

# Managerial Labor Market Competition and Incentive Contracts

---

Job Market Talk at HEC Paris

Bo Hu

January 31, 2019

Department of Economics, Vrije Universiteit Amsterdam  
Tinbergen Institute

# Introduction

## What we know:

- Principle-agent problem matters to explain incentive pay.
- Labor market competition gives total pay increases with firm size.

# Introduction

## What we know:

- Principle-agent problem matters to explain incentive pay.
- Labor market competition gives total pay increases with firm size.

## What I ask:

- **Firm Size Incentive Premium:**

Why is the fraction of incentives higher in larger firms?

# Introduction

## What we know:

- Principle-agent problem matters to explain incentive pay.
- Labor market competition gives total pay increases with firm size.

## What I ask:

- **Firm Size Incentive Premium:**  
Why is the fraction of incentives higher in larger firms?
- **Firm Size Incentive Premium and Managerial Labor Market:**  
Incentive premium is higher in industries where the managerial labor market is more active.

# Introduction

## What we know:

- Principle-agent problem matters to explain incentive pay.
- Labor market competition gives total pay increases with firm size.

## What I ask:

- **Firm Size Incentive Premium:**  
Why is the fraction of incentives higher in larger firms?
- **Firm Size Incentive Premium and Managerial Labor Market:**  
Incentive premium is higher in industries where the managerial labor market is more active.

## What I provide:

- An explanation based on the executive job ladder.

# Introduction — motivating facts

**Data:** U.S. S&P 1500 companies, 1992 - 2016

## Key variables:

- firm size by market capitalization
- performance-based incentives by PPS, *pay-for-performance sensitivity*

$$\text{PPS} = \frac{\Delta \text{Wealth (in dollars)}}{\Delta \text{Firm Value (in percentage)}}$$

# Introduction — motivating facts

**Data:** U.S. S&P 1500 companies, 1992 - 2016

## Key variables:

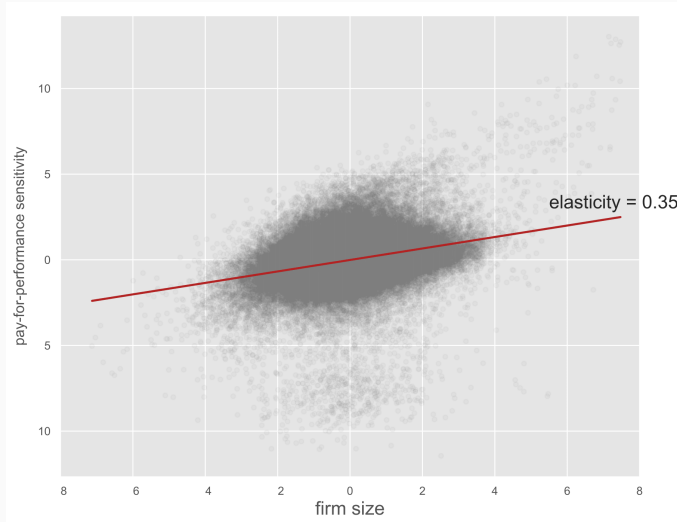
- firm size by market capitalization
- performance-based incentives by PPS, *pay-for-performance sensitivity*

$$\text{PPS} = \frac{\Delta \text{Wealth (in dollars)}}{\Delta \text{Firm Value (in percentage)}}$$

## Size incentive premium:

- Controlling for **total compensation**, year  $\times$  industry dummies, etc.

$$\text{Corr}(\text{PPS}, \text{firm size}) > 0.$$



**Figure 1:** PPS increases in firm size (size incentive premium)

Scatter and linear fit of  $\log(\text{PPS})$  on  $\log(\text{Mktcap})$ , based on S&P 1500 firms from 1992 to 2016.



|                                  | log(PPS)             |                      |                      |                       |                       |
|----------------------------------|----------------------|----------------------|----------------------|-----------------------|-----------------------|
|                                  | (1)                  | (2)                  | (3)                  | (4)                   | (5)                   |
| log(firm size)                   | 0.585***<br>(0.0141) | 0.347***<br>(0.0247) | 0.316***<br>(0.0029) | 0.325***<br>(0.0036)  | 0.316***<br>(0.0029)  |
| log(firm size)<br>× J-J rate     |                      |                      | 0.716**<br>(0.1054)  |                       |                       |
| log(firm size)<br>× GAI          |                      |                      |                      | 0.055***<br>(0.0112)  |                       |
| log(firm size)<br>× inside-CEO-% |                      |                      |                      |                       | -0.087***<br>(0.0196) |
| log(total pay)                   |                      | 0.609***<br>(0.0350) | 0.692***<br>(0.0046) | 0.0687***<br>(0.0056) | 0.684***<br>(0.0046)  |
| tenure, age, year                | X                    | X                    | X                    | X                     | X                     |
| other controls                   | X                    | X                    | X                    | X                     | X                     |
| industry                         | X                    | X                    |                      |                       |                       |
| year × industry                  | X                    | X                    |                      |                       |                       |
| Obs.                             | 146,747              | 128,006              | 128,006              | 79,476                | 128,006               |
| adj. $R^2$                       | 0.442                | 0.482                | 0.487                | 0.482                 | 0.485                 |

# Introduction — model intuition

Model:

- dynamic moral hazard + job ladder

# Introduction — model intuition

Model:

- dynamic moral hazard + job ladder

Basic idea:

# Introduction — model intuition

Model:

- dynamic moral hazard + job ladder

Basic idea:

- performance-based incentives + labor market incentives

# Introduction — model intuition

Model:

- dynamic moral hazard + job ladder

Basic idea:

- performance-based incentives + labor market incentives
- labor market incentives decrease with firm size

# Introduction — model intuition

Model:

- dynamic moral hazard + job ladder

Basic idea:

- performance-based incentives + labor market incentives
- labor market incentives decrease with firm size
- more performance-based incentives are required in larger firms

# Introduction — model intuition

Model:

- dynamic moral hazard + job ladder

Basic idea:

- performance-based incentives + labor market incentives
- labor market incentives decrease with firm size
- more performance-based incentives are required in larger firms

What are labor market incentives?

# Introduction — model intuition

Model:

- dynamic moral hazard + job ladder

Basic idea:

- performance-based incentives + labor market incentives
- labor market incentives decrease with firm size
- more performance-based incentives are required in larger firms

What are labor market incentives?

- on-the-job executives can be poached by outside firms



# Introduction — model intuition

Model:

- dynamic moral hazard + job ladder

Basic idea:

- performance-based incentives + labor market incentives
- labor market incentives decrease with firm size
- more performance-based incentives are required in larger firms

What are labor market incentives?

- on-the-job executives can be poached by outside firms
- labor market incentives: effort  $\leftarrow$  productivity  $\leftarrow$  poaching offer

## Introduction — model intuition, cont'd

Key assumption (Gabaix and Landier, 2008):

- $\text{cash flow} = \text{firm size} \times \text{executive productivity}$
- larger firms can always outbid smaller ones
- the job ladder towards larger firms

## Introduction — model intuition, cont'd

Key assumption (Gabaix and Landier, 2008):

- $\text{cash flow} = \text{firm size} \times \text{executive productivity}$
- larger firms can always outbid smaller ones
- the job ladder towards larger firms

Labor market incentives decrease in firm size

- **job ladder effect** — position on the ladder
- **wealth effect** — wealthier executives are harder to incentivize

This paper

1. documents the firm size incentive premium
2. develops a dynamic equilibrium framework to explain the premium
3. explains the significant increase in executive compensation since the mid 1970s (Frydman and Saks 2010)

## Related Literature

- Assignment models:
  - Tervio (2008), Gabaix and Landier (2008), Edmans et al. (2009), etc.
  - My paper adds dynamics and search frictions.
- Moral hazard models
  - Gayle and Miller (2009), Gayle et al. (2015)
  - My paper features a job ladder towards larger firms.

## Related Literature

- Assignment models:
  - Tervio (2008), Gabaix and Landier (2008), Edmans et al. (2009), etc.
  - My paper adds dynamics and search frictions.
- Moral hazard models
  - Gayle and Miller (2009), Gayle et al. (2015)
  - My paper features a job ladder towards larger firms.
- Dynamic contract literature
  - moral hazard: Spear and Srivastava (1987), etc.
  - limited commitment: Thomas Worrall (1988, 1990), etc.
- Labor search literature
  - sequential auction: Postel-Vinay and Robin (2002), etc.

# Road Map

1. Model
2. Data & evidence
3. Structural estimation
4. Explain the pattern since the mid 1970s

# The Model

---



## Set Up: Moral Hazard

Discrete time and infinite periods

## Set Up: Moral Hazard

Discrete time and infinite periods

Executives:

- risk averse,  $u(w) - c(e)$ ,  $e \in \{0, 1\}$ ,  $c(1) = c$ ,  $c(0) = 0$ ,

$$u(w) = \frac{w^{1-\sigma}}{1-\sigma}$$

- effort  $e$  stochastically increases executive productivity  $z \in \mathcal{Z}$
- $z$  is persistent, follows a discrete Markov Chain process

$$z_t = \rho_0(e) + \rho_z z_{t-1} + \epsilon_t$$

- die with  $\eta \in (0, 1)$ , the match breaks up, the job disappears

# Set Up: Moral Hazard

Discrete time and infinite periods

Executives:

- risk averse,  $u(w) - c(e)$ ,  $e \in \{0, 1\}$ ,  $c(1) = c$ ,  $c(0) = 0$ ,

$$u(w) = \frac{w^{1-\sigma}}{1-\sigma}$$

- effort  $e$  stochastically increases executive productivity  $z \in \mathcal{Z}$
- $z$  is persistent, follows a discrete Markov Chain process

$$z_t = \rho_0(e) + \rho_z z_{t-1} + \epsilon_t$$

- die with  $\eta \in (0, 1)$ , the match breaks up, the job disappears

Firms:

- firm size  $s \in \mathcal{S}$ , exogenous and permanent
- production (cash flow)  $y(s, z) = \alpha_0 s^{\alpha_1} z$ ,  $\alpha_0, \alpha_1 \in (0, 1]$ .

## Set Up: Managerial Labor Market

Managerial Labor Market:

- search frictional and allows on-the-job search
- with  $\lambda_1 \in (0, 1)$  sample an outside firm  $s'$  from  $F(s')$

## Set Up: Managerial Labor Market

Managerial Labor Market:

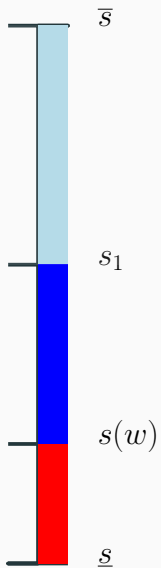
- search frictional and allows on-the-job search
- with  $\lambda_1 \in (0, 1)$  sample an outside firm  $s'$  from  $F(s')$

Bertrand Competition:

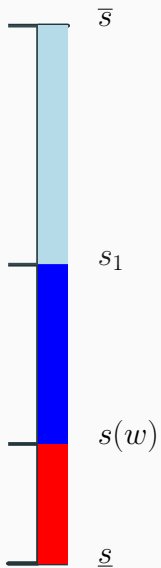
- current firm  $s$  versus outside firm  $s'$
- each has a bidding frontier,  $\overline{W}(z, s)$ , defined by

$$\Pi(z, s, \overline{W}(z, s)) = 0$$

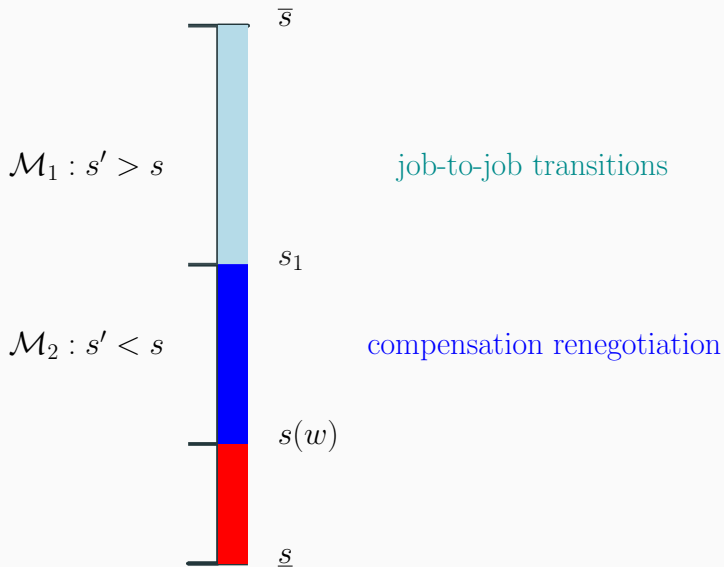
- $\overline{W}(z, s)$  increases in  $z$  and  $s$



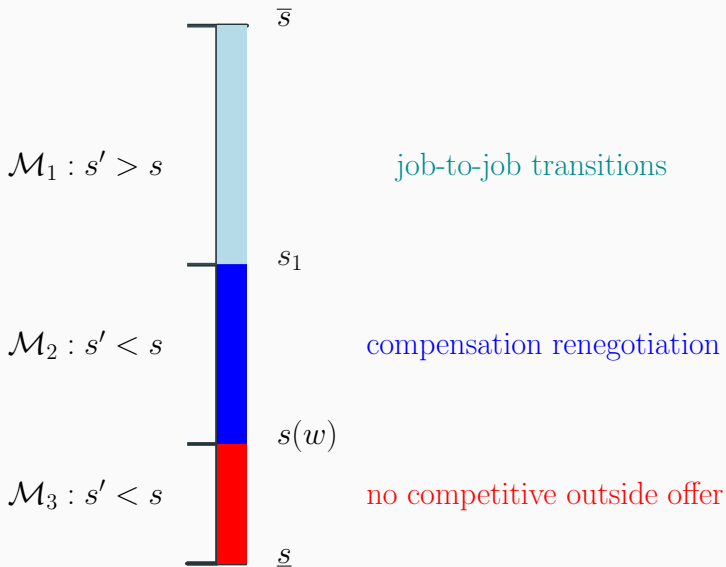
$\mathcal{M}_1 : s' > s$



job-to-job transitions







# Contracting Problem

Firms **maximize profits** by choosing

- current period compensation  **$w$**
- state-contingent continuation value  **$W(z', s')$**

subject to

*Promise-keeping Constraint,* (PKC)

*Incentive Compatibility Constraint,* (IC)

*Participation Constraint of executive,* (PC-Executive)

*Participation Constraint of firm,* (PC-Firm)

# Contracting Problem

Firms **maximize profits** by choosing

- current period compensation  $w$
- state-contingent continuation value  $W(z', s')$

subject to

*Promise-keeping Constraint,* (PKC)

*Incentive Compatibility Constraint,* (IC)

$W(z', s') \geq \min\{\overline{W}(z', s'), \overline{W}(z', s)\},$  (PC-Executive)

*Participation Constraint of firm,* (PC-Firm)

# Contracting Problem

Firms **maximize profits** by choosing

- current period compensation  $w$
- state-contingent continuation value  $W(z', s')$

subject to

*Promise-keeping Constraint,* (PKC)

*Incentive Compatibility Constraint,* (IC)

$W(z', s') \geq \min\{\overline{W}(z', s'), \overline{W}(z', s)\},$  (PC-Executive)

$W(z', s') \leq \overline{W}(z', s),$  (PC-Firm)

Details

# The Equilibrium

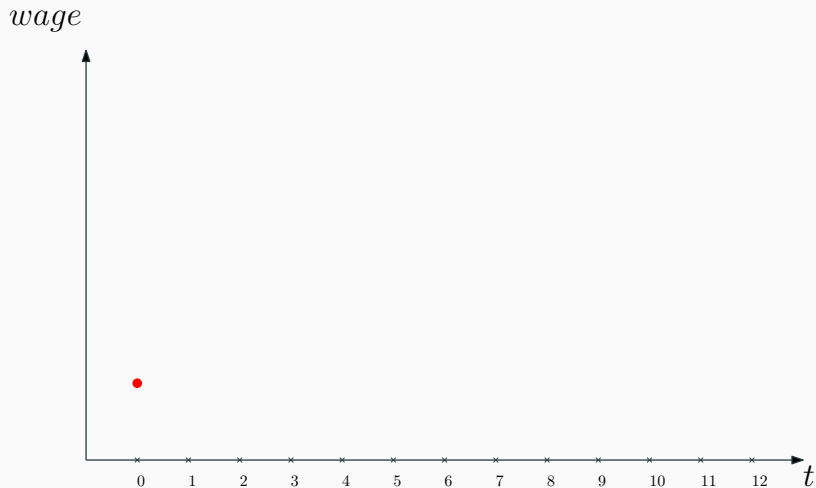
A stationary equilibrium is defined by

- value functions  $\{W^0, W, \Pi\}$ ;
- optimal contracts  $\sigma = \{w, W(z', s')\}$  for  $z' \in \mathbb{Z}$  and  $s' \in \mathbb{S}$ ;
- $\Gamma(z'|z)$  follows the optimal effort choice;
- a distribution of executives across employment states evolving according to flow equations.

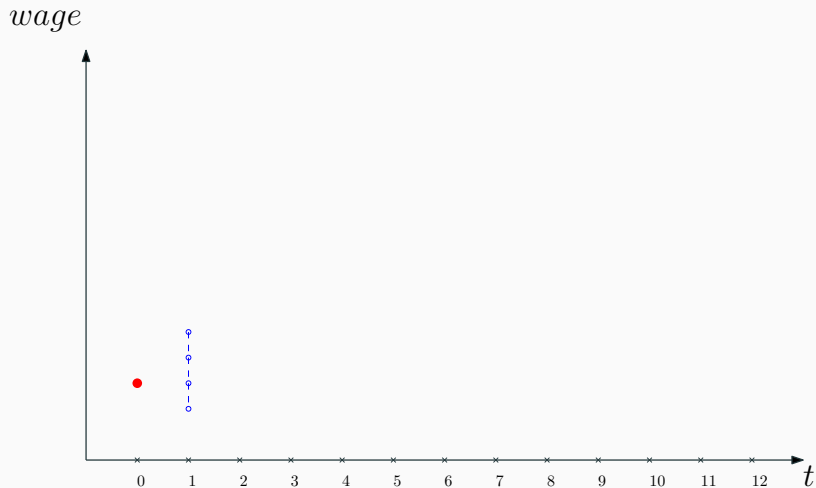
# The Optimal Contract

---

# The Optimal Contract

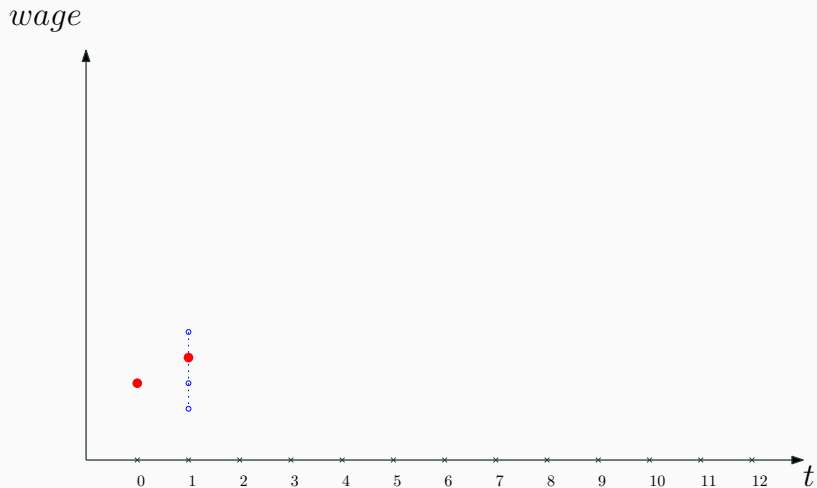


# The Optimal Contract

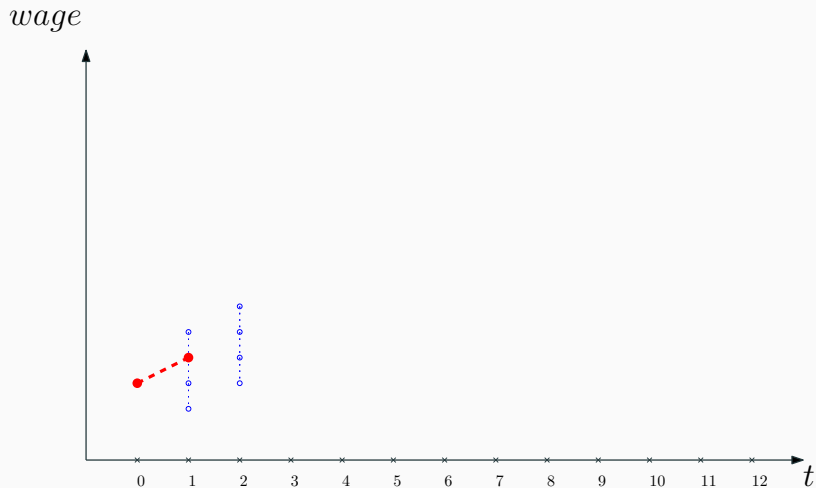




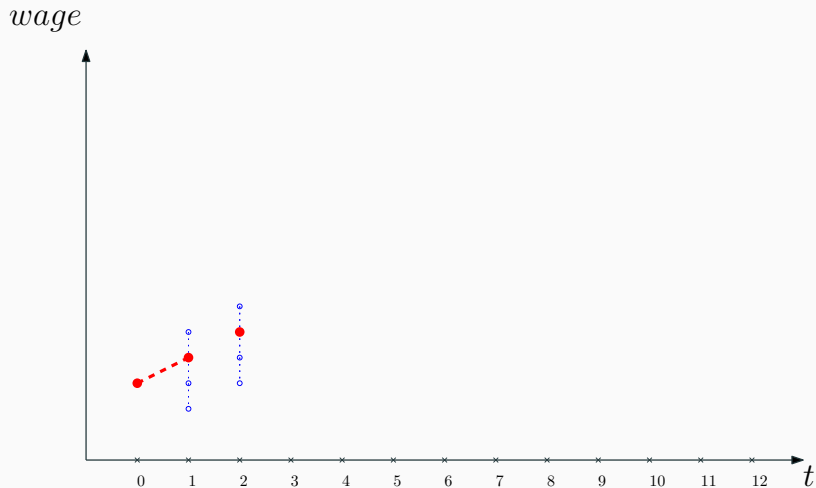
# The Optimal Contract



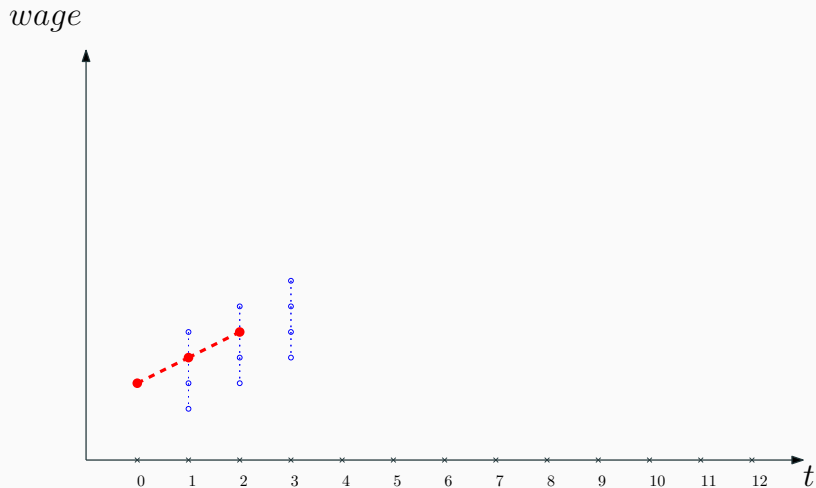
# The Optimal Contract



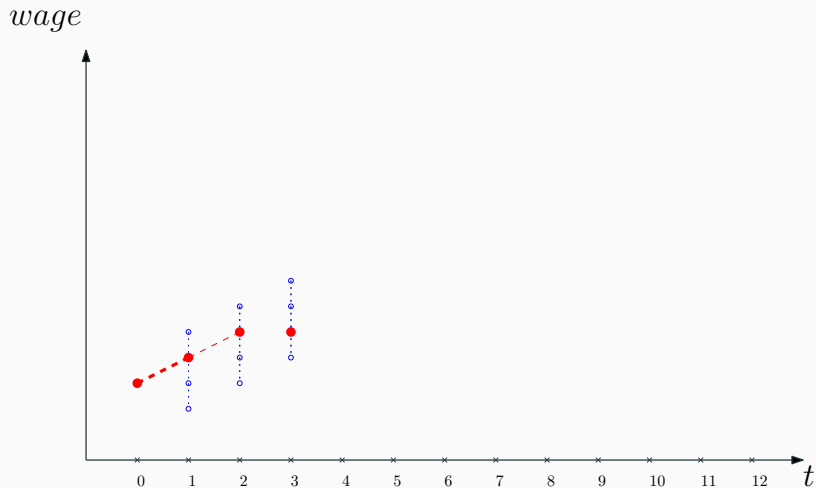
# The Optimal Contract



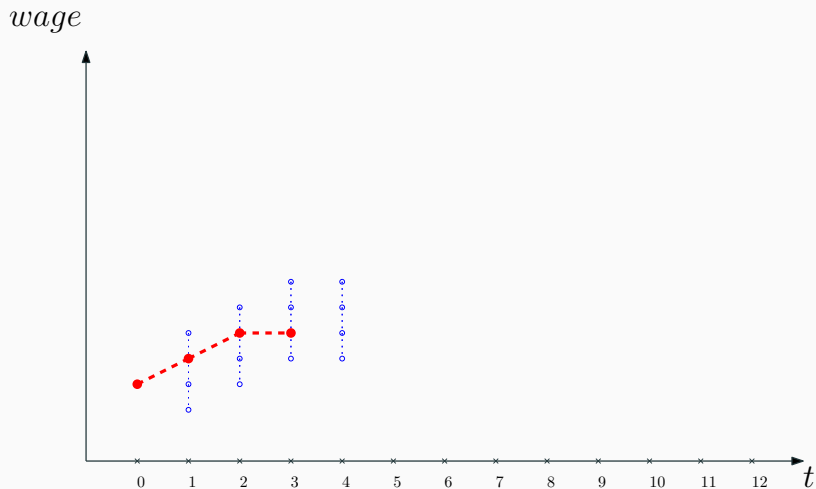
# The Optimal Contract



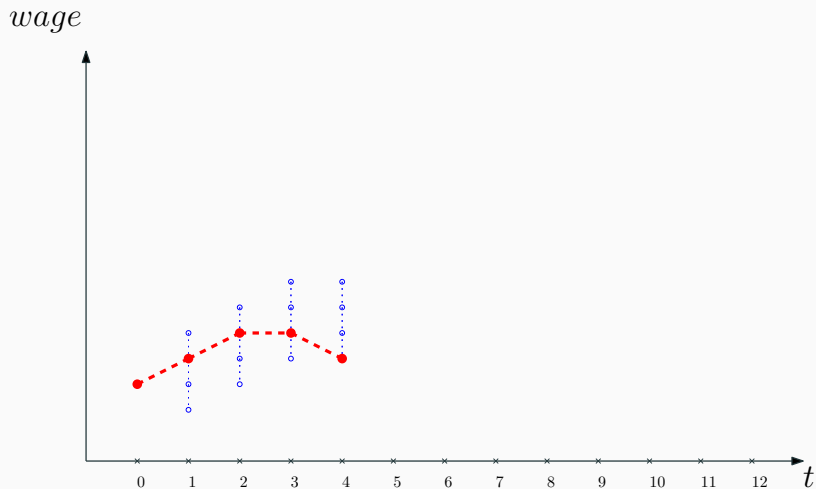
# The Optimal Contract



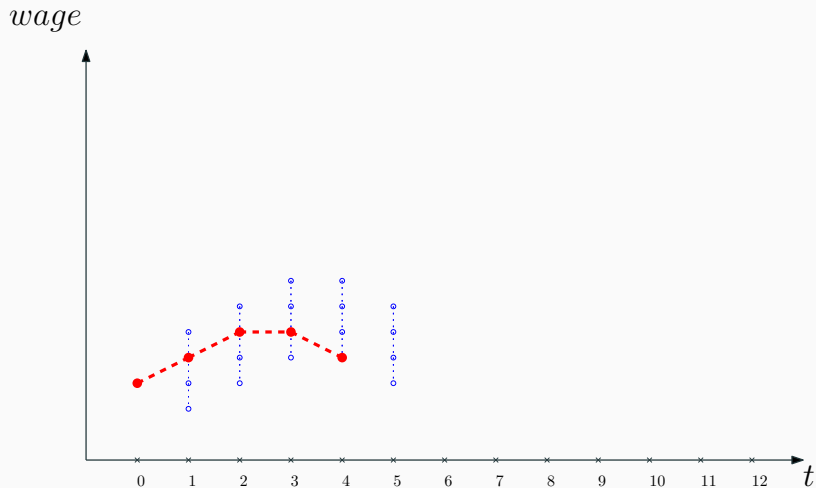
# The Optimal Contract



# The Optimal Contract

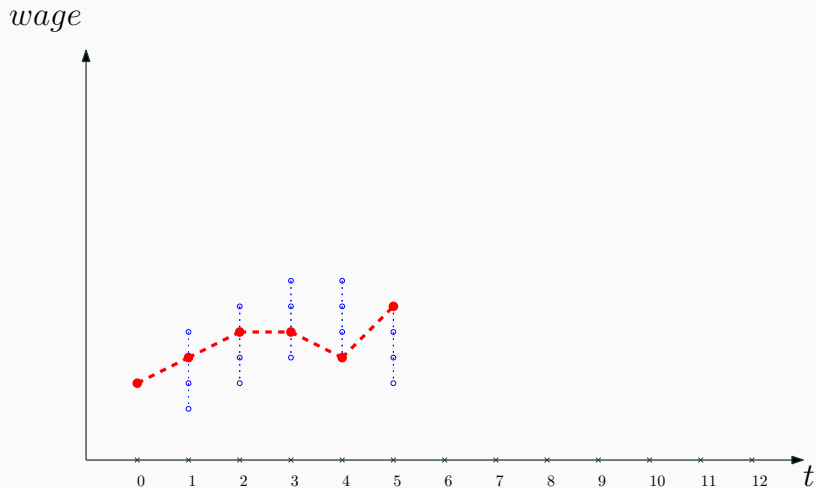


# The Optimal Contract

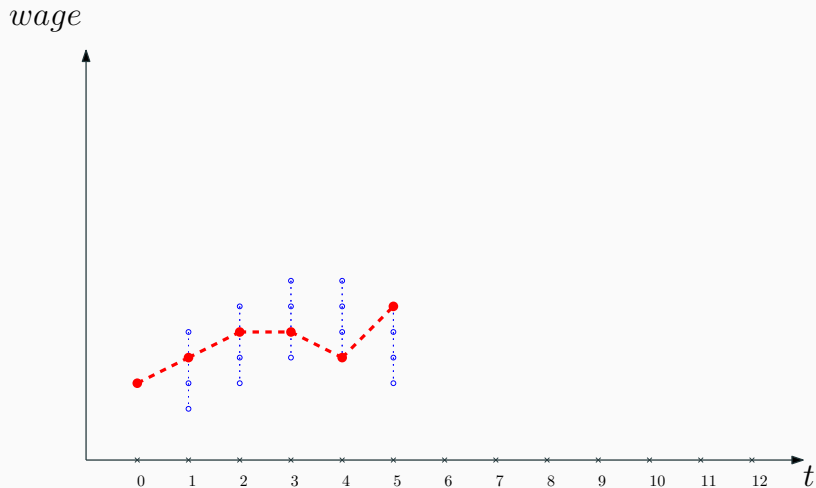




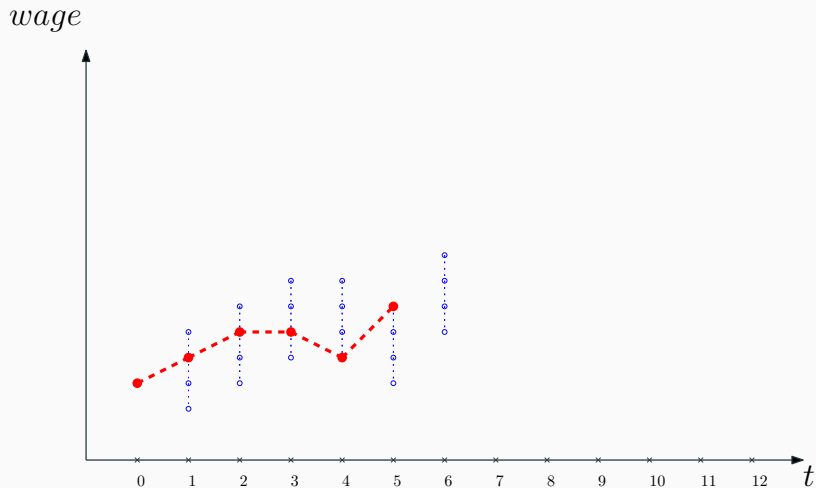
# The Optimal Contract



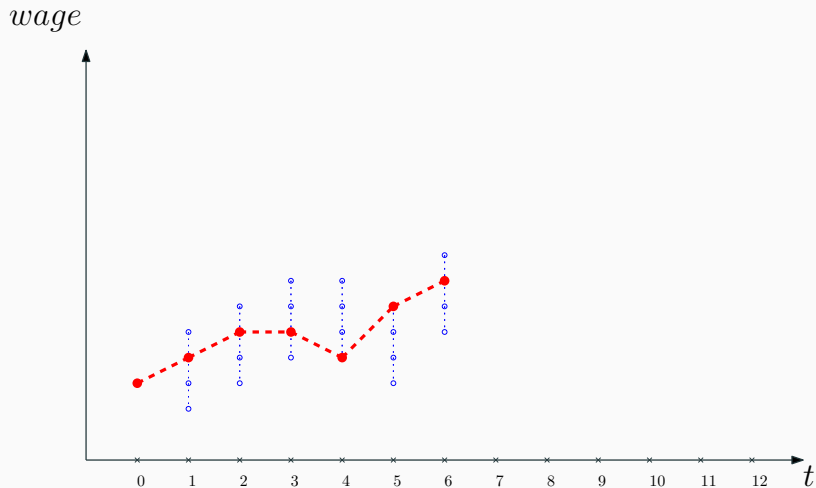
# The Optimal Contract



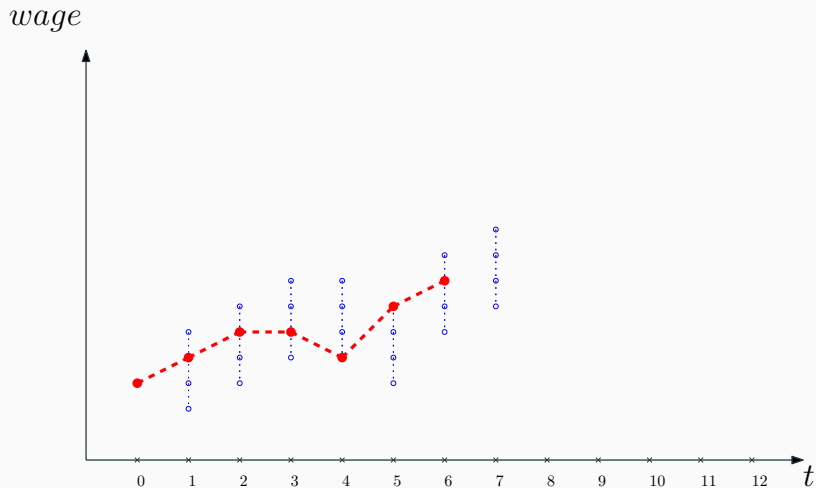
# The Optimal Contract



# The Optimal Contract

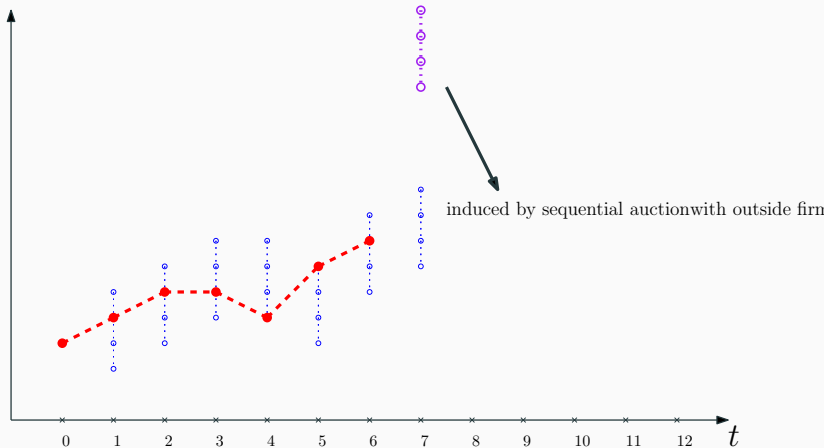


# The Optimal Contract

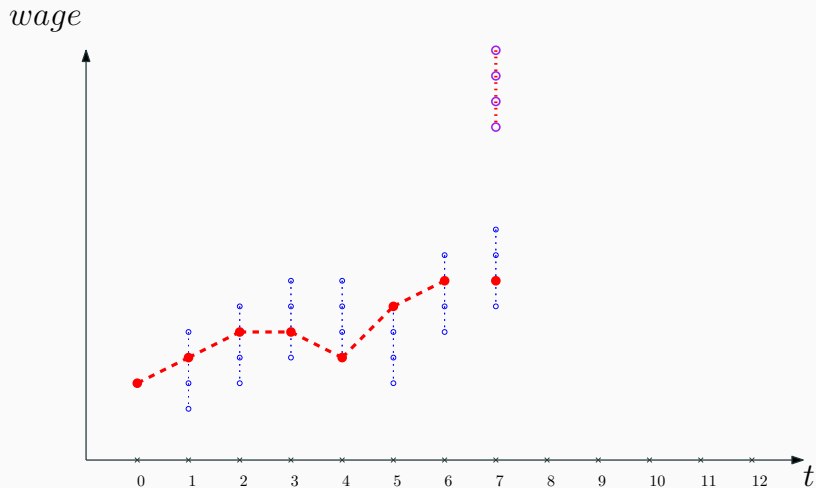


# The Optimal Contract

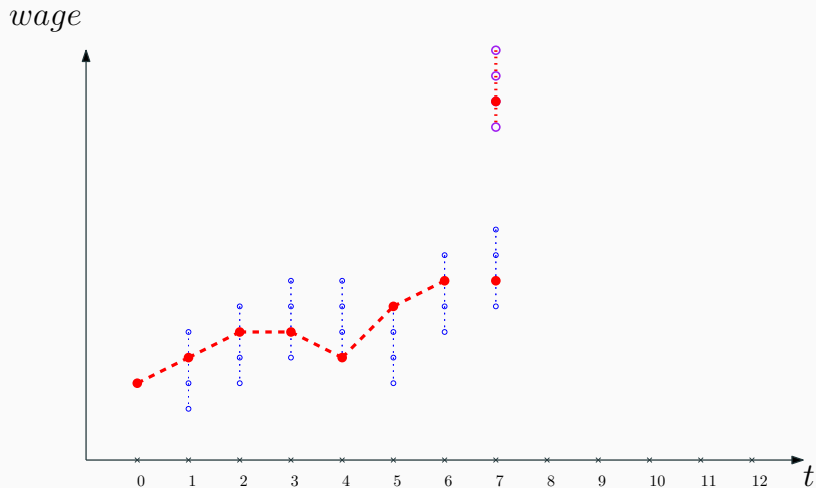
$wage$



# The Optimal Contract

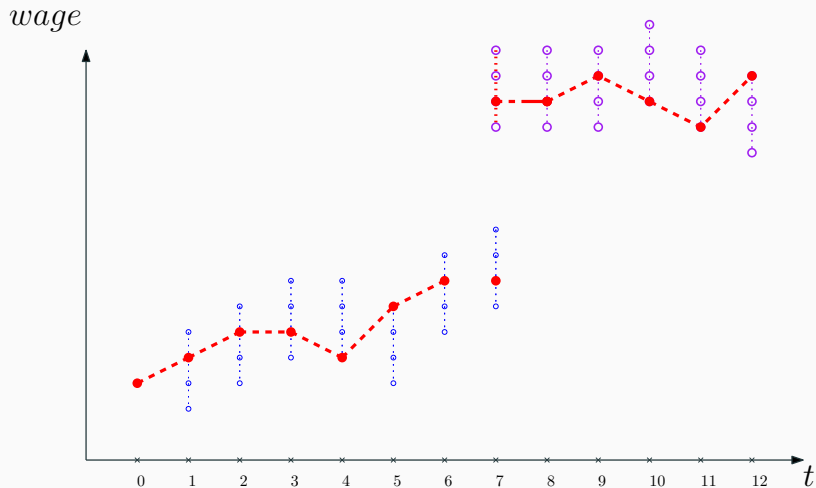


# The Optimal Contract

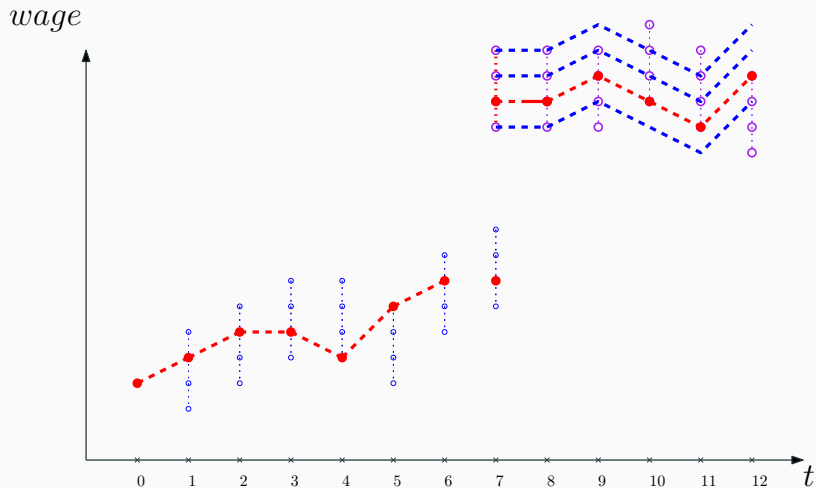




# The Optimal Contract



# The Optimal Contract



## Size incentive premium

---

## Labor market incentives

What is the incentive out of  $W(z')$ ?

$$\mathcal{I}[W(z')] \equiv \mathbb{E}_{z'} \left[ W(z') | e = 1 \right] - \mathbb{E}_{z'} \left[ W(z') | e = 0 \right].$$

## Labor market incentives

What is the incentive out of  $W(z')$ ?

$$\mathcal{I}[W(z')] \equiv \mathbb{E}_{z'} \left[ W(z') | e = 1 \right] - \mathbb{E}_{z'} \left[ W(z') | e = 0 \right].$$

The incentive compatibility constraint is

$$\underbrace{\sum_{s' \in \mathcal{M}_1} F(s') \mathcal{I}[\overline{W}(z', s)] + \sum_{s' \in \mathcal{M}_2} \mathcal{I}[\overline{W}(z', s')] F(s')}_{\text{Labor Market Incentives}} + \underbrace{\sum_{s' \in \mathcal{M}_3} F(s') \mathcal{I}[W(z')]}_{\text{Performance-based Incentives}} \geq \tilde{c},$$

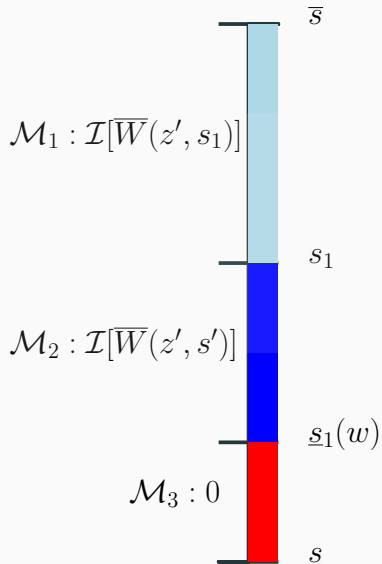
where

$\mathcal{M}_1 : s' \geq s$ , lead to job turnovers

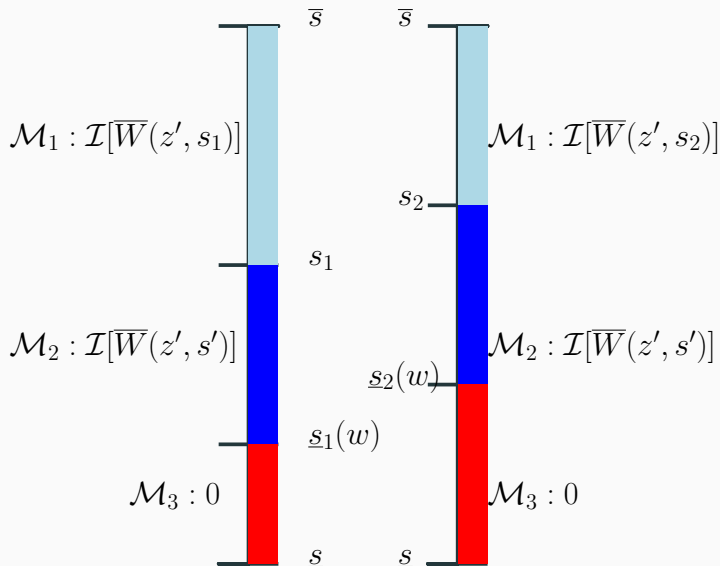
$\mathcal{M}_2 : s' < s$ , improve compensation, no job turnovers

$\mathcal{M}_3$  : other or no outside firms

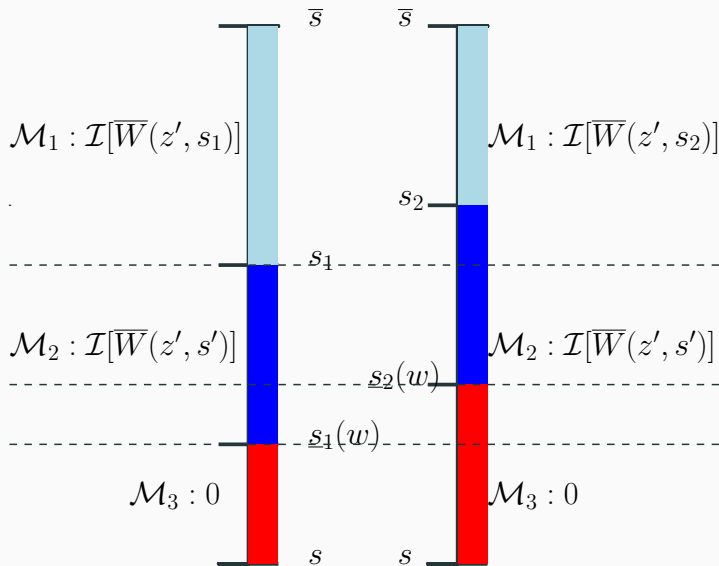
## Size incentive premium



## Size incentive premium

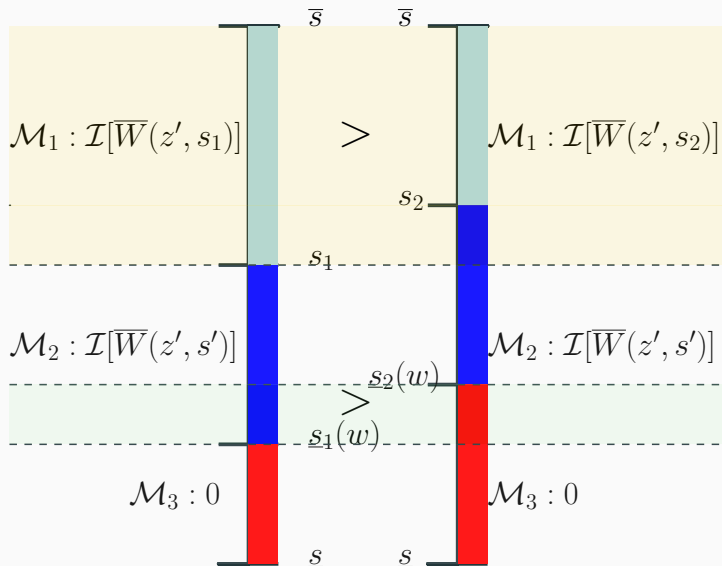


## Size incentive premium

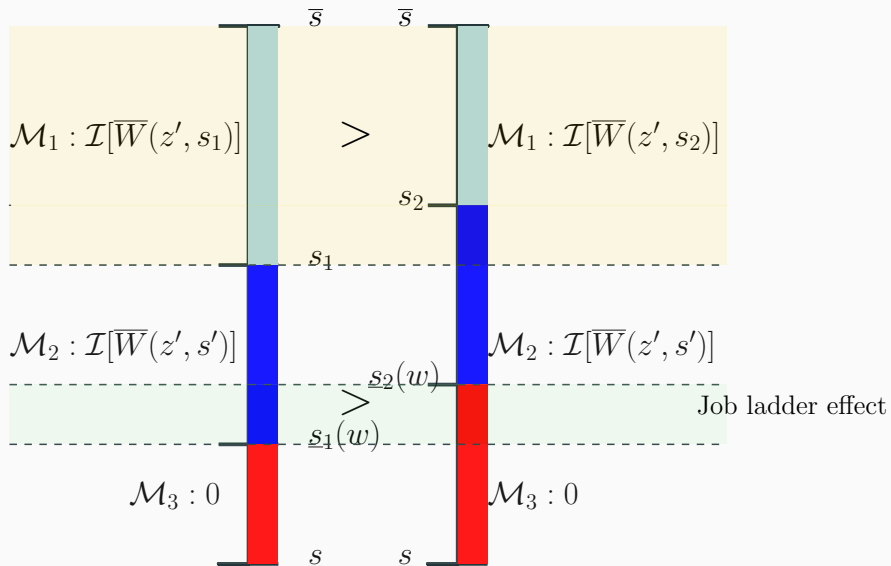




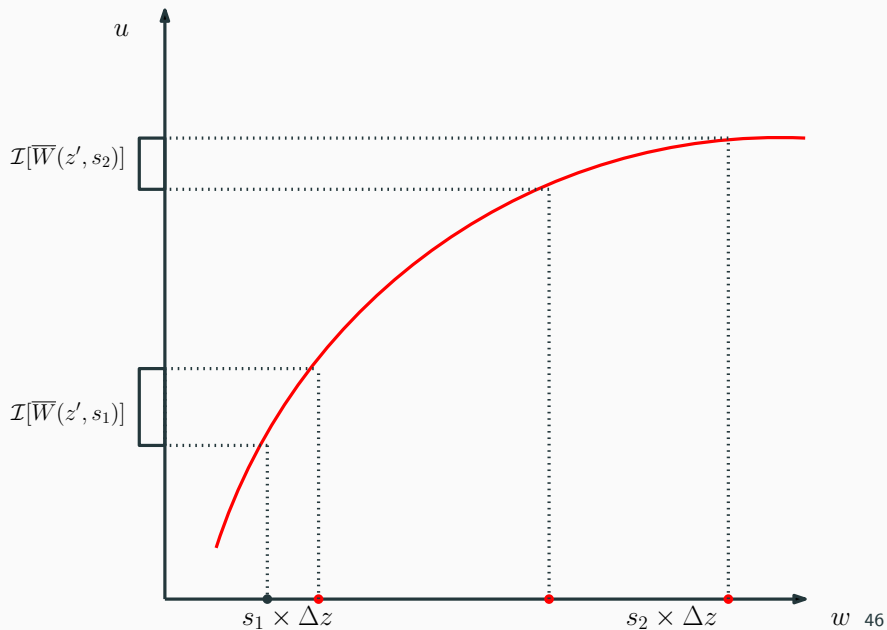
## Size incentive premium



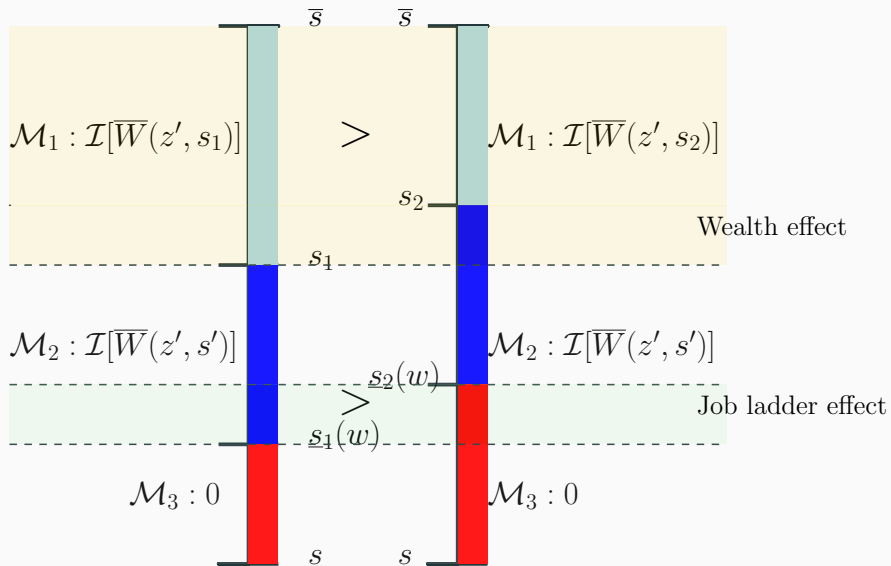
## Size incentive premium



## Incentives from $\overline{W}(z', s)$ decrease in $s$



## Size incentive premium



## Incentives from $\overline{W}(z', s)$ decrease in $s$

### Proposition

Suppose the executives' utility is of the CRRA form and the cost of effort  $c = \overline{c}(s)$ , then  $\mathcal{I}(\overline{W}(z', s))$  decreases in  $s$  if

$$\sigma > 1 + \frac{s^{1-\alpha_1}}{\alpha_1} \psi'(s), \quad (1)$$

where  $\psi(s)$  is a function of  $s$  that is positive and increasing in  $s$ .

# Summary

- Firms compete to retain/attract executives.
- Firm size matters.
- Labor market incentives decrease in firm size due to a job ladder effect and a wealth effect.

# Data and Evidence

---

## Assemble a new dataset

- ExecuComp & BoardEX + hand-collected from LinkedIn/Bloomberg
- ExecuComp: annual records on top executives' compensation
- BoardEX: detailed executive employment history
- Final sample: 35,088 executives, 218,168 executive-year obs., spanning the period 1992 to 2016.

## Define job turnovers

- Job-to-job transition: leaves the current firm, and starts to work in another firm within  $n?$  days.
- Exit: otherwise.



## Assemble a new dataset

- ExecuComp & BoardEX + hand-collected from LinkedIn/Bloomberg
- ExecuComp: annual records on top executives' compensation
- BoardEX: detailed executive employment history
- Final sample: 35,088 executives, 218,168 executive-year obs., spanning the period 1992 to 2016.

## Define job turnovers

- Job-to-job transition: leaves the current firm, and starts to work in another firm within 180 days.
- Exit: otherwise.

## Reduced-form evidence

### 1. Managerial labor market is active. [Details](#)

- annual job-to-job transition rate 5%
- relatively stable over years and across industries

### 2. Executives climb job ladders towards larger firms. [Details](#)

- about 66% of job-to-job transitions are towards larger firms
- for the rest, 20% of them are promotions from non-CEO to CEO

## Reduced-form evidence

3. Executives in larger firms have less job-to-job transitions. [Details](#)
  - Cox model, 1% increase in firm size leads 8.3% lower hazard of job-to-job transitions.
4. Starting from the same level of compensation, the pay-growth is higher in larger firms. [Details](#)
  - 1% increase in firm size leads to 10% increase in pay-growth rate

# Estimation

---

# Model Specifications

- utility function of **CRRA** form

$$u(w) = \frac{w^{1-\sigma}}{1-\sigma}$$

- production function of **multiplicative** form

$$y(s, z) = e^{\alpha_0} s^{\alpha_1} z$$

- productivity process by **AR(1)**, discretized by Tauchen (1989)

$$z_t = \rho_0(e) + \rho_z z_{t-1} + \epsilon_t$$

- poaching firm distribution by truncated **log-normal**  $F(s)$

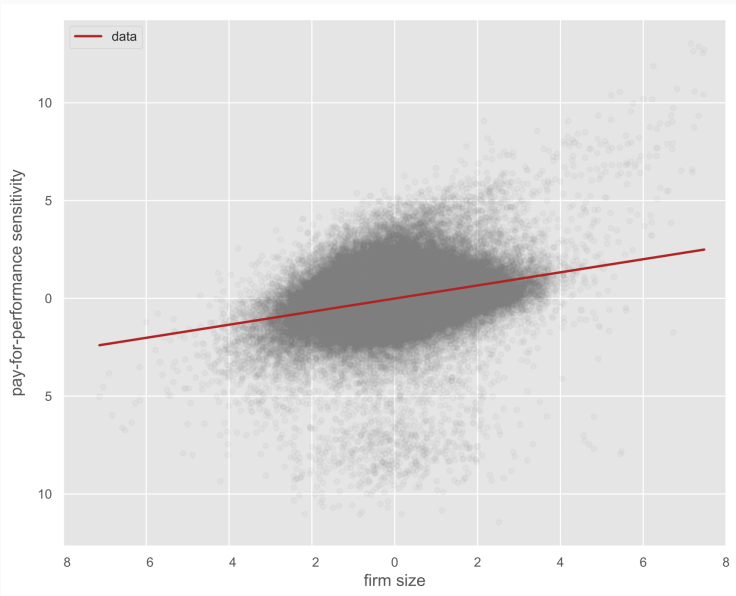
# Parameters

| Parameters           | Description                                    |
|----------------------|--|
| $\eta$               | the death probability                          |
| $\lambda_1$          | the offer arrival probability                  |
| -----                |  |
| $\rho_z$             | the $AR(1)$ coefficient of productivity shocks |
| $\mu_z$              | the mean of productivity shocks for $e = 1$    |
| $\sigma_z$           | the standard deviation of productivity shocks  |
| -----                |  |
| $\mu_s$              | the mean of $F(s)$                             |
| $\sigma_s$           | the standard deviation of $F(s)$               |
| -----                |  |
| $c$                  | cost of efforts                                |
| $\sigma$             | relative risk aversion                         |
| $\alpha_0, \alpha_1$ | production function parameters                 |

## Moments and Estimates

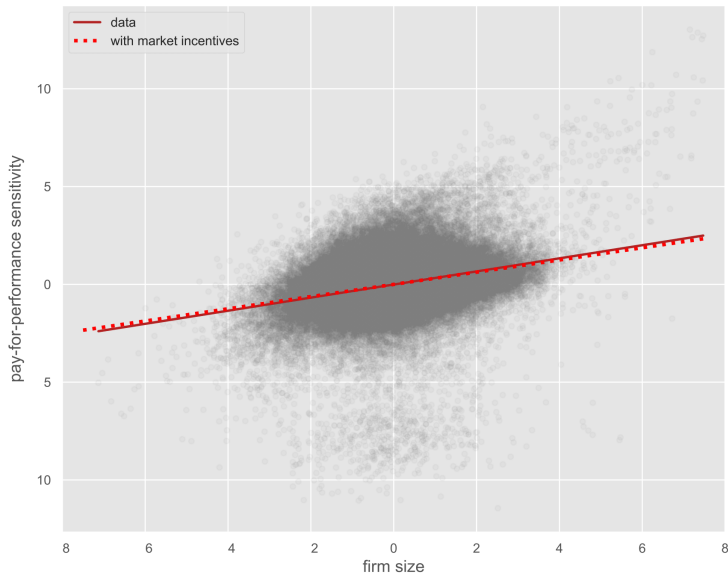
| Moments                                  | Data   | Model   | Estimates             | Standard Error |
|--|--------|---------|-----------------------|----------------|
| Exit Rate                                | 0.0691 | 0.0691  | $\eta = 0.0695$       | 0.0127         |
| J-J Transition Rate                      | 0.0498 | 0.0473  | $\lambda_1 = 0.3164$  | 0.0325         |
| $\hat{\rho}_{\text{profit}}$             | 0.7683 | 0.6299  | $\rho_z = 0.8004$     | 0.0366         |
| <i>Mean</i> (profit)                     | 0.1260 | 0.1144  | $\mu_z = 0.0279$      | 0.0014         |
| <i>Var</i> (profit)                      | 0.0144 | 0.0160  | $\sigma_z^2 = 0.1198$ | 0.0044         |
| -----                                    |        |         |                       |                |
| <i>Mean</i> (log(size))                  | 7.4515 | 7.4806  | $\mu_s = 1.2356$      | 0.0365         |
| <i>Var</i> (log(size))                   | 2.3060 | 2.1610  | $\sigma_s = 2.5795$   | 0.1211         |
| -----                                    |        |         |                       |                |
| <i>Mean</i> (log(total pay))             | 7.2408 | 7.2665  | $\alpha_0 = -1.5534$  | 0.0147         |
| <i>Var</i> (log(total pay))              | 1.1846 | 0.8960  | $\alpha_1 = 0.5270$   | 0.0217         |
| $\beta_{\text{total pay} - \text{size}}$ | 0.3830 | 0.2822  |                       |                |
| -----                                    |        |         |                       |                |
| $\beta_{\text{PPS} - \text{total pay}}$  | 1.1063 | 1.1997  | $\sigma = 1.1038$     | 0.0030         |
| <i>Mean</i> (log(PPS))                   | 8.4994 | 8.478   | $c = 0.0814$          | 0.0259         |
| <i>Var</i> (log(PPS))                    | 3.4438 | 3.35872 |                       |                |

# Data

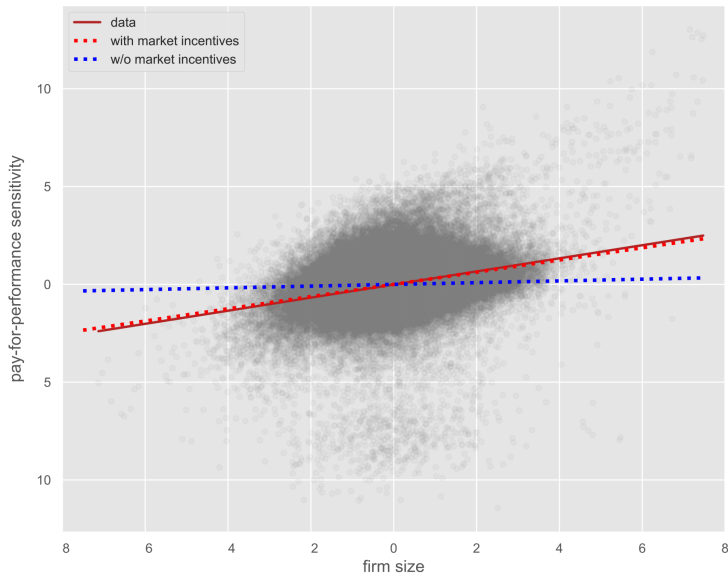




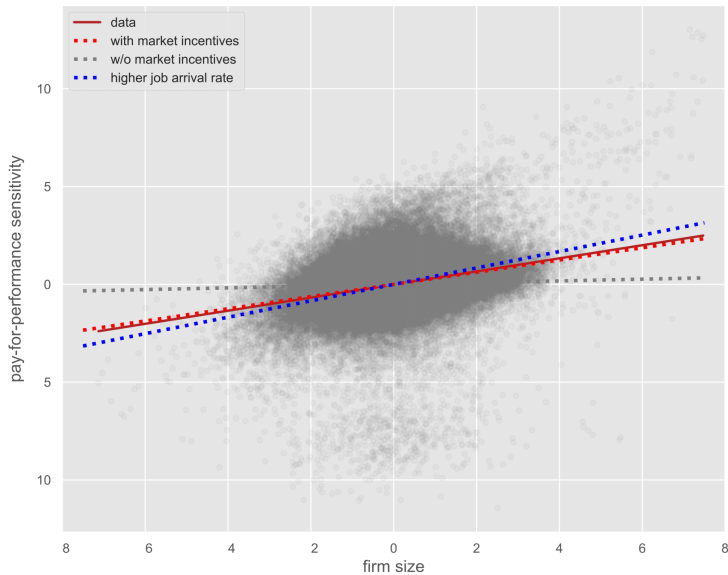
# Predictions — model



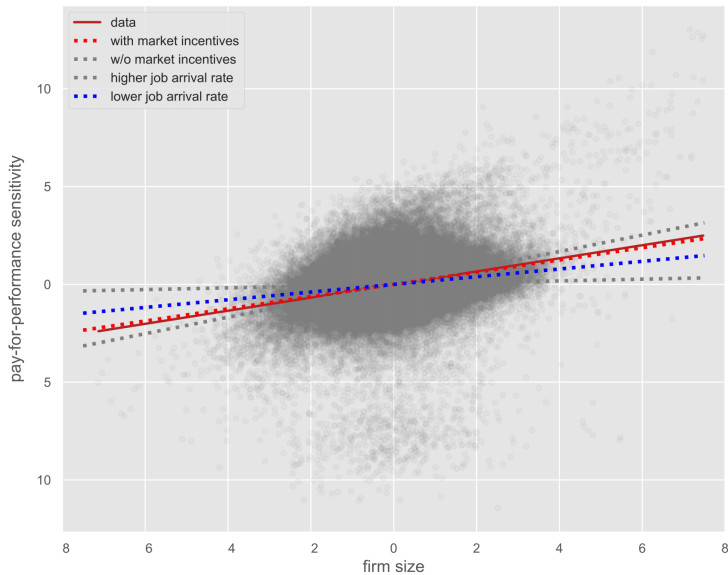
## Predictions — without labor market incentives



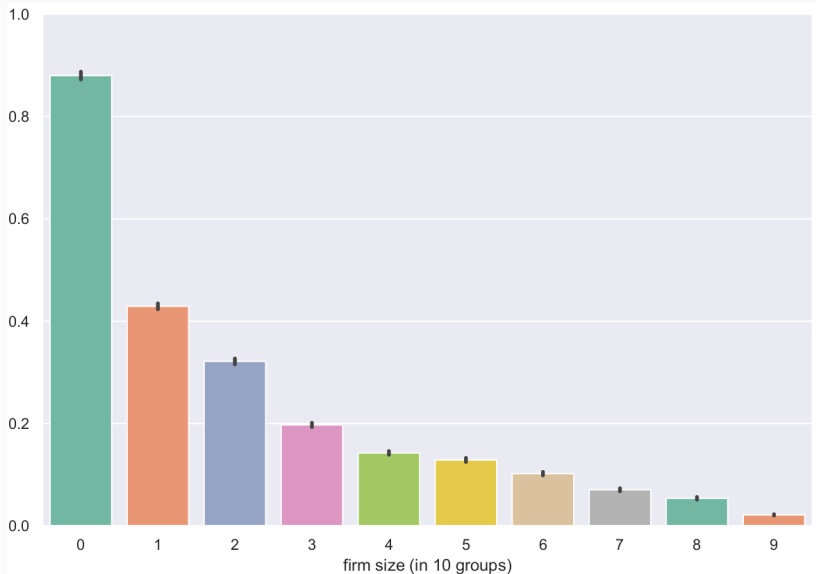
## Predictions — with higher job arrival rate



## Predictions — with lower job arrival rate



## Fraction of labor market incentives



## The pre-1970 puzzle

---

## The pre-1970 puzzle

Frydman and Saks (2010) document that since the mid-1970s:

1. sharp increase in total and incentive pay.
2. more inequality among executives
3. higher correlation between compensation and firm size

## The pre-1970 puzzle

Frydman and Saks (2010) document that since the mid-1970s:

1. sharp increase in total and incentive pay.
2. more inequality among executives
3. higher correlation between compensation and firm size

These facts can be quantitatively explained by an exogenous increase in higher job arrival rate  $\lambda_1$ .

- Huson et al. (2001), Murphy and Zabojnik (2007): An increasing number of CEO openings have been filled through external hires.
- Frydman (2005): Executive jobs have increasingly placed greater emphasis on general rather than firm-specific skills.



## Calibration for moments in the 1970s and 1990s

| Moments<br>(dollar value in year 2000) | Data   |         | Model              |                   |
|--|--------|---------|--------------------|-------------------|
|  | 1970s  | 1990s   | $\lambda_1 = 0.05$ | $\lambda_1 = 0.4$ |
| Mean total pay (thousand)              | 1090   | 4350    | 985                | 4296              |
| Mean size (million)                    | -      | -       | 2426               | 5710              |
| Mean PPS (thousand)                    | 21.743 | 120.342 | 24.972             | 125.310           |
| $\beta_{totalpay-size}$                | 0.199  | 0.264   | 0.175              | 0.240             |
| Percentiles of total pay (thousand)    |        |         |                    |                   |
| 25th percentile                        | 640    | 1350    | 109                | 1217              |
| 50th percentile                        | 930    | 2360    | 478                | 2957              |
| 75th percentile                        | 1310   | 4430    | 1596               | 5860              |

## A conjecture by Gabaix and Landier (2008)

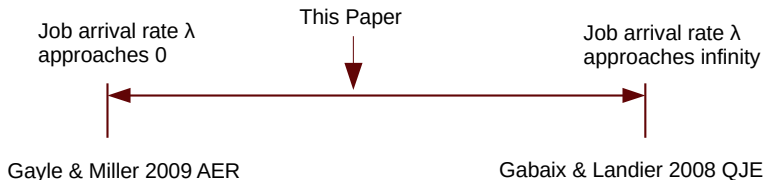
Another possibility is that the U.S. CEO market before 1970 was more like the contemporary Japanese CEO market. Companies would groom their CEOs in-house and not poach them from other firms. Hence, this labor market would just not be described well by our model. We conclude that our frictionless benchmark model does not apply unamended to the pre-1970 sample and leave the search for a fuller model to future research.

— Gabaix and Landier (2008)

## Conclusion

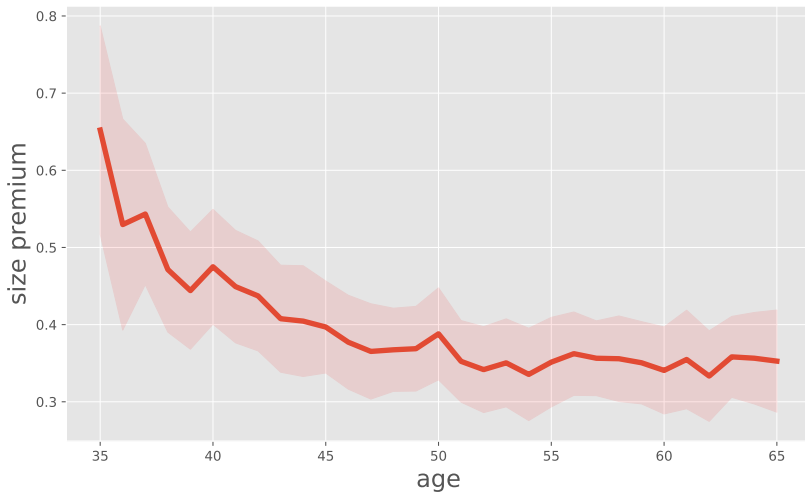
---

# A model links GM and GL



- In terms of **compensation level**, a “weighted sum” of GM and GL
- In terms of **incentives**, the interaction gives labor market incentives

## Firm size incentive premium over age



## Takeaways

- Moral hazard problem is not necessarily more severe in larger firms.
- Small and medium firms take advantage of the labor market incentives.
- Managerial labor market competition explains firm size incentive premium.

**Thanks you for your attention.**

`http://bohuecon.github.io`



# Contracting Problem

Firms choose  $\{w, W(z', s')\}$  to maximize profits

$$\Pi(z, s, V) = \max_{w, W(z', s')} \sum_{z' \in \mathbb{Z}} \sum_{s' \in \mathbb{S}} \left[ y(s, z') - w + \tilde{\beta} \Pi(z', s, W(z', s')) \right] \tilde{F}(s') \Gamma(z'|z)$$

subject to

$$V = u(w) - c + \tilde{\beta} \sum_{z' \in \mathbb{Z}} \sum_{s' \in \mathbb{S}} W(z', s') \tilde{F}(s') \Gamma(z'|z), \quad (\text{PKC})$$

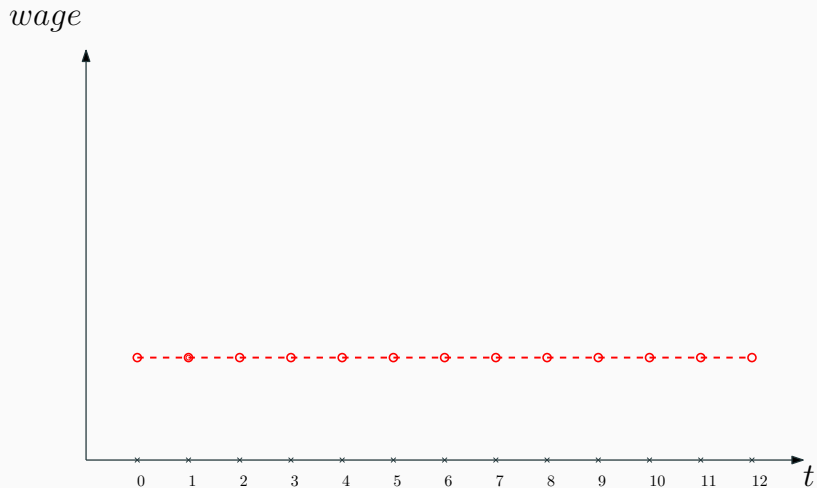
$$\tilde{\beta} \sum_{z' \in \mathbb{Z}} \sum_{s' \in \mathbb{S}} W(z', s') \tilde{F}(s') \left( \Gamma(z'|z) - \Gamma^s(z'|z) \right) \geq c, \quad (\text{IC})$$

$$W(z', s') \geq \min\{\overline{W}(z', s'), \overline{W}(z', s)\}, \quad (\text{PC-Executive})$$

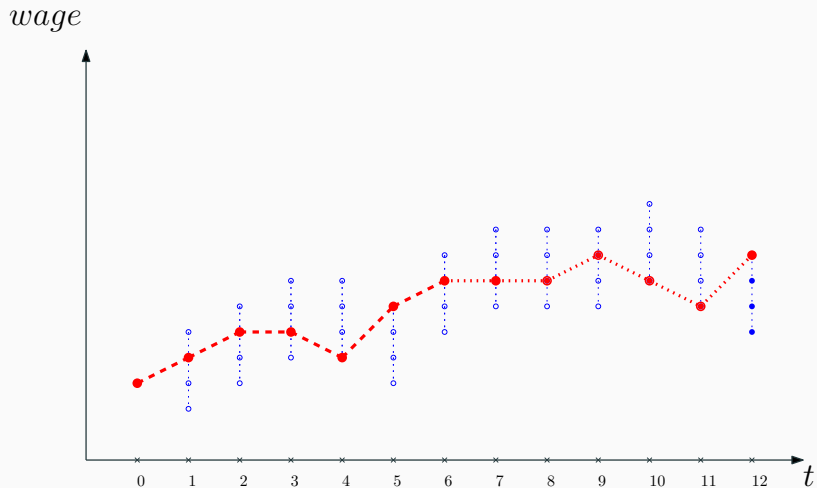
$$W(z', s') \leq \overline{W}(z', s). \quad (\text{PC-Firm})$$



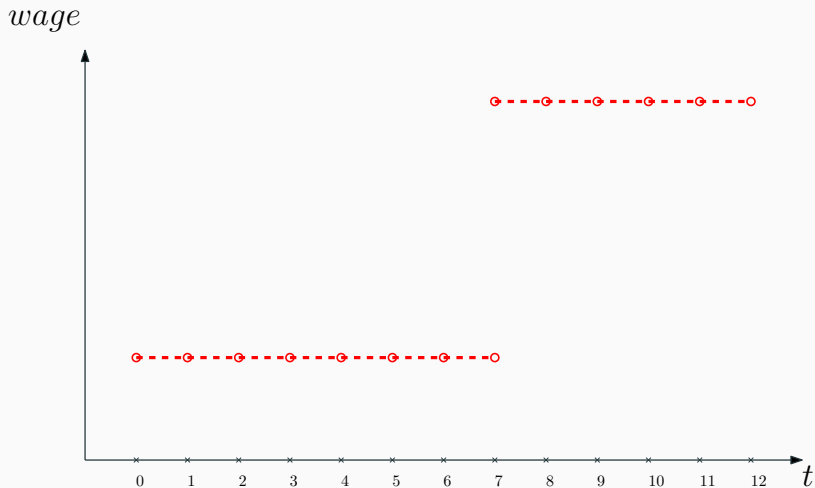
# No Moral Hazard, Full Commitment



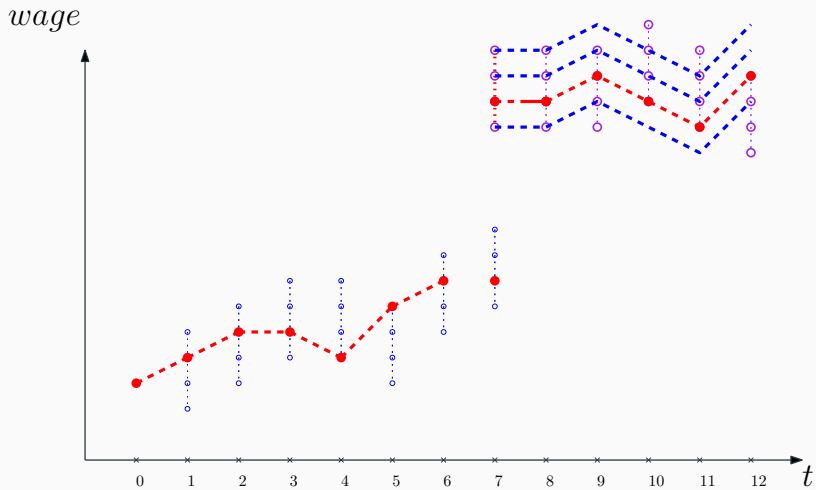
# Only Moral Hazard



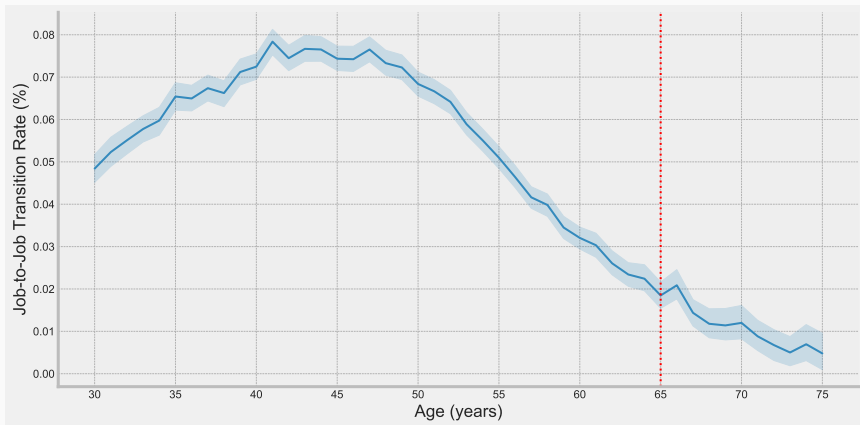
# Only Limited Commitment



# Optimal Contract

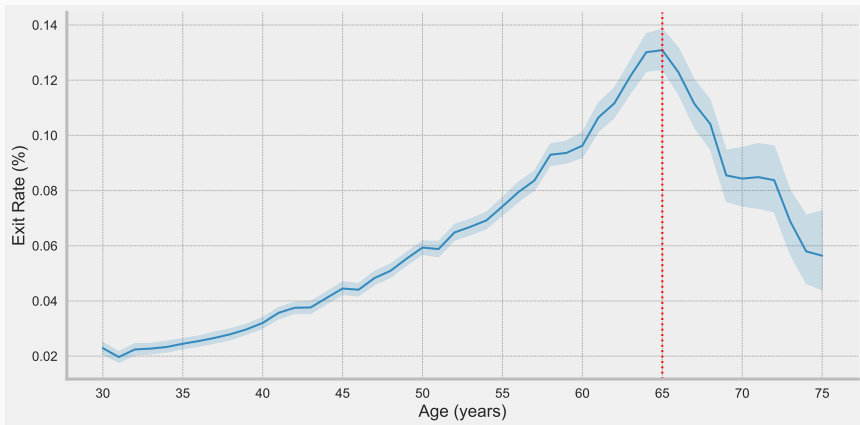


# Job-to-job transition rate over age



[Back](#)

# Exit rate over age



[Back](#)

# Climb the Job Ladder

Table 3: Change of firm size upon job-to-job transitions

| <i>Panel A: All executives</i>    |            |                             |                             |
|-----------------------------------|------------|-----------------------------|-----------------------------|
| Firm size proxy                   | Total obs. | Firm size decrease obs. (%) | Firm size increase obs. (%) |
| Market Cap                        | 2567       | 985 (39%)                   | 1582 (61%)                  |
| Sales                             | 2617       | 1051 (40%)                  | 1566 (60%)                  |
| Book Assets                       | 2616       | 1038 (40%)                  | 1578 (60%)                  |
| <i>Panel B: Across age groups</i> |            |                             |                             |
| Age groups                        | Total obs. | Firm size decrease obs. (%) | Firm size increase obs. (%) |
| ≤ 40                              | 100        | 34 (34%)                    | 66 (66%)                    |
| [40, 45)                          | 381        | 135 (35%)                   | 246 (65%)                   |
| [45, 50)                          | 701        | 262 (37%)                   | 439 (63%)                   |
| [50, 55)                          | 766        | 304 (40%)                   | 462 (60%)                   |
| [55, 60)                          | 261        | 179 (43%)                   | 82 (67%)                    |
| [60, 65)                          | 73         | 52 (39%)                    | 21 (61%)                    |
| [65, 70)                          | 30         | 7 (25%)                     | 23 (75%)                    |
| ≥ 70                              | 6          | 1 (16%)                     | 5 (84%)                     |

Table 4: Job-to-Job Transitions and Firm Size

|                       | Job-to-Job Transition  |                       |
|-----------------------|------------------------|-----------------------|
|                       | (1)                    | (2)                   |
| log(Firm Size)        | 0.917****<br>(0.0109)  | 0.972*<br>(0.0139)    |
| Age                   | 0.985****<br>(0.00273) | 0.967***<br>(0.0112)  |
| log(tdc1)             |                        | 0.830****<br>(0.0150) |
| Market-Book Ratio     | 0.942****<br>(0.0150)  | 0.939****<br>(0.0157) |
| Market Value Leverage | 1.033**<br>(0.0139)    | 1.035**<br>(0.0142)   |
| Profitability         | 0.913****<br>(0.0197)  | 0.905****<br>(0.0199) |
| Year FE               | Yes                    | Yes                   |
| Industry FE           | Yes                    | Yes                   |
| N                     | 154635                 | 118119                |
| chi2                  | 496.1                  | 491.4                 |



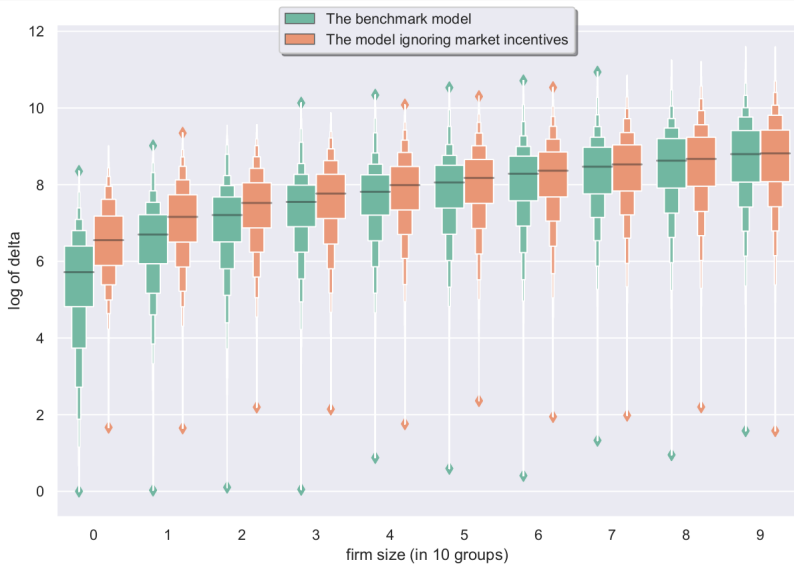
Table 1: Compensation growth increases with firm size

|   | $\Delta \log(tdc1)$   |                       |                        |                        |                        |                             |
|---|-----------------------|-----------------------|------------------------|------------------------|------------------------|-----------------------------|
|   | (1)                   | (2)                   | (3)                    | (4)                    | (5)                    | (6)                         |
| $\log(firm\ size)_{-1}$                         | 0.112***<br>(0.00903) | 0.154***<br>(0.0129)  | 0.108***<br>(0.00183)  | 0.107***<br>(0.00189)  | 0.141***<br>(0.00177)  | 0.127***<br>(0.00489)       |
| $\log(firm\ size)_{-1}$<br>$\times EE90$        |                       |                       | 0.0711*<br>(0.0403)    |                        |                        |                             |
| $\log(firm\ size)_{-1}$<br>$\times EE190$       |                       |                       |                        | 0.0759**<br>(0.0353)   |                        |                             |
| $\log(firm\ size)_{-1}$<br>$\times gai$         |                       |                       |                        |                        | 0.0233***<br>(0.00546) |                             |
| $\log(firm\ size)_{-1}$<br>$\times inside\ CEO$ |                       |                       |                        |                        |                        | -0.000232***<br>(0.0000696) |
| $\log(tdc1)_{-1}$                               | -0.290***<br>(0.0200) | -0.390***<br>(0.0262) | -0.251***<br>(0.00173) | -0.251***<br>(0.00173) | -0.304***<br>(0.00267) | -0.253***<br>(0.00173)      |
| Dummies   | X                     | X                     | X                      | X                      | X                      | X                           |
| Other controls                                  |                       | X                     | X                      | X                      | X                      | X                           |
| Observations                                    | 129068                | 106819                | 106820                 | 106820                 | 58188                  | 106820                      |
| adj. $R^2$                                      | 0.157                 | 0.216                 | 0.260                  | 0.260                  | 0.233                  | 0.262                       |

Table 2: Performance-based incentives increases with firm size

|  | log( $\delta$ )      |                      |                        |                        |                        |                          |
|--|----------------------|----------------------|------------------------|------------------------|------------------------|--------------------------|
|  | (1)                  | (2)                  | (3)                    | (4)                    | (5)                    | (6)                      |
| $\log(\text{firm size})$                               | 0.604***<br>(0.0141) | 0.347***<br>(0.0247) | 0.525***<br>(0.00512)  | 0.529***<br>(0.00499)  | 0.561***<br>(0.00310)  | 0.571***<br>(0.0139)     |
| $\log(\text{firm size})$<br>$\times \text{EE90}$       |                      |                      | 0.359*<br>(0.118)      |                        |                        |                          |
| $\log(\text{firm size})$<br>$\times \text{EE190}$      |                      |                      |                        | 0.415**<br>(0.101)     |                        |                          |
| $\log(\text{firm size})$<br>$\times \text{gai}$        |                      |                      |                        |                        | 0.0648***<br>(0.00156) |                          |
| $\log(\text{firm size})$<br>$\times \text{inside CEO}$ |                      |                      |                        |                        |                        | -0.000458*<br>(0.000202) |
| $\log(\text{tdc1})$                                    |                      | 0.609***<br>(0.0350) | -0.251***<br>(0.00173) | -0.251***<br>(0.00173) | -0.304***<br>(0.00267) | -0.253***<br>(0.00173)   |
| Dummies  | X                    | X                    | X                      | X                      | X                      | X                        |
| Other controls   |                      | X                    | X                      | X                      | X                      | X                        |
| Observations   | 146747               | 128006               | 125858                 | 125858                 | 75747                  | 125858                   |
| adj. $R^2$   | 0.442                | 0.514                | 0.521                  | 0.521                  | 0.531                  | 0.521                    |

# If labor market incentives are ignored ...



CEO's of "Small Firms" in S&P 500

tdc1: total compensation

delta: dollar-percentage incentive

|  | Company                   | Market Cap<br>millions | tdc1<br>000's | delta<br>000's/% |
|--|---------------------------|------------------------|---------------|------------------|
|  | INCYTE CORP               | 446.408                | 2432.9734     | 60.939838        |
|  | WESTROCK CO               | 547.828                | 2800.668      | 130.96215        |
|  | ENVISION HEALTHCARE CORP  | 678.6906               | 1777.991      | 217.729          |
|  | PRICELINE GROUP INC       | 886.0817               | 1775.531      | 165.73476        |
|  | LKQ CORP                  | 889.9763               | 2602.093      | 473.70974        |
|  | REGENERON PHARMACEUTICALS | 897.3801               | 3094.134      | 566.14187        |
|  | SKYWORKS SOLUTIONS INC    | 1113.547               | 2638.243      | 128.10688        |
|  | CENTENE CORP              | 1130.155               | 4584.605      | 344.02299        |
|  | ALASKA AIR GROUP INC      | 1194.977               | 950.098       | 99.525198        |
|  | HOLOGIC INC               | 1276.448               | 2709.708      | 428.10996        |
|  | ACUITY BRANDS INC         | 1328.171               | 1102.528      | 133.42285        |
|  | ANSYS INC                 | 1368.129               | 3738.803      | 431.01562        |
|  | GARTNER INC               | 1474.909               | 8945.338      | 158.65569        |

CEO's of "Large Firms" in S&P 500

tdc1: total compensation

delta: dollar-percentage incentives

|  | Company                     | Market Cap<br>millions | tdc1<br>000's | delta<br>000's/% |
|--|-----------------------------|------------------------|---------------|------------------|
|  | TIME WARNER INC             | 79965.89               | 18545.215     | 1212.9513        |
|  | CONOCOPHILLIPS              | 80163.26               | 35442.729     | 4520.5571        |
|  | UNITED PARCEL SERVICE INC   | 82439.55               | 3120.042      | 340.01132        |
|  | VERIZON COMMUNICATIONS INC  | 83233.88               | 19425         | 861.09722        |
|  | HOME DEPOT INC              | 86128.2                | 35750.103     | 2014.3633        |
|  | AT&T INC                    | 94944.89               | 17283.529     | 1666.3201        |
|  | COCA-COLA CO                | 95494.39               | 12781.61      | 425.62199        |
|  | PEPSICO INC                 | 97836.48               | 15268.415     | 2919.7995        |
|  | CISCO SYSTEMS INC           | 121238.6               | 16269.85      | 5981.3853        |
|  | CHEVRON CORP                | 126749.6               | 13125.882     | 1106.8351        |
|  | INTL BUSINESS MACHINES CORP | 129381.2               | 21693.615     | 1298.8777        |
|  | INTEL CORP                  | 147738.2               | 6101.835      | 1874.5755        |
|  | WAL-MART STORES INC         | 192048.2               | 16652.894     | 1465.7708        |
|  | EXXON MOBIL CORP            | 344490.6               | 48922.808     | 3843.027         |

## References

---

- Edmans, Alex, Xavier Gabaix, and Augustin Landier (2009), “A multiplicative model of optimal ceo incentives in market equilibrium.” The Review of Financial Studies.
- Frydman, Carola and Raven E Saks (2010), “Executive compensation: A new view from a long-term perspective, 1936–2005.” The Review of Financial Studies, 23, 2099–2138.
- Gabaix, Xavier and Augustin Landier (2008), “Why has ceo pay increased so much?” The Quarterly Journal of Economics, 123, 49–100.
- Gayle, George-Levi, Limor Golan, and Robert A Miller (2015), “Promotion, turnover, and compensation in the executive labor market.” Econometrica, 83, 2293–2369.

Gayle, George-Levi and Robert A Miller (2009), “Has moral hazard become a more important factor in managerial compensation?” American Economic Review, 99, 1740–69.

Tervio, Marko (2008), “The difference that ceos make: An assignment model approach.” American Economic Review, 98, 642–68.