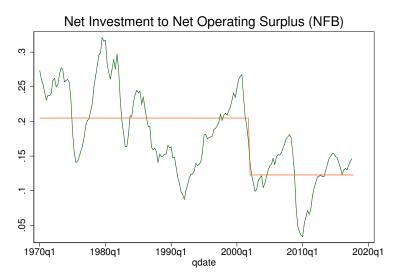
# Entry Costs and the Macroeconomy

Germán Gutiérrez Callum Jones Thomas Philippon

NYU, IMF, NBER, CEPR

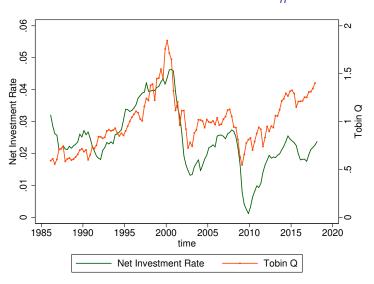
December 2019

Fact 1: Investment is Low #1



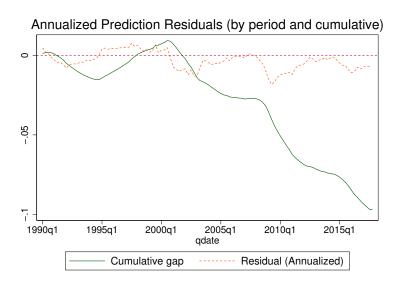
Gutiérrez and Philippon '17, and Lee et al '16.

Fact 1: Investment is Low #2

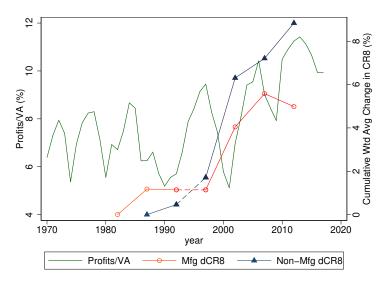


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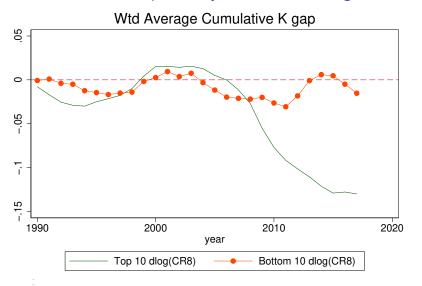
Fact 1: Investment is Low #3



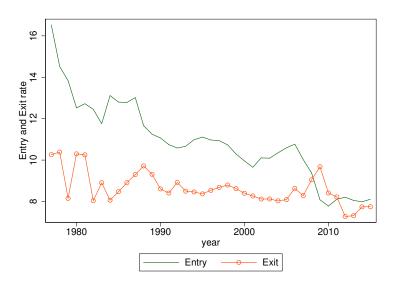
#### Fact 2: Concentration & Profits Have Increased



#### Fact 3: Investment Gap is Only in Concentrating Industries



#### Fact #3: Entry Rates Have Fallen



## Interpretation of the Evidence

- Interpretation remains controversial:
  - Endogeneity of profits/entry/concentration/investment
  - Need a model to interpret the evidence
  - Macro models so far focus on effect of (assumed) higher markups
- We use a fully specified model with competing drivers of facts
  - Use the data to derive a series for entry costs and study their importance
  - Provide direct empirical evidence of what these entry costs are

## Approach and Findings

- Develop a model with monopolistic competition and firm entry
  - Entry decision based on expected profits
- Estimate model on industry/aggregate data, 1989-2015, to get:
  - shocks and relationship between entry, competition, investment
  - Identified entry costs correlate with regulation/M&A
- Use the model to study aggregate implications, 1989 to 2015
  - About 10% of entry driven by shocks to demand beliefs
  - An increase in aggregate firm entry costs from 2003
  - Absent this increase,  $C_t$ : 6.5% higher,  $K_t$ : 6% higher

# Model

#### Overview

- Continuum of industries indexed by j
- Goods- and capital-producing firms with quad capital adj costs
- Firm entry into goods-producing industries
- Industry-level beliefs about demand before 2000
- Nominal rigidities and monetary policy subject to the ZLB
- Estimate the model on industry and aggregate data

#### Capital Producers

• Representative firm in industry j accumulates capital  $K_i$  to

$$\max_{l_{j,t}} V_{j,t} = \sum_{i=0}^{\infty} \Lambda_{t,t+i} \mathsf{Div}_{j,t+i}$$

where

$$\mathsf{Div}_{j,t} = R_{j,t}^k K_{j,t} - I_{j,t} - \frac{\phi_k}{2} K_{j,t} \left( \frac{I_{j,t}}{K_{j,t}} - \delta \right)^2$$

and investment is

$$I_{i,t} = K_{i,t+1} - (1-\delta)K_{i,t}$$

Solution: Q-theory,

$$\frac{I_{j,t}}{K_{i,t}} - \delta = \frac{1}{\phi_{t}} (Q_{j,t} - 1)$$

where  $Q_{i,t}$  is market value of the firm / capital replacement cost

Industry output aggregated by a perfectly competitive firm

$$Y_t = \left(\int_0^1 (D_{j,t} Y_{j,t})^{\frac{\sigma-1}{\sigma}} \mathrm{d}j\right)^{\frac{\sigma}{\sigma-1}}$$

Industry demand is

Motivation & Empirics

$$Y_{j,t} = D_{j,t} \left(\frac{P_{j,t}}{P_t}\right)^{-\sigma} Y_t$$

where  $D_{i,t}$  is an industry demand shock

$$\log D_{j,t} = (1-\rho_d)\log \frac{D_j}{D_j} + \rho_d \log D_{j,t-1} + \sigma_d \varepsilon_{j,t}^d$$

D<sub>i</sub> is steady-state demand

## Goods Producers #2

• Industries are made up of firms i

Motivation & Empirics

• Firm output  $y_{i,i,t}$  aggregated into an industry output

$$Y_{j,t} = \left(\int_0^{N_{j,t-1}} y_{i,j,t}^{\frac{\varepsilon_j-1}{\varepsilon_j}} \mathrm{d}i\right)^{\frac{\varepsilon_j}{\varepsilon_j-1}}$$

where  $N_{i,t-1}$  is the number of firms in industry j at time t

• Firm i chooses  $k_{i,j,t}$ ,  $\ell_{i,j,t}$  and  $p_{i,j,t}$  to

$$\max_{k_{i,j,t},\ell_{i,j,t},p_{i,j,t}} p_{i,j,t}y_{i,j,t} - W_t \ell_{i,j,t} - R_{j,t}^k k_{i,j,t}$$

subject to industry demand, and the production function

$$y_{i,j,t} = k_{i,j,t}^{\alpha} \ell_{i,j,t}^{1-\alpha}$$

Motivation & Empirics

## Goods-Producers Entry

The number of existing firms N<sub>i,t</sub> evolves by

$$N_{j,t+1} = (1 - \delta^n)N_{j,t} + n_{j,t}$$

• Firms pay entry input  $\kappa_{j,t}$  at price  $p_{i,t}^e$  to become active in t+1

$$p_{j,t}^e = (\kappa_{j,t} n_{j,t})^{\phi^n}$$

• Let  $V_{i,t}^e$  is the value of a firm in industry j. Firms enter until

$$(1-\delta^n)\mathbb{E}_t\Lambda_{t+1}V_{j,t+1}^e=p_{j,t}^e\kappa_{j,t}$$

Entry input costs are stochastic

$$\log \kappa_{j,t} = (1 - \rho_{\kappa}) \log \kappa + (1 - \rho_{\kappa}) \log \kappa_{j,t-1} + \sigma_{\kappa} \varepsilon_{j,t}^{\kappa}$$

Individual firm sets

where  $\mu_j = \frac{\varepsilon_j}{\varepsilon_i - 1}$ 

Motivation & Empirics

$$p_{i,j,t} = \mu_j \mathsf{MC}_{j,t}$$

Industry price is

$$P_{j,t} = \left(\int_0^{N_{j,t-1}} \rho_{i,j,t}^{1-\varepsilon_j} \mathrm{d}i\right)^{\frac{1}{1-\varepsilon_j}} = \frac{\mu_j \mathsf{MC}_{j,t}}{N_{i,t-1}^{\frac{1}{\varepsilon_j-1}}}$$

⇒ More entry - lower price

• All firms face the same factor prices so industry supply is

$$Y_{j,t} = N_{j,t-1}^{\frac{\varepsilon_j}{\varepsilon_j-1}} y_{i,j,t}$$

Industry demand is

Motivation & Empirics

$$Y_{j,t} = D_{j,t} P_{j,t}^{-\sigma}$$

• Equate supply and demand and substitute in  $P_{j,t}$ ,

$$y_{i,j,t} = \frac{\left(\mu_{j}\mathsf{MC}_{j,t}\right)^{-\sigma}D_{j,t}}{\mathsf{N}_{j,t-1}^{\frac{\varepsilon_{j}-\sigma}{\varepsilon_{j}-1}}}$$

⇒ More entry - lower firm output

Motivation & Empirics

## Households and Monetary Policy

Households choose  $C_t$ ,  $\ell_t$  and savings to

$$\max \ \mathbb{E}_t \sum_{t=0}^{\infty} \beta^t \left( \frac{C_t^{1-\gamma}}{1-\gamma} - \frac{\ell_t^{1+\psi}}{1+\psi} \right)$$

subject to the budget constraint:

$$S_t + P_t C_t \le \tilde{R}_t S_{t-1} + W_t \ell_t$$

Add sticky prices and wages, and monetary policy:

$$r_t = \max \left[0, \ \phi_i r_{t-1} + \phi_p \pi_t^p + \phi_y (y_t - y_t^F)
ight]$$

r<sub>t</sub> subject to the ZLB

#### Shocks

- Industry and aggregate shocks:
  - Entry-cost
  - Productivity
  - Inflation equations (Phillips curves)
  - Valuation of corporate assets
- Industry-specific shocks:
  - Industry demand
  - Regime shift in industry demand beliefs, between 1995 and 2000
- Aggregate-specific shocks:
  - Household discount factor
  - Monetary policy

#### Regime Shift in Demand Beliefs Before 2000

- Noisy entry: entry uncorrelated with future demand
- Evidence of noisy entry for several industries in late 1990s
  - Doms (2004): high dotcom growth rates
  - Hogendorn (2011): excess entry into Telecom sector
  - Substantial inflows into VC funds focused on dotcom
- Variation to identify elasticity of firm entry

Motivation & Empirics

#### Regime Shift in Demand Beliefs Before 2000

• We capture this as variations in beliefs about  $D_i$ , where

$$\log D_{j,t} = (1 - \rho_d) \log \frac{D_j}{D_j} + \rho_d \log D_{j,t-1} + \sigma_d \varepsilon_{j,t}^d$$

- In particular, our specification is:
  - Before 1995 and after 2000,  $D_i = 1$  for all industries
  - Between 1995 and 2000, D<sub>i</sub> is a free parameter

# Estimation

#### Estimation #1

- Bayesian/likelihood approach
- Data:
  - Industry: annual data, 1989 to 2015, for 43 industries on
    - Q Details
      - Concentration Ratio Details
    - Nominal Output, Capital, Prices
  - Aggregate: quarterly data, 1989Q1 to 2015Q1, on
    - Fed Funds rate / Inflation / Expected ZLB Durations
    - Consumption / Investment / Employment
    - Concentration Ratio Details

## Estimation #2

- Calibrated Parameters
  - Elasticity  $\varepsilon_i$  calibrated to  $NOS_i/Y_i$

Distribution Other Parameters

- Estimated Parameters:
  - Industry:
    - Shock processes, AR(1)
    - Expected demand regimes D<sub>i</sub>
    - $\phi^n$  and  $\sigma$
  - Aggregate:
    - Shock processes, AR(1)
- Three main challenges:
  - (i) ZLB, (ii) demand expectations, (iii) industry data imes 43

## Challenge 1: Solution Method for ZLB

• The ZLB implies a time-varying representation for our model

$$\mathsf{A}_t \mathsf{x}_t = \mathsf{B}_t \mathsf{x}_{t-1} + \mathsf{D}_t \mathbb{E}_t \mathsf{x}_{t+1} + \mathsf{F}_t \varepsilon_t$$

This gives rise to a time-varying VAR solution

$$x_t = \mathbf{Q}_t x_{t-1} + \mathbf{G}_t \varepsilon_t$$

- Expected ZLB durations pin down  $\mathbf{Q}_t$  and  $\mathbf{G}_t$ 
  - Kulish et al '17, Jones '17, Guerreri and Iacoviello '16.
- We use survey data on durations from NYFed



Motivation & Empirics

## Challenge 2: Solution for Demand Regime Shifts #1

Suppose the regime which is driving the observables is:

$$\mathbf{A} x_t = \mathbf{B} x_{t-1} + \mathbf{D} \mathbb{E}_t x_{t+1} + \mathbf{F} \varepsilon_t$$

- For example, steady-state demand in industry j,  $D_i$ , is low
- But agents believe that a \* regime is true:

$$\mathbf{A}^* x_t = \mathbf{C}^* + \mathbf{B}^* x_{t-1} + \mathbf{D}^* \mathbb{E}_t x_{t+1} + \mathbf{E}^* \varepsilon_t.$$

- For example, steady-state demand in industry j,  $D_i$ , is high
- We seek a solution of the form (Kulish and Pagan '16)

$$x_t = \tilde{\mathbf{Q}} x_{t-1} + \tilde{\mathbf{G}} \varepsilon_t$$

Motivation & Empirics

## Challenge 2: Solution for Demand Regime Shifts #2

To find the solution, expectations must satisfy

$$\mathbb{E}_t x_{t+1} = \mathbf{Q}^* x_t$$

• Substitute this into  $Ax_t = Bx_{t-1} + D\mathbb{E}_t x_{t+1} + F\varepsilon_t$  to get:

$$\tilde{\mathbf{Q}} = \left[\mathbf{A} - \mathbf{D}\mathbf{Q}^*\right]^{-1}\mathbf{B}$$

$$\tilde{\mathsf{G}} = \left[\mathsf{A} - \mathsf{D}\mathsf{Q}^*\right]^{-1}\mathsf{F}$$

- With  $x_t = \tilde{\mathbf{Q}} x_{t-1} + \tilde{\mathbf{G}} \varepsilon_t$ , we can form the state-space
- $\bullet$  So beliefs about demand map to  $\tilde{\mathbf{Q}}$  and  $\tilde{\mathbf{G}}$  and the likelihood

- We want to use industry-level data in identification
- Problem: Infeasible
  - 43 industries, 10+ state variables each, aggregate shocks, ZLB
- Recall our model is

$$x_t = \left[x_t^1, \ x_t^2, \ldots\right]' = \mathbf{Q}_t x_{t-1} + \mathbf{G}_t \varepsilon_t$$

• Solution: Write the industry *i* level variables as

$$\mathbf{x}_{t}^{j} = \underbrace{\mathbf{Q}\mathbf{x}_{t-1}^{j} + \mathbf{G}\boldsymbol{\varepsilon}_{t}^{j}}_{\text{industry-level component}} + \underbrace{\mathbf{Q}_{t}^{a}\mathbf{x}_{t-1}^{*} + \mathbf{G}_{t}^{a}\boldsymbol{\varepsilon}_{t}^{*}}_{\text{aggregate component}}$$

# Challenge 3: Likelihood Function With Industry Data #2

Industry i level variables are

$$\mathbf{x}_{t}^{j} = \underbrace{\mathbf{Q}\mathbf{x}_{t-1}^{j} + \mathbf{G}\mathbf{\mathcal{E}}_{t}^{j}}_{\text{industry-level component}} + \underbrace{\mathbf{Q}_{t}^{a}\mathbf{x}_{t-1}^{*} + \mathbf{G}_{t}^{a}\mathbf{\mathcal{E}}_{t}^{*}}_{\text{aggregate component}}$$

- Express industry-level data <u>relative</u> to average  $\bar{x}_t = \int x_t^j dj$
- Assuming average shock  $\int \mathcal{E}_t^j dj = 0$ , then

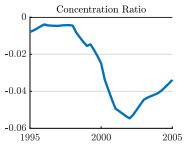
$$x_t^j - \bar{x}_t = \mathbf{Q}\left(x_{t-1}^j - \bar{x}_{t-1}\right) + \mathbf{G}\varepsilon_t^j$$

Shocks iid: separate the likelihood into 43 industry components

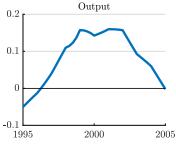
#### Treatment of Industry-Level Data

- Express industry-level data relative to aggregate
- For each industry series
  - 1. Compute a full set of time effects
  - 2. Subtract a industry-specific fixed effect and trend
  - 3. Work with the residuals
- Exploit these relative changes in identification

## Industry-Level Observable: Info Publishing, 1995 to 2005







# Industry and Aggregate Implications

## Industry-Level Estimates

	Prior				Posterior		
Parameter	Dist	Median	10%	90%	Median	10%	90%
φ <sup>n</sup>	N	3.0	2.4	3.6	1.55	1.08	2.32
σ	Ν	2.0	8.0	3.3	0.40	0.38	0.43
Log Demand Regimes (2 of 43)							

1.6

4.1

0.2

3.1

2.9

4.4

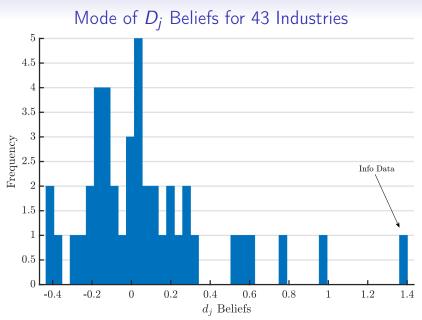
Full Estimates

Uniform

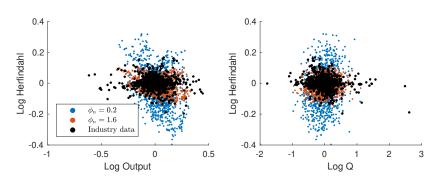
Uniform

Durable Comp.

Info Data



## Industry Identification of Estimate of $\phi_n$

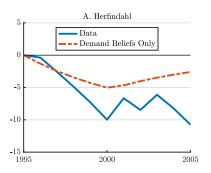


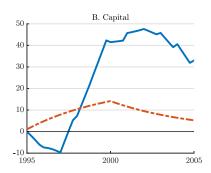
#### $\phi_n$ estimate implies:

- Following demand shock that raises  $Q_t$  to 10% after 1 year
- $\Rightarrow$  Number of firms increases by 1.4% after 2 years

#### Estimate of Demand Beliefs: Specific Industry

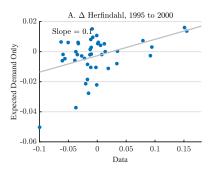
#### Example for Info Data Industry

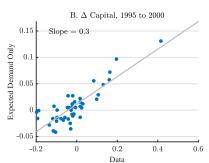




#### Estimate of Demand Beliefs: All Industries

### • Accounts for about 10% of entry





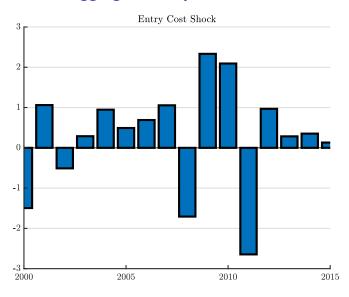
### Aggregate Implications

- What are the aggregate implications of firm entry?
- Use the estimated elasticity of firm entry to Q,  $\phi_n$  and:
  - 1. Estimate the aggregate model's parameters
  - 2. Filter the aggregate data for the shocks
- Experiments with estimated model
  - 1. Interpret changes in entry cost shocks
  - 2. Turn off aggregate entry cost shock from 2003

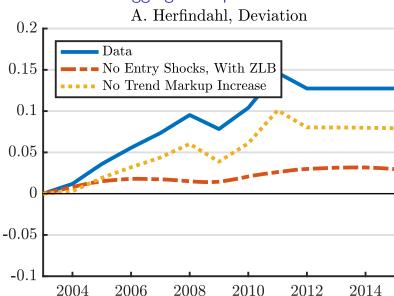
### Variance Decomposition of Aggregate Variables

Variable	Tech.	Pref.	Infl.	Risk P.	Policy	Entry Cost
Fed Funds Rate	26.9	2.3	14.5	41.8	8.9	5.7
Output	15.7	21.4	1.1	51.0	1.1	9.7
Consumption	28.1	18.2	1.2	44.7	0.9	7.0
Investment	8.9	17.3	1.7	28.5	2.5	41.2
Employment	23.2	19.3	1.4	47.1	1.1	8.0
Inflation	30.6	0.3	24.1	32.7	7.1	5.2
Herfindahl	20.5	20.2	1.0	49.0	1.0	8.3
Natural Rate	1.3	6.7	0.0	54.9	0.0	37.1

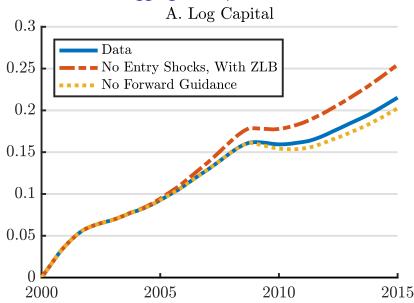
### Aggregate Entry Cost Shock







### Aggregate Implications



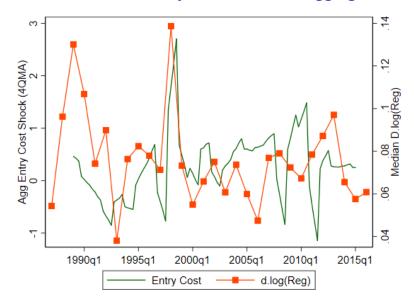


Validity
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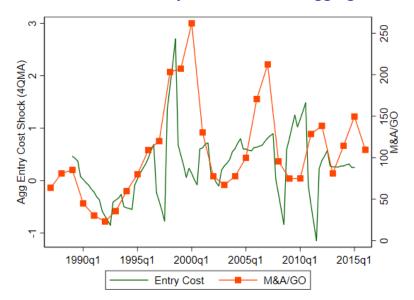
### Empirical Proxies of Barriers to Entry

- Regulation Index:
  - Regulation based on RegData 3.1 from QuantGov
  - Machine learning / natural language processing techniques to construct measures of regulatory stringency at the industry level
  - Number of restrictive words or phrases such as 'shall', 'must' and 'may not' in each section of the Code of Federal Regulations
- Regulatory employment:
  - Regulatory employment from the Census Occupational Employment Statistics
- M&A activity

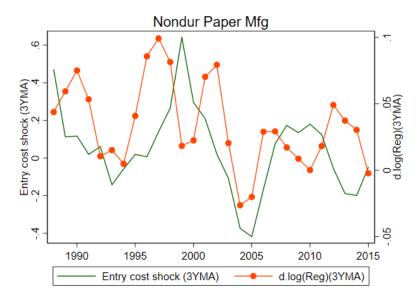
### What are the Entry Cost Shocks? Aggregate



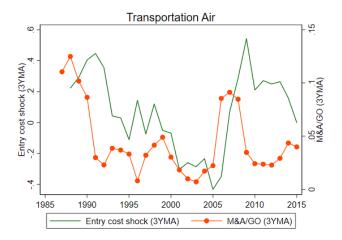
### What are the Entry Cost Shocks? Aggregate



### What are the Entry Cost Shocks? Non-Dur Paper Manuf



### What are the Entry Cost Shocks? Air Transport



Delta-Northwest (2008), United-Continental (2010),
 Southwest-AirTran (2011) and American-US Airways (2014)

#### The Economist on Airlines



Economist.com

### Entry Costs Across All Industries

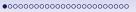
			ζ	κ i,t		
	(1) All	(2) Post-02	(3) Post-02	(4) Post-02	(5) All	(6) Post-02
$\Delta \log(RegIndex_{t-2,t-1}^{j})$	0.044** (0.014)	0.047* (0.017)			0.044** (0.014)	
$\Delta \log(Reg\hspace{.01in}Emp_{t,t+\boldsymbol{1}}^{j})$			0.031* (0.013)			
${\sf Mean} \big( {\sf L.dRegIndex}, {\sf F.dRegEmp} \big)$				0.038** (0.009)		0.033** (0.010)
$\log(M\&A_{j,t})(2YMA)$					0.047* (0.021)	0.087* (0.037)
Ind FE	Υ	Υ	Υ	Υ	Υ	Υ
Year FE	Y	Y	Y	Υ	Y	Y
R2 Observations	.051 837	.091 358	.085 358	.095 358	.057 837	.11 358

#### Conclusion

- US industries have become more concentrated
  - Lack of competition leads to lower investment
  - We find an increase in entry costs
  - We link those entry costs to regulation/M&A
- Europe has trended the other way

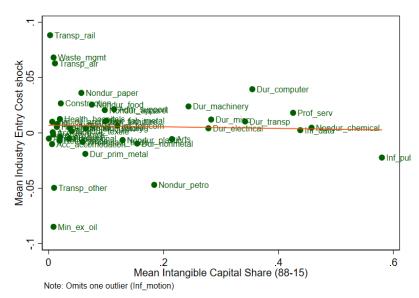


- Decreasing concentration
- Low investment in Europe and low valuations/high risk premia
- If true, then probably cyclical



# Appendix

### What are the Entry Cost Shocks?



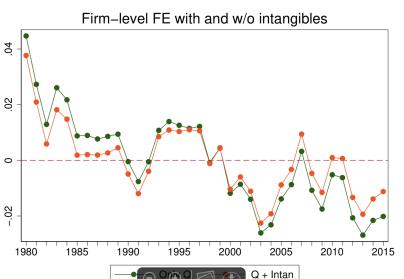
### How Should We Interpret These Facts?

- Drop in the price of capital?
- Intangible assets
  - Peters and Taylor '16, Alexander and Eberly '16
- Superstar firms?
  - Autor '17
- Globalization
  - Feenstra and Weinstein '17, Fresard and Valta '15, Hombert and Matray '15
- Decreasing Domestic Competition, DDC
  - Furman '15, Gutiérrez and Philippon '17

### How Should We Interpret These Facts? #2

- Drop in the price of capital?
  - Timing is wrong, as fall in price of capital occurs before 2000
- Intangible assets
  - 25% of the gap between Q and N/K explained by intangible intensity, so not much
  - National accounts does include IP investment
  - Argument not necessarily true for industries like airlines
- Superstar firms?
  - Implies TFP correlated with concentration, but not so from 2000
  - Leaders are investing less, when it should be more Evidence
  - Concentration trends not observed so much in Europe
- Globalization?
  - Measurement? investment gap appears in consolidated firm-level data, which includes investment in US and outside
  - External Profits? GP (2017) BPEA show profits have increased faster than foreign sales, so profits being shifted out of the US

## Intangibles: Gutierrez and Philippon (2017)



### Productivity: Gutierrez and Philippon (2017)

### Select Discussion: Super Star

- Our interpretation of the hypothesis (Autor et al.)
  - Not simply a description of skewness.
  - But an explanation for concentration: efficiency instead of market power
- What we find: some support in the 1990s, but not after 2002.

	(1)	(3)
	$\DeltaTFP$	
	97-02	02-12 <sup>†</sup>
$\Delta Census\ CR4$	0.481**	0.051
	[4.439]	[0.301]
Observations	469	297
$R^2$	4%	0%
+ p<0.10, * p<0.05,		P change t

# EXTRA: Measures of Concentration & Entry

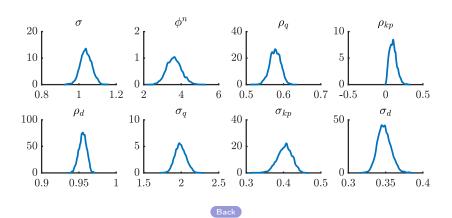
 Traditional Herfindahl + Common ownership adjustment (Azar, et. al. (2016))

$$MHHI = \sum_{j} s_{j}^{2} + \sum_{j} \sum_{k \neq j} s_{j} s_{k} \frac{\sum_{i} \beta_{ij} \beta_{ik}}{\sum_{i} \beta_{ij}^{2}}$$

$$= HHI + HHI^{adj}$$

 Other measures including entry, share of sales by top #10 firms, etc. also significant

### Posteriors for Common Industry Parameters

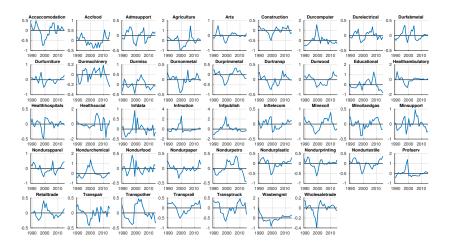


### Q Data

- Flow of funds
- Ratio of market value to the replacement cost of capital including intangibles



Q

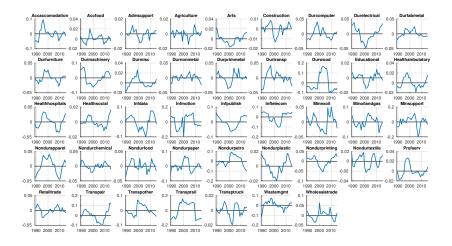


#### Concentration Ratio Data

- Compustat for BEA segments
- Patterns verified against aggregated firm-level census data
- Corrected for the import share, as in Feenstra and Weinstein '17
- Series from Compustat/BEA have a 65-70% correlation in levels and 40-50% in 5-year changes



#### Concentration Ratios

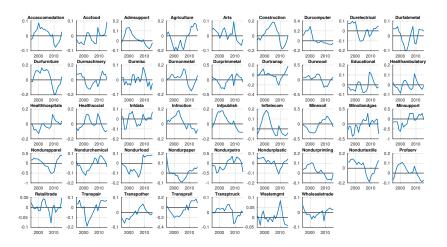


### Nominal Output Data

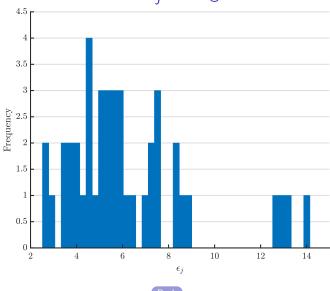
BEA



### Nominal Output

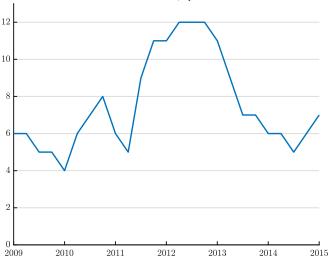




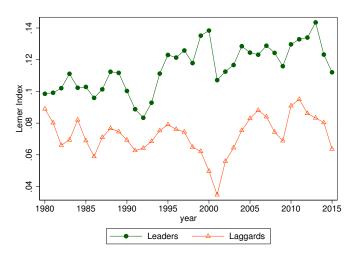


### ZLB Durations in Quarters

ZLB Durations, Quarters

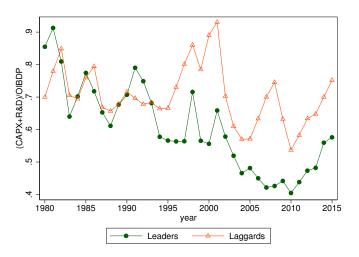


### Margins Increased for Industry Leaders



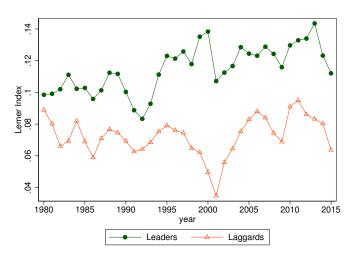
Note: Leaders includes all firms with the highest (lowest) market value (MV) that combined account for  $\sim$ 33% of MV within each industry and year.

### Leaders Explain Investment Gap #1



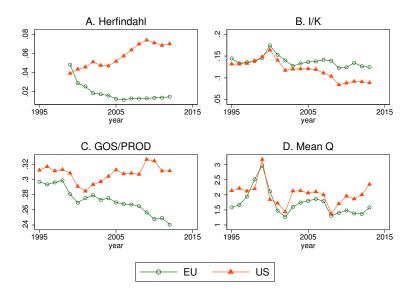
Note: Leaders (laggards) include all firms with the highest (lowest) market value (MV) that combined account for  $^{\sim}33\%$  of MV within each industry and year.

### Margins Increased for Industry Leaders

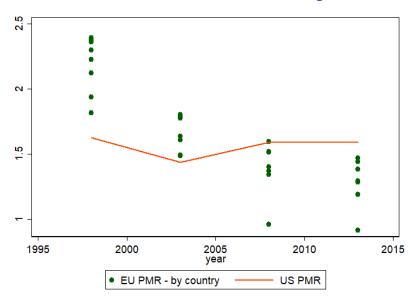


Note: Leaders includes all firms with the highest (lowest) market value (MV) that combined account for ~33% of MV within each industry and year.

### EU vs US



### EU vs US: OECD Product Market Regulations



## A Calvo-Style Entry Specification

• Staggered entry. Pay  $\kappa$  today, each period there is a chance  $\lambda$  of entry each period

### Other Parameters

$$\begin{array}{c|c} \delta & 0.025 \\ \phi^k & 20 \\ \beta & 0.99 \\ \alpha & 1/3 \\ \delta^n & 0.09/4 \end{array}$$

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