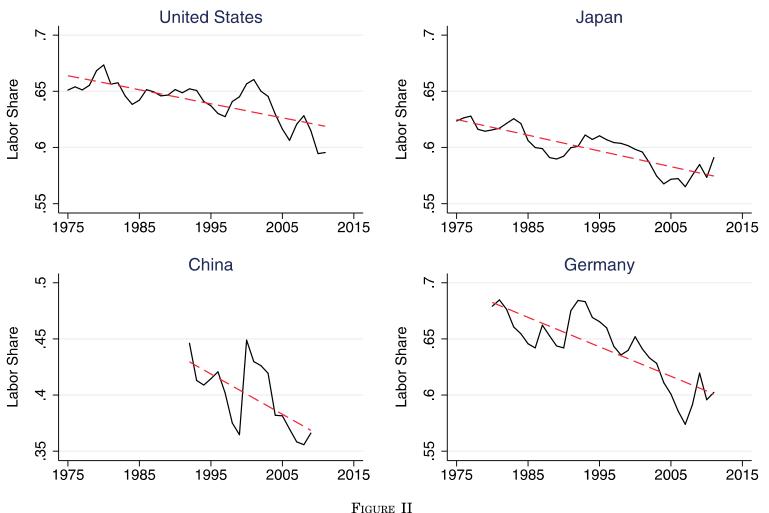
The Fall of the Labor Share and the Rise of Superstar Firms

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DARES Polarisation in Labour Markets
June 19th 2018



Falling Labor Share of Corporate sector Value-Added Evident in Many Countries



Declining Labor Share for the Largest Countries

Significance of decline in Labor share

- Overturns a key 'Kaldor fact'
- Fall is real and significant
 - Elsby et al. '13; Karabarbounis & Neiman '14; Rognlie '15; Koh et al. '17; Piketty '14; Bridgman '14; Smith et al '17
- Why is this a concern?
 - Slow GDP growth → Labor getting a shrinking slice of slow-growing pie
 - 2. Distribution of capital far more unequal than distribution of labor → Growing income inequality (IMF, '17)

Causes of the Falling Labor Share?

Role of technical change: Karabarbonis & Neiman '14

- Falling capital price and, critically, elas. of L-K sub $\sigma > 1$
- But empirical literature suggests $\sigma < 1$, e.g., Lawrence '15, Oberfield-Raval '14, Antras '04, Hamermesh '90

Role of trade exposure: Elsby et al. '13

 Driven by falling labor share in trade-impacted manufacturing industries (China competition)

These representative firm models overlook that aggregate fall reflects *reallocation* between firms

Role of rising <u>profit</u> share – higher aggregate mark-up

Contributions of this Paper

Offers a new 'Superstar Firms' hypothesis

- Large firms tend to have lower labor shares
- Rising prevalence of "winner take most" competition
- Small set of large firms capture increasing share of market, aggregate labor share falls due to reallocation

Presents evidence consistent with this hypothesis

- 1. Three decades of outcome measures
- 2. U.S. firm & establishment data Economic Censuses from multiple sectors (not just manufacturing)
- 3. Cross-national OECD comparisons using industry (KLEMS, COMPNET) & firm-level (BVD ORBIS) data

Summary of Evidence

- 1. A rise in sales concentration within four-digit industries across US private sector
- 2. Industries with larger increases in concentration see larger falls in labor share
- 3. Labor share fall largely due to reallocation of activity between firms, not primarily a general fall within all firms
- 4. Reallocation component of falling labor share largest in industries with rising sales concentration
- 5. These patterns are seen internationally, not just in US

Some Related Literature

- General Trends: Piketty '14; IMF '17
- Explanations of labor share fall: (a) <u>Measurement</u>: Rognlie '15; Smith et al '17; (b) <u>Market Power</u>: Kalecki '38; Barkai '16; Gutierrez & Philippon '16; Grullon et al '17; Berkowitz et al '17; Eeckhout & De Loecker '17; Hall '18 (c) <u>ICT</u>: Karabarbounis & Neiman '14; (d) <u>Trade</u>: Elsby et al '13; (e) <u>Regulations & Institutions</u>: Blanchard & Giavazzi '03; Azmat et al '12
- "Superstar" Firms: Brynjolfsson & McAfee '08; Furman & Orszag '15; Bain '51; Demsetz '73; Schmalensee '87
- Productivity: Bartelsman, Haltiwanger & Scarpetta '13; Decker, et al. '17; Andrews et al '15;
- Firms & Inequality increase: Davis & Haltiwanger, '92; Faggio et al, '10; Card et al '13; Song et al '17
- Firm-level Decompositions of labor share: Bockerman & Maliranta '12; Kehrig & Vincent '17

Overview

1. A Model of Superstar Firms

2. Data and Measurement

3. Evidence

4. Discussion

Superstar Firm Model Sketch

Heterogeneous firms i in an industry, z_i (TFPQ)

- $Y_i = z_i N_i^{\alpha} K_i^{\beta}$
 - Y =value-added
 - -K = capital
 - -N = labor
- <u>Imperfectly</u> competitive product markets with a mark-up of price over marginal cost (App I uses monop. comp.)
 - $m_i = P_i/c_i$
- Competitive factor markets: wage w, capital cost r
- Firms take random draw of productivity from a distribution with pdf λ(z). Productivity draw determines firm's idiosyncratic marginal cost

The Firm-level Labor Share, S_i

Taking FOC with respect to labor gives *labor share*, S = payroll (wN) over value added (PY) for firm i

•
$$S_i = \left(\frac{wN}{PY}\right)_i = \frac{\alpha}{m_i}$$

- More productive/lower marginal cost (high z_i "superstars") firms have:
 - larger market share $(\omega_i = \frac{P_i Y_i}{\sum P_i Y_i})$ more output due to lower marginal costs
 - lower labor share (S_i) because their mark-up m_i is higher (e.g. Melitz & Ottaviano '08; oligopoly models like Cournot). Why?...

Change in economic environment

- Change in environment which reallocates more market share to superstar firms will tend to (i) increase concentration and (ii) reduce aggregate labor share. Examples:
- Increased importance of **platform competition** (network effects, especially in digital markets)
- Larger investments needed to make new technology successful – Besson '17 on ICT
- Globalization <u>reallocates</u> more output to more efficient firms (Melitz, '03; Mrázová & Neary '17)
- Falling competition? (Eeckhout & De Loecker '17; Grullon et al. '16; Gutierrez & Philippon '17, '18 on anti-trust, regulation & occupational licensing). But increase in competition can also cause rising concentration & aggregate mark-up (App 1)

Predictions: Consider a Change in Environment that Favors Most Productive/Superstar Firms

- 1. Concentration levels will increase
- 2. Industries with largest increases in concentration will have biggest falls in labor share
- Fall in labor share mainly due to reallocation towards low labor share firms (rather than uniform fall)
- 4. Rising industry concentration will predict the *reallocation* component of rising labor share
- 5. If the underlying forces are global, these regularities will be seen in many countries

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Data Sources (USA)

Labor share and sales concentration

- US quinquennial Economic Censuses, 1982 2012
- Use six sectors covering ~ 80% of private sector jobs
 - 1. Manufacturing
 - 2. Retail
 - 3. Wholesale
 - 4. Services
 - 5. Utilities & Transportation
 - 6. Finance
- 5.2 million establishment-year observations
- 4.0 million firm-year observations
- Consistent series of four digit SIC codes

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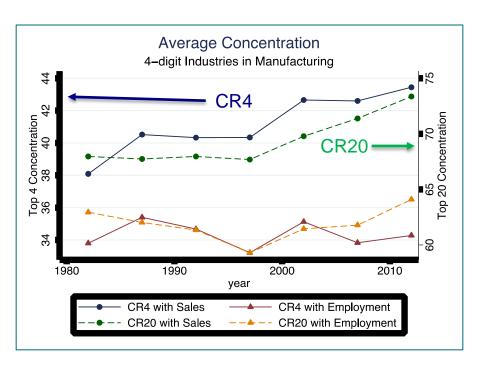
Summary of Evidence

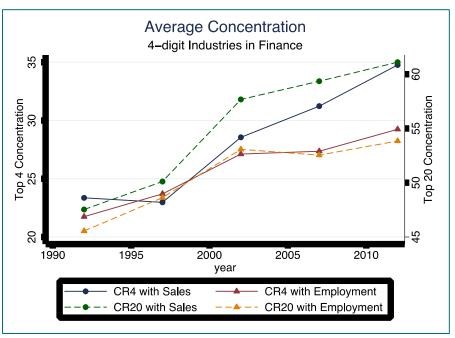
- 1. A rise in sales concentration within four-digit industries across US private sector
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Fig 4: Rising Concentration: Manufacturing and Finance

Manufacturing Sector

Finance Sector



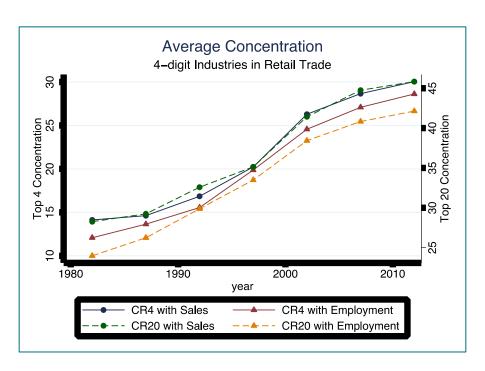


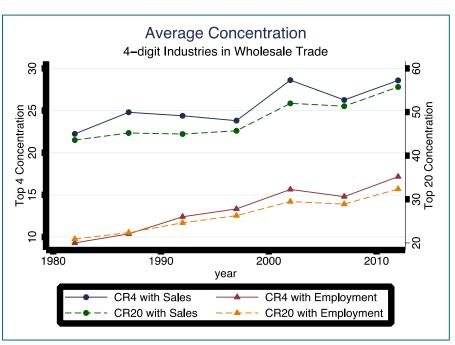
Notes: Weighted average of 4 digit industries within each large sector. Manufacturing: 388 inds; Finance: 31.

Fig 4: Rising Concentration: Retail and Wholesale Trade

Retail Trade

Wholesale Trade





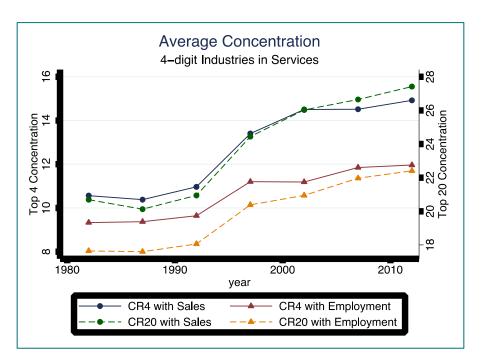
Notes: Weighted average of 4 digit industries within each large sector. Retail: 58;

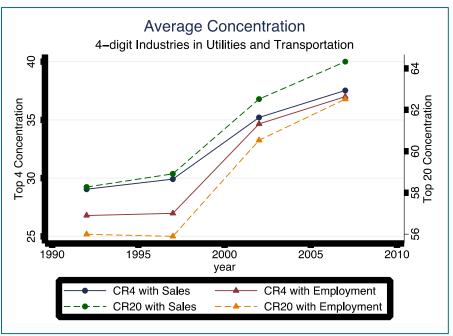
Wholesale: 56.

Fig 4: Rising Concentration: Services and Utilities + Transport

Service Sector

Utilities + Transportation Sector





Notes: Weighted average of 4 digit industries within each large sector. Services: 95; Utilities & Transport: 48.

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Fig 5: Basic Descriptive Relationship-Larger Firms Have Lower Labor Shares

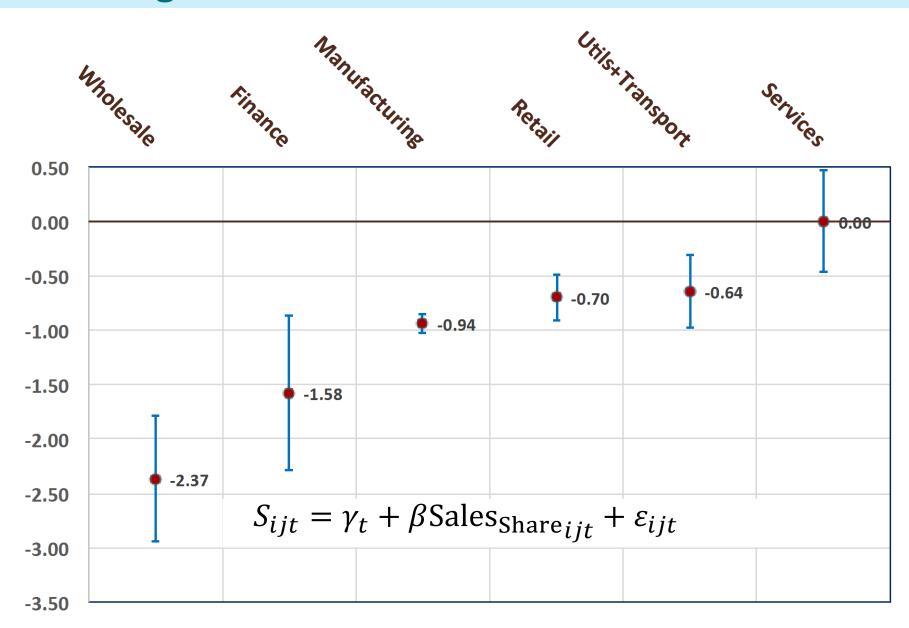


Table 2: Rising Concentration and Falling Labor Share; Manufacturing, 5 year changes

$$\Delta \left(\frac{\text{Payroll}}{\text{Value Added}}\right)_{it} = \Delta S_{jt} = \alpha + \beta \Delta \text{Conc}_{jt} + \gamma_t + \varepsilon_{jt}$$

$$\frac{\text{CR4}}{\text{1 Baseline}} \quad \frac{\text{CR20}}{\text{0.036}} \quad \frac{\text{HHI}}{\text{0.047}}$$

Notes: ** significant at 1% level; * = significant at 5% level; ~ = significant to 10% level

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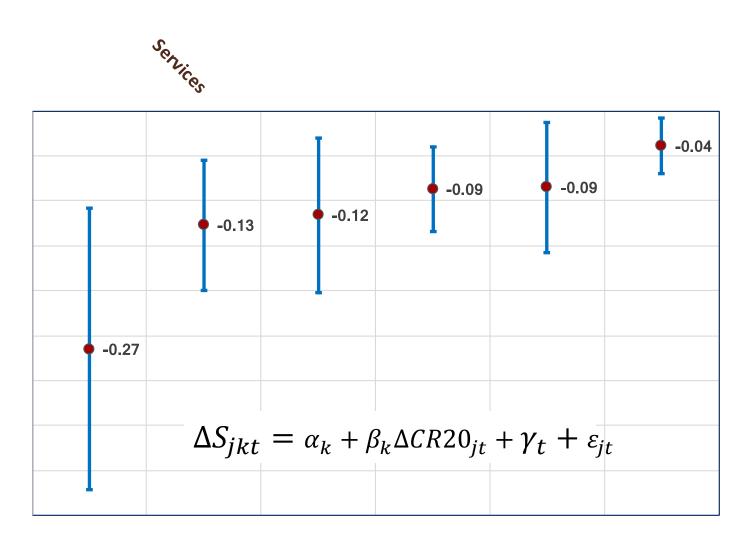
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		CR4		CR20		HHI	
1	Baseline	-0.148	**	-0.234	**	-0.189	*
		(0.036)		(0.047)		(0.096)	
2	Compensation Share of	-0.175	**	-0.264	**	-0.231	~
	Value Added	(0.046)		(0.061)		(0.121)	
3	Deduct Service	-0.331	**	-0.517	**	-0.501	**
	Intermediates from VA	(0.062)		(0.071)		(0.176)	
4	Industry Trends (Four-Digit	-0.171	**	-0.307	**	-0.208	~
	Dummies)	(0.042)		(0.053)		(0.118)	
5	1992 - 2012 Sub-Period	-0.181	**	-0.316	**	-0.23	*
		(0.044)		(0.063)		(0.117)	
6	Including Imports (1992 -	-0.204	**	-0.288	**	-0.138	
Ŭ	2012)	(0.052)		(0.045)		(0.180)	
	,	,		` '		` '	

Notes: ** significant at 1% level; * = significant at 5% level; ~ = significant to 10% level

Table 3: Industry Regressions of the Change in the Payroll-to-Sales Ratio on the Change in Concentration, Different Sectors

_	Stacked Five-Year Changes							Stacked Ten-Year Changes					
		CR4		CR20		HHI		CR4		CR20		HHI	
		(1)		(2)		(3)		(4)		(5)		(6)	
1	Manufacturing $n = 2,328; 1,164$	-0.064 (0.013)	**	-0.087 (0.024)	**	-0.107 (0.027)	**	-0.044 (0.022)	*	-0.044 (0.034)		-0.096 (0.037)	**
2	Retail $n = 348; 174$	-0.036 (0.021)	~	-0.085 (0.037)	*	-0.045 (0.026)	~	-0.045 (0.018)	*	-0.070 (0.029)	*	-0.075 (0.023)	**
3	Services $n = 570;285$	-0.090 (0.057)		-0.127 (0.037)	**	-0.354 (0.083)	**	-0.087 (0.070)		-0.129 (0.043)	**	-0.378 (0.158)	*
4	Wholesale $n = 336$; 168	-0.035 (0.012)	**	-0.039 (0.016)	*	-0.079 (0.039)	*	-0.037 (0.018)	*	-0.036 (0.018)	*	-0.067 (0.050)	
5	Finance $n = 124$; 62	-0.230 (0.083)	**	-0.265 (0.080)	**	-0.565 (0.204)	**	-0.252 (0.091)	**	-0.291 (0.070)	**	-0.740 (0.294)	*
6	Utilities + Transport $n = 144$; 48	-0.118 (0.026)	**	-0.116 (0.044)	**	-0.434 (0.054)	**	-0.048 (0.072)		-0.122 (0.051)	*	-0.269 (0.104)	**
7	All combined n = 3,850; 1,901	-0.076 (0.016)	**	-0.093 (0.022)	**	-0.144 (0.028)	**	-0.063 (0.019)	**	-0.083 (0.024)	**	-0.122 (0.033)	**

Fig 6: △Labor Share of <u>Sales</u> regressed on △Concentration: Results Across Six Sectors



Notes: OLS Regression coefficient of Δ Labor Share (payroll over sales) on CR20 (5 year changes); 95% confidence intervals; 1982-2012.

Summary of Evidence

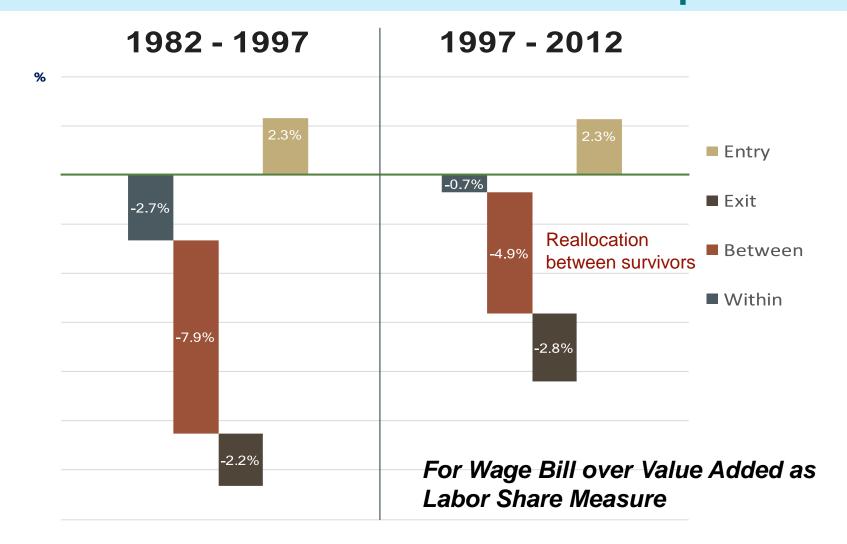
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Dynamic OP Decomposition between periods 2 & 1: Melitz-Polanec '15 add Entry + Exit

$$\Delta S = S_2 - S_1 = \Delta \bar{S}_S + \Delta [\Sigma(\omega_i - \bar{\omega})(S_i - \bar{S})]_S + \omega_{X,1} (S_{S,1} - S_{X,1}) + \omega_{E,2} (S_{E,2} - S_{S,2})$$

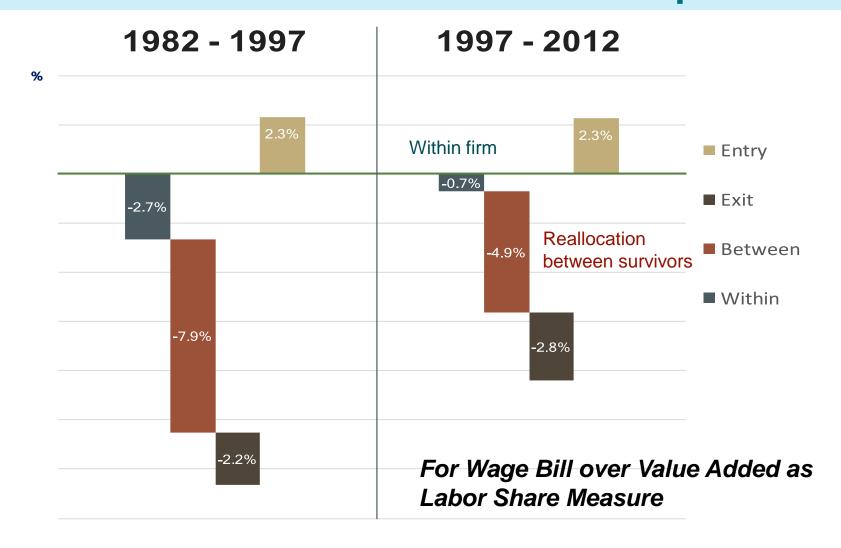
- 1. $\Delta \bar{S}_S$ is the change in unweighted mean labor share *within* surviving firms
- 2. $\Delta[\Sigma(\omega_i \overline{\omega})(S_i \overline{S})]_S$ is reallocation between survivors
- 3. $\omega_{X,1}(S_{S,1} S_{X,1})$ is contribution of exiting firms
- 4. $\omega_{E,2}(S_{E,2}-S_{S,2})$ is contribution of entering firms
- Also do alternative shift-share decompositions

Fig 9: MP Decomposition for Manufacturing: Between firm reallocation main component



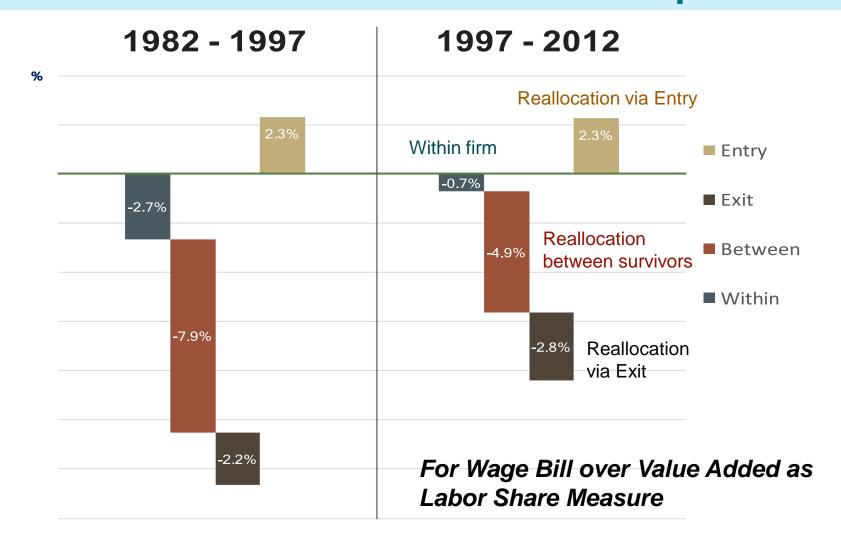
Notes: Overall labor share falls 16.5 percentage points 1982-2012. MP decomposition over 5 year periods, aggregated to two 15 year periods

Fig 9: MP Decomposition for Manufacturing: Between firm reallocation main component



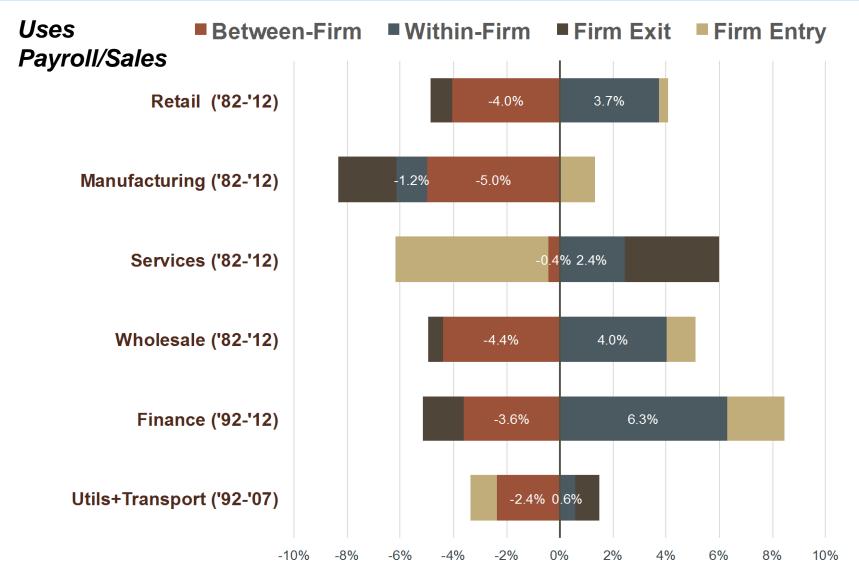
Notes: MP decomposition over 5 year periods, aggregated to two 15 year periods

Fig 9: MP Decomposition for Manufacturing: Between firm reallocation main component



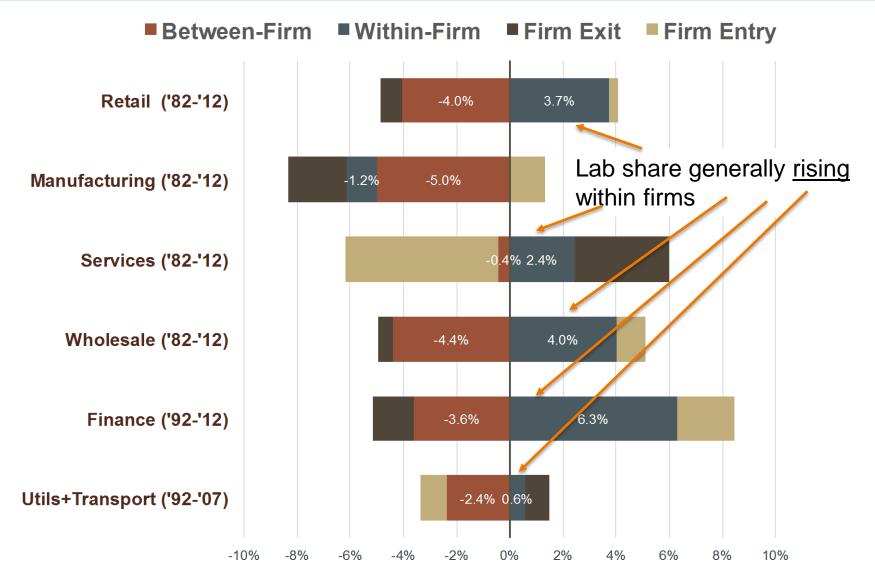
Notes: MP decomposition over 5 year periods, aggregated to two 15 year periods

△ Labor-Share Decomposition in 6 Sectors: Reallocation component dominates



Notes: MP decomposition over 5 year periods, aggregated over the full sample period

△ Labor-Share Decomposition in 6 Sectors Unweighted mean lab share for incumbents *rises*



Notes: MP decomposition over 5 year periods, aggregated over the full sample period

Price-cost markups (Preliminary)

1. Harder to estimate mark-ups than labor shares!

- Sales/Costs (Antras, Fort & Tintelnot '17)
- Using FOC (de Loecker & Warzynski '12; Hall '88)
 - Estimate production function in each industry to obtain elasticity of output wrt to variable factor (α_{it}); divide by factor share ($SHARE_{it}$):

$$\widehat{m_{it}} = \frac{\alpha_{it}}{SHARE_{it}}$$

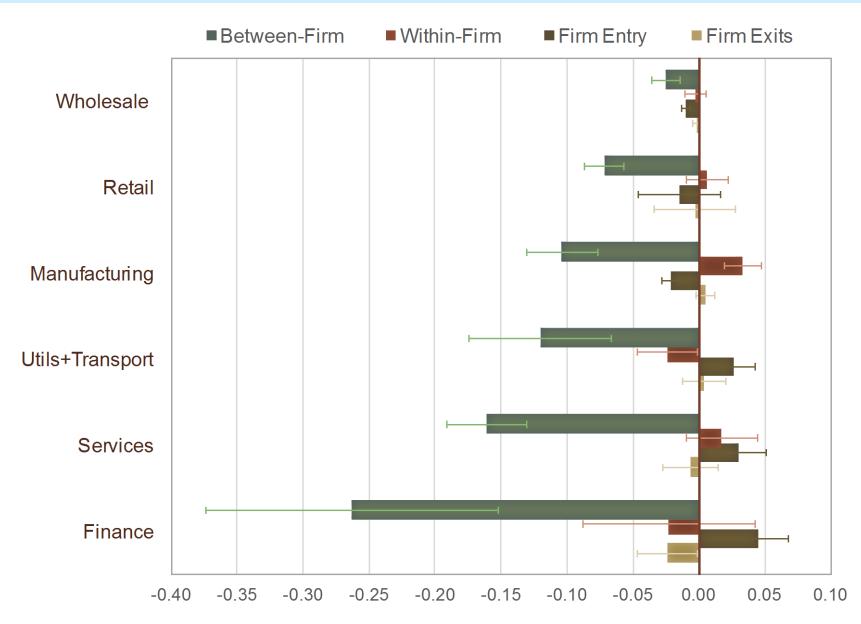
2. Using all methods we observe (in CM):

- Higher mark-ups for larger firms in cross section
- Increase in aggregate mark-up but relatively little change in unweighted average mark-up (again, it's reallocation)

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Fig 11: Regression of ∆Labor Share Components on Sector Level ∆ CR20: Loads on reallocation term



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Data Sources (International)

Industry-level labor shares, intermediate services

- KLEMS data
- 11 countries, 32 industries

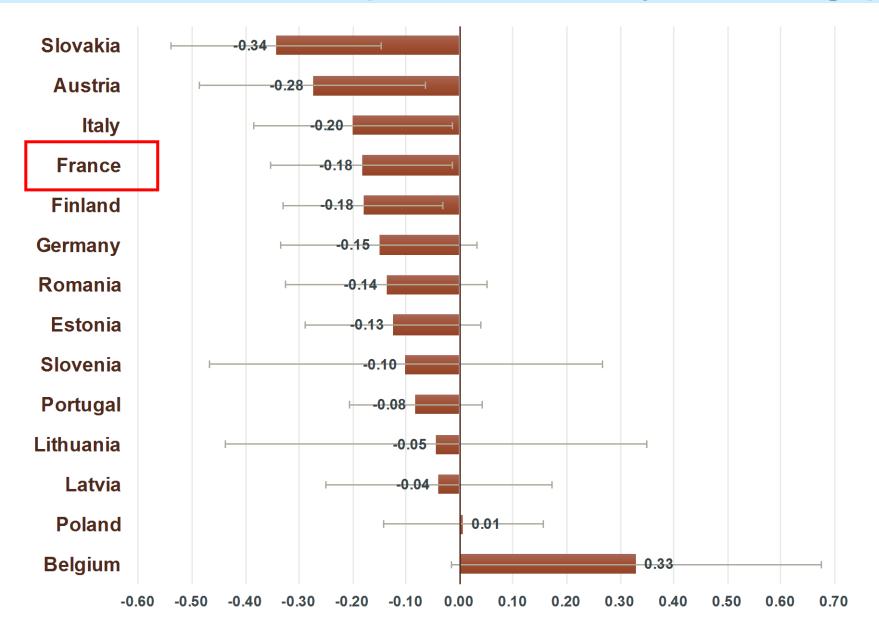
Industry-level labor shares and concentration

- ECB COMPNET data
- 14 countries, 53 industries

Firm-level labor shares

- BvD Orbis data
- 6 EU countries

Table 6: Industry Regs of \triangle Labor Share of Sales on \triangle Concentration (COMPNET, 10 year change)



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Summary of Empirical Findings

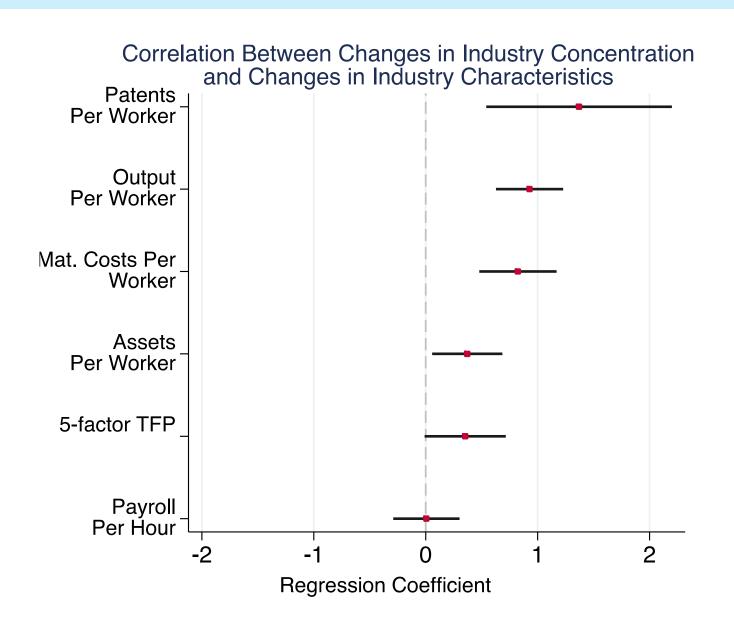
- 1. A pervasive fall in labor share across countries
- 2. Mainly due to reallocation of sales between-firms within industries rather than within-firm changes
- 3. Industries with largest increases in concentration had largest falls in labor share
- 4. And this was due to the reallocation component of falling labor share, not a general fall in share
- Comparable international findings in industry & firm-level data across OECD countries

What's Not Going on

Results do not appear explained by

- 1. Country-specific institutional factors like specific regulations or weakening labor unions
- 2. Susceptibility to 'routine-replacing technical change' (ICT)
- 3. 'China shock' trade exposure not major predictor

Fig 14: Not Simply "Rigged Economy:" Concentrating Industries Show Larger Increase in Innovation, Productivity



Conclusion: Much Supporting Evidence for 'Superstar Firms'

1. Tougher competition?

More consumer sensitivity to price/quality

2. Shift towards 'winner take most' markets?

IP and information-intensive goods

3. Less creative destruction?

- Less entry/exit/startup, Decker et al '14, Şahin et al '17
- More persistent tech. leaders, Acemoglu-Hildebrand '17
- Laggard firms catching up less quickly, Andrews et al, '16

4. Does ↑ concentration indicate *weaker* competition?

- Good news: concentrating industries look dynamic
- But once dominant, firms can raise barriers to growth/entry

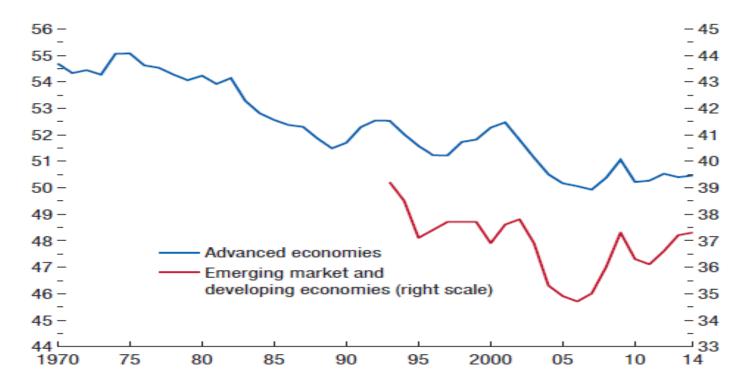
Back Up

Superstar Firm Model (Generalization of Melitz & Ottaviano, 2008)

- Monopolistic Competition with heterogeneous firms
 - General class of utility functions consistent with "Marshall's 2nd Law of Demand" (generates variable mark-ups unlike CES Dixit-Stiglitz preferences)
 - General class of underlying firm productivity distributions (nests Pareto pdf)

Figure 3.1. Evolution of the Labor Share of Income (Percent)

The labor share of income has been on a downward trend in both advanced economies and emerging market and developing economies.



Sources: CEIC database; Karabarbounis and Neiman (2014); national authorities; Organisation for Economic Co-operation and Development; and IMF staff calculations.

Note: For advanced economies the figure shows averages weighted by nominal GDP in current U.S. dollars. For emerging market and developing economies the figure shows year fixed effects weighted least squares regressions (using nominal GDP weights) that also include country fixed effects. Year fixed effects are normalized to reflect the level of the labor share in 2000.

Industry Codes

- "Retail & wholesale" has Office equipment, computers & software nec. 5044/4045/5046
- Services computer programming & related (7371/7372/7273/7279/7378/7377)

Productivity paradox

- If labor share fall was due to a general drop in competition this would help explain productivity slowdown.
- However we find unweighted average firm LS/mark-ups haven't changed much - Reallocation matters more
- But reallocation to more productive firms should generate higher productivity growth, but growth has actually slowed
- We <u>do</u> see faster productivity growth and innovation in the concentrating sectors where LS declining
- So culprit for productivity slowdown need to be found elsewhere than falling competition (finance; uncertainty; ideas harder to find; mismeasurement, etc.)

Decompositions

- Labor share decomposition similar to (inverse) labor productivity decomposition
 - But different from standard TFP decomposition
 - And standard model would have increased lab productivity growth but unchanged lab share (not secular decline in lab share)
- We find larger role for reallocation than usual decompositions

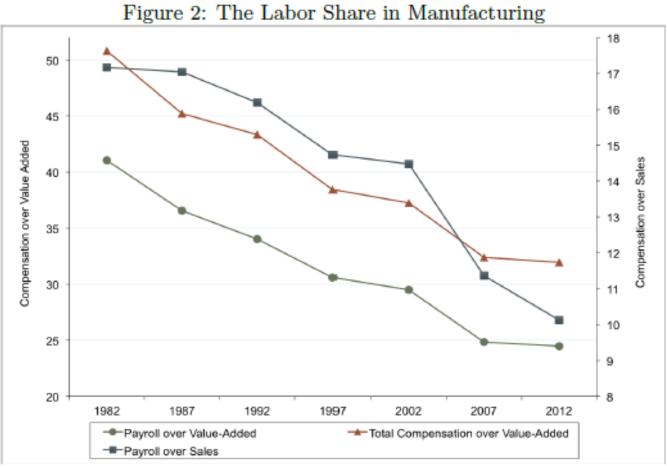
Outsourcing/Offshoring

- Domestic outsourcing can't be direct cause of aggregate LS fall - workers show up somewhere (would have to be some fall in rents type story)
- If offshoring was the cause, can assess this by looking at Compustat data – we see fall in even in multinationals (But could be offshoring AND outsourcing (e.g. Apple/FoxComm)
- Payroll/sales could fall with outsourcing, but no obvious bias with payroll/value added (VA net of intermediate inputs)
- Control for underestimated service inputs by looking within SIC4 for decompositions
- Underestimate Δoutsourcing for large firms? Implies big within firm fall in LS. We don't see this.

Concentration & Labor Share: Magnitudes

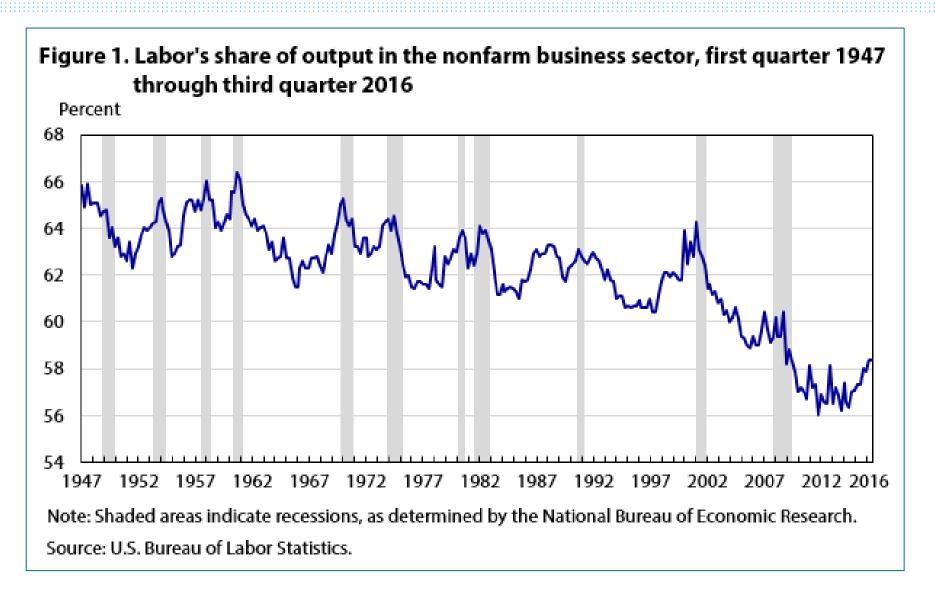
- Counterfactual: If concentration had stayed at 1982 levels what would the labor share have been in a sector in 2012 compared to actual level?
 - Example of CR20 (see Figure 7)
- Varies from 10% in manufacturing to 100% in retail
- Surprisingly low in manufacturing? Effect increased over time as coefficient on concentration rises. In the last 15 years 1997-2012 over 1/3 of change accounted for

Change in the Labor Share in US manufacturing



Notes: This figure plots the aggregate labor share in manufacturing from 1982-2012. The green circles (plotted on the left axis) represent the ratio of wages and salaries to value-added. The red diamonds (also plotted on the left axis) include a broader definition of labor income and plots the ratio of wages, salaries and fringe benefits to value-added. The blue squares (plotted on the right axis) show wages and salaries normalized by sales rather than value-added.

US Labor Share 1947-2016



Source: BLS https://www.bls.gov/opub/mlr/2017/article/estimating-the-us-labor-share.htm

NIPA vs Census. Manufacturing Labor Share

Figure A.8: Comparing Labor Share in NIPA and Census: Manufacturing Only
Panel A: The Labor Share

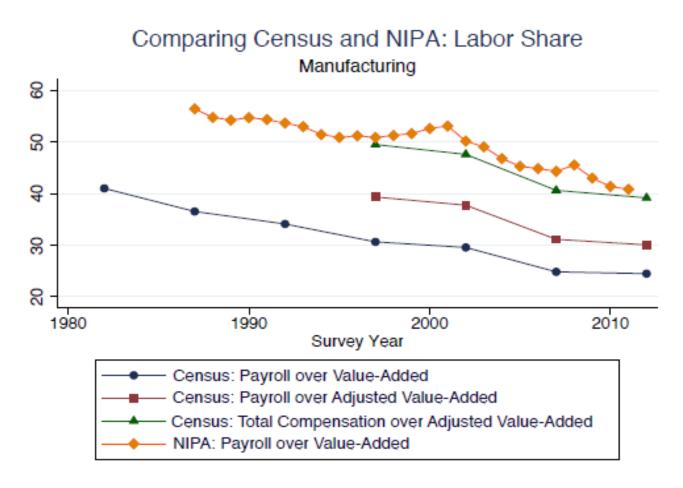
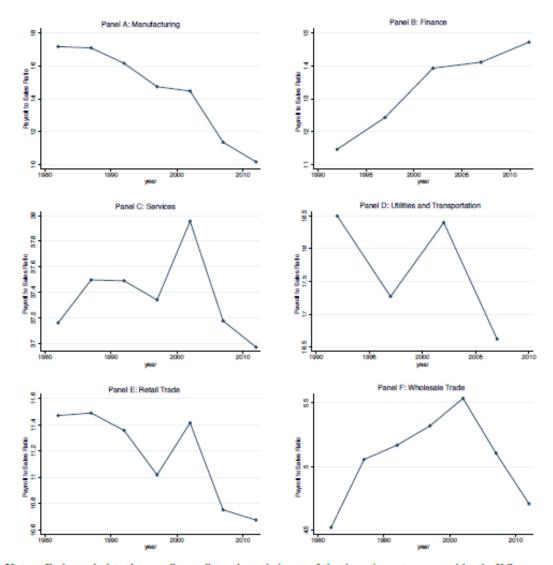


Figure 3: Average Payroll-to-Sales Ratio



Notes: Each panel plots the overall payroll-to-sales ratio in one of the six major sectors covered by the U.S. Economic Census.

Consider <u>increase</u> in market toughness (globalization or higher variety substitutability)

Modelled as a fall in minimum cost threshold (c^* : if a firm's marginal cost, $c > c^*$ it will exit)

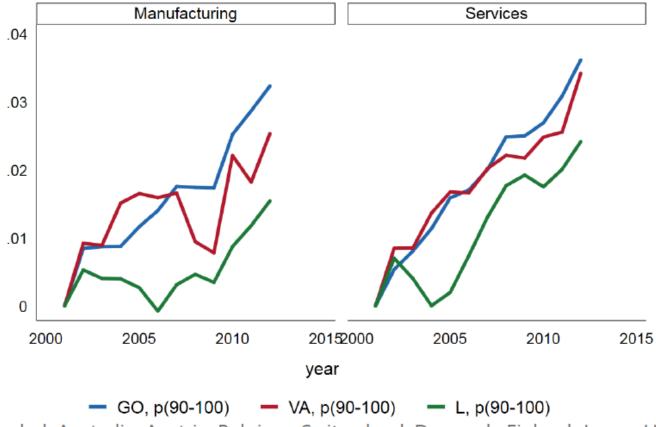
- 1. Output shifts to low labor share firms. "Between firm" reallocation pushes down aggregate labor share
- 2. But for an individual firm, labor share rises because mark-up falls ("within firm")

Result 3: An increase in market toughness depends on pdf of productivity, $\lambda(z)$

- Reduces industry labor share if λ(z) is log convex
- Increases industry labor share if $\lambda(z)$ is log concave
- Leaves industry labor share unchanged if λ(z) is log linear.
 This is standard Pareto case (e.g. Melitz & Ottaviano '08)

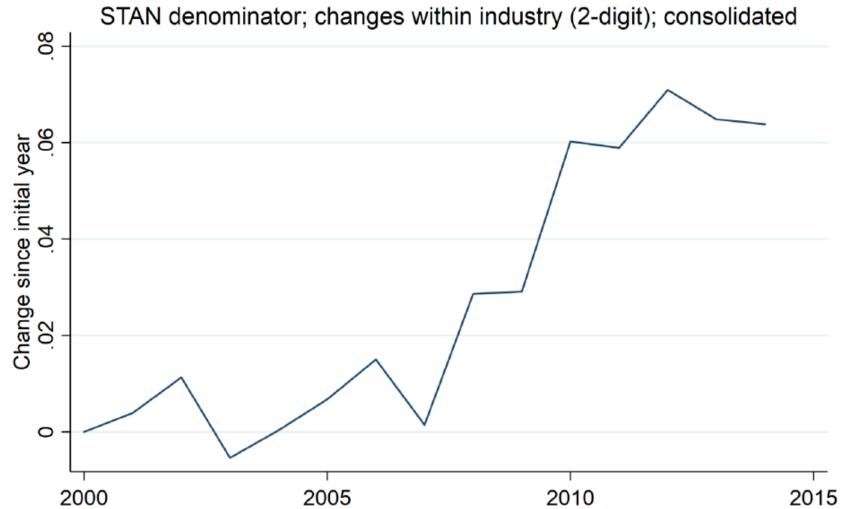
Hence, fundamentally an empirical issue

Trends in within-country-sector changes in Share of GO, VA, L in the top decile of sales distribution



Note: Countries included: Australia, Austria, Belgium, Switzerland, Denmark, Finland, Japan, Hungary, Norway, Portugal and Sweden. The estimates reported in the graph are those of year dummies in a cross-country regression of the share of GO, L and VA in the top decile of the distribution with year=2001 being the reference year and with 2-digit sectoral dummies inlincluded. Source: **MultiProd** database, December 2017.

Top 4 firm market share: Europe



The market shares are calculated by dividing sales of top 4 firms in Orbis by the total sales in the OECD STAN database. Year effects from regressions including industry and year dummies.

Higher mark-up (m_i) for more productive firms arises in many standard cases

- 1. Demand more inelastic when price is lower. Highly productive firms charge lower prices & so face more inelastic demand. Thus mark-ups m_i higher
- 2. In our data we confirm that larger firms have lower labor shares (& higher mark-ups as in de Loecker & Warzynski '12)
- 3. Consistent with Pass-through literature: 1% marginal cost increase causes less than a 1% increase in price (e.g. Arkolakis et al, '18 survey)
- **4. Note:** CES preferences imply common mark-up. But if allow fixed costs of labor (Bartelsman et al '13) N = V + F, then superstar firms still have lower labor shares since

$$S_i = \left(\frac{wN}{PY}\right)_i = \frac{\alpha}{m} + \frac{wF}{(PY)_i}$$

Consider <u>increase</u> in market toughness (globalization or higher variety substitutability)

Modelled as a fall in minimum cost threshold to produce in market (c*: if a firm's marginal cost, c > c* it will exit)

- 1. Output shifts to low labor share firms. "Between firm" reallocation pushes down aggregate labor share
- 2. But for an individual firm, labor share rises because mark-up falls ("within firm")

Increase in market toughness depends on pdf of productivity, $\lambda(z)$

- Reduces industry labor share if λ(z) is log convex;
- Unchanged if log linear (e.g. Pareto case); Increases if log concave

Hence, fundamentally an empirical issue

Fig 13: △Labor Share: Within/Between-Firm Decomposition by Country Using BVD Orbis Data

