

# A Coupled Model of Mortality and Morbidity Risk in the Workplace

## Implications for VSL Estimation

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- 1 Definition of VSL and Standard Treatment
- 2 A Model of Workplace Accidents
- 3 The Data
- 4 Estimation Strategy

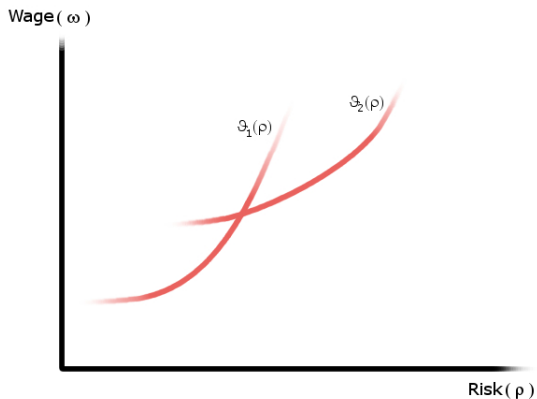
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# Value of a Statistical Life (VSL)

- People regularly choose between improved safety and other uses of income
  - Some forms of employment are more dangerous than others
- The value of a statistical life (VSL) is the willingness to pay to reduce the likelihood of death so that on average 1 fewer person dies.

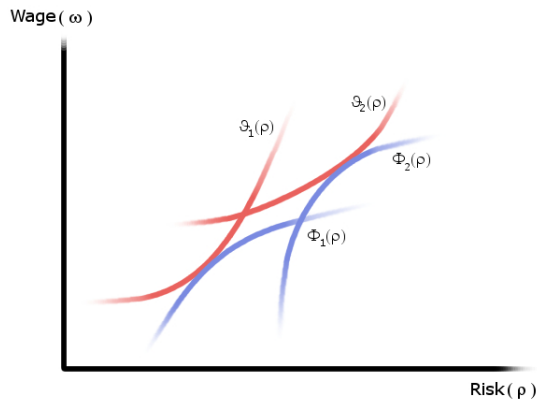
# The mortality risk bid Curves

## Worker bid curves for wage-risk bundles (indifference curves)

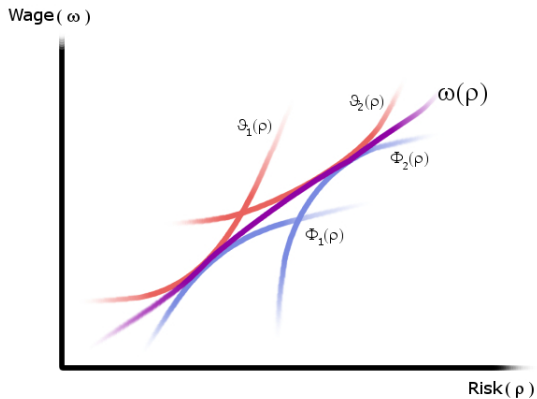


# The mortality risk offer curves

## Firms' wage-risk offer curves (isoprofit curves)



## Equilibrium defines the hedonic surface



## A linear specification

$$W_i = \alpha + \beta_D R_i^D + \beta_I R_i^I + \sum_{m=1}^M \lambda_m C_i^m + \sum_{n=1}^N \gamma_n D_i^n + \epsilon_i,$$

where

- $W_i$  is the wage paid to worker  $i$ ,
- $R_i^D$  is the likelihood that worker  $i$  experiences a fatal injury,
- $R_i^I$  is the likelihood that a worker at firm  $i$  experiences a non-fatal injury,
- $C_i^m$  are characteristics of worker  $i$ ,
- $D_i^n$  are workplace characteristics.



# Standard estimation of workplace risks

- Jobs are defined by industry / occupation pairs (sometimes just industry).
- Risk of death is estimated as the number of reported deaths for a given job divided by employment for that job.
- Risk of injury is similarly estimated.
- These risks are matched to worker data, for example from the Current Population Survey (CPS).

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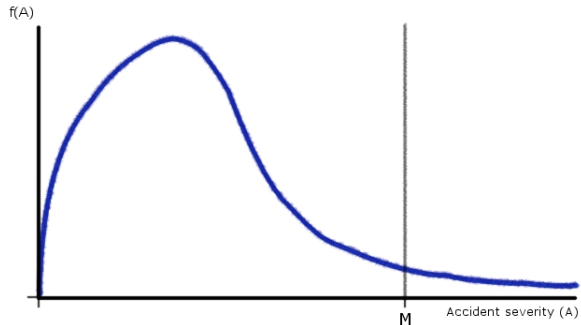
# Accidents, Injuries, and Deaths

- Controlling for risk of injury is important, as injury risk and death risk are highly correlated.
- The literature treats injuries and deaths as though they are fundamentally different types of events. However, injuries and deaths are likely the result of the same process.
  - A fall from the 5th rung of a ladder vs. the 50th rung are not fundamentally different
  - There are accidents, which may produce injuries or deaths depending on severity
- Further, injuries vary in their severity, which is ignored in the VSL literature.

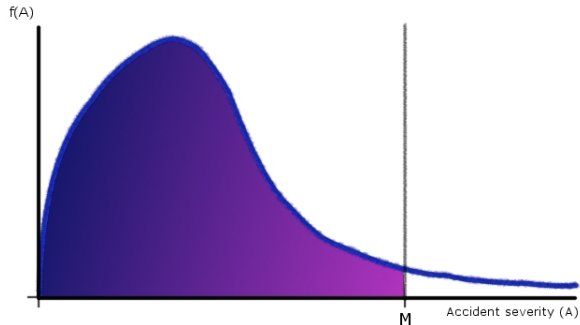
# The Mortality / Morbidity Process

- Each job carries a risk of accident,  $P^A$ .
  - Likelihood that you fall from the ladder
- Accidents vary in severity. An accident whose severity is greater than  $M$  (fatality bound), results in death.
  - Severity is which rung you are on.
  - $M$  is the rung beyond which all falls result in death.
- The random variable representing accident severities is  $A$ , with CDF  $F_A$ .
- The risk of death and injury are:
  - $R^D = P^A \cdot (1 - F_A(M))$
  - $R^I = P^A \cdot F_A(M)$
- Correlation between risks is a direct result of the model

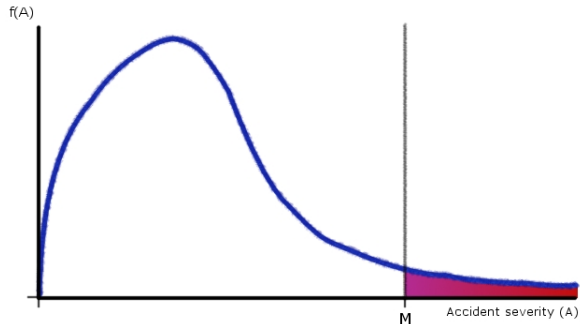
## Density with mortality bound



## Probability of an injury, given an accident occurs



## Probability of death, given an accident occurs



# Treatment of injury severities

- The severity of accidents and the probability of an accident are allowed to vary by job.
- Workers have preferences that vary with the distribution of injuries and the likelihood of death

## Injury risk measure

$$\rho(A) = P^A \cdot \int_0^M x^\gamma dF_A(x)$$

where  $\gamma$  allows for various ways in which injuries are priced.

- $\gamma = 0$  implies risk of injury is the relevant quantity.
- $\gamma = 1$  implies expected injury severity is the relevant quantity.



# Implications for VSL estimation

- 1 Injuries and deaths are both observations of accidents,  $A$ .
- 2 If only injuries are observed for a given job, can still estimate a likelihood of death (same  $M$  for all jobs).
- 3 If  $\gamma \neq 0$ , then use of risk of injury in place of  $\rho(A)$  introduces an omitted variable bias.

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Data will come from the Bureau of Labor Statistics (BLS).

- The Survey of Occupational Injuries and Illnesses (SOII) reports injuries that result in days away from work
  - There is interval censoring past 2 days (1, 2, 3-5, 6-10, 11-20, 21-30, 31+)
- The Census of Fatal Occupational Injuries records workplace deaths.

Wage and worker characteristics data will come from the Current Population Survey (CPS) merged outgoing rotation groups (MORG).

- Data on roughly 50,000 households is collected Monthly for 4 months. 8 months later, data is collected for another 4 months (8 observations per household).
- The last month of each 4-month block is when wage data is collected. This subset of the data is the MORG.
- Variables recorded include:
  - occupation and industry
  - Wage, employment status, union status
  - Education, race, gender
  - Consolidated Metropolitan Statistical Area (252 CMSAs)

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# General approach

The primary equation of interest is:

## Regression model

$$W_i = \alpha + \beta_D R_i^D + \beta_\rho \rho(A_i) + \sum_{m=1}^M \lambda_m C_i^m + \sum_{n=1}^N \gamma_n D_i^n + \epsilon_i ,$$

This requires we first estimate:

## Risk model

$$\rho(A) = P^{A_i} \cdot \int_0^M x^\gamma dF_{A_i}(x)$$

# General approach

The strategy is:

- 1 Estimate the accident distribution parameters from the data
- 2 Conditional on  $\gamma$ , the MLE of the parameters is simply the OLS estimate
- 3 Find the value of  $\gamma$  that maximizes this quantity.

If  $\gamma$  is not significantly different from 0 (boot-strap standard errors), the model I propose can be rejected in favor of the more parsimonious, traditional model.

# Estimating accident model

- There are  $J$  jobs for which data are recorded
- Injuries in  $l$  bins,  $i = 1, \dots, l$ : bin  $i = (a_i, b_i)$
- Specify model for job  $j$ :  $A_j F_A(\cdot; \theta_j)$  (e.g. Weibull)
- The number of injuries in bin  $i$  for job  $j$  is  $N_j^i$ .
- The number of deaths recorded for job  $j$  is  $D_j$ .

$$L(\theta, M; N, D) =$$

$$\prod_{j=1}^J \left\{ \prod_{i=1}^{l-1} \left[ (F_A(b_i; \theta_j) - F_A(a_i; \theta_j))^{N_j^i} \right] \cdot (F_A(M; \theta_j) - F_A(a_l; \theta_c))^{N_j^l} (1 - F_A(M; \theta_j))^{D_j} \right\}$$



# Estimation of VSL

Estimate the accident model parameters and guess a value of  $\gamma$ ,  $\bar{\gamma}$ .

Estimate the parameters of the hedonic surface:

$$\bar{W}_i = \alpha + \beta_D R_i^D + \beta_{\rho\rho}(A_i; \bar{\gamma}) + \sum_{m=1}^M \lambda_m C_i^m + \epsilon_i ,$$

Given the parameters of the hedonic surface and the accident distribution, find the  $\gamma$  that minimizes

$$\sum_i (\bar{W}_i - W_i)^2 .$$

Repeat until parameter estimates 'settle down'.