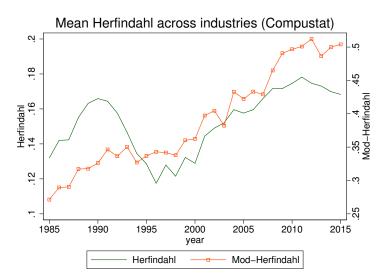
Declining Competition and Investment in the U.S.

German Gutierrez and Thomas Philippon

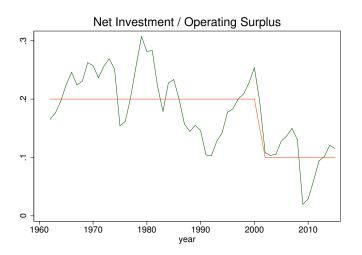
NYU, NBER, CEPR

May 2017, ESSIM

Stylized Fact #1: Increased Concentration

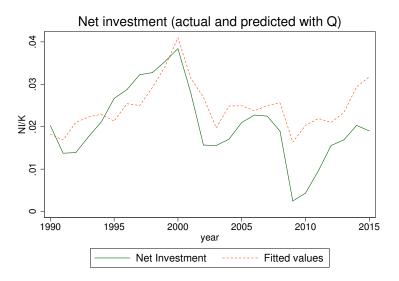


Stylized Fact #2: Profits Are High But Investment Is Low



Notes: Annual data for Non financial Business sector (Corporate and Non corporate).

Fact #2: I/K is low while Q is High

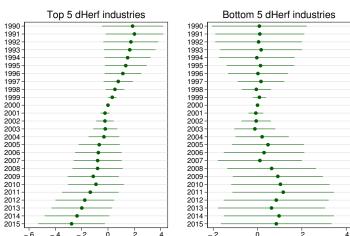


Theory

- Theories that predict low I/K because they predict low Q
 - E.g.: spreads & risk premia, low expected TFP growth, low expected demand, etc.
 - Solve the wrong puzzle: Q is high, but I/κ is low.
- Theories that predict a gap between Q and I/κ
 - monopoly rents
 - governance issues
 - intangible investment?

Motivation: Investment gap largest for concentrating industries

Capital Gap vs. Q



Identification Issue: Model

- Monopolistic competition, firm i in industry j
 - Fixed entry cost $\kappa_{j,t-1}^e$
 - Production

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

Industry demand

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

Aggregator

$$Y_{j,t}^{\mathcal{S}} \equiv \left(\int_{0}^{N_{j,t-1}} y_{i,t}^{\frac{\varepsilon_{j}-1}{\varepsilon_{j}}} di\right)^{\frac{\varepsilon_{j}}{\varepsilon_{j}-1}}$$

Industry Equilibrium

• Entry in industry j = 1..J

$$\begin{split} \frac{\varepsilon_{j} - \sigma}{\varepsilon_{j} - 1} \log N_{t-1} = & \log \left(\mu_{j} - 1\right) \mu_{j}^{-\sigma} + \log \mathbb{E}_{t-1} \left[\chi_{j,t}^{1-\sigma} D_{j,t} \right] \\ & - \log \left(1 + r_{t-1}\right) \kappa_{j,t-1}^{e} \end{split}$$

Investment

$$\log K_{j,t} = \log \alpha \frac{\chi_{j,t}^{1-\sigma}}{\rho_t} + \log D_{j,t} - \sigma \log \mu_j + \frac{\sigma - 1}{\varepsilon_j - 1} \log N_{j,t-1}$$

Competitive Limit with Anticipated Demand Shocks

• Entry in industry j = 1..J

$$\log N_{j,t-1}^c = \log \frac{\psi \chi_t^{1-\sigma}}{1+r_{t-1}} + \log \mathbb{E}_{t-1} \left[\frac{D_{j,t}}{D_{j,t}} \right]$$

Investment

$$\log K_{j,t} = \log \alpha \frac{\chi_{j,t}^{1-\sigma}}{\rho_t} + \log \frac{D_{j,t}}{\rho_t} + \log N_{j,t-1}$$

- Prop 1
 - Cross-industry OLS regression of log-investment on log-Herfindahl gives a slope of minus one.

Industry Equilibrium & Identification

• Entry in industry j = 1..J

$$\begin{split} \frac{\varepsilon_{j} - \sigma}{\varepsilon_{j} - 1} \log N_{t-1} = & \log \left(\mu_{j} - 1\right) \mu_{j}^{-\sigma} + \log \mathbb{E}_{t-1} \left[\chi_{j,t}^{1-\sigma} D_{j,t} \right] \\ & - \log \left(1 + r_{t-1}\right) \kappa_{j,t-1}^{e} \end{split}$$

Investment

$$\log K_{j,t} = \log \alpha \frac{\chi_{j,t}^{1-\sigma}}{\rho_t} + \log D_{j,t} - \sigma \log \mu_j + \frac{\sigma - 1}{\varepsilon_j - 1} \log N_{j,t-1}$$

• **Prop 2**: Variation in entry costs κ_j^e that are uncorrelated with future demand $D_{j,t}$ and productivity $A_{j,t}$ would be valid instruments for concentration.

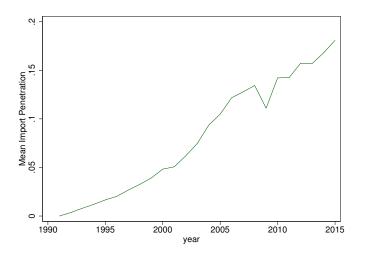
Our Strategy

- Natural experiment
 - Chinese import competition
- Instrument for Herfindahl
 - Excess entry in the 1990s
- Explaining the broad increase in concentration in the 2000's
 - Regulations, etc.

Chinese Competition

- Good
 - Orthogonal to industry demand & supply shocks
- Bad
 - Ambiguous effect on domestic industry investment
 - Test firm-level predictions
- Write model of vertical differentiation with heterogenous firms
 - Leader has higher quality / lower cost
- Prop 3:
 - The more efficient the leader, the more it reacts to competition by increasing investment.
 - Domestic industry investment ambiguous because laggards exit or downsize.

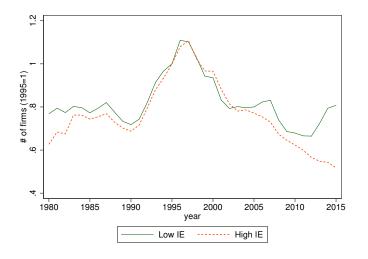
Average China Import Competition



Note: Annual data. Import penetration defined as $\Delta IP_{jt} = \frac{\Delta M_{jt}}{Y_{j,\mathbf{91}} + M_{j,\mathbf{91}} - E_{j,\mathbf{91}}}$



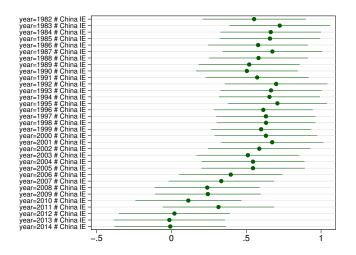
Number of US Firms, by Exposure to China



Notes: Annual data. US incorporated firms in manufacturing industries only. Industries assigned to exposure based on median 91-11 exposure. (1995 = 1)

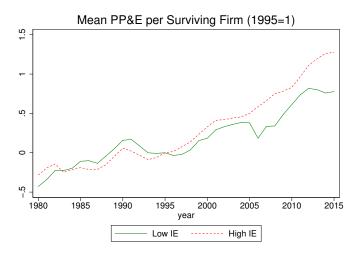


Impact of Exposure to China on N firms



Notes: Plot shows β_t from $log(N_{i,t}) = \mu_i + \eta_t + \beta_t \Delta I P_{i,99-11} \times 1 \{ year \} + \varepsilon_{i,t}$.

PP&E of Surviving Firms



Notes: Annual data. US incorporated firms in manufacturing industries only. Industries assigned to exposure based on median 91-11 exposure. Similar patterns for Assets, Intangibles, etc.

China IV regressions: NTR Gap

| | (1) | (2) | (3) | (4) | (5) | (6) |
|--|--------------|--------------|----------------|--------------|--------------|----------------|
| | $\log(AT_t)$ | $log(PPE_t)$ | $log(Intan_t)$ | $\log(AT_t)$ | $log(PPE_t)$ | $log(Intan_t)$ |
| | ≥1980 | ≥1980 | ≥1980 | ≥1980 | ≥1980´ | ≥1980 ´ |
| | | | | | | |
| Post $01 	imes NTR$ Gap | -0.693** | -0.911** | -0.552 | -1.265** | -1.519** | -1.167+ |
| · | [-3.38] | [-2.99] | [-0.90] | [-5.77] | [-4.83] | [-1.81] |
| $Post01 \times NTR Gap \times Lead_{99}$ | 3 | | | 1.164** | 1.239** | 1.321** |
| | | | | [7.65] | [7.46] | [4.47] |
| $\log(Age_{t-1})$ | 0.240** | 0.340** | 0.01 | 0.240** | 0.340** | 0.019 |
| | [8.01] | [9.79] | [0.13] | [8.17] | [10.26] | [0.25] |
| | | | | - | - | |
| Observations | 49971 | 49831 | 29698 | 49971 | 49831 | 29698 |
| Within R ² | 0.457 | 0.223 | 0.352 | 0.468 | 0.234 | 0.356 |
| Overall R^2 | 0.093 | 0.078 | 0.096 | 0.113 | 0.103 | 0.108 |
| Industry controls† | YES | YES | YES | YES | YES | YES |
| Year FE | YES | YES | YES | YES | YES | YES |
| Firm FE | YES | YES | YES | YES | YES | YES |

Notes: T-stats in brackets. + p < 0.10, * p < 0.05, ** p < 0.05. Standard errors clustered at industry-level. § Leaders defined as firms with above-median Q as of 1999 within each NAICS Level 4 industry

[†] Industry controls include measures of industry-level production structure (e.g., K/Emp) as of 1991

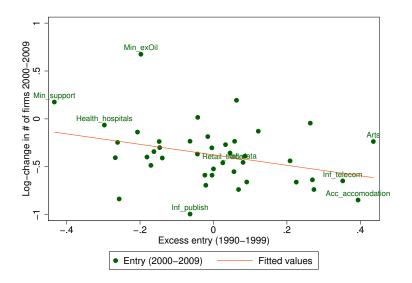




Competition & Investment: Beyond Manufacturing

- Chinese import competition
 - clean identification
 - but experiment is an increase in competition in one sector
- Excess entry in 1990s
 - we can show it varies a lot across sectors, and it is orthogonal to future demand
 - VCs, entry costs, etc.

IV: Entry post-2000 vs. Excess entry in 1990s



Entry (sometimes) predicts sales but Excess Entry does not

| | (1) | (2) | (3) | (4) | |
|--------------------------------|----------------------------|---------|-----------------------------|---------|--|
| | $\Delta log(Sale)_{99-04}$ | | $\Delta log(V.Add)_{99-04}$ | | |
| $\Delta log(\# firms)_{94-99}$ | 0.102 [0.85] | | 0.321* [2.64] | | |
| Excess $Entry_{90-99}(i)$ | | -0.08 | | -0.06 | |
| | | [-0.40] | | [-0.28] | |
| | | | | | |
| Observations | 43 | 42 | 43 | 42 | |
| R^2 | 0.017 | 0.004 | 0.145 | 0.002 | |

Notes: T-stats in brackets. + p<0.10, * p<0.05, ** p<.01

IV: Panel Regression Results

| | (1) | (2) | (3) | (4) |
|--|---------------|----------|---------------|----------|
| | 1st St. | 2nd St. | 1st St. | 2nd St. |
| | $HHI_{j,t-1}$ | Net I/K | $HHI_{j,t-1}$ | Net I/K |
| | \geq 2000 | ≥2000 | ≥2000 | ≥2000 |
| Mean Stock Q (t-1) | 0.01 | 0.036** | 0.03** | 0.043** |
| , , | [1.34] | [7.42] | [3.53] | [6.89] |
| Excess Inv _{90–99} | -1.51** | | ' ' | |
| 30 33 | [-2.82] | [-3.48] | | |
| Excess Entry _{90-99} (i) | -0.11** | 1 | | |
| 390 99() | [-3.04] | | | |
| Excess Entry _{90–99} (i) × Med HHI _t | [] | | 2.66** | |
| =xeese = x x y 90 = 99 (1) x x x ea 1 x x x 2 | | | [3.22] | |
| $HHI_{i,t-1}$ | | -0.504** | [5.22] | -0.602** |
| / // //,t=1 | | [-5.81] | | [-5.17] |
| A | | | | |
| Age controls | | es | | es |
| Year FE | No | | Yes | |
| Industry FE | No | | Yes | |
| Observations | 672 | 672 | 672 | 672 |
| R^2 | | 0.052 | | 0.036 |
| | | ode and | | |

Notes: T-stats in brackets. + p<0.10, * p<0.05, ** p<0.01.

Competition and Investment: Summary

- Most domestic industries have become MORE concentrated
 - Lower competition/entry means less investment by leaders and less investment at the industry level
- Some manufacturing industries have seen increased competition from China
 - Domestic leaders have increased investment, R&D, and employment
 - But overall effect on domestic investment somewhat negative

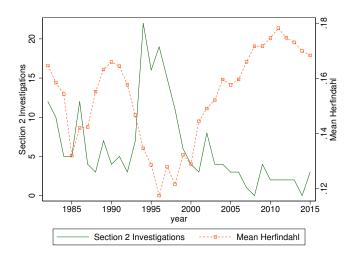
What explains the broad increase in concentration?

- 1. **Enforcement and regulation**: declined antitrust enforcement + increased regulation
- 2. Superstar firms: 'winner-takes-most'; incumbent innovation

Other explanations

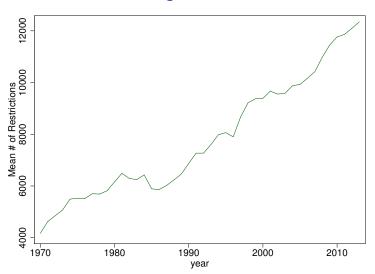
- 1. Omission of private firms in Compustat
- 2. Foreign competition (other than China)
- 3. Intangible
- 4. Population aging and decreased start-up rates
- -> 1-2 discussed (and discarded) in Grullon-Larkin-Michaely (2016); 3-4 discussed in Gutierrez and Philippon (2016b)

Antitrust enforcement



Note: Figure plots the average HHI across BEA industries along with the number of investigations filed by the Department of Justice under Section 2 of the Sherman Act of 1890. See Grullon-Larkin-Michaely (2016).

Regulation



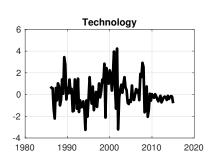
Note: Annual data. Mean number of relevant restrictions across BEA industries in our sample. Based on Mercatus Regulation index.

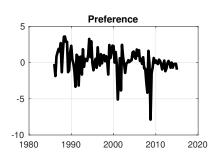
Regulation & Concentration Across Industries

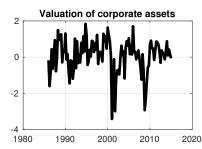
| | (1) | (2) |
|-------------------------|--------------------|---------------|
| | CR4 _{i,t} | $HHI_{i,t-1}$ |
| | \geq 1980 | \geq 1980 |
| Log(Reg index)MA2_(t-3) | 0.047* | 0.022* |
| | [2.53] | [2.29] |
| Mean Stock Q (t-1) | 0.031 | 0.026 + |
| | [1.58] | [1.93] |
| Mean log(age) (t-1) | 0.070* | 0.055* |
| | [2.22] | [2.30] |
| Year FE | Yes | Yes |
| Industry FE | Yes | Yes |
| Observations | 1004 | 1004 |
| Within R^2 | 0.181 | 0.113 |

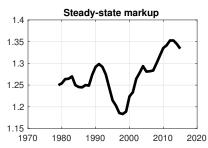
Notes: T-stats in brackets. + p<0.10, * p<0.05, ** p<.01. Omits Non-durable textile industry

Macro-Economic Implications (with C. Jones)

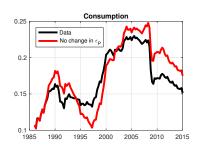


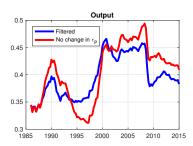


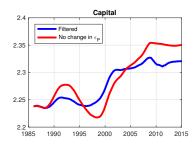




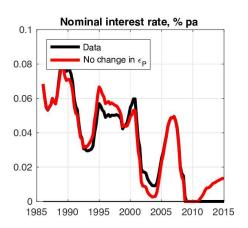
Counter-Factual







Counter-Factual



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