Benefits and Earnings Losses for Permanently Disabled Workers in California: Trends Through the Great Recession and Impacts of Recent Reforms

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Preface

California adopted sweeping reforms to its Workers' Compensation system in 2012 under Senate Bill 863 (SB863). Motivated in part by concerns about whether wage replacement benefits for injured workers receiving Permanent Partial Disability (PPD) benefits were sufficiently generous, the reforms included several changes intended to improve the adequacy of PPD benefits. SB863 also required the California Commission on Health and Safety and Workers' Compensation (CHSWC) to conduct a study "to compare average loss of earnings for employees who sustained work-related injuries with permanent disability ratings under the schedule."

This study, which was sponsored by CHSWC in order to meet this statutory requirement, is intended to describe trends in the economic consequences of permanently disabling injuries in the period (2005-2012) between implementation of the last major reform legislation to affect California's workers' compensation system and the enactment of SB863. Because this period spanned the Great Recession of 2008-2009, we analyze in detail the impact of this economic downturn on outcomes for injured workers. We then measure trends in disability ratings and benefits over this time period and predict the likely impacts of SB863 on the adequacy and equity of PPD benefits.

The intended audience includes policymakers in the California legislature, as well as the broader community of stakeholders who are directly involved with or affected by the California workers' compensation system, particularly workers and employers. Many of the issues raised here, in particular our analysis of the impact of the business cycle on outcomes for disabled workers and the adequacy of benefits, may be of interest to policymakers involved with workers' compensation in jurisdictions beyond California.

RAND Center for Health and Safety in the Workplace

The RAND Center for Health and Safety in the Workplace is dedicated to reducing workplace injuries and illnesses. The center provides objective, innovative, cross-cutting research to improve understanding of the complex network of issues that affect occupational safety, health, and workers' compensation. Its vision is to become the nation's leader in improving workers' health and safety policy. Program research is supported by government agencies, foundations, and the private sector.

The research reported here was conducted in the RAND Justice Policy Program, which spans both criminal and civil justice system issues with such topics as public safety, effective policing, police–community relations, drug policy and enforcement, corrections policy, use of technology in law enforcement, tort reform, catastrophe and mass-injury compensation, court resourcing, and insurance regulation. Program research is supported by government agencies, foundations, and the private sector.

This program is part of RAND Justice, Infrastructure, and Environment, a division of the RAND Corporation dedicated to improving policy- and decisionmaking in a wide range of policy domains, including civil and criminal justice, infrastructure protection and homeland security, transportation and energy policy, and environmental and natural resource policy.

Questions or comments about this report should be sent to the project leader, Michael Dworsky, an Associate Economist at RAND (mdworsky@rand.org). For more information on RAND Justice Policy, see www.rand.org/jie/justice-policy.html or contact the director at justice@rand.org.

Abstract

In 2013, California began implementation of major reforms to the state workers' compensation system that were enacted in 2012 as part of Senate Bill 863 (SB863). These reforms included several changes to Permanent Partial Disability (PPD) benefits. This report provides early evidence on how these reforms have affected disability ratings and benefits and compares PPD benefits to the earnings losses experienced by permanently disabled workers. Because SB863 changed benefits in part by modifying the disability rating system, we also evaluate the impact of these changes on the equity of PPD benefits. In order to address these questions, we analyzed administrative data identifying permanently disabled workers that was linked to data on wage and salary earnings.

We find that permanently disabled workers experience large earnings losses, with earnings reduced by 30% on average in the second year following the injury. Workers who were injured during and after the Great Recession of 2008-2009 experienced substantially higher earnings losses than those injured before the great recession. However, changes in the composition of the injured worker population, particularly a shift toward workers with lower pre-injury earnings, explains nearly half of this trend. Impairment ratings and benefits increased over this time period as well, but the fraction of earnings losses replaced by benefits declined between 2005 and 2012 due to increased earnings losses. Increased benefits and ratings under SB863 will yield replacement rates higher than those observed in 2005 even if earnings losses remain elevated. Impacts on equity are detectable but small.

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Summary

Introduction

In 2013, California began implementing major reforms to the state Workers' Compensation system that were enacted in 2012 as part of Senate Bill 863 (SB863). One of the key goals of SB863 was to increase the generosity of Permanent Partial Disability (PPD) benefits awarded to permanently disabled workers. The increase in benefits was motivated by a widespread perception that benefits were too low to provide adequate compensation for the earnings losses experienced by permanently disabled workers. To monitor the success of SB863 in accomplishing the goal of improving benefit adequacy, the California Commission on Health and Safety and Workers' Compensation (CHSWC) contracted with the RAND Corporation to assess recent trends in earnings loss and PPD benefits and how injury compensation will be affected by SB863. The purpose of this report is to present those findings.

The benefit increases enacted under SB863 may be viewed in part as a policy response to reductions in impairment ratings and benefits that followed implementation of a major reform package enacted in 2004 as Senate Bill 899 (SB899). SB899 contained several provisions that effectively reduced the generosity of benefits. A previous RAND study estimated that, in the two years following the enactment of these provisions, average indemnity benefits for permanently disabled workers fell by roughly one-third compared to the average that had prevailed before SB899 was implemented (Seabury et al., 2011). As a result, the *replacement rate* of lost income—the fraction of lost earnings replaced by indemnity benefits—fell by roughly one-fourth.

SB863 used several distinct policy levers to increase benefits. First, SB863 raised both the minimum and the maximum weekly wage to be used in calculating PPD benefits for the first time since 2006. Because most workers had earnings above the weekly maximum wage, the 26% increase in the weekly maximum wage, implemented in two steps between 2012 and 2014, was anticipated to have a particularly large impact on benefits. Second, SB863 eliminated what was known as the *Future Earnings Capacity* (FEC) adjustment, a factor that was used to adjust the disability ratings for certain types of injuries. Elimination of the FEC was accomplished by setting the FEC for all injuries to the maximum value allowed under SB899, yielding higher ratings for all impairments that previously had an FEC factor below the maximum.¹ Third, the reform created a new benefit called the *return-to-work benefit* to be funded at \$120 million per year. This program offers supplemental payments to injured workers whose permanent disability benefits are considered disproportionately low in comparison to their earnings loss.

All of these changes would clearly increase benefits, but the size of the reforms' effects on benefits might vary substantially according to an injured worker's circumstances. For example,

¹ The bill also prohibited compensation based on certain controversial types of secondary (or *add-on*) impairments (e.g., sexual dysfunction or sleep disorder), though if anything these changes reduce benefits for affected workers.

the increase in the maximum wage might lead to a 26% increase in benefits for a worker with wages above the new maximum while having no impact on benefits for a worker with wages just below the old maximum. Increases in ratings and benefits brought about by the elimination of the FEC would vary widely across different types of injuries. The return to work fund, meanwhile, was explicitly designed to target workers with the most severe earnings losses. Because these provisions had the potential to affect different groups very differently and had the potential to interact in complex ways, the ultimate impact of SB863 on the generosity and fairness of benefits is impossible to predict without detailed analysis.

This report follows past RAND work and examines the changes to workers' compensation policy in the context of empirical estimates of the lost earnings experienced by permanently disabled workers. Estimating earnings losses is the only way to judge how the SB863 benefit increases compare to earnings losses for the average permanently disabled worker. Careful measurement of earnings losses for permanently disabled workers is particularly important for assessment of California's recent PPD reforms because the period following enactment of SB899 and leading up to passage of SB863 spanned the Great Recession of 2008-2009, the most severe economic downturn in the US since the Great Depression. In order to understand the baseline levels of earnings losses and benefit adequacy against which to evaluate SB863, it is necessary to examine whether the recession and recovery have led to differentially poor labor market outcomes for disabled workers.

Research Objectives of This Report

This report provides policymakers and stakeholders with evidence about the extent to which the benefit increases enacted under SB863 have improved compensation for permanently disabling workplace injuries. This information is needed to assess whether PPD benefits compensate workers at an adequate level and whether benefits are delivered in an equitable fashion across different types of workers and injuries. To provide this evidence, we pursued the following research objectives.

To measure the replacement of lost income, we estimated the earnings losses and statutory benefits for permanently disabled workers in California who were injured during the eight years (2005 through 2012) leading up to implementation of SB863. We estimated the average earnings lost due to permanently disabling injuries that occurred over this period, spanning the end of the housing boom and the Great Recession of 2008-2009. In particular, we examined in detail the impact that these economic events had on earnings losses of permanently disabled workers. We also measured trends in impairment ratings and statutory benefits in order to evaluate, for the first time, the adequacy of PPD benefits at the time that SB863 was enacted.

While we provide evidence on how these reforms have affected disability ratings and statutory benefits for the earliest groups of workers to receive disability evaluations under SB863, it remains too early to observe the long-run consequences of injuries occurring after the implementation of SB863. We therefore evaluate the effectiveness of the reforms to PPD benefits enacted under SB863 by estimating how these reforms *would have* changed the adequacy of benefits for workers injured over the period leading up to the law's enactment.

Finally, because SB863 changed benefits in part by modifying the disability rating system, we also evaluate the impact of these changes on the equity, or fairness, of PPD benefits.

Summary of Key Findings and Implications

The remainder of this summary and the full report document our findings in detail. Here we offer a brief summary that outlines the key findings and their policy implications. In this study, we found that:

- Permanently disabled workers injured after the beginning of the Great Recession experienced much more severe earnings losses than workers injured before, suggesting that the economic downturn disproportionately affected injured workers relative to uninjured workers.
- For the average worker who was injured between 2005 and 2012, the benefit increases enacted under SB863 would have significantly increased replacement rates of lost income compared to what they were under SB899. Specifically, we estimated that the fraction of after-tax earnings losses replaced by benefits would have risen by 21.4 percentage points, from 58.8% to 80.2%.
- While SB863 will lead to higher benefits, much of this benefit increase is offset by the increases in earnings losses that followed the great recession.
- Both changes in ratings and increases in the maximum weekly wage led to substantial increases in benefit adequacy, while the Return to Work Benefit had a more modest impact, on average. However, the Return to Work Benefit has the largest impact on wage replacement rates for the lowest-wage workers. Since the other provisions of SB863 lead to larger benefit increases for middle-income and high-income workers, the Return to Work Benefit has an important role to play in preserving the progressivity of PPD benefits.

These findings have several important implications for California policymakers. We found that earnings losses for permanently disabled workers are highly sensitive to the business cycle, reinforcing the need to understand the context of economic conditions when assessing benefit adequacy. We also found that the Great Recession had a disproportionate impact on permanently disabled workers, with relatively little recovery by 2013. Careful monitoring is needed to assess the generosity of SB863 as economic conditions change. Also, more should be done to develop effective strategies and policies for tying benefits to measures of economic conditions such as return to work, to help ensure that the adequacy of benefits does not rise or fall as dramatically when underlying economic conditions change.

We also found that the Return to Work Benefit serves a policy objective that is not advanced by the other SB863 reforms by making PPD benefit compensation more progressive. Even though it has a modest impact on overall wage replacement rates, the fact that the benefit was targeted to the lowest earning and most at-risk workers – those who do not return to work after an injury – led to an overall increase in the progressivity of benefits. However, more needs to be done to monitor the take-up and use of the benefits, and ensure that the Return to Work Benefit continues to support the most at-risk workers.

Finally, our analysis suggested that the changes to benefits brought about by SB863 had little impact on the overall equity of disability benefits across different types of injuries. While it is

reassuring that eliminating the FEC did not make benefit delivery substantially less equitable across types of injuries, we found that the FEC itself was not a very effective tool for making benefits more equitable: inequities in ratings and benefits between workers with different types of injuries were widespread in the period before SB863, even though the FEC was designed to eliminate such inequities. Our analysis suggests that these inequities will continue under SB863. More work should be done to address these inequities using empirical data on systematic differences in earnings losses across different workers.

Measuring Earnings Losses for Permanently Disabled Workers

The policy questions posed in this report center on earnings and employment losses, impairment ratings, and benefits among permanently disabled workers. We measure these outcomes by analyzing administrative data from several state agencies using the matching methodology developed for numerous prior RAND studies for CHSWC, including Peterson, Reville et al. (1997), Reville, Boden et al. (2001), Reville and Schoeni (2001), Reville, Schoeni et al. (2002), Reville, Seabury et al. (2005), and Seabury, Reville et al. (2011).

The earnings loss caused by a permanently disabling workplace injury can be defined as the reduction in a worker's earnings relative to what that worker would have earned if the injury had not occurred. An injured worker's actual earnings history can be observed directly using administrative data on earnings. The challenge to estimating earnings losses comes from estimating what a worker would have earned in the absence of an injury. Workers may experience changes in earnings for a variety of reasons unrelated to injury, including wage growth or promotion, job changes, retirement, or unemployment. Simply comparing an injured worker's earnings before and after an injury would ignore these other factors and attribute all changes to the injury. Accurately estimating the earnings loss caused by an injury requires estimating the so-called *potential earnings*, the hypothetical earnings that injured workers would have received absent the injury. We follow past RAND studies and estimate potential earnings by matching injured workers to uninjured “control” workers who worked at the same firm and had very similar earnings prior to the injury. The earnings of these control workers in the time period following the injury serve as a natural estimate for the potential earnings of their closely matched injured workers.

Our data in this study are similar to the data used in past studies, (e.g., Peterson, Reville et al. (1997), Reville, Seabury et al. (2005)). Workers' compensation claims data are linked to earnings data for claimants based on their Social Security Number, and this information is combined with earnings data to identify the control group. We use data on workers' compensation claimants from two sources: the Workers' Compensation Information System (WCIS) and the California Disability Evaluation Unit (DEU).

The Workers' Compensation Information System (WCIS), which was developed and is managed by the Department of Industrial Relations (DIR), collects information at the individual claim level from claims administrators reporting to DIR. These data represent an important source of information for analyzing and evaluating the California workers' compensation system that is likely to be representative of paid claims for the private sector. The Disability Evaluation Unit (DEU) is a unit within the Division of Workers' compensation that takes information from

medical reports and uses it to produce a disability rating, a number from 0-100% indicating the severity of disability that, in turn, is used to determine PPD benefits. The DEU ratings include precise data on all elements of the rating, and we use this detailed information to simulate SB863 ratings and benefits for those injured under SB899.

We match data from the DEU and WCIS to earnings data from the Base Wage file maintained by the California Employment Development Department (EDD) for administration of Unemployment Insurance (UI). With roughly 95 percent of employees in California covered by the UI system, the matched WCIS-EDD data and DEU-EDD data provide the most complete and accurate California quarterly earnings history for permanent disabled workers.

Figure S.1 plots average earnings over time relative to the quarter of injury for all injured workers in WCIS that received PPD benefits and their matched controls. The matched control workers are selected on the basis of earnings over the four quarters preceding the quarter of injury, which are shaded gray in Figure S.1. The earnings profiles for control and injured workers match closely over this time period, but diverge sharply after the injury. Our main measure of the impact of injury is relative earnings, or injured worker earnings as a percentage of control worker earnings. Under the assumption that injured and control worker earnings would have been identical if the injury had not occurred, relative earnings less than 100% can be interpreted as evidence of earnings losses caused by the injury.

Figure S.1
Earnings by Date Relative to Injury for Injured and Control Workers, 2005-2012

The first row of Table S.1 reports relative earnings at 1, 2, and 3 years post-injury for the average permanently disabled worker in WCIS with an injury date between 2005 and 2012. Relative earnings in the first post-injury year were 69% of control worker earnings, meaning that permanently disabled workers earned 31% less on average than they would have if they had remained uninjured. Relative earnings recover slightly, to 70% of control worker earnings, in the second post-injury year, but appear to stabilize by the third post-injury year at 71% of control worker earnings.

Table S.1: WCIS Earnings, Employment, and Return to Work Over First Three Post-Injury Years

	First Post-Injury Year	Second Post-Injury Year	Third Post-Injury Year
Relative Earnings	69%	70%	71%
Relative Employment	73%	74%	76%
Relative At-Injury Employment	70%	63%	58%

Earnings, employment, and return to work over first three post-injury years relative to controls

Weights used to correct for match failure

WCIS injured workers receiving PPD benefits 2005-2012, N = 345,223

Similarly, we measure employment for injured workers relative to control workers at the end of the first, second, and third post-injury years (i.e., in the fourth, eighth, and twelfth post-injury quarters). The second row of Table S.1, which reports relative employment for the average injured worker in the WCIS, indicates that injured workers are 73% as likely as control workers to be employed in both the fourth post-injury quarter and 74% as likely as control workers to be employed in the eighth post-injury quarter. In contrast to the dynamics of earnings shown in Figure 3.2, relative employment recovers slightly more in the third post-injury year, reaching 76% of control worker employment in the twelfth post-injury quarter. This improvement in relative employment, however, is driven by the fact that control worker employment declines faster than injured worker employment rather than an increase in employment among injured workers who remained out of work after two years.

A third outcome measure that we examine is employment at the at-injury employer, defined by receipt of any wages from the at-injury employer. Compared to overall employment, which stabilized and began to increase slightly by two years post-injury, relative at-injury employment continues to decline steadily throughout the first two post-injury years. The third row of Table S.1 reports that relative at-injury employment falls from 70% in the fourth post-injury quarter to 63% in the eighth post-injury quarter and then to 58% in the twelfth post-injury quarter. In short, permanently disabling injuries lead to large and persistent earnings and employment losses for injured workers.

Trends in Earnings Losses Since 2005

A major goal of this report is to evaluate how earnings and employment losses for permanently disabled workers evolved over the period between implementation of SB899 (at the start of 2005) and implementation of SB863 (at the end of 2012). To measure overall trends, we calculate average post-injury outcomes for all injured workers and controls for each quarter of injury. Figure S.4 presents relative earnings in the second post-injury year for permanently disabled workers by quarter of injury between 2005 and 2012.

Workers injured after the beginning of the Great Recession experienced dramatically greater earnings losses than workers injured in 2007 and earlier years. This is illustrated in Figure S.2, which shows the average relative earnings in the second post-injury year (quarters 5-8 after injury). The average worker injured in the first quarter of 2008 earned 27.5% less than the average uninjured control in the second post-injury year, whereas the average worker injured in the first quarter of 2009 earned 37.1% less in the second post-injury year. In just one year, earnings losses increased by 9.5 percentage points, or 35% of losses as of the first quarter of 2008. Relative earnings appear to stabilize and recover slightly in 2009. However, earnings remained substantially lower than before the recession through the end of 2012. Similar trends are evident for employment and at-injury firm employment.

Figure S.2
Relative Earnings of Permanently Disabled Workers by Quarter of Injury, 2005-2012

Relative earnings measured over second full post-injury year (5 to 8 quarters after the quarter of injury).
Official NBER dates of great recession shaded gray.
Figure calculated using weights to correct for match failure.

In order to summarize these trends we aggregated injured workers into three cohorts based on the date of injury: pre-recession (2005-2007), recession (2008-2009), and post-recession (2010-2012). Relative outcomes for these three cohorts of workers are reported in Table S.2 at time horizons of one, two, and three years post-injury. We observe similar trends over time in relative earnings and employment whether we examine earnings in the first year, the second year, or the third year after injury: earnings and employment relative to control workers were seven to nine percentage points lower for workers injured after the recession than for workers injured before the recession.

Table S.2: Earnings, Employment, and Return to Work Post-Injury, By Date of Injury

A. Relative Earnings	Pre- Recession	Recession	Post- Recession
	Injury Year 2005-2007	Injury Year 2008-2009	Injury Year 2010-2012

First Post-Injury Year	72%	68%	64%
Second Post-Injury Year	74%	67%	66%
Third Post-Injury Year	76%	68%	67%

B. Relative Employment

	Injury Year 2005-2007	Injury Year 2008-2009	Injury Year 2010-2012
Fourth Post-Injury Quarter	78%	71%	69%
Eighth Post-Injury Quarter	78%	70%	70%
Twelfth Post-Injury Quarter	80%	72%	73%

C. Relative At-Injury Employment

	Injury Year 2005-2007	Injury Year 2008-2009	Injury Year 2010-2012
Fourth Post-Injury Quarter	75%	69%	66%
Eighth Post-Injury Quarter	68%	61%	57%
Twelfth Post-Injury Quarter	63%	56%	52%
Number of Cases (Unweighted)	155,121	93,689	108,409

WCIS injured workers receiving PPD benefits 2005-2012

Third-year outcomes for 2010-2012 cohort available only for 2010-2011 cases

While the timing of these trends suggests that the recession was responsible for the deterioration of injured workers' economic outcomes, a number of alternative explanations are also possible. We find that the large declines in the relative earnings and employment of injured workers during the great recession and recovery were accompanied by substantial changes in the composition of the injured worker population. On many dimensions, workers injured during and after the recession were more likely than workers injured before the recession to have characteristics that predict larger earnings losses, including longer spells of temporary disability, lower pre-injury earnings, and higher age at injury.

We estimate that these changes in the types of workers who became permanently disabled account for nearly half (47%) of the increase in earnings loss between the pre-recession and post-recession periods. Our finding that compositional changes contribute so much to trends in earnings losses is notable because it highlights a previously unexamined channel through which changing economic conditions affect outcomes among the disabled. It also suggests that policymakers wishing to stabilize the adequacy over the business cycle could make progress toward this goal by designing benefits so that benefits replace a similar fraction of lost income across groups whose prevalence in the PPD population changes with economic conditions. Such factors include pre-injury wages, age at injury, and the duration of temporary disability.

Even though compositional changes in the PPD population played an important role in earnings loss trends, the Great Recession appears to have had a large negative impact on outcomes over and above the impact of compositional changes. If we compared a worker injured before the recession (2005-2007) with a worker injured after the recession (2010-2012) who had the same demographics, earnings, job tenure, employer, and injury characteristics, earnings

losses would be 4.8 percentage points (19%) greater for the worker injured after the recession. This is a much smaller change than the 8.5 percentage point (35%) unadjusted increase in average earnings losses between these periods, but it nonetheless reflects a meaningful worsening of outcomes.

In short, we find that labor market outcomes for permanently disabled workers deteriorated sharply during the great recession and still had not recovered by the time that SB863 was implemented.

Trends in Ratings, Benefits, and Wage Replacement

The sharp reductions in post-injury relative earnings that we document during and after the recession would imply reductions in benefit adequacy if benefits remained constant over time. Even though there were no statutory changes to benefits between 2005-2012, several other factors led to changes in the level of benefits over this time period. We find that average disability ratings increased substantially between 2005-2012. This is consistent with some of the compositional changes noted above: the number and type of impairments suggest that injuries may have been slightly more severe after the great recession, and workers injured during and after the recession were older on average than those injured before the recession. Injury severity and age both lead to higher impairment ratings and increased benefits. In addition to changes in the claimant population, ratings may creep upward over time as knowledge about the rating system diffuses among medical evaluators and attorneys. Trends caused by the diffusion of knowledge among players in the workers' compensation system may be particularly important between 2005-2012 because California had no experience using the *AMA Guides* for disability rating prior to their adoption in 2005.

Figure S.3
Statutory Benefits by Rating Type and Injury Date, Constant-Maturity DEU
Ratings

Sample contains cases with injury dates between 2005-2012 that were rated at the DEU within 851 days of injury. Weighted average rating is calculated assuming that the true share PPD cases with representation is 74% in all quarters of injury between 2005-2012 as per WCIRB (2015). Formal ratings are not included in figure. Formal ratings constitute 1.3% ratings performed at the DEU on 2005-2012 injuries rated by May 2015.

Figure S.3 illustrates that the statutory benefits available to permanently disabled workers grew steadily between 2007 and 2012, and that this increase was driven by "Consult" ratings, where the worker is represented by an attorney. Between the 2005 and 2012 injury years, the average statutory benefits (inflated to constant 2014 dollars) for a case with representation rated at the DEU within 851 days of injury increased from \$22,990 to \$30,135, a cumulative percentage increase of 31% over seven years. However, statutory benefits for cases without representation were essentially flat over this time period, increasing only from \$10,980 to \$11,689, a cumulative percentage increase of 6% over seven years. While cases with attorney involvement are believed to be underrepresented at the DEU, we can provide a rough estimate of the average trend in benefits under the assumption that the fraction of all PPD cases with representation remains constant over time and is identical for workers at self-insured and insured employers. This weighted average, which is also shown in Figure S.6, suggests that, between the 2005 and 2012 injury years, statutory benefits increased from \$19,868 to \$25,326, a cumulative percentage increase of 27% over seven years.

The measure of benefit generosity that we use to analyze adequacy and equity is the *statutory after-tax wage replacement rate*. The wage replacement rate is the percentage of lost earnings that are replaced by benefits. Because workers' compensation benefits are non-taxable, we calculate earnings losses on an after-tax basis by simulating income and payroll taxes (both federal and California) before calculating the wage replacement rate. We calculate after-tax wage replacement rates by calculating the present value of statutory benefits and dividing this amount by estimated after-tax earnings losses over the first five years following the date of injury. It is important to note that these wage replacement rates are a benchmark intended to facilitate comparison across alternative policies and trends over time, and are likely to understate lifetime earnings losses for many workers because earnings losses may persist well beyond five years. This is particularly true for the most severe injuries.

Figure S.4
Statutory After-Tax Wage Replacement Rates for Permanently Disabled Workers

Figure S.4 presents estimated trends in statutory wage replacement rates under SB899 and SB863. The lowest (red) line shows the average, after-tax, replacement rates by injury quarter under SB899. While the average rating and average benefits were increasing over time as discussed above, those changes in the statutory benefits were not enough to offset greater post-injury wage losses experienced by workers injured during and after the Great Recession. We

estimate that statutory after-tax replacement rates under SB899—the bottom line on Figure S.4—fell from 64.3% before the recession to 57.1% during the recession and then to 52.4% after the recession.

Figure S.4 also illustrates what trends in replacement rates for permanently disabled workers would have been under the reforms enacted by SB863. The intermediate orange line depicts replacement rates using benefits calculated using SB899 ratings with the SB863 maximum wage. The blue line, meanwhile, shows the full effect of the ratings changes (increased FEC and elimination of add-ons) and benefit increases enacted under SB863. Finally, the black line includes the return to work benefit in the replacement rate calculation. Table S.3 reports after-tax wage replacement rates.

Table S.3: After-Tax Wage Replacement Rates by Year of Injury

	Pre-Recession (2005-2007)	Recession (2008-2009)	Post-Recession (2010-2012)	All Years
SB899 Benefits	64.3%	57.1%	52.4%	58.8%
SB863 Maximum Applied to SB899 Ratings	76.3%	66.8%	61.2%	69.2%
SB863 Benefits and Ratings	85.4%	74.3%	66.4%	76.8%
SB863 + Return to Work Fund	89.0%	77.6%	69.8%	80.2%

Several conclusions are apparent from Figure S.4. First, both the increased maximum wage and the changes to ratings translate into sizable increases in wage replacement rates, while the impact of the return to work benefit on overall wage replacement rates is more modest. Second, none of the policies enacted under SB863 would have stabilized wage replacement rates over the Great Recession. Although we estimate that return to work benefit payments would have increased sharply in response to the trends in employment and earnings loss over the great recession, the relatively small dollar value of the benefit (\$5,000) means that even sizable increases in the probability of return to work benefit payments lead to fairly small impacts on overall benefit adequacy.

Averaged over the 2005-2012 period, full implementation of SB863 would have increased after-tax wage replacement rates by 21.4 percentage points, from 58.8% to 80.2%. Because earnings losses were so much greater after the recession than before the recession, however, we estimate that the after-tax wage replacement rate would have been 69.8% for workers injured between 2010-2012 if SB863 had been in place at the time. The increase in benefits is large enough that after-tax wage replacement rates would have been higher under SB863 for workers injured after the great recession than they were under SB899 for workers injured before the great recession, but the majority of this benefit increase was offset by the increases in earnings losses.

How Has SB863 Affected the Equity of Ratings and Benefits?

We follow previous RAND studies (Peterson, Reville et al. 1997, Reville, Seabury et al. 2005, Bhattacharya, Neuhauser et al. 2010) in considering two concepts of fairness, or *equity*, that can be used to evaluate the disability rating system. *Vertical equity* refers to the principle

that workers with more severe earnings losses should receive proportionally more generous benefits to offset those losses. *Horizontal equity* refers to the principle that similarly situated workers should be treated similarly.

Figure S.5
Relationship Between Proportional Earnings Loss and Simulated Final Ratings Under SB863

SB863 ratings are simulated using data on ratings performed under the SB899 rating system. Ratings below 70 omitted to preserve legibility.

We examine vertical equity by estimating the average relationship between ratings and earnings losses for all injured workers. Figure S.5 plots the average proportional earnings loss against the final rating before apportionment under both SB899 and SB863. The figure shows a strong positive relationship between impairment ratings and proportional earnings losses, which reflects favorably on the vertical equity of the PD rating system under SB899. On average, each additional each 1-point increase in the final impairment rating predicted an increase of 1.03 percentage points in proportional earnings loss. Figure S.5 illustrates that SB863 will not lead to major changes in the vertical equity of ratings. The earnings loss at any given impairment rating is lower under SB863 because most cases receive higher final ratings, but the changes relative to SB899 are modest.

The most important input into the rating process is the standard rating assigned using the *AMA Guides* (or, for psychiatric impairments, the *Global Assessment of Function (GAF)*). While other steps of the rating process certainly matter, the vertical equity we observe with respect to final ratings under SB899 is an indication that the *AMA Guides* yield ratings that are informative

about the eventual degree of disability. The equity properties of the *AMA Guides* (as applied in California) have not previously been investigated, so it is reassuring to find that ratings based on the *AMA Guides* predict earnings loss. Because SB863 does not modify the *AMA Guides* underlying rating process, it is not surprising that changes in vertical equity are limited.

We may also expect SB863 to affect horizontal equity to the extent that increases in final ratings and benefits due to setting the FEC to 1.4 for all impairments may be inversely related to the pattern of earnings losses across impairments with similar standard ratings. We examined this possibility by comparing proportional earnings losses and wage replacement rates for cases with similar ratings across different impairment types, which replicates methods used to examine horizontal equity in prior RAND reports. Figure S.6 presents after-tax wage replacement rates for single-impairment cases with different impairment types. The seven groups of impairments chosen for the Figure each represent a different FEC rank, from Hand or Finger (1) to Psychiatric (8) impairments. Under SB863, increases in ratings and benefits were larger for cases with lower FEC ranks under SB899.

Figure S.6
Horizontal Equity: After-Tax Wage Replacement Rates Under SB863 and SB899

Several findings stand out in Figure S.6. While all impairments will receive higher benefits under SB863, the increases are generally skewed toward impairments with lower FEC ranks. The two lowest-ranked groups (impairments of the Hand or Finger and impairments of the Knee) experience the most dramatic increases in wage replacement rates. However, policy interactions with other provisions of SB863 make the relationship between changes in replacement rate and the FEC somewhat complex. More importantly, while there are dramatic differences in wage

replacement under SB863, we find similarly large differences under SB899. Our analysis strongly rejects the hypothesis that the FEC factors as implemented under SB899 led to horizontal equity across different types of impairments, and we conclude that SB863 does not systematically enhance or degrade the horizontal equity of the rating and benefit system.

Other Findings

Our analysis yielded a number of additional findings that may be of interest to policymakers:

- **Alternative Rating Procedures Could Have a Major Impact on Ratings and Benefits Under SB863**

Data reported in this study rely on ratings under the *AMA Guides*. However, alternative rating procedures that deviate from the *AMA Guides* were ruled permissible in a series of 2009 *en banc* rulings by the Workers' Compensation Appeals Board (WCAB). These rulings, collectively referred to as *Almaraz-Guzman I & II* (*Almaraz*), have become widely used in the permanent disability rating process. SB863 added a section to the labor code explicitly authorizing alternative ratings, and so we analyze the potential impact of these alternative procedures on ratings and benefits. Data from the DEU indicate that alternative ratings were submitted for over a quarter of ratings on represented cases in recent years and between 19-20% of unrepresented ratings. The fraction of both types of ratings seems to have reached a plateau around 2012-2013 and this may represent the fraction of alternative ratings we can expect going forward.

We find that *Almaraz* is likely to have had an important and substantial impact on the ratings and statutory benefits available to permanently disabled workers. We estimate that when an *Almaraz* rating is submitted to the DEU, relative to the underlying AMA rating, the alternative rating is 9.7 rating points higher for Summary ratings, 13.5 rating points higher for Consults, and 13.0 rating points higher for Formal ratings. By embedding the alternative rating procedure advanced under *Almaraz* in the statute law, SB863 creates the possibility that impairment ratings in the future could be substantially higher than suggested by our main analysis. If the alternative ratings were used to pay workers benefits, the benefits and replacement rates would be substantially higher. However, we do not know how often or to what degree alternative ratings are ultimately used instead of the more strict interpretation of the *AMA Guides*.

- **The Return to Work Fund is Important for Preserving the Progressivity of PPD Indemnity Benefits Under SB863**

Progressivity in wage replacement rates, which refers to the extent to which wage replacement rates for low-wage workers are higher than replacement rates for higher-wage workers, is introduced into the workers' compensation system largely because of the weekly minimum and the weekly maximum wage used to calculate PPD benefits. If two workers with the same disability rating experience the same after-tax proportional earnings losses, then the statutory wage replacement rate will be higher

for the worker with the lower pre-injury wage. Because increases in the weekly maximum wage affect only the benefits of workers with wages above the SB899 weekly maximum, we examined the impact of SB863 on the progressivity of PPD benefits.

We found that the changes in benefits and ratings under SB863 have a limited impact on workers in the first quartile of pre-injury earnings (annual earnings below \$22,315 in constant 2014 dollars) while yielding much larger increases for workers further up the income distribution. In contrast, the Return to Work Benefit is strongly progressive, both because the value of the benefit is fixed regardless of the worker's income level and because low-wage workers experience worse return to work outcomes than higher-wage workers.

Conclusions

We found that the benefit increases brought about by SB863 have done much to restore compensation for permanent partial disabilities in California to levels not seen since before the 2004 reforms. Replacement rates under the new statutory rules under SB863 should rise significantly, even in the face of a relatively sluggish economy in which the earnings of disabled workers continue to lag behind their pre-recession levels. We also found that the Return to Work Benefit did little to impact overall benefit adequacy, but it is expected to target benefits towards the most at-risk, low-wage workers, increasing the progressivity of PPD compensation. Nevertheless, several issues remain that require ongoing monitoring of return to work and earnings losses, and some systemic inequities remain in the system that should be addressed in future studies and reform efforts.

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Abbreviations

AME	Agreed Medical Examiner
AMA	American Medical Association
CHSWC	California Commission on Health and Safety and Workers' Compensation
DEU	California Disability Evaluation Unit
DIR	Department of Industrial Relations
DOI	Date of Injury
EDD	California Employment Development Department
EDI	Electronic Data Interchange
FEC	Future Earnings Capacity
FROI	First Report of Injury
GAF	Global Assessment of Functioning
IAIABC	International Association of Industrial Accident Boards and Commissions
MMI	Maximum Medical Improvement
P&S	Permanent and Statationary
PDRS	Permanent Disability Rating Schedule
PPD	Permanent Partial Disability
QME	Qualified Medical Examiner
SB	Senate Bill
SJDB	Supplemental Job Displacement Benefit
SROI	Subsequent Report of Injury
SSN	Social Security Number
TTD	Total Temporary Disability
UI	Unemployment Insurance
WCIRB	Workers' Compensation Insurance Rating Bureau

1. Introduction

Background and Purpose of Study

The past two decades have been a time of intense change and upheaval in the California workers' compensation system. In the early 2000s, workers' compensation insurance premiums in the state were skyrocketing and the system was widely believed to be in crisis. This concern led to a sweeping reform effort in April 2004 that led to dramatic changes in the way that medical and indemnity benefits were delivered. One of the biggest changes made by the 2004 reform bill, referred to as SB 899, was to require disability ratings to be based upon the American Medical Association's *Guides to the Evaluation of Permanent Impairment, 5th Edition* (AMA *Guides*). Previously, benefits had been determined by a unique California Permanent Disability Rating System (PDRS), which was derided by critics as subjective and inaccurate. After the adoption of these reforms, the average costs of workers compensation claims fell for a short period and premiums fell for several years.

In the late 2000s, a pair of developments led to a push for further changes to the system. The first was that premiums began to rise once more, largely driven by rising costs associated with the provision of medical care for injured workers. The second was evidence that the 2004 reforms led to a dramatic cut in permanent partial disability (PPD) benefits for disabled workers. The nature of the AMA Guides was such that disability ratings were significantly lower on average than the ratings under the pre-2005 PDRS. Because California PPD benefit levels are tied to disability ratings by law, disability benefits and replacement rates of lost income fell substantially after the reforms took effect (Seabury, Reville et al. 2011). Although large increases in PPD benefits were enacted in 2002 as part of Assembly Bill 749 (AB749), the reductions in ratings and benefits observed after implementation of SB899 raised concerns among stakeholders that SB899 may have imposed a considerable burden on disabled workers. These concerns may have been colored by evidence that PPD benefits in earlier periods had been of questionable adequacy (Peterson, Reville et al. 1997).

In response to these controversies, in September 2012 California enacted Senate Bill 863 (SB863). This bill had the dual goals of attempting to contain medical costs for injured workers while restoring some of the PPD benefits for permanently disabled workers reduced under SB899. Consequently, the bill made many changes to permanent disability benefits.

One of the most significant was to eliminate what was known as the "future earnings capacity" variable, a scaling factor that adjusted AMA Guides ratings according to the type of

injury.² Another important change was to raise the weekly benefit cap on PPD benefit levels, which had remained at the same level since 2006.

The bill also prohibited compensation based on certain controversial types of impairments that were secondary to the original impairment (e.g., sexual dysfunction or sleep disorder) and made various adjustments to administrative aspects of the system (such as the timing of permanent disability (PD) advances).

Finally, the reform also created a “return-to-work program” to be funded at \$120 million per year that would provide supplemental payments to injured workers whose permanent disability benefits are disproportionately low in comparison to their earnings losses. The bill provided the Director of the Department of Industrial Relations (DIR) wide leeway in the design and implementation of the program, as discussed in an earlier RAND report for CHSWC (Seabury and Scherer 2013).

The bill also required CHSWC to conduct a study “to compare average loss of earnings for employees who sustained work-related injuries with permanent disability ratings under the schedule.”

There are several challenges to evaluating the impact of SB 863 on benefit adequacy and equity. Typically, benefit adequacy is measured over an extended period of 3-5 years after the date of injury (Reville, Seabury et al. 2005). However, this requires a substantial lag between the passage of a reform and the availability of data with which to analyze its effect. Prior RAND work for CHSWC addressed a similar issue to evaluate the 2004 reforms by simulating the predicted 5-year losses of injured workers injured after the reforms. We adopt a similar approach in this case. However, in our analysis, we must deal with the fact that in 2008 the US experienced the biggest economic slowdown since the Great Depression. The so-called “Great Recession” had a significant and lasting impact on the labor market, and potentially drove post-injury earnings and employment in ways that are not well understood.

To help CHSWC and other interested policymakers in understanding how SB 863 has and will impact outcomes for injured workers, we study the earnings of recent PPD beneficiaries in California. Specifically, we identify trends in earnings loss and employment for injured workers from 2005-2012 and estimate what fraction of losses was replaced by benefits over this time period. We then estimate what fraction would have been replaced had the changes of SB 863 been in place, and then project the likely future impact on replacement rates as the return-to-work program is implemented and economic conditions improve.

Research Questions

In order to understand how the post-injury experiences of permanently disabled workers in California have been impacted by the Great Recession, and to evaluate the implications of the

² Technically, SB 863 did not eliminate the FEC, it simply fixed it at 1.4 for all workers, whereas before the range was 1.1-1.4 with an average of 1.22 among single-impairment cases. (It is more complex to report an average FEC factor for multiple-impairment cases because the FEC is defined at the impairment level.)

changes brought about by SB863 for the adequacy of disability benefits, we address the following research questions:

- How have earnings losses and return to work associated with permanently disabling workplace injuries in California varied over the last decade?
- How much of the changes in earnings losses and return to work were driven by broader economic factors compared to changes in the characteristics of workers who were filing claims?
- What is the impact of SB863 on the adequacy of benefits?
- Will the SB 863 reforms affect the equity of benefits?
- To what extent do different aspects of the reforms account for changes in adequacy or equity?

Organization of this Report

In Chapter 2 we provide background on workers' compensation reform in California, and suggest a framework for evaluation. We also describe recent trends in the California economy which will be important for putting our evaluation in context. In Chapter 3 we describe the data and methods we use in our analysis. Chapter 4 presents the results of our analysis of earnings losses and return to work for permanently disabled workers in California injured from 2005-2012. In particular, we spend considerable time evaluating how the Great Recession of the late 2000s impacted outcomes for disabled workers. In Chapter 5 we assess how SB863 impacted the adequacy of disability benefits. We do this by estimating what replacement rates of lost income would have been for workers injured from 2005-2012 if SB863 had been in place over this entire period. Chapter 6 details the effects of SB863 on benefit equity. We finish with conclusions and policy recommendations.

2. Policy Background

This section provides some general background on the goals of workers' compensation policies and defines some criteria that we use to evaluate California's system. We then describe relevant features of California's workers' compensation system and detail the history of reform to permanent partial disability benefits in California. Finally, we also provide some background on the disruption to labor markets caused by the great recession, which may affect outcomes for disabled workers.

Criteria for Evaluating Workers' Compensation Policies

State workers' compensation systems are designed to compensate workers for the medical costs and lost income they suffer as a result of work-related injuries or illnesses. Prior to the adoption of state workers' compensation systems in the early part of the 20th Century, compensation for work-related injuries and illnesses in the US was provided through the tort system.³ Based on civil tort law, workers injured on the job were entitled to full compensation for both economic and noneconomic damages suffered (potentially including punitive damages), but only when they could demonstrate that their injuries or illnesses resulted through negligence entirely on the part of employers. As is common in the tort system, actual recovery of damages was a costly and uncertain process. Workers' compensation was adopted as a compromise system that essentially carved-out the compensation of workplace injuries from the tort system. Rather, workers' compensation would operate as a no-fault compensation system that offered full medical and partial income benefits to injured workers. These systems were seen as a compromise in which workers received benefits with greater certainty but only at reduced levels (Fishback and Kantor 1996).

Because workers' compensation benefits provide only partial compensation, there has historically been intense interest in monitoring the actual level of compensation they provide. Different standards have been used to evaluate these policies over time. The 1972 Report of the National Commission on State Workmen's Compensation Laws (the National Commission Report), probably the most comprehensive evaluation of the design of state workers' compensation programs, relied primarily on what is known as the *adequacy* and *equity* criteria to evaluate benefits. In addition, Burton (1977) suggests additional criteria based on the system's *affordability* and *efficiency*.⁴ We define each of these in turn.

³For a more detailed account of the history of workers' compensation, including a discussion of who benefited and who lost, see Fishback and Kantor (1996).

⁴Burton (1977) distinguished delivery system efficiency (i.e., administrative efficiency) from other types of efficiency, but we combine these under a single category for simplicity.

Adequacy

The adequacy of benefits is typically measured through the replacement rate of lost income. For temporary disability benefits, the standard for adequacy is generally held to be a replacement rate of two-thirds of lost pre-tax income or 80% of after-tax income (National Commission (1972);NASI, 2004). For permanent disability benefits, there is less consensus about what the target replacement rate should be. The National Commission fell short of adopting the two-thirds statutory replacement rate as a standard, though later, such a standard was recommended by a study panel of the National Academy of Social Insurance did (NASI, 2004). A complicating factor with permanent disability benefits is that they vary considerably depending on the timeline over which they are measured (Seabury et al., 2011). At the very least, a two-thirds threshold is a useful benchmark against which to compare replacement rates. Pre-tax rates that fall significantly below this level—and after-tax rates that fall significantly below 80%—are of potential concern.

Equity

The equity standard refers to the notion that workers who experience injuries and illnesses with similar severity should receive comparable levels of compensation. From the standpoint of income replacement, this means that workers with injuries of similar severity should have similar replacement rates. Based on how it has been applied in practice, the equity criterion does not necessarily require that workers receive the exact same dollar amounts in compensation. For instance, higher wage workers will tend to have greater dollar losses, which means that under an equitable system they would receive more benefits on average. Equity does not even require that replacement rates are the same. State systems routinely cap the total benefits at some fixed dollar value (usually tied to the state average weekly wage), which means that higher wage workers will have lower replacement rates on average, which will decrease as their wages exceed the cap. Similarly, the presence of benefit floors means that, all else equal, the lowest wage workers will receive the highest replacement rates.

Note that the estimated replacement rate of lost income is a useful tool for evaluating equity. That is, workers' compensation benefits are equitable if workers with the same expected losses have approximately the same replacement rate of lost income. This approach has been used by several previous RAND studies (Reville, Seabury et al. 2005, Bhattacharya, Neuhauser et al. 2010, Seabury and Scherer 2013).

Affordability

The affordability criterion is fairly straightforward, and refers to the cost of the workers' compensation system. An affordable system is simply one that employers, workers, and the public can afford while still attaining minimum levels of adequacy (Reville, Seabury et al. 2005).Note that the costs of the system refer to both the actual cost of the benefits as well as the cost of administering and delivering them. The administrative costs of workers' compensation

benefits in state systems have generally been considered quite high (Berkowitz and Burton Jr 1987, Sengupta, Baldwin et al. 2014).⁵

There is an inherent and direct conflict between making a system more adequate and making it more affordable. Holding expected losses constant, we make workers' compensation benefits more adequate by increasing them, but this makes the system less affordable. There is some evidence that interventions that reduce expected losses, such as employer-based return to work programs, can serve the dual aim of making a system more affordable and more adequate (Seabury et al., 2011) (McLaren, Reville et al. 2010). Additionally, improvements in administrative efficiency can lower the overhead cost of delivering benefits, which makes the system more affordable without hurting its adequacy.

Efficiency

Broadly defined, efficiency incorporates the indirect costs associated with workers' compensation benefits. This includes behavioral effects such as disincentives to return to work. So, a workers' compensation system is more efficient if it achieves a given level of adequacy without creating adverse work incentives. Efficiency can also incorporate factors such as administrative delay or the levels of disputes. Other factors such as incentives for injury prevention – by employers and workers – can also be included here. While not all of these are easily measured, the impact of any given reform proposal on the efficiency of benefits could represent a significant portion of the total social costs or benefits of the proposal.

In this report, we focus our attention on the adequacy and equity of benefits. However, it is important to keep in mind that these changes also impact the affordability and efficiency of the system. Focusing too much on any one aspect of the system could lead to changes that create imbalance, and require further change to correct. Arguably, that describes some of the patterns of California's history of reforming the workers' compensation system.

Compensating Permanent Disabilities in California

As in other states, California's workers' compensation system requires employers to provide medical payments and cash indemnity benefits to workers who experience job-related injuries or illnesses.⁶ California requires all employers, regardless of size, to have coverage for workers' compensation. To obtain coverage, employers may self-insure or purchase workers' compensation from a private insurance carrier or the State Compensation Insurance Fund (State Fund). California employers wishing to self-insure must obtain certification from the Department of Industrial Relations (DIR), and to do so they must be able to demonstrate sufficient financial resources. Another option for employers that are too small to meet the self-

⁵ Although in some sense this is relative, as the administrative costs of the tort system are probably even higher (Studdert et al., 2006).

⁶ Employers are also required to provide some death benefits to the dependents of workers who have died from a workplace injury or illness, though occupational fatalities are relatively infrequent.

insured requirements is to combine efforts with other employers and self-insure as a private group or as a joint public authority (JPA).

Nonfatal workplace-related injuries or illnesses are classified as medical-only, temporary disability or permanent disability. Medical-only claims involve no lost time, only medical treatment. A temporary work-related injury or illness is defined as one that prevents a worker from doing his or her usual work for more than three days or the worker is hospitalized overnight.⁷ Workers with a temporary condition will collect weekly temporary total disability (TTD) or temporary partial disability benefits until they return to work at full wage or reach maximum medical improvement (MMI). Injured workers who attain MMI but still have some residual disability as a result of the injury are potentially eligible for permanent partial disability (PPD) benefits.

Historically, the California approach to compensating permanent disabilities has differed considerably from that of most states. The rating system in California has been the center of considerable controversy, including numerous allegations that it is overly subjective and promotes disputes (Berkowitz and Burton Jr (1987), Reville, Seabury et al. (2005)). For a detailed description of the system and its development over time see Reville, Seabury et al. (2005) and Seabury, Reville et al. (2011). Below, we discuss how reforms to the system in 2004 led to the adoption of a system based on the American Medical Association *Guides to the Evaluation of Permanent Impairment* (AMA Guides). The implementation of this change resulted in a substantial decline in benefits and helped motivate the adoption of SB 863.

Workers' Compensation Reform in California

The compensation of permanent partial disabilities has been at the heart of many controversies involving the California workers' compensation system over the years. Several past studies by RAND conducted for the California Commission on Health and Safety and Workers' Compensation (CHSWC) have questioned the adequacy of California's PPD benefit levels (Peterson, Reville et al. 1997, Reville and Schoeni 2001, Reville, Schoeni et al. 2002, Seabury et al., 2011). This is despite the fact that on a statutory basis, the benefits in California are not noticeably lower than in other states (Reville, Seabury et al. 2005). Nonetheless, concerns about adequacy have motivated several reforms to benefit levels over the years, including SB 863.

In California, the weekly benefit cap for TTD benefits was fixed at \$490 per week from 1996 to 2002, when it was raised in several steps for injuries occurring on or after 1/1/2004 by Assembly Bill 749 (AB 749) and tied to a cost of living adjustment based on the state average weekly wage after 2006 (the weekly maximum for injuries occurring in 2015 is \$1,103.29). Prior to April 19, 2004 (the adoption of SB 899), workers received TTD benefits until they reached maximum medical improvement (MMI) or were medically cleared to return to work. After April 19, 2004, however, TTD benefits were capped at 104 weeks except for some

⁷ If an injury or illness requires the worker to be out of work for 14 days or longer, the first three days are covered retroactively.

exceptions involving more severe injuries. Workers with these types of injuries—examples include amputations or severe burns—receive TTD benefits for up to 240 weeks (Labor Code §4656(c)(2)).

The amount of PPD benefits received by the injured worker is tied directly to the disability rating. The maximum weekly benefit is two-thirds of wages subject to a weekly cap that was increasing in the disability rating; for example, workers injured on January 1, 2006, after AB749 was fully implemented would have been eligible for up to \$230 per week if their disability ratings were under 70%, and up to \$270 per week if their disability ratings were 70%-99%. Also, the number of weeks for which benefits are available is an increasing function of the disability rating. Finally, workers with a rating of 70 or more are eligible for a small weekly life pension.

The passage of SB 899 in 2004 led to substantial changes in the disability rating system. The new rating system bases the foundation of the disability rating upon the *AMA Guides to the Evaluation of Permanent Impairment, 5th Edition (AMA Guides)* (Labor Code §4660(b)(1)). The new rating system abandoned the old subjective factors and work capacity guidelines, although it did keep the age and occupation modifiers. Additionally, SB 899 required the Administrative Director to incorporate empirical data on earnings losses for disabled workers to adjust disability ratings, which was done through what were referred to as future earnings capacity (FEC) adjustments. The FEC adjustments ranked different disabilities based on the estimates of earnings losses reported in Seabury, Reville et al. (2004). There were eight categories or "ranks" numbered one to eight. Higher categories receive larger upward adjustments to their disability ratings. The adjustments range from a 10% increase for the first category up to a 40% increase for the eighth category.

Another change in the disability rating system introduced by SB 899 was the introduction of new rules on how responsibility for the disability is split between the employer and worker ("apportionment"). SB 899 repealed the previous rules on apportionment and added the new requirement:

“A physician shall make an apportionment determination by finding what approximate percentage of the permanent disability was caused by the direct result of injury arising out of and occurring in the course of employment and what approximate percentage of the permanent disability was caused by other factors both before and subsequent to the industrial injury, including prior industrial injuries”(Labor Code §§4663 (c))

Furthermore, Labor Code §4664 (a) states that: “[t]he employer shall only be liable for the percentage of permanent disability directly caused by the injury arising out of and occurring in the course of employment.” Put more simply, the new apportionment rules reduce permanent disability ratings by the fraction of disability that the physician deems was not work related.

The net effect of the changes to the permanent disability rating system brought about by SB 899 was a substantial reduction in the size of permanent disability ratings. The adoption of the *AMA Guides* led to a reduction because the average rating in the *AMA Guides* is lower than the rating assigned to a similar impairment evaluated using the pre-2005 PDRS. Neuhauser (2007) found that the average permanent disability rating in California after AMA Guide adoption was

41.7% lower than under the PDRS prior to adoption. Additionally, he found that 9.8% of all permanent disability cases included apportionment in 2006, leading to an average reduction in ratings of 40.1% in apportioned cases. Overall, the apportioning of permanent disability to causation reduced total permanent partial disability benefit payments by almost 6%, and the total decline in permanent disability awards that could be attributed to lower disability ratings was more than 50%.

In addition to the above changes, SB 899 also introduced a two-tier PPD benefit. The provision, commonly referred to as “bump up/bump down,” specifies that employees are entitled to a 15% increase in their disability benefits if they are not offered a return to regular, modified or alternative work, and a 15% decrease in benefits if they are. The 30% swing in disability benefits potentially provides a strong incentive for employers to make a return to work offer for injured workers. To be eligible for the bump down, the employer must make the qualified work offer within 60 days of the injury being declared permanent and stationary (P&S). The bump-up/bump-down also had the important policy objective of better targeting PPD benefits at those with higher post-injury wage loss. Workers that return to the at-injury employer have substantially lower long-term wage loss than those that do not.

While the tiered benefit program provides unambiguous incentives to bring injured workers back to work and better targeting of benefits, implementation problems limited its effectiveness. One of the chief limitations had to do with the timing. In order to be eligible for the bump down, an employer has to make a qualified offer within 60 days of P&S date, but an employer (or insurer) may have been paying PPD benefits long before the P&S date was reached. In California, workers become eligible for PPD benefits two weeks after TTD benefit payments end, even if the injured worker has not yet reached MMI (§4650(b)). If a worker later settles the value of the permanent disability benefits, these advance payments are deducted from the final settlement amount. The reason this affected the usefulness of the tiered benefit is that PPD advancements are made at a statutory rate before any adjustment (i.e., before the bump-up or bump-down is applied). In many cases, even the majority of cases, it can be 6 months or more between the date at which an injured worker is cleared to return to work (meaning PPD benefits will often start well before the P&S date. For a worker with a disability rating of 11, (the mean rating in the DEU for unrepresented claims in the new schedule) the full PPD award could be paid out before the post-P&S period is reached. Given the advancement at statutory levels, it is unclear that the bump-down was used frequently enough to have a significant impact on return-to-work.

In the late 2000s there were two developments that increased pressure for further reform. The first was that premiums began to rise once more, largely driven by rising costs associated with the provision of medical care for injured workers. The second was a growing body of evidence that the 2004 reforms led to a dramatic cut in PPD benefits for disabled workers. Even after the FEC adjustments, disability ratings (and thus disability benefit levels) were significantly less on average than the ratings under the old schedule, and replacement rates of lost income fell by 26% after the reforms (Seabury, Reville et al. 2011). Given past evidence showing that California already had questionable benefit adequacy under the old benefit levels (Peterson,

Reville et al. 1997), there was concern that, despite the large increase in benefits under AB749, the effort to cut costs had imposed considerable burden on injured and disabled workers.

In September 2012 California adopted SB 863, which was an attempt to contain medical costs for injured workers while restoring some of the PPD benefits that had been reduced. The bill made many changes to permanent disability benefits, including: elimination of the FEC variable (replaced with a fixed multiplier of 1.4), an increase in the amount of wages that can be considered for calculation of PPD benefits, a limitation on compensation based on certain controversial types of add-on impairments (e.g., sexual dysfunction, psych, and sleep disorder), and various adjustments to administrative aspects of the system (such as the timing of permanent disability (PD) advances). The reform also created a “return-to-work program” to be funded at \$120 million per year that would provide supplemental payments to injured workers whose permanent disability benefits are disproportionately low in comparison to their earnings losses. The bill provided the Director of the Department of Industrial Relations (DIR) wide leeway in the design and implementation of the program. In addition, the bill required the Director and the CHSWC to determine eligibility and the amount of payments to be made based on a study.

California's Labor Market Since 2005

The adequacy of workers' compensation benefits fundamentally depends on the severity of earnings and employment losses caused by occupational injury and illness. Because earnings losses could be affected by labor market conditions, the recent performance of the economy and the labor market must always be taken into account in the course of evaluating the adequacy and equity of benefits. This is particularly true for this study because the period leading up to implementation of SB863 spanned the Great Recession of 2008-2009, the most severe economic downturn since the Great Depression.

As a consequence of the collapse of the housing market and the stock market in 2007 and 2008, the nationwide unemployment rate rose from its low of 4.4% in May 2007 to 10.0% in Oct 2009. During the same period, the average weekly hours of workers in the private sector declined from 34.6 in 33.8. While reductions in hours and employment are typical of U.S. recessions, the Great Recession was unusual in that the rate at which unemployed workers found new jobs or exited the labor force was the lowest since the Second World War (Elsby, Hobijn et al. 2010). The Great Recession's impact on California's labor market was far more severe than in the nation as a whole, as illustrated by Figure 2.1. According the Bureau of Labor Statistics (BLS), the unemployment rate among Californian workers rose from 5.2% in May 2007 to 12.2% in October 2010, higher than the national rate by 2.2 percentage points. As a consequence of this dramatic swing in the level of labor demand, workers injured during and after the great recession would face very different conditions from workers injured earlier as they recovered and returned to work.

Figure 2.1
2005-2014 Unemployment Rates in California vs Rest of US

The Great Recession was notable both for the severity of unemployment and in the weakness of the subsequent labor market recovery. The presence of a large surplus of unemployed, underemployed, and discouraged workers may have contributed to a slow labor market recovery, including unusually slow wage growth following the recession. Some economists have attributed the weakness of the recovery to the fact that the recession was triggered in part by the financial crisis, as economies that suffer recessions triggered by financial crises historically take between five and ten years after the financial crisis to reach the pre-recession level of output (Reinhart and Rogoff, 2014). Others have warned that the depth of the recession caused a lasting reduction in the economic potential of the U.S. economy: Summers (2014) estimates that potential US GDP in 2014 was only 90% of the value that would have been expected before the financial crisis. While unemployment rates at the time of this report's completion have returned to levels characteristic of the period before the great recession, the labor market recovery remained far from complete at the time that the SB863 reforms were implemented.

The downturn and the subsequent recovery affected the frequency of indemnity claims in California. According to the Workers' Compensation Insurance Rating Bureau of California (WCIRB), a long-run pattern of declining claims frequency—driven by the shift towards less hazardous industries—was sharply broken in 2010. Since 2010, the rate of indemnity claims per 1,000 workers has been increasing steadily, as depicted in Figure 2.2 (WCIRB 2013). The report

explains that the recession impacted the trend in multiple ways. First, the proportion of cumulative injury claims rose during with the recession and then remained high. Secondly, as the economy recovered from the recession, the frequency of claims rose because workers who entered the system were less experienced and thus more likely to suffer work injuries. While these figures include many cases that do not progress to permanent partial disability, the shifts in trends noted by the WCIRB strongly suggest that systematically different types of workers--with potentially different earnings prospects--may have been injured during and after the recession than were injured before the recession. We examine this possibility in detail in Chapter 4.

Figure 2.2
Indemnity Claims Rates by Year, Insured Firms

Source: Workers' Compensation Insurance Rating Bureau of California (WCIRB), *Analysis of Changes in Indemnity Claim Frequency — 2013 Report*. 2013, Workers' Compensation Insurance Rating Bureau of California

Another aspect of unemployment during the downturn was that the impact varied across demographic groups, in terms of sex, age, education and race. Men, workers under 25, workers without college education, and black and Hispanic workers were more affected than other groups (Elsby, Hobijn et al. 2010). Some scholars have also documented differences in outcomes between workers with disability and those without. While both groups suffered significant declines in labor force participation and employment rates between 2006 and 2010, evidence points to weaker recovery for the disabled workers: the unemployment rate among workers without disability rose from 4.6% in March 2006 to 10.0% in 2010 and then fell to 8.2% in 2012 whereas the rate among those with disabilities rose from 12.6% in March 2006 to 18.3% in the same month of 2010 and had climbed another 2.7 percentage points two years later (Livermore and Honeycutt 2015).

The BLS data make it clear that the dramatic changes in economic and labor force conditions during the great recession had substantial impacts on the employment of all workers. However, workers experiencing new, occupational disabilities during a downturn may face a very different constellation of factors affecting retention of employment. On the one hand, special protections

for workers experiencing occupational injuries, built into the Labor Code and case law may mitigate the impact of a recession. On the other hand, if occupational injuries lead to more frequent job separations, injured workers may be especially vulnerable to post-injury job loss with associated negative impacts on future long-term income. Very little research has addressed the impact of the business cycle on outcomes for injured workers. A major focus of this report is to address this gap so that the impact of SB863 can be evaluated with the greatest possible accuracy.

3. Methods

The policy questions posed in this report center on earnings losses, impairment ratings, and benefits among permanently disabled workers. We measure these outcomes by analyzing administrative data from several state agencies. This section describes the methods we use to measure earnings losses and provides an overview of our data sources. We measure economic outcomes using the matching methodology used in numerous prior RAND studies for CHSWC, including Peterson, Reville et al. (1997), Reville, Boden et al. (2001), Reville and Schoeni (2001), Reville, Schoeni et al. (2002), Reville, Seabury et al. (2005), and Seabury, Reville et al. (2011). We also illustrate our method by providing estimates of the impact of injury on earnings and employment for the average worker injured between 2005-2012.

Measuring Losses from Injury

We describe the empirical challenge to estimating earnings losses using Figure 3.1, which illustrates the hypothetical losses from a permanently disabling workplace injury. The dashed line represents the “potential” earnings a worker would have in the absence of an injury. Potential earnings increase over time, representing the increased earnings associated with increasing experience in the labor market or increasing tenure at the employer. The solid line represents the actual earnings of the injured worker. At the time of injury, the worker receives no earnings for some time while recovering from the injury. This is the period during which workers’ compensation temporary disability benefits are received.

Figure 3.1: Hypothetical Effect on Earnings after a Workplace Injury

At some point, the worker returns to work, perhaps in some modified capacity. In the example in the figure, the worker returns at lower earnings than prior to injury. The worker recovers earnings over time, as the wages converge closer to what they would have been absent

the injury. In this example, at the end of the observed period the worker makes more than she made prior to the injury, but not as much as she would have made if she had not been injured.

The shaded area in the figure represents the total lost earnings over the period after the injury. Estimating the size of this area and determining what fraction is replaced by workers' compensation benefits are the goals of this analysis. Whereas wages received while the claimant is injured are readily observable (the solid line in Figure 3.1), the challenge in estimating earning losses lies in estimating what the workers would have earned if uninjured, represented by the dotted line.

This example illustrates the metrics we can use to estimate the economic impact of a disability. The shaded area in Figure 3.1 represents the total earnings lost as a result of the disability. To measure the length of time out of work, we can measure whether the employee has returned at different points after injury, i.e., measuring the point of return to work. Whether we evaluate the impact on the actual dollars earned or the time out of work, both represent adverse outcomes for injured workers.

Administrative Data Sources For Studying Earnings Losses

Our data in this study are similar to the data used in past studies, (e.g., Peterson, Reville et al. (1997), Reville, Seabury et al. (2005)). Workers' compensation claims data are linked to earnings data for the claimant based on their Social Security Number, and this information is combined with earnings data to identify the control group. We use data on workers' compensation claimants from two sources: the Workers' Compensation Information System (WCIS) and the California Disability Evaluation Unit (DEU).

Workers' Compensation Information System (WCIS) Data on Claims

The Workers' Compensation Information System (WCIS), which was developed and is managed by the Department of Industrial Relations (DIR), was legislated in 1993 and implemented starting in 2001. Information at the individual claim level is transferred from claims administrators to DIR using the Electronic Data Interchange (EDI) formats developed by the International Association of Industrial Accident Boards and Commissions (IAIABC). In 2001, DIR began collecting EDI versions of the First Reports of Injury (FROI), which include detailed information on the injured worker, employer, nature of the injury and event leading to injury. Subsequent Reports of Injury (SROI) data are also included and are transaction-level data on indemnity payments, lost time, and the timing of important events on a claim like return to work and claim closure. In 2007, DIR began collecting transaction-level medical treatment data at the claim level, including procedures, diagnoses, and payments. In addition, claims administrators are required to report at least annually on individual claim-level data on benefits paid to date, including both medical payments and indemnity payments by type of indemnity.

These data represent an important source of information for analyzing and evaluating the California workers' compensation system. However, there are a number of limitations. Most important, while improving over time, these data are incomplete with a substantial (but unknown) fraction of claims administrators not reporting any information beyond the FROI.

Consequently, the WCIS may not be representative of the system as a whole and the representativeness and composition may change over time. Again, reporting has been improving over time due to efforts by DIR: recent statutory changes authorizing financial penalties for noncompliance are expected to increase participation, and technical difficulties that interfered with data submission have been addressed in recent years.

One additional concern regarding the WCIS is that data quality is likely to vary across data elements. In some cases, problems arise because claims administrators have discretion in reporting that makes it inadvisable to take the information in WCIS at face value. In our study, this concern is most serious with respect to detailed information about the type and severity of permanent impairments reported to the WCIS. The "permanent impairment percentage" referred to in the instruction manual for claims administrators could reasonably be construed to mean the standard rating associated with an impairment, the final rating before apportionment (after adjustments for future earnings capacity, occupation, and age), or the final rating after apportionment. A related concern is that permanent disability information (the impairment type, rating percent, and incurred indemnity amounts) may be estimated early in the life of a claim for initial reporting and insurance reserving purposes, but may not be updated to reflect a worker's actual impairment rating. We treat permanent disability information in the WCIS as a noisy measure of impairment severity but never take it at face value to calculate statutory benefits or identify PPD beneficiaries.

Furthermore, like most administrative systems, data elements that are not critical to administration on the claim can be subject to inconsistent and inaccurate reporting. For example, paid amounts will generally be accurate because they track important administrative information and are mandatory data elements on the relevant reports, but other details that would be valuable for our analysis, such as the date when the claimant obtained legal representation, may not be reliably or accurately reported because they are not required data elements in the EDI system underlying WCIS.

While these limitations mean that WCIS data has to be analyzed with care, the WCIS remains an extremely valuable resource. It may be most useful to consider the WCIS as representative of paid data for the private sector, since there are considerable gaps in local government reporting. Beyond that limitation, and if care is taken to limit some analyses to a subset of higher quality reporting entities, information on the cost of claims, duration of disability, medical treatment patterns and costs and trends in all cost components over time can be reliably estimated.

DWC extracted all FROI and SROI data in the WCIS for cases with injury dates of injury in 2005 or later. The data were current as of September, 2014. DWC provided us with a de-identified file containing selected data elements from these records.

Disability Evaluation Unit Data on Ratings

Disability ratings determine the level of statutory permanent partial disability benefits in California. The permanent disability (PD) rating is a number between 0% and 100% that indicates the severity of permanent disability, with higher numbers indicating greater severity and leading to larger amounts of indemnity payments for permanent partial disability. While

disability ratings are critically important for determining the level of indemnity payments for permanent partial disability, they do not affect a worker's access to compensation for medical care. It is worth noting that, for injuries occurring between 2004 and 2012, the PD rating did affect the value of the Supplemental Job Displacement Benefit (SJDB). The SJDB, which is a voucher for educational and vocational rehabilitation services available to workers who do not receive a qualifying offer to return to work at the at-injury employer, ranged in value from \$4,000 for low PD ratings (below 15%) to \$10,000 for the most severe ratings (50% or higher) (Labor Code Sec. 4658.5). SB863 set the value of the SJDB to a constant \$6,000 regardless of disability ratings for injuries in 2013 or later years, so the PD rating no longer affects access to vocational rehabilitation (Labor Code Sec. 4658.7). Earnings loss estimates in our study should be interpreted in the context of the SJDB, meaning that access to vocational rehabilitation was somewhat higher for workers with higher PD ratings.⁸

When a worker's impairment has reached *maximum medical improvement*, meaning that "his or her condition is well stabilized and unlikely to change substantially in the next year with or without medical treatment," a physician can evaluate the severity of the impairment and produce an impairment rating for each distinct impairment that may lead to a loss of earnings capacity lasting beyond the date of maximum medical improvement (Division of Workers' Compensation, 2005). Disability ratings are assigned according to procedures outlined in the *Schedule for Rating Permanent Disabilities* (PDRS) issued by DWC, which specifies rules for combining multiple impairments and calculating *final* ratings (which are used to determine benefits) from the *standard* ratings assigned to a worker's specific impairments.

As discussed above, the WCIS is not a reliable source for detailed information about PD ratings. In order to get a sample of claims with more reliable data on ratings and precision on the type of impairment, we use data from the Disability Evaluation Unit (DEU). The DEU is a unit within the Division of Workers' compensation that reviews medical reports to produce a disability rating.

The DEU ratings include precise data on:

- Type of physician evaluating the worker (treating physician, Qualified Medical Evaluator (QME) or Agreed Medical Evaluator (AME))
- Whether the case is represented
- Impairment(s)
- Percent impairment for each impairment
- Impact of occupational adjustment
- Impact of age adjustment
- Impact of apportionment, if any

From the DEU, we received transaction data for claims rated between 2005 and May 2015. The DEU performed an average of 90,000 ratings on approximately 60,000 unique claims each

⁸ SJDB eligibility and payments are not consistently reported in our WCIS data, and we do not include SJDB payments in our estimates of statutory benefits. We note that the range of SJDB payment amounts (\$4,000 to \$10,000) in place from 2004-2012 is very small compared to the range of statutory benefits.

year. In the early years the ratings were primarily for claims rated under the pre-2005 PDRS. In the later years, 95% of ratings are under the AMA-based rating schedule. For this study, we excluded claims rated under the pre-2005 PDRS, concentrating solely on ratings under the AMA-based schedule. Each DEU rating follows a specific format, dictated by the AMA Guides and the California Permanent Disability Rating Schedule (PDRS). The standardization of this format allowed us to parse the ratings data (which are entered as text) and, with some data cleaning, construct an analytic dataset capturing each step in the disability rating process.

Each impairment evaluated by the evaluating physician is identified by an "Impairment Number," which is listed in the PDRS and corresponds to the chapter and section in the *AMA Guides, 5th ed.* A rating in units of *Whole Person Impairment* (WPI) is assigned by the DEU rater based on the impairment number and the description supplied by the doctor. Each impairment number has an associated *Future Earnings Capacity* (FEC) factor. The product of the WPI and the FEC gives the standard rating after adjustment for FEC. Under SB899 the FEC ranged from 1.1 - 1.4 depending on the impairment. Under SB863, the FEC takes a single value, 1.4.

Next the rater assigns the worker to one of 43 occupational groups based on a description of the worker's primary job at injury. Each occupation group-impairment number pair is associated with an Occupational Factor, a letter between C & J based on how the impairment is thought to interact with the occupational demands of the worker's job to affect future earnings. The impact of the Occupational Adjustment depends on the letter and the FEC adjusted standard rating. As an example, an FEC adjusted standard rating of 10% with a "C" occupational adjustment (lowest factor) would be reduced to 7% while the same rating with a "J" adjustment (highest) would be increased to 16%.

The DEU rater then adjusts the rating for age. Ratings are reduced for workers younger than 37 and increased for workers older than 42. The younger or older the worker, the larger the magnitude of the adjustment. Again assuming a 10% rating after occupational adjustment, a 21 year-old worker would have the rating reduce to 8% and a 62 year-old worker would be increased to 13%. The age-adjusted rating is the final rating before apportionment, if any.

The doctor's report is required to indicate whether any of the final disability rating should be apportioned to non-industrial cause, reducing the rating. Apportionment is not consistently observed for all DEU ratings. If the worker is unrepresented, the rating reliably indicates if apportionment should be applied (as reviewed by a workers' compensation administrative law judge) and the percent of cause that is industrial. However, if the worker is represented, apportionment is calculated only if the parties request it, and the data do not reflect any decision on whether the doctor's finding meets the legal standards required under statute and case law.

Each doctor's report can evaluate one or more impairments for each worker. Of cases evaluated under SB899, 65.4% of workers have a single impairment evaluated, 19.3% have 2 impairments and 15.3% have three or more impairments evaluated.

Each unique claim in the DEU data can have more than one doctor's report. This led to several situations that required decisions on how to determine the final disability rating.

- A doctor can submit an updated evaluation on a claim where the impairment has evolved. In this case we chose the latest report, chronologically.

- A second report can be written by a specialist covering a separate impairment. In this case we combined the two reports using the rules for combining disabilities under AMA Guides.
- A second, comprehensive report by a different physician (most commonly an AME), subsequent to an initial treating physician or QME report, could be submitted when agreed to by the parties. We used the latest report, chronologically.

A single doctor's report can also be rated more than once. This occurs when one or both parties request a rating under the AMA Guides and a rating based on the case law standard established by the *Almaraz en banc* decision by the WCAB. When there was both an AMA guides and *Almaraz* rating, we used the AMA Guides for the primary analyses presented here.⁹ The implications of the *Almaraz* decision are potentially important for the disability rating system, however, and we discuss them at length in Chapter 5 of this report.

Some doctors' reports rated 0% under the AMA *Guides*, before apportionment. These were excluded from most analyses. We explicitly state when claims rating 0% under the AMA *Guides* are included. Finally, some reports were considered "not ratable" by the DEU because the reports were incomplete or the worker was not yet P&S. These reports were also excluded from analyses.

We match data from the DEU and WCIRB to earnings data from the Base Wage file maintained by the California Employment Development Department (EDD). Every quarter, employers covered by Unemployment Insurance (UI) in California are required to report the quarterly earnings of every employee to the EDD. These reports are stored in the Base Wage file. The industries covered by UI are virtually identical to the industries covered by workers' compensation and therefore a worker injured at a firm for which he or she can make a workers' compensation claim should also have a record for that quarter in the Base Wage file. With roughly 95 percent of employees in California covered by the UI system, the matched DEU-EDD data provide a substantially complete and accurate California quarterly earnings history for permanent disability claimants. We collected wages for all workers from the first quarter of 2003 through the second quarter of 2014.¹⁰ The linked EDD-WCIS and EDD-DEU data were assigned a scrambled social security number using an algorithm at EDD. Directly identifying data elements (names and unscrambled social security numbers) were removed from all EDD files before being transferred to RAND.

⁹ Among reports rated by the DEU between 2013-15, 20% of reports on unrepresented cases and 25% of reports on represented cases included both an AMA rating and an alternative rating under *Almaraz*. When the DEU calculates an *Almaraz* rating, the rater almost always calculates the AMA rating as well.

¹⁰ Data is not available in every year for every worker that we observe at the time of injury. In some cases, injured or comparison workers drop out of the sample and we do not know if they left the state, stopped working, or became self-employed. We assume that workers are not working (i.e., have zero earnings) in quarters when they have no wages reported to EDD. This could bias us towards over-estimating earnings losses if workers' compensation claimants are more likely to leave the state or become self-employed. Reville and Schoeni (2001) explore this issue using the CPS, and find no evidence that workers' compensation recipients are significantly more likely than nonrecipients to exit the state or to have self-employment issue.

Roles of WCIS and DEU Data in This Study

The WCIS and the DEU have complementary strengths and weaknesses, so we rely on them to address different aspects of our research questions.

In this study, we treat the WCIS as our primary data source for estimating trends in earnings losses among PPD claimants in Chapter 4. Estimation of trends in outcomes through recent injuries is a major objective of this report, but differences in the timing of data capture in the WCIS and the DEU lead to substantially greater data lags between the injury date and the appearance of a case in the DEU. Figure 3.2 illustrates these differences using a stylized flowchart of a worker's progression from injury to recovery and permanent impairment (in the left-hand column) and the timing of data capture in the WCIS and the DEU. Workers with a high probability of permanent disability can be identified in the WCIS by the receipt of PPD benefit payments, which must be reported to the WCIS within 14 days after benefit payments begin.¹¹ In contrast, workers' evaluating physician reports can take months or even more than a year after reaching maximum medical improvement to reach the DEU, which makes it difficult to examine trends for recently injured workers using the DEU. The majority of the lag between injury and DEU evaluation is likely driven by the duration to maximum medical improvement (and is inherent in the disability process since permanent impairment cannot be assessed before maximum medical improvement has been reached). However, additional administrative frictions (such as scheduling a QME examination, submission of a report to DEU, and the evaluation itself) could potentially lead to delays in the DEU evaluation process.

Notwithstanding these data lags, the DEU is the superior data source for analyzing disability ratings and statutory benefits because disability ratings and impairment numbers are frequently missing in the WCIS. They are also subject to substantial ambiguity in WCIS because of discretion exercised by claims administrators in how to report these data elements. These limitations make it essentially impossible to simulate the impact of SB863 on ratings and statutory benefits using the ratings data in the WCIS, but the DEU provides sufficient detail to make these calculations fairly straightforward. We treat the DEU as our primary source on ratings and statutory benefits, and we work with the DEU exclusively in our analysis of the equity impacts of SB863. Because incomplete reporting of injuries at public entities is a concern in the WCIS, we provide some evidence on trends in wage loss stratified on industry. In addition, we report (in the Appendix) trends in benefit adequacy using data from the DEU, which provides more reliable coverage of public-sector entities.

Benefit adequacy must be measured using data on both earnings losses and benefits. We conduct our analysis of benefit adequacy by combining data from both systems to address the

¹¹ Payment of advance PPD benefits before a worker has reached maximum medical improvement may lead us to erroneously include in our sample some workers who are later determined not to qualify for PPD benefits. Unfortunately, we found that other data elements that might be used to confirm permanent disability (such as data on the impairment number or the PD rating) are frequently missing in the WCIS. When we examined cases with both DEU and WCIS data, we found that the cases that were missing these other data elements were no less severe on average than cases with complete data on PD ratings in the WCIS. We conclude that PPD benefit payments our best option for identifying permanently disabled workers in the WCIS.

missing data problems in the WCIS. Estimation of benefit adequacy for both populations of cases also allows us to verify the robustness of our findings to the differences in the two datasets.

Figure 3.1
Timing of Data Capture in DEU vs WCIS

The left column lists milestones in the course of a worker's progression through the workers' compensation system. The right column describes the data capture that is triggered by each of these events. Blue parallelograms depict the filing of FROI and SROI with the WCIS. The green diamond depicts creation of a record in the DEU's administrative database. Note that the timing of the start of PPD benefits under SB899 usually preceded the date of P&S, but under SB863, benefits will start after P&S for workers that return to work at the at-injury firm at the end of TTD.

Employment Development Department: Data on Earnings and Employment

We match data from the DEU and WCIS to earnings data from the Base Wage file maintained by the California Employment Development Department (EDD). Every quarter, employers covered by Unemployment Insurance (UI) in California are required to report the quarterly earnings of every employee to the EDD. These reports are stored in the Base Wage file. The industries covered by UI are virtually identical to the industries covered by workers' compensation and therefore a worker injured at a firm for which he or she can make a workers' compensation claim should also have a record for that quarter in the Base Wage file. With roughly 95 percent of employees in California covered by the UI system, the matched WCIS-EDD data and DEU-EDD data provide the most complete and accurate California quarterly earnings history for permanent disability claimants. We collected wages for all workers from the first quarter of 2003 through the fourth quarter of 2013; for workers injured in 2011 or later, we refreshed the wage histories with 2014 earnings data to allow valid comparisons with earlier cohorts of injured workers.¹² Overall, 86.1% of social security numbers appearing on a FROI matched to an earnings history with wage data in the quarter of injury.

We frequently observed multiple records per individual for the same quarter in the quarterly wage files. Multiple records can be accounted for by name changes due to marriage, variations in how employers submit names (i.e. John vs Jonathan), typographical errors, and illegal use of SSNs. To adjust for these issues and capture all the wages for an individual by quarter and over time, we applied the Soundex phonetic filing system to the first and last name and applied a series of tests for the consistency of names across earnings records and over time. In order to qualify for inclusion in the sample, one of the following conditions had to be met for all wage records with an SSN matching the WC claim:

1. Same last name for all wage records
2. Multiple last name but single first name (to allow for name changes due to marriage)
3. First and last names meet conditions 1 and 2 except for quarters where first name used in other quarters is entered as last name and vice versa
4. First and last names meet conditions 1 and 2 except for quarters where the first name is entered as an initial matching the first name used in other quarters

We required consistent names on all earnings records over a three-year window (1 year pre-injury and 2 years post-injury) surrounding the quarter of injury in addition to the quarter of injury itself. Because of these data limitations, wages were not available for approximately 6% of injured workers that initially matched to a wage history in both the WCIS and DEU.

¹² See appendix for details.

Data is not available in every year for every worker that we observe at the time of injury. In some cases, injured or comparison workers drop out of the sample and we do not know if they left the state, stopped working, or became self-employed. This could bias us towards over-estimating earnings losses if workers' compensation claimants are more likely to leave the state or become self-employed. Reville and Schoeni (2001) explore this issue using the CPS, and find no evidence that workers' compensation recipients are significantly more likely than nonrecipients to exit the state or to have self-employment income.

All dollar values, including wages, indemnity benefits and other variables such as medical costs, were converted into 2014 dollars using the Consumer Price Index published by the U.S. Department of Labor Statistics.

Using Matched Uninjured Co-Workers as a Control Group

We estimate uninjured earnings in the post-injury period using the earnings of a matched comparison (control) group. The comparison group is made up of workers similar to the injured workers in the pre-injury period, but who did not experience a workplace injury during the time period under examination.

For each injured worker we selected up to 5 workers employed at the same firm at the time of injury who had earnings close to the injured worker's over the year prior to injury. We define "close" as being within a band equal to the wage of the injured worker plus or minus 15% of the log standard deviation of the earnings of all injured workers. The comparison workers were also required to have similar tenure at the at-injury employer prior to the quarter of injury, where tenure is measured using three levels: less than or equal to one year on the job, one to two years, or more than two years. If more than 5 comparison workers met the matching criteria, we selected the 5 workers with the lowest absolute value of the difference in wages from the injured workers (ties were decided randomly). We sampled with replacement, meaning the same comparison workers could match to more than 1 injured worker. If a worker was injured in a later year, however, they were not allowed to be a comparison worker.

Table 3.1

Control Worker Match Rate by Size of At-Injury Employer

Number of Employees	Percentage Matching At Least 1 Control	
	WCIS	DEU
1-10 Employees	23.2%	19.3%
11-50 Employees	62.0%	54.1%
50-100 Employees	81.6%	73.3%
101-500 Employees	92.7%	86.1%
501-1000 Employees	97.4%	92.0%
1001-5000 Employees	98.8%	94.3%
Over 5000 Employees	99.4%	94.8%
Overall Match Rate	88.9%	78.1%
Number of Injured Workers with a Matched Control	357,212	185,031

The table reports the fraction of workers with at least one valid matched control by employer size. The denominator used to calculate these match rates is the population of workers' compensation claims that were matched to a valid wage history.

For the WCIS, we restricted attention in this calculation to workers injured in 2005-2012 with paid PPD indemnity benefits

Here we describe formally how we use the matched data to estimate earnings losses. Let y_t^I represent the injured worker's earnings (where I denotes "injured" and the subscript t denotes "time from the injury"). Let y_t^U represent the comparison worker's earnings (where U denotes "uninjured"). We estimated y_t^U using the average earnings of the n comparison workers for that individual injured worker, where n is between 1 and 5, depending upon the number of available comparable uninjured workers at the injured worker's employer. For any injured worker, the undiscounted earnings loss between the time of injury, which we denoted as $t = 0$, and some future date, T , is shown in Equation 1.

$$(1) \quad \text{earnings loss} = \sum_{t=0}^T (y_t^U - y_t^I)$$

Usually, when we report earnings losses we report the average of the quantity in Equation 1 across all injured workers.

In some sense, return to work is easy to measure: we simply observe whether or not an individual is working (and at what point) after an injury occurs. In some cases, however, injured workers may exit the labor force for reasons totally independent of their disability. Simply asking whether or not disabled workers are working in the post-injury period ignores the possibility that they may not have worked even in the absence of a disability. Thus, to estimate the impact of injuries on return to work it is necessary to compare the likelihood that disabled workers are working in the post-injury period compared to the likelihood that uninjured "control" workers are working.

We can formally define our return to work estimates as follows. Let h_t^I be a variable that equals 1 if earnings are reported by an injured worker in quarter t (i.e. if $y_t^I > 0$), and let h_t^U be a similar indicator for uninjured workers (we focus on quarters because the data we propose to use is quarterly earnings data). If a person has earnings reported in that quarter then we presume they are working in that quarter. Furthermore, let $Pr(h_t^I)$ and $Pr(h_t^U)$ denote the probability that injured and uninjured workers report positive earnings in quarter t . In general we do not observe the probability that an individual works, we simply observe whether or not they work. However, aggregating into the fraction of individuals who work provides us with an estimate of the probability that an individual works. We can thus define return to work in a given quarter as

$$(1) \quad \text{relative employment}_t = \frac{Pr(h_t^I)}{Pr(h_t^U)}.$$

In some cases we might ask whether or not an individual returns to the at-injury employer.

Return to the at-injury employer can be examined in a similar fashion, with the h_t variables only equaling 1 if the injured worker reports earnings from the at-injury employer.

One limitation of this matching procedure is that it is more difficult to match individuals in smaller firms, thus we are unable to estimate losses for many of these workers. Table 3.1 reports

the match rate for both the WCIS and DEU samples. The match rate in the WCIS is lowest for small firms and climbs steadily to reach 99% at the largest employers. Because employer size may be an important predictor of post-injury outcomes, we apply a weighting methodology used in previous RAND studies to correct our estimates for match failure.¹³ The corrected estimates are valid for the total population of cases appearing in WCIS, not just those with a matched control worker.

Overall Patterns of Earnings and Employment for Permanently Disabled Workers

Figure 3.3 plots average earnings over time relative to the quarter of injury for all WCIS injured workers and matched controls. As described above, control workers are selected on the basis of earnings over the four quarters preceding the quarter of injury. This match window is shaded gray in Figure 3.3. The earnings profiles for control and injured workers match closely over this time period.

¹³ See Bhattacharya, Neuhauser et al. 2010 for a full description of this method.

Figure 3.3
Earnings by Date Relative to Injury for Injured and Control Workers, 2005-2012

The quarter of injury is indicated by the black vertical line at zero in Figure 3.3. Because wages are observed at the quarterly frequency, only a slight decline in earnings due to injury is visible in the quarter of injury.¹⁴ This reflects the fact that injuries are distributed approximately evenly throughout the quarter of injury, so that many workers remain healthy (and continue to earn wages at their usual rate) throughout a large portion of the quarter of injury. A much larger decline is apparent beginning immediately after the quarter of injury. By this time, all injured workers in our sample have already become disabled, but many have already returned to work.

Following the sharp drop in the first post-injury quarter and a further decline in the second post-injury quarter, average earnings for injured workers stabilize by the fifth post-injury quarter. While a small downward trend in earnings is evident over the second post-injury year (five to eight quarters post-injury), the earnings profile for injured workers is much closer to parallel with the profile for control workers.

¹⁴ The earnings profile for injured workers appears to decline prior to the quarter of injury because the data underlying Figure 3.2 are measured at fixed intervals rather than continuously. We have drawn lines in our figures to connect these quarterly observations in order to improve readability.

The critical assumption underlying our method is that injured worker earnings would have followed the same time profile as control worker earnings if the injured workers had not experienced an injury. This assumption cannot be tested directly, but it is possible to provide indirect validation of this assumption by examining match quality prior to the injury. Figure 3.4 shows that injured and control worker wages during the match window are very similar.¹⁵ The similarity between control and injured worker wages is by construction, so it does not provide any evidence on the validity of our method. A comparison of injured and control worker wages over the period prior to the match window (-8 to -5 quarters relative to the quarter of injury) is more informative because we did not use any information about wages in this earlier period to define the control group. The match between control and injured worker wages over this earlier period is nearly as close as the match during the match window, increasing the plausibility of our assumption that earnings for control and injured workers would have evolved identically if the injury had not occurred.

Even though, by construction, the control workers do not experience a workplace injury, there is also a clear trend break at the quarter of injury in the earnings profile for control workers. This may seem anomalous, but it merely a reflection of our sampling scheme in conjunction with ordinary labor market dynamics. Workers must be employed in order to be at risk of a workplace injury, and we require our matched controls to be employed during the quarter of injury, so our control worker sample has a 100% employment rate in the quarter of injury by construction. No sizable population, however, maintains a 100% employment rate indefinitely: natural attrition from the workforce due to both voluntary and involuntary job separations tends to reduce average earnings for a population of workers as their employment status reverts toward a long-run average that may be well below 100%.¹⁶ While wages tend to rise over time for workers who remain continually employed, the inclusion of workers who leave employment after the quarter of injury outweighs wage growth. In short, the trend break in control worker earnings is not a statistical artifact; it reflects the impact of mean-reversion on earnings dynamics and is thus important to account for in estimating earnings losses due to injury.

The importance of movement in and out of employment as a determinant of earnings dynamics is evident from Figure 3.4, which presents the fraction of injured and control workers who are employed as a function of time before and after the quarter of injury. Interestingly, employment for injured workers declines more smoothly after the quarter of injury than earnings. One possible explanation for this pattern may be that some workers attempt to return to work in the first post-injury quarter but subsequently separate from the at-injury employer. Regardless, the shape of the injured and control worker employment profiles and the magnitude of the post-injury decline for injured workers relative to control workers become very similar to the time profiles for earnings by the fourth post-injury quarter. This pattern is similar to findings in previous RAND wage loss studies of injured workers, as well as research suggesting that

¹⁵ We present further match quality diagnostics of possible interest to technical readers, including the average imbalance and absolute imbalance, in Appendix A.

¹⁶ The employment-population ratio for adults aged 18 to 64 in California between 2005-2012 was 64.4%. (Authors' calculations from Census Bureau population estimates and BLS QCEW data.)

decreased employment is the predominant channel through which poor health reduces labor earnings, rather than lower wages or reduced hours among those remaining employed (Currie and Madrian 1999).

Figure 3.5 presents post-injury trends in the probability of employment at the at-injury firm for injured and control workers. The pattern immediately following the date of injury strongly resembles the profile of overall employment. However, comparison of Figure 3.5 to Figure 3.4 shows that injured workers experience steady reductions in at-injury employment over the first two post-injury years, whereas overall employment stabilizes more rapidly. Control worker employment at the at-injury firm also decays steadily, but not by as much as is observed among the injured workers.

Readers may be struck by the lack of convergence between injured and control worker earnings, and one might hope that injured worker earnings would recover more fully. Unfortunately, large and persistent losses are a defining characteristic of the post-injury earnings trajectory for the average worker with permanent partial disability. In the Appendix, we present figures detailing five years of post-injury earnings and employment losses for workers injured in 2008 and earlier.¹⁷ Earnings profiles for injured and control workers are nearly parallel after the second post-injury year, leading to nearly flat proportional earnings losses. Relative employment shows more improvement after the second post-injury year, but this is driven entirely by declines in the employment of control workers: the fraction of injured workers who are employed also continues to decline, but at a slower rate than observed among the controls. Employment at the at-injury firm, in contrast, continues to decline relative to control workers after the second post-injury year. Given the differing patterns of relative overall employment, relative at-injury employment, and relative earnings, the role of post-injury job transitions in the earnings history of injured workers would be a promising topic for future study. In the present study we focus primarily on earnings losses, which are the most important outcome measure for assessing the adequacy of PPD benefits.

¹⁷ See Appendix Table A.3 and Appendix Figures A.1-A.3 for injured and control worker employment profiles covering five post-injury years.

Figure 3.4
Employment by Date Relative to Injury for Injured and Control Workers, 2005-2012

Match window shaded gray
 Relative employment measured at red vertical lines (4Q and 8Q post-injury)
 PPD Claimants in 2005-2012 WCIS

Figure 3.5
At-Injury Firm Employment by Date Relative to Injury for Injured and Control Workers, 2005-2012

As our primary measure of earnings loss due to injury, we focus on relative earnings over the second post-injury year. This window of time is shaded light red in Figure 3.3, so earnings losses can be depicted as the area between the injured and control worker earnings profiles that is shaded red. Throughout this report, we report post-injury earnings for injured workers as a percentage of control worker earnings over the same time period, which we refer to as *relative earnings*. Formally, relative earnings are defined as follows

Relative Earnings in Second Post-Injury Year

$$= \frac{\sum_{t=5}^8 (y_t^I - y_t^U)}{\sum_{t=5}^8 y_t^U}$$

Under the assumption that injured and control worker earnings would have been identical if the injury had not occurred, relative earnings less than 100% can be interpreted as evidence of earnings losses caused by the injury. The first row of Table 3.2 reports relative earnings at 1, 2, and 3 years post-injury for the average permanently disabled worker in WCIS with an injury date between 2005 and 2012. Relative earnings in the first post-injury year were 69% of control worker earnings, meaning that permanently disabled workers earned 31% less on average than

they would have if they had remained uninjured. Relative earnings recover slightly through the second and third post-injury years, reaching 70% of control worker earnings in the second year and 71% in the third year.

Table 3.2: Earnings, Employment, and Return to Work Over First Three Post-Injury Years

	First Post-Injury Year	Second Post-Injury Year	Third Post-Injury Year
Relative Earnings	69%	70%	71%
Relative Employment	73%	74%	76%
Relative At-Injury Employment	70%	63%	58%

Earnings, employment, and return to work over first three post-injury years relative to controls

Weights used to correct for match failure

WCIS injured workers receiving PPD benefits 2005-2012, unweighted N = 345,282

Third-year outcomes available only for 2005-2011, unweighted N = 320,770

Similarly, we measure employment for injured workers relative to control workers at the end of the first, second, and third post-injury years (i.e., in the fourth, eighth, and twelfth post-injury quarters).¹⁸ The fourth and eighth post-injury quarters are indicated by vertical lines on Figure 3.4. The second row of Table 3.2, which reports relative employment for the average injured worker in the WCIS, indicates that injured workers are 73% as likely as control workers to be employed in both the fourth and the eighth post-injury quarters. Similar to the dynamics of earnings shown in Figure 3.3, relative employment recovers slightly in the third post-injury year and reaches 76% of control worker employment in the twelfth post-injury quarter. This improvement in relative employment, however, is driven by the fact that control worker employment declines faster than injured worker employment rather than by an increase in the level of employment among injured workers.

A third outcome measure that we examine is employment at the at-injury employer, defined by receipt of any wages from the at-injury employer. Figure 3.5 shows injured and control worker time profiles for at-injury employment. Compared to overall employment, which stabilized and began to increase slightly by two years post-injury, relative at-injury employment continues to decline steadily throughout the first two post-injury years. The third row of Table 3.2 reports that relative at-injury employment falls from 70% in the fourth post-injury quarter to 63% in the eighth post-injury quarter and then to 58% in the twelfth post-injury quarter.

¹⁸ We classify workers as employed if they have total wages from all employers in a quarter of \$200 or more.

Discussion

The evidence presented in this section is meant to familiarize the reader with the magnitude of earnings and employment losses due to permanent disability and to illustrate how our outcome measures are defined. With consistently defined outcome measures, we can begin to analyze differences in earnings and employment losses both between workers at a point in time and across cohorts of workers injured at different points in time. Of particular interest for this study are the effects of worker characteristics (such as age and gender), employer characteristics, and the type and severity of permanent impairment on earnings loss.

Although this report does not place a heavy emphasis on the relationship between job transitions, earnings losses, and long-term employment outcomes, Table 3.2 and Figures 3.3 highlighted some interesting differences in the dynamics of earnings, employment, and at-injury employment. The slow, sustained decline in relative at-injury employment is particularly interesting insofar as it suggests that injured workers may be at higher risk of job separations following an initial period of recovery. The distinction between initial return to work and successful return to work and the importance of post-injury job separations have been highlighted by other researchers (Butler, Johnson et al. 1995; Boden and Galizzi 2003).

The fact that relative employment recovers slightly over time suggests that at least some injured workers who separate from the at-injury employer are able to adapt to their impairments by changing jobs. However, the fact that the uptick in relative employment is not accompanied by higher relative earnings implies that some combination of lower wages and reduced hours among those injured workers who remain employed offsets any recovery in relative employment. While it is beyond the scope of this report, more careful study of the career paths of permanently disabled workers, perhaps with survey datasets that capture hours worked, could help shed light on the relative importance of wages and hours in post-injury earnings and begin to provide an evidence base that could help policymakers to more effectively mitigate earnings losses among permanently disabled workers.

We report outcomes over the first through third post-injury years in the body of the report to provide some insight into the dynamics of injured worker outcomes, but we focus primarily on earnings and employment during the second post-injury year. This choice is driven by data availability: the most recent available wage data at the time this report was prepared covered earnings through the end of 2014, so the most long-term outcome measure that can be consistently defined for all workers injured while SB899 was in place is relative earnings in the second post-injury year.

The second post-injury year is somewhat earlier than might be ideal for evaluating the consequences of permanent disability, since many permanently disabled workers are likely to be on Temporary Total Disability for at least a portion of this time window. This is problematic for several reasons. Conceptually, one might argue that earnings losses experienced during the total disability period should be excluded from consideration when assessing the adequacy and equity of permanent partial disability benefits: temporary total disability benefits are paid during this time period, so PPD benefits understate the level of compensation provided by the WC system. Similarly, workers who have not reached maximum medical improvement by the start of the second post-injury year also may not have seen their earnings and employment outcomes

stabilize sufficiently to capture their likely long-term outcomes. For example, workers who remain employed two years after injury have limited earnings losses relative to control workers in the long run, but still experience meaningful earnings losses in the immediate post-injury period before recovering.

Notwithstanding these limitations, we find that a worker's relative earnings in the second post-injury year (which implicitly captures the impact of changes in employment and return to work at the at-injury employer) are reasonably predictive of longer-term earnings losses.

To evaluate the potential for bias due to our focus on a short follow-up period, we examined long-term earnings profiles for workers injured in 2008 or earlier, for whom we obtained five or more years of post-injury data. These data, which we present in Appendix A, show that injured and control worker earnings profiles are very close to parallel after the second post-injury year. For earnings and employment, relative outcomes in the second post-injury year may be a reasonable proxy for long-term relative outcomes. Relative at-injury firm employment continues to decline steadily through the fifth post-injury year.

The data assembled for this report represent the best available evidence on disability ratings and the economic consequences of workplace injury for the population of injured workers who receive PPD benefits in California. No data source is perfect, however, and it is worth noting certain limitations inherent in the use of administrative data. Income sources other than labor earnings and workers' compensation benefits are not captured in our data, so it is important to bear in mind that our earnings loss estimates may not accurately capture *income loss* if disabled workers become more likely to obtain income from sources other than wage employment (including self-employment, pensions, social security retirement, or other forms of disability insurance). As in most administrative data sources, we do not observe workers' ethnicity, citizenship status, and English-language fluency, characteristics that may be correlated with economic vulnerability and the workers' ability to navigate the Workers' Compensation system.

Finally, readers should be aware that the population of interest in our study consists of injured workers who file workers' compensation claims. Many workers who experience occupational injury and illness never file workers' compensation claims, and the decision to file a claim is certain to be related to worker, employer, and injury characteristics in systematic and potentially complex ways (Azaroff, Levenstein, and Wegman, 2002). We simply cannot observe these injuries in workers' compensation claims data. Since the objective of this study is to evaluate workers' compensation policy, we do not view this as in any way a threat to the validity of our study. Rather, we mention this limitation in order to remind readers that they should exercise caution in extrapolating our findings regarding earnings losses to the wider population of workers who experience occupational injury or illness.

4. Outcomes for Disabled Workers Through the Great Recession

A major goal of this report is to evaluate how earnings losses and other labor market outcomes for permanently disabled workers evolved over the period between implementation of SB899 (at the start of 2005) and implementation of SB863 (at the end of 2012). Measurement of trends in labor market outcomes prior to SB863 is important for several reasons. First, changes in the economic impact of injury can induce changes in benefit adequacy because the generosity and equity of permanent disability benefits are measured relative to the economic impact of permanent disability. This is true even if there are no statutory, regulatory, or legal changes in the workers' compensation system. The estimates in this section will help policymakers understand the conditions under SB899 against which SB863 will be evaluated. Second, an understanding of what factors caused any observed changes in earnings losses is necessary to assess whether the important determinants of changes in earnings loss are amenable to policy interventions. Finally, earnings and employment of disabled workers may be interpreted as indirectly informative about their overall well-being. Labor earnings are the primary source of income for most American families with working-age adults, so dramatic reductions in labor earnings are likely to reduce well-being. Furthermore, employment is an important dimension of social participation for working-age adults with disabilities, and as such may be viewed as inherently valuable even though economic theory does not hold that people derive utility from working (Altman, 2001).

In this chapter, we document the overall time profiles of earnings and employment for workers experiencing permanent impairments as a consequence of occupational injuries occurring between 2005 and 2012. We then conduct analyses intended to answer the following questions:

1. What concurrent changes in the composition of the injured worker population took place over this period that may affect earnings and employment losses?
2. To what extent do these compositional changes explain the patterns observed in the overall data?
3. Is there evidence that changes in labor demand in the aftermath of the great recession have disproportionately affected disabled workers?

Changes in Overall Earnings Losses Between 2005-2012

To measure the time profile of earnings losses, we calculate average post-injury outcomes for all injured workers in each quarter of injury. After averaging together outcomes for each injured worker's matched controls so that each injured worker is weighted equally, we calculate average post-injury control worker outcomes for all injured workers in each quarter of injury. We then estimate aggregate earnings loss as the ratio of these two averages in each quarter of injury.

Figure 4.1 plots average injured worker earnings and average control worker earnings in the second post-injury year by quarter of injury. This figure illustrates the pattern in control and

injured worker earnings underlying the relative earnings measure that serves as our main outcome variable. The two time profiles move together in part for mechanical reasons, since we have selected the control workers to match the pre-injury earnings of the injured workers. The time profiles for both injured and control workers display marked seasonality, with spikes for workers injured in the first quarter of each year as well as their controls.¹⁹ While we see a slight downward trend in both injured and control worker earnings prior to the official beginning of the great recession in 2008, there is a larger and sustained decline after the first quarter of 2008 that appears to persist through the end of the sample period in 2012. We define overall relative earnings as the ratio of average injured worker wages to average control worker wages and plot this ratio over time in Figure 4.2.

Figure 4.1
Injured and Control Worker Earnings by Quarter of Injury

Figure 4.2 presents relative earnings for PPD claimants by quarter of injury between 2005 and 2012. The dominant feature of these data is the sharp decline in relative earnings after the onset of the great recession in 2008. Figure 4.1 showed that post-injury earnings for both injured

¹⁹ Seasonality is also apparent in statewide average wages, but statewide average wages are higher in the fourth and first quarters whereas the seasonal increase in wages is confined to the first quarter in the WCIS.

and control workers declined during the great recession; Figure 4.2 makes it clear that this decline was differentially severe for injured workers. The average worker injured in the first quarter of 2008 earned 27.4% less than his uninjured control workers did in the second post-injury year, whereas the average worker injured in the first quarter of 2009 earned 37.1% less in the second post-injury year. In just one year, earnings losses (defined as 100% minus relative earnings) increased by 9.7 percentage points, or 35% of losses as of the first quarter of 2008.

Figure 4.2
Relative Earnings by Quarter of Injury

Relative earnings measured over second full post-injury year (5 to 8 quarters after the quarter of injury).

Figure 4.2 shows a sharp decline in the relative earnings of permanently disabled workers beginning with those workers injured in 2008, which coincides closely with the timing of the great recession. Relative earnings appear to stabilize and recover slightly in 2009, but remain substantially lower than before the recession through the end of 2012. This decline was apparent across the distribution of relative earnings, and was not a statistical artifact of our choice to take

the average of quarterly earnings for injured and control workers separately before calculating relative earnings.²⁰²¹

Figure 4.3
Relative Employment by Quarter of Injury

Relative employment measured at end of second full post-injury year (eighth quarter after the quarter of injury).

²⁰We measure earnings loss trends by calculating average earnings for injured and control workers before calculating relative earnings. This procedure implicitly weights workers proportionally to their wage, with the highest-wage workers having the greatest influence on measured trends. In the interest of weighting all workers equally, it may be preferable to calculate relative earnings at the individual level before taking averages. However, it is not possible to calculate the average of individual-level relative earnings in a statistically reliable manner. We observed qualitatively similar trends in the median of individual-level relative earnings, which can be measured reliably. See Appendix Figure B.1 and Appendix B for details.

²¹Data on labor earnings frequently have large outliers that can make estimates of averages unreliable. We excluded workers from our sample if their quarterly earnings in any quarter exceeded \$250,000. 189 otherwise-eligible workers were excluded under this criterion. In order to assess the sensitivity of our results to our choice of cutoff for excluding outliers, we also estimated trends in earnings losses using \$1 million of quarterly earnings as the cutoff, which led to exclusion of only 18 cases, and with \$100,000 of quarterly earnings as the cutoff, which removed an additional 1,735 workers from the sample. The level of earnings losses and estimated time profiles of earnings losses are nearly identical under all three definitions. See Appendix Table B.11 for results.

Figures 4.3 and 4.4 illustrate the time profiles of relative employment and relative post-injury employment at the at-injury employer over this time period. Relative employment (Figure 4.3) followed a broadly similar trajectory to relative earnings, although it appears that relative employment was falling more steeply than relative earnings before the great recession. After reaching a trough among workers injured in the first quarter of 2009, relative employment follows a slight upward trajectory but remains substantially lower than before the recession through the end of 2012. Relative employment at the at-injury employer (Figure 4.4) follows a trajectory that is qualitatively similar to relative earnings and overall employment through 2010, but then drops further in 2011 and 2012.

Figure 4.4
Relative Post-injury Employment, At-Injury Employer by Quarter of Injury

Relative at-injury employment measured at end of second full post-injury year (eighth quarter after the quarter of injury).

In order to summarize the patterns illustrated in Figures 4.1-4.4, we aggregated injured workers into three cohorts based on the date of injury: pre-recession (2005-2007), recession (2008-2009), and recovery (2010-2012). Relative outcomes for these three cohorts of workers are reported in Table 4.1 at time horizons of one, two, and three years post-injury. Relative

earnings and employment in the second year after injury were 8 percentage points lower for workers injured during the recovery than for workers injured before the recession. Relative at-injury employment declined even more sharply, by 11 percentage points, between the pre-recession period and the recovery.

Table 4.1: Earnings, Employment, and Return to Work Post-Injury, By Date of Injury

A. Relative Earnings

	Injury Year 2005-2007	Injury Year 2008-2009	Injury Year 2010-2012
First Post-Injury Year	72%	68%	64%
Second Post-Injury Year	74%	67%	66%
Third Post-Injury Year	76%	68%	67%

B. Relative Employment

	Injury Year 2005-2007	Injury Year 2008-2009	Injury Year 2010-2012
Fourth Post-Injury Quarter	78%	71%	69%
Eighth Post-Injury Quarter	78%	70%	70%
Twelfth Post-Injury Quarter	80%	72%	73%

C. Relative At-Injury Employment

	Injury Year 2005-2007	Injury Year 2008-2009	Injury Year 2010-2012
Fourth Post-Injury Quarter	75%	69%	66%
Eighth Post-Injury Quarter	68%	61%	57%
Twelfth Post-Injury Quarter	63%	56%	52%
Number of Cases (Unweighted)	150,498	90,490	104,235

WCIS injured workers receiving PPD benefits 2005-2012

Third-year outcomes for 2010-2012 cohort available only for 2010-2011 cases

One might ask whether these large changes were driven by particular industries that suffered the most severe job losses during the recession, most notably construction and manufacturing. To address this question, we calculated relative earnings by time period for 13 industry categories. The results are presented in Figure 4.5.

Figure 4.5
Relative Post-injury Earnings by Industry and Injury Period

Figure reports relative earnings without case-mix adjustment by industry and time period. Industry of at-injury employer identified from NAICS codes reported to EDD supplemented with industry code reported to WCIS if EDD industry code is missing. "Temporary/PEO" refers to Temporary Help Agencies and Professional Employer Organizations, a subset of Administrative/Support Services.

Figure 4.5 makes it clear that injured workers in all industries experienced worse post-injury outcomes during the recession, and that recovery to pre-recession levels of post-injury earnings has been incomplete or nonexistent in most industries. This is true of heavily cyclical industries such as construction and manufacturing that experienced very weak recoveries, but it is also true of industries that experienced stronger recoveries (including Administrative/Support Services and Accommodations/Food Services). It is even true of Health Care, where the recession barely led to a discernible interruption in steady employment growth over the time period of our study.²²

Another interesting feature of Figure 4.5 is that the drop in relative earnings in most industries is somewhat smaller than the economy-wide drop reported in Table 4.1. While this may seem surprising, it suggests that part of the overall trend may have been a change in the composition of the injured worker population. We accordingly investigate the impact of changes

²² Employment growth calculated using BLS QCEW data for 2005-2012. See Appendix B for definitions of industry categories.

in industry mix and other compositional factors on the pattern of earnings losses over 2005-2012.²³

Changes in the composition of the permanently disabled worker population

The time profiles reported in Figures 4.1-4.4 and Table 4.1 indicate that outcomes for the average worker injured during the recession (2008-2009) and the recovery (2010-2012) were worse than outcomes for the average worker injured prior to the recession (2005-2007). The timing of these changes in outcomes suggests that labor market conditions were responsible for the deterioration of injured workers' economic outcomes. The evidence presented so far does not, however, prove that this is the case, as a number of alternative explanations are also conceivable:

1. The composition of the injured worker population may have changed on observable dimensions, including demographics, wages, industry mix, or disability duration.
2. The composition of the injured worker population may have changed on unobservable dimensions due to changes in claims-filing behavior over the business cycle.
3. The effectiveness of medical care or rehabilitation may have changed.

Although we cannot conclusively test all of these potential explanations within the scope of this report, we can examine the importance of observable changes in composition. The hypotheses that the injured worker population shifted in unobservable ways or that the effectiveness of medical care or rehabilitation declined over this time period are more speculative, and we do not address them further in this report.

Rich information available in WCIS and the EDD Base Wage File allows us to examine whether there were concurrent changes in the composition of the PPD population that might be confounded with aggregate trends, and whether the large changes observed in average outcomes appear to be driven by such compositional changes.

Table 4.2: WCIS Injured Worker Demographics

	All Cases	Injury Year 2005-2007	Injury Year 2008-2009	Injury Year 2010-2012
Fraction Female	41%	40%	42%	43%
Average Age	44.4	43.9	44.6	45.0

²³ As discussed in Chapter 3, the WCIS may be subject to underreporting among public-sector employees. Without an external source of data on the industrial composition of the full PPD population, it is not clear how to correct for this potential underreporting. A more worrisome problem would arise if the pattern of underreporting across industries varied over time, since this could create the appearance of overall trends even if none exist. In order to assess robustness to time-varying underreporting across industries, we recalculated the overall time profile of earnings loss by calculating industry-specific time profiles and then calculating a weighted average of these time profiles using statewide industry employment shares by quarter as weights. The resulting time profile of relative earnings looks very similar to results for the WCIS injury population, suggesting that our results are not driven by time-varying underreporting. See Appendix B for estimates.

Age Distribution

	All Cases	Injury Year 2005-2007	Injury Year 2008-2009	Injury Year 2010-2012
16-20	1%	1%	1%	1%
21-25	5%	5%	5%	5%
26-30	8%	8%	8%	8%
31-35	9%	10%	9%	9%
36-40	12%	13%	12%	11%
41-45	15%	16%	15%	13%
46-50	16%	17%	17%	16%
51-55	16%	15%	16%	16%
56-60	11%	10%	12%	12%
61-65	5%	5%	5%	6%
66-70	1%	1%	2%	2%

WCIS injured workers receiving PPD benefits 2005-2012

We begin our investigation by presenting summary statistics on a range of factors hypothesized to affect earnings, employment, and return to work following a workplace injury. These can be broadly classified into worker demographics, job and employer characteristics, firm dynamics, and injury characteristics. Table 4.2 presents the percentage female, the average age, and the age distribution for the overall injured worker population (column 1) and the three time periods defined above (columns 2-4). Compared with workers injured in 2005-2007, workers injured in 2010-2012 are 1.1 years older on average (45.0 vs. 43.9) and 3 percentage points more likely to be female. Research has shown that women experience larger post-injury earnings losses (Boden and Galizzi 2003). There is evidence suggesting that older workers experience more severe injuries on average, although we are not aware of any studies on how the earnings loss resulting from an injury of a given severity varies with age (Silverstein, 2008).

Table 4.3 presents pre-injury annual earnings, post-injury control worker earnings, and the proportion of the sample falling into each quartile of the wage distribution. Inflation-adjusted annual earnings over the year prior to the injury for injured workers fell by about \$1,500 (from \$47,751 to \$46,241) between 2005-2007 and 2008-2009 and then fell by an additional \$2,700 (to \$43,050) between 2008-2009 and 2010-2012.²⁴ Remarkably, the decline in pre-injury wages among injured workers over recent years is not driven purely by wage growth failing to keep up with inflation. The average nominal pre-injury wage for injured workers actually declined between the recession period and the post-recession period, from \$41,487 in 2008-2009 to \$40,426 in 2010-2012. The distribution of workers by pre-injury wage quartile highlights that this change in the average is driven by a sizable increase between 2005-2007 and 2010-2012 (4.4

²⁴ All dollar amounts have been inflated to constant 2014 dollars using the Urban Consumer Price Index so that income levels can be compared across years.

percentage points, or about 19%) in the fraction of workers with real pre-injury annual earnings in the lowest quartile.²⁵

The injured worker's tenure at the at-injury firm is likely to be an important predictor of earnings losses and return to work. The impact of tenure on earnings loss is not clear a priori. Workers with higher job tenure may have a stronger relationship with their employers and may therefore be more likely to return to work and receive needed accommodation or workplace modification. By the same token, workers with higher job tenure may have more specialized skills and thus may have more to lose if their employment relationship is disrupted by injury. We measure pre-injury job tenure by counting the number of consecutive quarters of employment at the at-injury firm preceding the quarter of injury. In order to define job tenure consistently across all cohorts in our sample, the highest category of pre-injury job tenure is eight quarters (two years) of pre-injury employment. Table 4.3 shows that the majority of injured workers (60% across all years) have job tenure of 2 years or higher at the time of injury. Workers injured during and after the recession have higher pre-injury job tenure: the fraction with two years or more of tenure at the at-injury firm increases from 58% in 2005-2007 to 60% in 2008-2009 and then to 64% in 2010-2012. Increases in job tenure among workers injured during the recession might be expected as a consequence of compositional changes in the broader labor force. Some research on the relationship between injury rates and the business cycle finds that weak labor market conditions deter the filing of WC claims, and it is plausible that this effect might be more pronounced among workers with lower job tenure (Boone and Van Ours, 2006). On this view, the sharper increase in job tenure among permanently disabled workers during the recovery period is more surprising and may be a symptom of the weak labor market recovery.

Table 4.3 WCIS Injured Worker Wages and Firm Characteristics

		Injury Year 2005- 2007	Injury Year 2008- 2009	Injury Year 2010-2012
<i>Sample Averages</i> <i>(Standard Deviations in Parentheses)</i>	All Cases			
Pre-Injury Wage*	\$46,083 (36,137)	\$47,751 (36,174)	\$46,241 (36,449)	\$43,556 (35,661)
Nominal Pre-Injury Wage	\$40,448 (31,769)	\$39,823 (30,227)	\$41,487 (32,654)	\$40,426 (33,082)
Pre-Injury Job Tenure (Quarters)	5.92 (2.98)	5.74 (3.08)	5.96 (2.92)	6.12 (2.92)

²⁵ Income quartiles used in this report were defined by pooling all cases in the WCIS together (using weights to correct for match failure) and calculating quartiles of annual pre-injury earnings after inflating all earnings to real 2014 dollars. The income quartile cutoffs are defined using all workers with matched controls, whereas the sample used to analyze compositional changes is restricted to workers with complete data on all of the variables presented in Tables 4.2-4.4.

Post-Injury Control Wage*	\$42,423	\$45,013	\$40,393	\$40,505
	(36,167)	(36,713)	(36,131)	(35,165)
Firm Growth Rate (%)	2.31	3.95	-0.9	2.79
	(16.57)	(16.20)	(17.08)	(16.24)
Firm Separation Rate (%)	11.32	12.27	11.36	9.93
	(9.59)	(9.97)	(9.40)	(9.01)
<i>Fraction of Injured Workers</i>				
First Quartile of Wages	24%	23%	23%	27%
Second Quartile of Wages	25%	23%	26%	26%
Third Quartile of Wages	25%	26%	25%	24%
Fourth Quartile of Wages	26%	28%	25%	22%
<i>Pre-Injury Job Tenure</i>				
0-1 Quarters	14%	16%	12%	13%
2-3 Quarters	11%	11%	11%	9%
4-5 Quarters	9%	9%	9%	8%
6-7 Quarters	7%	7%	8%	6%
8 Quarters or More	60%	58%	60%	64%
<i>Industry</i>				
Manufacturing	13%	13%	13%	12%
Transportation and Warehousing	5%	5%	6%	5%
Health Care	8%	7%	9%	9%
Public Administration	13%	16%	12%	9%
Education	6%	6%	6%	7%
Administrative and Support Services	3%	3%	3%	3%
Agriculture	13%	12%	13%	13%
Retail	5%	4%	5%	6%
Accommodation and Food Services	7%	8%	7%	5%
Construction	5%	5%	5%	6%
Wholesale	6%	5%	6%	6%
Other	16%	14%	17%	18%
<i>Firm Size</i>				
Firm Size: 1-10 Employees	3%	2%	3%	3%
Firm Size: 11-50 Employees	15%	13%	15%	17%
Firm Size: 50-100 Employees	9%	10%	9%	7%
Firm Size: 101-500 Employees	17%	17%	18%	18%
Firm Size: 501-1000 Employees	8%	8%	8%	8%
Firm Size: 1001-5000 Employees	20%	19%	20%	21%
Firm Size: Over 5000 Employees	28%	32%	27%	25%
<i>Firm Growth Rate</i>				
-30% or Lower	3%	2%	4%	2%

-30% to -10%	12%	9%	19%	10%
-10% to -0.5%	28%	23%	31%	34%
-0.5% to 0.5%	7%	6%	7%	8%
0.5% to 10%	31%	39%	25%	26%
10% to 30%	12%	13%	9%	13%
30% or Higher	7%	7%	5%	7%
Firm Separation Rate				
4.4% or Less	24%	23%	22%	27%
4.4% to 8%	25%	22%	24%	29%
8% to 14%	26%	25%	28%	25%
14% or Higher	26%	31%	26%	19%

* Annual earnings reported in inflation-adjusted real 2014 dollars unless otherwise noted.

** At-injury job tenure topcoded at 8 quarters pre-injury

Table 4.3 also reports data on employer characteristics known or hypothesized to affect earnings and employment outcomes. Known factors include industrial composition and firm size distribution, while less-studied but potentially important factors include two measures of employment dynamics: the firm-level growth rate and the firm-level separation rate.

Several notable compositional changes are apparent. The shares of public administration, construction, and manufacturing workers decline, while the shares of industries including health care, education, and accommodations and food services increase. At-injury employers also appear to be slightly smaller on average after the recession, with the proportion of injured workers coming from the largest firms (5000 or more employers) falling from 32% before the recession to 25% after the recession. Firm size is a well-established determinant of safety: Mendeloff, Nelson et al. (2006) confirmed earlier evidence that smaller establishments had higher fatality rates than larger establishments, controlling for industry. They established that it was the size of the establishment, not the size of the firm, which had, by far, the greatest role. (While we measure the size of the firm, firm size and establishment size are correlated.) However, the impact of firm size on outcomes after an injury has occurred has been studied less widely. A key reason may be that workers' compensation information rarely has a good link to employer size. Some studies have found higher total disability durations at smaller firms, but some studies have failed to support this finding (Hunt and Habeck 1993, Cheadle, Franklin et al. 1994, Galizzi and Boden 1996).²⁶ An earlier RAND study showed that smaller firms were less likely to have formal return to work programs (Seabury et al., 2011).

²⁶ Cheadle et al. (1994) found higher TTD durations for firms with fewer than 50 employees. However, Hunt and Habeck (1993) and Galizzi and Boden (1996) found little or no effect.

Table 4.4: WCIS Injured Worker Severity

	All Cases	Injury Year 2005-2007	Injury Year 2008-2009	Injury Year 2010-2012
Weeks of Total Temporary Disability	18.5	18.1	20	17.7
Number of Permanent Impairments	0.9	0.8	1	1.1

The average TTD duration reported in this table was winsorized at the maximum TTD duration of 104 weeks, a process that affected slightly under 5,000 cases.

WCIS impairment rating data may be reserving estimates that are not revised and therefore do not necessarily reflect the eventual disability status of injured workers.

Table 4.3 also provides evidence of other changes in the mix of at-injury employers over the period 2005-2012. The growth rate of employment over the year preceding an injury fell from 4.0% per year in 2005-2007 to slightly negative (-0.9%) in 2008-2009 before rebounding to 2.8% in 2010-2012. The average turnover rate for at-injury firms, meanwhile, fell from 12.3% to 9.9% between 2005-2007 and 2010-2012. We hypothesize several channels through which firm-level employment dynamics could be important determinants of earnings losses. Since earnings losses are defined relative to the earnings of uninjured controls at the same employer, factors such as employer growth and the turnover rate that may affect earnings growth for uninjured workers will mechanically affect wage losses.²⁷ Controlling for industry will capture much of this variation, but measures of firm dynamics may reflect differences in the human resources strategies and importance of firm-specific human capital across different employers within the same industry. Since relative post-injury return to the at-injury employer continues to decline over time for injured workers, it is likely that the disruption of the employer-employee relationship contributes to long-term earnings losses. The employment growth rate and the turnover rate may both contain information about the potential earnings growth lost due to an injury that is not captured by other control variables. Finally, the turnover rate may also be informative about the importance of job-specific expertise and training at the firm in question. The importance of such expertise, which economists refer to as "firm-specific human capital", should affect an employer's incentives to rehabilitate and retain an injured worker. While, as discussed above, the injured worker's job tenure captures the potential for the individual worker to have accumulated firm-specific human capital, the turnover rate is likely to contain additional information about how firm-specific human capital is valued by the employer and thus may predict differences in earnings losses among workers with the same job tenure at different employers.

Finally, the severity of the average PPD worker's impairment may also change over the business cycle. Numerous studies have documented that the incidence rate of workers' compensation claims is related to the business cycle (Boone and van Ours 2006, Asfaw, Pana-Cryan et al. 2011, Boone, Van Ours et al. 2011).²⁸ These studies tend to find that business cycle

²⁷ See Anderson and Meyer (1994) for an overview of economic theories of the job turnover rate.

²⁸ See Asfaw et al. (2011) for evidence describing the association between non-fatal injury rates and the business cycle in the U.S. Boone et al. (2006, 2011) find similar patterns using data from Europe.

effects are less pronounced or non-existent for fatal and severe injuries. The implications of these findings for the overall PPD population are unclear, however, since not all PPD cases originate with severe or traumatic injuries. Therefore, we cannot rule out a priori the possibility that the composition of permanent impairments shifted toward types of health conditions with more severe consequences, or that the average severity of cases changed during the recession.

It is difficult to measure the severity of impairment directly, but several useful proxy variables are available in the WCIS. One useful measure that is reliably observed is whether claimants receive temporary total disability payments, and what duration of total disability is implied by those payments. We also control for the body part identified as the site of the initial injury. While it might be preferable to control for the type of permanent impairment, detailed information about the type of permanent impairment is not reported in the WCIS for approximately one third of workers who receive PPD benefit payments.

To sum up, the large declines in the relative earnings and employment of injured workers during the great recession and recovery were accompanied by substantial changes in the composition of the injured worker population. On many dimensions, workers injured after the recession were more likely than workers injured before the recession to have characteristics that predict larger earnings losses.

Effect of Worker, Employer, and Injury Characteristics on Post-Injury Earnings

How did these changes in the composition of the injured worker population affect injured worker outcomes? To evaluate the contribution of these compositional changes to the trends in relative earnings and employment, we estimated linear regression models for the difference in injured and control worker outcomes. We estimated models for post-injury earnings, employment, and at-injury employment at one, two, and three years post-injury. We focus primarily on earnings losses in our discussion since earnings losses are most directly related to benefit adequacy, but estimates of impacts on employment and return to work provide a broader view of post-injury outcomes and may be of independent interest to many readers. Technical details and the full set of estimates are presented in Appendix B.²⁹

As hypothesized, many of the worker and job characteristics that differ substantially between 2005-2007 and 2010-2012 are strongly predictive of post-injury earnings. We find that the pre-injury wage has a very strong impact on relative earnings even after adjusting for other factors. This relationship is depicted in Figure 4.6.³⁰ Relative earnings in the second post-injury year for workers earning below \$25,000 a year before the injury are around 65%, but climb steadily with pre-injury earnings until stabilizing around 80% for workers earning \$100,000 or more pre-injury. Job tenure also has a statistically significant impact on relative earnings. Relative

²⁹ See Appendix Tables B.5-B.7 for parameter estimates.

³⁰ Adjusted relative earnings in Figures 4.6-4.7 are constructed using recycled predictions from separate regression models for injured and control worker earnings. See Appendix B for details.

earnings are highest for workers with job tenure of two years or more, but the effect of tenure on post-injury earnings is much smaller than the impact of pre-injury earnings.

As suggested by the unadjusted estimates in Figure 4.5, earnings losses vary widely across industry even after controlling for other factors. Workers injured in construction, retail, and wholesale have particularly severe earnings losses, while workers injured in education and public administration experience higher post-injury earnings. Firm size has a substantial impact on earnings loss, as well. Workers injured at very large firms (5000+ employees) have relative earnings about 7 percentage points higher than workers at slightly smaller firms (1000-5000 employees). We also find that firm employment dynamics (growth and turnover) matter, but in complex ways. Relative earnings are lower for workers injured at faster-growing firms. The turnover rate has a U-shaped effect on relative earnings, however, with higher relative earnings in the bottom and top quartiles of turnover and lower relative earnings at moderate levels of turnover.

We note that the relationship between firm characteristics and post-injury outcomes is in some cases driven as much by variation in control worker outcomes as by variation in injured worker outcomes. For instance, control workers at a firm where employment falls by more than 30% in a year (a standard often used by researchers to define mass layoffs) also experience poor earnings. A similar phenomenon explains relatively high post-injury earnings (after adjusting for wages and other factors) for workers in the administrative/support services industry, where control workers appear to be at greater risk of job separation and earnings declines.³¹

Age at injury and injury characteristics are also strongly related to post-injury earnings: the relationship between age and predicted earnings losses is depicted in Figure 4.7. The results indicate that it is important to control for age at injury if we are interested in evaluating the impact of other factors (such as the business cycle) on earnings losses, but we caution that the coefficients should not be interpreted as capturing the causal effect of age on earnings loss. Temporary disability duration and body part of injury are also strongly predictive of earnings losses. We discuss the relationship between impairment severity and earnings loss extensively in Chapter 6 in the context of evaluating the equity of the rating and benefit systems.

Because we took earnings, job tenure, and employer into account in selecting matched control workers, our findings on the relationship between job characteristics and earnings losses can be interpreted as capturing the causal effects of job and firm characteristics on post-injury outcomes under the assumption that our matching procedure is valid. Our model also included controls for a range of additional variables related to demographics and injury characteristics that were not explicitly used in the matching process. Estimated coefficients on these variables should be interpreted with more caution, but these variables can nonetheless be used as case-mix adjusters to evaluate the impact of compositional changes in the pattern of earnings losses over the period of our study. In interpreting these estimates, it is also important to understand that the estimates presented in Figures 4.5-4.6 represent the relationship between pre-injury earnings and

³¹ Our case-mix adjustment procedure involves estimation of separate models for control and injured worker earnings, allowing us to examine the contributions of control worker and injured worker outcomes to relative earnings.

proportional post-injury earnings *holding all other factors constant*, meaning that this pattern is not driven by differences in injury severity, industry, job tenure, or in any of the other variables included in our analysis.

Figure 4.6
Case-Mix Adjusted Relative Post-Injury Earnings by Pre-Injury Annual Earnings

Figure reports predicted relative earnings as a function of pre-injury annual earnings holding all other worker and job characteristics constant.

Pre-injury annual earnings reported in thousands of constant 2014 dollars
95% confidence intervals reported.

Figure 4.7
Case-Mix Adjusted Relative Post-Injury Earnings by Age At Injury

Figure reports predicted relative earnings as a function of pre-injury annual earnings holding all other worker and job characteristics constant.

Pre-injury annual earnings reported in thousands of constant 2014 dollars
 95% confidence intervals reported.

These regression estimates confirm that many worker and employer characteristics are strongly related to relative earnings, including many of the characteristics that became more or less prevalent among the PPD population over the course of the great recession. To assess whether compositional changes are responsible for the trends observed between 2005-2012, we fix the composition of the injured worker population at the sample average and plot regression-adjusted time trends in Figure 4.8. Regression-adjustment dramatically reduces the magnitude of the reduction in relative earnings that occurred between 2005-2012. The sharp decline of 9.7 percentage points in relative earnings between 2008-2009 would be only 5 percentage points if the composition of the injured worker population had remained constant over the business cycle.³²

³² See Appendix B for technical details and estimates of the effect of case-mix adjusters.

Figure 4.8
Case-Mix Adjusted Trends in Relative Earnings

Case-Mix-Adjusted Relative Earnings estimated controlling for industry (2-digit NAICS), size of at-injury employer, pre-injury annual earnings, job tenure, gender, age, temporary total disability duration, number of permanent impairments, body part of injury, turnover rate, and employment growth rate of at-injury employer. [Orange] lines represent 95% confidence intervals. Losses measured over the second full post-injury year (5Q to 8Q post-injury) Earnings losses defined as difference between average yearly earnings for control workers and average yearly earnings for injured workers Proportional earnings losses defined as earnings losses divided by average yearly earnings for control workers

Relationship Between Trends and Labor Market Conditions

Figure 4.8 showed that case characteristics explain most of the decline in relative earnings observed between 2005-2012. Even so, a decline in relative earnings during the Great Recession remains visible. This raises the question of whether economic conditions were responsible for these trends.

Addressing this question directly is challenging because it is not possible to estimate the effects of statewide economic conditions unless we impose unacceptably strict assumptions

about how losses vary with the quarter of injury.³³ Because the statewide employment/population rate is, by definition, the same for all workers injured at the same time, we cannot infer from the data whether changes in losses over time are *caused* by economic conditions; we can never rule out the possibility that other time-varying factors that are not captured in our model are actually responsible for the evolution of wage loss over time. However, we can conduct an informal assessment of whether labor market conditions are capable of explaining the time trends we observed by predicting trends in earnings loss based on economic conditions and comparing this predicted time profile to the actual case-mix-adjusted trend line.

We address this question by fitting regression models for earnings losses that include two measures of labor market conditions. To proxy for the health of the overall labor market, we include the statewide employment/population ratio for adults aged 18-64. This measures the fraction of adults in California who are working each quarter. Because industries vary widely in their exposure to the business cycle, we also include an industry-specific employment/population ratio to proxy for changes in labor demand at the 2-digit industry level. We divide the industry-specific employment/population ratio by each industry's ratio in the corresponding quarter of 2004 to obtain a measure of the cumulative percentage change in employment for each industry relative to the same quarter in 2004. Rescaling the E/P ratio in this way is necessary to allow comparisons across different-sized industries. As before, we include fixed effects for the sectors so that permanent differences in outcomes across industries do not affect our estimates of the responsiveness of outcomes to the business cycle.

³³ The problem is that the statewide employment/population rate has the same value for all workers injured in a given quarter, making it perfectly collinear with time effects.

Figure 4.9
Trends Predicted From Economic Conditions

Overall labor demand has a positive effect on post-injury earnings and post-injury employment. Sector-specific labor demand has a positive impact on level of injured worker earnings, so injured workers earn more if injured when employment in industry is relatively high. However, sector specific demand has a negative impact on injured worker earnings relative to control workers. This is driven by the fact that the uninjured control workers experience even faster wage growth when labor demand is strong than do injured workers.³⁴ However, the impact of both statewide employment and sector-specific employment are arguably small relative to other influences on earnings losses.

Figure 4.9 plots the case-mix-adjusted trend in earnings loss predicted by the model that uses labor market conditions in place of time effects. The trend predicted using labor market conditions declines between 2008-2010, but the size of the decline is slightly smaller in part because the predicted values based on labor market conditions lie slightly below the actual trend

³⁴ See Appendix B, Table B.8 for details and coefficient estimates.

line prior to the Great Recession. We view this as suggestive, but not definitive, evidence that labor market conditions played a role in the earnings declines observed between 2008-2010.³⁵

Discussion

Comparison of the unadjusted time profile of earnings loss to the case-mix-adjusted estimates suggests that changes in the composition of the PPD claimant population played an important role in substantial increases in earnings losses observed after the great recession. To further understand the relative importance of changing worker characteristics and economic conditions as factors that led to lower relative earnings for permanently disabled workers, we apply several decomposition methods to our data.

Using our model for case-mix adjustment, we can estimate the fraction of all variation in earnings loss that is explained by various factors. Estimates are presented in Table 4.5. We note that our models explain only around 10% of all variation in earnings loss, and the estimates reported in Table 4.5 are shares of this *explained* variation; roughly 90% of differences in earnings loss between individuals is uncorrelated with these explanatory variables and thus remains *unexplained*. While this may seem like a low fraction of explained variation, this is a very typical result in the empirical analysis of labor market outcomes.

Injury severity, measured here as temporary disability duration, explains roughly half of the explained variation in earnings losses, and the body part of injury is the second-most important factor in the second year. Since these are our best proxies for the type and severity of the resulting permanent impairment, it is not surprising that these variables are by far the most important predictors of earnings loss. After these injury characteristics, the pre-injury wage and the worker's age at injury are the next-most important factors, each explaining about 4% of the explained variation in the second post-injury year. Interestingly, age becomes a much more important predictor of losses in the third post-injury year as the predictive importance of TTD duration declines (yet nonetheless continues to explain close to half of all explained variation).

The next-most important factors are the industry of the at-injury firm, pre-injury job tenure for the injured worker, and other characteristics of the at-injury firm (including firm size, the separation rate, and the firm-level growth rate). After accounting for all these other characteristics, the date of the injury explains only 1% of the explained variation in wage loss. To our surprise, gender explains less than 0.5% of explained variation in earnings losses in the second and third post-injury years after controlling for the rich array of other factors included in our model.

These results are a useful reminder that the vast majority of variation in economic outcomes for permanently disabled workers is not correlated with factors that can be readily measured

³⁵ We also conducted formal statistical tests comparing our main specification (which uses quarter-of-injury fixed effects) to the model using economic conditions and vice versa. We find that our test rejects the hypothesis that the true model contains economic conditions and not time trends. In contrast, our test fails to reject the hypothesis that the true model contains time effects and not economic conditions ($p = 0.15$). However, the model with time effects is more flexible than the model with economic conditions, so it is not surprising that formal comparison between models favors the model with time effects. See Appendix B for details.

shortly after the date of injury. Of the variation in outcomes that can be predicted by case characteristics, the majority is driven by differences in injury severity, economic status, age, and job characteristics. Even though the great recession was associated with dramatic shifts in average wage loss, differences between workers injured at a point in time are dramatically larger than differences over time in outcomes for similarly situated workers.

Table 4.5
Which Factors Predict Earnings Losses?

Explanatory Variables	Percentage of Explained Variation	
	Second-Year Earnings Loss	Third-Year Earnings Loss
Temporary Disability Duration	54.3%	45.5%
Body Part of Injury (FROI)	9.8%	10.1%
Pre-Injury Wage	4.2%	5.3%
Age	4.0%	12.9%
Industry	3.0%	4.3%
Pre-Injury Job Tenure	2.4%	2.3%
Firm Separation Rate	1.7%	2.9%
Firm Size	0.8%	0.6%
Firm Growth Rate	0.6%	1.1%
Quarter of Injury	0.4%	0.4%
Number of Permanent Impairments	0.1%	0.2%
Gender	0.0%	0.1%
R-Squared	12.27%	9.2%

Table reports partial sum of squares as percentage of model sum of squares from ANOVA for individual-level proportional earnings losses measured in the second and third post-injury years. See appendix B for details on the construction of individual-level earnings loss measures. All predictors are statistically significant at the 0.1% level.

The analysis in Table 4.5 is informative about the fraction of total variation in outcomes due to different factors: it tells us that a very small share of the total variation observed among all PPD cases between 2005-2012 is predicted by the injury date when other factors are also accounted for. However, these results do not tell us what fraction of the change in *average* outcomes between the pre-recession and post-recession periods is explained by the date of injury after controlling for these other factors. The relatively small proportion of variation explained by the date of injury tells us, instead, that there is a large amount of dispersion in earnings losses among injuries occurring at the same time, and that other case-mix adjusters (such as TTD duration and earnings loss) are capable of explaining much of this dispersion.

A different method is needed to analyze changes in the average outcome between injuries before versus after the recession. We build on the regression specifications used for case-mix adjustment to decompose the change in average earnings loss into a portion that is predicted by compositional changes and a remainder that is attributed to time effects. Table 4.6 presents the results of analyses conducted for three outcomes measured in the second post-injury year: average earnings losses, median earnings losses, and the reduction in employment at the end of the second post-injury year. The methods in the table are based on a binary division of injury dates into injuries occurring during and after the great recession (2008-2012) and injuries occurring before the great recession (2005-2007).³⁶

Table 4.6: Contribution of Compositional Changes to Change in Average Outcomes During and After the Great Recession

Fraction of Average Change Explained by...	Average % earnings loss	Median % earnings loss	Reduction in Employment
Recession	53%	63%	57%
Compositional Effects	47%	37%	43%

Average % earnings loss calculated using Oaxaca-Blinder decomposition for individual-level earnings loss estimates

Median % earnings loss decomposition calculated using DeNardo-Fortin-Lemieux reweighting method

Reduction in employment calculated using Oaxaca-Blinder decomposition for difference between individual employment and control worker average employment

See Appendix B for details

The results in Table 4.6 quantify the contribution of compositional changes to the time profile of earnings losses observed between 2005-2012. Compositional changes account for 46% of the decrease in relative earnings that followed the great recession.

A drawback of using relative earnings calculated at the individual level as an outcome variable is that outliers caused by very small values of control worker earnings can lead to noisy results. Table 4.6 therefore reports two alternative decompositions that should not be affected by outliers in individual-level relative earnings and related technical problems. Compositional changes account for somewhat less (35%) of the change in median relative earnings over this period, and an intermediate portion (40%) of the change in the post-injury reduction in employment. Similar calculations that focus only on data from the post-recession (2010-2012) period and the pre-recession period yield estimates of the compositional effect that are slightly (1 to 4 percentage points) smaller but otherwise very similar.³⁷

³⁶ See Appendix B for details and for estimates that compare only post-recession (2010-2012) injuries to pre-recession (2005-2007) injuries.

³⁷ See Appendix B for details.

Taken together, the results in Table 4.6 indicate that between 37% and 47% of the deterioration in outcomes for injured workers that followed the great recession was due to compositional changes.³⁸ We view this as a meaningful fraction of the overall change in average outcomes, but we also view this as indicating that the effect of the recession on outcomes independently of compositional changes was quite substantial.

Because our data report earnings on a quarterly basis, it is not clear whether the downward trend in pre-injury earnings is driven by a shift toward lower-wage workers or by reductions in hours worked. The number of workers who report working part-time for economic reasons such as slack business conditions doubled between 2005 and 2009 and has receded more slowly than the overall unemployment rate, so it is plausible that reduced hours among workers contributed to lower pre-injury earnings.³⁹ However, analysis of data reporting hours worked together with work injury occurrence would be necessary to determine if this is actually the case. Some important questions raised by these findings are whether these workers are likely to have weaker ties to their employers, or if employers have weaker incentives to rehabilitate & invest in return to work in a slack labor market.

An alternative explanation for the compositional shift toward lower-wage workers emanates from the workers' compensation system itself. The real value of PPD benefits for higher-wage workers have been falling over time because the weekly maximum wage was not indexed to inflation prior to passage of SB863. For workers above the weekly maximum wage, the cumulative effect of inflation between 2005 and 2013 was equivalent to a 15.5% cut in benefits. The incentive for higher-wage workers to pursue PPD benefits therefore weakened over time. While there is a sizable research literature demonstrating that TTD claiming is responsive to benefit generosity, the evidence on PPD is less conclusive.

Because we took earnings, job tenure, and employer into account in selecting matched control workers, the findings discussed so far on the relationship between wages and employer characteristics on earnings losses can be interpreted as capturing the causal effects of job and firm characteristics on earnings losses. Our model also included controls for a range of additional variables related to demographics and injury characteristics that were not explicitly used in the matching process. Estimated coefficients on these variables should be interpreted with more caution, but these variables can nonetheless be used as case-mix adjusters to evaluate the impact of compositional changes in the pattern of earnings losses over the period of our study. In interpreting these estimates, it is also important to understand that the estimates presented in

³⁸ For the average change in earnings and employment, it is possible to decompose the compositional effect into contributions associated with specific groups of variables. The compositional changes that were most important in predicting the decline in relative earnings in 2008 and later were (in descending order of importance) increases in injury severity, lower pre-injury wages, declines in the job separation rate, and increases in the age at injury. Injury severity comprises TTD duration, number of permanent impairments, and the body part of injury, accounted for the largest predicted decline in relative earnings in 2008 and later years. See Appendix Table B.10 for detailed estimates.

³⁹ Bureau of Labor Statistics (2015), "Labor Force Statistics from the Current Population Survey" (Seas) Employment Level - Part-Time for Economic Reasons, All Industries. <http://data.bls.gov/timeseries/LNS12032194>, Accessed September 13, 2015.

Figures 4.5-4.6 represent the relationship between pre-injury earnings and proportional post-injury earnings *holding all other factors constant*, meaning that this pattern is not driven by differences in injury severity, industry, job tenure, or in any of the other variables included in our analysis.

5. Wage Replacement and Benefit Adequacy Under SB899 and SB863

Chapter 4 documented recent declines in the earnings and employment of permanently disabled workers. In this chapter, we compare earnings losses to benefits and analyze the impact of the great recession on the degree to which PPD benefits protect workers against interruptions in income caused by their injuries. We also simulate the changes enacted under SB863 and evaluate the effects of these reforms on wage replacement. In addition to analyzing benefit adequacy, we document the spread of alternative rating procedures allowed under a series of WCAB rulings beginning in 2009 and estimate the potential impact of these alternative rating procedures on benefits. Specifically, we address the following questions:

- How did ratings and benefits under SB899 evolve between 2005-2012?
- What fraction of earnings losses were replaced by PPD benefits for workers injured between 2005-2012?
- What would wage replacement rates have been over the period 2005-2012 if SB863 had been in place?
- Which changes in ratings and benefits under SB863 are likely to have the most important impact on wage replacement rates?
- What is the potential impact of alternative rating procedures on ratings and benefits?

To address these questions, we measure trends in PD ratings and statutory benefits among cases rated at the DEU under SB899, and we combine these data with our earnings loss data to report wage replacement rates for the overall PPD population.

Ratings Data From the Disability Evaluation Unit.

We use data from the state Disability Evaluation Unit (DEU) instead of the WCIS as our primary data source on ratings and statutory benefits. While we consider the WCIS the most representative and timely data source for identifying workers who receive PPD benefits in California's workers' compensation system, our ability to analyze PPD benefits and ratings in the WCIS is severely limited by several aspects of the data. As discussed in Chapter 4, about one third of injuries in 2005-2012 that are reported as receiving PPD benefits in the WCIS do not have any data on impairment ratings. While impairment ratings are reported alongside benefits more frequently in recent years, the changing fraction of cases with impairment ratings reported undermines our confidence in trends calculated using the WCIS. The DEU data also has limitations, but it is the most authoritative source for detailed and accurate data on disability ratings.

Before turning to the analysis of trends in ratings and benefits, it is necessary to discuss some institutional details of the DEU that are important for understanding our data on ratings and benefits. Many, if not most, workers' compensation cases with PPD are never rated by the DEU. DEU ratings are performed at the request of one of the parties to the case or, under some circumstances, a workers' compensation judge. There is considerable variation in the time it takes for a DEU rating to be requested, and cases accordingly may not reach the DEU for some time after injury. The lag between injury and rating requires that analysts take considerable care in using DEU data to measure trends, as we discuss below.

Table 5.1 presents summary statistics on cases rated at the DEU. The first column (labeled "All Available Ratings") reports averages for ratings performed at the DEU by May, 2015 of cases with injury dates between 2005-2012 and complete data on final ratings and rating type. The remaining columns of the table (labeled "Constant-Maturity Sample") report averages for the sample of ratings that we use to measure trends by injury date over 2005-2012. The second column reports overall averages for this sample of ratings, while the third through fifth columns report averages disaggregated by the type of rating.

Table 5.1

Summary Statistics for Sample of DEU Ratings Used to Measure Trends

	All Available Ratings	Constant-Maturity Sample (Rated Within 851 Days of Injury)			
	All ratings	All ratings	Consult Ratings	Summary Ratings	Formal
Number of Ratings	191,477	118,524	55,461	62,193	870
Percentage of Constant-Maturity Ratings			47%	52%	1%
Percentage of All Available Ratings			55%	44%	1%
Final Rating Before Apportionment*	20.3	16.5	21.4	12	29
Final Rating After Apportionment	19.6	16	20.9	11.4	26.8
Statutory Benefit at Maximum Weekly Wage					
Without Life Pension	\$21,432	\$15,953	\$22,433	\$9,932	\$33,336
Including Life Pension**	\$23,098	\$16,654	\$23,698	\$10,080	\$37,611
Average Number of Rated Impairments	1.6	1.5	1.7	1.2	1.9
Days to First Rating					
Average	817	528	567	492	598
Median	696	531	578	486	632

DEU records excluded if data on final rating after apportionment, body system of impairment, or rating type is missing or invalid.

Column labeled "All Maturities" presents summary statistics for injuries occurring between 2005-2012 that were rated at the DEU before May, 2015.

Columns labeled "Constant-Maturity Sample" present cases rated within 851 days of injury, allowing comparable measurement of ratings and benefit trends by date of injury through the end of 2012.

When measuring trends in the DEU, it is important to work with a *constant-maturity* sample of cases, meaning a sample of cases that reaches the DEU within a fixed length of time after the injury date. Because cases can take so long to reach the DEU, it is not possible to observe an entire cohort of injured workers until many years have passed since the time of injury. For example, 43% of cases with injury dates between 2005 and 2009 took 900 days or longer to reach the DEU; a substantial fraction of cases take five years or longer. For more recent injury years, then, the fraction of cases that can be observed in the DEU data steadily declines in a non-random way unless we restrict attention to a constant-maturity sample.

The first two columns of Table 5.1 illustrate the tradeoff involved in using a constant-maturity sample. Restricting attention to a constant-maturity sample that allows measurement of trends through the end of 2012 excludes over one-third of the ratings performed at the DEU on injuries between 2005 and 2012. The remaining cases have substantially lower impairment ratings and benefits, reflecting the fact that more severe cases take longer to reach the DEU.

The characteristics of cases differ in important ways across the three types of ratings performed at the DEU. These types are Consult ratings (47% of ratings examined in Table 5.1), Summary ratings (52%), and Formal ratings (1%). Workers evaluated by Consult ratings have legal representation, whereas workers with Summary ratings are unrepresented. Formal ratings, which are far less common, are performed at the request of a workers' compensation administrative law judge to help resolve issues in a disputed claim before the WCAB and may or may not be represented. Table 5.1 presents summary statistics separately for these three types of ratings. Consult ratings yield substantially higher impairment ratings than do summary ratings. Table 5.1 shows that the average final rating before apportionment is 21.4 for Consult ratings, over 75% higher than the average final rating of 12 for Summary ratings. Consult ratings have more rated impairments on average (1.7 impairments for Consult ratings vs. 1.2 for Summary ratings). Formal ratings represent a small fraction of all ratings examined in Table 5.1 (1.0%), although they appear to be differentially severe and complex cases, with higher final ratings.

Table 5.1 also presents average statutory benefit amounts based on final ratings. These amounts represent the undiscounted total value of PPD payments mandated by the Labor Code, and are our primary measure of benefit generosity. Because the DEU does not have reliable reporting of weekly pre-injury wages, the benefit amounts presented here are calculated at the statutory maximum. The average benefit, in constant 2014 dollars, was \$16,654 for the sample of DEU cases we use to estimate trends. Average benefits differ between Summary, Consult, and Formal ratings in line with the differences in impairment ratings.

The last rows of Table 5.1 report the mean and median number of days between the date of injury and the date of the first rating at the DEU for the constant-maturity subsample of cases we use to estimate trends in replacement rates for the DEU. This subsample of cases is restricted to injuries that are rated at the DEU within 851 days of the injury date so that we can directly measure trends through the end of 2012. Among this subsample of cases, the average time before a case in our sample is rated is about 18 months (528 days). In contrast, the average time between the date of injury and the first rating at the DEU for all available injuries occurring between 2005-2012 is over two years (817 days).

If the duration between an injury and a case's first rating at the DEU were random, restriction to a constant-maturity sample of cases would not limit our ability to measure trends in outcomes. Unfortunately, this is not the case: more severe and complex injuries systematically take longer after the date of injury to reach the DEU.⁴⁰ Outcomes for severe injuries in the years immediately preceding enactment of SB863 cannot currently be studied using the DEU data because many of these cases have not yet received any ratings and thus are not observed. The average levels of ratings and benefits described in this section accordingly may underestimate the averages observed among the full PPD population because the most severe cases are systematically excluded. Even so, trends among less severe cases are informative about how the disability rating process—meaning the collective behavior of workers, employers, insurers, doctors, lawyers, and judges—evolved over the eight years between SB899 and SB863.⁴¹ In spite of the limitation of our measured trends, we believe they may reflect the dynamics that will play out when the most severe cases from the later years of the SB899 era eventually reach the DEU.

Trends in Ratings and Benefits Under SB899

The sharp reductions in earnings documented in Chapter 4 would imply reductions in benefit adequacy if benefits remained constant over the 2005-2012 time period. Even though there were no statutory changes to benefits between 2005-2012, several other factors may have led to changes in the level of benefits over this time period.

First, we find that average disability ratings increased substantially between 2005-2012. This is consistent with some of the compositional changes documented in Chapter 4, where we noted that WCIS data on TTD duration and number of impairments suggest that injuries may have been slightly more severe during and after the great recession. Also, workers injured during and after the recession were older on average than those injured before the recession. Injury severity and age should both directly lead to higher impairment ratings, and so we would expect to see some of the decline in earnings offset by increased benefits.

⁴⁰ Final impairment ratings increase by 0.72 percentage points on average with each 100 days of time between the injury and the rating. See appendix for details.

⁴¹ In the appendix, we compare trends in wage loss and benefits among low- and high-maturity cases for an earlier period of time when higher-maturity cases can also be consistently observed. Trends in both wage loss and benefits moved in the same direction for low- and high-maturity cases with injury dates from 2005 to 2009.

Figure 5.1
Average Final Ratings by Quarter of Injury and Rating Type, DEU Ratings

Sample contains injuries occurring in 2005-2012 rated at the DEU within 851 days of injury (N = 117,654).

In addition to changes in the claimant population, the behavior of parties to the disability rating process can evolve over time such that ratings tend to creep upward. Physicians and applicants' attorneys may have taken some time after adoption of the *AMA Guides* in 2005 to learn how best to apply the new rating system. We might expect ratings to trend upward over time as knowledge about the rating system diffuses among doctors and attorneys, even if factors explicitly accounted for in the rating process are held constant.

Figure 5.1 presents average trends in final ratings on injuries occurring between 2005-2012 that were rated at the DEU within 851 days of injury, stratified by rating type. Besides having higher ratings on average, cases with legal representation also display a large upward trend beginning around the start of 2007. Between 2005 and 2012, the average final rating on a Consult rating evaluated at constant maturity increased from 18.9 to 22.9 for a cumulative percentage increase of 21%. Final ratings rose less sharply among Summary ratings between 2005 and 2012, from 10.9 to 12.4 for a cumulative percentage increase of 12%.

Another factor, however, may tend to reduce benefits relative to losses over time, offsetting the impact of higher ratings. This is the impact of wage growth and inflation on the real value of the maximum weekly wage allowable in calculating PPD benefits. PPD benefits are capped by a provision specifying a maximum dollar value for the weekly wage used to calculate benefits. Because this maximum is not indexed to inflation, the maximum weekly payment for PPD benefits erodes in real terms as prices and wages increase over time. It is worth noting that

inflation and real wage growth are separate processes that both tend to reduce the generosity of PPD benefits relative to earnings losses over time.⁴² This means that gradual reductions in the adequacy of PPD benefits are built into the labor code, making periodic reform legislation necessary in order to maintain any given wage replacement rate.

To illustrate how inflation and wage growth affect the real value of PPD benefits over time, Figure 5.2 converts the maximum weekly wage for ratings below 55% in all years from 2005-2014 to real 2006 dollars. Under AB749, this maximum was set at \$345 in 2006 and later years; SB863 increased it to \$435. We see that the real value of the maximum PPD benefit for workers with earnings above the weekly maximum declined by 12% in real terms between 2006 and 2012.

Figure 5.2 also illustrates the distinction between *price* inflation and *wage* inflation, which would be the relevant benchmark if changes in injury rates were uncorrelated with wages and if

⁴² Inflation refers to increases in the general price level in the economy. We use the annual Consumer Price Index for Urban consumers produced by the U.S. Bureau of Labor Statistics to measure inflation. We use the Statewide Average Weekly Wage (SAWW) as reported by DWC as our measure of the average wage. The SAWW is taken from <http://www.dir.ca.gov/dwc/WorkerscompensationBenefits.htm>. The SAWW is a nominal dollar amount and therefore captures the impact of both real wage growth and inflation, while the CPI purely captures the impact of inflation on consumer prices.

wage growth were constant across the income distribution. While the statewide average weekly wage grew slowly during the great recession (and even fell in real terms between 2010 and 2011), wage growth was still faster than inflation. To sum up, the value of the maximum weekly PPD benefit declined in terms of purchasing power and declined slightly more relative to statewide average wages. This factor has the potential to offset the trends toward higher benefits observed in Figure 5.1.

Figure 5.3 shows trends in statutory benefits calculated at the weekly maximum wage (adjusted for inflation to constant 2014 dollars) for our constant-maturity sample of the DEU. The trends in Figure 5.3 thus capture the effect of trends in ratings and changes in the real value of the weekly maximum wage on statutory benefits, but do not capture other factors such as changes in the wages of disabled workers that could affect statutory benefits. These data therefore should be viewed as an illustration of how the effective generosity of PPD benefits evolved between 2005-2012 in isolation from factors outside the WC system.

Figure 5.3
Statutory Benefits by Rating Type and Injury Date,
Constant-Maturity DEU Ratings

Sample contains cases with injury dates between 2005-2012 that were rated at the DEU within 851 days of injury. Weighted average rating is calculated assuming that the true share PPD cases with representation is 74% in all quarters of injury between 2005-2012 as per WCIRB (2015). Formal ratings are not included in figure. Formal ratings constitute 1.3% ratings performed at the DEU on 2005-2012 injuries rated by May 2015.

The increases in ratings documented in Figure 5.3 clearly outweigh any erosion in the real value of the weekly maximum. Between the 2005 and 2012 injury years, the average benefits for a case with representation rated at the DEU within 851 days of injury increased from \$22,990 to \$30,135, a cumulative percentage increase of 31% over seven years. However, benefits for cases without representation were essentially flat over this time period, increasing only from \$10,980 to \$11,689, a cumulative percentage increase of 6% over seven years.

Figure 5.3 also presents the unweighted average (green triangles) trend in statutory benefits for Summary and Consult ratings at the DEU. As noted in Table 5.1, 55% of the constant-maturity sample of ratings that are comparable through the end of 2012 have representation. Between the 2005 and 2012 injury years, the average statutory benefits for constant-maturity DEU ratings increased from \$17,495 to \$20,757, a cumulative percentage increase of 19% over seven years.

It is challenging, however, to draw inferences from the DEU data about the experience of the average case in the overall PPD population because the DEU underrepresents cases with legal representation by an unknown amount. As discussed in Chapter 3, represented cases often bypass the DEU and obtain ratings from private raters instead. To indicate how this uncertainty could affect our estimates of trends in statutory benefits for the overall PPD population, Figure 5.3 also presents a weighted average of benefits for represented and unrepresented cases under the assumption that 74% of cases are represented. This fraction of PPD represented cases was calculated by the WCIRB for a recent year and is likely to be accurate for injuries occurring at insured employers (WCIRB). Between 2005 and 2012, this weighted average level of benefits increased from \$19,869 to \$25,326, a cumulative percentage increase of 27% over seven years.⁴³

As discussed in Chapter 3, we treat the linked WCIS-EDD dataset (after reweighting for match failure) as the most representative source of data for estimating trends in earnings losses. Measuring trends in earnings losses in the DEU is challenging because it can take several years after the date of injury for the most severe cases to reach the DEU. However, it is necessary to use the DEU to simulate the impact of SB863 on final ratings and statutory benefits. We use a statistical model to predict the level of statutory benefits available to workers observed in the WCIS based on case characteristics that are reported early in the life of the claim. This approach allows us to exploit the detailed information about impairment ratings in the DEU without being forced to assume that the relationship between time to rating and earnings loss is constant over time.⁴⁴

⁴³ We view this estimate as somewhat tentative because the decision to seek representation may be very different in the self-insured sector. However, we think the reweighted DEU is a better approximation to the true average level of benefits than the unweighted DEU, which may understate benefits. We report trends in benefit adequacy based on the weighted average of cases in the body of the report, but we also discuss estimates of benefit adequacy based on the unweighted average, which are presented in full in the appendix.

⁴⁴ We describe our methods in detail in the appendix. Because, on average, less-severe cases are rated at the DEU before more-severe cases with the same injury date, the data available for this study present us with a dilemma between assuming a fixed relationship between time to rating and benefits and assuming a fixed relationship between time to rating and earnings losses. We choose to extrapolate trends in benefits from low-severity to high-

Finally, we note a third factor that is not captured in the ratings and benefits data presented above, but is likely to be very important: the evolution of case law governing disability rating. A series of decisions by the WCAB, later confirmed by the appellate courts, greatly expanded the flexibility that evaluating physicians have to assign higher impairment values than indicated by the *AMA Guides* to permanent partial disability cases and, in some cases, assign positive values to claims that would have rated 0% under the *AMA Guides, 5th Edition*. The most important of these cases were the Almaraz and Guzman cases, typically combined into *Almaraz/Guzman I* and *Almaraz/Guzman II*.⁴⁵

Almaraz/Guzman I held that:

- the PDRS and Guides were both prima facie evidence and therefore rebuttable,
- if the Guides impairment led to an inequitable or disproportionate PD rating, it could be rebutted, and
- a rebuttable impairment could be rated in part or in whole outside the *AMA Guides*

Almaraz/Guzman II narrowed the original decision by holding that:

- the PDRS rating was rebuttable, but
- the alternative rating had to stay within the "four corners" of the *AMA Guides*.

As interpreted, the Almaraz/Guzman decisions also place some requirements upon the evaluating physician in proposing an alternative:

- The doctor cannot arbitrarily choose a *Guides* method to achieve a desired result.
- A report must constitute substantial evidence.

severity cases rather than extrapolating trends in wage loss because the large increases in earnings losses documented in Chapter 4 seem more likely to drive trends in benefit adequacy.

⁴⁵ An excellent explanation of the Almaraz/Guzman decisions with examples of the variation in calculation is available from the DIR website at: https://www.dir.ca.gov/dwc/educonf17/PD_Rating/PDRating.pdf

Table 5.2

***Almaraz*Cases as Percent of Each Rating Type by Transaction Date**

Calendar Year of Rating	Rating Type		
	Summary	Consult	Formal
2005	0%	0%	0%
2006	0%	0%	0%
2007	0%	0%	0%
2008	0%	0%	0%
2009	1.3%	6.9%	0.9%
2010	3.0%	17.5%	5.2%
2011	6.8%	23.0%	6.8%
2012	18.0%	25.0%	5.2%
2013	19.5%	25.6%	7.9%
2014	20.0%	25.8%	9.9%
2015 (thru 5/13/15)	19.1%	27.1%	2.3%

Rating type determined by DEU coding for latest rating, chronologically.

Almaraz rating determined by identification of specific phrases used by DEU raters in the final rating text. If any rating included the identifying text, the claim was identified as *Almaraz*

- The doctor must set forth facts and reasoning to support an alternative rating.

Table 5.2 presents data on the volume of *Almaraz* ratings identified at the DEU. Note that, unlike the figure shown above, Table 5.2 groups cases by the timing of the *rating*, not the injury date. Alternative ratings quickly became important in represented cases. Applicant and defense lawyers frequently submitted detailed letters to evaluating physicians arguing for and against broadening the rating criteria in individual cases. Diffusion of alternative rating methods to unrepresented cases (Summary ratings) developed more slowly, possibly as evaluating doctors became accustomed to issuing an alternative rating when it seemed warranted. The fraction of both types of ratings seems to have reached a plateau around 2012-2013 and this may represent the fraction of alternative ratings we can expect going forward.

We have not incorporated *Almaraz* ratings into our main analysis of statutory benefits and wage replacement rates in this chapter because the DEU data do not provide information about whether *Almaraz* ratings were based on underlying reports that met the legal requirements placed on evaluating physicians' opinions as outlined in *Almaraz/Guzman*. Instead, we conduct an analysis at the end of this chapter that illustrates the potential impact of alternative ratings on indemnity benefits.

There was a second important case law decision affecting application of the AMA Guides during the period between SB 899 and SB 863. The *Ogilvie* case law introduced a different type of alternative rating that essentially stepped completely outside the AMA guides. These ratings are not thought to be frequent, in part because they require extensive expert testimony. And these ratings are almost never visible in the DEU data. In addition, the impact *Ogilvie* decision was eliminated by statutory changes under SB 863. Consequently, the impact of the *Ogilvie* decision

was not evaluated. This will tend to bias the estimated indemnity down by an unknown, but probably limited amount.

To sum up, ratings performed at the DEU indicate that there was a steady upward trend in ratings and statutory benefits for permanently disabled workers injured between 2005 and 2012. Statutory benefits for low-maturity cases that can be compared across time over this entire period may have increased by 19% to 28% between the 2005 and 2012 injury years: higher ratings clearly outweighed the effects of inflation, especially for represented cases, which constitute a majority of PPD cases in California. These increases in ratings and benefits have the potential to offset the increased earnings losses observed in Chapter 4, at least in part. In the remainder of this chapter, we compare benefits for permanently disabled workers to earnings losses in order to assess trends in benefit adequacy under SB899 and the impact of SB863.

Definition and Measurement of Benefit Adequacy

A goal of workers' compensation policy is to protect workers against income losses caused by accidents. The extent to which benefits successfully indemnify workers against losses is known as the *adequacy* of benefits. Benefit adequacy has been widely accepted as a normative benchmark for evaluating workers' compensation policy since at least the National Commission Report of 1972 (National Commission 1972, Peterson, Reville et al. 1997, Boden and Galizzi 1999, Reville, Boden et al. 2001, Reville, Seabury et al. 2005, Seabury, Reville et al. 2011). The National Commission did not make specific recommendations for permanent partial disability benefits that would permit a translation of providing “substantial protection against interruption of income” into a numerical or quantitative standard. However, for temporary total and permanent total disability, the National Commission recommended that, subject to the state’s maximum weekly benefits, the disability benefits be at least two-thirds of the worker’s pre-injury *gross weekly wage* or four-fifths (80%) of the worker’s *after-tax* income.

If a similar degree of protection were provided for permanent partial disability as for permanent total disability, then after the date of MMI, the PPD benefits should replace two-thirds of the difference between the worker’s expected gross earnings (the earnings that a worker would have earned had they not been injured) and the worker’s actual gross earnings. Alternatively stated, benefits are adequate if the replacement rate – the PPD benefits divided by the earnings losses experienced by injured workers – is at least 66 2/3 percent. The replacement rate of 66 2/3 percent (or two-thirds) of lost wages (measured before payroll deductions for taxes or other items) as the measure of adequacy represents the majority position of a National Academy of Social Insurance report on the adequacy of permanent partial disability benefits (Hunt 2004).

As in much previous research, we focus on the *wage replacement rate*, or the fraction of earnings losses due to injury that is compensated by PPD benefits, as our measure of benefit adequacy. Because workers' compensation benefits are not subject to income and payroll taxes, we report after-tax replacement rates throughout the report.⁴⁶ Applying income and payroll taxes

⁴⁶ Our income tax calculator includes Federal and California income taxes. We approximate income tax liability assuming that workers have no non-income labor sources and that all workers file singly and take the standard

has a sizable impact on post-injury wages: average control worker earnings in the first post-injury year are 31.2% lower after taxes than before taxes. It is worth noting that the percentage reduction in average income due to taxes is higher than the tax rate faced by the typical worker. If we calculate the average tax rate for each worker in our sample, we find that the median worker in the sample had an average tax rate of 25.9% (17.3% excluding payroll taxes).

We calculate wage replacement rates as the ratio of statutory benefits to estimated earnings losses over the first five years following the date of injury. Because we do not have five years of follow-up data for recent cohorts, we use a sample of injuries from 2008 and earlier to estimate the ratio between 5-year earnings losses and earnings losses in the second year.⁴⁷ It is important to note that these wage replacement rates are a benchmark intended to facilitate comparison across alternative policies and trends over time, and are likely to understate lifetime earnings losses for many workers because earnings losses may persist well beyond five years. This is particularly true for the most severe injuries.

Anticipated Impacts of SB863 on Benefit Adequacy

SB863 implemented several changes to the PD rating system and also changed the relationship between impairment ratings and indemnity benefits. The ratings changes included elimination of certain secondary "add-on" impairments, elimination of the 15% bump-up/bump-down incentives for post-injury employment, and increases in the Future Earnings Capacity adjustment factors. We defer detailed discussion of these provisions until we examine ratings in Chapter 6. In this chapter, we focus on the net effect of these provisions on final ratings and benefits, which was expected to be a sizable increase in indemnity payments.

In addition to changing the ratings process, SB863 included increases in the level of indemnity benefits available to the majority of workers. The minimum weekly benefit was increased from \$130 to \$160. For workers with ratings less than 70%, the maximum benefit was increased in two steps from \$230 per week to \$290 per week. And for workers with ratings between 70% & 99% the maximum was increased from \$270 per week to \$290 per week. Because over two-thirds (68.7%) of injured workers had weekly wages greater than \$405 per week, raising the maximum benefit rate is likely to have a substantial impact. Only 6% of workers are affected by the increase in the minimum benefit.

deduction. These assumptions are necessary because we lack data on non-labor income, family structure, and homeownership and other deductible expenditures. Because our follow-up periods for workers are based on the quarter of injury and do not align with tax years for the majority of our sample, we tax income received over a period that spans two tax years under the rates in place at the end of the period.

Payroll taxes include both Social Security and Medicare contributions (7.65%) and State Disability Insurance contributions (between 0.8% and 1.2%). Yearly changes in the taxable income limit for payroll taxes were accounted for, as were fluctuations in the SDI contribution rate.

⁴⁷ This factor is 4.74. Proportional earnings losses are flat after the second year, but the dollar value of earnings losses diminishes over time as control worker earnings revert toward a long-run average as discussed in Section 3. See Appendix D for further details.

In addition to these changes in impairment ratings and benefits, SB863 added a new benefit called the Return-to-Work Benefit for selected workers with permanent partial disabilities. As implemented by the DWC, this benefit is paid to workers that applied for and received a Supplemental Job Displacement Benefit (SJDB) voucher. Permanently impaired workers are eligible for the SJDB voucher if their employers are unable to offer them jobs that meet their work restrictions and that pays near their pre-injury wages. As currently implemented, the benefit pays \$5,000 to each eligible worker that applies.

We simulate the impact that these provisions of SB863 would have had on benefits had they been in place over the period 2005-2012. Specifically, we address the following questions:

- What would wage replacement rates have been over the period 2005-2012 if SB863 had been in place?
- Which changes in ratings and benefits under SB863 are likely to have the most important impact on wage replacement rates?

To address these questions, we analyze these three provisions (changes to the minimum and maximum benefits, changes to the FEC, and elimination of specific add-on impairments) of SB863 separately by simulating two levels of statutory benefits for each case in the DEU. First, to capture the impact of the benefit increase, we calculate benefits under the SB863 weekly maximum using ratings actually calculated under SB899. Then, to capture the full impact of the rating and benefit changes, we use detailed information on impairment ratings to recalculate final ratings under SB863 and recalculate benefits under the SB863 maximum benefit. Finally, we examine earnings at the at-injury employer following the date of maximum medical improvement as reported in the WCIS to approximate eligibility for the Return to Work Benefit. This procedure is likely to overstate eligibility for the benefit because some separations from the at-injury employer may be voluntary, and so we view our estimates as providing an upper bound for the effect of the Return to Work Benefit on adequacy.

SB863 involved two other, potentially important changes to the impairment rating system that are more difficult to analyze. First, the bill eliminated language that was key to the Ogilvie decision, theoretically making it impossible to challenge the *AMA Guides* ratings through claims of higher wage loss.⁴⁸ These ratings, while likely quite high, were thought to be very infrequent. They are also not visible in the DEU or WCIS data.

Second, as discussed above, SB863 added LC4660.1(h) explicitly acknowledging in statute the application of the Almaraz/Guzman series of decisions.⁴⁹ It is unknown if this will affect the

⁴⁸LC 4660 (a) was changed, removing the reference to future earning capacity that triggered Ogilvie. 4660(a) was changed to LC 4660.1(a)"In determining the percentages of permanent disability, account shall be taken of the nature of the physical injury or disfigurement, the occupation of the injured employee, and his or her age at the time of the injury, ~~consideration being given to an employee's diminished future earning capacity.~~"

⁴⁹SEC. 60. Section 4660.1 is added to the Labor Code, to read:

4660.1. This section shall apply to injuries occurring on or after January 1, 2013.

...

4660.1. (h) In enacting the act adding this section, it is not the intent of the Legislature to overrule the holding in *Milpitas Unified School District v.*

frequency of alternative ratings, which are typically substantially higher than ratings under the *AMA Guides*. We revisit the question of how alternative ratings could affect benefits at the end of this chapter.

Benefit Adequacy Under SB899 and SB863

Table 5.3 reports estimated 5-year earnings losses and benefits for the WCIS sample between 2005-2012. As shown in Chapter 4, after-tax earnings losses increased sharply in the great recession and remained elevated during the early years of the economic recovery. We estimate that earnings losses over the first five post-injury years would be \$40,778 for the average worker injured between 2005-2012, increasing from \$36,238 before the recession to \$45,484 after the recession. We estimate that statutory benefits for the WCIS PPD population increased less sharply than suggested by the trends in the DEU reported above, growing from \$23,285 for injuries in 2005-2007 to \$24,357 for injuries in 2008-2009, and then declining slightly in 2010-2012, to \$23,793.

Table 5.3
After-Tax Earnings Losses, Statutory Benefits, and Paid Amounts, 2005-2012 WCIS

	Injury Year 2005- 2007	Injury Year 2008- 2009	Injury Year 2010- 2012	All Years
Projected Five-Year Earnings Losses	\$36,238	\$42,906	\$45,484	\$40,778
SB899 Statutory Benefits	\$23,285	\$24,357	\$23,793	\$23,719
SB899 Statutory Wage Replacement Rate	64.3%	57.1%	52.4%	58.8%
Paid Amount to Date	\$13,571	\$13,515	\$9,298	\$12,266
% of Cases Closed	51.3%	51.0%	41.9%	48.4%
Number of Observations (Unweighted)	150,523	90,507	104,252	345,282

After tax earnings losses estimated using 2005-2012 WCIS matched to EDD earnings records, reweighted to correct for match failure. Statutory benefits including present discounted value of life pension estimated using matched WCIS-DEU sample. Fitted benefits stratified on representation and reweighted to 74% represented as per WCIRB (2015). Wage replacement rates are calculated at the quarterly frequency before being averaged over time. See appendix for details. Paid amounts include both indemnity benefits and settlements. WCIS data were extracted in September, 2014. All dollar amounts adjusted for inflation to constant 2014 dollars.

Table 5.3 also includes figures on the total amount of PPD indemnity benefits and PPD settlements paid to date as of the time when the WCIS data were extracted in September 2014. Averaged over the entire 2005-2012 time period, paid benefits are just 52% of statutory benefits. This low ratio of paid benefits to statutory benefits is in large part an artifact of the high proportion of cases that remained open at the time of data extraction, particularly in the most

Workers' Comp. Appeals Bd. (Guzman) (2010) 187 Cal.App.4th 808.

recent years of data, when the proportion of claims with paid PPD that were closed fell to 42%.⁵⁰ We include these data in Table 5.3 in part to illustrate one motivation for our focus on statutory benefits: it is too soon to draw meaningful conclusions from trends in paid benefits through the end of 2012.

We estimate that the after-tax statutory wage replacement rate for workers injured between 2005-2012 was 64.3% on average. We find that after-tax statutory wage replacement rates fell during the great recession and then declined further during the post-recession period, from 64.3% for injuries occurring in 2005-2007 to 57.1% for injuries occurring in 2008-2009 and to 52.4% for injuries occurring in 2010-2012.

Readers may be concerned that growth in benefits for the WCIS population is flatter than the trend calculated in the DEU. The flatter trend in the WCIS is largely driven by the fact that our estimates for the WCIS factor the pre-injury weekly wage into the benefit calculation, whereas our estimates for the DEU calculated benefits at the weekly maximum. As discussed in Chapter 4, the population of permanently disabled workers shifted toward lower-wage workers following the great recession. Even though the real value of the weekly maximum wage was eroded by inflation, the compositional shift in the PPD population actually led to a slight reduction in the proportion of workers with earnings above the weekly maximum and a slight increase in the proportion of workers below the weekly minimum. Figure 5.4 illustrates these trends.

⁵⁰ The sample of injuries between 2005-2012 with linked WCIS-DEU data allows us to examine the relationship between paid amounts and statutory benefits using individual-level data. On closed cases, paid-to-date amounts are, on average, 86% of statutory benefits. On open cases, paid-to-date amounts are 56% of statutory benefits. Even on the cases with the earliest injury dates, open cases tend to be more severe and have higher statutory benefits by approximately 50%.

Figure 5.4
Percentage of PPD Workers with Wages Above Weekly Maximum or Below Weekly Minimum

Workers receiving PPD in WCIS between 2005-2012, unweighted N = 345,282

Figure 5.5
Statutory After-Tax Wage Replacement Rates Under SB899 and SB863, 2005-2012

After tax earnings losses estimated using 2005-2012 WCIS matched to EDD earnings records. Statutory benefits including present discounted value of life pension estimated using matched WCIS-DEU sample. See appendix for details. Dashed horizontal line indicates 80% target wage replacement rate.

Figure 5.5 illustrates what trends in replacement rates for the WCIS would have been under SB863: averages over the pre-recession, recession and post-recession periods are reported in Table 5.5. The intermediate blue line depicts replacement rates for benefits calculated using SB899 ratings with the SB863 maximum wage. The black line, meanwhile, shows the full effect of the ratings changes and benefit increases enacted under SB863. While all three lines (mechanically) reflect the impact of the earnings loss trends reported in Chapter 4, both the increased maximum wage and the changes to ratings translate into sizable increases in wage replacement rates.

Our estimate of the statutory after-tax wage replacement rate for all workers injured in 2005-2012 is 58.8%. For these workers, the SB863 weekly maximum would have increased after-tax wage replacement rates to 69.2%, while the combined impact of rating changes and the weekly maximum would have increased benefits to 76.8% of lost wages over the first five post-injury years. The higher weekly maximum wage would have increased benefits by about 10.4 percentage points, while the changes to the rating system (combined with the benefit increase)

would have led to a further increase of 7.5 percentage points. The Return to Work Benefit, depicted in the black line on Figure 5.4, increases the after-tax wage replacement rate by an additional 3.5 percentage points.

Table 5.4: After-Tax Wage Replacement Rates Under SB899 and SB863 by Year of Injury

	Injury Year 2005-2007	Injury Year 2008-2009	Injury Year 2010-2012	All Years
SB899 Benefits	64.3%	57.1%	52.4%	58.8%
SB863 Maximum Applied to SB899 Ratings	76.3%	66.8%	61.2%	69.2%
SB863 Benefits and Ratings	85.4%	74.3%	66.4%	76.8%
SB863 + Return to Work Fund	89.0%	77.6%	69.8%	80.2%

The combined effect of the three SB863 provisions modeled here will be a substantial increase in after-tax wage replacement rates for permanently disabled workers. Had all three provisions been in place over 2005-2012, wage replacement rates would have been 24.7 percentage points (39%) higher for workers injured in 2005-2007, 20.5 percentage points (36%) higher for workers injured in 2008-2009, and 17.4 percentage points (33%) higher for workers injured in 2010-2012. The declining impact of SB863 on wage replacement rates is in part a mechanical consequence of greater earnings losses in recent years (which increase the denominator of the wage replacement rate). It may also reflect the reduced impact of the hike in the maximum weekly wage, which is driven by the lower portion of workers constrained by the weekly maximum. In contrast to the weekly maximum and the changes to ratings, which have smaller effects (in percentage points) on the wage replacement rate after the recession, the effect of the return to work fund remains nearly constant in magnitude over the 2005-2012 period.

We present several alternative estimates of trends in benefit adequacy in the appendix to assess the robustness of our conclusions, including estimates that focus only on a constant-maturity subset of cases from the DEU. We also report estimates for the WCIS that use different assumptions in estimating statutory benefits. Alternative methods lead to a lower baseline (2005-2007) level of statutory after-tax wage replacement under SB899. The constant-maturity DEU sample, which uses data on earnings losses and benefits for the same individuals, yields estimated after-tax wage replacement rates over the 2005-2012 period around 50%, as do our estimates using the WCIS that do not reweight the fraction of represented cases.

However, there are good reasons why we might expect these alternative methods to yield lower wage replacement rates, and so the difference in results do not necessarily indicate that the wage replacement estimates reported in this chapter are too high. A constant-maturity sample from the DEU systematically omits the most severe cases, which (as we discuss in Chapter 6) tend to have higher wage-replacement rates over the fixed five-year time horizon we consider in this study. Similarly, estimates of benefits that do not account for the DEU's underrepresentation of cases with attorney involvement may lead to underestimates of replacement rates because

cases with legal representation have higher ratings and benefits. The 50% figure may be a lower bound for the statutory after-tax wage replacement rate under SB899.

More importantly, all these methods yield similar estimates of the change in benefit adequacy between 2005-2012, and of the impact of changes enacted under SB863 on benefit adequacy: SB863 would have increased after-tax wage replacement rates by 20 to 25 percentage points for the average worker injured during the 2005-2012 period (16 to 20 percentage points for the average worker injured in 2010-2012). We conclude that the large reductions in post-injury earnings that followed the great recession drove the trends in wage replacement rates. While alternative assumptions lead to higher estimated levels of statutory wage replacement, differences in the methodology used to estimate average statutory benefits do not alter the basic conclusion that after-tax wage replacement rates fell after the great recession, and that the benefit increases in SB863 are large enough to offset these increases in earnings loss.

Potential Impacts of *Almaraz v. Guzman*

The above analysis did not incorporate the possible impact of the *Almaraz/Guzman* decisions. In order to illustrate how *Almaraz* could alter our findings, we present the first detailed estimates of the impact of *Almaraz/Guzman* using data from all DEU ratings under the AMA Guides performed between 1/1/2005 and 5/13/2015. This effort required key assistance from the DWC and especially the DEU to correctly identify how these ratings were handled by the DEU

We find that *Almaraz* is likely to have had an important and substantial impact on the ratings and statutory benefits available to permanently disabled workers. We estimate the impact of an *Almaraz* rating relative to the underlying AMA rating. The estimated impact is given in Table 5.6. The average impact by type of rating is given at the top of the table (+9.7 rating points for Summary ratings, + 13.5 rating points for Consults, and + 13.0 rating points for Formals).

Table 5.6

Impact of *Almaraz/ Guzman* on Final Ratings before Apportionment

	Summary Ratings (Before Apportionment)				Consult Ratings (Before Apportionment)				Formal Ratings (Before Apportionment)			
	n =	Average AMA Rating	Average Almaraz Increase (Pct. points)	Std. Err of Almaraz Increase	n =	Average AMA Rating	Average Almaraz Increase (Pct. points)	Std. Err of Almaraz Increase	n =	Average AMA Rating	Average Almaraz Increase (Pct. points)	Std. Err of Almaraz Increase
All	1,743	9.59	9.71	0.202	8,574	23.10	13.48	0.127	38	34.08	13.00	1.77
0%	563	0.00	8.21	0.313	698	0.00	17.77	0.651				
1% - 5%	293	3.28	9.60	0.451	644	3.32	13.02	0.435				

6% - 10%	301	7.93	9.70	0.455	1,016	8.14	13.19	0.380
11% - 20%	338	15.29	11.00	0.550	2,231	15.55	13.51	0.239
21% - 40%	197	28.63	11.58	0.686	2,567	29.01	13.69	0.218
41% - 60%	47	47.91	11.26	0.949	1,014	48.50	12.61	0.318
61% - 99%	4	75.25	12.50	2.598	392	71.80	10.31	0.373

Data is from the DEU ratings done between 1/1/2005 and 5/13/2015 under the AMA Guides-based PDRS

It is quite interesting and useful that the average impact of Almaraz, within rating type, is reasonably consistent across the range of underlying AMA ratings. Even when the underlying AMA rating is 0% or the rating is above 60%, the impact of Almaraz in absolute rating points is similar.

We have calculated the impact of alternative ratings on statutory benefits. Here we are estimating the impact if the alternative rating was used instead of the baseline AMA rating.

Table 5.7

Estimated Impact of Almaraz type ratings on PD indemnity

(Cases with alternative ratings only, DEU ratings data, 2005-2015)

	Rating Type		
	Summary	Consult	Formal
AMA ratings	\$13,089	\$27,899	\$47,425
Almaraz Ratings	\$19,845	\$47,192	\$73,458
Difference (\$)	\$6,756	\$19,293	\$26,033
Difference (% of AMA)	51.6%	69.2%	54.9%

The estimates in Table 5.7 reflect the potentially large impact of alternative ratings among cases for which these ratings are calculated. These increases are large enough, and alternative ratings are widespread enough, that these ratings could have a meaningful impact on the average level of statutory benefits for all PPD cases. If all the alternative ratings performed by the DEU between 2012 and May, 2015 (regardless of injury date) were legally valid, these ratings would increase statutory benefits for the average Summary-rated case by \$1,300, or about 10%. On Consults the increase would be about \$4,800 or 17%. Formal ratings have a similar range of impacts, but the small number of Formal ratings with information on both *Almaraz* and AMA ratings makes these estimates more unreliable.

The most important limitation of this analysis is that whether the AMA or *Almaraz* rating will ultimately prevail and be determinant of the amount of indemnity received by the worker involves two complex issues that are not visible in the DEU data.

The question of whether the doctor's report on the issue constitutes "substantial evidence" adequately setting forth the facts and reasoning for an alternative rating is a legal matter. That decision can only be made by a judge, who likely will choose one or the other rating as dispositive. It is also possible that the parties to the case can settle the issue without a legal finding. Under these circumstances, we would expect the settled amount of indemnity to fall somewhere between the levels of statutory benefits defined by the AMA and Almaraz ratings. Consequently, the alternative rating should be seen as an upper bound on the impact of the *Almaraz/Guzman* approach on the final rating in cases where an alternative rating is given.

Discussion

While statutory benefits trended upward over the period from 2005-2012, reduced earnings for injured workers outweighed the impact of higher benefits and led to a decline in after-tax wage replacement rates for workers injured in 2008 and later years. After-tax replacement rates for injuries in 2005-2007 were 64.3% for the WCIS, but fell to 52.4% for injuries in 2010-2012. Alternative methods lead to lower estimates of wage replacement rates but yield very similar trajectories of percentage point declines over the 2005-2012 period.

A limitation of the method used to calculate after-tax replacement rates in this analysis is that we have included earnings losses in the first post-injury year in the denominator of our wage replacement rates. A portion of earnings losses during the first post-injury year is likely to include lost earnings that were compensated by temporary total disability benefits, and so our estimates may overstate the level of earnings losses experienced over the first five years of *permanent disability*: the median duration between the date of injury and the date of maximum medical improvement in the WCIS is slightly over one year, meaning that this would be a concern for the typical worker. An alternative approach that is less likely to capture losses due to temporary total disability is to calculate earnings losses over the second through fifth post-injury years and scale up the result by 25% to approximate losses over the first five years of the permanent disability period. This method would reduce our estimates of five-year earnings loss by 4.9% across the board, implying 2005-2012 average after-tax wage replacement rates under SB899 that are 3.0 percentage points higher than those reported in Table 5.4 but not meaningfully changing our conclusions about how replacement rates evolved over time or the impact of SB863. We do not view this as a major limitation of our analysis, since (as discussed above) the choice of a five-year wage window over which to evaluate benefit adequacy is likely to understate lifetime earnings losses for most workers.

Our estimates suggest that SB863 led to a dramatic improvement in the adequacy of PPD benefits as the SB863 reforms were phased in over 2012 and 2014. The increases in benefits and ratings due to SB863 were substantial enough to undo the effects of higher earnings losses and increase wage replacement rates slightly above the levels observed in 2005-2007 under SB899. For injuries occurring in 2010-2012, estimated after-tax replacement rates under the SB863 benefit and rating changes would have been 69.8% for the WCIS, significantly higher than the

52.4% replacement rate SB899. The most important factor explaining declining replacement rates over this period appears to be increased earnings losses during the great recession. Because earnings fell so sharply, much of the increase in benefits enacted under SB863 serves to return replacement rates to approximately the level (64.3%) observed under SB899 for the period prior to the great recession.

6. Impacts of SB863 on Disability Ratings and Benefit Equity

In addition to overall benefit adequacy, a fair assignment of benefits to workers should also be a policy objective of the workers' compensation system. In this chapter, we analyze the implications of SB863 for the fairness, or *equity*, of PD ratings and indemnity benefits. As discussed in Chapter 5, SB863 will substantially increase overall wage replacement rates for permanently disabled workers, offsetting the declines in post-injury earnings documented in Chapter 4. However, there is no guarantee that improvements in adequacy will simultaneously improve the equity of the rating and benefit systems across different groups of workers, or that increase in benefits will be targeted to the workers experiencing the greatest losses.

This chapter considers the provisions of SB863 and examines detailed data on disability ratings conducted under SB899 and under SB863 to address the following questions:

- What impacts would we expect SB863 to have on the equity of PD ratings and benefits?
- Has SB863 affected the initial ratings performed under the new rating system?
- What was the relationship between earnings losses, ratings, and benefits under SB899 for the average impairment, and how will SB863 change this relationship?
- How were different impairments of similar severity treated under SB899, and what will be the impacts of SB863?
- Will SB863 affect low-wage and high-wage workers differently?

Which groups of disabled workers will be affected by rating and benefits changes under SB863?

SB863 made a number of changes to the calculation of ratings and the rate at which Permanent Partial Disability benefits are paid. First, the legislation eliminated compensation for certain secondary impairments that were "added on" to the primary impairment. These included sleep, sexual dysfunction, and psychiatric impairments secondary to a primary condition. Sleep and sexual dysfunction had very small effects on overall average ratings, but psychiatric impairments were expected to have an important impact.

Second, SB863 eliminated the 15% bump-up/bump-down in the weekly PPD benefit rate that depended on whether the at-injury employer could offer a worker post-injury employment with a wage near pre-injury levels. If the employer offered such work, weekly benefits were reduced by 15%. If no complying offer was made benefits were increased by 15%. Like the add-on elimination, the bump-up/bump-down elimination was expected to have limited impact because the implementing language in SB899 was interpreted by the courts to mean a substantial fraction of PPD benefits are paid out before the bump-up/bump-down could be applied.

SB863 also increased all Future Earning Capacity (FEC) adjustment factors to 1.4. Under SB899 FEC factors ranged from 1.1 to 1.4 and averaged 1.22. This was expected to lead to a substantial increase in PPD indemnity, but also to vary substantially by the type of impairment.

For example, impairments of the hand/fingers would have their FEC increased from 1.1 to 1.4. Psychiatric impairments would have the same FEC (1.4) under SB899 and SB863.

In short, changes in disability ratings under SB863 will primarily affect workers whose impairments are from lower FEC groups. As discussed in Chapter 5, much of the increase in benefits under SB863 will come about through the increase in the maximum weekly wage used in calculating PPD benefits and, to a lesser extent, the increase in the minimum weekly wage. These increases should have the largest effect on workers with wages above the weekly maximum wage under SB899. The return to work benefit will have a more limited impact on adequacy because it is fixed at a fairly modest amount independently of the worker's earnings, but this design feature should make it more valuable to lower-wage workers, while the fact that the return to work benefit is tied to post-injury outcomes (in contrast to other PPD benefits) could allow it to have a larger impact on the equity of benefits.

In the remainder of this Chapter, we present analyses of how the rating changes under SB863 are likely to affect the distribution of impairment ratings and the fairness of the disability rating system. As in Chapter 5, the limited amount of data on ratings actually conducted under SB863 leads us to focus instead on simulating outcomes for the population of cases rated under SB899. We focus exclusively on cases evaluated at the DEU in this chapter because evaluation of equity requires detailed information about the specific impairments that affect each worker.

DEU Rating Data

Table 6.1 presents summary statistics on cases rated at the DEU under SB899 through May 2015. Our analysis sample for this table excludes cases with incomplete information on final ratings, impairment codes, or the type of rating, but includes cases that were not matched to earnings data from EDD. These exclusions leave us with 191,477 unique cases from injuries occurring between 2005-2012. In contrast to Chapter 5, where we focused on a constant-maturity sample of DEU cases in order to analyze trends in ratings, we use all available ratings regardless of case maturity in Table 6.1 and the subsequent analysis. Pooling all these cases together, the average final rating before apportionment was 20.3. At the statutory maximum wage under SB899, nominal statutory benefits averaged \$21,432 excluding life pensions, and \$23,098 including the present discounted value of life pensions.⁵¹ 65.4% of cases had a single rated impairment, 19.0% had two rated impairments, and 15.6% had three or more rated impairments.

The characteristics of cases differ sharply across types of ratings. Three types of ratings are performed at the DEU: Consult ratings (55% of SB899 ratings in our sample), Summary ratings (44%), and Formal ratings (1.3%). Workers evaluated at Consult ratings have legal representation, whereas workers at Summary ratings are unrepresented. Formal ratings, which are far less common, are performed at the request of a workers' compensation judge.

⁵¹ Conversion of life pensions into a present value is complicated because the life span of a beneficiary is uncertain. We assume that life pensions are received as a lump sum as soon as the worker becomes eligible for payments to begin, but we discount this lump sum back to the date of injury at a 2.3% discount rate. We also assume that workers live to age 80.

Consult ratings, which are performed at the request of an attorney, yield substantially higher impairment ratings than do summary ratings. Table 6.1 shows that the average final rating before apportionment is 25.8 for Consult ratings and 12.9 for Summary ratings. Consult ratings are also more likely than Summary ratings to have multiple rated impairments (46.8% of Consult ratings vs. 18.3% of Summary ratings). Formal ratings are a special subset of both represented and unrepresented claimants. Formal ratings are those requested of the DEU by a workers' compensation administrative law judge to help resolve issues in a disputed claim before the WCAB. They represent a small fraction of all ratings (1.3%), although they appear to be differentially severe and complex cases, with higher final ratings

The last rows of Table 6.1 report the mean and median number of days between the date of injury and the date of the first rating at the DEU. The average time before a case in our sample is rated is over two years (817 days), and the median is about 23 months (696 days). Consult and Formal ratings are substantially slower to reach the DEU than are Summary ratings.

Table 6.1

Characteristics of DEU Ratings Performed Under SB899

	All ratings	Consult Ratings	Summary Ratings	Formal
Number of Ratings	191,477	105631	83350	2496
Percentage of Total Ratings	100%	55%	44%	1%
Final Rating Before Apportionment*	20.3	25.8	12.9	35.0
Statutory Benefit at Maximum Weekly Wage				
Without Life Pension	\$21,432	\$29,176	\$11,012	\$41,661
Including Life Pension**	\$23,097	\$31,867	\$11,205	\$49,130
Average Number of Rated Impairments	1.6	1.9	1.2	2.3
Number of Rated Impairments				
0	0.07%	0.06%	0.09%	0.04%
1	65.41%	53.12%	81.68%	41.95%
2	19.00%	23.38%	13.88%	24.00%
3	7.58%	11.15%	2.89%	13.26%
4	3.86%	6.00%	1.02%	8.09%
5	1.70%	2.78%	0.24%	5.00%
6	2.13%	3.51%	0.21%	7.93%

Days to First Rating

Average	817	937	650	1185
Median	696	808	566	1044

Sample includes all DEU cases with injury date between 2005-2012 with final rating reported, impairment code for highest-rated impairment, and rating type (consult, summary, or formal) reported.

* Row excludes 538 cases without apportionment information reported

** Includes discounted present value of life pension

Figure 6.1 illustrates the distribution of final ratings for the data underlying Table 6.1. Ratings are skewed to the right, with half of ratings falling between zero and fourteen and 75% of ratings falling between zero and twenty-six. The shape of this distribution is important to bear in mind because the scarcity of very high ratings makes it more difficult to analyze equity and other outcomes for the most severe injuries: just 10% of cases have ratings above 45.

Figure 6.1
Distribution of Final Ratings Performed Under SB899

Table 6.2 presents further detail on the composition of the DEU caseload by body system and presence of add-on impairments. For reporting purposes and for the analysis of horizontal equity presented later in this chapter, we classify cases by the chapter of the *AMA Guides* used to rate the highest-rated impairment on the case. The most frequently impaired body system is the Spine (37% of cases overall), followed by the Upper and Lower Extremities (32% and 18%, respectively). Mental and Behavioral disorders are the next most-common category (5%), followed by the Central/Peripheral Nervous System (2%), the Cardiovascular System (2%), and

the Digestive System (1%). A residual category of 10 "Other" impairment types comprises the final 3% of cases.

Table 6.2 Body System Distribution and Add-On Impairments Among DEU Ratings Performed Under SB899

	All ratings	Consult Ratings	Summary Ratings	Formal
Body System of Highest-Rated Impairment				
Spine	36.8%	42.4%	29.4%	42.3%
Upper	32.10%	26.15%	40.10%	17.3%
Lower	17.8%	13.3%	23.7%	9.0%
Mental/Behavioral	4.9%	7.3%	1.7%	11.2%
Central/Peripheral Nervous System	2.4%	3.5%	1.0%	4.5%
Cardiovascular (Any)	1.9%	2.4%	1.0%	7.4%
Digestive	1.3%	1.9%	0.4%	3.4%
Other	2.9%	3.1%	2.6%	4.6%
Percentage with Add-on Impairments				
Psychiatric	2.2%	3.7%	0.06%	5.9%
Sleep Disorder	0.6%	0.9%	0.03%	2.6%
Sexual Dysfunction	0.1%	0.2%	0.02%	0.5%
Pain	16.3%	22.5%	8.5%	19.6%

Sample includes all DEU cases with injury date between 2005-2012 with final rating reported, impairment code for highest-rated impairment, and rating type (Consult, Summary, or Formal) reported.

Sharp differences between types of ratings are also apparent in the distribution of body systems. Cases with impairments of the Spine, Mental/Behavioral Disorders, and the Central/Peripheral Nervous System are much more common among Consult ratings than among Summary ratings, while cases with impairments of the Upper and Lower extremities are correspondingly less common. The body systems that are more likely to be evaluated under Consult contain impairments that may be complex and more difficult to evaluate, such as low back pain, psychiatric disorders, and carpal tunnel syndrome. These body systems are also differentially common among Formal ratings.

Table 6.2 also presents data on the presence of secondary "add-on" impairments in four categories: psychiatric disorders, sleep disorders, sexual dysfunction, and pain. The first three were eliminated by SB863 for injuries occurring in 2013 and later years. Table 6.2 shows these add-ons were used somewhat rarely, with Psychiatric add-ons being the most commonly used (2.2% of all cases), followed by sleep disorders (0.57% of cases) and sexual dysfunction (0.14% of all cases). While infrequent, sleep and psychiatric add-ons had been increasing steadily over the 2005-2012 period. The pain add-on, in contrast, appears on 16.4% of all cases. The second through fourth columns show that the eliminated add-ons were used almost entirely in represented (Consult) ratings and Formal ratings, and almost never in Summary ratings.

Early Impairment Ratings Under SB863

Table 6.3 compares early ratings for the last injuries to occur under SB899 to the first injuries to occur under SB863. We examine injuries occurring in 2012 and 2013 and restrict attention to a constant-maturity subpopulation of injuries rated at the DEU within 486 days of injury. This is the highest maturity at which 2013 injuries can be compared to earlier years without inducing bias due to right-truncation. We present statistics for all rating types pooled together.

Table 6.3

Early Impacts of SB863 on DEU Ratings

Injury Year	2013-comparable constant maturity		Statistically Significant Difference?
	2012	2013	
SB863 in Effect?	No	Yes	
Combined Standard Rating (WPI)	9.1	9.2	
Number of Impairments	1.4	1.4	
Body System of Highest-Rated Impairment			
Spine	33.61	33.99	
Upper	34.8	34.12	
Lower	19.69	19.34	
Mental/Behavioral	3.78	3.83	
Central/Peripheral Nervous System	1.65	1.45	
Cardiovascular (Any)	2	2.69	
Digestive	1.02	0.95	
Other	3.45	3.62	
% of Consult Ratings	33.63%	41.40%	***
Percentage with Add-on Impairments			
Psychiatric	0.47%	0.36%	
Sleep Disorder	0.24%	0.04%	**
Sexual Dysfunction	0.02%	0.02%	
Pain	14.80%	15.85%	
Final Rating Before Apportionment*	15.1	16.9	***
Statutory Benefit at Maximum Weekly Wage			
Without Life Pension	\$14,350	\$17,116	***

Including Life Pension*	\$15,103	\$17,771	***
Number of Cases	5,103	4,751	
Days to First Rating			
Average	340	346	
Median	354	357	

* p < 0.1, ** p < 0.05, *** p < 0.01

Significance assessed using unequal variance t-tests for continuous variables and chi-squared tests for binary and categorical variables

Sample contains cases rated within 486 days of injury

Among this constant-maturity subpopulation of cases, the distribution of injury type and severity did not change between 2013 and 2014. The average combined standard rating was 9.1 for 2012 injuries and 9.2 for 2013 injuries, but this difference was both small in practical terms and statistically insignificant ($p = 0.59$). The average number of rated impairments (1.4) remained constant across both years. Moreover, the distribution of cases by body system of primary impairment was statistically identical across years ($p=0.47$). These statistics provide strong evidence that, among low-maturity cases, the severity and type of impairments among the population of injured workers evaluated at the DEU did not change with implementation of SB863. This is somewhat surprising in light of the fact that there was a statistically significant increase of 7.8 percentage points in the share of Consult ratings following implementation of SB863, since we have seen that Consult ratings tend to be more severe cases and have a different distribution of impairments as defined by the AMA chapter.⁵² It appears, however, that restriction to a constant-maturity subpopulation outweighs the impact of these changes in representation status: it is quite likely that higher-maturity cases are responsible for the overall compositional differences between Consult and Summary ratings.

⁵² We cannot offer a definitive explanation for the increased share of cases with representation after implementation of SB863, but there are several interesting possibilities. One possibility is that workers needed more guidance to navigate the workers' compensation system after implementation of SB863 and became more likely to seek out representation. However, another possibility is that some cases where the date of injury is subject to ambiguity—for instance, cumulative injury claims or post-termination claims—were shifted from 2012 injury dates to 2013 injury dates because the increases in benefits under SB863 create an incentive to shift claims into 2013. The increase in the share of consult ratings in 2013 is consistent with a scenario in which attorneys (who have a better understanding of the incentives built into the workers' compensation system than applicants) might advise clients to shift injury dates forward when there is ambiguity, but that unrepresented workers may be less aware of these incentives.

In an analysis not reported in this study, we found suggestive evidence that the volume of consult ratings exhibited a trend break following implementation of SB863, and that this effect may have been more pronounced for cumulative injuries than for non-cumulative injuries. However, we consider these findings merely suggestive, as statistical tests for the hypothesis that injuries were shifted from late 2012 to early 2013 do not yield strong support for this proposition after controlling for seasonality in the volume of injuries. The more pronounced increase in consult ratings occurs later in 2013, whereas one might expect shifting injury dates to result in a spike of cases early in 2013.

While the type and severity of injuries remained constant for low-maturity claims through enactment of SB863, changes to the rating system and benefit schedule have had the anticipated effects of increasing final ratings and statutory benefits. The average final rating before apportionment increased by 1.8 percentage points, from 15.1% to 16.9%.

Surprisingly, psychiatric add-ons restricted under SB899 continue to appear under SB863. The sleep disorder add-on and the sexual dysfunction add-on are used in just a handful of cases after SB863. However, these add-ons were also rare among low-maturity cases under SB899. For example, Table 6.1 showed that 2.2% of the overall population of SB899 ratings had psychiatric add-ons, as compared to just 0.5% among the constant-maturity subpopulation examined in Table 6.3. The early data under SB863 therefore suggest that restriction of the add-ons had a trivial effect on ratings that was far outweighed by the increases to FEC, but the available data do not capture the high-severity cases where we might expect to see a larger impact of the add-on restrictions.

The far more common pain add-on appears on slightly more cases after implementation of SB863 (15.9% vs 14.8%), but this difference is not statistically significant at conventional levels ($p = 0.16$). This appears to reflect the higher share of represented ratings rather than a change in the rating process, as differences between 2013 and 2012 in the fraction of cases with pain add-ons are statistically insignificant (though slightly positive) after stratifying on rating type.

The net impact of the changes to ratings, along with the increase in the maximum weekly wage used to calculate benefits, was to substantially increase statutory benefits for low-maturity cases. For 2012 injuries in our low-maturity subpopulation, the average statutory benefit was \$14,350 (\$15,103 including life pensions) and \$17,116 (\$17,771 including life pensions) for 2013 injuries, representing an increase in benefits of 19% (18% including life pensions).

These increases are substantially lower than the increases reported in Chapter 5, but this is simply a mechanical consequence of the truncation of our sample at such a low point of the maturity distribution. As depicted in Figure 6.1, less than a quarter of cases from a typical injury cohort reach the DEU within 486 days of injury. As depicted in Figure 6.2 and Figure 6.3, these are the least severe injuries in the injury cohort. These facts mean that we will not be able to infer the full impact of SB863 on ratings or benefits by examining ratings actually performed under SB863 until several more years have passed.

Equity in Permanent Disability Ratings and Benefits

At present, we can only observe a severely truncated sample of ratings actually performed under SB863. Chapter 5 presented analyses of trends in benefit adequacy and replacement rates under SB863 that addressed right-truncation by combining wage loss data from the WCIS with trends in benefits estimated using high-maturity cases from the DEU. In order to evaluate how the changes to benefits and ratings under SB863 will affect the equity of PPD benefits, we abstract from time trends and pool together all ratings performed to date under SB899. Our analysis of equity should therefore be interpreted as capturing outcomes for an average injury within a group being measured occurring between 2005-2012 that was rated by June 2014.

We follow previous RAND studies in distinguishing between two dimensions along which the fairness or *equity* of the disability rating system can be evaluated: vertical equity and

horizontal equity (Peterson, Reville et al. 1997, Reville, Seabury et al. 2005, Bhattacharya, Neuhauser et al. 2010). *Vertical equity* refers to the principle that workers with more severe earnings losses should receive proportionally more generous benefits to offset those losses. *Horizontal equity* refers to the principle that similarly situated workers should be treated similarly.

We also examine how SB863 affects the *progressivity* of benefits, which we define as the extent to which the wage replacement rate is higher for lower-wage workers. While the appropriateness of progressivity as a policy objective for the workers' compensation system (as opposed to tax policy and other social insurance) is debatable, the use of minimum and maximum weekly wage amounts in calculating PPD benefits introduces a considerable degree of progressivity into workers' compensation benefits in California and other jurisdictions.⁵³ Because increases in benefits under SB863 are accomplished in large part by increasing the weekly maximum benefit, stakeholders may find it of interest to examine the impacts of the reforms across the income distribution. This may be particularly true in light of our finding in Chapter 4 that low-wage workers experience larger proportional earnings losses than otherwise identical high-wage workers.

As in past RAND work, we evaluate the equity of ratings and benefits by measuring the relationship between ratings and earnings losses. Because SB863 involved important changes to benefits as well as changes to the rating system, we also examine the relationship between earnings losses and benefits by grouping together workers with similar ratings and then comparing benefits and earnings losses across these groups. Finally, we compare the progressivity of benefits under SB899 and SB863 by calculating wage replacement rates stratified on the worker's pre-injury wage.

Vertical Equity Under SB899 and SB863

We examine vertical equity by estimating the average relationship between benefits and earnings losses for all injured workers. We begin by examining this relationship under the rating system and benefit schedule in place under SB899. As with our analysis of adequacy in Chapter 5, we separately analyze the impact of increases to the maximum wage and changes to the rating system.

⁵³ Some authors have suggested that progressivity should be considered an element of vertical equity in evaluating the design of workers' compensation benefits (Gunderson and Hyatt, 1998). Gunderson and Hyatt also offer an informative discussion of the role of minimum and maximum benefits in creating progressivity.

Figure 6.2
Relationship Between Proportional Earnings Loss and Final Ratings Under SB899

Ratings at or above 70 WPI excluded for legibility. Figure depicts quadratic line of best fit. Cases with zero-ratings before apportionment are excluded.

Figure 6.2 shows the relationship between final impairment ratings before apportionment and proportional earnings losses.⁵⁴ We pool together all cases rated under SB899 in June 2014 or earlier.⁵⁵ Each point in the figure represents the average earnings loss (as a proportion of control worker earnings over the second post-injury year) for workers with a given final rating. Because ratings above 20 are assigned less frequently, we averaged over wider ranges of ratings above this level.⁵⁶ We find a clear positive relationship between impairment ratings and proportional earnings losses, which reflects favorably on the vertical equity of the PD rating system under

⁵⁴ While earlier RAND studies for CHSWC focused separately on standard ratings and final ratings, we focus primarily on final ratings in our analysis here. With the exception of the add-on restrictions, modifications to the rating system enacted under SB863 did not affect standard ratings, but rather altered the relationship between standard ratings and final ratings by modifying the FEC.

⁵⁵ The reader might be concerned that our use of a sample that does not restrict all cases to a constant range of maturities could bias our analysis of vertical equity because severe cases, which take longer to reach the DEU, will differentially have earlier injury dates. This raises the possibility that a comparison of outcomes between low- and high-rated cases would be biased because economic conditions would vary along with severity. This is a reasonable concern, but we suspect that the impact of such bias is likely to be small in light of our finding in Chapter 4 that only 1% of the explained variation in earnings loss (approximately 0.1% of the total variation) was associated with the date of injury.

⁵⁶ We grouped together ratings between 20-24, 25-29, 30-49, 50-69, and 70-100.

SB899. On average, each additional 1 point increase in the final impairment rating predicted an increase of 1.03 percentage points in proportional earnings loss.⁵⁷

The most important input into the rating process is the standard rating assigned using the *AMA Guides* (or, for psychiatric impairments, the *Global Assessment of Functioning (GAF)*). While other steps of the rating process certainly matter, vertical equity with respect to final ratings under SB899 is an indication that the *AMA Guides* yield ratings that are predictive of the eventual degree of disability. SB863 could well alter the strength of the relationship between final ratings and earnings losses if increases in ratings are differentially concentrated among low-rated or high-rated cases. The impact of SB863 on the strength of the relationship between ratings and earnings loss is therefore an empirical question.

Figure 6.3 plots proportional earnings losses against final ratings simulated under SB863. For reference, the data points from Figure 2 are plotted as hollow circles. SB863 appears to shift the curve between proportional earnings losses and final ratings to the right across most of the range of ratings: the earnings loss at any given impairment rating is lower because many cases receive higher final ratings under SB863. As anticipated, the vertical equity exhibited under SB899 is largely preserved by SB863.

⁵⁷ The quadratic line of best fit in Figure 6.2 reflects statistically significant downward concavity. However, the relationship between ratings and proportional losses is linear for ratings below 25, where the majority of cases fall. For ratings below 25, a one-point increase in the final rating before apportionment is associated with a 1.4 percentage point increase in proportional earnings losses.

Figure 6.3
Relationship Between Proportional Earnings Loss and Simulated Final Ratings Under SB863

SB863 ratings are simulated using data on ratings performed under the SB899 rating system. Ratings below 70 omitted to preserve legibility.

Relationship Between Benefits and Losses Under SB899 and SB863

Besides increasing final ratings for workers with a given set of impairments and standard ratings, SB863 also increases the level of benefits available to workers with a given final rating. We examine the relationship between lost earnings and benefits in order to assess how SB863 affects the vertical equity of statutory benefits. Figure 6.4 shows the relationship between earnings losses (on the x-axis) and SB899 statutory benefits (on the y-axis) at different levels of SB899 final ratings. A quadratic curve of best fit is included to highlight the nonlinear relationship between earnings losses and benefits under SB899. As a benchmark, the dashed line through the origin indicates the level of benefits corresponding to an 80% after-tax wage replacement rate. The curvature in the relationship between earnings loss and statutory benefits is a reflection of the formula tying impairment ratings (which had a nearly linear relationship with proportional earnings losses) to weeks of PD benefits, which increase more rapidly than linearly with ratings.

Figure 6.4
Relationship Between Predicted After-Tax Earnings Loss and Statutory PPD Benefits Under SB899

Figure 6.5 illustrates the relationship between earnings loss and benefits under three incremental steps between SB899 and full implementation of SB863. Quadratic curves of best fit are shown without the underlying scatter plots to maintain legibility. Application of the maximum benefit to SB899 ratings pivots the curve upward, with increases proportional to benefits and (because of the rating system's vertical equity) increasing with the severity of earnings losses, but with almost no impact on cases with the lowest earnings losses. As suggested by the analysis of rating changes presented above, the FEC changes under SB863 increase benefits broadly across the range of ratings, including for low-rated cases. The return to work benefit is skewed in the opposite direction, toward cases with more severe earnings losses, but the impact on the overall distribution of benefits is very slight compared to the other provisions of SB863 analyzed here.

To assess whether the changes in the relationship between earnings loss and benefits suggested by Figure 6.5 are statistically significant, we estimated regression models for the relationship between ratings and benefits under the four policy regimes depicted in Figure 6.5. The positive relationship between losses and benefits apparent in the figures is highly

statistically significant under both SB899 and SB863, indicating that PPD benefits satisfy vertical equity under both rating systems.⁵⁸

Figure 6.5
Relationship Between Proportional Earnings Loss and Simulated Final Ratings Under SB863

Discussion

SB863 uses three distinct policy instruments that would seem to target different dimensions of the rating and benefit process. The graphical evidence in Figure 6.5 indicates that SB863 will induce a different relationship between earnings losses and benefits than the relationship that prevailed under SB899. To provide a clearer view of how increases in after-tax wage replacement rates will vary with severity, Figure 6.6 presents the data in Figure 6.5 as wage replacement rates for six groups of cases ranked by final ratings under SB899. For reference, Table 6.4 reports wage losses and benefits (Panel A) and wage replacement rates (Panel B).

⁵⁸ We estimated regression models of benefits on earnings losses using the final rating as an instrumental variable. The slope of this line summarizes in a single number the overall relationship between losses and benefits under a system of ratings and benefits, and can be interpreted as a quantitative measure of vertical equity in the sense that a zero coefficient would indicate that the rating system failed to assign higher benefits to cases with larger earnings losses. Similarly, differences in the measure allow us to test whether the relationship between losses and benefits has changed as a result of policy changes in a way that is distinguishable from chance. However, we emphasize that there is not a clear normative interpretation of differences in positive values of this measure. See Appendix D for details.

Figure 6.5
After-Tax Wage Replacement Rates Under SB899 and SB863
by SB899 Final Rating After Impairment

Abstracting from any correlation between wages and injury severity, the increase in the weekly maximum wage should increase benefits by an equal percentage across the entire rating distribution. The estimates in Table 6.4, which reports benefits calculated at the weekly maximum, indicates that this is the case: benefits are 27% higher at all levels of ratings below 30. The percentage increase in benefits due to the higher weekly maximum under SB863 is a more modest 21% for the most severe cases (those with final ratings of 30 or higher) because SB863 did not increase the maximum life pension payment.

The changes to the rating schedule under SB863, in contrast, lead to increases in benefits that are larger as a proportion of SB899 benefits for the lowest-rated cases. Although (as Table 6.4 indicates) the increase in FEC leads to higher ratings and benefits at all levels of final ratings, the increases are largest relative to what benefits would have been under the SB899 rating schedule for the lowest-rated cases. As a percentage of the level of statutory benefits that would result from applying the SB863 weekly maximum to SB899 final ratings, the additional increase in benefits due to the changes in the rating schedule is highest in percentage terms for cases with final ratings between 0 and 4 (a 17% increase), decreases steadily as ratings rise (to a 11-12% increase for rating between 10 and 20) and is smallest for cases with ratings of 30 or above (a 5% increase). Figure 6.5 makes apparent a similar pattern in terms of the change in after-tax wage replacement rates under SB863.

Unlike the other provisions of SB863, the incremental impact of the return to work fund on wage replacement rates at different levels of ratings is less straightforward to predict *a priori*.

Because the value of the return to work benefit is a constant \$5,000, variation in its value across the rating distribution is driven entirely by differences in eligibility. The estimates we report in Table 6.4—which we view as an upper bound on return to work fund eligibility—show that the expected value of the return to work benefit increases sharply with final ratings. Even though the dollar value of the expected return to work benefit increases with ratings, its value does not increase as sharply as benefits under SB863. The incremental impact of the return to work benefit on wage replacement rates is therefore largest in percentage terms for the lowest-rated cases (which have the smallest earnings losses) and declines steadily as ratings increase, even though eligibility for the benefit is highest for the highest-rated cases.

Table 6.4
Impact of SB863 on Benefits and After-Tax Wage Replacement Rates by Final Rating Under SB899

A. Earnings Loss and Benefits

Final Rating Before Apportionment, SB899	5-Year Earnings Loss	Present Discounted Value of Statutory Benefits			
		SB899 Benefits	SB899 Ratings, SB863 Weekly Maximum	SB863 Ratings and Maximum	Return to Work Fund Payments
0-4	\$13,491	\$2,164	\$2,746	\$3,202	\$1,335
5-9	\$21,267	\$5,467	\$6,956	\$7,918	\$1,679
10-14	\$32,429	\$9,944	\$12,644	\$14,038	\$2,089
15-19	\$39,868	\$15,135	\$19,234	\$21,545	\$2,351
20-29	\$50,366	\$23,316	\$29,618	\$32,516	\$2,720
30-100	\$78,460	\$71,318	\$86,655	\$91,072	\$3,241

B. Statutory After-Tax Wage Replacement Rates

Final Rating Before Apportionment, SB899	After-Tax Wage Replacement Rates				Number of Ratings
	SB899	SB899 Ratings, SB863 Maximum	SB863 Ratings and Maximum	SB863 + Return to Work Benefit	
0-4	16.0%	20.4%	23.7%	33.6%	36,300
5-9	25.7%	32.7%	37.2%	45.1%	51,224
10-14	30.7%	39.0%	43.3%	49.7%	43,202
15-19	38.0%	48.2%	54.0%	59.9%	24,773
20-29	46.3%	58.8%	64.6%	70.0%	37,365
30-100	90.9%	110.4%	116.1%	120.2%	55,145

The return to work benefit explicitly targets workers with disproportionately high earnings losses. As such, we might have expected it to make a larger contribution to the vertical equity of the PD benefit system. To be clear, return to work fund eligibility is strongly related to impairment ratings and earnings loss. An increase of \$10,000 (2014\$) in earnings loss is associated with an increase of up to 4.5% in the probability of Return to Work Benefit eligibility. However, our estimates indicate that the corresponding increase in statutory benefits associated

with such an increase in earnings loss would be substantial, whereas a 4.5% increase in return to work fund eligibility has an expected value of \$225.

To sum up, ratings under SB899 were strongly predictive of proportional earnings losses, and the combined benefit and rating system led to a relationship between earnings losses and benefits that was consistent with vertical equity. In addition to raising benefits overall (as discussed in Chapter 5), SB863 broadly preserves the vertical equity observed under SB899, with benefits generally increasing as earnings losses rise.

Impact of SB863 on Progressivity of PPD Benefits

The increase in the maximum weekly wage is a major contributor to the increases in wage replacement rates under SB863. Because increases in the weekly maximum wage affect only the benefits of workers with wages above the SB899 weekly maximum, we examined the impact of SB863 on the progressivity of PPD benefits by calculating after-tax wage replacement rates separately for groups of workers with different levels of pre-injury earnings.

As discussed above, progressivity in wage replacement rates is introduced into the workers' compensation system largely because of the weekly minimum and the weekly maximum wage used to calculate PPD benefits. If two workers with the same disability rating experience the same after-tax proportional earnings losses, then the statutory wage replacement rate will be higher for the worker with the lower pre-injury wage. We would expect the increase in the weekly maximum to yield the largest increase in wage replacement rates among workers with pre-injury earnings just above the new weekly maximum, while having little impact on lower-wage workers. However, SB863 also increased the weekly minimum wage, which will increase benefits for workers with wages below the new minimum. In addition to the weekly minimum and maximum, it is possible that the composition of injuries (and thus ratings and benefits) may differ with the pre-injury wage. We also showed, in Chapter 4, that proportional earnings losses are much greater for low-wage workers than for higher-wage workers even when other factors are held constant. The degree of progressivity under SB899 and the impact of SB863 depend on all these considerations.

Table 6.6 describes annual earnings, earnings losses, ratings, benefits, and replacement rates for all available cases rated under SB899. Earnings losses over the first five post-injury years increase in magnitude as earnings rise but decline as a percentage of pre-injury annual earnings. As suggested by the regression-adjusted estimates presented in Chapter 4, differences in injury severity (measured here by final ratings before apportionment) do not seem large enough to explain the dramatically higher proportional earnings losses for low-wage workers: the range across income quartiles of average ratings is 1.2 rating points. The impact of the weekly maximum wage is apparent in the pattern of statutory benefits across income quartiles.⁵⁹

⁵⁹ While our earlier calculations calculated benefits at the statutory maximum to highlight the effects of changes in the rating system and benefit schedule, we use each worker's annual earnings over the year preceding the injury to calculate benefits in this subsection since our focus is on variation over the income distribution.

Statutory benefits increase sharply between the first and second earnings quartiles but do not increase any further as earnings increase above the median

The benefit schedule under SB899 was mildly progressive. Workers with pre-injury wages below the median (in the bottom two quartiles) had higher wage replacement rates than workers with pre-injury wages above the median.⁶⁰ Wage replacement rates under SB899 were 57% in the first quartile and 62% in the second quartile, compared with 52% in the third quartile and 46% in the fourth quartile. The fact that the after-tax wage replacement rate was higher in the second quartile than in the lowest quartile appears to be driven by the differentially severe relative earnings losses among the lowest-quartile workers.

Table 6.6
Outcomes by Pre-Injury Annual Earnings Under SB899

Quartile of Earnings	Annual Earnings	Five-Year Earnings Loss	Final Rating Before Apportionment	Statutory Benefits, SB899	After-Tax Wage Replacement Rate
1st quartile	\$12,658	\$25,087	19.8	\$14,384	57.3%
2nd quartile	\$30,528	\$39,187	19.6	\$24,252	61.9%
3rd quartile	\$50,163	\$43,640	18.6	\$22,731	52.1%
4th quartile	\$98,476	\$54,426	19.3	\$24,591	45.2%

Statutory benefits calculated using estimated average weekly wage based on annual earnings over four quarters prior to quarter of injury. All dollar amounts reported in constant 2014 dollars.

Figure 6.6 shows after-tax wage replacement rates by quartile of pre-injury earnings under SB863 and also shows the impacts of the return to work benefit. As expected, the changes in benefits and ratings under SB863 have a limited impact on workers in the first quartile of pre-injury earnings, increasing after-tax wage replacement by 4 percentage points. The largest increase (19 percentage points) is apparent for workers in the second quartile of pre-injury annual earnings, but increases of a similar magnitude are apparent for workers in the third quartile (17 percentage points) and the fourth quartile (15 percentage points). In the absence of the return to work benefit, the rating and benefit changes in SB863 could be viewed as reducing the progressivity of PPD benefits in the sense that the workers with the lowest pre-injury earnings would have after-tax wage replacement rates substantially below those for workers in the second and third quartiles of pre-injury earnings, and roughly equal to the after-tax wage replacement rates for workers in the highest quartile of pre-injury earnings. However, some might argue that the differential increases in after-tax wage replacement rates in the second

⁶⁰ We defined the quartiles of the wage distribution using permanently disabled workers in our WCIS sample. The median annual wage, in constant 2014 dollars, was \$39,009. The 25th percentile, which divides the first quartile from the second quartile, was \$22,315. The 75th percentile, which divides the third quartile from the fourth quartile, was \$63,990.

quartile of pre-injury earnings (compared with higher earnings levels) represents an increase in progressivity, and we do not take a stand on the optimal degree of progressivity for PPD benefits.

Figure 6.6
After-Tax Wage Replacement Rates Under SB899 and SB863
by Quartile of Pre-Injury Wage

Benefits calculated using estimated average weekly wage based on annual earnings over four quarters prior to quarter of injury.

Compared to the benefit and ratings changes under SB863, the effects of the return to work benefit on after-tax wage replacement rates across the income distribution are markedly different. Relative to replacement rates under the other ratings and benefit provisions of SB863, our estimates suggest that the return to work benefit could increase wage replacement rates for workers in the first quartile of pre-injury annual earnings by as much as 14 percentage points. The incremental effects of the return to work benefit on replacement rates fall sharply with pre-injury earnings, to 7 percentage points in the second quartile, 4 percentage points in the third quartile, and 2 percentage points in the fourth quartile. Although these estimates are likely to represent an upper bound on eligibility for the return to work benefit, we do not believe that our measure of return to work fund eligibility overstates or understates eligibility in a way that is correlated with the worker's pre-injury wage.⁶¹ The feature of the return to work benefit that

⁶¹ See Appendix D for discussion.

limited its impact on vertical equity—namely its fixed dollar value regardless of pre-injury wages—appears to make it strongly progressive.

Horizontal Equity

The provision of SB863 most likely to affect horizontal equity is the elimination of differences between impairment types in the FEC adjustment. As discussed above, increases in final ratings and benefits due to setting the FEC to 1.4 for all impairments may be inversely related to the pattern of earnings losses across impairments with similar standard ratings. While our analysis of vertical equity showed that the changes to the rating system differentially affected cases with low earnings losses, resulting changes in the relationship between earnings losses and benefits were offset by the increase in the weekly maximum, and the shape of the overall relationship between earnings losses and benefits is similar under SB863 and SB899. We might expect to see larger impacts of SB863 on horizontal equity. In particular, we may be concerned that horizontal inequities across impairments in different FEC groupings could be exacerbated rather than reduced.

We examined this possibility by comparing proportional earnings losses for cases with similar ratings across different impairment types, which replicates methods used to examine horizontal equity in prior RAND reports. Our graphical analysis focuses on seven impairments chosen to span the range of FEC groups.⁶² These are defined in Table 6.6, which also presents the average impairment ratings and earnings loss for these impairments. Table 6.6 makes it clear that there are substantial differences in both ratings and earnings losses across these impairment groups, which is why it is important to stratify on ratings when examining horizontal equity. To isolate the impact of changes in the FEC factors, we restrict attention to single-impairment cases and use ratings before apportionment.

⁶² FEC rank 3 is rarely used, and there was an insufficient number of cases available for our analysis.

Table 6.7
Selected Impairments for Horizontal Equity Analysis

FEC group	Impairment name	Impairment number	N cases 2005-2012	SB899 Final Rating Before Apportionment	SB863 Final Rating Before Apportionment	Relative Earnings, Second Post-Injury Year
1	Hand or finger impairment	16.05.xx.xx or 16.06.xx.xx	6,137	6.0	7.6	95.1%
2	Knee impairment	17.05.xx.xx	14,667	8.4	10.1	89.2%
4	Carpal tunnel syndrome	16.01.02.02	1,766	7.1	8.0	86.0%
5	Low back pain	15.03.01.00 or 15.03.02.02	18,422	15.2	16.7	72.9%
6	Digestive system impairment	06.xx.00.xx	371	17.9	18.9	64.8%
7	Shoulder impairment	16.02.01.xx or 16.02.02.xx	13,901	11.0	11.3	81.6%
8	Psychiatric impairment	14.01.00.00	3,330	26.0	26.1	46.2%

Figure 6.6 depicts the horizontal equity of final ratings under SB899 for these impairments. Each cluster of bars represents the population of cases with ratings in a given range, for instance the first seven bars represent cases with final ratings between 0 and 4.75. The bars are ordered by FEC group. If the rating system were completely accurate in predicting proportional earnings losses (and thus in targeting benefits to earnings losses) we would expect all the bars at each rating level to have the same height. Instead, we find some systematic differences between similarly rated cases with different impairments. These differences are most apparent among ratings below 30, which is the range that most cases rated at the DEU fall into. (While the average final rating before apportionment for 2005-2012 injuries in our DEU population is 20.3, the median final rating was 15 and 75% of cases received ratings of 28 or lower.)

As observed in previous RAND studies, earnings losses are extremely high among cases with psychiatric impairments, even at the bottom of the rating distribution.⁶³ The relationship between earnings losses and ratings is nearly identical between SB863 and SB899, which is in line with our expectations given that psychiatric impairments are not affected by changes to the FEC under SB863. Because SB863 pushes cases with less severe earnings losses up the rating distribution, however, horizontal equity between psychiatric cases and other impairments appear to worsen under SB863.

⁶³ The pre-2005 PDRS used a series of measures for calculating the percent disability for a psychiatric impairment rating. These measures were idiosyncratic to California's rating system. The *AMA Guides, 5th ed.*, adopted under SB899, did not include a method for measuring psychiatric impairment. California adopted the Global Assessment of Functioning measurement system, which had been in wide use and validated under limited testing. Subsequently, the AMA adopted the GAF for the 6th Edition of the *Guides*. Interestingly, while the pre-2005 California approach was shown in earlier RAND studies to be a very poor predictor of the economic consequences of a psychiatric disability, the GAF, while a very different measurement system appears to show little, if any, improvement at predicting earnings loss.

Figure 6.6
Proportional Earnings Loss by Impairment
SB899 Final Ratings Before Apportionment

Cases grouped by impairment, SB899 final rating before apportionment
 Single-impairment cases only
 FEC rank under SB899 in parentheses
 Empty bars reflect data suppression to avoid reporting averages for small cells of cases

Figure 6.7
Proportional Earnings Loss by Impairment
SB863 Final Ratings Before Apportionment

Cases grouped by impairment, SB863 final rating before apportionment
 Single-impairment cases only
 FEC rank under SB899 in parentheses
 Empty bars reflect data suppression to avoid reporting averages for small cells of cases

Note that these ratings incorporate the FEC adjustment as set under SB899. The fact that, within each rating group, losses remain lower for impairments in the lowest FEC groups—a pattern reflected in Figure 6.6 by the increasing height of bars from top to bottom within rating levels—suggests that the FEC factors used under SB899 could have been more effective in achieving horizontal equity across impairment types with a larger increase in FEC factors between FEC groups 1-2 and groups 4 and higher. Carpal Tunnel Syndrome, which has FEC rank 4, also appears to have less severe earnings losses than impairments with higher FEC ranks at some levels of ratings. Similarly, the disparity between losses for impairments of the Digestive System and neighboring groups may suggest that the higher FEC factors for Digestive System impairments could have improved horizontal equity, at least over the middle of the rating distribution.⁶⁴ That said, the SB899 rating system may perform somewhat better on horizontal equity among the most severe impairments (ratings above 30) with near equality of earnings losses among the three highest FEC groups shown (low back pain, digestive system impairments, and shoulder impairments) and among the three lowest FEC groups (hand or finger, knee, and CTS). This category may provide less meaningful comparisons across impairments, however, because it pools together an extremely wide range of impairments in order to maintain precision.

Figure 6.7 presents the same statistics using SB863 ratings calculated for the same population of cases. In line with the relatively modest changes between SB863 and SB899, the overall shape of the graph appears broadly similar, and vertical equity within impairments is preserved. Horizontal equity appears to improve between CTS, LBP, and Shoulder Impairments, which now have nearly identical proportional earnings losses at all rating levels below 30; under SB899, proportional losses for CTS and LBP grew faster with impairment ratings than did losses for shoulders.

However, closer inspection reveals the emergence of some new inequities under SB863. The gap between the lower-FEC groups and the higher-FEC groups increases. Compared to SB899, cases with Hand or Finger Impairments and Knee Impairments now have lower earnings losses. More strikingly, the difference between digestive system impairments and other impairments that emerged among ratings between 5 and 20 is now magnified and apparent among all ratings below 30.

This pattern of greater inequities between low-FEC and high-FEC ratings is consistent with the patterns that we suggested above in our discussion of vertical equity: low-rated impairments with relatively mild earnings losses are being pushed up the rating distribution. Figure 6.6 corroborates the notion that this pattern is driven by the structure of the FEC adjustment.

So far, our comparison of horizontal equity between SB899 and SB863 has been impressionistic: SB863 reduced inequities between certain groups of impairments, but appeared to open up larger inequities among other groups. To test whether SB863 will reduce horizontal equity overall, we estimated a set of regression models using the grouped data presented in Figures 6.6-6.7 that predict proportional earnings loss as a function of the final rating under each rating system. We then estimated interacted models that allow the level of earnings loss and the

⁶⁴ The calculations presented in this figure classify cases with multiple impairments by the body system of the highest-rated impairment and, therefore,

relationship between ratings and earnings loss to vary freely across impairments. The F-statistic from a hypothesis test that the interaction terms are significant captures, for each rating system, how different the relationship between ratings and earnings loss is across impairment categories. We can therefore view the F-statistic as a summary measure of horizontal inequity: the more important impairment-specific relationships between ratings and earnings losses are, the higher the F-statistic.

The F-statistics for all models are large and highly significant, indicating that we can reject the hypothesis of perfect horizontal equity under both SB899 and SB863. This much was apparent from Figures 6.6 and 6.7. What is less obvious whether horizontal inequity is greater under one system or the other, and whether such differences are unlikely to emerge at random. To answer this question, we compared the F-statistic on the interaction terms estimated under SB899 to the F-statistic estimated under SB863 as a way to summarize which rating system leads to greater inequities across the impairments. We applied this test to several subpopulations and found that the difference in horizontal equity between SB863 and SB899 is not statistically significant.⁶⁵

To sum up, the visible differences in horizontal equity between SB863 and SB899 are not systematic or substantial enough to be distinguishable from randomness. We therefore cannot conclude that the rating changes under SB863 lead to an overall decrease in horizontal equity even though there are some suggestive changes in the pattern of wage loss across selected impairments.

Horizontal Equity of Benefits Under SB863

Finally, as with vertical equity, we can look beyond changes to final ratings and examine the impact of SB863 on the relationship between earnings losses and benefits. Figure 6.8 compares wage replacement rates under SB899 with wage replacement rates under SB863 for the selected impairment types examined above. Replacement rates presented here include the return to work benefit and increases to the weekly maximum in addition to changes in ratings. Consistent with the comparison between ratings and earnings loss shown above, Figure 6.8 shows that replacement rates increase most markedly for the lower FEC groups. In particular, the average hand and finger impairment with injury dates in 2005-2012 and no secondary impairments would have had after-tax wage replacement rates above 90% over the first five post-injury years under the SB863 rating schedule, while the average for all impairments included in the Figure is 58.1%.

It is important to note that, because Figure 6.8 is not stratified on ratings, the average replacement rates across impairment types should not be used to analyze horizontal equity across impairments under either law in isolation, nor should they be taken as a reflection on the accuracy of the basic structure of the PDRS or the *AMA Guides*. For instance, impairments of the digestive system (which were shown above to have disproportionately high earnings losses at

⁶⁵ We used a permutation method to estimate the distribution of the difference of two F-statistics under the null hypothesis that SB899 and SB863 do not differ in horizontal equity. See Appendix D for details.

low ratings) have above-average replacement rates overall. This apparent contradiction is readily explained by the fact that these cases have the highest average ratings of the impairments presented here, meaning that the majority of cases (and the majority of earnings losses) with digestive system impairments fall into the range of the rating distribution where replacement rates are higher on average and horizontal equity appears to be stronger. More generally, there are systematic differences in replacement rates across the severity distribution (with very low and very high earnings losses being associated with higher replacement rates) which imply that replacement rates will vary across impairments purely because they fall into different ranges of the rating distribution. Table 6.4, which defined the impairments used in our horizontal equity analysis, documents wide variation in ratings and earnings losses across impairments. Therefore, Figure 6.8 is informative about whether *changes in replacement rates between SB899 and SB863* are skewed toward particular types of impairments, and not about the level of horizontal equity present under either system.

Figure 6.8
Horizontal Equity: After-Tax Wage Replacement Rates Under SB863 and SB899

7. Conclusions and Policy Recommendations

Overview of Key Findings

In this study we examined recent trends in the economic outcomes of permanently disabled workers in the California workers' compensation system and the potential impact of the permanent disability benefit increases enacted in SB863. We estimated the level of earnings losses experienced by permanently disabled workers injured between 2005 and 2012, and compared the compensation that was offered to these workers to what would have been offered had the new reforms been in place. We also examined several other recent legislative, judicial and regulatory changes in the workers' compensation system and their implications for the adequacy and equity of benefits. Our central findings included the following:

- Permanently disabled workers injured after the beginning of the Great Recession experienced much more severe earnings losses than workers injured before, suggesting that the economic downturn disproportionately affected injured workers relative to uninjured workers.
- For the average worker who was injured between 2005 and 2012, the benefit increases enacted under SB863 would have significantly increased replacement rates of lost income compared to what they were under SB899. Specifically, we estimated that the fraction of after-tax earnings losses replaced by benefits would have risen by 21.4 percentage points, from 58.8% to 80.2%.
- While SB863 has led to higher PPD benefits, future trends in the replacement rate of lost earnings will be driven in large part by the extent to which earnings of disabled workers recover from the Great Recession.
- Both changes in ratings and increases in the maximum weekly wage led to substantial increases in benefit adequacy, while the Return to Work Benefit had a more modest impact on average. However, the Return to Work Benefit has the largest impact on wage replacement rates for the lowest-wage workers. Since the other provisions of SB863 lead to larger benefit increases for middle-income and high-income workers, the Return to Work Benefit has an important role to play in preserving the progressivity of PPD benefits.
- The elimination of the Future Earning Capacity (FEC) adjustment had little impact on the overall equity of disability benefits across workers with different types of injuries. This is largely due to the fact that the FEC as implemented was based on the old California PDRS and did little to address discrepancies in the relationship between earnings losses and disability ratings under the *AMA Guides*.

- In addition to future economic trends, two of the biggest uncertainties regarding future trends in PPD benefits are the use of alternative disability rating procedures based on the *Almaraz* decision and the take-up of the Return to Work Benefit. These and other system factors require careful monitoring by the Commission and other policymakers and stakeholders.

These findings have many important policy implications for permanent partial disability compensation in California, which we discuss in detail over the remainder of this Chapter.

The Role of Economic Conditions in Assessing Benefit Adequacy

In Chapter 4 we documented that the economic outcomes of permanently disabled workers worsened considerably during the Great Recession, with relatively little improvement through the end of 2012. The gap between the earnings of injured workers and control workers increased rapidly after the onset of the recession, leading to a dramatic increase in average earnings loss for injured workers.

A number of factors could potentially lead to greater earnings losses during periods of economic hardship. We found that a large portion of the increase in earnings loss associated with the recession was actually due to changes in the types of workers claiming PPD benefits. That is, in the wake of the recession, the population of permanently disabled workers shifted toward groups of workers that tend to experience larger earnings losses. For example, compared to the average worker with a PPD claim injured from 2005-2007, workers injured in 2008 and later were older, had more severe injuries and had lower pre-injury earnings. There are many possible explanations as to why the composition of the population of PPD claimants may have changed. For example, it is possible that workers with less severe injuries are less likely to file for PPD benefits when economic conditions are poor because they fear employer retribution and don't want to lose their job. Ultimately, our data do not allow us to identify the cause of compositional changes, but this is an important issue for future research to identify and address.

While compositional changes drove a large part of the trend in earnings losses, we nonetheless witnessed a significant increase in earnings loss even when we used more advanced statistical methods to control for the changes in composition. This finding can be illustrated by imagining two identical workers (with the same job, demographics, and wage) who experienced the same injury at different points in time. If one of these workers was injured before the recession (say, in 2005) and the other had been injured after the recession (say, in 2012) the worker injured after the recession would have experienced much greater earnings loss. This suggests that worsening economic conditions put disabled workers even more at risk than under times of prosperity such as the mid-2000s.

From a policy perspective, the impact of the business cycle on earnings losses may provide an additional rationale for targeting benefits toward more vulnerable groups. In California, PPD benefits are designed to vary according to the severity of injury but not underlying economic conditions. Thus, the measured adequacy of benefits will vary according to the earnings losses experienced by disabled workers; so, when economic conditions worsen and earnings losses rise, benefit adequacy falls. Policymakers could help stabilize benefit adequacy through economic

upswings and downswings by designing benefits that lead to similar wage replacement rates across different populations of workers. One such targeting mechanism that has been suggested by past work is the tying of benefit levels to offers of return to work (Reville, Seabury et al. 2005, Seabury, Reville et al. 2011).

From the perspective of targeting benefits according to expected earnings losses, SB863 was arguably mixed. The prior reform SB899 introduced a tiered benefit—the “bump-up, bump-down”—which was designed to promote return to work by offering higher benefits when no return to work offer was made and lower benefits when such an offer was extended. However, there were problems with the implementation of this policy and concern over the costs of administering it (Seabury et al. 2011), and it was eliminated by SB863. SB863 did provide some targeting of benefits to vulnerable populations of workers through the Return to Work Fund, though the size of the benefit is too small to materially affect the wage replacement rate for the average worker.

Future study should explore benefit design options that minimize administrative complications but do more to smooth out the kind of fluctuations in wage replacement across the business cycle that we identified in this report. Policymakers considering how benefit design could be made more responsive to the business cycle should, however, think carefully about the financing of any such benefits, as policies that would necessitate premium increases while the labor market is slack could in theory lead to adverse impacts on hiring.

Other Factors that Influence Long Run Benefit Adequacy

The benefit increases introduced by SB863 significantly increased the adequacy of PPD benefits in California, more than making up for the declines in PD ratings that followed adoption of the *AMA Guides* under SB899. This is despite the fact that earnings losses increased significantly in the wake of the Great Recession. Going forward, if the economy continues to improve and earnings losses fall we expect that benefit adequacy would further rise, to the extent that after-tax replacement rates could exceed 80%. However, there are several factors that make it difficult to forecast future replacement rates. One is a general point that while the economy has been improving, there is uncertainty about future economic growth. Additionally, even if the economy does improve, there could be future downward pressure on replacement rates if an improving economy leads to wage inflation.

As in most states, weekly cash benefits—temporary and permanent—in California are equal to two-thirds of pre-injury wages subject to fixed minimums and maximums. As we discussed in Chapter 5, unlike the TTD maximum, California's PPD weekly maximum benefit is fixed by statute and not adjusted for changes in wage growth or inflation. Accordingly, real benefits and effective replacement rates tend to erode over time due to inflation and real wage growth.

The fixed nature of the maximum weekly wage has significant implications for trends in benefit adequacy. Under SB863, the maximum weekly PPD benefit applicable to most cases increased by 26% in 2014. However, this was the first increase in the maximum benefit since 2006, and the real value of the maximum benefit declined by 13% between 2006 and 2014 due to inflation. The new maximum benefit under SB863 is only 7% higher than the real value of the previous maximum benefit in 2006. In other words, the majority of the increase in benefit

adequacy resulting from the new maximum was necessary to offset the decline in real benefit levels brought about by inflation. If the economic recovery continues and it leads to real wage growth, this could cause the level of earnings losses to rise faster than benefits and lower replacement rates in the future.

A simple way to address the potential erosion of replacement rates over time is to index PPD benefits to inflation the same way that TTD benefits are. However, indexation of PPD benefits is not particularly common in the US. We examined the U.S. Chamber of Commerce *Analysis of Workers' Compensation Laws* to learn how other states handle indexation of the PPD benefit maximum. As of 2012, just 18 states indexed the maximum wage for computing PPD benefits to the state average wage.⁶⁶ If PPD benefits are to be fixed in nominal terms, it further reinforces the need to carefully monitor the adequacy of benefits to ensure that replacement rates do not become too high or too low as underlying economic fundamentals evolve.

The Equity of Permanent Disability Benefits

The impairment rating system and the benefit schedule are the policy instruments for determining an individual claimant's PPD benefits, and ideally they should allocate benefits in a fair and cost-effective manner. Vertical equity, defined as the property of assigning higher ratings and benefits to workers with more severe losses, is a fundamental normative principle for the design of workers' compensation benefits. We found that the *AMA Guides* ratings were quite successful at predicting the severity of work disability and earnings losses that are likely to result from a given impairment.⁶⁷ On a foundational level, then, California's current approach to determining disability benefits is consistent with vertical equity.

There was arguably more potential for SB863 to negatively affect the PPD schedule's horizontal equity, defined as allocating benefits such that workers with similar losses receive similar benefits regardless of the type of injury. This is because the design of the FEC was, in principle, intended to help normalize the relationship between expected losses and average ratings across body part. If the FEC worked well, then eliminating it by fixing it to a single value could actually have worsened horizontal equity. However, while we found that there are significant differences in the compensation of injuries with similar earnings loss depending on the nature of injury, we found no evidence that these differences were exacerbated by SB863. This suggests that the previous FEC's probably did not do a particularly good job of promoting horizontal equity, likely because it was based on data from the old California rating system and not the *AMA Guides*.

This suggests that while SB863 did not worsen horizontal equity, it also didn't improve it. Future research should consider whether the differences in the relationship between earnings losses and ratings across body parts could be alleviated.

⁶⁶ The 18 states that indexed the maximum PPD benefit to the statewide average wage are the following: Alabama, Arizona, Arkansas, Hawaii, Idaho, Kansas, Kentucky, Maryland, Missouri, Montana, New Jersey, New York, North Dakota, Ohio, Oregon, Rhode Island, Utah, West Virginia (U.S. Chamber of Commerce, 2012).

⁶⁷ This is consistent with the findings of Seabury et al. (2013).

Adjusting Benefits for Age and Occupation

Another way to target PPD benefits more accurately would be to modify the formula to convert *impairment* ratings to *disability* ratings according to differences in worker characteristics. In California, occupation and age are two dimensions that are currently used to adjust PPD benefits. These adjustments reflect beliefs about the interaction between age and occupation and a worker's underlying impairment that determines the degree of disability. The goals of these adjustments are to better match benefits to the expected impact of workers' impairments on future earnings.

The impact of the age and occupation adjustments under the current PDRS can be substantial. Table 7.1 illustrates the degree to which benefits paid for the same common impairment can be affected by a worker's occupation and age. The example is for a Diagnosis Related Estimate (DRE) Lumbar Category III with a Whole Person Impairment (WPI) in the AMA Guides of 10%. A worker with neutral occupation and age adjustments (39 year-old medical technician) would receive a final rating of 14% and PPD benefits of \$13,412 if earning at least \$435/week. Depending on their age and occupation adjustments, workers with the same impairment and identical pre-injury wage could receive as little as \$6,090 or as much as \$35,742.

Table 7.1 Impact of Occupation and Age Adjustments under California's PDRS

	21 year-old clerk	39 year-old medical technician	62 year-old skilled construction worker
Impairment	Low back	Low back	Low back
WPI (Standard rating)	10%	10%	10%
FEC	1.4	1.4	1.4
Rating (after FEC)	14%	14%	14%
Occupation group	110	310	420
Occupational Variant	C	F	J
Rating (after Occupation Adjustment)	10%	14%	22%
Final Rating (after Age Adjustment)	7%	14%	29%
PD benefits (at AWW > \$435)	\$6,090	\$13,412	\$35,742
Examples based on California 2005 PDRS.			

While this variation in benefits paid to different workers with similar impairments is intended to target workers with higher expected losses, it has never been empirically validated for equity or its impact on adequacy. In fact, prior work has questioned whether the reduction of benefits for younger workers actually matches the empirical patterns of earnings loss (Reville, Seabury et al. 2005). Although the present study did not analyze occupation and age as factors affecting adequacy and equity, a reasonably straight-forward modification to the methodology would allow the WCIS and DEU data to be used to much more precisely measure and predict the impact of age and occupation on future earnings loss. In turn, this would allow the occupation and age matrices in the PDRS to be redefined to improve equity and also as a tool to improve adequacy.

Labor Code 4660.1(e) sets the requirement that “The schedule of age and occupational modifiers shall promote consistency, uniformity, and objectivity.” Future work should seek to establish a consistent, objective and empirically-based system for incorporating these adjustments into the rating schedule.

***Almaraz* and Other Uncertainties**

In this report, we focused primarily on changes to statute law and DIR regulations, such as the Return to Work fund. But the law is implemented by the courts and shaped by the behavior of lawyers, doctors, and other participants in the system. We identify some factors that DIR should monitor closely in order to keep track of potential further changes in equity, adequacy, and costs.

Almaraz ratings have diffused rapidly and are now performed on one in four cases rated at the DEU. SB863 codified the *Almaraz/Guzman* series of WCAB *en banc* decisions. We estimate that the ratings calculated under the *Almaraz* approach are substantially higher than AMA ratings on the same cases and could lead to as much as an average \$19,000 higher disability payments (+69%) for represented workers getting an alternative rating. This would be about an average of \$4,800 in additional benefits when spread across all represented workers. Unrepresented workers tend to get smaller percentage increases (52%) and smaller absolute increases (\$6,800) when given an alternative rating. These are potentially very important increases to the benefits we calculate in this study for purposes of estimating adequacy. Compared to our estimates of statutory after-tax wage replacement under SB863 for 2010-2012 injuries, *Almaraz* ratings could have increased wage replacement rates for 2010-2012 injuries by as much as 9.3 percentage points, from 61.1% to 70.3%. It is important to note that this large impact on benefit adequacy is an upper bound that assumes that all *Almaraz* ratings are legally valid, and so there is substantial uncertainty regarding the true impact of *Almaraz* ratings on statutory and paid benefits.

Departure from the *AMA Guides* warrants close scrutiny on vertical and horizontal equity grounds. *Almaraz* ratings are certain to increase overall compensation, but it isn't clear if that compensation increase is well targeted at those with disproportionate earnings losses. Horizontal equity may improve or degrade depending on if *Almaraz* ratings systematically factor in information that is predictive of earnings losses or if they add greater variability and uncertainty, but no additional precision.

The impacts of *Almaraz* on equity are more difficult to evaluate empirically, however, for several reasons. It is unlikely that *Almaraz* ratings are assigned at random with respect to severity/complexity earnings losses. It is also possible that they lead to disputes, which could create reverse causation between ratings and expected earnings losses. Despite those challenges and because AMA Guides are widely used in other jurisdictions, it would be important and relatively straight-forward to evaluate, on claims with both AMA and alternative *Almaraz* ratings, which of the two types of ratings more accurately predicted future wage loss. This would be a very valuable direction for future research on the California system.

We also suggest that DIR may wish to monitor WCAB rulings to see if the *Almaraz* ratings are holding up in court and, if possible, linking to WCIS to evaluate impact on paid amounts. Insurance data from WCIRB, SCIF, or others could also provide an important complementary data source to monitor how *Almaraz* ratings influence dispute costs.

Conclusion

The past 15 years have seen much change and upheaval in the California workers' compensation system, particularly the compensation of permanent partial disability benefits. Competing concerns about benefit adequacy and employer cost have motivated numerous reform efforts. At times, these reforms have addressed one issue while worsening the other. This report evaluated how the changes to disability benefits in SB863 will impact outcomes for injured workers, and found that they largely offset the declines in benefit adequacy that occurred in the wake of SB899. However, there remain issues with the California system that need to be addressed in order to ensure that disabled workers receive adequate and fair compensation that is administered in an efficient fashion and that is affordable to employers and the public.

A. Appendix: Methods and Supplemental Results for Chapter 3

Construction of Matched Wage Data

DWC created files containing identifiers for individuals appearing in the WCIS or the DEU and securely transferred these files to the State of California Employment Development Department EDD for linkage to wage histories for injured workers and matched controls. All steps involving identifiable information (name and SSN) took place at EDD; names were removed and social security numbers were scrambled before any files were transferred to RAND.

The starting point for constructing the WCIS analysis file is the WCIS injured worker file, containing identifying information (name and social security number) and injury dates for approximately 9 million selected workers injured between 2005 and 2014, and the quarterly wage history data covering all workers from 1995 through 2014. Starting with the WCIS injured worker file, we applied several screening steps to eliminate bad or malformed SSNs and eliminate exact duplicates based on SSN and year-of-injury. This reduced the file by less than 1%. Next, we limited the population to those workers injured from 2005 through 2013 - yielding approximately 4.3 million workers.

We then pulled quarterly wages for these workers from the EDD wage history files covering the entire 1995-2014 period. The wage files are very large and these wage pulls took a considerable amount of time. Wages were pulled by merging to the EDD wage data using SSN, dropping workers who matched to no wage records in any quarter. This step also created 2-character SOUNDEX strings based on a worker's first and last name in each wage quarter. These soundex strings were used to ensure the integrity of the wage data by checking for consistency of worker names across the quarterly wage records. Workers with inconsistent names across their wage histories were dropped later in the file building process.

The resulting merged wage history file for workers injured between 2005 and 2013 was downloaded to RAND using a secure, encrypted Accellion server. The IDs on the file at this point were JCN and a scrambled SSN named SSN_KEY. The unscrambled SSN remained at EDD.

When downloaded, the WCIS file structure consisted of quarterly wage records, with each worker represented by up to 80 quarters of wage data. The next step was to construct a JCN-level file with one record per JCN and 80 quarters of wage history data strung out on each record. This wide file was then merged to the data from First Reports of Injury (FROI) and Subsequent Reports of Injury (SROI) provided by DWC (Division of Workers' Compensation within the California Department of Industrial Relations). The FROI and SROI files were merged using JCN.

As mentioned above, earlier in the file building process, we constructed SOUNDEX string based on worker first and last names. Actual first and last names were not included on the file downloaded to RAND for confidentiality reasons: only the SOUNDEX strings were transferred. At this point, we built indicators based on the consistency of the 2-character SOUNDEX strings

of first and last names across the EDD wage history data for a given worker. The process cycled through the quarterly wage history data and set various flags to identify inconsistencies observed in worker first and last names. The flags were used during the analysis phase of the project to screen out workers with inconsistencies in their names. In order to qualify for inclusion the following conditions had to be met:

1. Either a single, consistent last name across the entire wage history, or,
2. Multiple last names but single consistent first name (this allowed for the possibility of last name changes due to marriage)

We allowed first name-last name flip flops (e.g. - "Adam Smith" and "Smith Adam" were treated as the same worker), and we treated single initials as equivalent to the same first name (e.g. "Adam Smith" and "A. Smith" were considered the same worker).

Name consistency was not checked for the entire 80-quarter wage history. Instead, we looked at different "windows" of wage quarters. Wider windows, with more wage quarters, would be more likely to yield name inconsistencies, while narrower windows would be more generous. After experimenting with several different window sizes, we selected the period plus/minus 8 wage quarters surrounding the quarter of injury. Worker with inconsistent names within this wage window were not included in the analysis.

Control Worker Selection and Match Quality

As described in Chapter 3, our procedure for estimating earnings losses due to injury involves selecting a control group of workers who did not experience a workplace injury. This section provides additional details on the procedure used to select matched controls and presents some measures of match quality.

For each injured worker with a match to the EDD base wage file, our matching algorithm consists of the following steps:

1. Select the earnings histories of all workers with earnings from the at-injury employer in the quarter of injury
2. For each *potential control* worker selected in step 1, calculate total earnings from all employers over the four quarters immediately preceding the quarter of injury. We refer to this time period as the *match window*.
3. For each potential control worker selected in step 1, calculate the difference between the natural log of total earnings over the match window and the natural log of the injured worker's total earnings over the match window
4. Exclude any potential control workers for whom the difference calculated in step 3 is greater than 20% of the standard deviation of the log of injured worker yearly earnings over the match window
5. For each potential control worker remaining after step 4, calculate pre-injury tenure at the at-injury employer as the number of consecutive quarters of earnings at the at-injury employer

6. Exclude any potential control workers for whom pre-injury tenure differs from the injured worker, with tenure coded into three categories (less than or equal to one year on the job, one to two years, or more than two years)
7. For each potential control worker remaining after step 6, rank control workers by their distance from the injured worker's profile of quarterly earnings over each quarter in the match window.
8. Select the five closest matches according to the ranking in Step 7 and discard the remaining control workers

We apply steps 1 through 8 for each injured worker matched to a valid wage history, sampling control workers with replacement. In order to summarize in a single number the distance between the paths of injured and control worker earnings over the match window, we use the Mahalanobis distance in Step 7. The Mahalanobis distance, which is widely used in the literature on matching when the match is based on more than one variable, can be thought of as a generalization of the Euclidean distance that corrects for the variance and covariance of each element of the vector used for matching.⁶⁸ To understand how this distance measure is constructed and how it ranks the potential control workers, define vectors $\bar{y}^I$ and $\bar{y}^U$ containing total earnings in each of the four quarters preceding the quarter of injury t_0 for each potential control workers ($\bar{y}^U$) and the corresponding injured worker ($\bar{y}^I$)

$$\begin{aligned}\bar{y}^U &= (y_{(t_0-1)}^U, y_{(t_0-2)}^U, y_{(t_0-3)}^U, y_{(t_0-4)}^U)' \\ \bar{y}^I &= (y_{(t_0-1)}^I, y_{(t_0-2)}^I, y_{(t_0-3)}^I, y_{(t_0-4)}^I)'\end{aligned}$$

The Mahalanobis distance M between each potential control and the injured worker is then defined by

$$M = (\bar{y}^I - \bar{y}^U)' \hat{\Sigma}_y^{-1} (\bar{y}^I - \bar{y}^U)$$

where $\hat{\Sigma}_y$ denotes the sample covariance matrix of $\bar{y}^I$ for injured workers with the same quarter of injury. The Mahalanobis distance is a slight departure from the distance measures applied in previous RAND reports that used the matching methodology, which used the average wage over the match window as the basis for ranking. The difference is that the Mahalanobis distance incorporates information about the quarter-by-quarter distance between potential control worker earnings and injured worker earnings, thus prioritizing potential controls who experience similar earnings growth to the injured worker in addition to selecting workers with similar annual earnings.

Match quality can be evaluated using statistics that summarize the distance between the injured and control workers. We examine three such statistics: average imbalance after matching, average absolute imbalance after matching, and average elementwise absolute imbalance after matching. The average imbalance after matching is the average difference between injured and control worker annual earnings. A more stringent criterion is the average absolute imbalance, which uses the absolute value of the difference in annual earnings instead. Finally, we also

⁶⁸ See {Lee, 2005 #80}, pp. 85-87.

present the elementwise absolute imbalance, which sums the absolute value of the difference in quarterly earnings between injured and control. Formally, these are defined as follows:

$$\text{Average Imbalance} = \frac{1}{N} \sum_{i=1}^N (1,1,1,1)(\bar{y}^I - \bar{y}^U)$$

$$\text{Average Absolute Imbalance} = \frac{1}{N} \sum_{i=1}^N |(1,1,1,1)(\bar{y}^I - \bar{y}^U)|$$

$$\text{Average Elementwise Absolute Imbalance} = \frac{1}{N} \sum_{i=1}^N \sum_{\tau=1}^4 |y_{t_0-\tau}^I - y_{t_0-\tau}^U|$$

Appendix Table A.1 presents match quality statistics for the WCIS and DEU samples. The top panel presents imbalance statistics calculated over the match window, while the lower panel presents imbalance statistics calculated over the year preceding the match window. The imbalance statistics the match window verify our success in finding close matches for injured workers; the statistics for the year preceding the match window address the plausibility of the matching assumption that workers with similar wage profiles during the match window have similar earnings at other points in time. Imbalance statistics are reported as percentages of average earnings for all injured workers in the relevant sample over the time period for which the imbalance statistics are calculated.

Table A.1: Match Quality for WCIS and DEU Matched Controls

Balance Statistics for Match Window (1-4 Quarters Pre-Injury)

	WCIS	DEU
Average Imbalance	0.6%	0.1%
Average Absolute Imbalance	4.1%	2.8%
Average Elementwise Absolute Imbalance	10.3%	8.9%

Balance Statistics for Year Before Match Window (5-8 Quarters Pre-Injury)

	WCIS	DEU
Average Imbalance	0.8%	0.8%
Average Absolute Imbalance	20.9%	17.6%
Average Elementwise Absolute Imbalance	25.7%	21.8%

All average balance statistics reported as percentages of average annual earnings for injured workers over the same time period

Balance defined as difference between injured and control worker annual earnings

Absolute balance defined as absolute difference between injured and control worker annual earnings

Elementwise absolute balance defined as sum of absolute value of difference between injured and control worker quarterly earnings over one year

Match window contains earnings records 1 to 4 quarters prior to the quarter of injury

Year before match window contains earnings records 5 to 8 quarters prior to the quarter of injury

Appendix Table A.1 shows that the quality of the match for both samples is high. The average imbalance in the match window is below 1% in both the WCIS sample (0.6% of injured

worker earnings) and the DEU sample (0.1% of injured worker earnings). The average absolute imbalance over the match window, which captures the average distance between injured and control workers at the individual level (in contrast to the group-level comparison captured in the average imbalance) is also quite low. The average matched worker in the WCIS has controls whose annual earnings were within 4.1% (roughly \$1,700) of average injured worker earnings over the match window; the corresponding figure for the DEU is 2.8% (roughly \$1,300). The elementwise absolute imbalance, which captures the average distance on an individual, quarter-by-quarter basis, is somewhat higher, at 10.3% of average earnings in the WCIS and 8.9% in the DEU.

The lower panel of Appendix Table 1 shows that the average imbalance was also quite low over the year preceding the match window: the difference in average annual earnings for both the WCIS and DEU samples remains below 1% of average injured worker earnings. Because we did not use any data on the level of wages from this time period to choose the matched controls, we view this as a validation of our matching methodology. That said, the absolute imbalance and elementwise absolute imbalance are several times larger over the year preceding the match period.

The average imbalance is the least demanding matching criterion we consider in that positive and negative differences for different workers can cancel each other out. However, for our purposes, the average imbalance is arguably the most relevant measure since all our estimates average many injured workers together (thus allowing poor matches at the individual level to cancel out). We included the average absolute imbalance and the average elementwise imbalance so that technical readers can understand the quality of the match at the individual level.

As an alternative approach to evaluating the plausibility of the matching method used here, we can conduct a "placebo" exercise in which we compare one control worker's earnings to average earnings for the remaining matched controls. Although we cannot test the assumption that injured and control worker earnings would have followed the same trajectory in the absence of an injury, we can examine whether the control workers' earnings continue to move together after the injury. To do so, we recalculated control worker wages excluding each injured worker's best match (under the algorithm described above) from the control set and then calculated the difference between the best control's earnings and the other controls. Results for the average difference over the two years before and two years after the injury are presented in Table A.2. Average earnings evolve similarly after the date of injury for the best control and the remaining controls, providing additional support for the plausibility of our match assumption.

Table A.2: Difference Between Best Match and Other Controls for WCIS

	Difference between best match and remaining controls
Year Before Match Window (5-8 Quarters Pre-Injury)	-0.1%
Match window (1-4 Quarters Pre-Injury)	0.1%
First Year Following Injury (1-4 Quarters Post-Injury)	-0.3%
Second Year Following Injury (5-8 Quarters Post-Injury)	-0.3%

Table reports average difference between earnings for the best control and earnings for remaining controls over four years surrounding the injury date
Sample size is 338,736, as groups of control workers that contain only one control worker cannot be used in this exercise.

Differences are reported as percentage of average earnings for all remaining controls

Long-Term Earnings Loss Trajectories

To evaluate the potential for bias due to our focus on a short follow-up period, we examined long-term earnings profiles for workers injured in 2008 or earlier, for whom we obtained five or more years of post-injury data. These data, which are presented in Figures A.1 to A.3, show that injured and control worker earnings profiles are very close to parallel after the second post-injury year. For earnings and employment, relative outcomes in the second post-injury year may be a reasonable proxy for long-term relative outcomes. Relative at-injury employment continues to decline steadily through the fifth post-injury year.

Table A.3

WCIS Earnings, Employment, and Return to Work Over First Five Post-Injury Years

	First Post-Injury Year	Second Post-Injury Year	Third Post-Injury Year	Fourth Post-Injury Year	Fifth Post-Injury Year
Relative Earnings	0.73	0.75	0.76	0.76	0.75
Relative Employment	0.78	0.78	0.8	0.81	0.82
Relative At-Injury Employment	0.76	0.69	0.65	0.61	0.59

Earnings, employment, and return to work over first five post-injury years relative to controls

WCIS injured workers receiving PPD benefits 2005-2008, N = 204247

Figure A.1
Relative Earnings Over Five Post-Injury Years

Figure A.2
Relative Employment Over Five Post-Injury Years

Match window shaded gray
 Relative employment measured at red vertical lines (4Q and 8Q post-injury)
 PPD Claimants in 2005-2008 WCIS (N = 204247)

Figure A.3
Relative At-Injury Employment Over Five Post-Injury Years

B. Appendix: Methods and Supplemental Results for Chapter 4

Aggregate vs. Individual-Level Estimation of Relative Earnings (Chapter 4)

It is worth noting that the definition of relative earnings used to calculate aggregate trends differs from the definition presented in Chapter Three. In Chapter Three, we defined relative earnings at the individual level. Here, however, we averaged earnings over control and injured workers separately and then took the ratio of the averages. Although the ratio of the averages is a different mathematical object from the average of the ratios, we used the ratio of the averages to calculate the trends presented here because calculating relative earnings at the individual level leads to complexities when control worker earnings in the sample are below injured worker earnings. Using individual-level relative earnings leads to enormous positive outliers (when control earnings are very low) and missing data (when control earnings are zero). Calculating relative earnings at the individual level thus leads to results that are statistically unreliable and clearly absurd: for example, the sample average of relative earnings is approximately 400%, implying that a permanently disabling injury *increases* a worker's earnings by a factor of 4.

To assess whether our conclusions are driven by our choice to average earnings before calculating relative earnings, we present selected deciles of individual-level relative earnings in Figure B.4. The deciles of a distribution are not affected by the magnitude of outliers. Whereas relative earnings had a clearly misleading average of 400%, median relative earnings for the overall sample were 67%.

The 10th through 90th deciles of individual-level relative earnings by quarter of injury are shown in Figure B.1. 20th decile and below are zero in all quarters. This figure also illustrates the difficulties inherent in measuring relative earnings at the individual level: permanently disabled workers at the 90th percentile of relative earnings earned over 150% as much as their controls in the period prior to the recession. Above approximately the seventieth percentile of individual-level relative earnings (i.e., where relative earnings begin to exceed 100%), the average post-injury earnings of control workers begins to decline sharply, with post-injury control worker earnings declining sharply above the 90th percentile of individual-level relative earnings. What these injured workers have in common is not that their earnings have grown dramatically after the injury, but that outcomes for their control workers have been unusually poor.⁶⁹

Figure B.1 shows that individual-level relative earnings declined sharply across the distribution around the time of the great recession. The decline in post-injury earnings was particularly sharp in the middle of the distribution, with much more pronounced declines in earnings between the fortieth and sixtieth percentiles than at higher percentiles. Between the first quarter of 2008 and the first quarter of 2009, median relative earnings declined from 54.3% to 31.3%. However, declines in relative earnings during the recession are also apparent at the seventieth percentile and above, and outcomes at all points in the distribution reach a trough in the first quarter of 2009.

⁶⁹ A potentially helpful way to think of this for technical readers is to note that, if we treat control worker outcomes as a measure of each injured worker's earnings potential, individual-level outcomes will have a high variance due to sampling error even though the control worker's outcomes are an unbiased estimator of the injured worker's earnings potential.

Figure B.1
Trends in Deciles of Individual-Level Relative Earnings

Deciles of individual-level relative earnings in second post-injury year by quarter of injury. Deciles are labeled at right of graph. Thick line represents median relative earnings. Relative earnings at 10th and 20th decile are zero in all quarters of injury. Estimates are weighted to correct for match failure. Cases for which control and injured earnings were both equal to zero were assigned relative earnings of zero. Relative earnings for workers with positive earnings are set to equal 6 (approximately the 99th percentile).

We also note that earnings at the fortieth percentile and the median actually began a steep decline early in 2007, while relative earnings at higher deciles declined more gradually prior to 2008. The slight decline in overall relative earnings that preceded the sharp drop during the recession appears to have been driven by workers with lower post-injury earnings.

More generally, Figure B.1 shows that changes in average earnings losses over the business cycle are spread unevenly across deciles of the post-injury earnings distribution. Part of the explanation is mechanical: a large fraction of workers were not employed at two years post-injury even before the recession, so the outcomes measured at a fixed time horizon had no room to get worse for this group. (The fact that two-year outcomes could not get worse for these workers certainly does not rule out the possibility that their longer-term outcomes could be affected by the recession.) However, the fact that the pattern of earnings losses over the business cycle is somewhat more pronounced for workers in the middle of the distribution is an interesting finding that may warrant closer investigation in future work. However, because of the

problems inherent in measuring individual-level earnings losses, we do not pursue this approach in our main analysis of earnings losses and benefits.

Methodology for Case Mix Adjustment of Time Profile of Relative Earnings

To assess the impact of covariates on injured worker outcomes, our primary regression specification for the effect of injury on labor market outcomes uses the difference between injured and control worker outcomes as the dependent variable.

$$y_{ijqt}^I - y_{ijqt}^C = f(E^{I,\text{pre-injury}}, \beta^E) + X_i^D \beta^D + X_i^I \beta^I + X_{jq}^F \beta^F + \mu_q + \varepsilon_{ijqt}$$

where

y_{ijqt}^I Injured worker outcome y t quarters post-injury for injured worker i injured at firm j in quarter

y_{ijqt}^C Injured worker outcome y t quarters post-injury for injured worker i injured at firm j in quarter q

$f(E^{I,\text{pre-injury}}, \beta^E)$ Flexible function for injured worker's real pre-injury annual earnings (dummy variables for 50 bins)

X_i^D Dummy variables for demographics of injured worker, including gender and 5-year age bins

X_i^I Controls for characteristics of injury, including receipt of TTD benefits, estimated TTD duration (dummy variables for 10 deciles of implied TTD duration), number of permanent impairments reported in WCIS (0, 1, or 2), and dummy variables for body part of injury (xx categories)

X_{jq}^F Controls for characteristics of at-injury firm in the quarter of injury, including dummies for seven categories of firm size, ten industry categories, seven categories of the firm's cumulative growth rate over the year preceding the injury, and four categories of the firm's quarterly separation rate over the year preceding the injury.⁷⁰

In models for earnings loss, y denotes total annual earnings over the first, second, or third full post-injury year. In models for employment (at-injury employment), y^I denotes a dummy variable for the event that the injured worker is working (employed at the at-injury firm) in the fourth, eighth, or twelfth post-injury quarter. y^C is the fraction of the injured worker's matched control workers who are working (employed at the at-injury firm) in the same quarter.

Construction of Temporary Disability Duration and Additional Summary Statistics on Injury Characteristics

We provide some additional detail and summary statistics on the procedures we used to construct selected covariates for use in our regression models for earnings loss.

⁷⁰ All dummy variable sets exclude one category.

To control for changes in the initial severity of injury, we calculated the duration of Temporary Total Disability (TTD) implied by the WCIS data. TTD duration variables used in this study are meant as a proxy for the initial severity of the disability to be used in the absence of reliable PD rating information about the case. We used data on the total amounts of Temporary Total Disability (TTD) benefits paid to date (including settlements) and data reported in the WCIS on the average weekly wage to calculate the implied duration of temporary total disability (applying the SAWW-indexed weekly minimum and maximum corresponding to each year of injury as appropriate).

This process is potentially prone to measurement error deriving both from the paid amounts and from the weekly wage variable. On claims with injury dates toward the end of the sample, a mild amount of right-truncation is also likely for the most serious cases. To reduce the impact of these forms of measurement error and truncation, we binned the implied TTD duration into deciles for use as a case-mix adjustment variable. Because TTD durations are so right-skewed, the effect of right-censoring on injury durations in 2011 and 2012 is likely to be confined to the top two or three deciles of the TTD duration distribution. We enter these implied TTD duration deciles into our regression model as a set of dummy variables, with the excluded category being PPD cases with no paid TTD at the time of data collection. Table B.2 reports boundaries for the categories of implied TTD duration used as control variables. The average paid to date amounts for the top decile is implausibly high, reflecting some extremely large outlier amounts. Because we work with binned values of implied duration, these outliers should not affect our results as long as these cases are generally high-severity.

Table B.2
Definition of Implied TTD Duration Control Variables and Summary
Statistics on

TTD duration category	Minimum Implied Duration	Maximum Implied Duration*	Average Implied Weeks*	TTD Paid- to-Date (BTC 050)	TTD Settlement Fraction of Paid-to- Date (BTC Cases 550) (Weighted)	PPD Cases (Weighted)
No TTD Payments	0.0	0.0	0.0	0.0	0.0	29.2%
1	0.0	3.0	1.3	637.1	14.2	7.1%
2	3.0	7.5	5.1	2416.0	65.8	7.0%
3	7.5	12.7	10.0	4589.7	106.9	7.0%
4	12.7	19.2	15.8	7170.1	148.1	7.0%
5	19.2	27.6	23.2	10159.1	225.1	7.0%
6	27.6	38.4	32.7	14020.7	287.3	7.1%
7	38.4	52.1	45.1	18905.1	448.3	7.1%
8	52.1	72.5	61.5	25247.9	456.2	7.1%
9	72.5	103.9	87.8	36026.3	473.9	7.2%
10	103.9	104.0	104.0	396248.4	811.9	7.3%

*Winsorized at 104 weeks.=

To examine whether right-truncation drives trends in implied TTD duration, we compared trends in the average TTD duration to trends at lower percentiles. Right-truncation in later injury years should lead to underestimates of total paid amounts (and therefore of implied TTD duration) primarily for cases that are still being paid at the time of truncation. Some lower-duration cases could also be affected because TTD for an injury may occur after an initial attempt at return to work, but we are comfortable assuming that right-truncation would appear as a differential decrease in cases with implied durations high enough to extend beyond 104 weeks after the date of injury.

Table B.3 shows average implied duration and selected percentiles of duration by year of injury. The decline in average TTD duration that initially raised our concerns about right-truncation is apparent among cases with low and high implied duration alike and begins in 2010. The decline in the average duration closely mirrors the decline in the median, and changes between 2009 and 2012 at the 25th percentile are similar to those observed at the median in percentage terms. Table B.3 suggests that a general decline in implied TTD duration drives the trend in the average, not right-truncation.

Table B.3
Implied TTD Duration by Year of Injury

Injury Year	Average	10th Percentile	25th Percentile	Median	75th Percentile
2005	37.7	3.1	10.1	27.1	58.3
2006	38.2	3.0	10.0	27.0	60.3
2007	39.1	2.9	10.0	28.0	62.6
2008	41.6	3.1	10.7	30.5	68.9
2009	41.2	3.3	10.7	30.3	67.3
2010	39.9	2.9	10.0	28.8	64.0
2011	38.7	2.8	9.8	27.6	61.3
2012	33.4	2.5	8.3	23.4	50.7

Implied TTD duration winsorized at 104 weeks.

We emphasize that the figures reported in Tables B.2 and B.3 are to be used as a rough proxy for initial injury severity. Inferring the actual duration of total disability from administrative data on paid amounts is an inherently error-prone process, and we caution against treating these data directly as a measure of time spent on TTD for the average worker. It is also worth repeating that these are estimates for the population of workers who also receive PPD indemnity payments or settled PPD payments, and not for the overall population of workers with TTD indemnity payments. These cases are much higher-severity on average, and it is not at all clear that average TTD duration for PPD cases should move together with overall average TTD duration.

We also report the incidence of part of injury codes by period (pre-recession, recession, post-recession) in Table B.4. Body part of injury is reported on the FROI, and so it is a rough proxy for the type of permanent impairment. The relative frequencies of the most common body parts of injury among the PPD population are fairly stable across period, though some injury types

(Soft Tissue Neck injuries, Shoulder injuries, Low Back Injuries, and Knee injuries) do become slightly more common after the recession. This table is included primarily as a benchmarking resource for other analysts interested in California's workers' compensation system.

Table B.4
Injury Part of Body Codes by Period

	Pre- Recession (2005- 2007)	Recession (2008- 2009)	Post- Recession (2010- 2012)	Total
25:Soft Tissue Neck	1.1%	1.4%	1.6%	1.3%
30:Multiple Upper Extremities	3.1%	2.8%	2.7%	2.9%
31:Upper Arm	1.5%	1.5%	1.5%	1.5%
32:Elbow	1.9%	1.8%	1.8%	1.8%
33:Lower Arm	2.0%	1.9%	2.0%	2.0%
34:Wrist	4.7%	4.8%	4.6%	4.7%
35:Hand	3.8%	3.5%	3.6%	3.6%
36:Finger(s)	4.0%	3.9%	4.0%	4.0%
37:Thumb	1.2%	1.2%	1.1%	1.2%
38:Shoulder(s)	9.6%	10.5%	11.0%	10.3%
39:Wrist(s) & Hand(s)	1.5%	1.5%	1.4%	1.5%
41:Upper Back Area	3.0%	2.1%	1.8%	2.4%
42:Lower Back Area	15.3%	16.1%	16.7%	16.0%
53:Knee	11.6%	12.1%	12.5%	12.0%
54:Lower Leg	1.4%	1.3%	1.3%	1.3%
55:Ankle	2.7%	2.7%	2.6%	2.7%
56:Foot	2.0%	1.9%	1.8%	1.9%
66:No Physical Injury	0.9%	1.2%	1.4%	1.2%
90:Multiple Body Part	13.8%	13.1%	12.5%	13.2%
Other*	14.9%	14.6%	14.1%	14.6%

* All "other" part of injury codes each represent less than 1% of injuries

Injured workers with missing data on any of the included covariates were dropped from the sample. This resulted in the exclusion of 17,672 observations, or 5.4% of the 345,282 injuries used to calculate the overall time profile of relative earnings in Chapter 4. The fraction of otherwise eligible observations dropped is highest in 2005 (8%) and 2006 (6%) but then stabilizes between 3-5% in each year from 2007-2012. Pre-recession relative earnings for the regression sample are slightly lower (72.7%) than for the sample used to estimate the overall time profile of relative earnings (73.7%), but match the overall averages very closely in later years.

The higher rate of missing industry codes in earlier years raises the possibility of survivorship bias in the selection of firms for our regression analysis sample: EDD retains industry codes for only five years, so we had to backfill NAICS codes to employers in earlier years. Missing NAICS codes may be differentially likely for firms that went out of business or changed tax ID number between the date of injury and 2009, which was the earliest quarter with

NAICS codes in the EDD data.⁷¹ Examining post-injury outcomes for the control workers at firms with missing NAICS codes confirms that these firms had differentially poor outcomes for control workers, as one might expect if these firms were more likely to go out of business. In this case, survivorship bias in the sample of employers used for our regression models leads us to exclude workers with relatively *small* earnings losses in the early years of the sample. This would lead us to *underestimate* relative earnings (i.e., overestimate earnings losses) for injured workers in the early years with more missing NAICS codes since the injured workers who are excluded from the sample would have experienced earnings losses in the absence of their injuries when their employers went out of business. We reiterate that this problem does not affect our main estimates of unadjusted trends (since we do not require complete data on covariates for those estimates), not does it affect any of the estimates in Chapters 3, 5 or 6.

This potential bias is not a problem for the internal validity of our case-mix adjustment model, our regression estimates, or our decomposition results quantifying the contribution of compositional changes to the time profile of earnings losses. Assuming that non-reporting of NAICS codes to EDD for reasons other than attrition of firms, then our case-mix adjustment and decomposition results are valid for the population of workers injured at employers that survived to 2009. This population covers the vast majority of injured workers. In 2005, the year with the highest share of missing NAICS data, the share of missing cases is 8.2%, 5 percentage points higher than the 3.2% rate for injuries in 2009 or later (when there is no survivorship bias).

The main consequence of survivorship bias due to non-reporting of NAICS codes is that our decomposition results may not be externally valid for the full population of PPD cases. Intuition suggests that survivorship bias would lead us to slightly overestimate the role of compositional factors because the unadjusted drop in relative earnings associated with the great recession is in fact larger than the unadjusted drop observed in our regression sample. However, this line of reasoning is not conclusive without knowledge of whether the employers that are excluded from the sample because they went out of business are industries with relatively high or relatively low earnings losses.

However, because the missing data problem affects relatively few cases, the impact is likely to be very small. To illustrate the potential impact of this bias on our decomposition results, we added the difference in pre-recession earnings losses to the total change between pre- and post-recession outcomes estimated in the regression sample (and used to calculate the decomposition results in Table 4.6). Under the assumption that this difference in unadjusted wage loss between the regression sample and the full PPD sample is uncorrelated with all explanatory variables (i.e., it is purely the effect of changing economic conditions) we can recalculate the decomposition results in Table 4.6 to obtain an (approximate) lower bound on the change in average earnings losses from the pre- to post-recession that is explained by compositional factors.⁷² This back-of-

⁷¹ The FROI contains an industry code field as well. Unfortunately, industry reporting on the FROI is missing for 59% of 2005 injuries and 40% of 2006 injuries that would otherwise be usable in our regression sample, and

⁷² The average difference between pre- and post-recession earnings loss in the regression sample is 6.3 percentage points, and the change predicted by the change in average covariates is 2.9 percentage points. The estimate in Table

the-envelope calculation implies that at least 40% of the change in average earnings losses for permanently disabled workers can be attributed to compositional factors, in contrast to the 46% estimate for the regression sample that is reported in Table 4.6. Since this difference is fairly small compared to the range of estimates already reported using alternative outcome definitions and (in Appendix Table B.5, dropping the recession years from the sample), we do not believe that survivorship bias affects the qualitative conclusions that we draw from our decomposition results.

Regression Estimates for Association Between Worker Characteristics and Post-Injury Outcomes

Table **B.5** shows parameter estimates for the coefficients on age and gender. Because we are not explicitly matching on age and gender, these estimates should not be interpreted as the causal effects of age or gender on earnings losses, but rather as potentially contaminated by omitted variable bias. For instance, if older workers nearing retirement age matched to younger workers with longer remaining careers, the effect of age on earnings loss would be biased downward. However, these coefficients do capture all the variation in outcomes that is predicted by demographics, and therefore can be used for case-mix adjustment.

Table **B.6** shows the effects on earnings loss of proxies for injury severity and type of injury that are observable in the WCIS: temporary disability duration, number of permanent impairments reported on the SROI, and body part of injury reported on the FROI.

Table **B.7** reports the effects of firm characteristics on outcomes for injured workers.

All regressions also control for quarterly time effects and 50 bins of real pre-injury earnings.

4.6 is $2.9/6.3 = 46\%$. If we add 1.0 percentage points to the pre-recession loss and perform this calculation, we obtain $2.9/7.3 = 40\%$.

Table B.5: Regression Coefficients for Demographics (Age at Injury and Gender) and Job Tenure

VARIABLES	Relative Earnings			Relative Employment			Relative At-Injury Employment		
	First Post-Injury Year	Second Post-Injury Year	Third Post-Injury Year	Fourth Post-Injury Quarter	Eighth Post-Injury Quarter	Twelfth Post-Injury Quarter	Fourth Post-Injury Quarter	Eighth Post-Injury Quarter	Twelfth Post-Injury Quarter
Female	960.9***	-373.2***	-457.7***	0.00974*	-	-	0.0144*	0.00867*	0.00305
	-91.56	-111.8	-129.1	-0.00204	0.00217	0.00236	0.00206	-0.00209	0.00214
	[781.4 - 1,140]	[-592.3 - -154.0]	[-710.7 - -204.6]	[0.00575 - 0.0137]	[- 0.00584 - 0.00268]	[-0.0104 - -0.00115]	[0.0104 - 0.0185]	[0.00458 - 0.0128]	[- 0.00114 - 0.00725]
Age 21-25	512.8*	804.9**	1,091**	0.0342***	0.0506***	0.0324***	0.011	0.00502	0.00673
	-296.3	-350.7	-427.6	-0.0102	-0.0109	-0.0115	-0.0101	-0.00936	0.00904
	[-67.95 - 1,094]	[117.6 - 1,492]	[252.5 - 1,929]	[-0.0543 - -0.0142]	[-0.0720 - -0.0292]	[-0.0549 - -0.00990]	[- 0.00873 - 0.0308]	[-0.0133 - 0.0234]	[- 0.0110 - 0.0245]
Age 26-30	1,123***	1,356**	1,500***	0.0564***	0.0816***	0.0668***	0.014	0.0168*	0.0220*
	-288.4	-341	-424.3	-0.00988	-0.0105	-0.0111	0.00972	-0.00904	0.00871
	[557.9 - 1,688]	[687.8 - 2,024]	[668.3 - 2,332]	[-0.0757 - -0.0370]	[-0.102 - -0.0610]	[-0.0886 - -0.0451]	[- 0.00504 - 0.0331]	[- 0.000920 - 0.0345]	[0.0049 7 - 0.0391]

Age 31-35	1,105*** -288.3 [540.1 - 1,670]	1,377** -339 [712.5 - 2,041]	1,312*** -416.8 [495.0 - 2,129]	- 0.0589*** [-0.0781 - -0.0398]	- 0.0951*** [-0.116 - -0.0747]	- 0.0797*** [-0.101 - -0.0583]	0.0233* -0.0096 [0.0044 5 - 0.0421]	0.0285** -0.00894 [0.0109 - 0.0460]	0.0349* 0.00861 [0.0180 - 0.0517]
Age 36-40	1,033*** -281.8 [480.7 - 1,585]	1,536** -332.3 [884.7 - 2,187]	1,492*** -411.6 [685.6 - 2,299]	- 0.0613*** [-0.0802 - -0.0424]	- 0.0961*** [-0.116 - -0.0759]	- 0.0824*** [-0.104 - -0.0612]	0.0244* -0.0095 [0.0057 5 - 0.0430]	0.0399** -0.00884 [0.0226 - 0.0572]	0.0468* 0.00851 [0.0301 - 0.0634]
Age 41-45	1,084*** -278.3 [538.2 - 1,629]	1,373** -328.6 [729.1 - 2,017]	960.7** -406.4 [164.2 - 1,757]	- 0.0602*** [-0.0790 - -0.0414]	- 0.103*** [-0.123 - -0.0831]	- 0.0990*** [-0.120 - -0.0779]	0.0323* 0.00943 [0.0138 - 0.0507]	0.0437** -0.00877 [0.0265 - 0.0609]	0.0478* 0.00844 [0.0312 - 0.0643]
Age 46-50	1,153*** -278.4 [607.7 - 1,699]	678.6** -327.9 [35.98 - 1,321]	-765.7* -407 [-1,563 - 32.12]	- 0.0601*** [-0.0788 - -0.0413]	- 0.118*** [-0.138 - -0.0977]	- 0.125*** [-0.146 - -0.104]	0.0414* 0.00941 [0.0229 - 0.0598]	0.0492** -0.00875 [0.0321 - 0.0664]	0.0517* 0.00843 [0.0352 - 0.0682]

Age 51-55	567.7**	-1,669***	-4,764***	-0.0706***	-0.150***	-0.179***	**	0.0341*	0.0275**	0.0153*
	-281	-332.6	-412.4	-0.00959	-0.0102	-0.0108		-0.00943	-0.00879	-0.00847
	[16.90 - 1,119]	[-2,321 - -1,017]	[-5,572 - -3,956]	[-0.0894 - -0.0518]	[-0.170 - -0.130]	[-0.200 - -0.158]		[0.0156 0.0448]	[0.0103 - 0.00133 - 0.0319]	
Age 56-60	-260.5	-4,386***	-8,543***	-0.0941***	-0.197***	-0.247***		0.0179*	0.00071	-0.0183**
	-290.4	-345.2	-426.1	-0.0097	-0.0104	-0.0109		-0.00955	-0.00892	-0.00863
	[-829.7 - 308.6]	[-5,063 - -3,709]	[-9,378 - -7,707]	[-0.113 - - 0.0751]	[-0.217 - -0.177]	[-0.268 - -0.225]		[-0.000851 - 0.0366]	[-0.0168 - -0.0182]	[-0.0352 - - 0.00137]
Age 61-65	-2,005***	-8,041***	-12,907***	-0.134***	-0.275***	-0.343***		-0.0138	-0.0561***	-0.0859***
	-323.8	-388.7	-466.3	-0.0101	-0.0108	-0.0114		-0.00998	-0.00944	-0.00919
	[-2,640 - -1,371]	[-8,803 - -7,279]	[-13,821 - -11,993]	[-0.154 - - 0.114]	[-0.296 - -0.254]	[-0.365 - -0.321]		[-0.0334 - -0.00571]	[-0.0746 - -0.0376]	[-0.104 - -0.0678]
Age 66-70	-2,473***	-7,838***	-12,567***	-0.145***	-0.282***	-0.349***		-0.0234**	-0.0618***	-0.0863***
	-422.4	-507	-601.1	-0.012	-0.0127	-0.0134		-0.0119	-0.0116	-0.0115
	[-3,301 - -1,645]	[-8,832 - -6,844]	[-13,745 - -11,389]	[-0.168 - - 0.122]	[-0.307 - -0.257]	[-0.375 - -0.323]		[-0.0467 - -2.09e-05]	[-0.0845 - -0.0391]	[-0.109 - -0.0639]

Pre-injury job tenure 2-3Q -404.9**	-658.1***	-582.5**	-0.00940**	-0.0145***	-0.0201***	0.0196***	0.0137***	0.00432
(185.7)	(218.9)	(242.2)	(0.00476)	(0.00495)	(0.00523)	(0.00471)	(0.00436)	(0.00420)
[-769.0 -- 40.87]	[-1,087 -- 229.0]	[-1,057 -- 107.8]	[-0.0187 -- 7.21e-05]	[-0.0242 -- 0.00478]	[-0.0304 -- 0.00987]	[0.0103 -- 0.0288]	[0.00520 -- 0.0223]	[-0.00391 -- 0.0126]
Pre-injury job tenure 4-5Q 2,017***	1,495***	1,280***	-0.0626***	-0.0767***	-0.0803***	-0.0859***	-0.106***	-0.112***
(204.6)	(244.7)	(273.5)	(0.00506)	(0.00536)	(0.00569)	(0.00509)	(0.00490)	(0.00482)
[1,617 -- 2,418]	[1,015 -- 1,974]	[743.7 -- 1,816]	[-0.0725 -- 0.0527]	[-0.0872 -- 0.0662]	[-0.0914 -- 0.0691]	[-0.0958 -- 0.0759]	[-0.115 -- 0.0959]	[-0.121 -- 0.103]
Pre-injury job tenure 6-7Q 1,394***	1,199***	1,250***	-0.0611***	-0.0783***	-0.0811***	-0.0849***	-0.107***	-0.119***
(220.1)	(261.5)	(294.4)	(0.00537)	(0.00565)	(0.00600)	(0.00542)	(0.00521)	(0.00516)

	[963.0 - 1,826]	[686.2 - 1,711]	[672.7 - 1,827]	[-0.0717 - - 0.0506]	[-0.0894 - - 0.0673]	[-0.0929 - - 0.0693]	[-0.0956 - - 0.0743]	[-0.118 - - 0.0972]	[-0.129 - - 0.109]
Pre-injury job tenure 8Q+	3,424***	3,221***	2,969***	-0.0263***	-0.0481***	-0.0575***	-0.0294***	-0.0453***	-0.0584***
	(181.3)	(214.4)	(237.4)	(0.00422)	(0.00444)	(0.00468)	(0.00424)	(0.00405)	(0.00397)
	[3,069 - 3,780]	[2,801 - 3,642]	[2,504 - 3,434]	[-0.0346 - - 0.0181]	[-0.0568 - - 0.0394]	[-0.0667 - - 0.0483]	[-0.0377 - - 0.0211]	[-0.0532 - - 0.0374]	[-0.0662 - - 0.0507]
Observations	327,520	327,521	304,177	327,520	327,554	304,210	327,520	327,554	304,210
R-squared	0.182	0.13	0.107	0.152	0.122	0.098	0.117	0.098	0.087

Robust standard errors in brackets

*** p<0.01, ** p<0.05, * p<0.1

Table B.6: Regression Coefficients for Injury Characteristics

VARIABLES	Relative Earnings		Third Post-Injury Year	Relative Employment			Relative At-Injury Employment		
	First Post-Injury Year	Second Post-Injury Year		Fourth Post-Injury Quarter	Eighth Post-Injury Quarter	Twelfth Post-Injury Quarter	Fourth Post-Injury Quarter	Eighth Post-Injury Quarter	Twelfth Post-Injury Quarter
Decile of Total Disability Duration									
Excluded Group: no paid TTD									
TTD Duration Decile 1	283.2 (185.0)	232.0 (229.4)	-2.165 (263.6)	0.0533*** (0.00376)	0.0426*** (0.00417)	0.0339*** (0.00458)	0.0583*** (0.00392)	0.0506*** (0.00412)	0.0387*** (0.00432)
TTD Duration Decile 2	[-79.39 - 645.7] -677.1***	[-217.5 - 681.5] -272.9	[-518.9 - 514.6] -456.3*	[0.0460 - 0.0607] 0.0465***	[0.0344 - 0.0507] 0.0423***	[0.0249 - 0.0429] 0.0339***	[0.0506 - 0.0660] 0.0583***	[0.0426 - 0.0587] 0.0535***	[0.0303 - 0.0472] 0.0424***
TTD Duration Decile 3	[-1,019 - 334.8] -2,581***	[-698.0 - 152.3] -1,132***	[-952.9 - 40.22] -1,516***	[0.0392 - 0.0539] 0.0379***	[0.0342 - 0.0504] 0.0274***	[0.0250 - 0.0427] 0.0176***	[0.0506 - 0.0660] 0.0574***	[0.0455 - 0.0615] 0.0445***	[0.0339 - 0.0508] 0.0318***
TTD Duration Decile 4	[-2,910 - 2,251] -5,301***	[-1,545 - 718.4] -2,679***	[-2,000 - 1,032] -2,703***	[0.0305 - 0.0453] 0.0198***	[0.0193 - 0.0356] 0.0113***	[0.00877 - 0.0265] 0.00278	[0.0498 - 0.0651] 0.0380***	[0.0364 - 0.0525] 0.0278***	[0.0233 - 0.0402] 0.0107**
TTD Duration Decile 5	[-5,633 - 4,968] -9,003***	[-3,094 - 2,265] -5,505***	[-3,186 - 2,220] -4,714***	[0.0121 - 0.0275] -0.0429***	[0.00308 - 0.0196] -0.0388***	[-0.00620 - 0.0118] -0.0361***	[0.0301 - 0.0458] -0.0113***	[0.0197 - 0.0359] -0.0221***	[0.00226 - 0.0191] -0.0256***
TTD Duration Decile 6	[-9,352 - 8,654] -12,399***	[-5,936 - 5,074] -8,524***	[-5,209 - 4,220] -7,371***	[-0.0508 - 0.0349] -0.111***	[-0.0473 - 0.0303] -0.0952***	[-0.0452 - 0.0269] -0.0886***	[-0.0193 - 0.00322] -0.0637***	[-0.0303 - 0.0140] -0.0751***	[-0.0340 - 0.0172] -0.0763***
TTD Duration Decile 7	[-12,726 - 12,071] -15,202***	[-8,941 - 8,108] -11,692***	[-7,846 - 6,897] -9,995***	[-0.119 - 0.103] -0.196***	[-0.104 - 0.0865] -0.163***	[-0.0978 - 0.0794] -0.138***	[-0.0719 - 0.0555] -0.117***	[-0.0833 - 0.0670] -0.113***	[-0.0845 - 0.0680] -0.112***
	(170.4)	(206.4)	(234.4)	(0.00425)	(0.00448)	(0.00476)	(0.00418)	(0.00411)	(0.00413)
	[-15,535 -	[-12,097 -	[-10,454 -	[-0.204 -	[-0.172 -	[-0.147 -	[-0.126 -	[-0.121 -	[-0.120 -

TTD Duration Decile 8	-14,868]	11,288]	-9,535]	0.187]	0.154]	0.128]	0.109]	0.105]	0.104]
	-17,942***	-16,417***	-13,678***	-0.307***	-0.248***	-0.200***	-0.215***	-0.169***	-0.158***
	(176.0)	(211.3)	(238.3)	(0.00415)	(0.00436)	(0.00467)	(0.00413)	(0.00406)	(0.00405)
TTD Duration Decile 9	[-18,287 -	[-16,831 -	[-14,145 -	[-0.315 -	[-0.256 -	[-0.210 -	[-0.223 -	[-0.177 -	[-0.166 -
	-17,597]	16,003]	-13,211]	0.299]	0.239]	0.191]	0.207]	0.161]	0.150]
	-18,291***	-19,445***	-16,091***	-0.361***	-0.332***	-0.271***	-0.254***	-0.213***	-0.188***
TTD Duration Decile 10	(173.1)	(203.9)	(235.1)	(0.00408)	(0.00426)	(0.00463)	(0.00409)	(0.00399)	(0.00400)
	[-18,630 -	[-19,845 -	[-16,552 -	[-0.369 -	[-0.340 -	[-0.280 -	[-0.262 -	[-0.220 -	[-0.196 -
	-17,952]	19,045]	-15,630]	0.353]	0.324]	0.262]	0.245]	0.205]	0.180]
Number of Permanent Impairments Reported in WCIS Excluded Group: No Permanent Impairments Listed in WCIS	-21,454***	-23,931***	-21,492***	-0.408***	-0.425***	-0.366***	-0.296***	-0.277***	-0.238***
	(188.5)	(219.0)	(241.4)	(0.00398)	(0.00402)	(0.00439)	(0.00402)	(0.00387)	(0.00391)
	[-21,823 -	[-24,361 -	[-21,965 -	[-0.415 -	[-0.433 -	[-0.374 -	[-0.304 -	[-0.285 -	[-0.246 -
1 Permanent Impairment Listed in WCIS	-21,084]	23,502]	-21,019]	0.400]	0.417]	0.357]	0.288]	0.270]	0.230]
	-302.6***	-789.0***	-1,501***	0.00897***	0.00415	-0.00413	0.0133***	0.0123***	0.00775***
	(112.4)	(138.6)	(158.1)	(0.00238)	(0.00255)	(0.00272)	(0.00242)	(0.00245)	(0.00248)
2 Permanent Impairments Listed in WCIS	[-523.0 -	[-1,061 -	[-1,811 -	[0.00430 -	[-0.000850 -	[-0.00946 -	[0.00852 -	[0.00753 -	[0.00289 -
	82.18]	517.3]	1,192]	0.0136]	0.00916]	0.00119]	0.0180]	0.0171]	0.0126]
	-560.4***	-1,281***	-2,020***	-0.00223	-0.0137***	-0.0263***	0.0124***	0.0115***	0.00425
Site of Injury on FROI Excluded Group: 10 (Multiple Head Injury)	(145.9)	(179.6)	(205.2)	(0.00331)	(0.00351)	(0.00376)	(0.00334)	(0.00335)	(0.00340)
	[-846.4 -	[-1,633 -	[-2,422 -	[-0.00872 -	[-0.0206 -	[-0.0337 -	[0.00591 -	[0.00492 -	[-0.00242 -
	274.3]	929.5]	1,618]	0.00425]	0.00686]	0.0189]	0.0190]	0.0181]	0.0109]
FROI Injury Part of Body Code 11:Skull	1,366*	1,553	1,125	0.0371*	0.00740	0.0323	0.0437**	0.0329*	0.0300
	(791.2)	(963.0)	(1,088)	(0.0193)	(0.0204)	(0.0216)	(0.0193)	(0.0192)	(0.0185)
	[-184.8 -	[-334.3 -	[-1,008 -	[-0.000856 -	[-0.0326 -	[-0.0101 -	[0.00586 -	[-0.00477 -	[-0.00618 -
FROI Injury Part of Body Code 12:Brain	2,917]	3,441]	3,259]	0.0750]	0.0474]	0.0746]	0.0816]	0.0706]	0.0662]
	-9,269***	-9,988***	-10,243***	-0.132***	-0.121***	-0.114***	-0.144***	-0.150***	-0.127***
	(882.5)	(1,100)	(1,161)	(0.0173)	(0.0188)	(0.0199)	(0.0171)	(0.0172)	(0.0166)
FROI Injury Part of Body Code 13:Ear(s)	[-10,998 -	[-12,144 -	[-12,519 -	[-0.166 -	[-0.158 -	[-0.153 -	[-0.177 -	[-0.184 -	[-0.159 -
	-7,539]	7,832]	-7,968]	0.0980]	0.0846]	0.0755]	0.110]	0.117]	0.0941]
	4,908***	-4,990***	-7,245***	-0.00882	-0.0489***	-0.0362*	-0.00409	-0.0341**	-0.0221
	(1,059)	(1,325)	(1,463)	(0.0164)	(0.0174)	(0.0187)	(0.0165)	(0.0172)	(0.0173)
	[2,832 -	[-7,587 -	[-10,114 -	[-0.0410 -	[-0.0830 -	[-0.0728 -	[-0.0365 -	[-0.0678 -	[-0.0559 -
	6,984]	2,393]	-4,377]	0.0234]	0.0148]	0.000522]	0.0283]	0.000497]	0.0118]

FROI Injury Part of Body Code 14:Eye(s)	4,895*** (713.1) [3,497 - 6,293]	4,691*** (892.4) [2,942 - 6,441]	4,804*** (1,005) [2,834 - 6,773]	0.0686*** (0.0157) [0.0379 - 0.0993]	0.0666*** (0.0173) [0.0327 - 0.100]	0.0630*** (0.0182) [0.0274 - 0.0987]	0.0630*** (0.0158) [0.0320 - 0.0940]	0.0771*** (0.0164) [0.0449 - 0.109]	0.0875*** (0.0158) [0.0565 - 0.118]
FROI Injury Part of Body Code 15:Nose	3,596*** (1,240) [1,166 - 6,027]	3,094** (1,483) [186.7 - 6,001]	4,349** (1,756) [908.0 - 7,790]	0.0688** (0.0281) [0.0137 - 0.124]	0.0464 (0.0302) [-0.0127 - 0.106]	0.0948*** (0.0315) [0.0331 - 0.157]	0.0609** (0.0283) [0.00535 - 0.116]	0.0427 (0.0291) [-0.0142 - 0.0997]	0.0720** (0.0287) [0.0157 - 0.128]
FROI Injury Part of Body Code 16:Teeth	7,484** (3,321) [974.1 - 13,993]	5,984 (4,916) [-3,652 - 15,620]	7,495 (4,854) [-2,018 - 17,008]	0.0733 (0.0455) [-0.0159 - 0.162]	0.0797 (0.0507) [-0.0196 - 0.179]	-0.000953 (0.0525) [-0.104 - 0.102]	0.0511 (0.0439) [-0.0349 - 0.137]	0.0493 (0.0464) [-0.0416 - 0.140]	0.0545 (0.0543) [-0.0518 - 0.161]
FROI Injury Part of Body Code 17:Mouth	1,741 (1,682) [-1,557 - 5,038]	1,356 (2,165) [-2,887 - 5,598]	489.7 (2,555) [-4,519 - 5,498]	-0.0125 (0.0368) [-0.0846 - 0.0596]	-0.00938 (0.0399) [-0.0876 - 0.0689]	-0.0123 (0.0406) [-0.0919 - 0.0673]	-0.0368 (0.0350) [-0.105 - 0.0319]	0.00644 (0.0360) [-0.0640 - 0.0769]	-0.00818 (0.0362) [-0.0792 - 0.0629]
FROI Injury Part of Body Code 18:Soft Tissue Head	1,093 (685.7) [-250.8 - 2,437]	1,430* (859.2) [-254.4 - 3,114]	1,242 (954.6) [-628.8 - 3,113]	0.0351** (0.0156) [0.00458 - 0.0656]	0.0257 (0.0169) [-0.00744 - 0.0589]	0.0281 (0.0178) [-0.00674 - 0.0630]	0.0389** (0.0156) [0.00830 - 0.0696]	0.0323** (0.0158) [0.00124 - 0.0633]	0.0342** (0.0154) [0.00403 - 0.0644]
FROI Injury Part of Body Code 19:Facial Bones	-1,350 (1,538) [-4,366 - 1,665]	-257.8 (1,692) [-3,574 - 3,058]	1,499 (1,965) [-2,353 - 5,351]	0.0908*** (0.0293) [0.0334 - 0.148]	0.0612** (0.0312) [5.49e-05 - 0.122]	0.0657* (0.0353) [-0.00355 - 0.135]	0.0621** (0.0306) [0.00211 - 0.122]	0.0556* (0.0300) [-0.00322 - 0.114]	0.0759** (0.0317) [0.0138 - 0.138]
FROI Injury Part of Body Code 20:Multiple Neck Injury	2,497*** (652.4) [1,218 - 3,775]	1,236 (842.0) [-414.2 - 2,886]	1,416 (933.2) [-413.3 - 3,245]	0.0456*** (0.0144) [0.0175 - 0.0738]	0.0283* (0.0154) [-0.00189 - 0.0585]	0.0262 (0.0164) [-0.00603 - 0.0584]	0.0561*** (0.0144) [0.0280 - 0.0842]	0.0410*** (0.0146) [0.0125 - 0.0695]	0.0413*** (0.0145) [0.0129 - 0.0698]
FROI Injury Part of Body Code 21:Vertebrae	502.5 (968.7) [-1,396 - 2,401]	-1,630 (1,109) [-3,804 - 544.4]	-1,051 (1,344) [-3,686 - 1,583]	-0.00914 (0.0201) [-0.0485 - 0.0302]	-0.0218 (0.0214) [-0.0637 - 0.0201]	-0.0180 (0.0231) [-0.0632 - 0.0272]	0.0247 (0.0205) [-0.0154 - 0.0649]	-0.00872 (0.0202) [-0.0484 - 0.0310]	0.00654 (0.0208) [-0.0342 - 0.0473]
FROI Injury Part of Body Code 22:Disc	1,591** (706.3)	-269.4 (893.1)	-271.8 (1,074)	0.0122 (0.0158)	-0.00899 (0.0168)	-0.00974 (0.0182)	0.0144 (0.0157)	0.00559 (0.0158)	0.0105 (0.0157)

FROI Injury Part of Body Code 23:Spinal Cord	[206.4 - 2,975] -2,027*	[-2,020 - 1,481] -1,130	[-2,377 - 1,833] -790.7	[-0.0188 - 0.0431] -0.0384	[-0.0419 - 0.0239] -0.00363	[-0.0455 - 0.0260] -0.00554	[-0.0162 - 0.0451] -0.0149	[-0.0253 - 0.0365] 0.0106	[-0.0204 - 0.0413] 0.0261
	(1,226)	(1,395)	(1,592)	(0.0266)	(0.0285)	(0.0318)	(0.0272)	(0.0265)	(0.0273)
FROI Injury Part of Body Code 24:Larynx	[-4,429 - 375.2] -209.4	[-3,864 - 1,603] -1,848	[-3,912 - 2,330] -6,658	[-0.0907 - 0.0138] -0.0137	[-0.0596 - 0.0523] 0.00551	[-0.0678 - 0.0567] -0.0977	[-0.0681 - 0.0384] -0.0319	[-0.0414 - 0.0627] -0.0232	[-0.0273 - 0.0795] -0.0903
	(3,382)	(3,476)	(4,668)	(0.0609)	(0.0585)	(0.0767)	(0.0640)	(0.0618)	(0.0743)
FROI Injury Part of Body Code 25:Soft Tissue Neck	[-6,838 - 6,419] 2,078***	[-8,660 - 4,965] -135.9	[-15,807 - 2,491] -792.4	[-0.133 - 0.106] 0.00933	[-0.109 - 0.120] -0.00870	[-0.248 - 0.0527] -0.00488	[-0.157 - 0.0935] 0.0233*	[-0.144 - 0.0980] -0.00318	[-0.236 - 0.0554] 0.0122
	(584.8)	(744.3)	(818.8)	(0.0128)	(0.0139)	(0.0149)	(0.0128)	(0.0129)	(0.0129)
FROI Injury Part of Body Code 26:Trachea	[932.3 - 3,225] 3,686	[-1,595 - 1,323] -4,935	[-2,397 - 812.3] -2,268	[-0.0157 - 0.0344] -0.0132	[-0.0359 - 0.0185] -0.122**	[-0.0341 - 0.0243] -0.0839	[-0.00181 - 0.0484] 0.0239	[-0.0284 - 0.0221] -0.0397	[-0.0130 - 0.0374] -0.0457
	(2,852)	(4,291)	(5,542)	(0.0612)	(0.0606)	(0.0959)	(0.0644)	(0.0690)	(0.0977)
FROI Injury Part of Body Code 30:Multiple Upper Extremities	[-1,904 - 9,276] 3,366***	[-13,346 - 3,477] 1,571**	[-13,130 - 8,594] 1,557**	[-0.133 - 0.107] 0.0565***	[-0.241 - 0.00356] 0.0446***	[-0.272 - 0.104] 0.0436***	[-0.102 - 0.150] 0.0724***	[-0.175 - 0.0955] 0.0524***	[-0.237 - 0.146] 0.0496***
	(512.0)	(644.5)	(717.0)	(0.0115)	(0.0125)	(0.0133)	(0.0115)	(0.0116)	(0.0114)
FROI Injury Part of Body Code 31:Upper Arm (Excluding Clavicle & Scapula)	[2,363 - 4,370] 4,652***	[307.3 - 2,834] 5,141***	[151.8 - 2,962] 4,288***	[0.0340 - 0.0790] 0.104***	[0.0202 - 0.0690] 0.0901***	[0.0174 - 0.0697] 0.0891***	[0.0500 - 0.0949] 0.123***	[0.0297 - 0.0751] 0.107***	[0.0273 - 0.0719] 0.103***
	(543.1)	(694.0)	(781.1)	(0.0124)	(0.0135)	(0.0145)	(0.0125)	(0.0127)	(0.0126)
FROI Injury Part of Body Code 32:Elbow	[3,587 - 5,716] 4,981***	[3,781 - 6,501] 3,371***	[2,757 - 5,819] 3,685***	[0.0798 - 0.128] 0.0957***	[0.0637 - 0.117] 0.0696***	[0.0606 - 0.118] 0.0759***	[0.0988 - 0.148] 0.111***	[0.0821 - 0.132] 0.0834***	[0.0779 - 0.127] 0.0840***
	(530.8)	(676.7)	(754.0)	(0.0121)	(0.0131)	(0.0141)	(0.0121)	(0.0123)	(0.0122)
FROI Injury Part of Body Code 33:Lower Arm	[3,941 - 6,022] 4,653***	[2,044 - 4,697] 4,208***	[2,207 - 5,163] 4,194***	[0.0720 - 0.119] 0.0942***	[0.0440 - 0.0953] 0.0829***	[0.0483 - 0.104] 0.0733***	[0.0874 - 0.135] 0.106***	[0.0594 - 0.108] 0.0854***	[0.0601 - 0.108] 0.0820***
	(514.6)	(658.2)	(732.1)	(0.0120)	(0.0130)	(0.0139)	(0.0119)	(0.0121)	(0.0119)
	[3,644 - 5,662]	[2,918 - 5,498]	[2,760 - 5,629]	[0.0708 - 0.118]	[0.0575 - 0.108]	[0.0460 - 0.101]	[0.0826 - 0.129]	[0.0617 - 0.109]	[0.0586 - 0.105]

FROI Injury Part of Body Code 34:Wrist	4,677*** (485.5)	3,905*** (620.2)	3,841*** (690.3)	0.0945*** (0.0110)	0.0782*** (0.0119)	0.0808*** (0.0128)	0.106*** (0.0109)	0.0879*** (0.0111)	0.0845*** (0.0108)
	[3,726 - 5,629]	[2,690 - 5,121]	[2,488 - 5,194]	[0.0730 - 0.116]	[0.0548 - 0.102]	[0.0557 - 0.106]	[0.0849 - 0.128]	[0.0662 - 0.110]	[0.0633 - 0.106]
FROI Injury Part of Body Code 35:Hand	4,761*** (489.8)	3,293*** (622.9)	2,693*** (694.7)	0.0908*** (0.0112)	0.0639*** (0.0121)	0.0598*** (0.0130)	0.0936*** (0.0112)	0.0707*** (0.0113)	0.0717*** (0.0111)
	[3,801 - 5,721]	[2,072 - 4,514]	[1,331 - 4,054]	[0.0689 - 0.113]	[0.0401 - 0.0876]	[0.0343 - 0.0853]	[0.0717 - 0.115]	[0.0485 - 0.0928]	[0.0499 - 0.0934]
FROI Injury Part of Body Code 36:Finger(s)	8,103*** (483.9)	8,224*** (616.1)	7,414*** (684.8)	0.180*** (0.0110)	0.164*** (0.0121)	0.143*** (0.0130)	0.181*** (0.0111)	0.170*** (0.0113)	0.162*** (0.0111)
	[7,155 - 9,052]	[7,016 - 9,431]	[6,072 - 8,756]	[0.159 - 0.202]	[0.140 - 0.187]	[0.118 - 0.169]	[0.159 - 0.203]	[0.148 - 0.192]	[0.140 - 0.184]
FROI Injury Part of Body Code 37:Thumb	6,946*** (570.6)	5,469*** (739.2)	4,820*** (819.5)	0.132*** (0.0131)	0.110*** (0.0143)	0.105*** (0.0154)	0.143*** (0.0132)	0.109*** (0.0135)	0.108*** (0.0136)
	[5,828 - 8,065]	[4,020 - 6,918]	[3,214 - 6,426]	[0.106 - 0.157]	[0.0821 - 0.138]	[0.0746 - 0.135]	[0.117 - 0.169]	[0.0829 - 0.136]	[0.0818 - 0.135]
FROI Injury Part of Body Code 38:Shoulder(s)	3,663*** (466.4)	4,224*** (595.1)	4,368*** (659.0)	0.0898*** (0.0105)	0.0736*** (0.0115)	0.0729*** (0.0123)	0.105*** (0.0105)	0.0897*** (0.0106)	0.0867*** (0.0103)
	[2,749 - 4,577]	[3,058 - 5,391]	[3,076 - 5,660]	[0.0691 - 0.110]	[0.0511 - 0.0960]	[0.0488 - 0.0970]	[0.0846 - 0.126]	[0.0689 - 0.110]	[0.0665 - 0.107]
FROI Injury Part of Body Code 39:Wrist(s) & Hand(s)	3,814*** (561.8)	2,061*** (702.1)	1,280 (780.2)	0.0626*** (0.0125)	0.0557*** (0.0135)	0.0399*** (0.0146)	0.0792*** (0.0125)	0.0696*** (0.0127)	0.0606*** (0.0125)
	[2,713 - 4,915]	[685.0 - 3,437]	[-249.4 - 2,809]	[0.0381 - 0.0871]	[0.0292 - 0.0821]	[0.0113 - 0.0684]	[0.0546 - 0.104]	[0.0447 - 0.0945]	[0.0360 - 0.0852]
FROI Injury Part of Body Code 40:Multiple Trunk	2,659*** (665.0)	549.4 (835.6)	-944.3 (992.9)	0.0141 (0.0143)	0.00460 (0.0151)	-0.000202 (0.0162)	0.0125 (0.0141)	0.00970 (0.0140)	0.0165 (0.0138)
	[1,356 - 3,963]	[-1,088 - 2,187]	[-2,890 - 1,002]	[-0.0140 - 0.0421]	[-0.0250 - 0.0342]	[-0.0319 - 0.0315]	[-0.0150 - 0.0401]	[-0.0177 - 0.0371]	[-0.0105 - 0.0435]
FROI Injury Part of Body Code 41:Upper Back Area (Thoracic Area)	1,575*** (519.2)	1,041 (657.5)	1,474** (730.3)	0.0211* (0.0116)	-0.00240 (0.0125)	0.00426 (0.0134)	0.0256** (0.0115)	0.00476 (0.0116)	0.00867 (0.0114)
	[557.5 - 2,593]	[-247.5 - 2,330]	[42.19 - 2,905]	[-0.00152 - 0.0438]	[-0.0268 - 0.0220]	[-0.0220 - 0.0305]	[0.00319 - 0.0481]	[-0.0180 - 0.0276]	[-0.0137 - 0.0311]
FROI Injury Part of Body Code 42:Lower Back Area (including Lumbar & Lumbo-Sacral)	853.1* (519.2)	-731.3 (657.5)	-1,065 (730.3)	-0.00798 (0.0116)	-0.0219* (0.0125)	-0.0178 (0.0134)	0.0104 (0.0115)	-0.00575 (0.0116)	-0.00125 (0.0114)

	(461.3)	(586.5)	(649.0)	(0.0104)	(0.0114)	(0.0122)	(0.0104)	(0.0104)	(0.0101)
	[-51.07 - 1,757]	[-1,881 - 418.3]	[-2,337 - 207.1]	[-0.0285 - 0.0125]	[-0.0442 - 0.000359]	[-0.0417 - 0.00597]	[-0.00988 - 0.0308]	[-0.0262 - 0.0147]	[-0.0211 - 0.0186]
FROI Injury Part of Body Code 43:Disc	794.5	-903.2	-2,537**	-0.0145	-0.0296	-0.0288	0.0154	-0.00153	0.00158
	(807.1)	(1,018)	(1,270)	(0.0191)	(0.0203)	(0.0228)	(0.0190)	(0.0192)	(0.0194)
	[-787.4 - 2,376]	[-2,898 - 1,092]	[-5,027 - 46.93]	[-0.0519 - 0.0229]	[-0.0695 - 0.0102]	[-0.0734 - 0.0158]	[-0.0219 - 0.0527]	[-0.0392 - 0.0361]	[-0.0365 - 0.0397]
FROI Injury Part of Body Code 44:Chest (including Ribs, Sternum & Soft Tissue)	1,199*	812.5	-193.8	-0.0119	-0.00713	-0.0142	0.0128	0.00790	0.0111
	(679.6)	(898.9)	(981.8)	(0.0157)	(0.0168)	(0.0178)	(0.0157)	(0.0159)	(0.0158)
	[-133.1 - 2,531]	[-949.3 - 2,574]	[-2,118 - 1,730]	[-0.0428 - 0.0189]	[-0.0401 - 0.0258]	[-0.0491 - 0.0207]	[-0.0180 - 0.0435]	[-0.0232 - 0.0390]	[-0.0198 - 0.0421]
FROI Injury Part of Body Code 45:Sacrum and Coccyx	2,126*	633.3	1,158	0.0312	-0.0187	0.0148	0.0697**	0.0212	0.0181
	(1,141)	(1,387)	(1,865)	(0.0303)	(0.0324)	(0.0381)	(0.0321)	(0.0297)	(0.0315)
	[-111.3 - 4,363]	[-2,085 - 3,352]	[-2,497 - 4,813]	[-0.0282 - 0.0907]	[-0.0823 - 0.0448]	[-0.0598 - 0.0894]	[0.00676 - 0.133]	[-0.0371 - 0.0795]	[-0.0435 - 0.0797]
FROI Injury Part of Body Code 46:Pelvis	1,723	2,256	1,920	0.0346	0.0428	0.0324	0.0428	0.0578*	0.0522*
	(1,230)	(1,700)	(1,661)	(0.0303)	(0.0319)	(0.0327)	(0.0304)	(0.0299)	(0.0299)
	[-687.9 - 4,133]	[-1,076 - 5,589]	[-1,335 - 5,175]	[-0.0248 - 0.0941]	[-0.0198 - 0.105]	[-0.0316 - 0.0965]	[-0.0168 - 0.102]	[-0.000827 - 0.116]	[-0.00646 - 0.111]
FROI Injury Part of Body Code 47:Spinal Cord	972.5	-1,218	-224.7	0.00870	-0.0189	0.00514	0.00897	-0.0134	0.00405
	(1,142)	(1,503)	(1,732)	(0.0262)	(0.0269)	(0.0295)	(0.0257)	(0.0249)	(0.0257)
	[-1,265 - 3,210]	[-4,163 - 1,728]	[-3,619 - 3,169]	[-0.0427 - 0.0601]	[-0.0716 - 0.0339]	[-0.0526 - 0.0629]	[-0.0414 - 0.0594]	[-0.0622 - 0.0355]	[-0.0463 - 0.0544]
FROI Injury Part of Body Code 48:Internal Organs	-3,574***	-8,910***	-12,599***	-0.0962***	-0.109***	-0.126***	-0.0811***	-0.116***	-0.104***
	(1,220)	(1,537)	(1,692)	(0.0189)	(0.0203)	(0.0207)	(0.0190)	(0.0193)	(0.0189)
	[-5,965 - 1,184]	[-11,923 - 5,896]	[-15,915 - -9,282]	[-0.133 - 0.0592]	[-0.149 - 0.0691]	[-0.167 - 0.0856]	[-0.118 - 0.0439]	[-0.154 - 0.0782]	[-0.141 - 0.0668]
FROI Injury Part of Body Code 49:Heart	-3,930***	-12,372***	-15,492***	-0.0523***	-0.114***	-0.127***	-0.0561***	-0.116***	-0.130***
	(1,178)	(1,578)	(1,685)	(0.0153)	(0.0171)	(0.0182)	(0.0155)	(0.0163)	(0.0166)
	[-6,238 - 1,621]	[-15,464 - 9,280]	[-18,795 - -12,188]	[-0.0823 - 0.0223]	[-0.148 - 0.0808]	[-0.162 - 0.0911]	[-0.0865 - 0.0258]	[-0.148 - 0.0844]	[-0.162 - 0.0972]
FROI Injury Part of Body Code 50:Multiple Lower Extremities	2,123***	1,880**	1,930**	0.0656***	0.0256*	0.0369**	0.0715***	0.0380***	0.0435***
	(600.7)	(778.0)	(869.0)	(0.0140)	(0.0152)	(0.0163)	(0.0140)	(0.0143)	(0.0141)

FROI Injury Part of Body Code 51:Hip	[945.8 - 3,300] 1,689**	[355.7 - 3,405] 2,466***	[226.3 - 3,633] 1,674*	[0.0382 - 0.0931] 0.0578***	[-0.00423 - 0.0555] 0.0482***	[0.00509 - 0.0688] 0.0286*	[0.0440 - 0.0990] 0.0747***	[0.00995 - 0.0660] 0.0532***	[0.0158 - 0.0712] 0.0421***
	(695.5)	(841.0)	(920.0)	(0.0146)	(0.0156)	(0.0167)	(0.0146)	(0.0147)	(0.0146)
FROI Injury Part of Body Code 52:Upper Leg	[325.6 - 3,052] 3,629***	[817.2 - 4,114] 4,621***	[-128.9 - 3,477] 4,737***	[0.0292 - 0.0864] 0.0827***	[0.0176 - 0.0789] 0.0702***	[-0.00414 - 0.0614] 0.0718***	[0.0462 - 0.103] 0.0833***	[0.0245 - 0.0819] 0.0755***	[0.0134 - 0.0708] 0.0883***
	(815.5)	(935.2)	(1,040)	(0.0170)	(0.0190)	(0.0196)	(0.0171)	(0.0176)	(0.0176)
FROI Injury Part of Body Code 53:Knee	[2,031 - 5,227] 4,599***	[2,788 - 6,454] 5,973***	[2,698 - 6,776] 5,453***	[0.0495 - 0.116] 0.115***	[0.0330 - 0.107] 0.0989***	[0.0333 - 0.110] 0.0895***	[0.0498 - 0.117] 0.126***	[0.0410 - 0.110] 0.114***	[0.0537 - 0.123] 0.106***
	(465.6)	(593.7)	(658.5)	(0.0105)	(0.0114)	(0.0122)	(0.0104)	(0.0105)	(0.0102)
FROI Injury Part of Body Code 54:Lower Leg	[3,687 - 5,512] 2,976***	[4,809 - 7,136] 5,025***	[4,162 - 6,743] 5,297***	[0.0944 - 0.135] 0.0775***	[0.0766 - 0.121] 0.0695***	[0.0656 - 0.113] 0.0610***	[0.106 - 0.147] 0.0845***	[0.0932 - 0.134] 0.0857***	[0.0862 - 0.126] 0.0875***
	(569.0)	(721.3)	(809.6)	(0.0129)	(0.0139)	(0.0148)	(0.0129)	(0.0130)	(0.0129)
FROI Injury Part of Body Code 55:Ankle	[1,861 - 4,091] 3,810***	[3,611 - 6,438] 4,793***	[3,710 - 6,883] 4,214***	[0.0522 - 0.103] 0.104***	[0.0423 - 0.0968] 0.0853***	[0.0320 - 0.0900] 0.0702***	[0.0592 - 0.110] 0.112***	[0.0602 - 0.111] 0.0949***	[0.0623 - 0.113] 0.0878***
	(510.1)	(645.7)	(719.2)	(0.0116)	(0.0125)	(0.0135)	(0.0115)	(0.0117)	(0.0115)
FROI Injury Part of Body Code 56:Foot	[2,811 - 4,810] 3,221***	[3,527 - 6,059] 3,654***	[2,805 - 5,624] 3,010***	[0.0814 - 0.127] 0.0851***	[0.0607 - 0.110] 0.0605***	[0.0439 - 0.0966] 0.0561***	[0.0891 - 0.134] 0.0921***	[0.0720 - 0.118] 0.0756***	[0.0653 - 0.110] 0.0835***
	(531.3)	(666.2)	(741.3)	(0.0121)	(0.0130)	(0.0140)	(0.0121)	(0.0122)	(0.0120)
FROI Injury Part of Body Code 57:Toe(s)	[2,179 - 4,262] 4,960***	[2,348 - 4,960] 4,559***	[1,557 - 4,463] 4,112***	[0.0614 - 0.109] 0.107***	[0.0350 - 0.0860] 0.0729***	[0.0286 - 0.0835] 0.0817***	[0.0684 - 0.116] 0.118***	[0.0517 - 0.0994] 0.115***	[0.0600 - 0.107] 0.101***
	(980.6)	(1,270)	(1,443)	(0.0224)	(0.0240)	(0.0255)	(0.0225)	(0.0228)	(0.0235)
FROI Injury Part of Body Code 58:Great Toe	[3,038 - 6,882] 7,155***	[2,071 - 7,048] 7,785***	[1,285 - 6,940] 5,650***	[0.0629 - 0.151] 0.127***	[0.0259 - 0.120] 0.141***	[0.0318 - 0.132] 0.112***	[0.0735 - 0.162] 0.126***	[0.0705 - 0.160] 0.127***	[0.0547 - 0.147] 0.119***
	(1,611)	(1,725)	(1,795)	(0.0330)	(0.0345)	(0.0365)	(0.0338)	(0.0343)	(0.0345)
FROI Injury Part of Body Code 60:Lungs	[3,997 - 10,313] -876.6	[4,403 - 11,166] -2,193	[2,132 - 9,167] -2,315	[0.0625 - 0.192] -0.0331	[0.0734 - 0.209] -0.0464**	[0.0408 - 0.184] -0.0318	[0.0599 - 0.193] -0.0517**	[0.0597 - 0.194] -0.0715***	[0.0512 - 0.187] -0.0470**
	(1,067)	(1,359)	(1,589)	(0.0205)	(0.0217)	(0.0232)	(0.0204)	(0.0199)	(0.0193)

FROI Injury Part of Body Code 61:Abdomen Including Groin	[-2,969 - 1,215] 2,372***	[-4,856 - 470.5] 1,327*	[-5,430 - 799.3] 482.4	[-0.0733 - 0.00717] 0.0293**	[-0.0889 - 0.00392] -0.00784	[-0.0774 - 0.0137] 0.00129	[-0.0916 - 0.0118] 0.0298**	[-0.111 - 0.0324] 0.00621	[-0.0849 - 0.00912] 0.0157
	(609.5)	(771.1)	(855.2)	(0.0148)	(0.0157)	(0.0169)	(0.0148)	(0.0144)	(0.0143)
FROI Injury Part of Body Code 62:Buttocks	[1,177 - 3,567] 2,280**	[-184.1 - 2,839] 1,080	[-1,194 - 2,159] 10.62	[0.000422 - 0.0583] 0.0240	[-0.0386 - 0.0229] -1.50e-05	[-0.0318 - 0.0344] -0.0230	[0.000768 - 0.0587] 0.0424	[-0.0221 - 0.0345] 0.0286	[-0.0122 - 0.0437] 0.0113
	(953.0)	(1,183)	(1,384)	(0.0272)	(0.0270)	(0.0298)	(0.0268)	(0.0255)	(0.0264)
FROI Injury Part of Body Code 63:Lumbar and/or Sacral Vertebrae (Vertebrae NOC Trunk)	[411.7 - 4,147] 850.9	[-1,239 - 3,398] 249.3	[-2,703 - 2,724] 192.2	[-0.0293 - 0.0772] 0.0123	[-0.0530 - 0.0529] 0.00632	[-0.0814 - 0.0353] 0.0143	[-0.0102 - 0.0950] 0.0336**	[-0.0213 - 0.0785] 0.0205	[-0.0404 - 0.0631] 0.0353**
	(601.9)	(744.6)	(833.9)	(0.0144)	(0.0156)	(0.0168)	(0.0144)	(0.0145)	(0.0143)
FROI Injury Part of Body Code 64:Artificial Appliance	[-328.8 - 2,031] 1,024	[-1,210 - 1,709] -158.6	[-1,442 - 1,827] 43.47	[-0.0159 - 0.0405] -0.220	[-0.0243 - 0.0369] -0.110	[-0.0186 - 0.0471] -0.412***	[0.00545 - 0.0617] -0.201	[-0.00801 - 0.0490] -0.0647	[0.00725 - 0.0633] -0.00186
	(4,443)	(7,790)	(6,975)	(0.166)	(0.192)	(0.116)	(0.186)	(0.208)	(0.206)
FROI Injury Part of Body Code 65:Insufficient Info to Properly Identify-Unclassified	[-7,685 - 9,732] -1,837***	[-15,427 - 15,110] -2,769***	[-13,628 - 13,715] -1,284	[-0.544 - 0.105] -0.0642***	[-0.488 - 0.267] -0.0361**	[-0.640 - 0.184] -0.0139	[-0.565 - 0.164] -0.0698***	[-0.472 - 0.343] -0.0683***	[-0.405 - 0.401] -0.0422***
	(638.9)	(808.6)	(877.0)	(0.0143)	(0.0154)	(0.0165)	(0.0141)	(0.0139)	(0.0137)
FROI Injury Part of Body Code 66:No Physical Injury	[-3,089 - 584.8] -10,158***	[-4,354 - 1,184] -10,888***	[-3,003 - 434.9] -10,195***	[-0.0922 - 0.0362] -0.155***	[-0.0663 - 0.00597] -0.118***	[-0.0462 - 0.0184] -0.100***	[-0.0973 - 0.0422] -0.190***	[-0.0955 - 0.0411] -0.187***	[-0.0691 - 0.0154] -0.160***
	(693.3)	(801.6)	(911.2)	(0.0135)	(0.0144)	(0.0154)	(0.0132)	(0.0130)	(0.0129)
FROI Injury Part of Body Code 90:Multiple Body Parts	[-11,517 - 8,799] 842.6*	[-12,459 - 9,317] -846.7	[-11,981 - 8,409] -957.4	[-0.181 - 0.128] 0.00572	[-0.146 - 0.0894] -0.00677	[-0.130 - 0.0699] -0.00113	[-0.216 - 0.164] 0.00790	[-0.212 - 0.161] -0.00766	[-0.186 - 0.135] 0.00319
	(468.9)	(595.2)	(656.9)	(0.0105)	(0.0114)	(0.0122)	(0.0104)	(0.0105)	(0.0102)
FROI Injury Part of Body Code 91:Body Systems and Multiple Body Systems	[-76.41 - 1,762] -8,606***	[-2,013 - 319.7] -9,480***	[-2,245 - 330.2] -8,801***	[-0.0148 - 0.0262] -0.152***	[-0.0291 - 0.0155] -0.118***	[-0.0250 - 0.0227] -0.103***	[-0.0124 - 0.0282] -0.178***	[-0.0282 - 0.0129] -0.181***	[-0.0168 - 0.0231] -0.150***
	(680.9)	(830.1)	(954.7)	(0.0145)	(0.0156)	(0.0166)	(0.0140)	(0.0139)	(0.0139)

FROI Injury Part of Body Code 99:Whole Body	[-9,941 -- 7,272] -7,596***	[-11,107 -- 7,853] -9,749***	[-10,673 -- -6,930] -8,153***	[-0.181 -- 0.124] -0.123***	[-0.148 -- 0.0869] -0.0846**	[-0.136 -- 0.0704] -0.0585	[-0.205 -- 0.150] -0.146***	[-0.208 -- 0.154] -0.161***	[-0.178 -- 0.123] -0.134***
	(1,793)	(2,393)	(2,432)	(0.0390)	(0.0389)	(0.0415)	(0.0348)	(0.0346)	(0.0344)
	[-11,110 -- -4,081]	[-14,439 -- 5,059]	[-12,921 -- -3,386]	[-0.200 -- 0.0468]	[-0.161 -- 0.00829]	[-0.140 -- 0.0227]	[-0.214 -- 0.0778]	[-0.229 -- 0.0930]	[-0.202 -- 0.0670]
Observations	327,610	327,611	304,260	327,610	327,644	304,293	327,610	327,644	304,293
R-squared	0.181	0.130	0.106	0.152	0.122	0.098	0.117	0.099	0.087

Robust standard errors in brackets

*** p<0.01, ** p<0.05, * p<0.1

Table B.7: Regression Coefficients for Firm Characteristics

VARIABLES	Relative Earnings			Relative Employment			Relative At-Injury Employment		
	First Post-Injury Year	Second Post-Injury Year	Third Post-Injury Year	Fourth Post-Injury Quarter	Eighth Post-Injury Quarter	Twelfth Post-Injury Quarter	Fourth Post-Injury Quarter	Eighth Post-Injury Quarter	Twelfth Post-Injury Quarter
Firm Size									
Excluded Group = 1-10 Employees									
Firm Size 11-50 Employees	488.8 (389.7)	-27.98 (430.6)	-238.3 (474.5)	0.0241*** (0.00910)	0.0197** (0.00969)	0.0162 (0.0107)	0.0312*** (0.00939)	0.0188** (0.00950)	0.0194* (0.0100)
	[-274.9 - 1,253]	[-871.9 - 815.9]	[-1,168 - 691.8]	[0.00626 - 0.0419]	[0.000691 - 0.0387]	[-0.00471 - 0.0372]	[0.0128 - 0.0496]	[0.000140 - 0.0374]	[-0.000268 - 0.0391]
Firm Size 51-100 Employees	976.8**	370.0	168.2	0.0518***	0.0414***	0.0355***	0.0592***	0.0380***	0.0372***
	(401.6)	(446.6)	(489.8)	(0.00940)	(0.00999)	(0.0110)	(0.00968)	(0.00974)	(0.0102)
	[189.6 - 1,764]	[-505.3 - 1,245]	[-791.7 - 1,128]	[0.0333 - 0.0702]	[0.0218 - 0.0610]	[0.0139 - 0.0570]	[0.0402 - 0.0782]	[0.0189 - 0.0571]	[0.0172 - 0.0573]
Firm Size 101-500 Employees	1,085***	270.0	-34.43	0.0646***	0.0521***	0.0429***	0.0814***	0.0547***	0.0485***
	(380.7)	(418.4)	(457.4)	(0.00879)	(0.00936)	(0.0103)	(0.00907)	(0.00917)	(0.00970)
	[338.5 - 1,831]	[-550.0 - 1,090]	[-930.9 - 862.1]	[0.0474 - 0.0818]	[0.0338 - 0.0705]	[0.0227 - 0.0631]	[0.0636 - 0.0991]	[0.0368 - 0.0727]	[0.0295 - 0.0676]
Firm Size 501-1000 Employees	1,357***	581.3	145.6	0.0776***	0.0587***	0.0525***	0.0956***	0.0642***	0.0597***
	(391.0)	(432.8)	(475.0)	(0.00901)	(0.00959)	(0.0106)	(0.00928)	(0.00939)	(0.00991)
	[591.0 - 2,124]	[-267.0 - 1,430]	[-785.4 - 1,077]	[0.0599 - 0.0952]	[0.0399 - 0.0775]	[0.0318 - 0.0732]	[0.0774 - 0.114]	[0.0458 - 0.0826]	[0.0403 - 0.0791]
Firm Size 1001-5000 Employees	-452.4	-1,078**	-1,604***	0.0610***	0.0417***	0.0277***	0.0943***	0.0678***	0.0588***
	(382.2)	(421.8)	(461.9)	(0.00880)	(0.00937)	(0.0103)	(0.00908)	(0.00920)	(0.00973)
	[-1,202 - 296.8]	[-1,905 - 251.5]	[-2,509 - 698.9]	[0.0437 - 0.0782]	[0.0233 - 0.0600]	[0.00746 - 0.0479]	[0.0765 - 0.112]	[0.0497 - 0.0858]	[0.0398 - 0.0779]
Firm Size 5001+ Employees	3,057***	2,502***	1,624***	0.114***	0.0915***	0.0685***	0.157***	0.133***	0.120***
	(382.2)	(424.8)	(467.8)	(0.00882)	(0.00939)	(0.0103)	(0.00909)	(0.00922)	(0.00975)
	[2,307 - 3,806]	[1,669 - 3,334]	[707.2 - 2,541]	[0.0968 - 0.131]	[0.0731 - 0.110]	[0.0482 - 0.0888]	[0.139 - 0.175]	[0.115 - 0.151]	[0.101 - 0.139]
At-Injury Industry									

Excluded Group = Other Industries

Manufacturing	-443.9*** (171.7) [-780.5 - - 107.4]	-641.6*** (206.7) [-1,047 - - 236.4]	-402.9* (238.6) [-870.6 - 64.80]	-0.0277*** (0.00362) [-0.0348 - - 0.0206]	-0.0359*** (0.00386) [-0.0435 - - 0.0283]	-0.0269*** (0.00418) [-0.0351 - - 0.0187]	-0.0240*** (0.00369) [-0.0312 - - 0.0168]	-0.0324*** (0.00374) [-0.0397 - - 0.0251]	-0.0298*** (0.00384) [-0.0373 - - 0.0223]
Transportation/Warehousing	-2,395*** (198.3) [-2,784 - - 2,007]	1,112*** (250.5) [620.7 - 1,603]	1,978*** (282.9) [1,424 - 2,533]	-0.00361 (0.00473) [-0.0129 - 0.00565]	0.0179*** (0.00502) [0.00807 - 0.0277]	0.0189*** (0.00546) [0.00820 - 0.0296]	0.00778 (0.00475) [-0.00154 - 0.0171]	0.0239*** (0.00477) [0.0146 - 0.0333]	0.0275*** (0.00491) [0.0179 - 0.0371]
Health Care	-401.0** (180.4) [-754.6 - - 47.31]	86.25 (226.9) [-358.5 - 531.0]	418.1 (258.3) [-88.03 - 924.3]	-0.00860** (0.00396) [-0.0164 - - 0.000827]	-0.0140*** (0.00421) [-0.0222 - - 0.00570]	-0.00313 (0.00462) [-0.0122 - 0.00592]	-0.0130*** (0.00410) [-0.0210 - - 0.00492]	-0.0167*** (0.00416) [-0.0248 - - 0.00854]	-0.0115*** (0.00429) [-0.0199 - - 0.00306]
Public Administration	3,436*** (230.7) [2,984 - 3,888]	2,118*** (287.7) [1,554 - 2,682]	1,144*** (327.9) [501.7 - 1,787]	0.0137*** (0.00346) [0.00691 - 0.0205]	-0.00130 (0.00378) [-0.00870 - 0.00609]	-0.00611 (0.00413) [-0.0142 - 0.00198]	0.0447*** (0.00358) [0.0377 - 0.0517]	0.0560*** (0.00384) [0.0485 - 0.0635]	0.0630*** (0.00407) [0.0550 - 0.0710]
Administrative/Support	809.8*** (186.3) [444.7 - 1,175]	2,206*** (226.2) [1,763 - 2,650]	3,183*** (263.0) [2,667 - 3,698]	0.0126*** (0.00486) [0.00311 - 0.0221]	0.0493*** (0.00510) [0.0393 - 0.0593]	0.0733*** (0.00550) [0.0625 - 0.0841]	-0.0111** (0.00471) [-0.0203 - - 0.00185]	0.0176*** (0.00453) [0.00872 - 0.0265]	0.0369*** (0.00449) [0.0281 - 0.0457]
Agriculture	1,413*** (269.2) [885.9 - 1,941]	1,678*** (289.3) [1,111 - 2,245]	1,944*** (309.8) [1,336 - 2,551]	0.00434 (0.00708) [-0.00954 - 0.0182]	0.0179** (0.00752) [0.00317 - 0.0326]	0.0324*** (0.00823) [0.0163 - 0.0486]	0.00345 (0.00707) [-0.0104 - 0.0173]	-0.00570 (0.00704) [-0.0195 - 0.00809]	-2.18e-05 (0.00729) [-0.0143 - 0.0143]
Retail	-1,025*** (157.5) [-1,334 - - 716.5]	-1,029*** (192.4) [-1,406 - - 652.1]	-875.6*** (220.1) [-1,307 - - 444.2]	-0.0334*** (0.00375) [-0.0407 - - 0.0261]	-0.0470*** (0.00397) [-0.0547 - - 0.0392]	-0.0535*** (0.00431) [-0.0619 - - 0.0450]	-0.0313*** (0.00379) [-0.0387 - - 0.0238]	-0.0441*** (0.00381) [-0.0516 - - 0.0366]	-0.0538*** (0.00389) [-0.0614 - - 0.0462]
Accommodations/Food Services	657.3*** (170.9) [322.3 - 992.3]	1,001*** (209.9) [589.9 - 1,413]	1,012*** (250.0) [521.8 - 1,502]	-0.00719 (0.00525) [-0.0175 - 0.00310]	-0.0115** (0.00552) [-0.0223 - - 0.000704]	-0.0133** (0.00599) [-0.0250 - - 0.00155]	-0.0245*** (0.00526) [-0.0349 - - 0.0142]	-0.0337*** (0.00516) [-0.0438 - - 0.0235]	-0.0399*** (0.00523) [-0.0502 - - 0.0297]
Construction	-4,658*** (252.5)	-3,150*** (301.8)	-2,626*** (341.8)	-0.0551*** (0.00528)	-0.0365*** (0.00563)	-0.0297*** (0.00607)	-0.0444*** (0.00533)	-0.0256*** (0.00526)	-0.0246*** (0.00531)

Education	[-5,153 -- 4,163] 7,094***	[-3,742 -- 2,559] 5,233***	[-3,296 -- 1,956] 4,531***	[-0.0654 -- 0.0447] 0.0996***	[-0.0475 -- 0.0255] 0.0538***	[-0.0416 -- 0.0178] 0.0387***	[-0.0549 -- 0.0340] 0.0944***	[-0.0359 -- 0.0153] 0.0700***	[-0.0350 -- 0.0142] 0.0705***
	(183.8)	(234.4)	(271.7)	(0.00387)	(0.00431)	(0.00473)	(0.00400)	(0.00438)	(0.00467)
	[6,734 - 7,455] -795.4***	[4,774 - 5,693] -1,187***	[3,999 - 5,064] -1,196***	[0.0920 - 0.107] -0.0362***	[0.0454 - 0.0623] -0.0337***	[0.0294 - 0.0479] -0.0329***	[0.0866 - 0.102] -0.0326***	[0.0614 - 0.0786] -0.0406***	[0.0614 - 0.0797] -0.0446***
Wholesale	(220.8)	(275.2)	(316.3)	(0.00501)	(0.00534)	(0.00580)	(0.00517)	(0.00519)	(0.00536)
	[-1,228 -- 362.6]	[-1,727 -- 648.1]	[-1,816 -- 575.8]	[-0.0460 -- 0.0264]	[-0.0442 -- 0.0233]	[-0.0443 -- 0.0215]	[-0.0427 -- 0.0224]	[-0.0508 -- 0.0305]	[-0.0551 -- 0.0341]
	Firm Annual Employment Growth Excluded Group = Below -30%								
Firm Annual Growth Rate (- 30% to -10%)	-1,676***	-1,660***	-1,738***	-0.0488***	-0.0486***	-0.0584***	-0.0420***	-0.0389***	-0.0413***
	(324.8)	(377.2)	(417.7)	(0.00785)	(0.00825)	(0.00872)	(0.00762)	(0.00736)	(0.00717)
	[-2,312 -- 1,039] -2,572***	[-2,400 -- 921.1] -2,904***	[-2,556 -- 919.0] -3,371***	[-0.0641 -- 0.0334] -0.0574***	[-0.0648 -- 0.0324] -0.0710***	[-0.0755 -- 0.0413] -0.0930***	[-0.0570 -- 0.0271] -0.0439***	[-0.0533 -- 0.0244] -0.0479***	[-0.0554 -- 0.0273] -0.0543***
Firm Annual Growth Rate (- 10% to -0.5%)	(318.7)	(370.2)	(411.2)	(0.00761)	(0.00802)	(0.00848)	(0.00739)	(0.00716)	(0.00697)
	[-3,196 -- 1,947] -2,208***	[-3,630 -- 2,178] -2,646***	[-4,177 -- 2,565] -3,433***	[-0.0723 -- 0.0425] -0.0590***	[-0.0867 -- 0.0553] -0.0669***	[-0.110 -- 0.0764] -0.0939***	[-0.0584 -- 0.0294] -0.0444***	[-0.0619 -- 0.0338] -0.0429***	[-0.0679 -- 0.0406] -0.0525***
	(353.6)	(414.1)	(462.5)	(0.00830)	(0.00879)	(0.00932)	(0.00815)	(0.00802)	(0.00795)
Firm Annual Growth Rate (0.5% to 10%)	[-2,901 -- 1,515] -2,647***	[-3,458 -- 1,834] -3,077***	[-4,340 -- 2,527] -3,712***	[-0.0753 -- 0.0428] -0.0704***	[-0.0841 -- 0.0497] -0.0815***	[-0.112 -- 0.0757] -0.105***	[-0.0604 -- 0.0284] -0.0514***	[-0.0587 -- 0.0272] -0.0517***	[-0.0681 -- 0.0369] -0.0588***
	(321.1)	(372.6)	(414.7)	(0.00766)	(0.00807)	(0.00853)	(0.00744)	(0.00721)	(0.00703)
	[-3,277 -- 2,018] -3,252***	[-3,807 -- 2,346] -3,252***	[-4,525 -- 2,899] -3,650***	[-0.0854 -- 0.0553] -4,127***	[-0.0973 -- 0.0657] -0.0679***	[-0.122 -- 0.0885] -0.0749***	[-0.0659 -- 0.0368] -0.0947***	[-0.0658 -- 0.0376] -0.0535***	[-0.0726 -- 0.0450] -0.0489***
Firm Annual Growth Rate (10% to 30%)	(335.2)	(386.5)	(427.7)	(0.00791)	(0.00832)	(0.00881)	(0.00770)	(0.00745)	(0.00728)
	[-3,909 -- 2,595] -2,706***	[-4,408 -- 2,893] -2,087***	[-4,966 -- 3,289] -2,164***	[-0.0833 -- 0.0524] -0.0374***	[-0.0913 -- 0.0586] -0.0229***	[-0.112 -- 0.0775] -0.0326***	[-0.0686 -- 0.0384] -0.0317***	[-0.0636 -- 0.0343] -0.0121	[-0.0682 -- 0.0396] -0.00997
	(355.0)	(411.8)	(460.1)	(0.00843)	(0.00886)	(0.00941)	(0.00817)	(0.00786)	(0.00769)
Firm Annual Growth Rate (30%+)									

	[-3,401 -- 2,010]	[-2,895 -- 1,280]	[-3,066 -- 1,262]	[-0.0539 -- 0.0209]	[-0.0402 -- 0.00552]	[-0.0511 -- 0.0142]	[-0.0478 -- 0.0157]	[-0.0275 -- 0.00325]	[-0.0250 -- 0.00509]
Firm Separation Rate Excluded Category: Separation Rate below 4.4%									
Firm Separation Rate Quartile 2 (4.4% to 8.1%)	-938.4*** (148.4)	-330.0* (183.0)	-210.5 (212.9)	-0.00731*** (0.00271)	0.000358 (0.00294)	0.00427 (0.00323)	-0.0181*** (0.00281)	-0.0225*** (0.00299)	-0.0275*** (0.00319)
	[-1,229 -- 647.6]	[-688.6 -- 28.70]	[-627.9 -- 206.9]	[-0.0126 -- 0.00200]	[-0.00540 -- 0.00612]	[-0.00207 -- 0.0106]	[-0.0236 -- 0.0126]	[-0.0283 -- 0.0166]	[-0.0337 -- 0.0212]
Firm Separation Rate Quartile 3 (8.1% to 14.1%)	-1,060*** (154.2)	-366.4* (193.3)	-59.65 (222.9)	-0.0178*** (0.00314)	-0.000474 (0.00338)	0.00629* (0.00371)	-0.0352*** (0.00324)	-0.0302*** (0.00338)	-0.0299*** (0.00355)
	[-1,362 -- 757.4]	[-745.2 -- 12.44]	[-496.5 -- 377.2]	[-0.0240 -- 0.0117]	[-0.00711 -- 0.00616]	[-0.000984 -- 0.0136]	[-0.0416 -- 0.0289]	[-0.0368 -- 0.0235]	[-0.0368 -- 0.0229]
Firm Separation Rate Quartile 4 (14.1%+)	-460.9*** (173.4)	1,134*** (214.2)	1,661*** (244.2)	0.00922** (0.00375)	0.0429*** (0.00402)	0.0556*** (0.00439)	-0.0289*** (0.00384)	-0.00432 (0.00393)	0.00966** (0.00408)
	[-800.7 -- 121.0]	[714.4 -- 1,554]	[1,182 -- 2,139]	[0.00187 -- 0.0166]	[0.0351 -- 0.0508]	[0.0470 -- 0.0642]	[-0.0364 -- 0.0213]	[-0.0120 -- 0.00338]	[0.00166 -- 0.0177]
Observations			327,610	327,611	304,260	327,610	327,644	304,293	327,610
R-squared			0.181	0.130	0.106	0.152	0.122	0.098	0.117

Impact of Economic Conditions on Losses

Our regression estimates show that there was a substantial decrease in relative earnings for disabled workers who were injured during and after the great recession, even after including a rich set of control variables measuring characteristics of the worker, the at-injury job, and the nature and severity of the injury. To evaluate the impact of economic conditions more directly, we modified the regression model used for case-mix adjustment by replacing time effects with measures of economic conditions at the time of injury:

$$y_{ijqt}^I - y_{ijqt}^C = f(E_{t-04}^{I, \text{pre-injury}}, \beta^E) + EP^{\text{state}} \beta^{\text{state}} + \% \Delta_{t-04} EP^{\text{industry}} \beta^{\text{ind}} + X_i^D \beta^D + X_i^I \beta^I + X_{jq}^F \beta^F + \mu_q + \varepsilon_{ijqt}$$

where

EP^{state} is the statewide employment-population ratio for 18-64 year-olds in the quarter of injury. A 1-unit change corresponds to a 1 percentage point increase in the number of jobs per adult in California.⁷³

$\% \Delta_{t-04} EP^{\text{industry}}$ is the percentage change relative to 2004 in the employment-population ratio for the industry of the at-injury firm, where the 2004 baseline is from the same calendar quarter as the quarter of injury to control for seasonality in industry-specific employment. A 1-unit change corresponds to a 1% increase over 2004 in industry employment relative to the statewide adult population. Scaling $\% \Delta_{t-04} EP^{\text{industry}}$ as an index where the 2004 level is equal to 100 for all industries allows us to compare changes in employment across industries of dramatically different sizes while normalizing for population growth.

EP^{state} captures the overall condition of the statewide labor market in the quarter of injury, while $\% \Delta_{t-04} EP^{\text{industry}}$ captures the level of labor demand in the at-injury industry in the quarter of injury. The regression model controls for all other case-mix adjusters described above, including the firm-level rate of year-on-year employment growth at the time of injury and the turnover rate. Because these two time-varying firm characteristics directly control for changes in labor demand and the probability of job separation at the at-injury employer, EP^{state} and $\% \Delta_{t-04} EP^{\text{industry}}$ should be interpreted as reflecting the impact of broader economic conditions on outcomes for disabled workers independently of hiring and firing at the at-injury employer. Among other things, $\% \Delta_{t-04} EP^{\text{industry}}$ may capture labor demand at other firms in the same industry, while EP^{state} may capture labor demand in different industries.

Table B.8 reports the regression coefficients for EP^{state} and $\% \Delta_{t-04} EP^{\text{industry}}$ in regressions for earnings and employment outcomes at 1, 2 and 3 years post-injury. (All other worker, injury, and firm characteristics, including the time-varying firm characteristics, have very similar effects on injured worker outcomes to the coefficients presented above in Tables B.5 to B.7.) Post-injury annual earnings for injured workers are significantly higher when the statewide employment-to-population ratio is higher, implying that a 1 percentage point decrease in employment-to-

⁷³ We used total UI-covered employment from the BLS QCEW as the nominator for our employment-to-population ratio and Census Bureau population estimates of the 18-64 year-old population as our denominator. While changes in the age structure of employment above age 64 could generate spurious variation in this measure, we believe that this employment-to-population ratio is adequate as a rough proxy for economic conditions.

population predicts a decrease of \$230 in annual earnings in the second post-injury year. To place this in context, we may note that, between 2005 and 2012, the statewide employment-to-population ratio peaked in at 68.1% in 2006-2007 and reached a trough of 60.6% in 2011, leading to a predicted \$1,728 reduction in injured worker earnings in the second post-injury year. However, the impact of overall economic conditions on post-injury earnings declines in magnitude over the first three post-injury years, and the same pattern is apparent with the impact on injured worker employment (which shrinks and becomes statistically insignificantly different from zero by the third post-injury year).

The impact of industry-specific employment-to-population on earnings loss is much less pronounced and is essentially zero after the first post-injury year.⁷⁴ It is notable that injured worker employment becomes significantly associated with industry-specific employment-to-population in the second and third post-injury years (on the time scale when the impact of statewide employment is decaying), but the magnitude of this effect appears to be much smaller than the effect of statewide employment.

There is a fundamental limitation inherent in this modeling approach, which is that we can estimate the impact of statewide economic conditions on earnings and employment losses only under the assumption that other time-varying factors do not affect earnings and employment losses. Even though we control for a rich set of other variables, this assumption is likely too strong to be realistic. In particular, these results do not substantiate the conclusion that changes in economic conditions *caused* the dramatic increases in earnings losses observed following the great recession unless we are willing to assume that no other time-varying factors influenced outcomes for disabled workers. What we do learn from this model, and from the estimates of relative earnings presented in Figure 4.9 is the extent to which the case-mix adjusted time profile of earnings loss during the 2005-2012 period could be predicted purely using injury characteristics and economic conditions. Unsurprisingly, the model using economic conditions captures the drop in relative earnings associated with the great recession as well as the slow recovery.

⁷⁴ The change in the average level across industries of $\% \Delta_{t-04} EP^{\text{industry}}$ between the peak and the trough of the business cycle is about 9.2 percentage points, and the range between the 10th and 90th percentile in any year varies between roughly 5 and 10 percentage points.

Table B.8
Effect of Statewide and Industry Employment/Population Ratios on Earnings Losses

	Annual Earnings: Difference from Control Workers			Employment: Difference from Control Workers			At-Injury Employment: Difference from Control Workers		
	First post-injury year	Second Post-injury Year	Third Post-Injury Year	End of first post-injury year (QOI+4)	End of second post-injury year (QOI+8)	End of third post-injury year (QOI+12)	End of first post-injury year (QOI+4)	End of second post-injury year (QOI+8)	End of third post-injury year (QOI+12)
Statewide Employment/Population Ratio	271.4*** (13.54) [244.9 - 298.0]	230.4*** (16.83) [197.4 - 263.3]	154.5*** (19.26) [116.8 - 192.3]	0.00593*** (0.000306) [0.00533 - 0.00653]	0.00378*** (0.000326) [0.00314 - 0.00442]	0.000564 (0.000357) [-0.000135 - 0.00126]	0.00813*** (0.000309) [0.00752 - 0.00873]	0.00862*** (0.000312) [0.00801 - 0.00923]	0.00826*** (0.000322) [0.00763 - 0.00889]
% Change from 2004 in At-Injury Industry Employment/Population Ratio	-45.02*** (7.618) [-59.95 - -30.09]	-15.91* (9.034) [-33.62 - 1.792]	-1.503 (10.58) [-22.25 - 19.24]	0.000163 (0.000187) [-0.000205 - 0.000530]	0.000499** (0.000198) [0.000111 - 0.000888]	0.000696*** (0.000226) [0.000253 - 0.00114]	-0.000365* (0.000188) [-0.000735 - 3.92e-06]	-0.000466** (0.000181) [-0.000821 - 0.000111]	-0.000298 (0.000187) [-0.000664 - 6.75e-05]
Observations	327,520	327,521	304,177	327,520	327,554	304,210	327,520	327,554	304,210
R-squared	0.178	0.126	0.104	0.149	0.119	0.096	0.115	0.097	0.086
Outcome variables in regressions are differences between injured worker and control worker outcomes at selected post-injury time horizons: positive coefficients mean that higher values of the explanatory variables predict better outcomes for injured workers relative to controls. Regression models do not include time effects. Regression specifications are otherwise identical to those used for Tables B.5-B.7. Control variables not reported include pre-injury annual earnings (50 categories), gender, age, at-injury firm size, at-injury firm growth rate, at-injury firm separation rate, industry fixed effects, deciles of temporary disability duration, number of permanent impairments, and body part of injury.									

While it is impossible to test the assumption that time-varying factors other than economic conditions caused the decline in relative earnings observed between 2005-2012, we can perform a statistical test to compare the fit of the case-mix adjusted model with flexible time effects to the model that controls for statewide economic conditions. Specifically, we used the P-test for non-nested regression models described in Davidson and MacKinnon (1993). This is a test of the null hypothesis that one model is the true model against the alternative hypothesis that a competing, non-nested model is true.⁷⁵ We perform the test twice, once to test the model with time effects and once to test the model with employment rates. The model with employment rates is strongly rejected ($p < 0.001$), but the model with time effects is only marginally rejected ($p = 0.075$), indicating that employment rates fail to capture information about earnings losses that is not absorbed in the time effects. Time effects are perfectly collinear with statewide employment rates, so this is not surprising since the model with time effects is more flexible.

Alternative Specification To examine the robustness of our estimates to functional form, we also estimated all regression models using an alternative specification in which the dependent variable is the level of the injured worker's post-injury outcome (earnings, employment, or at-injury employment). Instead of using the difference between injured worker and control worker outcomes as the dependent variable (as in our main model), this model includes the control worker's post-injury outcomes and the injured worker's pre-injury outcomes as explanatory variables. This specification, which is similar to the models used in earlier RAND studies, has the slight disadvantage that the model has to explain idiosyncratic variation in the level of the injured worker's outcome rather than differencing out this variation. However, inclusion of the matched control outcome as an explanatory variable means that this difference may be small in practice.

$$y_{ijqt}^I = f(E^{I, \text{pre-injury}}, \beta^E) + f(y_{ijqt}^C, \beta^C) + X_i^D \beta^D + X_i^I \beta^I + X_{jq}^F \beta^F + \mu_q + \varepsilon_{ijqt}$$

Estimates of the impact of case-mix adjusters on injured worker earnings were very similar to those obtained from our preferred (differenced) model and are not reported here.

Specification for Proportional Losses Neither our preferred specification nor the alternative model is well-suited to estimating relative earnings or relative employment. The problem is that these models do not explicitly model control worker outcomes, which are the denominator of relative earnings. Previous RAND studies have fixed control worker outcomes at overall sample averages. It is highly likely that control worker outcomes vary systematically with characteristics of interest, meaning that relative outcomes estimated using a sample average may be biased. As discussed above, it is not feasible to calculate relative earnings prior to taking averages or fitting regression models because injured workers whose controls have zeroes or very low values for the outcomes lead to outliers and missing data when relative outcomes are calculated at the individual level. We therefore sought to find a middle ground between using the same denominator for all workers in a quarter of injury and modeling individual-level relative earnings.

⁷⁵ The test can be implemented by including the fitted value from the competing model in the model assumed under the null and conducting a t-test on the coefficient for the fitted value.

To generate the figures illustrating relative outcomes in the report, we used a third regression specification that estimates separate linear regression models for injured worker and control worker outcomes.

$$y_{ijqt}^I = f(E^{I,\text{pre-injury}}, \beta^E) + X_i^D \beta^D + X_i^I \beta^I + X_{jq}^F \beta^F + \mu_q + \varepsilon_{ijqt}^I$$

$$y_{ijqt}^C = f(E^{I,\text{pre-injury}}, \gamma^E) + X_i^D \gamma^D + X_i^I \gamma^I + X_{jq}^F \gamma^F + \nu_q + \varepsilon_{ijqt}^C$$

These models allow us to calculate predicted values for both control and injured worker outcomes for all individuals in our population. We then take the ratio of these predicted values as our measure of relative outcomes. This captures systematic variation in both injured and control worker outcomes that is correlated with our explanatory variables of interest while aggregating the data sufficiently to avoid the problems caused by infinitesimal or zero outcomes for the control workers. It also has the benefit of allowing us to distinguish the roles of injured worker and control worker outcomes in our estimates of the impact of injury. That said, the regression models used to estimate relative outcomes have the drawback that they do not fully exploit the availability of matched controls since injured workers are not explicitly paired with their control workers except for purposes of statistical inference.

To calculate regression-adjusted effects of an explanatory variable of interest, we fixed all other covariates at their sample averages and then varied the variable of interest to calculate predicted injured and control worker earnings as a function of the variable of interest. Calculating predicted values for the control workers solves the problems of outliers and missing data by effectively averaging out zeroes and small positive values.⁷⁶ For example, to calculate the regression-adjusted time trends in Figure 4.4 we constructed the fitted values

$$\hat{y}^I(q) = f(\overline{E^{I,\text{pre-injury}}}, \hat{\beta}^E) + \bar{X}_i^D \hat{\beta}^D + \bar{X}_i^I \hat{\beta}^I + \bar{X}_{jq}^F \hat{\beta}^F + \mu_q$$

$$\hat{y}^C(q) = f(\overline{E^{I,\text{pre-injury}}}, \hat{\gamma}^E) + \bar{X}_i^D \hat{\gamma}^D + \bar{X}_i^I \hat{\gamma}^I + \bar{X}_{jq}^F \hat{\gamma}^F + \nu_q$$

We then define regression-adjusted relative earnings in quarter q as

$$\text{Regression-Adjusted Relative Earnings for Quarter } q = \frac{\hat{y}^I(q)}{\hat{y}^C(q)}$$

For Figure 4.9, we use the same approach to calculate predicted values for the model that uses employment-to-population ratios in place of time effects, fixing all other variables at sample averages while varying the economic conditions variables. Because the industry-specific employment-to-population measure $\% \Delta_{t-04} EP^{\text{industry}}$ varies across observations at a point in time, we use the actual distribution of at-injury industry in each quarter to construct a weighted average of $\% \Delta_{t-04} EP^{\text{industry}}$. Standard errors are calculated using the delta method to account for sampling uncertainty in our estimates of the variable of interest. We ignore sampling uncertainty in the other regression parameters because we are only using these estimates to determine the appropriate level of the response function of y with respect to the variable of interest. This could

⁷⁶ Although our use of linear models for binary outcomes could potentially create problems with predicted probabilities below zero or greater than 100%, this is less of a concern for our purposes because we are interested in predictions near the sample average. In practice, our predicted probabilities were all reasonable and well-behaved.

be calculated just as easily using the overall sample average of y , which has infinitesimal standard errors because our sample is very large. The separate regression models here are estimated as seemingly unrelated regressions so that the residual correlation between outcomes for injured workers and their matched controls (formally, the error terms ε_{ijqt}^I and ε_{ijqt}^C) is accounted for. This correlation is fairly strong (e.g., $\rho = 0.18$ for earnings in the second post-injury year) because our sample is matched.

The drawback of using separate regression models to estimate the effects of covariates on injured and control worker earnings is that this specification does not make efficient use of our matched sample: injured workers are not explicitly compared to their matched controls at the individual level. We therefore view the differenced regression specification as the most accurate estimate of the impact of covariates on outcomes. It is reported in this appendix so that readers can confirm that the estimated impacts of covariates are qualitatively very similar across models.

The fact that the differenced model and the model estimated in levels yield similar results should not be viewed as evidence that the selection of matched controls is not methodologically important. It might, in fact, be argued that the stability of our estimates across very different models is evidence for the success of the matching procedure in eliminating bias due to unobservable heterogeneity (Ho, Imai et al. 2007).

Methods for Decomposition of Changes in Average Outcomes

To quantify the contribution of compositional changes to the overall change in outcomes associated with the great recession, we estimate Oaxaca-Blinder decompositions for the change in proportional earnings loss between the pre-recession period and the post-recession period. We use a modified version of individual-level relative earnings as the outcome variable, in which post-injury control wages are averaged over fifty cells of pre-injury earnings in each quarter of injury. The averaging ensures that the denominator of relative earnings is positive and not excessively small for all injured workers. Construction of this modified individual-level variable allows us to focus on a single outcome for the Oaxaca-Blinder decomposition here.

To assess robustness, we also estimate a DeNardo-Fortin-Lemeiux median decomposition for relative earnings. Finally, we estimate a Oaxaca-Blinder decomposition for the difference between (binary) injured worker employment and average control worker employment, which can be modeled as a continuous (if bunched and highly non-normal) variable. The median decomposition and the decomposition of employment should not be affected by outliers in relative earnings, which may still be a concern even though we average control worker wages before calculating relative earnings. Table 4.6 in the text presents results comparing outcomes after the start of the recession (2008-2012) to pre-recession (2005-2007) outcomes. Table B.5 reports similar calculations that omit the recession years from the sample, comparing 2010-2012 to 2005-2007. The estimated contribution of compositional effects is slightly smaller, by 4 percentage points for average earnings loss, 2 percentage points for the median, and 1 percentage point for the reduction in employment. All our decompositions use pre-recession coefficients to calculate the impact of changes in endowment.

Table B.9
Decomposition Results, 2010-2012 vs 2005-2007

Fraction of Average Change Explained by...	Average % earnings loss	Median % earnings loss	Reduction in Employment
Recession	59%	63%	54%
Compositional Effects	41%	37%	46%

Table B.10
Detailed Decomposition Results for Change in Average Earnings and Employment, 2008-2012 vs 2005-2007

Group of Variables	Relative Earnings	Relative Employment
Injury Severity	-1.33% (0.12%)	-0.91% (0.08%)
Pre-Injury Wage	-0.82% (0.05%)	-0.56% (0.03%)
Separation Rate	-0.77% (0.08%)	-0.54% (0.03%)
Age at Injury	-0.58% (0.03%)	-0.37% (0.04%)
Firm Size	-0.40% (0.05%)	-0.26% (0.04%)
	0.24%	-0.15%
Industry	(0.09%)	(0.02%)
Growth Rate	0.49% (0.04%)	0.20% (0.05%)
Job Tenure	0.57% (0.09%)	0.42% (0.06%)

Table reports detailed Oaxaca-Blinder decomposition results for second-year relative earnings and employment 8 quarters post-injury. Standard errors in parentheses.

Robustness of Earnings Loss Trends to Outliers and Differential Non-Reporting of Injuries

Effect of Outliers on Earnings Loss Estimates

Our main results primarily rely on estimates of average earnings and wage loss. Averages can be very sensitive to outliers, and so we defined a maximum level of quarterly earnings as a criterion for inclusion in our analysis sample. Our main estimates treat workers with quarterly earnings in any quarter of their wage histories above \$250,000 (so annual earnings above \$1 million) as outliers. This threshold leads to exclusion of 189 otherwise eligible individuals (0.05% of the sample). The outlier screen should eliminate implausibly large wages that are likely to reflect typographical errors, but it should also remove extremely high-wage individuals (e.g., professional athletes and some entertainers are covered by WC) whose wages are recorded accurately. Exclusion of such high-wage individuals is motivated purely by statistical considerations, since extreme outliers can be so influential on the average that information about the majority of workers is not discernible. If such outliers appear only occasionally, they can make estimation of trends in lost earnings much more difficult.

That said, the choice of an outlier threshold is inherently subjective, and our choice of a \$1 million annual earnings arguably leaves scope for high-wage workers to drive the trends. We therefore conducted sensitivity analyses by estimating trends in wage loss that use a lower threshold (\$100,000 quarterly earnings) and a higher threshold (\$1 million quarterly earnings). Relative to our main estimation sample, raising the outlier threshold to \$1 million per quarter adds 171 injured workers to our sample, while lowering the outlier threshold to \$100,000 per quarter removes 1,735 injured workers from the sample.

Relative earnings by period (pre-recession, recession, post-recession) under these alternative outlier criteria are presented in Table B.11 alongside our main estimates. We find that trends in quarterly earnings losses are practically identical under these alternative outlier screens. While \$400,000 annualized earnings is still a high wage (particularly relative to the population of workers' compensation claimants), the stability of our estimates makes us confident that our choice of outlier screens did not drive our main results. A non-trivial number of workers (just over 0.5% of the otherwise eligible sample) are removed by our stricter outlier screen, and we are concerned that lower thresholds would begin to undermine the representativeness of our data.

Table B.11
Sensitivity of WCIS Earnings Loss Estimates to Threshold for Earnings Outliers

Main Sample (< \$250,000 Quarterly Earnings)			
	Injury Year 2005-2007	Injury Year 2008-2009	Injury Year 2010-2012
Relative Earnings, Second Post-Injury Year	74.48%	67.12%	65.99%
Injured Worker Earnings, Second Post-Injury Year	\$21,521	\$17,940	\$18,128
Control Worker Earnings, Second Post-Injury Year	\$29,161	\$26,986	\$27,717
Loose Outlier Threshold (< \$1 Million Quarterly Earnings)			
	Injury Year 2005-2007	Injury Year 2008-2009	Injury Year 2010-2012
Relative Earnings, Second Post-Injury Year	74.44%	67.24%	66.08%
Injured Worker Earnings, Second Post-Injury Year	\$21,572	\$18,045	\$18,190
Control Worker Earnings, Second Post-Injury Year	\$29,241	\$27,101	\$27,779
Strict Outlier Threshold (< \$100,000 Quarterly Earnings)			
	Injury Year 2005-2007	Injury Year 2008-2009	Injury Year 2010-2012
Relative Earnings, Second Post-Injury Year	74.14%	66.88%	65.64%
Injured Worker Earnings, Second Post-Injury Year	\$21,237	\$17,644	\$17,830
Control Worker Earnings, Second Post-Injury Year	\$28,896	\$26,628	\$27,394

Injured workers are excluded as outliers if they have total quarterly earnings in any quarter of their wage history above the outlier threshold.

Earnings Loss Estimates Stratified by Firm Size and Industry

In light of concerns about the representativeness of our data sources for WC claims, we conducted two exercises to assess the robustness of our estimated wage loss trends to differential non-reporting of claims to the WCIS by industry and firm size.

There are two reasons to be concerned about the ability of our data to capture earnings losses at small employers. First, some analysts suspect that reporting of WC administrative data to claims databases tends to overrepresent large employers. Second, our control-worker methodology depends on the availability of co-workers who match the injured worker's pre-injury wage and job tenure, and so the probability of match failure is mechanically higher at small firms. At the limit, it is impossible to find an uninjured control worker for an injured worker at a one-person firm (many of which are covered under both UI and WC in California).

In our main analysis, we corrected for match failure using an inverse propensity score method applied in previous RAND studies.⁷⁷ Under the assumption that, among workers injured at the same-size firm with similar wages in the same quarter, match failure is uncorrelated with earnings loss, this method delivers estimates that are representative of the population of PPD claims captured in WCIS. However, if we believe that injuries at small employers are differentially underreported to WCIS, then our estimates may not be representative of the entire PPD population.

For reference, Table B.12 presents the distribution of employment by firm size in our matched EDD-WCIS data against the nationwide distribution of private-sector UI-covered employment in 2005, the first year of our analysis sample. The unweighted WCIS is clearly skewed toward larger employers, as expected given the match rates reported in Table 3.1. Weighting to account for match failure (so that the firm size distribution approximates the firm size distribution for WCIS claims with a wage history, including those with no control workers) leads to much higher shares of employment at small firms, but the smallest firms remain substantially underrepresented relative to the overall firm size distribution.

However, the overall firm size distribution may not necessarily match the distribution of firm size for at-injury employers since industrial composition and injury risk are likely to be correlated with firm size. Furthermore, the benchmark distribution of employment by firm size included in Table B.12 includes only private-sector employment. Our sample, in contrast, includes state and local government workers, primarily in the public administration sector but also many in education and health care. Nearly all employees in the public administration sector are employed by "firms" (defined by the state Tax ID number used to remit UI payroll taxes) in the largest size category. Excluding workers with at-injury employment in the public administration industry (NAICS codes 91-99) reduces the share of very large (> 1000) at-injury employers to within 4 percentage points of the private-sector average as reported by BLS. We conclude that our data may still underrepresent the smallest employers, but that much of the apparent disparity may be driven by the fact that our population of interest includes the government workers, who are typically excluded from statistics on the firm size distribution.

⁷⁷ See Bhattacharya et al. (2010) for a discussion of our previous use of this method, and see Little and Rubin (1987) for further technical details. We used the quartile of the weekly wage interacted with firm size and quarter of injury fixed effects as the covariates in the model used to predict match failure.

Table B.12
Firm Size Distribution of Employment in WCIS-EDD Data
vs. Nationwide Private Sector Distribution

	All WCIS	All WCIS	WCIS Excluding Public Administration	Private sector Nationwide Employment Distribution by Firm Size(%)
Firm Size*	Unweighted %	Weighted %	Weighted %	
1-10 Employees	1.3	2.7	3.0	11.3
11-50 Employees	7.5	15.3	17.4	18.5
50-100 Employees	6.1	9.2	10.3	8.2
101-500 Employees	19.7	17.6	19.4	17.7
501-1000 Employees	9.7	8.3	8.8	6.8
1001+ Employees	55.9	47.0	41.0	37.4

* This column lists firm size categories as defined in our DWC-EDD data. Firm size thresholds in the available Business Employment Dynamics tables have upper limits that are one worker smaller than those tabulated in our DWC-EDD databases, e.g., 1-9 employees instead of 1-10 employees.

2005 Distribution of Private-Sector Employment covered by Unemployment Insurance by Firm Size

Source: BLS Business Employment Dynamics. Available at <http://www.bls.gov/bdm/sizeclassqanda.htm>, Accessed January 9, 2016.

To assess the robustness of our estimated trends to the underrepresentation of small employers in WCIS, we estimated earnings loss trends stratified on the seven categories of firm size reported in Table 3.1 and calculated weighted average trends using the 2005 distribution of private-sector employment by firm size (as reported in Table B.12) to weight the estimates. Figure B.2 displays this time profile. Relative earnings are slightly lower than in our main estimates, reflecting larger earnings losses at the smallest firms (which are substantially upweighted in this calculation). However, the overall shape of the time profile between 2005-2012 is very similar to our main estimates. Since public employers are almost entirely concentrated in the largest firm size category (again, with "firm" defined by the state or federal Tax ID number), we view the reweighted trends as an upper bound on the share of small firms in the true PPD population and the potential impact on wage loss trends.

Figure B.2
WCIS Wage Loss Estimates Stratified on Firm Size and
Reweighted to Match Private-Sector Firm Size Distribution

Another concern that we discussed in our comparison of the WCIS to the DEU was the large discrepancy in the share of injuries in the public administration industry between the WCIS and the DEU. To assess robustness to the potential for underrepresentation of certain industries in the WCIS we calculated earnings loss estimates stratified on industry (and correcting for match failure) and reweighted according to each industry's share of statewide employment. In contrast to the estimates reweighted on firm size, we used quarterly data on employment by industry from the QCEW, which captures shifts in the employed population over the business cycle. If relative PPD injury rates across industries stayed constant across the business cycle, then trends obtained by stratifying and reweighting would give us an accurate estimate of actual trends in wage loss. However, we doubt that this is the case in light of evidence that the cyclicalities of injury rates with days away from work, restriction or transfer varies widely across industries (Asfaw, Pana-Cryan et al. 2011). Therefore, we view these estimates as a very rough robustness check to illustrate the potential impact of time-varying underreporting of injuries to the WCIS.

Table B.13 presents, for reference, definitions of the 12 industry categories used to report results in this study.

Table B.13
Definition of Industry Categories Used in Report

Industry	2007 NAICS Codes
Manufacturing	31-33
Transportation/Warehousing	48-49
Health Care	62
Public Administration	92
Administrative/Support Svc	561
Temporary Help/Professional Employer Organizations	56132, 56133
Agriculture	111, 112, 1151, 1152
Retail	44-45
Accommodations/Food Svc	72
Construction	23
Education	61
Wholesale	42
"Temporary/PEO" refers to Temporary Help Agencies and Professional Employer Organizations, a subset of Administrative/Support Services.	

Figure B.3 presents estimates of stratified-on-industry wage loss trends reweighted on quarterly industry employment shares using the industry categories defined in Table B.13. The time profile of earnings losses generally resembles our main estimates.

Figure B.3
WCIS Wage Loss Estimates Stratified on At-Injury Industry and
Reweight to Match Quarterly Statewide Employment Shares

Table B.13 compares the stratified-and-reweighted relative earnings estimates underlying Figures B.2 and B.3 to the main estimates reported in Chapter 4. Relative earnings before the recession are slightly lower in both reweighted specifications, but otherwise undergo a similar trajectory. We prefer the main estimates (which are reweighted to correct for match failure accounting for firm size and the pre-injury wage) because we do not have another external data source capable of capturing changes over time in the industry or firm size distribution of injuries.

Table B.14
Relative Earnings in Second Post-Injury Year Stratified and Reweighted by
Industry Employment Share and Private-Sector Employment by Firm Size

	Injury Year 2005-2007	Injury Year 2008-2009	Injury Year 2010-2012
Main Estimates	74%	67%	66%
Reweight by Industry Share	71%	66%	65%
Reweight by Firm Size	71%	65%	65%

C. Appendix: Methods and Supplemental Results for Chapter 5

Estimation of Statutory Benefits for WCIS

Due to several limitations of the information on PPD ratings and benefits available in the WCIS, our analysis of trends in statutory benefits combines data from the DEU and the WCIS to predict the average final rating and benefits for WCIS cases as a function of data observable in the WCIS. Although it would be ideal to use individual-level data on actual disability ratings and benefits to analyze replacement rates, it is not possible to observe these outcomes for recent injury cohorts in either the DEU or the WCIS. The key limitation of the DEU for analyzing trends in benefits is that the population of DEU cases becomes less representative for recent injury years. As discussed in Chapter 6, this is because severe and complex cases can take five or more years to reach the DEU. Furthermore, as noted above, the population of workers captured in the DEU differs systematically from the population observed in the WCIS, and so wage loss estimates from the DEU may not represent the experience of the average PPD claimant in the state.

Meanwhile, the WCIS also has limitations that make it difficult to analyze trends in ratings and benefits using WCIS data alone. As noted in Chapters 3 and 5, the WCIS does not have sufficiently detailed or reliable information on PD ratings to calculate statutory PPD benefits. The WCIS does have the advantage of reporting amounts of PPD benefits paid to date, and it is believed that paid-to-date amounts in WCIS are accurate. Without accurate data on ratings, however, it is not generally possible to know whether PPD payments on a case have been completed. Because PPD benefits may be paid over many years or, for severe cases eligible for life pensions, until the worker's death, paid-to-date amounts reported in the WCIS are likely to understate the total value of benefit payments that will eventually be made to the average worker. In principle, paid-to-date amounts on closed cases should capture the total amount of benefits. However, slightly less than half (48%) of WCIS cases with PPD payments are reported as being closed at the time of data extraction, and this fraction also declines sharply in recent years. Table C.1 presents estimates of relative earnings, wage loss, paid amounts, and estimated statutory benefits for closed versus open cases in the WCIS. The table stratifies cases on date of injury to account for the portion of cases that are closed, which also highlights the difficulty of using closed cases to measure recent trends. As measured by earnings losses, closed cases are dramatically less severe, and the differences between closed and open cases grows as we examine more recent injuries and the right-truncation problem becomes more severe. The choice between using paid amounts on all claims or restricting attention to closed claims thus represents a dilemma in which either approach may lead to biased estimates of trends in benefit levels due to right-censoring.

Table C.1
Wage Losses and Statutory Benefits for Closed vs Open Cases, by Date of Injury

	Injury Year 2005-2007				Injury Year 2008-2009	
	Closed	Not Closed	Closed	Not Closed	Closed	Not Closed
Relative Earnings, Second Post-Injury Year	73.3%	74.5%	68.1%	65.1%	71.6%	61.5%
Projected Five-Year Earnings Loss	\$33,412	\$38,728	\$38,161	\$47,630	\$34,825	\$52,932
SB899 Statutory Benefits	\$16,993	\$28,545	\$18,009	\$29,694	\$16,478	\$28,278
PPD Paid to Date	\$11,892	\$11,174	\$12,273	\$12,265	\$9,109	\$8,459

Table contains 2005-2012 injuries reported in WCIS. Claim status and paid-to-date amounts measured as of September 2014. Statutory benefits estimated using matched WCIS-DEU sample as described below, with predicted benefits reweighted under the assumption that 74% of cases are represented as per WCIRB (2015). All dollar amounts reported in constant 2014 dollars.

In order to estimate trends in ratings, benefit levels, and replacement rates in a way that is consistent over time, we use a subset of claimants appearing in both WCIS and DEU to model final ratings and statutory benefits as a function of data elements appearing in the WCIS. We then use this model to predict statutory benefits for all cases appearing in the WCIS, allowing us to analyze replacement rate trends for all workers in the WCIS. The critical assumption underlying this approach is that, after controlling for the observable characteristics of a case, the unobservable determinants of a WCIS case's final rating do not vary systematically with whether or not a case is evaluated at the DEU, i.e., that there is no selection on unobservables.

This assumption is not directly testable, but its content depends on the set of variables from WCIS that are included in our model. Since the goal of the model is to predict final ratings and benefits on the basis of incomplete information from the WCIS, we include variables intended to capture the nature and severity of the worker's injury, as well as other factors (including residence in Southern California, where claimants are differentially likely to be represented by an applicants' attorney, and whether a case is closed).⁷⁸ We also include flexible gender-specific age profiles to capture age adjustments in the rating process and potential gender-specific differences in the distribution of detailed impairments within body parts. Our preferred

⁷⁸ We used 3-digit zip code of residence as reported in the DEU data (with missing values assigned from linked WCIS data where possible) to rank the counties of California by the fraction of DEU ratings with representation. After examining the fraction represented for all 3-digit zip codes in California, we defined "Southern California" to include all 3-digit zip codes in California between 900 and 935, excluding zip codes 919, 920, 921, and 934. Roughly speaking, this area comprises the greater Los Angeles region and inland areas in Fresno or further south, and excludes coastal areas outside of Ventura, Los Angeles, and Orange Counties. This definition is similar to the "L.A. Basin" region defined by WCIRB but includes a larger portion of inland California where representation was more common among DEU cases.

specification uses the following case characteristics to predict the final rating at the DEU, all entered as sets of dummy variables:

- Receipt of TTD benefits and deciles of estimated TTD duration
- Body part of injury codes reported on the FROI
- Pre-injury annual earnings
- Age in years interacted with gender
- Claim status (closed vs open) interacted with residence in Southern California.

Formally, this regression model can be expressed as follows

$$B_{isc} = \alpha_{sc} + X_i \beta^X + \varepsilon_{isc}$$

where B_{isc} is the real discounted present value of statutory benefits after apportionment for individual i in region s with WCIS claim status c injured in year t , X_i contains data on demographics and injury characteristics observed in the WCIS, and α_{sc} represents an intercept that varies flexibly depending on whether the claimant lives in Southern California ($s=1$) or elsewhere ($s=0$) and whether the case was closed ($c=1$) or open ($c=0$) at the time that data was extracted from the WCIS.⁷⁹ This model captures variation in the level of statutory benefits that is systematically related to features of a case observable in the WCIS.

TTD receipt and duration are strongly associated with statutory benefits, with statutory benefits increasing steadily with TTD duration. Benefits also vary widely (up to \$45,000) with the body part of injury after controlling for other worker and case characteristics. The body parts of injury associated with the highest statutory benefits are multiple body systems (which includes polytrauma), the heart, the internal organs, and the spinal cord, while the body parts of injury associated with the lowest statutory benefits are the toes, nose, thumb, fingers, and knee. Benefits also increase with age for both male and female workers.⁸⁰ Finally, there were sizable

⁷⁹ We model benefits directly rather than modeling ratings and then computing benefits on the basis of predicted ratings because, holding wages constant, benefits are a convex function of ratings. Modeling benefits based on predicted ratings would lead to an underestimate of benefits due to Jensen's inequality, which holds that a convex function of the expectation of a random variable is necessarily less than the expectation of a convex function of a random variable. Similarly, we explored models that used the natural log of statutory benefits as the dependent variable, but while these models fit the data slightly better than our preferred model, predicted benefit levels from these models were biased substantially downward due to Jensen's inequality.

⁸⁰ We explored models that also incorporated permanent impairment and PD rating information from the WCIS. Even though these variables are often placeholders estimated for insurance reserving purposes early in the life of a claim, they were strongly predictive of statutory benefits. However, we found that these models were not appropriate for modeling time trends, as PD rating information in the WCIS also appeared to be subject to right-censoring problems that tend to bias trends downwards in recent years. Body part of injury, in contrast, is available shortly following the date of injury on the FROI. As discussed in Appendix B, right-censoring is more of a concern with TTD duration, but we think this is unlikely to affect our estimates substantially because we use deciles of TTD duration, and the 80th percentile of implied TTD duration (approximately 72.5 weeks) is somewhat below the duration between the last injury dates in our sample and the time of data collection (approximately 89 weeks). Furthermore, as discussed in Appendix B, downward trends in TTD duration for PPD cases following the recession

differences in statutory benefits associated with geography and WCIS claim status, even after controlling for the other factors mentioned here. Open cases in Southern California had statutory benefits that were \$4,300 higher than similar open cases elsewhere in California, while closed cases were associated with statutory benefits that were approximately \$2,500 (in Southern California) to \$3,600 (elsewhere in California) higher than open cases in the same region, reflecting the fact that more severe cases remain open longer. While this regression model explains only 14% of the variation in statutory benefits, we do not need to have high explanatory power for the model to accomplish its goal of yielding unbiased predictions of statutory benefits based on characteristics observed in the WCIS.

We use the estimated coefficients from the above regression model to predict statutory benefits for all cases in the WCIS as a function of case characteristics, defining $\hat{B}^X(X_{isc})$ as follows

$$\hat{B}^X(X_{isc}) = \hat{\alpha}_{sc} + X_i \hat{\beta}^X$$

$\hat{B}^X(X_{isc})$ captures the average relationship between injury characteristics and final ratings over all available cases from the 2005-2012 injury years, but it does not capture two of the most important influences on ratings: injury date and time between the injury and the DEU rating. Besides the strong relationship between time to rating and case severity that led to the right-censoring problems discussed in Chapters 5 and 6, injury date has an independent effect on ratings that must be accounted for to provide an accurate description of trends in ratings and benefits. As described in Chapter 5, this "ratings creep" may reflect the gradual accumulation of expertise about the rating system on the part of doctors and applicants' attorneys. While we do not need to understand its origins, we do need to factor time effects into our predicted ratings. In particular, we need to estimate time effects in a way that captures trends among high-maturity cases as well as low-maturity cases.

We accomplish this by estimating a separate regression model that adds dummy variables for year of injury (i.e., time effects) to the main specification described just above. This model includes cases at all available maturities and deals with right-censoring by controlling flexibly for case maturity at rating (in 100-day bins of time between the injury and DEU rating). This specification assumes that time effects on benefits are additively separable from the effect of time to rating on ratings (denoted here M_i) and benefits. Put differently, we assume that time effects shift the entire maturity curve in parallel. This model can be expressed as follows:

$$X_{isc} = \alpha_{sc}^T + X_i \beta^{TX} + M_i \gamma^T + \phi_{sct}^T + \eta_{isc}$$

The objective of this model is to isolate the profile of time effects ϕ_{sct}^T , which are allowed to vary freely with WCIS case status (c) and residence in Southern California (s). The time effects capture trends in benefits holding constant case characteristics and the time between injury and

are apparent across the severity distribution, and not just in the right tail of cases that would be affected by right-censoring.

rating. Because $\hat{B}^X(X_{isc})$ already contains an intercept term capturing the long-run average level of benefits over 2005-2012, we de-mean the estimated time effects by subtracting off the in-sample average $\bar{\phi}_{sct}^T$ and then add the de-meaned time profile to the predicted value $\hat{B}^X(X_{isc})$ based on injury characteristics so that the predicted statutory benefits also capture the time trend in benefits caused by ratings creep.

$$\hat{B}(X_{isct}) = \hat{B}^X(X_{isc}) + (\hat{\phi}_{sct}^T - \bar{\phi}_{sct}^T)$$

We estimate $\hat{B}(X_{isct})$ stratified on type of DEU rating to capture the distinct trends in ratings

for represented and unrepresented cases separately. The resulting predicted values have a reasonably good in-sample fit among the sample of matched DEU-WCIS cases used to estimate the model, as shown in Appendix Table C.2.

Appendix Table C.2
In-Sample Fit of Predicted Statutory Benefits

	DEU	Matched DEU & WCIS Claims	
	Actual Statutory Benefits	Actual Statutory Benefits	Estimated Statutory Benefits
Consult Ratings	\$28,811	\$27,641	\$27,387
Number of Cases	89,274	38,237	38,237
Summary Ratings	\$8,933	\$10,380	\$11,247
Number of Cases	92,342	40,357	40,357
Matched DEU-WCIS sample restricted to cases rated before June, 2014 for which linkage to the WCIS was available with complete data on WCIS explanatory variables and DEU rating variables. WCIS variables used in model include age, gender, weekly wage, zip code, body part of injury, PPD paid amount, WCIS PD rating, and case status. No restriction was placed on time to rating at the DEU.			

Under an assumption about the fraction of cases that are represented, we can calculate a prediction for the average WCIS case. As elsewhere in this report, we assume that 74% of cases are represented in each injury year between 2005-2012 as per estimates from WCIRB (2015). To produce the estimates presented in Chapter 5, we use a weighted average of $\hat{B}(X_{isct})$ for

represented and unrepresented cases where the weight assigned to represented cases is fixed at 74% in all quarters of injury.

Replacement Rate Estimates Without Reweighting on Representation Status

Claimants with legal representation, which tend to have both more severe losses and higher ratings, appear to be underrepresented in the DEU data. We do not consistently observe

representation status in the WCIS, and we do not have data on trends in representation over 2005-2012 that is representative for the full population of permanently disabled workers captured in the WCIS. Our main estimates deal with these limitations by assuming that the share of cases with representation in the WCIS population is similar to the 74% share reported by the WCIRB for insured claims (2015). (The share of insured claims with representation was stable over the 2005-2012 time frame of our study.) However, one might worry that this assumption is too strong, and that fluctuations over time in the share of (constant-maturity) DEU cases that are represented may reflect real trends in the overall PPD population.

We examine this possibility by estimating $\hat{B}(X_{isct})$ on a pooled sample of all matched WCIS-

DEU cases rather than stratifying on representation status. The fitted values obtained under this approach are likely to understate the level of statutory benefits because many cases with representation may bypass the DEU. The average wage loss in the unweighted DEU is slightly less severe wage losses than in the WCIS (as we discuss below) suggesting that the unweighted DEU is likely to underestimate benefits. We accordingly view these estimates as a lower bound on the level of statutory benefits. The advantage of this estimation strategy is that it does not rely on any assumptions about the true share of PPD cases with representation: if we thought that a constant percentage of represented cases bypassed the DEU, then trends in representation status among the population of DEU cases would capture information about trends in the broader population and thus serve as a useful check on the robustness of our results.

Figure C.1 depicts trends in wage replacement for the WCIS with benefit imputed from the DEU without stratifying on representation status. Averages are reported in Table C.3. The trends are nearly parallel to those reported in Chapter 5, but are nine to ten percentage points lower across the entire 2005-2012 period. The impact of SB863 is nearly identical in magnitude to our main estimates. The estimated level of wage replacement is also very similar to the stratified-on-representation estimates for the DEU sample reported above in Table A.3.

Figure C.1
Sensitivity Analysis: Statutory After-Tax Wage Replacement Rates Using Unweighted Estimates of Benefits, 2005-2012

After tax earnings losses estimated using 2005-2012 WCIS matched to EDD earnings records. Statutory benefits including present discounted value of life pension estimated using matched WCIS-DEU sample. Dashed horizontal line indicates 80% target wage replacement rate. Benefits estimated using unweighted DEU data.

Table C.3**Statutory After-Tax Wage Replacement Rates Under SB899 and SB863, WCIS**

	Injury Year 2005-2007	Injury Year 2008-2009	Injury Year 2010-2012	All Years
SB899 Benefits	54.1%	48.5%	45.3%	50.0%
SB863 Maximum Applied to SB899 Ratings	65.0%	57.0%	53.0%	59.3%
SB863 Benefits and Ratings	75.0%	64.9%	58.2%	67.3%
SB863 + Return to Work Fund	78.6%	68.2%	61.6%	70.8%

Wage loss estimates from WCIS weighted to correct for match failure. N = 345,282 (Unweighted).

Benefit Adequacy Estimates for DEU Population

We rely on the WCIS to analyze trends in earnings loss and wage replacement primarily because we believe the WCIS captures permanently disabled workers earlier in the course of their disability, reducing the effect of right-truncation on estimates of trends for the PPD population. Many cases take years to reach the DEU, as illustrated in Figure C.2

Figure C.2
Duration Between Injury Date and First DEU Rating, 2009 and Earlier Injuries

The long durations between an injury and a DEU rating creates some methodological challenges because the time to first rating is strongly related to the severity of the case. Truncating the data at a constant maturity therefore involves discarding a substantial amount of data. However, restriction to a constant-maturity sample is necessary because time to first rating is strongly related to the severity of the case. Figure C.3 illustrates this pattern by plotting the average final rating for bins of cases with similar time between the injury and the first DEU rating. Ratings increase by 0.72 percentage points on average with each 100 days of time between the injury and the rating.⁸¹ Apart from a subset of severe cases that are rated shortly after the date of injury, the relationship between time to rating and severity increases steadily over the first six years following the date of injury.

⁸¹ The positive relationship between time to first rating and severity is apparent within both summary and consultative ratings, although the absolute magnitude of the increase is larger for (higher-rated) consultative ratings.

Figure C.3
Final Rating by Days From Injury to First Rating at DEU

Figure C.3 highlights the dilemma involved when using data to analyze recent trends for PPD claims. The systematic relationship between severity and the duration to first rating over six or more years after the injury date means that right truncation in a sample that is not restricted to constant-maturity cases will generate spurious downward trends in average ratings unless many years pass between the injury dates of interest and the date when data is extracted. However, restriction to a constant-maturity sample means excluding the highest-rated cases from the analysis. This is particularly unappealing for a study that focuses on benefit adequacy, as overall benefit adequacy may be driven by the cases with the highest earnings losses.

In this appendix, we use a constant-maturity sample of cases that is comparable through the end of 2011 to analyze wage loss and adequacy trends in the DEU. Estimating earnings loss and wage replacement trends in the DEU is a useful check on the accuracy of the estimates presented in Chapter 5. DEU estimates do not require any modeling of the relationship between injury characteristics and statutory benefits because we can directly observe earnings losses, ratings, and statutory benefits at the individual level. This simplicity comes at the expense of our ability to capture recent trends for the most severe cases, however, and it is important to keep this limitation in mind when comparing these estimates to our estimates for the WCIS.

As we discussed in Chapter 5, cases with and without legal representation differ systematically on many important dimensions, including the severity of the injury (as measured

by final impairment ratings) and statutory benefits. In light of these differences, we begin our examination of the DEU by presenting trends in relative earnings stratified on representation status in Figure C.4.⁸² Earnings losses for Summary and Formal ratings (which overwhelmingly do not have representation) are limited, but are much more severe for Consult ratings (which have representation).⁸³ On average, workers who receive Summary and Formal ratings earn 14% less than their controls, while earnings losses are nearly twice as large (37%) for workers with representation. Losses among workers with representation are also more sensitive to the business cycle.

Figure C.4
Relative Post-Injury Earnings for Workers Rated at the DEU, Stratified by Type of Rating

Sample restricted to cases rated at the DEU within 899 days of injury. Quarterly wage loss estimates aggregated to semi-annual frequency to improve legibility. Workers evaluated in Summary ratings do not have legal representation, while workers evaluated in Consult ratings are represented. Formal ratings, which are rare, may be represented or unrepresented. Weights used to correct for failure to match

⁸² As in our analysis of the WCIS, all estimates use weights to correct for higher rates of match failure at small employers to make the wage loss estimates representative of all cases rated at the DEU.

⁸³ As discussed in Chapters 5-6, Formal ratings are often very severe cases. However, they are rare, especially among the low-maturity cases for which trends can be consistently estimated, and so year-to-year trends overwhelmingly reflect outcomes among Summary cases.

We emphasize differences in outcomes between worker with and without legal representation because an unknown portion of represented cases bypass the DEU, meaning that the unweighted population of DEU cases may not be representative of the broader PPD population. Without taking a stand on what the true probability of legal representation is among the overall PPD population, we can examine trends in wage replacement rates stratified on type of rating. Table C.4 presents estimated after-tax wage replacement rates for the three time periods examined in the body of the report. Averaged over the entire 2005-2011 period for which a constant-maturity sample with matching wage records can be defined, wage replacement rates under SB899 were nearly identical between Summary and Formal ratings (48.0%) and Consult ratings (49.5%). The wage replacement rates estimated here are roughly 15 percentage points lower than the average after-tax wage replacement rate reported for the WCIS (64.3%) in Chapter 5 of the report.

We also observe very different trends in wage replacement rates among the two groups of DEU ratings. Although earnings losses among Summary and Formal ratings were less sensitive to the business cycle than earnings losses among Consult ratings, wage replacement rates among Summary and Formal ratings declined markedly under SB899 while wage replacement rates among Consult ratings remained nearly constant over the 2005-2011 period. This is because, as discussed in Chapter 5, ratings and benefits trended steadily upward for (represented) Consult ratings while remaining flat for (unrepresented) Summary ratings.

Table C.4 also presents the simulated impact of SB863 on after-tax wage replacement rates by time period and type of rating. The 20 percentage point increase in wage replacement rates for Consult ratings due to SB863 is similar to the magnitude of the increase estimated in Chapter 5 for the WCIS sample, while the increase for Summary and Formal ratings (24.5 percentage points) is slightly larger.

Table C.4
After-Tax Wage Replacement Trends Stratified
by Type of DEU Rating

Summary and Formal Ratings

	Injury Year 2005-2007	Injury Year 2008-2009	Injury Year 2010-2011	Total
SB899 Benefits	51.8%	45.2%	43.2%	48.0%
SB863 Maximum Applied to SB899 Ratings	64.0%	55.1%	52.8%	59.0%
SB863 Benefits and Ratings	73.0%	61.5%	58.5%	66.5%
SB863 + Return to Work Fund	79.8%	66.8%	63.3%	72.5%

Consult Ratings

	Injury Year 2005-2007	Injury Year 2008-2009	Injury Year 2010-2011	Total
SB899 Benefits	49.5%	49.7%	49.2%	49.5%
SB863 Maximum Applied to SB899 Ratings	59.4%	58.8%	57.8%	58.9%
SB863 Benefits and Ratings	64.8%	64.0%	62.5%	64.1%
SB863 + Return to Work Fund	71.1%	69.5%	67.4%	69.9%

Sample contains 2005-2011 injuries rated at DEU within 899 days of injury. Unweighted N = 81,287

With some assumptions about the share of cases that are represented, we can attempt to synthesize the DEU wage loss and wage replacement estimates into a single measure of benefit adequacy for workers evaluated at the DEU. The blue line in Figure 5.5 presents relative earnings for a weighted average of constant-maturity DEU cases calculated under the assumption that 74% of cases are represented in every quarter of injury between 2005-2011. This assumption, which we used in Chapter 5 to examine trends in benefits, is based on estimates from WCIRB. For comparison, the black line in Figure 5.5 represents the unweighted average trend in wage loss for constant-maturity cases rated at the DEU, while the red line represents estimates from the WCIS.

Figure C.5
Relative Earnings Trends in 2005-2012 DEU Cases
Unweighted and Reweighted by Representation Status

DEU sample limited to constant-maturity cases rated within 899 days of injury. Unweighted N = 81,287. Weights to correct for match failure applied to all calculations. "Reweighted DEU" trend constructed as a weighted average of relative earnings for represented and unrepresented cases with a weight of 74% placed on represented cases in all quarters of injury. "Unweighted DEU" trend does not reweight on representation status. All trends (including WCIS) are reported at a semiannual frequency to preserve legibility of DEU trends.

Without reweighting on representation status, relative earnings before the recession are several percentage points higher in the DEU than in the WCIS. More notably, the impact of the

great recession is far more muted: while relative earnings in the unweighted DEU dip sharply during the recession, the decline in relative earnings between the pre-recession and post-recession periods is just 1 percentage point, as opposed to 8 percentage points in the WCIS. The peak-to-trough amplitude between relative earnings in the first two quarters of 2007 and relative earnings in the first two quarters of 2009 is just 3 percentage points in the unweighted DEU, versus 11 percentage points in the WCIS.

Reweightings on representation status suggests that these differences could be driven in large part by the fact that claimants represented by an attorney are substantially underrepresented in the DEU. The blue line, which presents trends in relative earnings reweighted on representation status, resembles the trend in the WCIS more closely. Pre-recession relative earnings are lower after reweighting (73% in the reweighted DEU, vs 74% in the WCIS), and the impact of the recession is more apparent. Reweighted relative earnings drop 4 percentage points between the pre-recession and post-recession periods—still less than the 8 percentage point decline in the WCIS, but more than the 1 percentage point decline in the unweighted DEU.

Even after reweighting, the impact of the recession appears smaller in the constant-maturity DEU than it does in the WCIS. To understand how our use of a restricted-maturity sample to construct Figure C.5 affects the estimated trends in the DEU, we estimated trends in earnings through the end of 2009 using a higher-maturity sample of cases rated within 1,613 days of injury, a window that allows us to develop comparable estimates of trends between 2005 and the end of 2009.

We compared earnings losses and benefits for this higher-maturity sample to the sample used to construct trends through the end of 2011. Figure C.6 shows that restricting maturity has a limited impact on average earnings losses among unrepresented cases, but a major impact on earnings losses among represented cases. Relative earnings over the 2005-2009 period are 4 percentage points lower among the broader sample that includes all cases rated within 1,613 days of injury. To further examine the relationship between time before rating and earnings loss, we plotted losses separately for cases rated between 900 and 1,613 days of injury. Relative earnings among these cases, which constitute about one-third of consult cases rated within 1,613 days of injury, are 10 to 15 percentage points lower than among cases rated within 899 days of injury. The impact of the recession on earnings losses does appear to be broadly similar between the lower-maturity and higher-maturity samples, though the divergence between these trend lines at the end of 2009 may raise concerns about extrapolation of trends over the business cycle from low- to high-maturity cases. The modeling strategy used to predict benefits in the WCIS

Figure C.7 plots trends in statutory benefits for the five groups of cases examined in Figure C.6. Again, restriction to a low-maturity sample has a limited impact on trends among unrepresented cases but a substantial impact on trends among represented cases.

Figure C.6
Effect of Maturity on Wage Loss by Rating Type

Figure C.7
Effect of Maturity on Average Statutory Benefits by Rating Type

Differences Between DEU and WCIS Populations

Differences in earnings loss trends between the DEU and the WCIS may also be a consequence of observable differences in the composition of the two populations. To clarify these differences, Table C.5 compares selected worker, employer, and case characteristics that are observable in both datasets. Several important differences emerge. Workers rated at the DEU are older on average and slightly more likely to be male. Consistent with these characteristics, pre-injury annual earnings are about \$4,000 higher for DEU workers in constant 2014 dollars (\$50,086 for DEU cases versus \$46,083 for WCIS cases).

Table C.5
Worker Characteristics of DEU vs WCIS Wage Loss Samples

Demographics	WCIS	DEU
Average Age	44.4	46.1
Percent Female	42%	40%
Pre-Injury Annual Earnings (2014\$)	\$46,083	\$50,086
Industry		
	WCIS	DEU
Accommodations/Food Svc	5%	4%
Administrative/Support	6%	5%
Agriculture	3%	3%
Construction	7%	7%
Education	5%	10%
Health Care	8%	9%
Manufacturing	13%	11%
Other	16%	16%
Public Administration	13%	19%
Retail	13%	9%
Transport/Warehousing	5%	5%
Wholesale	6%	5%
Unweighted Number of Cases with Matched Controls	345,282	88,668

WCIS wage loss sample consists of WCIS claims with matched wage histories and matched controls

DEU wage loss sample consists of constant-maturity claims rated within 899 days of injury (thus comparable through 2011) and with matched wage histories and matched controls

Differences in the industrial composition of the DEU population versus the WCIS population are also apparent. The most striking differences are driven by different coverage of public employers in the two databases. The fraction of cases with an industry code in the Public Administration sector is 19% in the DEU, versus 13% in the WCIS. Education, another sector with substantial public employment, accounts for 10% of the DEU caseload versus 5% of the WCIS caseload.⁸⁴ To the extent that employment in Public Administration and Education is

⁸⁴ The industry data from EDD that we use consist only of NAICS codes, which do not distinguish between public- and private-sector establishments. In 2012, the Public Administration industry (NAICS 92) encompassed only about a 36% of government employment in California: a larger share of public employees worked in Education (44%).

correlated with public-sector employment, these workers may enjoy greater job security and experience better return to work. These differences are offset by higher shares of workers in Retail and Manufacturing in the WCIS.

We cannot know with certainty whether the WCIS or the DEU is more representative of the industrial mix for the overall population of PPD cases in California. The WCIS is known to suffer from a non-trivial amount of underreporting on subsequent reports of injury, which contain the information on benefit receipt that we use to define the PPD population. Some analysts familiar with the WCIS have suggested that there is differentially greater underreporting of public-sector injuries, in which case the DEU could be more representative of the true PPD population than the WCIS. We addressed this concern by estimating wage loss trends that stratify the WCIS on industry and reweight according to statewide employment changes. The results of this calculation, presented in Appendix Figure B.3, strongly resemble the main estimates presented in Chapter 4.

D. Appendix: Methods and Supplemental Results for Chapter 6

Measurement of Return to Work Benefit Eligibility in DEU

As implemented by DWC, the return to work benefit is available to workers meeting the eligibility criteria for the Supplemental Job Displacement Benefit, namely that the worker does not receive a qualified return to work offer within 60 days of reaching maximum medical improvement.

A challenge in analyzing the return to work fund with DEU ratings is that the DEU rating data do not contain the permanent and stationary date. We use the date of the first rating at the DEU as a very rough proxy for eligibility for the return to work fund. Because workers may not reach the DEU for some time after reaching maximum medical improvement, and because at-injury employment for injured workers decays with time elapsed from the injury, we view the resulting estimates as an upper bound on eligibility for the return to work benefit. We conducted validation exercises using the WCIS and verified that there is a strong association between return to work fund eligibility and final ratings, meaning that any impact of the return to work benefit on vertical equity is not just an artifact of our strategy for measuring eligibility in the DEU. That said, it is likely that some of the association we observe is measurement error driven by the timing of DEU ratings. We accordingly view our analysis of the return to work benefit for DEU cases as an upper bound on the positive association between return to work fund eligibility and severity, and thus as an upper bound on the impact of the return to work fund on vertical equity.

Figure D.1 illustrates that eligibility for the return to work fund increases with disability ratings. Because we were concerned that this might be a mechanical consequence of the relationship between time to rating and case severity, we used the matched DEU-WCIS sample

Health Care, another industry with substantial public-sector employment, accounts for 9.5% of DEU cases versus 8.4% for WCIS.

to verify that return to work fund eligibility increases sharply with impairment ratings. We compared return to work benefit eligibility based on the MMI date in the WCIS to final impairment ratings in the DEU and found that eligibility generally increases steadily over the distribution of final ratings with the exception of cases in the lowest decile of the rating distribution.

Figure D.1
Imputed Return to Work Fund Eligibility by Final Rating

Methods for Projecting Five-Year Earnings Losses from Second-Year Earnings Losses

Throughout the report, we calculate wage replacement rates using estimates of earnings losses over the first five post-injury years. Earnings over five post-injury years cannot be directly observed for recent injuries, including nearly all post-recession injuries. We therefore use data from injuries in 2008 and earlier years to estimate the relationship between earnings in the second post-injury year and earnings over the first five post-injury years.

Our method for projecting earnings loss is simple: we divide the sum of after-tax earnings losses over the first five post-injury years by after-tax earnings losses in the second post-injury year to obtain the ratio of five-year losses to second-year losses for the 2005-2008 injury cohorts, for whom five years of post-injury data are available. Second-year losses (in real after-tax dollars) are observable for all our injury cohorts, so we multiply second-year losses by the ratio of five-year losses to second-year losses.

In Chapter 5, we calculate this ratio using all available cases from the 2005-2008 injury years in the WCIS: this factor is 4.74. Benefit adequacy estimates for the DEU in Appendix C are also calculated using this ratio. The estimates of earnings losses and wage replacement in Chapter 6 are stratified on final ratings and impairment type, and so we might be concerned that the relationship between second-year and five-year losses would vary among these conditions. Accordingly, we also estimated the ratio of five-year to second-year losses stratified on any variables used for stratification in the analysis in question: final ratings for our analysis of vertical equity, and impairment type and final ratings for our analysis of horizontal equity. Tables D.1 and D.2 present these factors for the DEU sample alongside the underlying estimates of control and injured worker annual earnings. All estimates are weighted to correct for match failure.

Table D.1
Proportional Earnings, Injured Earnings, and Control Earnings by Final Rating, 2005-2008 DEU Cases

Final Rating Before Apportionment	Year 1 (Loss)	Year 2 (Loss)	Year 3 (Loss)	Year 4 (Loss)	Year 5 (Loss)	Ratio of Five-Year Losses to Second-Year Losses
0-4	14.6%	7.3%	6.4%	6.7%	7.2%	5.76
5-9	19.9%	12.7%	10.9%	10.4%	11.1%	5.12
10-14	27.8%	21.1%	18.9%	18.7%	18.9%	4.99
15-19	33.3%	27.9%	25.5%	24.7%	25.3%	4.90
20-29	39.8%	37.0%	34.8%	33.0%	33.8%	4.82
30-100	50.6%	54.8%	54.5%	54.3%	53.6%	4.88
All Ratings	30.4%	26.3%	24.8%	24.3%	24.6%	4.95

Injured Worker Annual Earnings

Final Rating Before Apportionment	Year 1 (Injured)	Year 2 (Injured)	Year 3 (Injured)	Year 4 (Injured)	Year 5 (Injured)	Number of Cases
0-4	\$37,930	\$39,433	\$38,329	\$36,651	\$35,362	12899
5-9	\$34,308	\$35,432	\$34,567	\$33,273	\$32,054	17282
10-14	\$29,886	\$30,480	\$29,675	\$28,209	\$27,040	13449
15-19	\$27,239	\$27,152	\$26,413	\$25,069	\$23,868	10187
20-29	\$24,344	\$23,220	\$22,506	\$21,507	\$20,229	11335
30-100	\$21,402	\$17,552	\$15,922	\$14,561	\$13,747	15936
All Ratings	\$29,334	\$28,986	\$27,980	\$26,618	\$25,469	81088

Control Worker Annual Earnings

Final Rating Before Apportionment	Year 1 (Controls)	Year 2 (Controls)	Year 3 (Controls)	Year 4 (Controls)	Year 5 (Controls)	Number of Cases
0-4	\$44,132	\$42,544	\$41,032	\$39,501	\$38,412	12899
5-9	\$42,372	\$40,582	\$38,999	\$37,478	\$36,561	17282
10-14	\$40,615	\$38,625	\$36,975	\$35,418	\$34,333	13449
15-19	\$39,792	\$37,665	\$35,999	\$34,368	\$33,396	10187
20-29	\$39,018	\$36,872	\$35,338	\$33,687	\$32,691	11335

30-100	\$41,082	\$38,874	\$37,095	\$35,652	\$34,577	15936
All Ratings	\$41,314	\$39,349	\$37,724	\$36,179	\$35,157	81088

Table D.2
Proportional Earnings, Injured Earnings, and Control Earnings by Selected Impairment, 2005-2008 Single-Impairment DEU Cases

Hand or finger impairment (16.05.xx.xx or 16.06.xx.xx)

Final Rating Before Apportionment	Year 1 (Loss)	Year 2 (Loss)	Year 3 (Loss)	Year 4 (Loss)	Year 5 (Loss)	Ratio of Five-Year Losses to Second-Year Losses
0-4	5.7%	1.4%	2.6%	1.7%	1.1%	9.03
5-9	11.4%	2.3%	3.1%	3.7%	5.5%	11.16
10-14	18.8%	8.7%	5.3%	5.2%	7.5%	5.23
15-19	24.1%	13.6%	7.0%	5.1%	9.5%	4.34
20-29	34.3%	30.3%	32.8%	31.9%	38.7%	5.55
30-100	41.2%	38.3%	18.5%	11.1%	18.2%	3.32
All Ratings	10.3%	3.9%	4.0%	3.5%	4.2%	6.70

Injured Worker Annual Earnings

Final Rating Before Apportionment	Year 1 (Injured)	Year 2 (Injured)	Year 3 (Injured)	Year 4 (Injured)	Year 5 (Injured)	Number of Cases
0-4	\$36,871	\$36,949	\$34,979	\$33,810	\$33,103	2247
5-9	\$33,692	\$34,245	\$32,130	\$30,203	\$28,756	1068
10-14	\$29,264	\$29,484	\$28,410	\$26,770	\$25,142	495
15-19	\$29,466	\$29,226	\$29,146	\$27,138	\$25,126	196
20-29	\$24,445	\$24,128	\$24,713	\$22,605	\$21,209	100
30-100	\$23,347	\$22,716	\$28,690	\$28,582	\$24,064	25
All Ratings	\$34,403	\$34,593	\$32,892	\$31,414	\$30,304	4131

Control Worker Annual Earnings

Final Rating Before Apportionment	Year 1 (Controls)	Year 2 (Controls)	Year 3 (Controls)	Year 4 (Controls)	Year 5 (Controls)	Number of Cases
0-4	\$39,019	\$37,464	\$35,941	\$34,428	\$33,505	2247
5-9	\$37,695	\$35,066	\$33,229	\$31,506	\$30,693	1068
10-14	\$35,347	\$32,300	\$30,135	\$28,442	\$27,576	495
15-19	\$37,615	\$33,845	\$31,512	\$28,856	\$28,327	196
20-29	\$36,301	\$34,598	\$36,054	\$33,649	\$34,582	100
30-100	\$38,502	\$36,808	\$35,492	\$32,660	\$30,754	25
All Ratings	\$38,101	\$35,980	\$34,334	\$32,662	\$31,831	4131

Knee impairment (17.05.xx.xx)

Final Rating Before Apportionment	Year 1 (Loss)	Year 2 (Loss)	Year 3 (Loss)	Year 4 (Loss)	Year 5 (Loss)	Ratio of Five-Year Losses to Second-Year Losses
0-4	14.9%	4.7%	3.5%	4.5%	4.9%	6.94
5-9	18.7%	6.8%	3.9%	3.3%	3.9%	5.37
10-14	23.4%	14.3%	15.5%	18.1%	17.7%	6.22
15-19	29.2%	21.9%	23.9%	24.9%	25.4%	5.72
20-29	29.9%	26.0%	26.4%	27.5%	31.5%	5.43
30-100	37.0%	39.7%	45.0%	52.2%	56.3%	5.80
All Ratings	19.7%	10.0%	9.2%	10.1%	10.8%	5.95

Injured Worker Annual Earnings

Final Rating Before Apportionment	Year 1 (Injured)	Year 2 (Injured)	Year 3 (Injured)	Year 4 (Injured)	Year 5 (Injured)	Number of Cases
0-4	\$42,676	\$46,158	\$45,002	\$42,744	\$41,183	3721
5-9	\$38,873	\$42,455	\$41,800	\$40,285	\$38,896	2908
10-14	\$37,750	\$40,180	\$37,469	\$34,603	\$33,651	1341
15-19	\$33,770	\$34,546	\$31,730	\$29,093	\$27,393	694
20-29	\$32,686	\$32,147	\$30,254	\$27,714	\$24,175	577
30-100	\$30,146	\$27,498	\$22,820	\$18,175	\$15,818	272
All Ratings	\$39,205	\$41,953	\$40,464	\$38,235	\$36,659	9513

Control Worker Annual Earnings

Final Rating Before Apportionment	Year 1 (Controls)	Year 2 (Controls)	Year 3 (Controls)	Year 4 (Controls)	Year 5 (Controls)	Number of Cases
0-4	\$49,890	\$48,416	\$46,677	\$44,907	\$43,550	3721
5-9	\$47,373	\$45,553	\$43,569	\$41,811	\$40,653	2908
10-14	\$48,738	\$46,896	\$44,756	\$43,079	\$41,974	1341
15-19	\$46,701	\$44,236	\$42,293	\$40,118	\$38,617	694
20-29	\$45,688	\$43,451	\$41,743	\$39,678	\$37,846	577
30-100	\$47,005	\$45,578	\$43,331	\$41,955	\$41,487	272
All Ratings	\$48,388	\$46,639	\$44,741	\$42,952	\$41,677	9513

Carpal tunnel syndrome impairment (16.01.02.02)

Final Rating Before Apportionment	Year 1 (Loss)	Year 2 (Loss)	Year 3 (Loss)	Year 4 (Loss)	Year 5 (Loss)	Ratio of Five-Year Losses to Second-Year Losses
0-4	16.0%	9.9%	7.7%	8.7%	6.5%	4.94
5-9	18.1%	13.6%	12.6%	13.3%	15.7%	5.38
10-14	21.3%	13.3%	20.3%	18.8%	14.8%	6.67
15-19	19.6%	19.2%	22.1%	25.2%	18.0%	5.41
20-29	30.1%	29.3%	36.5%	45.8%	35.5%	6.05
30-100	Insufficient Data					
All Ratings	18.2%	13.1%	13.1%	14.1%	13.2%	5.48

Injured Worker Annual Earnings

Final Rating Before Apportionment	Year 1 (Injured)	Year 2 (Injured)	Year 3 (Injured)	Year 4 (Injured)	Year 5 (Injured)	Number of Cases
0-4	\$35,639	\$36,525	\$36,317	\$34,959	\$35,131	404
5-9	\$34,329	\$34,685	\$33,909	\$32,678	\$30,952	538
10-14	\$33,493	\$34,870	\$31,800	\$30,622	\$30,466	149
15-19	\$32,454	\$30,712	\$27,866	\$24,207	\$25,762	70
20-29	\$24,252	\$22,546	\$20,715	\$18,475	\$19,734	46
30-100	Insufficient Data					
All Ratings	\$33,919	\$34,374	\$33,353	\$31,917	\$31,329	1216

Control Worker Annual Earnings

Final Rating Before Apportionment	Year 1 (Controls)	Year 2 (Controls)	Year 3 (Controls)	Year 4 (Controls)	Year 5 (Controls)	Number of Cases
0-4	\$42,141	\$40,534	\$39,458	\$38,503	\$37,747	404
5-9	\$41,589	\$40,145	\$38,950	\$38,008	\$37,256	538
10-14	\$42,059	\$40,202	\$39,963	\$38,198	\$36,408	149
15-19	\$39,905	\$38,030	\$36,278	\$33,782	\$32,612	70
20-29	\$33,861	\$31,881	\$32,344	\$33,079	\$31,037	46
30-100	Insufficient Data					
All Ratings	\$41,133	\$39,550	\$38,551	\$37,485	\$36,537	1216

Low back pain impairment (15.03.01.00 or 15.03.02.02)

Final Rating Before Apportionment	Year 1 (Loss)	Year 2 (Loss)	Year 3 (Loss)	Year 4 (Loss)	Year 5 (Loss)	Ratio of Five-Year Losses to Second-Year Losses
0-4	24.2%	15.9%	12.3%	13.8%	16.8%	5.22
5-9	20.0%	13.6%	10.4%	7.5%	7.9%	4.37
10-14	27.7%	22.3%	18.3%	17.5%	17.5%	4.63
15-19	34.5%	28.8%	25.2%	22.9%	23.9%	4.70
20-29	38.2%	35.2%	33.6%	32.5%	33.0%	4.90
30-100	55.2%	56.9%	55.6%	50.3%	50.0%	4.71
All Ratings	30.8%	25.9%	22.9%	20.8%	21.2%	4.69

Injured Worker Annual Earnings

Final Rating Before Apportionment	Year 1 (Injured)	Year 2 (Injured)	Year 3 (Injured)	Year 4 (Injured)	Year 5 (Injured)	Number of Cases
0-4	\$35,433	\$34,448	\$34,772	\$34,795	\$31,999	155
5-9	\$29,913	\$30,506	\$30,333	\$29,960	\$29,095	3486
10-14	\$27,963	\$27,957	\$27,732	\$26,630	\$25,511	3373
15-19	\$26,748	\$26,896	\$26,584	\$25,869	\$24,893	2540
20-29	\$26,539	\$25,918	\$24,819	\$23,643	\$22,610	1978
30-100	\$19,789	\$16,538	\$15,771	\$15,698	\$15,167	862
All Ratings	\$27,560	\$27,418	\$27,020	\$26,276	\$25,291	12394

Control Worker Annual Earnings

Final Rating Before Apportionment	Year 1 (Controls)	Year 2 (Controls)	Year 3 (Controls)	Year 4 (Controls)	Year 5 (Controls)	Number of Cases
0-4	\$45,362	\$40,965	\$39,820	\$40,450	\$38,895	155
5-9	\$36,962	\$35,301	\$34,011	\$32,625	\$31,867	3486
10-14	\$37,915	\$35,973	\$34,331	\$32,919	\$31,803	3373
15-19	\$39,767	\$37,760	\$36,098	\$34,508	\$33,904	2540
20-29	\$41,799	\$39,987	\$38,250	\$36,626	\$35,794	1978
30-100	\$40,998	\$38,407	\$37,141	\$35,009	\$34,387	862
All Ratings	\$38,954	\$37,022	\$35,493	\$33,993	\$33,157	12394

Digestive system impairment (06.xx.00.xx)

Final Rating Before Apportionment	Year 1 (Loss)	Year 2 (Loss)	Year 3 (Loss)	Year 4 (Loss)	Year 5 (Loss)	Ratio of Five-Year Losses to Second-Year Losses
0-4	12.9%	15.0%	18.7%	13.2%	10.2%	4.67
5-9	31.4%	30.8%	30.6%	31.6%	30.2%	5.02
10-14	33.8%	30.6%	37.9%	29.8%	40.9%	5.65
15-19	35.9%	38.8%	38.0%	46.4%	48.5%	5.35
20-29	41.7%	43.1%	48.8%	53.7%	57.2%	5.67
30-100	49.0%	54.8%	35.2%	34.7%	24.3%	3.61
All Ratings	35.5%	36.5%	35.9%	36.8%	37.6%	4.99

Injured Worker Annual Earnings

Final Rating Before Apportionment	Year 1 (Injured)	Year 2 (Injured)	Year 3 (Injured)	Year 4 (Injured)	Year 5 (Injured)	Number of Cases
0-4	\$33,391	\$31,314	\$28,618	\$29,013	\$31,126	23
5-9	\$34,623	\$32,285	\$30,677	\$29,104	\$28,271	70
10-14	\$27,895	\$26,086	\$22,749	\$23,471	\$18,402	56
15-19	\$31,745	\$26,151	\$25,709	\$20,750	\$19,437	59
20-29	\$20,351	\$17,683	\$15,451	\$12,930	\$11,528	59
30-100	\$20,755	\$19,985	\$23,855	\$21,830	\$24,691	39
All Ratings	\$28,225	\$25,512	\$24,308	\$22,410	\$21,292	306

Control Worker Annual Earnings

Final Rating Before Apportionment	Year 1 (Controls)	Year 2 (Controls)	Year 3 (Controls)	Year 4 (Controls)	Year 5 (Controls)	Number of Cases
0-4	\$38,132	\$36,831	\$35,507	\$33,887	\$34,890	23
5-9	\$49,272	\$46,667	\$44,970	\$43,848	\$42,354	70
10-14	\$40,606	\$37,610	\$37,020	\$34,662	\$33,780	56
15-19	\$47,104	\$42,757	\$41,974	\$40,608	\$40,185	59
20-29	\$33,298	\$31,076	\$30,614	\$29,630	\$29,299	59
30-100	\$42,398	\$44,201	\$39,413	\$37,184	\$35,439	39
All Ratings	\$42,475	\$40,196	\$38,750	\$37,203	\$36,407	306

Shoulder impairment 16.02.01.xx or 16.02.02.xx

Final Rating Before Apportionment	Year 1 (Loss)	Year 2 (Loss)	Year 3 (Loss)	Year 4 (Loss)	Year 5 (Loss)	Ratio of Five-Year Losses to Second-Year Losses
0-4	18.5%	8.9%	5.8%	7.3%	8.8%	5.52
5-9	21.8%	13.0%	11.8%	12.2%	14.0%	5.61
10-14	26.9%	16.7%	13.8%	14.3%	15.2%	5.20
15-19	32.0%	26.5%	25.8%	26.2%	27.5%	5.21
20-29	36.5%	34.0%	33.0%	34.0%	36.5%	5.11
30-100	47.6%	47.2%	48.2%	48.1%	49.4%	5.09
All Ratings	25.6%	17.5%	15.7%	16.4%	17.9%	5.31

Injured Worker Annual Earnings

Final Rating Before Apportionment	Year 1 (Injured)	Year 2 (Injured)	Year 3 (Injured)	Year 4 (Injured)	Year 5 (Injured)	Number of Cases
0-4	\$35,704	\$38,361	\$38,142	\$36,228	\$34,676	2079
5-9	\$35,778	\$37,944	\$36,722	\$35,124	\$33,317	2450
10-14	\$32,266	\$34,979	\$34,477	\$32,731	\$31,142	1866
15-19	\$30,100	\$30,968	\$29,756	\$27,474	\$25,805	1404
20-29	\$27,775	\$26,293	\$25,291	\$23,370	\$21,115	767
30-100	\$25,658	\$21,918	\$19,788	\$17,180	\$15,712	221
All Ratings	\$33,154	\$34,878	\$34,045	\$32,177	\$30,468	8787

Control Worker Annual Earnings

Final Rating Before Apportionment	Year 1 (Controls)	Year 2 (Controls)	Year 3 (Controls)	Year 4 (Controls)	Year 5 (Controls)	Number of Cases
0-4	\$43,488	\$42,120	\$40,596	\$39,288	\$38,369	2079
5-9	\$45,273	\$43,593	\$41,860	\$40,426	\$39,414	2450
10-14	\$43,578	\$42,002	\$40,277	\$38,725	\$37,540	1866
15-19	\$43,572	\$42,128	\$40,608	\$38,499	\$37,395	1404
20-29	\$42,317	\$39,866	\$38,435	\$36,938	\$35,686	767
30-100	\$45,440	\$41,546	\$39,807	\$37,147	\$36,225	221
All Ratings	\$43,965	\$42,296	\$40,674	\$39,101	\$38,041	8787

Psychiatric impairment (14.01.00.00)

Final Rating Before Apportionment	Year 1 (Loss)	Year 2 (Loss)	Year 3 (Loss)	Year 4 (Loss)	Year 5 (Loss)	Ratio of Five-Year Losses to Second-Year Losses
0-4	37.6%	35.2%	43.0%	42.3%	36.4%	5.53
5-9	45.4%	33.5%	36.5%	25.3%	22.8%	4.88
10-14	51.1%	45.3%	37.4%	37.1%	34.7%	4.54
15-19	49.1%	47.6%	40.3%	39.0%	37.7%	4.49
20-29	58.2%	58.8%	53.6%	50.5%	47.6%	4.57
30-100	62.5%	67.6%	66.1%	65.9%	63.7%	4.82
All Ratings	56.1%	56.2%	52.6%	50.6%	48.3%	4.70

Injured Worker Annual Earnings

Final Rating Before Apportionment	Year 1 (Injured)	Year 2 (Injured)	Year 3 (Injured)	Year 4 (Injured)	Year 5 (Injured)	Number of Cases
0-4	\$21,640	\$20,787	\$18,340	\$15,778	\$15,760	34
5-9	\$20,776	\$23,214	\$20,547	\$21,143	\$21,138	186
10-14	\$19,848	\$19,400	\$20,086	\$19,382	\$20,039	287
15-19	\$20,306	\$18,326	\$18,611	\$17,497	\$16,705	321
20-29	\$17,140	\$14,553	\$15,422	\$15,296	\$15,215	484
30-100	\$16,169	\$12,465	\$10,863	\$10,069	\$9,848	758
All Ratings	\$18,052	\$15,926	\$15,402	\$14,823	\$14,690	2070

Control Worker Annual Earnings

Final Rating Before Apportionment	Year 1 (Controls)	Year 2 (Controls)	Year 3 (Controls)	Year 4 (Controls)	Year 5 (Controls)	Number of Cases
0-4	\$33,701	\$32,069	\$32,135	\$29,337	\$27,423	34
5-9	\$36,625	\$34,920	\$33,291	\$29,986	\$29,108	186
10-14	\$37,969	\$35,487	\$33,350	\$32,549	\$32,364	287
15-19	\$37,504	\$34,995	\$32,715	\$31,140	\$29,914	321
20-29	\$37,683	\$35,306	\$34,334	\$33,111	\$32,026	484
30-100	\$40,182	\$38,433	\$36,253	\$35,384	\$34,332	758
All Ratings	\$38,449	\$36,340	\$34,519	\$33,217	\$32,252	2070

Final Ratings Before Apportionment Used

Estimation of Vertical Equity Measures

To assess statistical significance of differences in the relationship between final ratings and losses under SB899 and SB863, we use linear regression models to estimate this relationship and then test for the equality of coefficients across models. OLS regression of the relationship between earnings loss and benefits using microdata on earnings losses is inconsistent, however. As discussed in Chapter 3, individual earnings losses are subject to severe measurement error induced by sampling error in control worker earnings. The problem is not that control earnings are measured with error: the EDD earnings data are likely the most accurate possible measure of covered wages in existence. The problem, rather, is that the average outcome for a finite number of control workers is a very noisy measure of any individual worker's true earnings potential. This sampling error is not problematic when earnings are an outcome variable, but it leads to very severe classical measurement error if earnings are used as an explanatory variable. OLS estimation of this equation yields a coefficient of 0.062 [0.0552 - 0.0687], which might seem to suggest that an additional dollar of earnings loss leads to only an additional 6 cents of compensation.

Instead, we use the impairment rating as an instrumental variable for earnings loss in a regression of statutory benefits on earnings loss. Instrumental variables regression is a statistical method that, in our application, isolates the variation in earnings losses that is predicted by an impairment rating system and asks whether this variation translates into benefits. The instrumental variables regression coefficient therefore summarizes in a single number the overall relationship between losses and benefits under a policy regime and can be interpreted as a quantitative measure of vertical equity. This approach is analogous to estimating a line of best fit through the grouped data points in Figures 6.4 and 6.5, but it allows us to avoid arbitrary choices about the level of aggregation and perform valid statistical inference on the resulting estimates. Estimates are sensitive to the level of aggregation because the relationship between earnings losses and benefits is nonlinear.

Instrumental variables methods allow consistent estimation in the presence of measurement error as long as noise in the instrument is uncorrelated with noise in the explanatory variable of interest (Hausman, 2001). Impairment ratings satisfy this condition unless idiosyncratic variation in an injured worker's impairment rating is correlated with the labor market outcomes of his controls.

To be clear, these IV estimates do not have a causal interpretation. Benefits are mechanically linked to the impairment rating, so it clearly does not meet the exclusion restriction necessary for a valid instrumental variable. The model used here can, nonetheless, serve as a test of vertical equity under the following argument: if the rating system did not, on average, assign higher benefits to workers with greater earnings losses, the instrumental variables estimate would be zero. If we estimate a non-zero coefficient, then the system must assign higher benefits to cases with higher earnings losses.

Estimation of Horizontal Equity Measures

To measure the degree of horizontal equity, we estimate a linear regression model where the explanatory variables are the final rating and interactions between the final rating and the impairment category. We use the F-statistic on the interaction terms to measure the magnitude of differences across body parts in the level of earnings loss and in the relationship between ratings and earnings loss. Importantly for our purposes (because the dependent variable differs under SB899 and SB863 due to different cases being grouped together), the F-statistic is normalized by the amount of variation in the dependent variable. The F-statistic under SB863 ($F = 94.1$) was slightly higher than the F-statistic under SB899 ($F = 91.8$).

We are not aware of statistical theory regarding the difference between two F-statistics, so we used a permutation method to derive p-values for our test statistic treating the rating system in effect (SB899 or SB863) as the binary treatment to be permuted (Good 2006). For the seven impairment categories presented in Figures 6.6-6.7, we constructed permutation datasets in which we exchanged ratings (and cell-average earnings losses) calculated under SB899 with ratings and earnings losses calculated under SB863. For the analysis of selected impairments, there was a small number of permutations (128) so we enumerated all permutations to obtain critical values for our test statistic. The difference between the two F-statistics was near the center of the permutation distribution (two-sided p-value = 0.9375), leading us to conclude that, among the conditions examined in Chapter 6, SB863 did not lead to a change in horizontal equity that was distinguishable from chance. Sensitivity analyses that excluded psychiatric impairments and cases with ratings of 30 or higher also yielded no evidence that SB863 led to a statistically significant change in horizontal equity.

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