

The heterogenous effects of employers' concentration on wages:
better sorting or uneven rent extracting?

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Introduction

When is labor market concentration high?

- When:
 1. there are few employers,
 2. the employment share of some employers is high (large employers)
- When a large employer increases his share of employment, or when medium- or small- sized employers leaves the market, labor market concentration increases
- Labor market concentration \Rightarrow market structure on the employers' side
- Measured with Herfindahl-Hirschmann index (HHI), ▶ HHI
 - DoJ and European commission benchmarks = above resp. **0.25** and **0.2**, product markets considered as very concentrated

Research questions

1. Beyond the average, how does labor market concentration affect the **distribution** of wages and hence wage **inequality**?
 - *Hypothesis* \Rightarrow A rise in labor market concentration increases inequality
2. How can labor market concentration affect inequality?
 - *Two mechanisms investigated* \Rightarrow **Sorting versus bargaining sensitivity**

Literature

1. Labor concentration and average wage

- Empirics: *Azar, Marinescu, Steinbaum, Taska* (2020), *Rinz* (2020), *Marinescu, Ouss, Pape* (2021), *Bassanini, Batut, Caroli* (2020)
- Theory: *Jarosch, Nimczik and Sorkin* (2021): in more concentrated market, higher probability of re-encountering twice the same employer

2. Labor concentration and inequality

- Empirics: *Rinz* (2020): few measures, no study of mechanism
- Theory: ?

3. Sorting

- Empirics: *Card, Heining, and Kline* (2016), *Song, Price, Guvenen, Bloom, and von Wachter* (2019): most change in wage inequality attributed to change in between-firm inequality rather to within-firm inequality, i.e. sorting
- Theory: *Eeckout* (2018) for a literature review

4. Monopsony: *Robinson* (1933) **Modern Monopsony**

- - *Manning* (2003), *Berger, Herkenhoff, Mongey* (2021), *Lamadon, Mogstad, Setzler* (2021): unobserved idiosyncratic preference over non-wage job features

We explore two mechanisms

1. "Better sorting"

- With more concentration, employers can be + demanding in the selection process \Rightarrow More efficient sorting \Rightarrow higher productivity workers gather in higher productivity firm (positive assortative matching)
- *Inequality and productivity increases*

2. "Bargaining sensitivity"

- Lower-paid jobs wage + sensitive to labor concentration: better-paid jobs wage depends relatively more on factors other than market structure
- *Inequality increases but no productivity gain*

Contribution

1. Using a combination of IV and fixed effects, we quantify the effect of labor market concentration along the wage distribution and on wage inequality between jobs in France

▶ Quantification

2. We investigate mechanisms at play
 - We find evidence that increase in inequality brought by labor market concentration is not linked to a better sorting, which could increase productivity, but to a higher sensitivity of the bargaining position of the least paid jobs to employers' concentration

Data & Measures

Data overview

- French administrative employee-employers data, DADS-Postes (INSEE) + FICUS-FARE (INSEE): balance-sheet information - Annual data
- Mainland France + Corsica over 2000-2019
- 178 sectors, 304 CZ
 - To cover the whole period, **we construct one unique sector classification** (2 revisions of NAF: 2003, 2008), exclude: agriculture, extraction, public sector, financial intermediation
 - ▶ List
 - We use the 2010 CZ classification for all the period

Definition of local labor market

- Local labor market: a sector in a Commuting Zone (CZ):
 - Example: the jobs in the rubber industry of the CZ including Béthune and 102 other '*communes*' make a local labor market
- We use sectors instead of occupations in main specification:
 1. Conceptual reason: we analyse between- and within- firm inequality, which makes more sense at sectoral level
 2. Data limitation: longer period covered with sectors, usable since 2009 only for occupations
 3. Worker mobility: similar using sectors or occupations, between 2017 and 2018, 7% of workers changed sector, 6.8% changed 3-digit occupation and 7.8% 4-digit occupation (DADS-Panel, authors' calculations)
- However, we conduct the analysis for robustness using occupations (3-digit and 4-digit) and results are similar

Effect on inequality

Specification

- Level of analysis: CZ/sector/year level (304 CZ, 178 sectors, 20 years)

$$\log(\text{Ineq}_{c,j,t}) = \beta * \log(\text{HHI}_{c,j,t}) + X_{c,j,t} + Z_{j,t} + \alpha_{c,t} + \omega_{c,j} + \epsilon_{c,j,t}$$

- $\text{Ineq}_{c,j,t}$ is the Inequality Measure (in log) in CZ c , in industry j , at time t .
- $\text{HHI}_{c,j,t}$ is the HHI in CZ c , in industry j , at time t .
- $X_{c,j,t}$ is a vector of controls (CZ/sector/year)
- $Z_{j,t}$ is a vector of controls (sector/year)
- Standard error are clustered at the CZ level

Concerns for identification

- Local decline in economic activity, job polarization and product market concentration can affect both labor market concentration and wage inequality
- To mitigate those concerns, our controls include:
 1. Controls at local labor market * year level
 - Average age of employees, average firm size, and average number of employees (size of the market)
 - Polarization
 2. Controls at the sector * year level
 - Labor productivity of the sector, each year
 - Product market concentration ▶ HHIs
 3. Fixed effect at the CZ * year level

Possible bias: local heterogenous productivity shock

- Local positive productivity shock benefiting only the larger firms (likely if larger firms are the most innovative ones):
 1. Can increase concentration as already larger firms become even bigger and increase their share of employment + if smaller, lower-productivity, firms exit ⇒ **concentration increases**
 2. Can decrease inequality if smaller, lower-productivity, firms exit : destruction of lower-paid jobs ⇒ **inequality between remaining job decreases**
- To deal with this omitted variable bias, we use an instrument

Instrument

- Instrument = employment-weighted average HHI within the same industry across *other commuting zones* ▶ First Stage

$$HHI^{-c}_{j,t} = \frac{\sum_{z \neq c} (HHI_{z,j,t} * empl_{z,j,t})}{\sum_{z \neq c} empl_{z,j,t}}$$

- Instrument captures sectoral changes that can affect local HHI through:
 1. Change in production function (ex: fixed cost) \Rightarrow might require employers to concentrate more or less
 2. Financial factors affecting mergers and hence employers' concentration
- Eliminates local forces shaping concentration:
 1. Local heterogeneous productivity shock
 2. Change in economic dynamism of the local labor market

Labor market concentration decreases average wage

	Mean	
	(1) OLS	(2) IV
HHI employment (log, mkt)	0.030*** (0.003)	-0.058*** (0.010)
Lab. prod. (mean log, sect)	0.028*** (0.002)	0.023*** (0.002)
HHI sales (log, sect)	0.002*** (0.001)	0.003*** (0.001)
Average age (mkt)	0.013*** (0.000)	0.014*** (0.000)
Market size (log, mkt), post	-0.061*** (0.005)	-0.064*** (0.005)
Firm size (mean log, mkt), decl. eff	0.076*** (0.003)	0.029*** (0.004)
Polarization	0.012*** (0.002)	0.007*** (0.002)
CZ year FE	Yes	Yes
CZ sector FE	Yes	Yes
Obs	210,551	210,551
R squared	0.092	0.025
Adjusted R-squared	0.091	0.024
KP Stat		840.8

Standard errors in parentheses

* p<0.1, ** p<0.05, *** p<0.01

Mechanism

Exploring two mechanisms

1. "Better sorting" mechanism

- With better sorting, wage gap between different types of firm widens
 ⇒ **between-firm** inequality should increase (Dispersion of the average wage of each firm of the market) [▶ Def](#)

2. "Bargaining position sensitivity" mechanism

- Increase in employers concentration more damaging for the least-paid jobs (return of bargaining power from less concentration to wage concave or can afford to wait more)
 ⇒ **within-firm** inequality should increase (Dispersion of wages of jobs of a given firm) [▶ Def](#)
- Mechanically, the average wage of firms with more lower-paid jobs should decrease
 ⇒ **between-firm** inequality should increase

IV: Effect on between- and within-firm inequality

	Within		Between	
	(1) Gini	(2) 90/10	(3) Gini	(4) 90/10
HHI employment (log, mkt)	0.048*** (0.007)	0.089*** (0.011)	0.059*** (0.008)	0.090*** (0.009)
Lab. prod. (mean log, sect)	-0.008** (0.003)	-0.026*** (0.005)	0.013** (0.005)	0.015** (0.006)
HHI sales (log, sect)	0.002* (0.001)	0.003* (0.002)	0.001 (0.001)	0.003** (0.001)
Average age (mkt)	-0.006*** (0.000)	-0.013*** (0.001)	-0.012*** (0.001)	-0.019*** (0.001)
Market size (log, mkt), post	0.078*** (0.004)	0.060*** (0.006)	0.097*** (0.004)	0.066*** (0.005)
Firm size (mean log, mkt), decl. eff	-0.016*** (0.003)	-0.010** (0.005)	-0.237*** (0.005)	-0.219*** (0.005)
Polarization	0.022*** (0.003)	0.026*** (0.006)	0.045*** (0.003)	0.044*** (0.004)
CZ year FE	Yes	Yes	Yes	Yes
CZ sector FE	Yes	Yes	Yes	Yes
Obs	210,551	210,551	210,551	210,551
R squared	0.011	-0.003	0.040	0.022
Adjusted R-squared	0.010	-0.004	0.040	0.021
KP Stat	840.8	840.8	840.8	840.8

Standard errors in parentheses

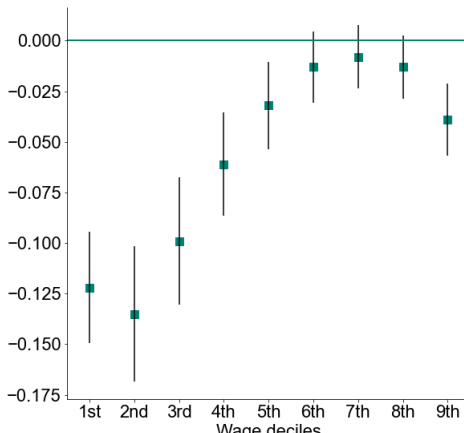
* p<0.1, ** p<0.05, *** p<0.01

Further exploring relevance of the 2 mechanisms

- Effect on within- and between- firm inequality consistent with bargaining and sorting
- As between-firm estimate is consistent with both and within-firm only with the bargaining one, weak evidence that the bargaining hypothesis might be more important
- Let's examine the effect of labor concentration on the wage along the wage distribution

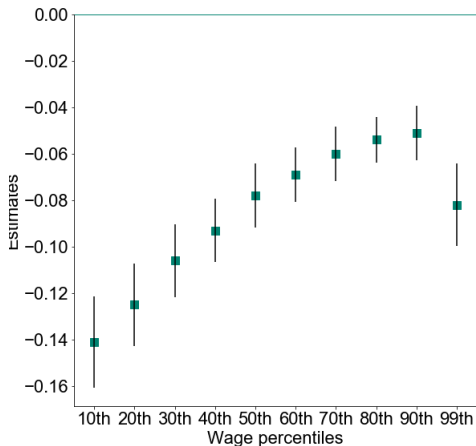
Negative effect along the wage distribution of jobs

- Sorting mechanism: some jobs should benefit
- We find that no deciles of jobs benefit, the 99th percentile either



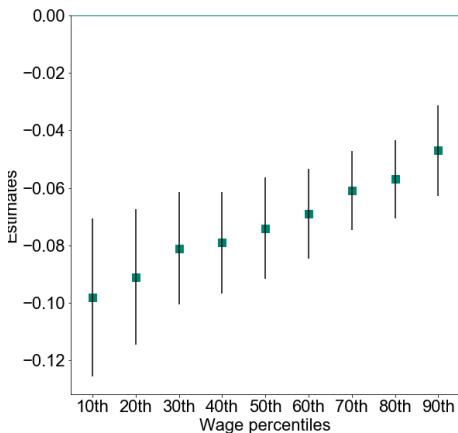
Effect of labor concentration on average wage of firms

- Sorting mechanism: some firms should benefit
- We find that no deciles of firms benefit



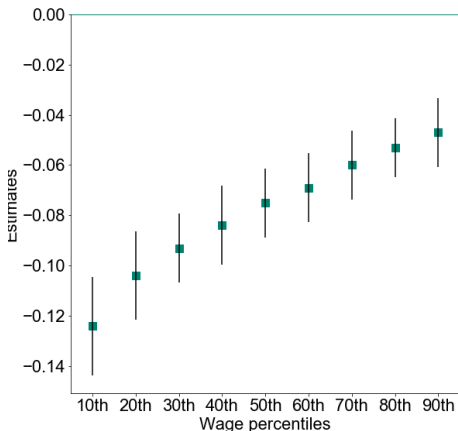
Effect on average wage of firms, for the richest markets

- Sorting: maybe only richest firms on richest markets (above median average wage) benefit?
- We find that this is not the case



Effect on average wage of firms, for the largest markets

- Sorting: maybe only richest firms on largest markets (above median number of employees) benefit?
- We find that this is not the case



Robustness

Robustness checks

1. Alternative definition of labor markets:
 - Occupation instead of sectors [▶ Table](#)
 - '*Département*' instead of commuting zones [▶ Table](#)
2. Alternative instruments:
 - Number of firms
 - Normalized HHI
3. Alternative measures of concentration: Payroll-HHI instead of employment-HHI [▶ Table 1](#) [▶ Table 2](#)
4. Weighted regressions [▶ Table](#)
5. More inequality measures [▶ Table](#)

Alternative instruments

1. Inverse of number of firms: $1/N$

- Captures the variation of HHI linked to the number of employers
- Gini estimate (0.041) [▶ Table](#)

2. Normalized HHI: $HHI_{norm} = \frac{HHI - 1/N}{1 - 1/N}$

- Captures the variation of HHI linked to the dispersion of employment shares, i.e. the weight of each employer's - holding number of firms fixed
- Gini estimate (0.015): indicates that effect does not come only from variation of number of employers but also from variation in their relative weights [▶ Table](#)

Conclusion

Results overview

- Labor concentration decreases average wage and increases inequality between jobs in the same local labor market
- Labor concentration increases inequality between jobs in the same firm ("within-firm inequality") and between the average jobs in each firm ("between-firm inequality")
- Labor concentration decrease wages of jobs and average wage of all firms along the wage distribution, even on richest and largest markets
- ⇒ We conclude that relative bargaining argument is much more prevalent than sorting: labor concentration increase inequality by undercutting relatively more the bargaining power of the lowest earners

Hirschmann Herfindhal Index

- Employment share of each firm in each sector/CZ

$$s_{j,c,f} = \frac{emp_{j,c,f}}{\sum_f emp_{j,c,f}}$$

▶ Back

- We regroup all jobs in establishments of a given firm in same local labor market: common employer
- Employment HHI at the sector/CZ level:

$$HHI_{j,c} = \sum_f (s_{f,j,c})^2 \text{ with } 0 \leq HHI \leq 1$$

- **Robustness**: payroll-HHI

First stages

	Employment-HHI		Payroll-HHI	
	(1)	(2)	(3)	(4)
	HHI, log	HHI, log	HHI, log	HHI, log
Instrument : employment-HHI	0.779*** (0.027)			
Instrument : 1/Number of firms		0.595*** (0.021)		
Instrument : normalized employment-HHI			0.486*** (0.017)	
Instrument : payroll-HHI				0.572*** (0.026)
CZ year FE	Yes	Yes	Yes	Yes
CZ sector FE	Yes	Yes	Yes	Yes
Obs	210,551	210,551	210,551	210,551
KP stat	840.82	808.18	819.15	481.88

Standard errors in parentheses

* $p < 0.1$, ** $p < 0.05$, *** $p < 0.01$

▶ Back

Alternative definition of market: sector**département* level

	(1)	(2)	(3)
	Gini	90/10	99/10
HHL employment (log, mkt)	0.028*** (0.006)	0.107*** (0.012)	0.074*** (0.012)
Lab. prod. (mean log, sect)	-0.012*** (0.002)	-0.019*** (0.002)	0.006 (0.006)
HHL sales (log, sect)	0.004*** (0.001)	0.004*** (0.001)	-0.001 (0.002)
Average age (mkt)	-0.008*** (0.000)	-0.025*** (0.001)	-0.022*** (0.001)
Market size (log, mkt), post	0.065*** (0.004)	0.081*** (0.007)	0.123*** (0.008)
Firm size (mean log, mkt), decl. eff	-0.037*** (0.003)	-0.069*** (0.007)	-0.054*** (0.007)
Polarization	0.033*** (0.002)	0.063*** (0.005)	0.095*** (0.006)
DEP year FE	Yes	Yes	Yes
CZ sector FE	Yes	Yes	Yes
Obs	144,055	144,055	144,055
R squared	0.014	-0.008	0.004
Adjusted R-squared	0.013	-0.009	0.003
KP Stat	1076.9	1076.9	1076.9

Standard errors in parentheses

* p<0.1, ** p<0.05, *** p<0.01

Alternative definition of market: 3-digit occupation*commuting zone level

	(1)	(2)	(3)
	Gini	90/10	Mean
HHI employment (log, mkt)	0.627*** (0.174)	0.233*** (0.036)	-0.084*** (0.021)
Average age (mkt)	-0.017*** (0.003)	-0.028*** (0.001)	0.018*** (0.001)
Market size (log, mkt)	-0.147** (0.059)	-0.102*** (0.015)	0.078*** (0.008)
Firm size (mean log, mkt), decl. eff	0.013 (0.017)	-0.052*** (0.008)	0.026*** (0.004)
CZ year	Yes	Yes	Yes
CZ occup FE	Yes	Yes	Yes
Obs	90,402	90,592	90,592
R squared	-0.078	-0.017	0.019
Adjusted R-squared	-0.080	-0.018	0.018
KP Stat	787.3	772.0	772.0

Standard errors in parentheses

* p<0.1, ** p<0.05, *** p<0.01

Alternative instruments: Number of firms

	Overall		Between		Within	
	(1) Gini	(2) 90/10	(3) Gini	(4) 90/10	(5) Gini	(6) 90/10
HHI employment (log, mkt)	0.041*** (0.006)	0.123*** (0.011)	0.020** (0.009)	0.054*** (0.010)	0.086*** (0.008)	0.162*** (0.013)
Lab. prod. (mean log, sect)	-0.022*** (0.002)	-0.047*** (0.005)	0.011** (0.005)	0.013** (0.006)	-0.006* (0.003)	-0.023*** (0.005)
HHI sales (log, sect)	0.002*** (0.001)	0.002* (0.001)	0.002* (0.001)	0.003*** (0.001)	0.001 (0.001)	0.002 (0.002)
Average age (mkt)	-0.009*** (0.000)	-0.025*** (0.001)	-0.012*** (0.001)	-0.019*** (0.001)	-0.007*** (0.000)	-0.014*** (0.001)
Market size (log, mkt), post	0.079*** (0.003)	0.090*** (0.005)	0.096*** (0.004)	0.065*** (0.005)	0.080*** (0.004)	0.063*** (0.007)
Firm size (mean log, mkt), decl. eff	-0.046*** (0.003)	-0.078*** (0.006)	-0.232*** (0.005)	-0.215*** (0.005)	-0.020*** (0.003)	-0.019*** (0.006)
Polarization	0.035*** (0.002)	0.051*** (0.004)	0.042*** (0.003)	0.042*** (0.004)	0.025*** (0.003)	0.031*** (0.006)
CZ year FE	Yes	Yes	Yes	Yes	Yes	Yes
CZ sector FE	Yes	Yes	Yes	Yes	Yes	Yes
Obs	210,551	210,551	210,551	210,551	210,551	210,551
R squared	0.015	-0.009	0.047	0.028	-0.004	-0.025
Adjusted R-squared	0.014	-0.009	0.046	0.028	-0.005	-0.026
KP Stat	808.2	808.2	808.2	808.2	808.2	808.2

Standard errors in parentheses

* p<0.1, ** p<0.05, *** p<0.01

Alternative instruments: normalized HHI

	Overall		Between		Within	
	(1) Gini	(2) 90/10	(3) Gini	(4) 90/10	(5) Gini	(6) 90/10
HHI employment (log, mkt)	0.015** (0.006)	0.053*** (0.012)	0.067*** (0.010)	0.096*** (0.012)	0.028*** (0.009)	0.050*** (0.013)
Lab. prod. (mean log, sect)	-0.023*** (0.002)	-0.051*** (0.005)	0.013** (0.005)	0.015** (0.007)	-0.009*** (0.003)	-0.028*** (0.005)
HHI sales (log, sect)	0.002*** (0.001)	0.003** (0.001)	0.001 (0.001)	0.003** (0.001)	0.002** (0.001)	0.003** (0.002)
Average age (mkt)	-0.009*** (0.000)	-0.024*** (0.001)	-0.012*** (0.001)	-0.019*** (0.001)	-0.006*** (0.000)	-0.012*** (0.001)
Market size (log, mkt), post	0.078*** (0.003)	0.087*** (0.005)	0.097*** (0.004)	0.067*** (0.005)	0.078*** (0.004)	0.059*** (0.006)
Firm size (mean log, mkt), decl. eff	-0.043*** (0.003)	-0.069*** (0.006)	-0.238*** (0.005)	-0.220*** (0.006)	-0.013*** (0.003)	-0.006 (0.005)
Polarization	0.034*** (0.002)	0.047*** (0.004)	0.045*** (0.003)	0.044*** (0.004)	0.021*** (0.003)	0.024*** (0.006)
CZ year FE	Yes	Yes	Yes	Yes	Yes	Yes
CZ sector FE	Yes	Yes	Yes	Yes	Yes	Yes
Obs	210,551	210,551	210,551	210,551	210,551	210,551
R squared	0.037	0.019	0.038	0.020	0.014	0.003
Adjusted R-squared	0.036	0.018	0.037	0.020	0.013	0.002
KP Stat	816.6	816.6	816.6	816.6	816.6	816.6

Standard errors in parentheses

* $p < 0.1$, ** $p < 0.05$, *** $p < 0.01$

Payroll-HHI: average wage and overall inequality

	(1)	(2)	(3)
	Mean	Gini	90/10
Payroll HHI (log, mkt)	-0.055*** (0.011)	0.002 (0.005)	0.044*** (0.009)
Lab. prod. (mean log, sect)	0.025*** (0.002)	-0.024*** (0.002)	-0.052*** (0.005)
HHI sales (log, sect)	0.003*** (0.001)	0.002*** (0.001)	0.003** (0.001)
Average age (mkt)	0.014*** (0.000)	-0.009*** (0.000)	-0.024*** (0.001)
Market size (log, mkt), post	-0.063*** (0.005)	0.077*** (0.003)	0.086*** (0.005)
Firm size (mean log, mkt), decl. eff	0.088*** (0.004)	-0.042*** (0.003)	-0.070*** (0.006)
Polarization	0.008*** (0.002)	0.033*** (0.002)	0.046*** (0.004)
CZ year FE	Yes	Yes	Yes
CZ sector FE	Yes	Yes	Yes
Obs	210,551	210,551	210,551
R squared	-0.009	0.042	0.022
Adjusted R-squared	0.042	-0.009	0.021
KP Stat	481.9	481.9	481.9

Standard errors in parentheses
 * p<0.1, ** p<0.05, *** p<0.01

Payroll-HHI: within- and between-firm inequality

	Between		Within	
	(1) Gini	(2) 90/10	(3) Gini	(4) 90/10
Payroll HHI (log, mkt)	0.079*** (0.009)	0.113*** (0.011)	0.029*** (0.007)	0.065*** (0.012)
Lab. prod. (mean log, sect)	0.011** (0.005)	0.012* (0.006)	-0.010*** (0.003)	-0.030*** (0.005)
HHI sales (log, sect)	0.000 (0.001)	0.001 (0.001)	0.002* (0.001)	0.003* (0.002)
Average age (mkt)	-0.012*** (0.001)	-0.019*** (0.001)	-0.006*** (0.000)	-0.012*** (0.001)
Market size (log, mkt), post	0.096*** (0.004)	0.065*** (0.005)	0.077*** (0.004)	0.059*** (0.006)
Firm size (mean log, mkt), decl. eff	-0.242*** (0.005)	-0.225*** (0.006)	-0.014*** (0.003)	-0.009* (0.005)
Polarization	0.045*** (0.003)	0.044*** (0.004)	0.021*** (0.003)	0.024*** (0.006)
CZ year FE	Yes	Yes	Yes	Yes
CZ sector FE	Yes	Yes	Yes	Yes
Obs	210,551	210,551	210,551	210,551
R squared	0.037	0.020	0.016	0.002
Adjusted R-squared	0.036	0.020	0.016	0.001
KP Stat	481.9	481.9	481.9	481.9

Standard errors in parentheses

* p<0.1, ** p<0.05, *** p<0.01

Weighted regressions

	Overall		Between		Within	
	(1) Gini	(2) 90/10	(3) Gini	(4) 90/10	(5) Gini	(6) 90/10
HHI employment (log, mkt)	0.0162** (0.0067)	0.0515*** (0.0127)	0.0724*** (0.0141)	0.0771*** (0.0177)	0.0391*** (0.0094)	0.0756*** (0.0177)
Lab. prod. (mean log, sect)	-0.0353*** (0.0055)	-0.0938*** (0.0111)	0.0141* (0.0076)	-0.0021 (0.0113)	-0.0312*** (0.0041)	-0.0747*** (0.0092)
HHI sales (log, sect)	0.0021*** (0.0006)	0.0064*** (0.0011)	0.0067*** (0.0017)	0.0101*** (0.0020)	0.0006 (0.0006)	0.0041*** (0.0015)
Average age (mkt)	-0.0090*** (0.0006)	-0.0250*** (0.0011)	-0.0116*** (0.0009)	-0.0193*** (0.0010)	-0.0070*** (0.0011)	-0.0161*** (0.0020)
Market size (log, mkt), post	0.3136*** (0.0851)	0.6983*** (0.2605)	0.1112 (0.0732)	0.1305 (0.1633)	0.4006*** (0.0866)	0.8011*** (0.1784)
Firm size (mean log, mkt), decl. eff	-0.0190*** (0.0051)	-0.0276*** (0.0090)	-0.1223*** (0.0057)	-0.0900*** (0.0072)	-0.0117*** (0.0044)	-0.0026 (0.0095)
Polarization	0.2971*** (0.0924)	0.7021** (0.2753)	0.0907 (0.0761)	0.1461 (0.1646)	0.3558*** (0.0935)	0.7728*** (0.1903)
CZ year FE	Yes	Yes	Yes	Yes	Yes	Yes
CZ sector FE	Yes	Yes	Yes	Yes	Yes	Yes
Obs	208,463	208,463	208,463	208,463	208,463	208,463
R squared	0.0171	0.0244	0.0039	0.0054	0.0124	-0.0040
Adjusted R-squared	0.0163	0.0236	0.0031	0.0046	0.0116	-0.0048
KP Stat	55.6	55.6	55.6	55.6	55.6	55.6

Standard errors in parentheses
 * p<0.1, ** p<0.05, *** p<0.01

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More inequality indices

	Overall			
	(1) Theil	(2) Entrop	(3) Piesch	(4) Mehran
HHI employment (log, mkt)	0.032*** (0.009)	0.077*** (0.009)	0.018*** (0.006)	0.034*** (0.005)
Lab. prod. (mean log, sect)	-0.032*** (0.004)	-0.044*** (0.005)	-0.019*** (0.002)	-0.026*** (0.002)
HHI sales (log, sect)	0.002** (0.001)	0.003*** (0.001)	0.002*** (0.001)	0.002*** (0.000)
Average age (mkt)	-0.015*** (0.000)	-0.026*** (0.001)	-0.008*** (0.000)	-0.010*** (0.000)
Market size (log, mkt), post	0.141*** (0.006)	0.104*** (0.005)	0.090*** (0.004)	0.065*** (0.003)
Firm size (mean log, mkt), decl. eff	-0.070*** (0.005)	-0.053*** (0.005)	-0.045*** (0.003)	-0.044*** (0.002)
Polarization	0.063*** (0.003)	0.064*** (0.004)	0.040*** (0.002)	0.028*** (0.002)
CZ year FE	Yes	Yes	Yes	Yes
CZ sector FE	Yes	Yes	Yes	Yes
Obs	210,551	210,551	210,551	210,551
R squared	0.031	0.020	0.032	0.024
Adjusted R-squared	0.030	0.019	0.031	0.023
KP Stat	840.8	840.8	840.8	840.8

Standard errors in parentheses

* p<0.1, ** p<0.05, *** p<0.01

More inequality ratios

	Overall				
	(1)	(2)	(3)	(4)	(5)
	50/10	90/50	80/50	50/20	99/10
HHI employment (log, mkt)	0.090*** (0.009)	-0.007 (0.006)	0.019*** (0.005)	0.103*** (0.008)	0.054*** (0.012)
Lab. prod. (mean log, sect)	-0.041*** (0.005)	-0.008*** (0.002)	-0.016*** (0.002)	-0.060*** (0.004)	-0.012** (0.006)
HHI sales (log, sect)	-0.003*** (0.001)	0.006*** (0.001)	0.003*** (0.000)	0.001 (0.001)	-0.002* (0.001)
Average age (mkt)	-0.024*** (0.001)	-0.001*** (0.000)	-0.003*** (0.000)	-0.018*** (0.000)	-0.021*** (0.001)
Market size (log, mkt), post	0.034*** (0.004)	0.055*** (0.003)	0.040*** (0.003)	0.059*** (0.004)	0.129*** (0.007)
Firm size (mean log, mkt), decl. eff	-0.050*** (0.005)	-0.023*** (0.003)	-0.024*** (0.002)	-0.076*** (0.004)	-0.061*** (0.006)
Polarization	0.026*** (0.004)	0.023*** (0.002)	0.012*** (0.001)	0.018*** (0.003)	0.089*** (0.005)
CZ year FE	Yes	Yes	Yes	Yes	Yes
CZ sector FE	Yes	Yes	Yes	Yes	Yes
Obs	210,551	210,551	210,551	210,551	210,551
R squared	0.003	0.017	0.008	-0.009	0.012
Adjusted R-squared	0.002	0.016	0.007	-0.009	0.011
KP Stat	840.8	840.8	840.8	840.8	840.8

Standard errors in parentheses

* p<0.1, ** p<0.05, *** p<0.01

Labor and product market concentration

- The two concepts should be distinguished:
 - Labor market concentration is local
 - Product market concentration, for most goods and some services (tradable), is not local
 - Correlation between weighted average labor HHI and sectoral product market HHI in our data is positive but moderate: 0.48 in 2018
1. We control for the product market concentration at the sector * year level
 - *NB: No balance sheet at the establishment, i.e. local level*
 2. We find higher estimates for manufacture sector (where both concepts are even more likely to be dissociated)

Market power and concentration: ambiguous link

- Concentration is also an equilibrium outcome: cannot *a priori* equate concentration with employers' market power
- "*Burdett Mortensen effect*": decrease in market power of employers (i.e. more competitive labor market) can actually **increase** concentration
- In a labor market becoming more competitive, workers can more easily move to better-paying firms, which increase their market share and labor concentration (*if those better-paying firm already have a large share of the market*)

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US labor market concentration

Figure: HHI by CZ, average over SOC

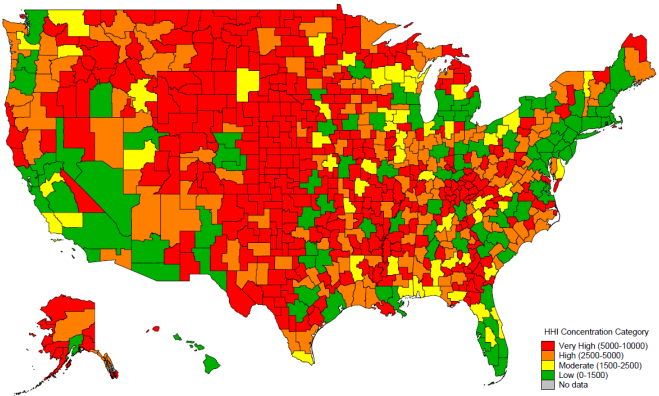


Figure: Source: Marinescu et al. 2018

SECTOR

151a2	Manufacture of meat and fish	153	Manufacture of fruit and vegetables
154	Manufacture of vegetable and animal oils and fats	155	Manufacture of dairy products
156	Manufacture of grain mill products, starches and starch products	157	Manufacture of prepared animal feeds
158	Manufacture of other food products	159	Manufacture of beverages
160	Manufacture of tobacco products	171	Preparation and spinning of textile fibres
172	Tissage Weaving of Textiles	173	Finishing of textiles
174	Manufacturing of textile articles	175	Manufacture of other textiles
176	Manufacture of knitted fabrics	177	Manufacture of knitted and crocheted apparel
181	Manufacture of leather clothes	182	Manufacture of textile clothing
183	Manufacture of articles of fur	191	Tanning and dressing of leather
192	Manufacture of luggage, handbags, saddlery and harness	193	Manufacture of footwear
201	Sawmilling, planing and impregnation of wood	202	Manufacture of veneer sheets and wood-based panels
203	Manufacture of other builders' carpentry and joinery	204	Manufacture of wooden containers
205	Manufacture of products of wood, cork, straw and plaiting materials	211	Manufacture of pulp, paper and paperboard
212	Manufacture of articles of paper and paperboard	221	Publishing
222	Printing and service activities related to printing	223	Reproduction of recorded media
241	Manufacture of basic chemicals	242	Manufacture of pesticides and other agrochemical products
243	Manufacture of paints, varnishes and similar coatings	244	Pharmaceutical industry
245	Manufacture of soap, cleaning and perfumes preparations	246	Manufacture of other chemical products
247	Manufacture of artificial or synthetic fibres	251	Manufacture of rubber products
252	Manufacture of plastics products	261	Manufacture of glass and glass products
262	Manufacture of other porcelain and ceramic products	263	Manufacture of ceramic tiles and flags
264	Manufacture of bricks, tiles and construction products, in baked clay	265	Manufacture of cement, lime and plaster
266	Manufacture of articles of concrete, cement and plaster	267	Cutting, shaping and finishing of stone
268	Manufacture of non-metallic mineral products	271	Steel industry
272	Manufacture of furniture	273	Manufacture of other products of first processing of steel
274	Manufacture of basic precious and other non-ferrous metals	275	Casting of metals
281	Manufacture of structural metal products	282	Manufacture of tanks, reservoirs and containers of metal
283	Boiler making	284	Forging, pressing, stamping and roll-forming of metal; powder metallurgy
285	Treatment and coating of metals; machining	286	Manufacture of cutlery, tools and general hardware
287	Manufacture of other fabricated metal products	291	Manufacture of mechanical equipment
292	Manufacture of general-purpose machinery	293	Manufacture of agricultural machinery
294	Manufacture of machine tools	295	Manufacture of other special purpose machinery
296	Manufacture of weapons and ammunition	297	Manufacture of household appliance
300	Manufacture of office machinery and computer equipment	311	Manufacture of electric motors, generators, transformers
312	Manufacture of electricity distribution and control apparatus	313	Manufacture of wiring and wiring devices
314	Manufacture of batteries and accumulators	315	Manufacture of electric lighting equipment
316	Manufacture of other electrical equipment	321	Manufacture of electronic components and boards
322	Manufacture of transmitting and receiving apparatus	323	Manufacture of sound and video reception, recording and reproduction apparatus
331	Manufacture of medical, surgical and orthopaedic equipment	332	Manufacture of measuring and checking instruments
333	Manufacture of industrial process control equipment	334	Manufacture of optical instruments and photographic equipment
335	Watches and clocks	341	Manufacture of motor vehicles
342	Manufacture of bodies (coachwork) for motor vehicles; manufacture of trailers and semi-trailers	342	Manufacture of parts and accessories for motor vehicles
351	Building of ships and boats	353	Manufacture of railway locomotives and rolling stock
353	Manufacture of air and spacecraft related machinery	354	Manufacture of motorcycles and bicycles
355	Manufacture of transport equipment n.e.c.	361	Manufacture of furniture
362	Manufacture of jewellery, biogemstone and related articles	363	Manufacture of musical instruments
364	Manufacture of sports goods	365	Manufacture of games and toys
366	Manufacturing n.e.c.	37	Recovery of recyclable and non-recyclable metal materials
401	Electric power generation and distribution	402	Manufacture of gas; distribution of gaseous fuels through mains
403	Steam and air conditioning supply	410	Water collection, treatment and supply
451	Site preparation	452	Construction of residential and non-residential buildings or civil engineering
453	Installation works	454	Building completion and finishing
455	Renting of construction equipment with operator	501	Sale of motor vehicles
502	Maintenance and repair of motor vehicles	503	Sale of motor vehicle parts and accessories
504	Sale, maintenance and repair of motorcycles and related parts and accessories	505	Retail sale of automotive fuel
511	Wholesale on a fee or contract basis	512	Wholesale of agricultural raw materials
513	Wholesale of food	514	Wholesale of household goods
515	Wholesale of non-agricultural intermediate products	515	Wholesale of other machinery, equipment and supplies
519	Other wholesale	521	Retail sale in non-specialised stores
522	Retail sale of food, beverages and tobacco in specialised stores	523	Dispensing chemist in specialised stores
524	Retail sale of other goods in specialised stores	525	Retail of second-hand goods
526	Retail trade not in stores	527	Repair of personal and household goods
551	Hotels and similar accommodation	552	Other short-stay accommodation
553	Restaurants	555	Beverage serving activities
555	Event catering and other food service activities	601	Rail transport
602	Urban and Road transport	603	Transport via pipeline
611	Sea and coastal passenger water transport	612	Water transport
62	Passenger air transport and Freight air transport	623	Space transport
631	Warehousing and Cargo handling	632	Management of transport infrastructures
633	Travel agency activities	634	Organization of freight transport
642	Telecommunications	660	Insurance
671	Activities auxiliary to financial services	672	Activities auxiliary to insurance
701	Buying and selling of own real estate	702	Renting of real estate
703	Real estate activities on a fee or contract basis	711	Renting and leasing of motor vehicles
712	Renting and leasing of transport equipment	713	Renting and leasing of other machinery, equipment
714	Renting and leasing of personal and household goods	721	Consultancy
722	Computer programming and related activities	723	Data processing
724	Database activities	725	Maintenance and repair of office machines and computer equipment
731	Research and experimental development on natural sciences and engineering	732	Research and experimental development on social sciences and humanities
741	Legal and accounting activities Management consultancy activities	742	Architectural and engineering activities and related technical consultancy
743	Control activities and technical analysis	746	Advertising
745	Selection and supply of personnel	746	Security and investigation activities
747	Cleaning activities	748	Other services provided mainly to businesses
852	Veterinary activities	900	Remediation activities and other waste management services
924	Press Agencies	930a	Laundry
930b	Hairdressing	930c	Other beauty treatment
930d	Funeral and related activities	930e	Physical well-being activities
930f	Other personal service activities		

Départements instead of CZ

- Local labor markets are defined as the intersection of a sector and a *'département'*
- 304 CZ versus 99 *'départements'*: larger labor markets
- Estimates slightly higher: 0.028 for Gini (versus 0.025 using CZ), 0.107 for 90/10 (versus 0.083 using CZ)

▶ Table

Occupations instead of sectors

- Local labor markets are defined as the intersection of an occupation and a '*département*'
- 99 3-digit occupations (versus 178 sectors)
- Estimates are higher: 0.627 for Gini (versus 0.025 using sectors), 0.233 for 90/10 (versus 0.083 using CZ)

▶ Table

Payroll-HHI instead of employment-HHI

- Berger *et al.*, 2021: When there is a positive relationship between wages and employment, the payroll-HHI is strictly larger than the employment-HHI
- In our data, the payroll-HHI = 0.48 versus 0.46 for the employment-HHI
- A firm with a wage bill share of 20% might effectively be a larger employer, i.e. have a higher weight on the labor market, than a firm with an employment share of 20%, as wage and size are strongly correlated.

$$s_{j,c,f,t}^w = \frac{\text{wage}_{j,c,f,t}}{\sum_f \text{wage}_{j,c,f,t}} ; \text{HHI}_{j,c,t}^w = \sum_f (s_{f,j,c,t}^w)^2$$

- All estimates significant and of the same sign as with employment-HHI, except Gini overall

Weighted regressions

- NB: regression conducted on our restricted sample of already large markets
- Regression weighted by size of the market in terms of numbers of jobs
- Estimate for Gini is 0.0162 versus 0.025 for non-weighted regression

▶ Table

More inequality measures

- More inequality ratios
 - Higher estimate for 90/10 and 99/10 ratios than 50/10, 90/50, 80/50 and 50/20
 - Labor concentration has an effect on inequality through its impact on the tails of the distribution [▶ Table](#)
- More inequality measures
 - Theil index, Entropy index, Piesch index, Mehran index
 - Find similar results, higher estimates [▶ Table](#)

"Between-firms" inequality

- Inequality between average wage in each firm:
"Between-firms" = Dispersion of the average wage of each firm of the market
- Example for Gini:
 1. Calculate the average wage of each firm f , \bar{w}_f
 2. Calculate the inequality measures between those average wages

$$Gini_{j,c,t}^{Btw} = \frac{\sum_f \sum_g |\bar{w}_f - \bar{w}_g|}{\sum_f \sum_g \bar{w}_f}$$

for average wages of all firms f and g in local labor market

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Quantification of the effect of employers' concentration

1. **Distribution:** Comparing labor market with average level of concentration in manufacturing (0.6) and a labor market with average level in services (0.3): wages of the 1st decile would be 6.7% lower, 5.5% for the 3rd decile, and 2.2% for the 9th decile
2. **Inequality:**
 - Wedge between 1st and 9th decile higher by almost 5% at average level in manufacture compared to average in services
 - A 10% increase in labor concentration is associated with a rise in the Gini index of 0.3% and a rise in the 90/10 earnings ratio of 0.8%