

# “Firming up inequality”

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## Introduction – Motivation

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- ▶ Mostly due, in equal share, to a compositional change : sorting and segregation
- ▶ Massive, matched employer-employee database
- (1) Variance decomposition : within vs. between-firm
- (2) AKM methodology
  - Some exploration of firm size distribution : within firm variance happen in mega-firms.

## Great data set

- ▶ Massive database covering almost all workers in the U.S.
  - All W-2 form from U.S. Social Security administration
  - Start in 1981 (measurement issue) until 2013, 5 periods of 7 years
  - Yearly annual earnings in 2013 \$ (PSE deflator)
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  - Sample restrictions :
    - Employed : with earnings at least the amount of working 13 weeks for 40 hours at minimum wage (\$ 7.25)
    - Men (for computing reasons), between 20 and 60 years
    - Exclusion of public administration and educational services
    - Firm : EIN corporate unit for tax : less disaggregated than establishments
      - 30 millions estbl. in U.S. LBD vs. 6 millions of EIN

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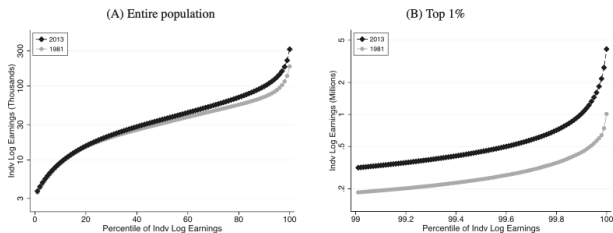


FIGURE I  
Cumulative Distributions of Annual Earnings in the SSA Data

## Variance decomposition

- ▶ Cross-sectional variance of log-earning : decomposed into Between vs. Within firms

$$y_t^{i,j} \equiv \bar{y}_t^j + [y_t^{i,j} - \bar{y}_t^j]$$
$$\text{Var}(y_t^{i,j}) = \text{Var}_j(\bar{y}_t^j) + \sum_j \omega_j \text{Var}(y_t^{i,j} | j = j(i, t))$$



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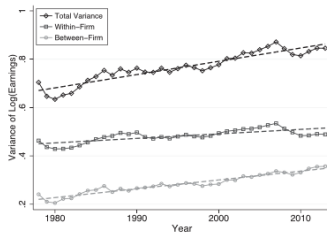
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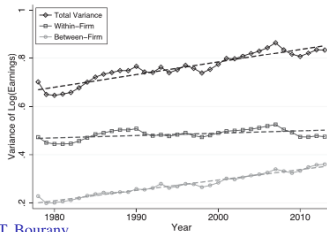
- ▶ *Between firms* variance represents two third of the overall change, while *Within firm* accounts for one third
- ▶ Difference across the firm size distribution
- ▶ Two others fancier exercises :
  - Comparing worker earning vs. average firm earning (coworker) at different percentiles
  - Non-parametric density decomposition of earning : holding fixed between or within firm percentile

# Variance decomposition : Between vs. Within firms

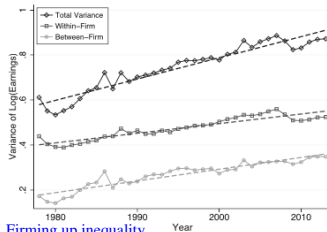
(A) Overall decomposition



(B) Workers at firms with 20 to 10,000 employees



(C) Workers at mega firms (10,000+ employees)



## AKM - methodology

- ▶ Abowd, Kramarz, Margolis 1999 (AKM) and Card, Heining, Kline 2013 (CHK)

$$y_t^{i,j} = \theta^{i,p} + X_t^i \beta^p + \psi^{j,p} + \epsilon_t^{i,j}$$

- Worker  $i$ , Firm  $j$ , Period  $p$ , Year  $t$ , Observables  $X_t$  (age)

- ▶ Variance decomposition : 
$$\text{var}(y_t^{i,j}) = \underbrace{\text{var}(\theta^i - \bar{\theta}^j) + \text{var}(\epsilon_t^{i,j})}_{\text{Within-firm component}} + \underbrace{\text{var}(\psi^j) + 2\text{cov}(\bar{\theta}^j, \psi^j) + \text{var}(\bar{\theta}^j)}_{\text{Between-firm component}}$$

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- ▶ Decomposition of levels :

- Variance of worker effect  $\approx 50\%$

- ▶ Decomposition of the *change* (Table IV) :

- Firm pay premium – i.e. firm fixed effect variance  $\text{Var}(\psi^j)$  – stable
- Worker fixed effect variance rise, mostly due to composition effect :

- (1) Sorting effect :  $\text{Cov}(\bar{\theta}^j, \psi^j)$  accounts for 35% of the rise
- (2) Segregation effect :  $\text{Var}(\bar{\theta}^j)$  : accounts 31%

## AKM - methodology

- ▶ Plenty of robustness checks :
  - Graphs with quartiles symmetric.
  - Include match fixed effect  $m_{ij}$
  - Exclude the year of change of firms
  - Same issue of the limited mobility bias, but may not affect the change
  - Most details in appendix D and CHK
- ▶ Replication by firms size (Table V) :
  - Small firms : entirely between firm component (equally sorting/segragation)
  - Mega-firms : within firm mostly

## Summary and theory

- ▶ Rising inequality/variance of earning :
  - The between firms component explain a large share (2/3) of rise in variance of earning
  - Split equally between sorting effect and segregation
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- ▶ Theories that could rationalize these :
  - Rise in return of skill (mechanical effect only explains a small share)
  - Skill-biased technical change
  - Rising Outsourcing (firm focus on “core competencies”)
  - Complementarity between workers (tasks) or between worker and firms (technology)
  - Within firm inequality driven by mega firms :
    - (1) Stagnating earning lower paid workers (big firm premium gap shrank) and
    - (2) Rising earning of top 1% (rising returns of stocks)