

Are Managers Paid for Market Power?

RENJIE BAO¹ JAN DE LOECKER² JAN EECKHOUT³

¹ Princeton

² KU Leuven

³ UPF Barcelona

SOLE

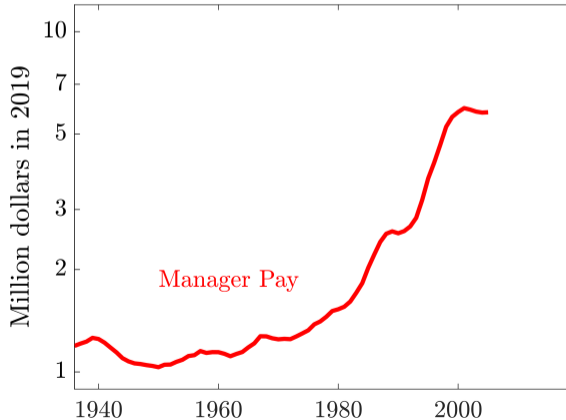
May 12, 2023

MOTIVATION

- Increase in **income inequality** – most in **top percentiles** (Piketty and Saez, 2003)

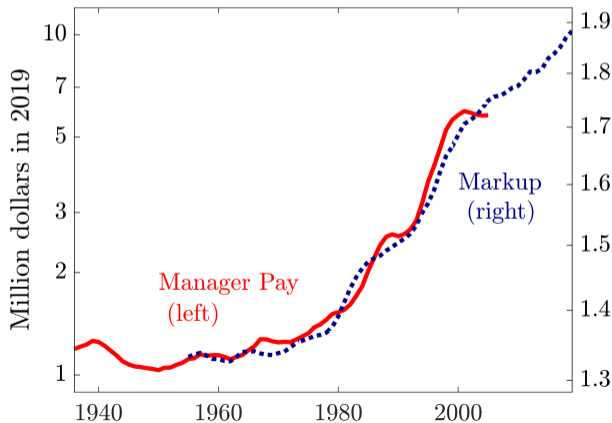
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- Increase in **income inequality** – most in **top percentiles** (Piketty and Saez, 2003)
- Manager pay: top earnings; rise since the late 1970s (Frydman and Saks, 2010)



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MANAGER PAY FROM FIRM SIZE AND MARKET POWER

- Decompose Manager Pay into two channels
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	log Manager Pay					
	<i>A. size = sales</i>		<i>B. size = COGS</i>		<i>C. size = employ</i>	
	(1)	(2)	(3)	(4)	(5)	(6)
log Firm Size	0.438 (0.003)	0.450 (0.003)	0.387 (0.003)	0.450 (0.003)	0.391 (0.003)	0.410 (0.003)
log Markup		0.405 (0.015)		0.854 (0.016)		0.472 (0.016)
R-squared	0.551	0.565	0.502	0.565	0.489	0.508
Observations	32,930	31,982	32,930	31,982	32,930	31,982

MANAGER PAY FROM FIRM SIZE AND MARKET POWER

- Decompose Manager Pay into two channels
 1. **Firm Size**: conventional wisdom
 2. **Market Power**: new mechanism — *outperform competitors*
- Method
 1. Structural model: a combination of
 - **Competitive matching market** (Gabaix and Landier, 2008; Terviö, 2008)
 - **Oligopolistic** competition (Atkeson and Burstein, 2008) ⇒ **compete for market power**
 2. Estimation
 - Technology: productivity and complementarity
 - Market structure: the number of firms competing with each other

CONTRIBUTION OF FIRM SIZE AND MARKET POWER

- The rise of Manager Pay:
 1. On average, **Market Power** 45.8% vs. **Firm Size** 54.2%
 2. Over time, market power contributes from **38.0%** (1994) to **48.8%** (2019)
 - accounts for **57.8%** of increase in Pay

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 2. Over time, market power contributes from 38.0% (1994) to 48.8% (2019)
 - accounts for 57.8% of increase in Pay
- Cross-section of managers: *heterogeneity*
 - Low-ability managers: **Firm Size** channel dominates $\approx 100\%$
 - Top-ability managers: **Market Power** channel dominates 80.3%

Model

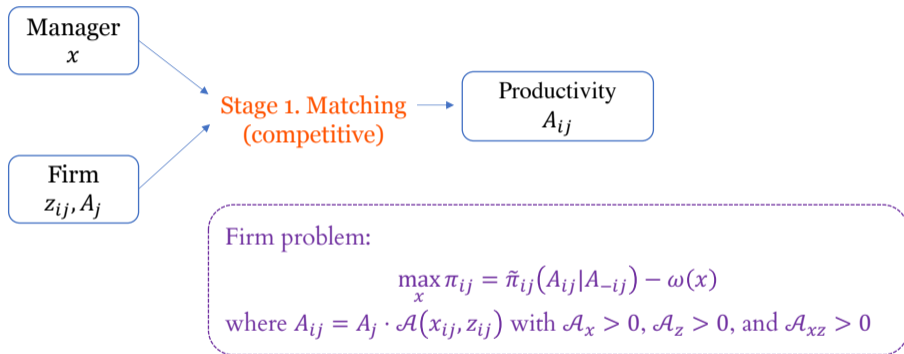
A SKETCH OF SETUP – PRIMITIVES

Manager
 x

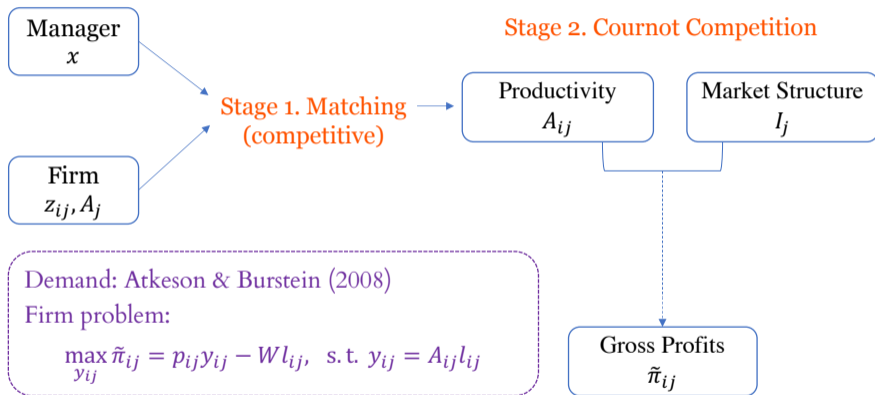
Firm
 z_{ij}, A_j

- Same measure of firms and managers
- Market structure
 - A continuum of markets $j \in [0,1]$
 - I_j firms in market j
- Heterogeneity between managers, firms and markets

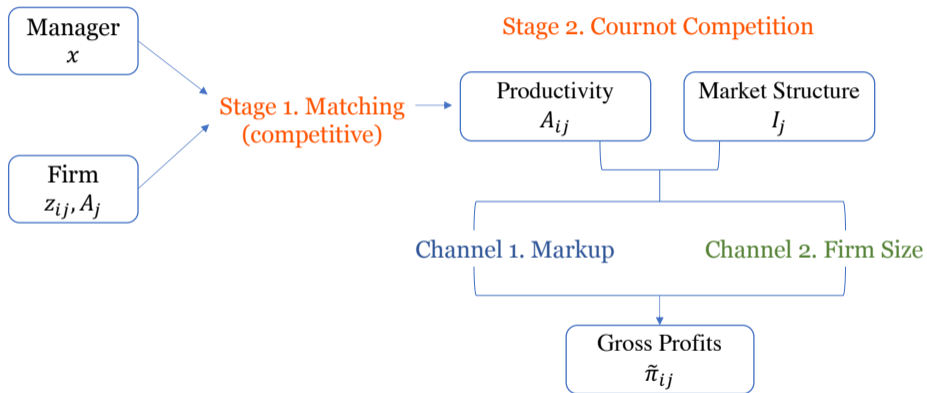
A SKETCH OF SETUP – MANAGER MARKET



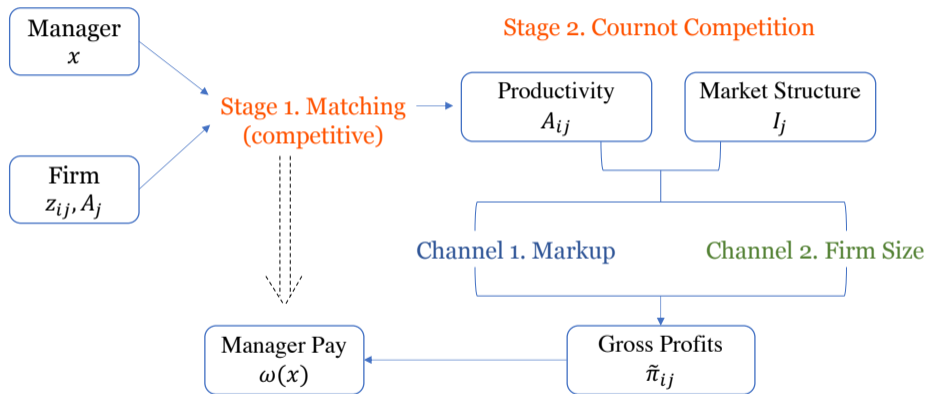
A SKETCH OF SETUP - OUTPUT MARKET



A SKETCH OF SETUP - OUTPUT MARKET



A SKETCH OF SETUP - DETERMINANTS OF MANAGER PAY



MANAGER PAY - FIRST ORDER CONDITIONS

Stage 2:
$$p_{ij} \underbrace{(1 + \varepsilon_{ij}^P)}_{\mu_{ij}^{-1}} = W/A_{ij} \Leftrightarrow \tilde{\pi}_{ij} = (\mu_{ij} - 1)Wl_{ij}$$

Stage 1:
$$\max_x \pi_{ij} = \tilde{\pi}_{ij} - \omega(x) \Rightarrow \frac{\partial \tilde{\pi}_{ij}}{\partial A_{ij}} \frac{\partial A_{ij}}{\partial x_{ij}} = \frac{d}{dx} \omega(x_{ij})$$

MANAGER PAY - FIRST ORDER CONDITIONS

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- Managers contribute in two channels: ▶ Elasticity

$$\tilde{\pi}_{ij} = (\mu_{ij} - 1)Wl_{ij} \quad \Rightarrow \quad \frac{\partial \tilde{\pi}_{ij}}{\partial A_{ij}} = \underbrace{\frac{\partial \mu_{ij}}{\partial A_{ij}} Wl_{ij}}_{\text{Market power}} + \underbrace{(\mu_{ij} - 1)W \frac{\partial l_{ij}}{\partial A_{ij}}}_{\text{Firm size}}$$

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$$\Rightarrow \quad \omega(x_{ij}) = \omega_0 + \int_{\underline{x}}^{x_{ij}} \left[\frac{\partial \mu_{i'j'}}{\partial A_{i'j'}} Wl_{i'j'} + (\mu_{i'j'} - 1) W \frac{\partial l_{i'j'}}{\partial A_{i'j'}} \right] \times \left[\frac{\partial A_{i'j'}}{\partial x_{ij}} \right] dx_{i'j'}$$

MATCHING - ALGORITHM WITH EXTERNALITY

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- But, **externality** from competition
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- Complementarity \Rightarrow PAM between managers and firms...
- But, **externality** from competition
 - Productivity is not the correct criterion for firm ranking
 - Impossible to find the exact matching with **a large number of firms**
- Approximate stable matching: *find a proxy for firms' profitability with externality*
 1. Compute $\partial\tilde{\pi}_{ij}/\partial x_{ij}|_{\bar{x}}$ by assigning all firms the *average* manager
 2. Construct PAM allocation between the manager types x and $\partial\tilde{\pi}_{ij}/\partial x_{ij}|_{\bar{x}}$

▶ Efficiency

Quantitative Exercise

ASSUMPTIONS & PARAMETRIZATION

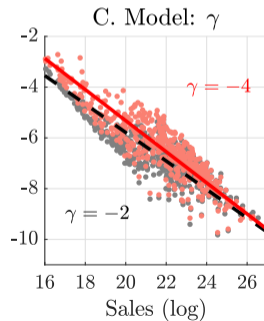
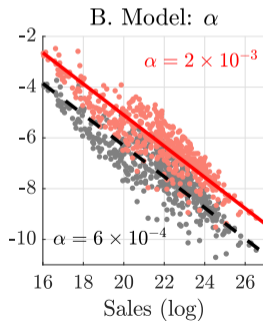
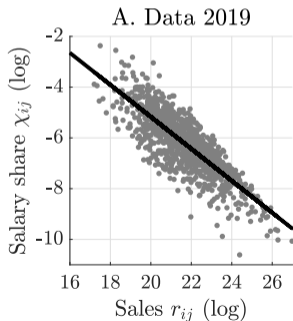
- Simulated Methods of Moments - year by year
- Market structure: $I_j \sim \mathcal{N}(m_I, \sigma_I)$ and $I_j \in \{1, 2, \dots\}$
- Types $\{x_{ij}, z_{ij}, A_j\}$: independently drawn from lognormal distribution
- TFP – CES form:

$$A_{ij} = A_j \left[\alpha x_{ij}^\gamma + (1 - \alpha) z_{ij}^\gamma \right]^{\frac{1}{\gamma}},$$

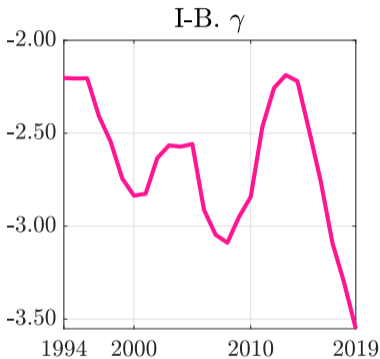
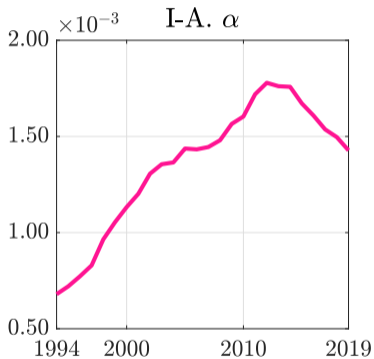
\Rightarrow flexibility of CES setup

TARGETED MOMENTS – MANAGER RELATED PARAMETERS

		Key Parameter	Meaning
I. Match	Average salary share	α	$A_{ij} = A_j \left[\alpha x_{ij}^\gamma + (1 - \alpha) z_{ij}^\gamma \right]^{\frac{1}{\gamma}}$
	Sales elasticity of salary share	γ	



ESTIMATION – MANAGER RELATED PARAMETERS



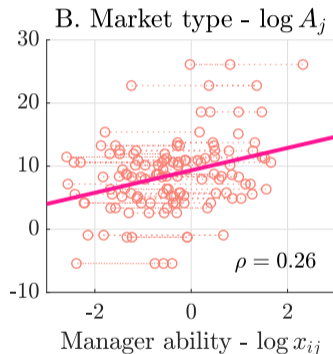
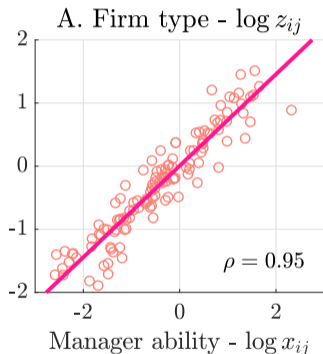
ESTIMATION - OTHER PARAMETERS

- Other parameters are consistent with the literature ▶ Identification
 - Increasingly concentrated market structure
 - Higher heterogeneity across firms

Main Results

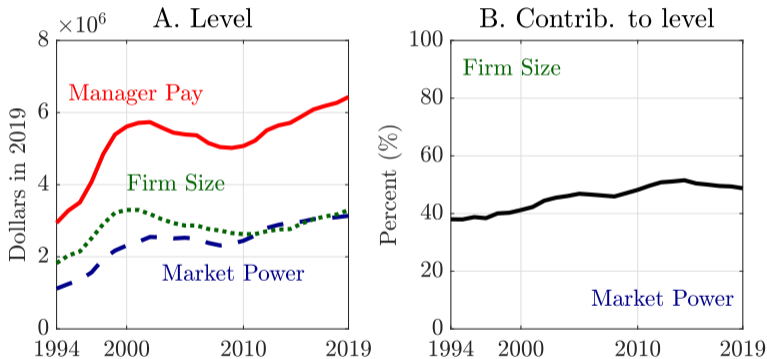
MATCHING CORRELATION

Estimated Economy (2019)



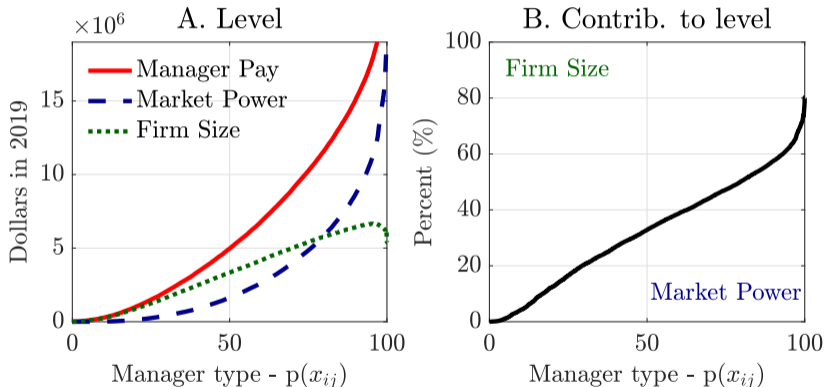
MARKET POWER VS. FIRM SIZE

Time Series



MARKET POWER VS. FIRM SIZE

Crossectional Heterogeneity (2019)



CONCLUSION

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Increasingly so

- **Market Power** contributes 45.8% to Manager Pay, from 38.0% (1994) to 48.8% (2019)
- Heterogeneity: the bottom (all via **Firm Size**) and the top (80.3% via **Market Power**)
- A general story for all managers and superstar workers (coders, athletes,...)

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Appendix

ROBUSTNESS & ADDITIONAL EXERCISES

- Elasticity of productivity ▶ Elasticity
- Cournot vs. Bertrand ▶ Bertrand
- An alternative decomposition: interpreting revenue as firm size ▶ Revenue

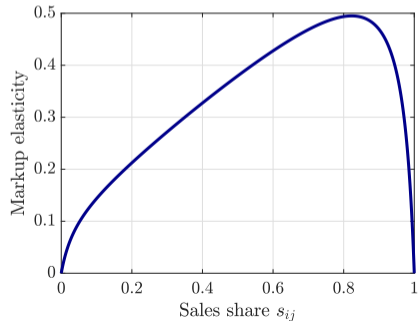
MARKET POWER VS. FIRM SIZE

Markup Elasticity of Productivity

$$\varepsilon_{ij}^{\mu} := \frac{\partial \mu_{ij}}{\partial A_{ij}} \frac{A_{ij}}{\mu_{ij}} = \underbrace{\left[\frac{(\eta - 1)(1 - \phi_{ij})}{1 + (\eta - 1)\left(\frac{1}{\theta} - \frac{1}{\eta}\right)\mu_{ij}s_{ij}} \right]}_{\frac{\partial s_{ij}}{\partial A_{ij}} \frac{A_{ij}}{s_{ij}}, \downarrow \text{ in } s_{ij}} \times \underbrace{\left[\left(\frac{1}{\theta} - \frac{1}{\eta}\right)\mu_{ij}s_{ij} \right]}_{\frac{d\mu_{ij}}{ds_{ij}} \frac{s_{ij}}{\mu_{ij}}, \uparrow \text{ in } s_{ij}} \in [0, 1)$$

- ϕ_{ij} is a weight for firm's importance
- First increase with s_{ij} , then decreases, where

$$\lim_{s_{ij} \rightarrow 0} \varepsilon_{ij}^{\mu} = \lim_{s_{ij} \rightarrow 1} \varepsilon_{ij}^{\mu} = 0$$



MARKET POWER VS. FIRM SIZE

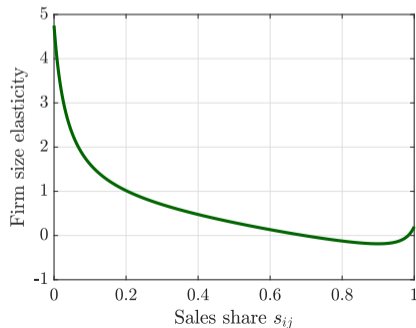
Firm Size Elasticity of Productivity

$$\varepsilon_{ij}^l := \frac{\partial l_{ij}}{\partial A_{ij}} \frac{A_{ij}}{l_{ij}} = \underbrace{\phi_{ij} [\theta - 1]}_{\text{Monopoly}} + (1 - \phi_{ij}) \underbrace{\left[\frac{\eta}{1 + (\frac{1}{\theta} - \frac{1}{\eta})(\eta - 1)\mu_{ij}s_{ij}} - 1 \right]}_{\text{Strategic interaction, } \downarrow \text{ in } A_{ij}},$$

- ε_{ij}^l can be negative when s_{ij} is moderately large
- First decreases with s_{ij} , then increases, with

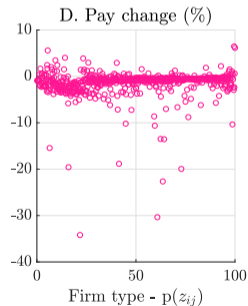
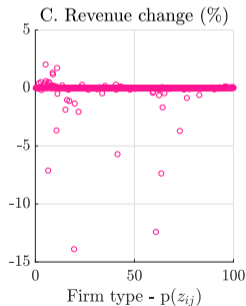
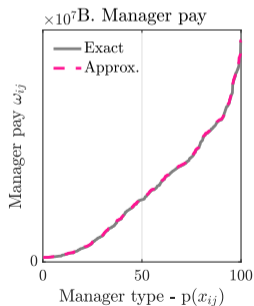
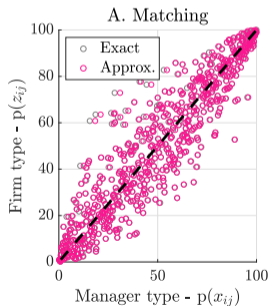
$$\lim_{s_{ij} \rightarrow 0} \varepsilon_{ij}^l = \eta - 1 > 0 \quad , \quad \lim_{s_{ij} \rightarrow 1} \varepsilon_{ij}^l = \theta - 1 > 0$$

◀ Back

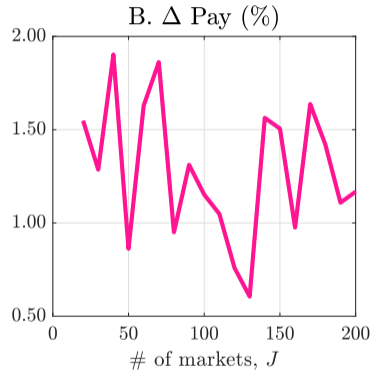


EFFICIENCY: MATCHING ALGORITHM

- An example with $J = 200$
 - The average revenue difference is 0.001%
 - The average manager pay difference is 1.17%



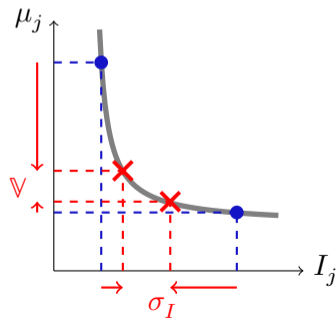
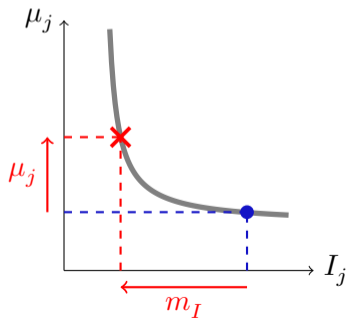
EFFICIENCY: MATCHING ALGORITHM



TARGETED MOMENTS

II. Market

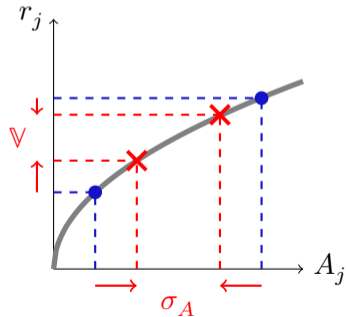
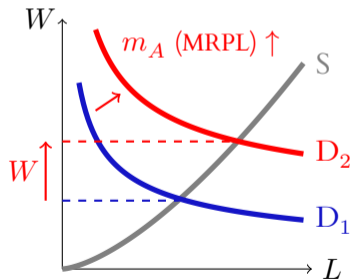
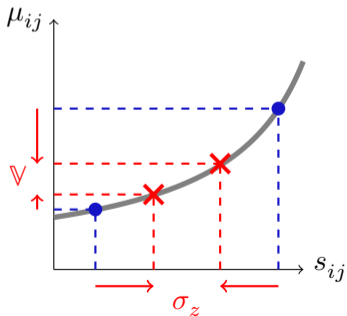
		Moment(s)	Key Parameter(s)
II. Market	Average markup	$\mathbb{E}(\mu_{ij})$	m_I
	Variance markup (between)	$\mathbb{V}(\log \mu_j)$	σ_I



TARGETED MOMENTS

III. Firm

		Moment(s)	Key Parameter(s)
III. Firm	Variance markup (within)	$\mathbb{V}(\log \mu_{ij} j)$	σ_z
	Average worker's wage	$\mathbb{E}(W)$	m_A
	Variance sales	$\mathbb{V}(\log r_{ij})$	σ_A



TARGETED MOMENTS

IV. Aggregates

		Moment(s)	Key Parameter(s)
IV. Aggregates	Average employment	$\mathbb{E}(l_{ij})$	$\bar{\varphi}$
	Average manager salary	$\mathbb{E}_x(\omega(x))$	ψ
	Manager salary, p1	$\omega(x p1)$	ω_0