## Labor Market Power

David Berger

**Duke University** 

Kyle Herkenhoff

Federal Reserve Bank of Minneapolis

Simon Mongey

University of Chicago

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The views expressed herein are those of the authors and not those of the Census or the Federal Reserve System.

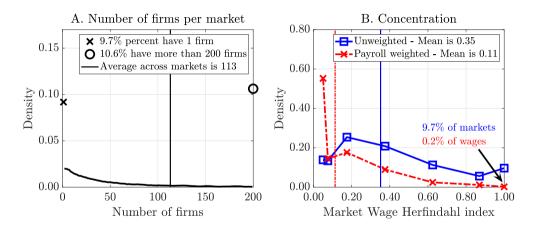
## Measuring labor market power in the U.S. labor market

- Fact Labor markets are concentrated. Many employers, concentrated employment.
- Model Tractable general equilibrium oligopsony model with strategic interaction
- Estimate Match reduced form responses to changes in tax policy in Census data
- Validate (i) Pass-through, (ii) Strategic response, (iii) Mergers

  Kline et al, 2018 Staiger et al, 2010 Arnold, 2020
- Micro Measure labor market power in terms of wage markdowns on MRPL  $w_i = u_i \times MRPL_i$ ,  $\mathbb{E}[u_i] = 0.92$ ,  $u^* = 0.71$

- Macro Measure labor market power in terms of (i) welfare, (ii) Wages vs. Misalloc.
- Apply Link concentration ↔ labor share.

### Motivation



## - Market - NAICS3 × Commuting Zone

### Literature

### 1. Theory

Oligopsony Robinson (1933), Hotelling (1929), Salop (1979), Bhaskar, Manning & To (2002)

Oligopoly Atkeson Burstein (2008), Amiti, Itskhoki, Konings (2019), Edmond Midrigan Xu (2015, 2019)

Frictional Burdett Mortensen (1998), Flinn (2010), Manning (2003, 2006)

Competitive Card Cardoso Heining Kline (2018), Lamadon Mogstad Setzler (2019)

New - GE model of strategic interaction in local labor mkts taken to firm-level Census data

### Empirics

Concentration Benmelech et al (2018), Azar et al (2018), Rinz (2018)

Hershbein, Macaluso, Yeh (2019), Rossi-Hansberg et al (2018)

Corporate Taxes Giroud, Rauh (2019), Suarez Serrato, Zidar (2016)

Wage pass-through Kline, Petkova, Williams, Zidar (2018), Card, Cardoso, Heining, Kline (2016)

Wage responses Staiger et al (2010), Derenoncourt et al (2021)

New - Quantitatively interpret empirical evidence

# Model

## Environment

### Representative family

- Continuum of labor markets  $j \in [0, 1]$
- Labor market j has a fixed number of firms  $i \in \{1, 2, ..., M_i\}$
- Disutility of supplying workers  $\{n_{iit}\}$  across firms

#### **Firms**

- Firm i has idiosyncratic productivity  $z_{ijt}$ , DRS production
- Hire workers  $n_{ijt}$ , rent capital  $k_{ijt}$  to produce identical final good

#### Markets

- Local, Cournot competition for labor
- National, Walrasian markets for output and capital

### Household

#### **Preferences**

$$\mathcal{U}_0 = \max_{\{n_{ijt}, c_{ijt}, \mathcal{K}_{t+1}\}} \; \sum_{t=0}^{\infty} eta^t U\Big(\mathbf{C}_t, \mathbf{N}_t\Big) \quad , \quad eta \in (0,1) \quad , \quad arphi > 0$$

### Disutility of labor supply

$$egin{aligned} \mathbf{N}_t &:= \left[\int_0^1 \mathbf{N}_{jt}^{rac{ heta+1}{ heta}} \, dj
ight]^{rac{ heta}{ heta+1}} &, \quad heta > arphi \ \mathbf{N}_{jt} &:= \left[rac{n_{1jt}}{\eta}^{rac{\eta+1}{\eta}} + \cdots + rac{n_{M_jjt}}{\eta}^{rac{\eta+1}{\eta}}
ight]^{rac{\eta}{\eta+1}} &, \quad \eta > heta \end{aligned}$$

### **Budget constraint**

$$\mathbf{C}_t + \begin{bmatrix} K_{t+1} - (1-\delta)K_t \end{bmatrix} = \int_0^1 \begin{bmatrix} w_{1jt} n_{1jt} + \dots + w_{M_jjt} n_{M_jjt} \end{bmatrix} dj + R_t K_t + \Pi_t,$$

$$\mathbf{C}_t := \int_0^1 \begin{bmatrix} c_{1jt} + \dots + c_{M_jjt} \end{bmatrix} dj.$$

## Discussion of preferences

#### 1. Across markets

$$\mathbf{N}_t := \left[\int_0^1 \mathbf{N}_{jt}^{rac{ heta+1}{ heta}} \, dj
ight]^{rac{ heta}{ heta+1}}$$

 $\theta \to 0$ : Fixed labor supply to each market

 $\dots \theta$  proxies *inter*-market mobility costs (e.g. moving)

#### 2. Within markets

$$\mathbf{N}_{jt} := \left[ n_{1jt}^{rac{\eta+1}{\eta}} + \cdots + n_{M_{j}jt}^{rac{\eta+1}{\eta}} 
ight]^{rac{\eta}{\eta+1}}$$

 $\eta \to \infty$ : All workers to firm with highest wage

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 $\dots \eta$  proxies *intra*-market mobility costs (e.g. commute distance)

Equivalence result - Nested logit individual choice model

Anderson, De Palma, Thisse (EL 1987), Verboven (EL 1996)

## Firms - Cournot competition

$$\max_{k_{ijt}, n_{ijt}} \pi_{ijt} \left( k_{ijt}, \mathbf{n}_{ijt}, \mathbf{n}_{-ijt}^* \right) = \underbrace{\overline{Z} z_{ijt} \left( k_{ijt}^{1-\gamma} \mathbf{n}_{ijt}^{\gamma} \right)^{\alpha} - R_t k_{ijt}}_{\widetilde{Z} \widetilde{z}_{ijt} n_{ijt}^{\widetilde{\alpha}}} - w \left( \mathbf{n}_{ijt}, \mathbf{n}_{-ijt}^*, \mathbf{N}_t \right) \mathbf{n}_{ijt}$$

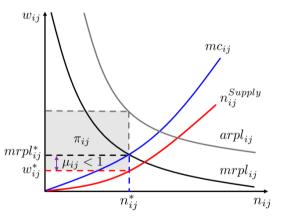
subject to

$$w\left(\mathbf{n}_{ijt}, \mathbf{n}_{-ijt}^*, \mathbf{N}_t\right) = \left(\frac{\mathbf{n}_{ijt}}{\mathbf{N}_{jt}}\right)^{\frac{1}{\eta}} \left(\frac{\mathbf{N}_{jt}}{\mathbf{N}_t}\right)^{\frac{1}{\theta}} \mathbf{W}_t , \quad \mathbf{W}_t = -\frac{U_N(\mathbf{C}_t, \mathbf{N}_t)}{U_C(\mathbf{C}_t, \mathbf{N}_t)}$$

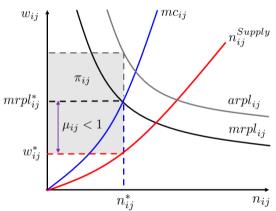
$$\mathbf{N}_{jt} = \left[ n_{1jt}^* \frac{\eta+1}{\eta} + \dots n_{ijt}^* \frac{\eta+1}{\eta} + \dots n_{M_jjt}^* \frac{\eta+1}{\eta} \right]^{\frac{\eta}{\eta+1}}$$

## Partial equilibrium

A. Low productivity firm



B. High productivity firm



- Result - Endogenous negative  $cov\left(\mu_{ij},z_{ij}\right)<0$ 

Example - Shares, Markdowns, Wages, Employment

### Wages

$$w_{ijt} = \mu_{ijt} \underbrace{mrpl_{ijt}}_{\widetilde{\alpha}\widetilde{Z}\widetilde{z}_{ijt}n_{ijt}^{\widetilde{\alpha}-1}} = \mu_{ijt} \widetilde{\alpha} \left(\frac{va_{ijt}}{n_{ijt}}\right)$$

### Wages

$$w_{ijt} = \mu_{ijt} \underbrace{mrpl_{ijt}}_{\widetilde{\alpha}\widetilde{Z}\widetilde{z}_{ijt}n_{ijt}^{\widetilde{\alpha}-1}} = \mu_{ijt} \widetilde{\alpha} \left(\frac{va_{ijt}}{n_{ijt}}\right)$$

#### Markdown

$$\mu_{ijt} = \frac{\varepsilon_{ijt}}{\varepsilon_{ijt} + 1} \quad , \quad \varepsilon_{ijt} := \frac{\partial \log n_{ijt}}{\partial \log w_{ijt}} \bigg|_{\substack{n^*_{-ijt}}} = \left[ s_{ijt}^{wn} \frac{1}{\theta} + \left(1 - s_{ijt}^{wn}\right) \frac{1}{\eta} \right]^{-1} \quad , \quad \varepsilon_{ijt}^{wn} = \frac{w_{ijt} n_{ijt}}{\sum_{k \in j} w_{kjt} n_{kjt}}$$

$$Equilibrium labor supply elasticity \qquad Wage bill share$$

## Wages

$$w_{ijt} = \mu_{ijt} \underbrace{mrpl_{ijt}}_{\widetilde{\alpha}\widetilde{Z}\widetilde{z}_{jt}n_{ijt}^{\widetilde{\alpha}-1}} = \mu_{ijt} \widetilde{\alpha} \left(\frac{va_{ijt}}{n_{ijt}}\right)$$

#### Markdown

$$\underbrace{\mu_{ijt} = \frac{\varepsilon_{ijt}}{\varepsilon_{ijt} + 1}}_{\text{Markdown}} \quad , \quad \underbrace{\varepsilon_{ijt} := \frac{\partial \log n_{ijt}}{\partial \log w_{ijt}} \bigg|_{\substack{n^*_{-jjt}}} = \left[ s_{ijt}^{wn} \frac{1}{\theta} + \left( 1 - s_{ijt}^{wn} \right) \frac{1}{\eta} \right]^{-1}}_{\text{Equilibrium labor supply elasticity}} \quad , \quad \underbrace{s_{ijt}^{wn} = \frac{w_{ijt} n_{ijt}}{\sum_{k \in j} w_{kjt} n_{kjt}}}_{\text{Wage bill share}}$$

Result 1 - Market equilibrium  $\{s_{ijt}, \mu_{ijt}\}_{i \in j}$  is independent of aggregates.

► Tilde variables

► Product market competition

## Wages

#### Markdown

$$\mu_{ijt} = \frac{\varepsilon_{ijt}}{\varepsilon_{ijt} + 1} \quad , \quad \varepsilon_{ijt} := \frac{\partial \log n_{ijt}}{\partial \log w_{ijt}} \bigg|_{\substack{n^*_{-ijt}}} = \left[ s_{ijt}^{wn} \frac{1}{\theta} + \left( 1 - s_{ijt}^{wn} \right) \frac{1}{\eta} \right]^{-1} \quad , \quad \underbrace{s_{ijt}^{wn} = \frac{w_{ijt} n_{ijt}}{\sum_{k \in j} w_{kjt} n_{kjt}}}_{\text{Wage bill share}}$$

### Result 2 - Pass-through is less than one

► Tilde variables

► Product market competition

## General equilibrium - Two wedges

- 1. General equilibrium
- Aggregates  $\{ \mathbf{W}, \mathbf{N}, \mathbf{C}, \mathbf{Y} \}$  depend on misallocation  $\ \omega$  and markdown  $\mu$

Output: 
$$\mathbf{Y} = \omega \times \widetilde{Z} \mathbf{N}^{\widetilde{\alpha}}$$
, Labor demand:  $\mathbf{W} = \mu \times \widetilde{\alpha} \widetilde{Z} \mathbf{N}^{\widetilde{\alpha}-1}$ 

Goods market clearing: 
$$\mathbf{C} = \text{Const.} \times \mathbf{Y}$$
, Labor supply:  $\mathbf{W} = -\frac{U_N(\mathbf{C}, \mathbf{N})}{U_C(\mathbf{C}, \mathbf{N})}$ 

- Negative cov. b/w productivity  $(z_{ii} \uparrow)$  and markdowns  $(\mu_{ii} \downarrow)$  induces misallocation:

$$\omega = \int \left(\frac{\widetilde{z}_j}{\widetilde{z}}\right)^{\frac{1+\theta}{1+\theta(1-\widetilde{\alpha})}} \left(\frac{\mu_j}{\mu}\right)^{\frac{\alpha\theta}{1+\theta(1-\widetilde{\alpha})}} \omega_j \, dj \quad , \quad \omega_j = \sum_{i \in j} \left(\frac{\widetilde{z}_{ij}}{\widetilde{z}_j}\right)^{\frac{1+\eta}{1+\eta(1-\widetilde{\alpha})}} \left(\frac{\mu_{ij}}{\mu_j}\right)^{\frac{\eta\widetilde{\alpha}}{1+\eta(1-\widetilde{\alpha})}}$$

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- 2. Two "Monopsony limits"
- If (i)  $\theta \to \eta$ , or (ii)  $s_{ij} \to 0$ , then markdowns are identical,  $\mu = \frac{\eta}{\eta + 1}$  and  $\omega = 1$ .

## General equilibrium - Labor share

#### Concentration

$$extstyle egin{aligned} extstyle HHI^{wn}_i &:= \int_0^1 s_j^{wn} HHI^{wn}_j dj \, \in [0,1] \end{aligned} \quad , \qquad HHI^{wn}_j := \sum_{i \in j} \left( s_{ij}^{wn} 
ight)^2 \end{aligned}$$

## General equilibrium - Labor share

#### Concentration

$$extit{HHI}^{wn} := \int_0^1 s_j^{wn} HHI_j^{wn} dj \, \in [0,1] \qquad , \qquad HHI_j^{wn} := \sum_{i \in j} \left( s_{ij}^{wn} 
ight)^2$$

#### Labor share

$$LS = \widetilde{\alpha} \frac{\mu}{\omega} = \alpha \gamma \times \underbrace{\left[ HHI^{wn} \left( \frac{\theta}{\theta + 1} \right)^{-1} + \left( 1 - HHI^{wn} \right) \left( \frac{\eta}{\eta + 1} \right)^{-1} \right]^{-1}}_{\text{Comp. } LS}$$
Labor market power adjustment

► HHI measures over time

► Labor share algebra

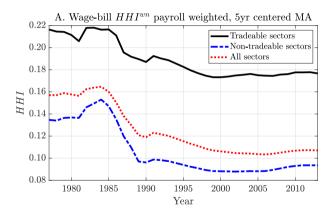
▶ Bias of employment HHI relative to wage bill HH

## Concentration, 1977 to 2013

Data: LBD, Market: NAICS3 × Commuting Zone, (e.g. Mnpls X furniture mfg.)

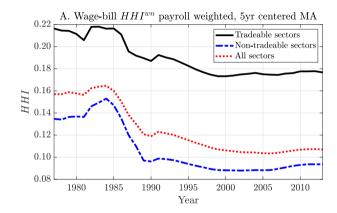
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 $(HHI^{wn})^{-1}$  increased from 6.25 in 1977 to 9.43 in 2013

Result - At estimated  $\{\theta, \eta, \alpha, \gamma\}$  increasing competition added 4.32 ppt to Labor Share

# **CALIBRATION**

### Indirect inference

- Equilibrium labor supply elasticities, if known, would identify  $(\theta, \eta)$ 

$$\varepsilon\Big(s_{ij},\theta,\eta\Big) := \frac{\partial \log n_{ij}}{\partial \log w_{ij}}\bigg|_{\substack{n^*_{-ii}}} = \left[s_{ij}\frac{1}{\theta} + (1-s_{ij})\frac{1}{\eta}\right]^{-1}$$

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Even a perfect quasi-experiment is only going to deliver reduced form elasticities

$$\varepsilon\left(s_{ij},\theta,\eta,\ldots\right) := \frac{\Delta \log n_{ijt}}{\Delta \log w_{ijt}} \approx \frac{\varepsilon\left(s_{ijt},\theta,\eta\right)}{1 + \varepsilon\left(s_{ijt},\theta,\eta\right)\left(\frac{\eta-\theta}{\theta\eta}\right)\left(\frac{\sum_{k\neq i} s_{kjt} \Delta \log n_{kjt}}{\Delta \log n_{ijt}}\right)}$$

### Monopsony limits

- Under either limit  $\varepsilon = \epsilon$ 

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#### Indirect inference

- 1. Data Quasi-experiment to estimate average relationship  $\hat{\epsilon}^{Data}(s)$
- 2. Model Replicate in the model and  $\min_{\theta,\eta} \left| \widehat{\epsilon}^{Data}(s) \widehat{\epsilon}^{Model}(s,\theta,\eta) \right|$

1. Empirical estimates of reduced form elasticities -  $\hat{\epsilon}^{Data}(s)$ 

### State corporate tax changes

- Policy Large changes in state corporate taxes (Giroud Rauh, JPE 2019)
- Variation Within market-state j, s, across firm payroll share  $i \in j$
- Sample Tradeable *C*-corps operating in 2 markets in state *s*, 2002-2012

## Specification

$$\log n_{ijt} = \alpha_{ij} + \phi_t + \psi s_{ijt-1}^{wn} + \beta_n \tau_{s(j)t} + \gamma_n \left( s_{ijt-1}^{wn} \times \tau_{s(j)t} \right) + \Gamma X_{s(j)t} + e_{ijt}$$

$$\widehat{\epsilon}^{Data}(s_{ijt}) = \frac{d\widehat{\log n_{ijt}}}{d\widehat{\log w_{ijt}}} = \frac{\widehat{\beta}_n + \widehat{\gamma}_n s_{ijt}^{wn}}{\widehat{\beta}_w + \widehat{\gamma}_w s_{ijt}^{wn}}$$

► Table - Regression results

## 2. Model simulation of reduced form elasticities - $\widehat{\epsilon}^{Model}(s, \theta, \eta)$

### Firms maximize post-tax profits

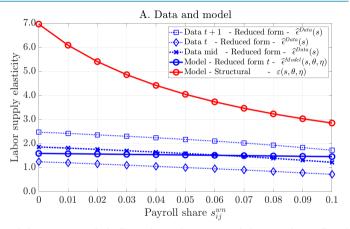
$$\pi_{ijt} = \left(1 - \tau_C\right) \lambda_C z_{ijt} \left(n_{ijt}^{\gamma} k_{ijt}^{1 - \gamma}\right)^{\alpha} - \left(1 - \tau_C\right) w_{ijt} n_{ijt} - \left(1 - \tau_C \lambda_K\right) R_t k_{ijt}$$

- 1. Tax on profits
- 2. Distorts after tax return on fraction of capital
- 3. Only affects C-Corps
- 4. C-Corps are  $\lambda_C > 1$  times more productive:
- Simulate a tax cut.

- SMM: Data:  $\{\tau_C, \lambda_K, \Delta\tau_C, G(M_j)\}$ . Estimate:  $\{\lambda_C, \theta, \eta, \widetilde{\alpha}, F(z), \overline{Z}, \overline{\phi}\}$

- $\tau_{\rm C} = 7.15\%$  (Giroud Rauh, 2019)
- $\lambda_{K} = 0.31$  (Graham et. al., 2014)
- 43% of firms (CBP)
- 66% of emp. (CBP)
- $\Delta \tau_C = -1$  ppt (Giroud Rauh, 2019)

## *Reduced form* and *Structural* elasticities ( $\theta = 0.45$ , $\eta = 6.96$ )



- Implies 13% markdown at atomistic firms (s = 0), 70% markdown at large firm (s = 1)
- Strategic interactions imply  $\varepsilon>\epsilon$  large firms shift labor supply to small firms





Figure - Bias of idiosyncratic shocks:  $\hat{\epsilon} > \epsilon$ 

## Parameters and moments

| A. Common                |                                   |          |   |       |      |  |  |  |  |
|--------------------------|-----------------------------------|----------|---|-------|------|--|--|--|--|
| Parameter                | Description                       | Value    | Moment  | Model | Data |  |  |  |  |
| r                        | Risk free rate                    | 0.04     |   |       |      |  |  |  |  |
| δ                        | Depreciation rate                 | 0.10     |   |       |      |  |  |  |  |
| $\varphi$                | Aggregate Frisch elasticity       | 0.50     |   |       |      |  |  |  |  |
| Ĵ                        | Number of markets                 | 5,000    |   |       |      |  |  |  |  |
| B. Tradeabl              | e                                 |          |   |       |      |  |  |  |  |
| $G(M_j)$                 | Mix two paretos                   |          | Mean, Std. Dev., Skewness of distribution<br>15 percent of markets have only 1 firm |       |      |  |  |  |  |
| $\omega_{\mathcal{C}}$   | Share of firms that are C-corps   | 0.42     | Share of estabs. that are <i>C</i> -corps (CBP, 2                                   | 2014) |      |  |  |  |  |
| $\tau_C$                 | State corporate tax rate          | 0.069    | Mean of state corp. tax rate $\tau_{C,st}$  |       |      |  |  |  |  |
| $\Delta_{\tau}$          | State corporate tax rate increase | 0.010    | Std. dev. of annual $\tau_{C,st}$   |       |      |  |  |  |  |
| $\lambda_{K}$            | Fraction of capital debt financed | 0.213    | Tradeable industries (Compustat, 2014)  |       |      |  |  |  |  |
| Estimated                |                                   |          |   |       |      |  |  |  |  |
| η                        | Within market substitutability    | 6.96     | Average $\widehat{\epsilon}^{Data}(s^{wn})$ for $s^{wn} \in [0, 0.05]$              | 1.55  | 1.70 |  |  |  |  |
| $\dot{\theta}$           | Across market substitutability    | 0.45     | Average $\widehat{\epsilon}^{Data}(s^{wn})$ for $s^{wn} \in [0.05, 0.10]$           | 1.48  | 1.38 |  |  |  |  |
| $\Delta_C$               | Relative productivity of C-corps  | 1.41     | Emp. share of C-corps   | 0.66  | 0.66 |  |  |  |  |
| $\sigma_{\widetilde{z}}$ | Productivity dispersion           | 0.248    | Payroll weighted $\mathbb{E}[HHI^{wn}]$   | 0.17  | 0.17 |  |  |  |  |
| α                        | DRS parameter                     | 1.000    | Labor share   | 0.53  | 0.54 |  |  |  |  |
| $\gamma$                 | Labor exponent                    | 0.799    | Capital share   | 0.19  | 0.19 |  |  |  |  |
| ĩ                        | Productivity shifter              | 1.53e+04 | Ave. firm size  | 34.6  | 34.6 |  |  |  |  |
| $\overline{\varphi}$     | Labor disutility shifter          | 2.261    | Ave. payroll per worker (\$000)   | 58.3  | 58.3 |  |  |  |  |

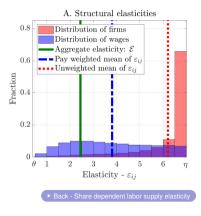
## Parameters and moments

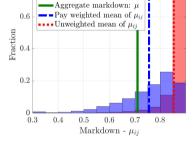
| C. Economy-wide    |                                |          |   |         |      |  |  |  |  |
|--------------------|--------------------------------|----------|---|---------|------|--|--|--|--|
| Parameter          | Description                    | Value    | Moment  | Model   | Data |  |  |  |  |
| $G(M_j)$           | Mix two paretos                |          | Mean, Std. Dev., Skewness of distribution 9 percent of markets have only 1 firm |         |      |  |  |  |  |
| η                  | Within market substitutability | 6.96     | Held fixed at estimated tradeable value   |         |      |  |  |  |  |
| $\dot{\theta}$     | Across market substitutability | 0.45     | Held fixed at estimated tradeable   | e value |      |  |  |  |  |
| Estimated          |                                |          |   |         |      |  |  |  |  |
| $\sigma_z$         | Productivity dispersion        | 0.327    | Payroll weighted $\mathbb{E}[HHI^{wn}]$   | 0.11    | 0.11 |  |  |  |  |
| α                  | DRS parameter                  | 0.957    | Labor share   | 0.57    | 0.57 |  |  |  |  |
| $\gamma$           | Labor exponent                 | 0.812    | Capital share   | 0.18    | 0.18 |  |  |  |  |
| Z                  | Productivity shifter           | 1.59e+04 | Ave. firm size  | 22.8    | 22.8 |  |  |  |  |
| $\overline{arphi}$ | Labor disutility shifter       | 3.081    | Ave. payroll per worker (\$000)   | 43.8    | 43.8 |  |  |  |  |

- Fewer markets with 1 firm
- Lower concentration
- Smaller firms with lower pay

## Distribution of labor supply elasticities and markdowns

0.8

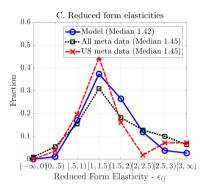




B. Markdowns

Distribution of firms

Distribution of wages



## Next

#### 1. Validation

- (i) Pass-through (Kline, Petkova, Williams, Zidar, QJE 2019)
- (ii) Strategic interactions (Staiger, Spetz, Phibs, JOLE 2010)
- (iii) Mergers (Arnold, JMP 2020)

#### 2. Measurement

- (i) Welfare gains associated with efficient allocation
- (ii) Decomposition into  $\mu$  and  $\omega$

### 3. Applications

- Concentration and the labor share

# **VALIDATION**

## 1. Pass-through

- Replicate Kline et al (2018) patent quasi-experiment
- Shock to  $\uparrow z_{ij}$  to match average increase in  $\uparrow (va_{ij}/n_{ij})$  of 13 percent
- Compute pass-through in logs

$$\Delta \log w_{it} = \gamma_i + \beta \Delta \log vapw_{it} + e_{it}$$
 ,  $\hat{\beta} = 0.47$ 

- Monopsony limits vs. Oligopsony
  - In either of the monopsony limits, then  $\mu_{ijt}$  is constant, and  $\hat{\beta} = 1$

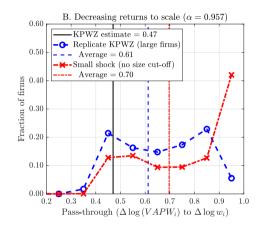
$$\Delta \log w_{ijt} = \Delta \log \mu_{ijt} + \Delta \log vapw_{ijt}$$

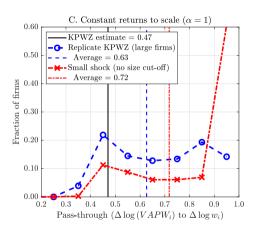
- In our model, if  $\eta > \theta$ , then  $\Delta \log \mu_{ijt} < 0$  and  $\widehat{\beta} < 1$ 

Details - Implementation of experiment in the model

► Details - Data and model summary statistics. Increase in value added per worker etc.

## 1. Pass-through





► Details - Implementation of experiment in the model

▶ Details - Data and model summary statistics. Increase in value added per worker etc.

## 2. Competitor responses

- Replicate Staiger et al (2010) VA hospital quasi-experiment
- Firm VA, j increases wages from 2-3 percent below market average to market average
- Compute competitor wage responses

$$\Delta \log w_{ij} = \alpha_0 + \alpha_1 \Delta \log w_{VA,j} + e_{ij}$$
 ,  $\widehat{\alpha}_1 = 0.13$ 

- Monopsony limits vs. Oligopsony
  - In either of the monopsony limits, competitors do not respond and  $\hat{\alpha}_1 = 0$

$$\Delta \log w_{ij} = \Omega(s_{ij}) \Delta \log vapw_{ij} + \left(1 - \Omega(s_{ij})\right) \sum_{k \neq i} \left(rac{s_{kj}}{1 - s_{ij}}\right) \Delta \log w_{kj}$$

- In our model, if  $\eta > \theta$ , then  $\Omega(s_{ij}) < 1$  and  $\widehat{\alpha}_1 > 0$ 

► Details - Implementation of experiment in the model

▶ Details - Data and model summary statistics. Increase in value added per worker etc.

## 2. Competitor responses

- Replicate Staiger et al (2010) VA hospital quasi-experiment
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 ,  $\widehat{\alpha}_1 = 0.13$ 

|   | Model         | Data<br>Staiger et al (2010) |
|---|---------------|------------------------------|
| Log avg. market wage minus focal firm log wage ex-ante ( $\log \bar{w}_{-ij} - \log w_{ij}$ ) Number of firms in market | 0.02<br>10.89 | 0.02<br>10.90                |
| Elasticity of competitor wages WRT focal wage $(\frac{d \log \bar{w}_{-ij}}{d \log w_{ij}})$                            | 0.07          | 0.13                         |

➤ Details - Implementation of experiment in the model

► Details - Data and model summary statistics. Increase in value added per worker etc.

## 3. Mergers

- Replicate Arnold et al (2020) mergers in local labor markets
- Merge firms 1 and 2:  $\mu(s_{1j}) 
  ightarrow \mu(s_{1j}' + s_{2j}')$
- Compute merging firm and market changes in employment and wages
- Monopsony limits vs. Oligopsony
  - In either of the monopsony limits, competitors do not respond
  - In our economy: (i) merging firms' wages and employment fall, (ii) merging firms' combined shares fall and competitors' combined shares increase, (iii) market wage and market employment fall

▶ Details - Implementation of experiment in the model

▶ Details - Data and model summary statistics. Increase in value added per worker etc.

## 3. Mergers

### Calibrate size of merging entities to match descriptive statistics in Arnold (2020)

| Moment  | A. Arnold     | <b>(2020)</b> | <b>B. Replicate</b>              |
|---|---------------|---------------|----------------------------------|
|   | Reference     | Value         | Value                            |
| Part I. Outcomes at merging firms Target: Median employment pre-merger                        | Table 1       | 116.0         | 116.3                            |
| Change in log employment (weighted) Change in log payroll (weighted)                          | Table 3(1)    | -0.144        | -0.070                           |
|   | Table 3(4)    | -0.121        | -0.083                           |
| Change in log worker earnings high concentration market medium concentration market           | Table 5(2)    | -0.008        | -0.013                           |
|   | Table 6(1)    | -0.031        | -0.041                           |
|   | Table 6(2)    | -0.008        | -0.012                           |
| $\Delta HHI_{j} = \alpha + \beta \Delta \widehat{HHI}_{j}$                                    | Table 8(1)    | 0.834         | 0.904                            |
| Part II. Market outcomes in markets wit Target: Average change in log <i>HHI</i> <sub>j</sub> | h large predi | cted char     | i <b>ges in</b> hhi <sub>j</sub> |
|   | Figure 8A     | 0.170         | 0.171                            |
| Elasticity of market wage to HHI above median HHI   | Table 10(3)   | -0.219        | -0.475                           |
|   | Table 10(6)   | -0.259        | -0.505                           |

## WELFARE

### Counterfactual

How much would consumption have to increase to be indifferent between U.S. labor market and a competitive labor market?

### Counterfactual

How much would consumption have to increase to be indifferent between U.S. labor market and a competitive labor market?

#### Efficient allocation

- Corresponds to a competitive equilibrium in which  $\mu_{ij}^*=1$
- Implies aggregates  $\mu^* = 1$ , and  $\omega^* = 1$
- Compare this to our benchmark economy with  $\mu_o = 0.72$ , and  $\omega_o = 0.97$
- Identical system of aggregate conditions

$$\mathbf{Y} = \boldsymbol{\omega} \times \widetilde{\mathbf{Z}} \mathbf{N}^{\widetilde{\alpha}}$$
 ,  $\mathbf{W} = \boldsymbol{\mu} \times \widetilde{\alpha} Z \mathbf{N}^{\widetilde{\alpha}-1}$ 

### Results

Define - Welfare gain associated with competitive labor market,  $\lambda_{SS}$ 

$$U\Big((\mathbf{1}+\lambda_{SS})\mathbf{C}_o,\mathbf{N}_o\Big) = U\Big(\mathbf{C}^*,\mathbf{N}^*\Big) \quad , \quad U\Big(\mathbf{C},\mathbf{N}\Big) = \frac{\mathbf{C}^{1-\sigma}}{1-\sigma} - \frac{1}{\overline{\varphi}^{\frac{1}{\phi}}} \frac{\mathbf{N}^{1+\frac{1}{\phi}}}{1+\frac{1}{\varphi}}$$

### Results

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$$U\Big((1+\lambda_{SS})\mathbf{C}_o,\mathbf{N}_o\Big) = U\Big(\mathbf{C}^*,\mathbf{N}^*\Big) \quad , \quad U\Big(\mathbf{C},\mathbf{N}\Big) = \frac{\mathbf{C}^{1-\sigma}}{1-\sigma} - \frac{1}{\overline{\varphi}^{\frac{1}{\varphi}}} \frac{\mathbf{N}^{1+\frac{1}{\varphi}}}{1+\frac{1}{\varphi}}$$

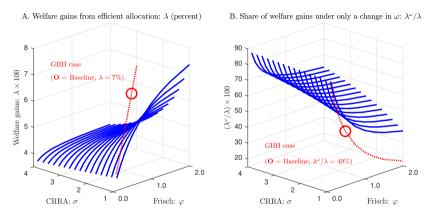
| Frisch elasticity |                          | A. Welfare B. Labor market           |                          | C. Concentration         |                      |                 |                   |                   |
|-------------------|--------------------------|--------------------------------------|--------------------------|--------------------------|----------------------|-----------------|-------------------|-------------------|
|                   | GH                       |                                      | $\sigma=1.0$             | $\sigma = 2.0$           |                      |                 |                   |                   |
|                   | Steady state             | Transition                           | Steady state             | Steady state             | Ave. wage            | Agg. emp.       | Unweighted        | Weighted          |
| $\varphi$         | $\lambda_{SS} 	imes 100$ | $\lambda_{\mathit{Trans}} 	imes 100$ | $\lambda_{SS} 	imes 100$ | $\lambda_{SS} 	imes 100$ | $\mathbf{E}[w_{it}]$ | $\sum_i n_{it}$ | $\Delta HHI^{wn}$ | $\Delta HHI^{wn}$ |
| 0.2               | 4.8                      | 4.2                                  | 4.0                      | 3.6                      | 48.5                 | 1.1             | 0.19              | 0.15              |
| 0.5               | 7.0                      | 5.7                                  | 5.3                      | 4.5                      | 48.1                 | 11.3            | 0.19              | 0.15              |
| 8.0               | 9.2                      | 7.2                                  | 6.0                      | 4.8                      | 47.5                 | 22.5            | 0.19              | 0.15              |

#### Results

- Labor market power leads to between 4% to 9% welfare losses
- Increase in competition but increase in concentration



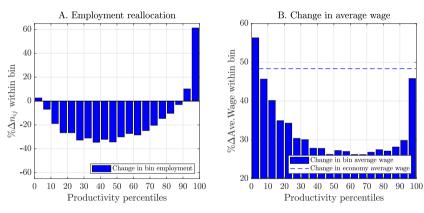
## Decomposition and robustness



#### Interpretation

- ↑ Frisch Larger gains (working more less painful), less gains from reallocation
- Wealth effects Higher labor supply in distorted oligopoly economy

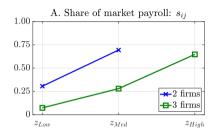
### Reallocation



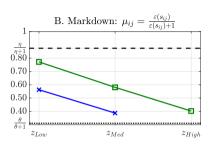
### Interpretation

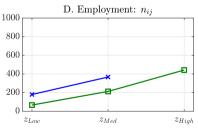
- Significant reallocation of employment toward higher productivity firms
- Achieved through higher (shadow) wages

### Reallocation

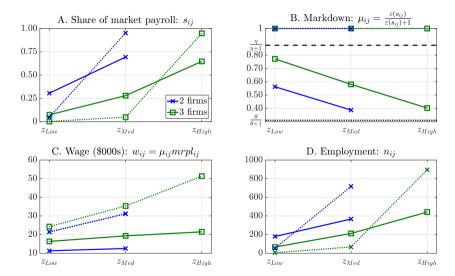






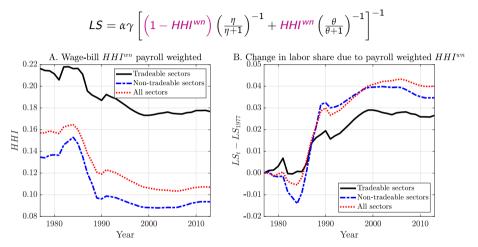


### Reallocation



# **APPLICATION**

## What are implications for labor share?



Result - Labor market concentration does not explain declining labor share

### Contributions

- 1. Develop and validate general equilibrium oligopsony model
  - Provides a model relevant concentration measure
  - Kick the tires hard: Replicate pass-through, strategic interactions, and merger responses
- 2. New evidence on size dependent corporate tax response, used in estimation
  - Quantitatively important to model strategic interaction if inferring labor market power via employment and wage responses to identified shocks
- 3. Welfare losses from labor market power are large: 4% to 9%
- 4. Welfare and concentration both increase in efficient allocation
- 5. Declining payroll concentration from 1976-2014 implies a +4.3 ppt labor share rise

# THANK YOU!

# **A**PPENDIX

## Representation - Logit model

- Workers  $m \in [0, 1]$  with committed income  $y_m \sim F(y)$
- Minimize total labor disutility of attaining y<sub>m</sub>

$$\min_{ij} \log h_m - \xi_{ij} \qquad \text{s.t.} \qquad w_{ij} h_m = y_m$$

- Random labor disutility

$$F\Big(\xi_{11},\ldots,\xi_{ij},\ldots\xi_{NJ}\Big)=\exp\left[-\sum_{j=1}^J\left(\sum_{i=1}^{M_j}\mathrm{e}^{-(1+\eta)\xi_{ij}}
ight)^{rac{1+ heta}{1+\eta}}
ight]$$

- Labor supply

$$n_{ij} = \frac{w_{ij}^{\eta}}{\sum_{i=1}^{M_j} w_{ij}^{1+\eta}} \frac{\left[\sum_{i=1}^{M_j} w_{ij}^{1+\eta}\right]^{\frac{1+\theta}{1+\eta}}}{\sum_{l=1}^{J} \left[\sum_{k=1}^{M_l} w_{kl}^{1+\eta}\right]^{\frac{1+\theta}{1+\eta}}} Y. \tag{1}$$

- Result Delivers same supply system as rep. agent CES 📭 📾

### Firms - Notation

Optimizing out capital

$$\pi_{ijt} = \max_{n_{ijt}} \ \widetilde{Z} \widetilde{z}_{ijt} n_{ijt}^{\widetilde{\alpha}} - w_{ijt} n_{ijt}$$

- The 'widetilde' variables are defined as follows:

$$egin{array}{lll} \widetilde{lpha} &:=& rac{lpha \gamma}{1-\left(1-\gamma
ight)lpha} \ & \widetilde{z}_{ijt} &:=& \left[1-\left(1-\gamma
ight)lpha
ight] \left(rac{\left(1-\gamma
ight)lpha}{R_t}
ight)^{rac{\left(1-\gamma
ight)lpha}{1-\left(1-\gamma
ight)lpha}} z_{ijt}^{rac{1}{1-\left(1-\gamma
ight)lpha}} \ & \widetilde{Z} &:=& \overline{Z}^{rac{1}{1-\left(1-\gamma
ight)lpha}} \end{array}$$

- Note that  $(1 - \gamma) \alpha$  is capital's share of income

► Back - Nash equilbrium markdown

### Computation

A firm's wage-bill share is defined by their relative wage:

$$s_{ij}^{wn} = \left(rac{w_{ij}}{{ extbf{w}}_j}
ight)^{1+\eta}$$

Within a market, an equilibrium can be solved by iterating through the following conditions given a guess of  $\mathbf{s}_j^{wn} = \left(s_{1j}^{wn}, \dots, s_{Mij}^{wn}\right)$ 

$$\begin{split} \varepsilon_{ij} &= \begin{cases} s^{\textit{wn}}_{ij}\theta + \left(1-s^{\textit{wn}}_{ij}\right)\eta & \text{Bertrand} \\ \left[s^{\textit{wn}}_{ij}\frac{1}{\theta} + \left(1-s^{\textit{wn}}_{ij}\right)\frac{1}{\eta}\right]^{-1} & \text{Cournot} \end{cases} \\ \mu_{ij} &= \frac{\varepsilon_{ij}}{\varepsilon_{ij}+1} \\ w_{ij} &= \mu_{ij}MRPL_{ij} \\ \mathbf{w}_{j} &= \left[\int_{0}^{1}w^{1+\eta}_{ij}dj\right]^{\frac{1}{1+\eta}} \\ s^{\textit{wn}(\textit{NEW})}_{ij} &= \left(\frac{w_{ij}}{\mathbf{w}_{i}}\right)^{1+\eta} \end{split}$$

Berg We, guess, equal, shares and then iterate until  $s_i^{wn(NEW)} = s_i^{wn}$ . Pack

Sub in inverse supply curve for  $n_{ij}$ :

$$MRPL_{ij} = \omega \mathbf{W}^{(1-\widetilde{\alpha})(\theta-\varphi)} \widehat{z}_{ij} \left\{ w_{ij}^{-\eta} \mathbf{w}_{j}^{\eta-\theta} \right\}^{1-\widetilde{\alpha}}$$

Write the wage in terms of the marginal revenue product of labor:

$$\begin{aligned} w_{ij} &= \mu_{ij} \textit{MRPL}_{ij} \\ &= \mu_{ij} \omega \mathbf{W}^{(1-\widetilde{\alpha})(\theta-\varphi)} \widehat{z}_{ij} \left\{ w_{ij}^{-\eta} \mathbf{w}_{j}^{\eta-\theta} \right\}^{1-\widetilde{\alpha}} \\ &= \mu_{ij} \omega \mathbf{W}^{(1-\widetilde{\alpha})(\theta-\varphi)} \widehat{z}_{ij} \left\{ w_{ij}^{-\eta} \mathbf{w}_{j}^{\eta-\theta} \right\}^{1-\widetilde{\alpha}} \end{aligned}$$
 Use  $\mathbf{w}_{j} = w_{ij} s_{ii}^{-\frac{1}{\eta+1}} \colon w_{ij} = \omega^{\frac{1}{1+(1-\widetilde{\alpha})\theta}} \mathbf{W}^{\frac{(1-\widetilde{\alpha})(\theta-\varphi)}{1+(1-\widetilde{\alpha})\theta}} \mu_{ii}^{\frac{1}{1+(1-\widetilde{\alpha})\theta}} \widehat{z}_{ii}^{\frac{1}{1+(1-\widetilde{\alpha})\theta}} s_{ii}^{-\frac{(1-\widetilde{\alpha})(\eta-\theta)}{\eta+1}} \underbrace{\frac{1}{1+(1-\widetilde{\alpha})\theta}}_{1+(1-\widetilde{\alpha})\theta} s_{ii}^{-\frac{(1-\widetilde{\alpha})(\eta-\theta)}{\eta+1}} \underbrace{\frac{1}{1+(1-\widetilde{\alpha})(\eta-\theta)}}_{1+(1-\widetilde{\alpha})(\eta-\theta)} \underbrace{\frac{1}{1+(1-\widetilde{\alpha})(\eta-\theta)}}_{1+(1-\widetilde{\alpha})(\eta-\theta)} \underbrace{\frac{1}$ 

We will solve for an equilibrium in 'hatted' variables, and then rescale:

$$egin{aligned} \widehat{m{w}}_{ij} &:= \mu_{ij}^{rac{1}{1+(1-\widetilde{m{a}}) heta}} \widehat{m{z}}_{ij}^{rac{1}{1+(1-\widetilde{m{a}}) heta}} m{s}_{ij}^{-rac{(1-\widetilde{m{a}})(\eta- heta)}{\eta+1}} rac{1}{1+(1-\widetilde{m{a}}) heta} \ \widehat{m{w}}_{j} &:= \left[\sum_{i \in j} \widehat{m{w}}_{ij}^{\eta+1}
ight]^{rac{1}{\eta+1}} \ \widehat{m{w}} &:= \left[\int \widehat{m{w}}_{j}^{ heta+1} dj
ight]^{rac{1}{ heta+1}} \ \widehat{m{n}}_{ij} &:= \left(rac{\widehat{m{w}}_{ij}}{\widehat{m{w}}_{j}}
ight)^{\eta} \left(rac{\widehat{m{w}}_{j}}{\widehat{m{W}}}
ight)^{ heta} \left(rac{\widehat{m{W}}}{1}
ight)^{arphi} \end{aligned}$$

These definitions imply that

$$\begin{aligned} w_{ij} &= \omega^{\frac{1}{1 + (1 - \tilde{\alpha})\theta}} \mathbf{W}^{\frac{(1 - \tilde{\alpha})(\theta - \varphi)}{1 + (1 - \tilde{\alpha})\theta}} \widehat{w}_{ij} \\ \mathbf{w}_{j} &= \omega^{\frac{1}{1 + (1 - \tilde{\alpha})\theta}} \mathbf{W}^{\frac{(1 - \tilde{\alpha})(\theta - \varphi)}{1 + (1 - \tilde{\alpha})\theta}} \widehat{\mathbf{w}}_{j} \\ \mathbf{W} &= \omega^{\frac{1}{1 + (1 - \tilde{\alpha})\theta}} \mathbf{W}^{\frac{(1 - \tilde{\alpha})(\theta - \varphi)}{1 + (1 - \tilde{\alpha})\theta}} \widehat{\mathbf{W}} \end{aligned}$$

These definitions allow us to compute the equilibrium market shares in terms of 'hatted' variables:

$$s_j^{wn} = \left(\frac{w_{ij}}{\mathbf{w}_j}\right)^{\eta+1} = \left(\frac{\widehat{w}_{ij}}{\widehat{\mathbf{w}}_j}\right)^{\eta+1} \tag{2}$$

For a given set of values for parameters  $\{\overline{\varphi}, \widetilde{Z}, \widetilde{\alpha}, \beta, \delta\}$ , we can solve for the non-constant returns to scale equilibrium as follows:

- 1. Guess  $\mathbf{s}_{j}^{wn} = (s_{1j}^{wn}, \dots, s_{M_{jj}}^{wn})$
- 2. Compute  $\{\epsilon_{ii}\}$  and  $\{\mu_{ij}\}$  using the industry eq formulas.
- 3. Construct the 'hatted' equilibrium values as follows:

$$\begin{split} \widehat{w}_{ij} &= \mu_{ij}^{\frac{1}{1+(1-\widetilde{\alpha})\theta}} \widehat{z}_{ij}^{\frac{1}{1+(1-\widetilde{\alpha})\theta}} s_{ij}^{-\frac{(1-\widetilde{\alpha})(\eta-\theta)}{\eta+1}} \frac{1}{1+(1-\widetilde{\alpha})\theta} \\ \widehat{\mathbf{w}}_{j} &= \left[ \sum_{i \in j} \widehat{w}_{ij}^{\eta+1} \right]^{\frac{1}{\eta+1}} \\ \widehat{\mathbf{W}} &= \left[ \int \widehat{\mathbf{w}}_{j}^{\theta+1} dj \right]^{\frac{1}{\theta+1}} \\ \widehat{n}_{ij} &= \left( \frac{\widehat{w}_{ij}}{\widehat{\mathbf{w}}_{i}} \right)^{\eta} \left( \frac{\widehat{\mathbf{w}}_{j}}{\widehat{\mathbf{W}}} \right)^{\theta} \left( \frac{\widehat{\mathbf{W}}}{1} \right)^{\varphi} \end{split}$$

- 4. Update the wage-bill share vector using previous expression (prior slide).
- 5. Iterate until convergence of wage-bill shares. Back

**Recovering true equilibrium values from 'hatted' equilibrium:** Once the 'hatted' equilibrium is solved, we can construct the true equilibrium values by rescaling as follows:

$$\omega = \frac{\widetilde{Z}}{\overline{\varphi}^{1-\widetilde{\alpha}}} \tag{3a}$$

$$\mathbf{W} = \omega^{\frac{1}{1 + (1 - \tilde{\alpha})\varphi}} \widehat{\mathbf{W}}^{\frac{1 + (1 - \tilde{\alpha})\theta}{1 + (1 - \tilde{\alpha})\varphi}} \tag{3b}$$

$$w_{ij} = \omega^{\frac{1}{1 + (1 - \tilde{\alpha})\theta}} \mathbf{W}^{\frac{(1 - \tilde{\alpha})(\theta - \varphi)}{1 + (1 - \tilde{\alpha})\theta}} \widehat{w}_{ij}$$
(3c)

$$\mathbf{w}_{j} = \omega^{\frac{1}{1 + (1 - \tilde{\alpha})\theta}} \mathbf{W}^{\frac{(1 - \tilde{\alpha})(\theta - \varphi)}{1 + (1 - \tilde{\alpha})\theta}} \widehat{\mathbf{w}}_{j}$$
(3d)

$$n_{ij} = \overline{\varphi} \left( \frac{w_{ij}}{\mathbf{w}_j} \right)^{\eta} \left( \frac{\mathbf{w}_j}{\mathbf{W}} \right)^{\theta} \left( \frac{\mathbf{W}}{1} \right)^{\varphi} \tag{3e}$$

We set the scale parameters  $\overline{\phi}$  and  $\widetilde{Z}$  in order to match average firm size observed in the data  $(AveFirmSize^{Data}=27.96$  from Table 5), and average earnings per worker in the data  $(AveEarnings^{Data}=\$65,773$  from Table 5):

$$\widehat{AveFirmSize}^{Data} = \frac{\int \left\{ \sum_{i \in j} n_{ij} \right\} dj}{\int \left\{ M_j \right\} dj}$$
 (4a)

$$\widehat{AveEarnings}^{Data} = \frac{\int \left\{ \sum_{i \in j} w_{ij} n_{ij} \right\} dj}{\int \left\{ \sum_{i \in j} n_{ij} \right\} dj}$$
(4b)

To compute the values of  $\overline{\varphi}$  and  $\widetilde{Z}$  that allow us to match  $AveFirmSize^{Data}$  and  $AveEarnings^{Data}$ , we substitute the model's values for  $n_{ij}$ ,  $w_{ij}$ , and  $M_j$  into  $AveFirmSize^{Data}$  and  $AveEarnings^{Data}$ . We repetitively substitute equations (3a) through (3e) into (4a) and (4b). We then solve for  $\overline{\varphi}$  and  $\widetilde{Z}$ :

$$\overline{\varphi} = \frac{\frac{AveFirmSize^{Data}}{AveFirmSize}}{\left(\frac{AveEarnings^{Data}}{AveEarnings}\right)^{\varphi}}$$
(5)

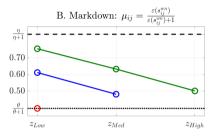
$$\widetilde{Z} = \overline{\varphi}^{1-\widetilde{\alpha}} \left( \frac{AveEarnings^{Data}}{AveEarnings} \right)^{1+(1-\widetilde{\alpha})\varphi} \times \widehat{\boldsymbol{W}}^{-(1-\widetilde{\alpha})(\theta-\varphi)}$$
(6)

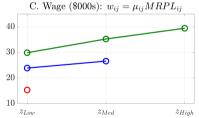
where

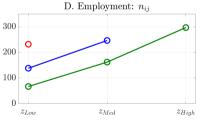
$$\begin{aligned} & \textit{AveFirmSize}^{\textit{Model}} = \frac{\int \left\{ \sum_{i \in j} \widehat{n}_{ij} \right\} dj}{\int \left\{ M_{j} \right\} dj} \\ & \textit{AveEarnings}^{\textit{Model}} = \frac{\int \left\{ \sum_{i \in j} \widehat{w}_{ij} \widehat{n}_{ij} \right\} dj}{\int \left\{ \sum_{i \in j} \widehat{n}_{ij} \right\} dj} \end{aligned}$$

## Firms - Local labor market equilibrium



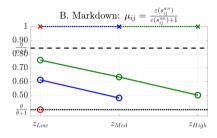


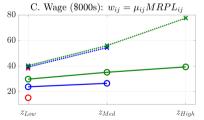




## Firms - Local labor market equilibrium - Competitive









## Aggregation – Labor share and concentration

$$\begin{split} & ls_{ij} = \frac{w_{ij}n_{ij}}{\widetilde{z}_{ij}\widetilde{Z}n_{ij}^{\widetilde{\alpha}}} \\ & ls_{ij} = \widetilde{\alpha} \frac{w_{ij}}{\widetilde{\alpha}\widetilde{z}_{ij}\widetilde{Z}n_{ij}^{\widetilde{\alpha}-1}} \\ & ls_{ij} = \widetilde{\alpha} \frac{w_{ij}}{MRPL_{ij}} \\ & ls_{ii} = \widetilde{\alpha}\mu_{ii} \end{split}$$

Let  $y_{ij} = \tilde{z}_{ij} \tilde{Z} n_{ii}^{\tilde{\alpha}}$ . At the market level, the labor share in market j,  $LS_j$ , is given by the following expression:

$$LS_{j} = \left[\frac{\sum_{i} y_{ij}}{\sum_{i} w_{ij} n_{ij}}\right]^{-1}$$
$$= \left[\sum_{i} \left(\frac{w_{ij} n_{ij}}{\sum_{i} w_{ij} n_{ij}}\right) \frac{y_{ij}}{w_{ij} n_{ij}}\right]^{-1}$$

► Back - Labor share and aggregation

## Aggregation – Labor share and concentration

Using the definition of the wage-bill share,

$$\begin{split} LS_{j}^{-1} &= \sum_{i} s_{ij}^{\textit{wn}} \widetilde{\alpha}^{-1} \mu_{ij}^{-1} \\ LS_{j}^{-1} &= \widetilde{\alpha}^{-1} \sum_{i} s_{ij}^{\textit{wn}} \left[ \frac{\eta+1}{\eta} + s_{ij}^{\textit{wn}} \left( \frac{\theta+1}{\theta} - \frac{\eta+1}{\eta} \right) \right] \\ LS_{j}^{-1} &= \widetilde{\alpha}^{-1} \frac{\eta+1}{\eta} + \widetilde{\alpha}^{-1} \left( \frac{\theta+1}{\theta} - \frac{\eta+1}{\eta} \right) HHI_{j}^{\textit{wn}} \end{split}$$

Define the inverse Herfindahl at the market level as  $IHI_j^{wn}=(HHI_j^{wn})^{-1}$ . Aggregating across markets yields the economy-wide labor share:

$$\begin{split} LS^{-1} &= \frac{\int \sum y_{ij}}{\int \sum w_{ij} n_{ij}} = \int \frac{\sum w_{ij} n_{ij}}{\int \sum w_{ij} n_{ij}} \frac{\sum y_{ij}}{\sum w_{ij} n_{ij}} \\ &= \int s_j^{wn} L S_j^{-1} \\ LS^{-1} &= \frac{1}{\widetilde{\alpha}} \left( \frac{\eta + 1}{\eta} + \left( \frac{\theta + 1}{\theta} - \frac{\eta + 1}{\eta} \right) \int s_j^{wn} \left( IHI_j^{wn} \right)^{-1} dj \right) \end{split}$$

## Aggregation – Labor share and concentration

Wage Bill Herfindahl: 
$$HHI_j^{wn} \equiv \sum_i (s_{ij}^{wn})^2$$
,  $s_{ij}^{wn} = \frac{w_{ij}n_{ij}}{\sum_i w_{ij}n_{ij}}$   
Employment Herfindahl:  $HHI_j^n \equiv \sum_i (s_{ij}^n)^2$ ,  $s_{ij}^n = \frac{n_{ij}}{\sum_i n_{ij}}$ 

Note:

$$HHI_{j}^{wn} = \sum_{i} \left( \frac{w_{ij}}{\sum_{i} s_{ij}^{n} w_{ij}} \right) \left( s_{ij}^{n} \right)^{2}$$

1. Employment Herfindahl yields less concentration:

Since 
$$cov(s_{ij}^n, w_{ij}) > 0$$
, then  $HHI_j^{wn} > HHI_j^n$ 

2.  $cov(s_{ij}^n, w_{ij})$  is endogenous and depends on concentration

► Back - Labor share and aggregation

Table: Summary Statistics, Longitudinal Employer Database 1976 and 2014

|  | (A) Firm-market-level averages |                    |
|--|--------------------------------|--------------------|
|  | 1976´                          | 2014               |
| Total firm pay (000s)  | 470.90                         | 1839.00            |
| Total firm employment  | 37.09                          | 27.96              |
| Pay per employee   | \$ 12,696                      | \$ 65,773          |
| Firm-level observations  | 660,000                        | 810,000            |
|  |                                | ket-level averages |
|  | 1976                           | 2014               |
| Wage-bill Herfindahl (Unweighted)                                      | 0.45                           | 0.45               |
| Employment Herfindahl (Unweighted)                                     | 0.43                           | 0.42               |
| Wage-bill Herfindahl (Weighted by market's share of total employment)  | 0.19                           | 0.14               |
| Employment Herfindahl (Weighted by market's share of total employment) | 0.18                           | 0.12               |
| Firms per market   | 42.56                          | 51.60              |
| Percent of markets with 1 firm   | 14.6%                          | 14.7%              |
| National employment share of markets with 1 firm                       | 0.63%                          | 0.36%              |
| Market-level observations  | 15,000                         | 16,000             |
|  | (C) Market-level correlation   |                    |
|  | 1976                           | 2014               |
| Correlation of Wage-bill Herfindahl and number of firms                | -0.22                          | -0.21              |
| Correlation of Wage-bill Herfindahl and Std. Dev. Of Relative Wages    | -0.49                          | -0.51              |
| Correlation of Wage-bill Herfindahl and Employment Herfindahl          | 0.98                           | 0.98               |
| Correlation of Wage-bill Herfindahl and Market Employment              | -0.20                          | -0.21              |
| Market-level observations  | 15,000                         | 16,000             |

Notes: Tradeable NAICS2 codes (11,21,31,32,33,55). Back to overline chart Berger Herkenhoff Mongey, "Labor Market Power"

|                                | (A) Firm-m | (A) Firm-market-level averages |  |  |
|--------------------------------|------------|--------------------------------|--|--|
|                                | 1976       | 2014                           |  |  |
| Total firm pay (000s)          | 209.40     | 1102.00                        |  |  |
| Total firm employment          | 19.43      | 23.21                          |  |  |
| Pay per employee               | \$ 10,777  | \$ 47,480                      |  |  |
| Firm-Market level observations | 3,746,000  | 5,854,000                      |  |  |

|   | (B) Market-level averages |        |
|---|---------------------------|--------|
|   | 1976                      | 2014   |
| Wage-bill Herfindahl (Unweighted)                                     | 0.36                      | 0.34   |
| Employment Herfindahl (Unweighted)                                    | 0.33                      | 0.32   |
| Wage-bill Herfindahl (Weighted by market's share of total wage-bill)  | 0.17                      | 0.11   |
| Employment Herfindahl (Weighted by market's share of total wage-bill) | 0.15                      | 0.09   |
| Firms per market  | 75.70                     | 113.20 |
| Percent of markets with 1 firm  | 10.4%                     | 9.4%   |
| Market level observations   | 49,000                    | 52,000 |

|   | (C) Market-level correlations |        |
|---|-------------------------------|--------|
|   | 1976                          | 2014   |
| Correlation of Wage-bill Herfindahl and number of firms       | -0.20                         | -0.17  |
| Correlation of Wage-bill Herfindahl and Employment Herfindahl | 0.97                          | 0.97   |
| Correlation of Wage-bill Herfindahl and Market Employment     | -0.15                         | -0.16  |
| Market-level observations                                     | 49,000                        | 52,000 |

Notes: All NAICS. | Back to overline chart | Back to calib

## Corporate taxes, labor and wages

|                                  | log n <sub>ijt</sub><br>(1) | log n <sub>ijt</sub><br>(2) | $\log w_{ijt}$ (3)        | log w <sub>ijt</sub><br>(4) |
|----------------------------------|-----------------------------|-----------------------------|---------------------------|-----------------------------|
| $	au_{s(j)t}$                    | -0.00357***<br>(0.000644)   | -0.00368***<br>(0.000757)   | -0.00181***<br>(0.000584) | -0.00187***<br>(0.000588)   |
| $s_{ijt}^{wn}$                   |                             | 2.085***<br>(0.0467)        |                           | 0.214***<br>(0.00724)       |
| $	au_{s(j)t} 	imes s^{wn}_{ijt}$ |                             | 0.0158***<br>(0.00495)      |                           | 0.00310***<br>(0.000749)    |
| Year FE                          | Υ                           | Υ                           | Υ                         | Υ                           |
| Commuting Zone/Industry FE       | Υ                           | Υ                           | Υ                         | Υ                           |
| Firm×State FE                    | Υ                           | Υ                           | Υ                         | Υ                           |
| R-squared<br>Round N             | 0.872<br>4,425,000          | 0.877<br>4,425,000          | 0.819<br>4,425,000        | 0.821<br>4,425,000          |

Notes: \*\*\* p<0.01, \*\* p<0.05, \* p<0.1 Standard errors clustered at State×Year level. Tradeable C-Corps from 2002 to 2014.

- 1 ppt increase in  $\tau_{s(i)t}$  causes a -0.36% change in employment
- Elast. is -0.32% at mean  $s_{ij}^{wn}=0.03$  and -0.15% for 1-std dev larger  $s_{ij}^{wn}=0.14$

## Data Appendix

#### Data:

- Isolate all plants (Ibdnums) with non missing firmids, with strictly positive pay, strictly positive employment, non-missing county codes for the continental US (we exclude Alaska, Hawaii, and Puerto Rico)
- isolate all lbdnums with non-missing 2 digit NAICS codes equal to 11,21,31,32,33, or 55.
- We use the consistent 2007 NAICS codes provided by Fort & Klimek throughout the paper.
- Define a firm to be the sum of all establishments in a commuting zone with a common firmid and NAICS3 classification.
- 1. **Summary Statistics Sample:** Our summary statistics include all observations that satisfy the above criteria in 1976 and 2014.
- Corporate Tax Sample: The corporate tax analysis includes all observations that satisfy the above criteria between 2002 and 2014 with an LFO of 'C'. Firms must operate in at least two markets within a state.



## Data Appendix

#### Table: Sample NAICS3 Codes.

| NAICS3 | Description                                     | NAICS3 | Description  |
|--------|---|--------|--|
| 111    | Crop Production                                 | 322    | Paper Manufacturing                                  |
| 112    | Animal Production and Aquaculture               | 323    | Printing and Related Support Activities              |
| 113    | Forestry and Logging                            | 324    | Petroleum and Coal Products Manufacturing            |
| 114    | Fishing, Hunting and Trapping                   | 325    | Chemical Manufacturing                               |
| 115    | Support Activities for Agriculture and Forestry | 326    | Plastics and Rubber Products Manufacturing           |
| 211    | Oil and Gas Extraction                          | 327    | Nonmetallic Mineral Product Manufacturing            |
| 212    | Mining (except Oil and Gas)                     | 331    | Primary Metal Manufacturing                          |
| 213    | Support Activities for Mining                   | 332    | Fabricated Metal Product Manufacturing               |
| 311    | Food Manufacturing                              | 333    | Machinery Manufacturing                              |
| 312    | Beverage and Tobacco Product Manufacturing      | 334    | Computer and Electronic Product Manuf.               |
| 313    | Textile Mills                                   | 335    | Electrical Equipment, Appliance, and Component Manuf |
| 314    | Textile Product Mills                           | 336    | Transportation Equipment Manufacturing               |
| 315    | Apparel Manufacturing                           | 337    | Furniture and Related Product Manufacturing          |
| 316    | Leather and Allied Product Manufacturing        | 339    | Miscellaneous Manufacturing                          |
| 321    | Wood Product Manufacturing                      | 551    | Management of Companies and Enterprises              |



## Data Appendix

#### Table: Commuting Zone Examples

| CZ ID, 2000 | County Name       | Metropolitan Area, 2003   | County Pop. 2000 | CZ Pop. 2000 |
|-------------|-------------------|---|------------------|--------------|
| 58          | Cook County       | Chicago-Naperville-Joliet, IL Metropolitan Division                   | 5,376,741        | 8,704,935    |
| 58          | DeKalb County     | Chicago-Naperville-Joliet, IL Metropolitan Division                   | 88,969           | 8,704,935    |
| 58          | DuPage County     | Chicago-Naperville-Joliet, IL Metropolitan Division                   | 904,161          | 8,704,935    |
| 58          | Grundy County     | Chicago-Naperville-Joliet, IL Metropolitan Division                   | 37,535           | 8,704,935    |
| 58          | Kane County       | Chicago-Naperville-Joliet, IL Metropolitan Division                   | 404,119          | 8,704,935    |
| 58          | Kendall County    | Chicago-Naperville-Joliet, IL Metropolitan Division                   | 54,544           | 8,704,935    |
| 58          | Lake County       | Lake County-Kenosha County, IL-WI Metropolitan Division               | 644,356          | 8,704,935    |
| 58          | McHenry County    | Chicago-Naperville-Joliet, IL Metropolitan Division                   | 260,077          | 8,704,935    |
| 58          | Will County       | Chicago-Naperville-Joliet, IL Metropolitan Division                   | 502,266          | 8,704,935    |
| 58          | Kenosha County    | Lake County-Kenosha County, IL-WI Metropolitan Division               | 149,577          | 8,704,935    |
| 58          | Racine County     | Racine, WI Metropolitan Statistical Area                              | 188,831          | 8,704,935    |
| 58          | Walworth County   | Whitewater, WI Micropolitan Statistical Area                          | 93,759           | 8,704,935    |
| 47          | Anoka County      | Minneapolis-St. Paul-Bloomington, MN-WI Metropolitan Statistical Area | 298,084          | 2,904,389    |
| 47          | Carver County     | Minneapolis-St. Paul-Bloomington, MN-WI Metropolitan Statistical Area | 70,205           | 2,904,389    |
| 47          | Chisago County    | Minneapolis-St. Paul-Bloomington, MN-WI Metropolitan Statistical Area | 41,101           | 2,904,389    |
| 47          | Dakota County     | Minneapolis-St. Paul-Bloomington, MN-WI Metropolitan Statistical Area | 355,904          | 2,904,389    |
| 47          | Hennepin County   | Minneapolis-St. Paul-Bloomington, MN-WI Metropolitan Statistical Area | 1,116,200        | 2,904,389    |
| 47          | Isanti County     | Minneapolis-St. Paul-Bloomington, MN-WI Metropolitan Statistical Area | 31,287           | 2,904,389    |
| 47          | Ramsey County     | Minneapolis-St. Paul-Bloomington, MN-WI Metropolitan Statistical Area | 511,035          | 2,904,389    |
| 47          | Scott County      | Minneapolis-St. Paul-Bloomington, MN-WI Metropolitan Statistical Area | 89,498           | 2,904,389    |
| 47          | Washington County | Minneapolis-St. Paul-Bloomington, MN-WI Metropolitan Statistical Area | 201,130          | 2,904,389    |
| 47          | Wright County     | Minneapolis-St. Paul-Bloomington, MN-WI Metropolitan Statistical Area | 89,986           | 2,904,389    |
| 47          | Pierce County     | Minneapolis-St. Paul-Bloomington, MN-WI Metropolitan Statistical Area | 36,804           | 2,904,389    |
| 47          | St. Croix County  | Minneapolis-St. Paul-Bloomington, MN-WI Metropolitan Statistical Area | 63,155           | 2,904,389    |

# **Summary Statistics**

Table: Summary Statistics, C-Corp Sample

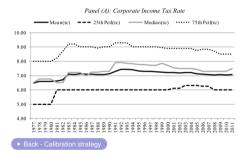
| Variable   | Mean  | Std. Dev. |
|--|-------|-----------|
| Corporate Tax Rate in Percent $(\tau_{s(j)t})$           | 7.14  | 3.19      |
| Change in Corporate Tax Rate                             | 0.05  | 0.78      |
| Total Pay At Firm (Thousands)                            | 2148  | 19010     |
| Total Employment At Firm                                 | 37.99 | 215.2     |
| Wage Bill Share $(s_{iit}^{wn})$                         | 0.03  | 0.12      |
| HHI - Wage Bill  | 0.10  | 0.16      |
| Log Number of Firms per Market [exp(5.56)=259.8]         | 5.56  | 2.01      |
| Log Total Employment ( $\log n_{ijt}$ ) [exp(2.39)=10.9] | 2.39  | 1.32      |
| Log Wage ( $\log w_{ijt}$ ) [exp(3.58)=\$35k]            | 3.58  | 0.71      |
| Observations   |       | 4,425,000 |

Notes: Tradeable C-Corps from 2002 to 2012.



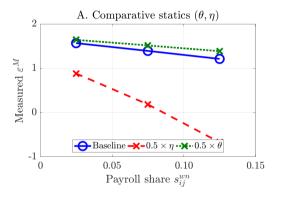
# **Summary Statistics**

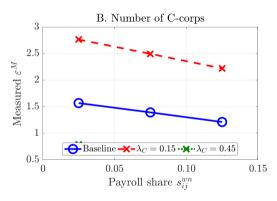
#### Reproduced from Giroud and Rauh (2011):



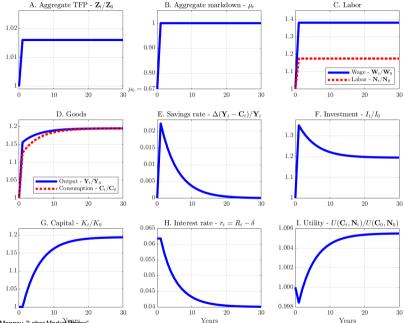


## Bias in idiosyncratic shock case



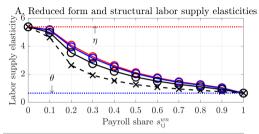


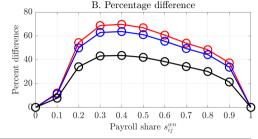
▶ Back - Measured and perceived elasticities



▶ Back

## Measured and perceived labor supply elasticities





- $\times$  -Structural elasticity  $\varepsilon(s_{ij})$  Reduced form elasticity  $\widehat{\epsilon}(s_{ij})$ : 1% productivity shock
   Reduced form elasticity  $\widehat{\epsilon}(s_{ij})$ : 10% productivity shock
   Reduced form elasticity  $\widehat{\epsilon}(s_{ij})$ : 50% productivity shock
- → % diff. b/w reduced form & structural elast.: 1% prod. shock

  → % diff. b/w reduced form & structural elast.: 10% prod. shock

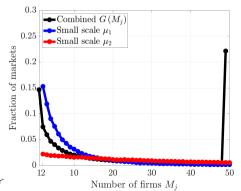
  → % diff. b/w reduced form & structural elast.: 50% prod. shock
- Method Simulate purely idiosyncratic shock to a single firm
- Result Estimated Reduced form  $\widehat{\varepsilon}(s)$  is always larger than Structural  $\varepsilon(s)$
- Implication Treating reduced form as structural <u>understates</u> labor market power

ightharpoonup Back - Bias when using idiosyncratic shocks:  $\widehat{\epsilon} > \epsilon$ 

# Calibration - Number of firms $M_j$

- 15% of markets have one firm  $(M_i = 1)$
- Rest drawn from two Paretos, same shape  $\gamma$ , different scales  $\mu_1$ ,  $\mu_2$

| Distribution of number of firms $M_j$ | Mean | Std.Dev. | Skewness |
|---------------------------------------|------|----------|----------|
| Data (LBD, 2014)                      | 51.6 | 264.9    | 29.9     |
| Model                                 | 51.6 | 264.9    | 28.7     |



► Back - Calibration table

## Calibration

Table: Estimated parameters

| Par.   | Description  | Value           | Targeted Moment                          | Model              | Data               |
|--|--|-----------------|--|--------------------|--------------------|
| $\widetilde{\alpha}$ $\sigma_{\widetilde{\tau}}$ | DRS parameter Log Normal Standard Deviation                | 0.984<br>0.391  | Labor share $E(HHI_i^{wn})$ Payroll wtd. | 0.57<br>0.14       | 0.57<br>0.14       |
| $\frac{\widetilde{Z}}{\overline{\varphi}}$       | Productivity shifter<br>Aggregate labor disutility shifter | 23,570<br>6.904 | Avg. wage per worker<br>Avg firm size    | \$ 65,773<br>27.96 | \$ 65,773<br>27.96 |

#### Labor share:

- ► To recover labor-share, we must take a stance on capital's share of income
- Assume KS = .18 as in Barkai (2018)

$$\widetilde{lpha} = rac{lpha\gamma}{1 - (1 - \gamma)\,lpha} \ \widetilde{lpha} = rac{lpha\gamma}{1 - \mathit{KS}}$$



## 1. Non-targeted concentration measures

| Moment  | Model | Data  |
|---|-------|-------|
| A. Unweighted   |       |       |
| Wage-bill Herfindahl (unweighted)   | 0.35  | 0.45  |
| Std. Dev. of Wage-bill Herfindahl (unweighted)                                  | 0.33  | 0.33  |
| Skewness of Wage-bill Herfindahl (unweighted)                                   | 1.07  | 0.48  |
| B. Weighted   |       |       |
| Wage-bill Herfindahl (weighted by market's share of total payroll)              | 0.14  | 0.14  |
| Std. Dev. of Wage-bill Herfindahl (weighted by market's share of total payroll) | 0.03  | 0.20  |
| Skewness of Wage-bill Herfindahl (weighted by market's share of total payroll)  | 3.01  | 2.20  |
| C. Correlations of Wage-bill Herfindahl   |       |       |
| Number of firms   | -0.52 | -0.21 |
| Std. Dev. Of Relative Wages   | -0.31 | -0.51 |
| Employment Herfindahl   | 1.00  | 0.98  |
| Market Employment   | -0.75 | -0.21 |

- Model generates 2x difference between wtd. and unwtd. HHIwn



## Pass-through - Details

- 1. Replicate experiment in KPWZ (QJE 2019)
- Same sample properties: (i) median firm size, (ii) average VAPW increase
- Randomly sample 1% of firms with size greater than  $\overline{n}$  employees
  - With  $\overline{n} = 2$ , match median size of 25 in KPWZ
- Then increase productivity by △
  - With  $\Delta = 14\%$  match increase in  $vapw_{ii}$  of 13 percent in KPWZ
- Repeat exercise 10 times, report average point estimates
- 2. Compare to following statistic from KPWZ
- Table 2, Panel A. Top dosage quintile Mean VAPW = \$120, 160, Median n = 25.26
- Table 5 col(4) Event study.  $\uparrow VAPW = \$15,740 \implies \uparrow 13\%$
- Table 8B col(1b) IV regression  $w_{ijt} = \alpha_{ij} + 0.23 vap w_{ijt}$ . Elast. = 0.23  $\left(\frac{\overline{vapw}}{\overline{w}}\right) = 0.47$

## 2. Pass-through

| Size cutoff  | 2.00   |
|--|--------|
| Fraction of Firms  | 0.01   |
| N firms  | 906    |
| Log change in VAPW (VAPW= $\widetilde{Z}	ilde{z}_{ij}n_{ii}^{	ilde{\alpha}-1}$ ) | 0.13   |
| Data Percent change in VAPW (Panel A Table 2 and Table 5 =15.74/120.16)          | .13    |
| Shock size   | 0.14   |
| Nsims  | 1.00   |
| Median firm size   | 25.07  |
| Data median firm size  | 25.26  |
| Mean firm size   | 56.37  |
| Data mean firm size  | 61.49  |
| Median VAPW (dollars)  | 90565  |
| Data median VAPW (dollars)   | 86870  |
| Mean VAPW (dollars)  | 92314  |
| Data mean VAPW (dollars)   | 120160 |

► Back - Pass-through results

## 3. Size wage premium

- Size-wage premium regressions in Bloom et al (2018)

$$\log w_{ij} = \beta_0 + \beta_1 \log n_{ij} + \epsilon_{ij}$$

|                             | Model                        | Bloom et al (2018), 1980 | Bloom et al (2018), 2013 |
|-----------------------------|------------------------------|--------------------------|--------------------------|
|                             | (1)                          | (2)                      | (3)                      |
| Elasticity of wage WRT size | 0.18                         | 0.11                     | 0.03                     |
| Dependent variable          | $log(w_{ij}) \\ log(n_{ij})$ | Log annual earnings      | Log annual earnings      |
| Independent variable        |                              | Log firm employees       | Log firm employees       |

- Model implies 10% larger firm pays 1.8% more



## Discussion - Wage bill shares and MRPL

## Identifying MRPL

$$\frac{s_{ijt}^{wn}}{s_{ikt}^{wn}} = \left(\frac{\mu\left(s_{ijt}^{wn}\right)}{\mu\left(s_{ikt}^{wn}\right)}\right)^{1+\eta} \left(\frac{MRPL_{ijt}}{MRPL_{ikt}}\right)^{1+\eta}$$

- Up to a normalization,  $\{s_{ijt}^{wn}\}$  can be used to infer  $\{MRPL_{ijt}\}$ 

## Discussion - Wage bill shares and MRPL

#### Identifying MRPL

$$\frac{s_{ijt}^{wn}}{s_{ikt}^{wn}} = \left(\frac{\mu\left(s_{ijt}^{wn}\right)}{\mu\left(s_{ikt}^{wn}\right)}\right)^{1+\eta} \left(\frac{MRPL_{ijt}}{MRPL_{ikt}}\right)^{1+\eta}$$

- Up to a normalization,  $\{s_{ijt}^{wn}\}$  can be used to infer  $\{MRPL_{ijt}\}$ 

#### Implications for measurement in LBD

- Labor markets relatively easy to define
- Wage bill shares observed  $s_{ijt}^{wn}$
- Construct wage bill Herfindahl indices  $HHI_{jt} = \sum_{i} s_{ijt}^{wn2}$
- Contrast with studies of competition in goods markets which do not have local measures of sales shares

Autor, Dorn, Katz, Patterson, Van Reenen (2018), Phillipon Gutierrez (2018)



## 2. Pass-through - Corporate tax effects

#### After-tax profits with a corporate profit tax

$$\begin{array}{rcl} \pi_{ij} & = & \pi^{Econ.}_{ij} - \tau_{C} \pi^{Acc.}_{ij} \\ \pi^{Econ.}_{ij} & = & z_{ij} n^{\alpha}_{ij} k^{1-\alpha}_{ij} - w_{ij} n_{ij} - Rk_{ij} - \delta k_{ij} \\ \pi^{Acc.}_{ij} & = & z_{ij} n^{\alpha}_{ij} k^{1-\alpha}_{ij} - w_{ij} n_{ij} - \lambda_{K} Rk_{ij} - \delta k_{ij} \end{array}$$

- Can only write off fraction  $\lambda_K$  of capital financed by debt

#### Result

$$\pi_{ij} = MRPL(z_{ij}, r, \tau_C) n_{ij} - w_{ij} n_{ij}$$

$$MRPL(z_{ij}, r, \tau_C) = \frac{1}{1 + \tau_C} \alpha (1 - \alpha)^{\frac{1 - \alpha}{\alpha}} \left(\frac{\widetilde{z}_{ij}}{\widetilde{R}}\right)^{\frac{1 - \alpha}{\alpha}} \widetilde{z}_{ij}$$

$$\widetilde{z}_{ij} = (1 - \tau_C) z_{ij}$$

$$\widetilde{R} = (1 + \lambda_K \tau_C) r + (1 + \tau_C) \delta$$

#### Product market discussion

- Labor market power  $\mu_{ijt}$  identified from product market power in tradeable goods market (the focus of our paper)
- Tradeable goods prices that are set non-competitively by a firm enter the marginal revenue product, MRPL<sub>ijt</sub>
- MRPLiit is distinct from what we call the labor market markdown
- We recover  $\mu_{ijt}$  by comparing local labor market responses to corporate tax changes within a NAICS3 code
- If tradeable good prices (e.g. furniture prices) do not differ across local labor markets within a state, our estimate of  $\mu_{iit}$  only captures labor market power.

► Back

## Evidence of upward sloping labor supply curves

#### Generation 1: Exogenous variation in employment demand or wages

- Staiger, Spetz, Phibbs (2010): mandated pay changes in registered nurse market (from national payscale to local)
  - LS elast of 0.10
- Ashenfelter, Farber, Ransom (2010) provide summary

#### Generation 2: Vacancy applications and wages

- Banfi and Villena-Roldan (2018): controlling for firm size, job title, and all available observables, higher wage offering attracts more workers
- Belot, M., P. Kircher, and P. Muller (2015): in actual UI sponsored job search office, post fake vacancies with higher wages, those vacancies draw more job searchers

Strong evidence for upward sloping LS curve faced by individual firms, conditional on size

## Is monopsony power generated by outside options

Theory: Zhu (2011) provides framework with N firms, agents understand outside option is to match with remaining N-1 firms

- Wages (asset prices) fall if bargaining breaks down

Empirics: Does outside option affect wages?

- Jager, Schoefer, Young, Zweimüller (2018): outside options not strong determinant of wages
  - Four large reforms of UI in Austria.
  - Wage response less than 1 cent per 1.00 dollar UI increase
  - Nash-bargaining implies 39 cent per 1.00 dollar UI increase in calibrated model
- Hagedorn, Karahan, Manovskii, Mitman (2014): important determinants
  - County border-pair identification strategy



## Welfare - Output decomposition - Details

- Compute counterfactual output with scale effect only:

$$n_{ij}^{s} = n_{ij} \frac{\int \sum n_{ij}^{c} dj}{\int \sum n_{ij} dj}$$
$$y_{ij}^{s} = \widetilde{z}_{ij} \widetilde{Z}(n_{ij}^{s})^{\widetilde{\alpha}}$$

- We then compute the share of gains due to reallocation:

$$\frac{\frac{\int \sum y_{ij}^c \ dj}{\int \sum y_{ij} \ dj} - \frac{\int \sum y_{ij}^s \ dj}{\int \sum y_{ij} \ dj}}{\frac{\int \sum y_{ij}^c \ dj}{\int \sum y_{ij} \ dj} - 1}$$

- Share output gains due to reallocation: 26%
- Share output gains due to scale: 74%

## Minimum wage - Appendix

Household - Additional constraint: Labor supply less than labor demand:

$$n_{ijt} \leq \underline{n}_{ijt}$$

- Define  $\lambda_t \nu_{ijt}$  as associated multiplier
- $\lambda_t$  is the multiplier on the budget constraint
- $v_{ijt}$  is marginal utility of sending a worker to firm with a binding  $w_{ij} = \underline{w}$
- $\widetilde{w}_{iit} = w_{iit} v_{iit}$  is the perceived wage

Firm - Problem as before with added constraint:

$$w_{ijt} = egin{cases} \overline{arphi}^{-rac{1}{arphi}} \mathbf{N}_t^{rac{1}{arphi}} igg( rac{\mathbf{N}_{jt}}{\mathbf{N}_t} igg)^{rac{1}{artheta}} igg( rac{n_{jit}}{\mathbf{N}_{jt}} igg)^{rac{1}{\eta}} &, & ext{if} \quad n_{ijt} > \underline{n}_{ijt} \ rac{\omega}{\eta} &, & ext{otherwise} \end{cases}$$

Result - Equilibrium can be solved in perceived wages  $\widetilde{w}_{ijt}$ 

# Minimum wage - Appendix

Define the *perceived* wage-bill share:

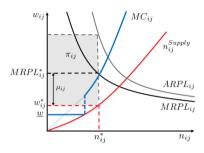
$$\widetilde{s}_{ijt} = \frac{(w_{ijt} - v_{ijt})n_{ijt}}{\sum_{i \in j} (w_{ijt} - v_{ijt})n_{ijt}}$$

Define the *perceived* sectoral and aggregate wage indexes:

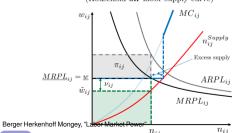
$$\widetilde{\mathbf{W}}_{jt} := \left[\sum_{i \in j} \left(w_{ijt} - 
u_{ijt}
ight)^{1+\eta}
ight]^{rac{1}{1+\eta}} \quad , \quad \widetilde{\mathbf{W}}_t := \left[\int \widetilde{\mathbf{W}}_{jt}^{1+ heta} dj
ight]^{rac{1}{1+ heta}}.$$

▶ Back

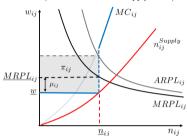
#### A. Region I - No effect



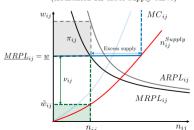
C. Region III - Increase employment (Household off labor supply curve)



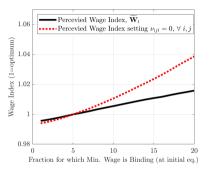
B. Region II - Increase in employment (Household on labor supply curve)



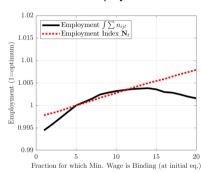
D. **Region IV** - Decrease employment (Household **off** labor supply curve)



# Minimum wage - Scale effects A. Wages



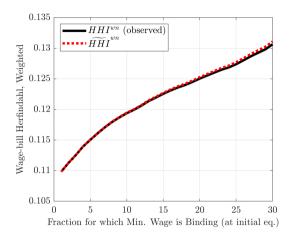
#### B. Employment



- (i) Perceived wages, which determine  $n_{ij}$ , do not increase as much
- (ii) Small firms shrink, (enter Region IV), employment falls
- (iii) HHI monotonically increases, implying falling labor share

▶ Back

## Minimum wage - Concentration



- E.g. Would imply decline in labor share of 2 ppt over this range

## Minimum wage - Appendix

- Initialize the algorithm by (i) guessing a value for  $\widetilde{\mathbf{W}}_t^{(0)}$ , (ii) assuming all firms are in *Region I*, which implies guessing  $v_{ijt}^{(0)} = 0$ . These will all be updated in the algorithm.
- 1. Solve the sectoral equilibrium:
  - 1.1 Guess perceived shares  $\tilde{s}_{iit}^{(0)}$ .
  - 1.2 In Region I, where minimum wage does not bind, solve for the firm's wage as before, except with the perceived aggregate wage index  $\widetilde{\mathbf{W}}_t$  instead of  $\mathbf{W}_t$ :

$$w_{ijt} = \left[\omega\mu\left(\widetilde{s}_{ijt}\right)\widetilde{\mathbf{W}}_{t}^{\left(1-\widetilde{\alpha}\right)\left(\theta-\varphi\right)}\widetilde{z}_{ijt}\widetilde{s}_{ijt}^{\left(I\right)-\frac{\left(1-\widetilde{\alpha}\right)\left(\eta-\theta\right)}{\eta+1}}\right]^{\frac{1}{1+\left(1-\widetilde{\alpha}\right)\theta}}$$

- 1.3 In all other regions Region II, III, IV, set  $w_{iit} = w$ .
- 1.4 Compute perceived wages using the guess  $v_{iit}^{(k)}$ :  $\widetilde{w}_{ijt} = w_{ijt} v_{iit}^{(k)}$
- 1.5 Update shares using  $\widetilde{w}_{ijt}$ :

$$\widetilde{s}_{ijt}^{(I+1)} = \frac{\widetilde{w}_{ijt}^{1+\eta}}{\sum_{i \in j} \widetilde{w}_{ijt}^{1+\eta}} \quad \left( := \frac{\widetilde{w}_{ijt} n_{ijt}}{\sum_{i \in j} \widetilde{w}_{ijt} n_{ijt}} = \frac{\widetilde{w}_{ijt} \overline{\varphi} \left( \frac{\widetilde{w}_{ijt}}{\overline{\mathbf{w}}_{it}} \right)^{\eta} \left( \frac{\widetilde{\mathbf{w}}_{jt}}{\overline{\mathbf{w}}_{t}} \right)^{\theta} \widetilde{\mathbf{W}}_{t}^{\varphi}}{\sum_{i \in j} \widetilde{w}_{ijt} \overline{\varphi} \left( \frac{\widetilde{w}_{ijt}}{\overline{\mathbf{w}}_{jt}} \right)^{\eta} \left( \frac{\widetilde{\mathbf{w}}_{jt}}{\overline{\mathbf{w}}_{t}} \right)^{\theta} \widetilde{\mathbf{W}}_{t}^{\varphi}} \right)$$

1.6 Iterate over (b)-(e) until  $\widetilde{s}_{ijt}^{(I+1)} = \widetilde{s}_{ijt}^{(I)}$ . Berger Herkenhoff Mongey, "Labor Market Power"

- 1. Recover employment  $n_{iit}$  according to the current guess of firm region. First use  $\widetilde{w}_{iit}$  to compute  $\widetilde{\mathbf{W}}_{it}$ ,  $\widetilde{\mathbf{W}}_{t}$ . Then by region:
  - (I) Firm is unconstrained:

$$n_{ijt} = \overline{\varphi} \left( \frac{w_{ijt}}{\widetilde{\mathbf{W}}_{jt}} \right)^{\eta} \left( \frac{\widetilde{\mathbf{W}}_{jt}}{\widetilde{\mathbf{W}}_{t}} \right)^{\theta} \widetilde{\mathbf{W}}_{t}^{\varphi}$$

(II) Firm is constrained and employment is determined by the household labor supply curve at  $\underline{w}$ :

$$n_{ijt} = \overline{\varphi} \left( \frac{\underline{w}}{\widetilde{\mathbf{W}}_{jt}} \right)^{\eta} \left( \frac{\widetilde{\mathbf{W}}_{jt}}{\widetilde{\mathbf{W}}_{t}} \right)^{\theta} \widetilde{\mathbf{W}}_{t}^{\varphi}$$

(III),(IV) Firm is constrained and employment is determined by firm MRPL;; curve at w:

$$n_{ijt} = \left(\frac{\widetilde{\alpha}\widetilde{Z}\widetilde{z}_{ijt}}{\underline{w}}\right)^{\frac{1}{1-\widetilde{\alpha}}}$$

- 2. Update  $v_{ijt}^{(k)}$ :
  - 2.1 Use  $n_{ijt}$  to compute  $N_{jt}$ ,  $N_t$ .
  - 2.2 Update viit from the household's first order conditions:

$$v_{ijt}^{(k+1)} = w_{ijt} - \overline{\varphi}^{-\frac{1}{\overline{\varphi}}} \left( \frac{n_{ijt}}{N_{jt}} \right)^{\frac{1}{\overline{\eta}}} \left( \frac{N_{jt}}{N_t} \right)^{\frac{1}{\overline{\theta}}} N_t^{\frac{1}{\overline{\varphi}}}$$

- 3. Update  $\widetilde{\mathbf{W}}_{t}^{(k)}$ :
  - 3.1 Compute  $\tilde{w}_{iit} = w_{iit} v_{iit}^{(k+1)}$
  - 3.2 Use  $\widetilde{w}_{iit}$  to update the aggregate wage index to  $\widetilde{\mathbf{W}}_{t}^{(k+1)}$ .
- 4. Update firm regions:
  - 4.1 Compute profits for all firms:  $\pi_{ijt} = \tilde{Z}\tilde{z}_{ijt}n_{ijt}^{\tilde{\alpha}} \underline{w}n_{ijt}$ .
  - 4.2 If in sector j there exists a firm with  $w_{iit} < \overline{w}$ , then move the firm with the lowest wage into Region II.
- 4.3 If in sector j there exists a firm that was initially in Region II and has negative profits  $\pi_{iit} < 0$ , move that firm into Region III.<sup>1</sup>
- 5. Iterate over (1) to (5) until  $v_{ijt}^{(k+1)} = v_{ijt}^{(k)}$  and  $\widetilde{\mathbf{W}}_{t}^{(k+1)} = \widetilde{\mathbf{W}}_{t}^{(k)}$ .