

Granular Origins of Agglomeration

Shinnosuke Kikuchi Daniel G. O'Connor

UCSD

Princeton

November 13, 2025

Motivation

- Individual firms play a key role in local labor markets
 - Kodak in Rochester, Toyota in Toyota, Microsoft for engineers in Seattle

Motivation

- Individual firms play a key role in local labor markets
 - Kodak in Rochester, Toyota in Toyota, Microsoft for engineers in Seattle
 - Japanese local labor market (3-digit mfg \times CZ): median of 4 plants

Motivation

- Individual firms play a key role in local labor markets
 - Kodak in Rochester, Toyota in Toyota, Microsoft for engineers in Seattle
 - Japanese local labor market (3-digit mfg \times CZ): median of 4 plants
- Firm-specific shocks can have a big impact on the whole labor market
 - People can end up unemployed because a single firm had a bad year
 - Firms can have a tough time finding workers to expand

Motivation

- Individual firms play a key role in local labor markets
 - Kodak in Rochester, Toyota in Toyota, Microsoft for engineers in Seattle
 - Japanese local labor market (3-digit mfg \times CZ): median of 4 plants
- Firm-specific shocks can have a big impact on the whole labor market
 - People can end up unemployed because a single firm had a bad year
 - Firms can have a tough time finding workers to expand

Research Questions:

- How does granularity affect the geography of economic activity?
- What does granularity imply for optimal policy?

Core Mechanism: Labor Market Pooling

Imagine Profs. with two states of productivity: $a_H \gg 0$ or $a_L \sim 0$

Core Mechanism: Labor Market Pooling

Imagine Profs. with two states of productivity: $a_H \gg 0$ or $a_L \sim 0$

RA market with one Prof:

- RA always works for that Prof.

Core Mechanism: Labor Market Pooling

Imagine Profs. with two states of productivity: $a_H \gg 0$ or $a_L \sim 0$

RA market with one Prof:

- RA always works for that Prof.
- ... Even when that Prof. is unproductive (a_L)

Core Mechanism: Labor Market Pooling

Imagine Profs. with two states of productivity: $a_H \gg 0$ or $a_L \sim 0$

RA market with one Prof:

- RA always works for that Prof.
- ... Even when that Prof. is unproductive (a_L)

RA market with two Profs:

- RA can move to the most productive Prof.

Core Mechanism: Labor Market Pooling

Imagine Profs. with two states of productivity: $a_H \gg 0$ or $a_L \sim 0$

RA market with one Prof:

- RA always works for that Prof.
- ... Even when that Prof. is unproductive (a_L)

RA market with two Profs:

- RA can move to the most productive Prof.
- RAs are more productive on average: $\max\{a\}$

Core Mechanism: Labor Market Pooling

Imagine Profs. with two states of productivity: $a_H \gg 0$ or $a_L \sim 0$

RA market with one Prof:

- RA always works for that Prof.
- ... Even when that Prof. is unproductive (a_L)

RA market with two Profs:

- RA can move to the most productive Prof.
- RAs are more productive on average: $\max\{a\}$

Therefore, there are **agglomeration** benefits!

What We do

1. Propose a model where individual firms matter and are subject to shocks

What We do

1. Propose a model where individual firms matter and are subject to shocks
 - Average wages are increasing in city population
 - Agglomeration strength can be summarized by a covariance statistic
 - Optimal to subsidize firm entry - especially in small markets

What We do

1. Propose a model where individual firms matter and are subject to shocks
 - Average wages are increasing in city population
 - Agglomeration strength can be summarized by a covariance statistic
 - Optimal to subsidize firm entry - especially in small markets
2. Enrich and estimate the model using Japanese administrative data

What We do

1. Propose a model where individual firms matter and are subject to shocks
 - Average wages are increasing in city population
 - Agglomeration strength can be summarized by a covariance statistic
 - Optimal to subsidize firm entry - especially in small markets
2. Enrich and estimate the model using Japanese administrative data
3. Validate the model's reduced form predictions

What We do

1. Propose a model where individual firms matter and are subject to shocks
 - Average wages are increasing in city population
 - Agglomeration strength can be summarized by a covariance statistic
 - Optimal to subsidize firm entry - especially in small markets
2. Enrich and estimate the model using Japanese administrative data
3. Validate the model's reduced form predictions
 - Firms are subject to idiosyncratic shocks
 - Firms in larger markets expand more in response to shocks

What We do

1. Propose a model where individual firms matter and are subject to shocks
 - Average wages are increasing in city population
 - Agglomeration strength can be summarized by a covariance statistic
 - Optimal to subsidize firm entry - especially in small markets
2. Enrich and estimate the model using Japanese administrative data
3. Validate the model's reduced form predictions
 - Firms are subject to idiosyncratic shocks
 - Firms in larger markets expand more in response to shocks
4. Demonstrate quantitative importance of the mechanism

What We do

1. Propose a model where individual firms matter and are subject to shocks
 - Average wages are increasing in city population
 - Agglomeration strength can be summarized by a covariance statistic
 - Optimal to subsidize firm entry - especially in small markets
2. Enrich and estimate the model using Japanese administrative data
3. Validate the model's reduced form predictions
 - Firms are subject to idiosyncratic shocks
 - Firms in larger markets expand more in response to shocks
4. Demonstrate quantitative importance of the mechanism
 - An implied wage elasticity of 0.005 in the smallest CZs (total: 0.02-0.05)
 - Optimal subsidies would increase population by $\sim 1\%$ in small cities

Related Literature

- **Agglomeration:** Marshall (1890), Miyauchi (2018), Davis and Dingel (2019), Duranton and Puga (2004) Andersson et al. (2014), Kline and Moretti (2014), Greenstone et al. (2010), Ellison and Glaeser (1997), Rosenthal and Strange (2004)

This paper: Model and quantify a particular microfoundation

- **Labor Market Pooling:** Krugman (1992), Overman and Puga (2010), Nakajima and Okazaki (2012), de Almeida and de Moraes Rocha (2018), Moretti and Yi (2024), Conte et al. (2024)

This paper: New model with new theoretical insights, evidence, and quantification

- **Granularity:** Gabaix (2011), Bernard et al. (2018), Gaubert and Itskhoki (2021), Gaubert et al. (2021)

This paper: Implications for economic geography and place-based policy

Table of Contents

How Does Granularity Lead to Agglomeration?

Model Description

Theoretical Results

A Quantitative, Granular Model of Economic Geography

Estimation of Granular Driven Agglomeration

Validation of the Mechanism

Quantification of Granular Driven Agglomeration

How Does Granularity Lead to Agglomeration?

Today's Plan

How Does Granularity Lead to Agglomeration?

Model Description

Theoretical Results

A Quantitative, Granular Model of Economic Geography

Estimation of Granular Driven Agglomeration

Validation of the Mechanism

Quantification of Granular Driven Agglomeration

Model Summary

- **Goal:** Provide a tractable, quantitative model where:

Model Summary

- **Goal:** Provide a tractable, quantitative model where:
 1. Individual firms subject to idiosyncratic shocks matter in labor markets

Model Summary

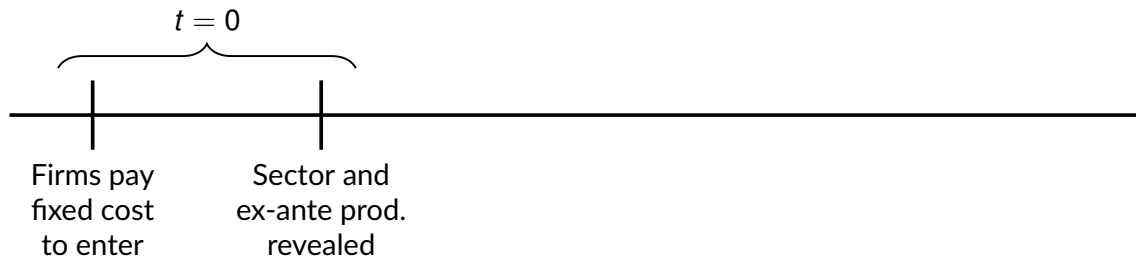
- **Goal:** Provide a tractable, quantitative model where:
 1. Individual firms subject to idiosyncratic shocks matter in labor markets
 2. Free entry is not an inequality constraint

Model Summary

- **Goal:** Provide a tractable, quantitative model where:
 1. Individual firms subject to idiosyncratic shocks matter in labor markets
 2. Free entry is not an inequality constraint
- $i \in \mathcal{I}$ locations, $s \in [0, 1]$ sectors, $n \in \mathcal{N}$ firms

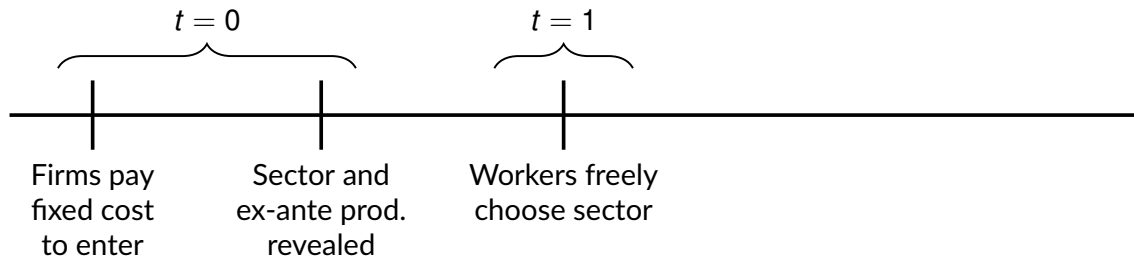
Model Summary

- **Goal:** Provide a tractable, quantitative model where:
 1. Individual firms subject to idiosyncratic shocks matter in labor markets
 2. Free entry is not an inequality constraint
- $i \in \mathcal{I}$ locations, $s \in [0, 1]$ sectors, $n \in \mathcal{N}$ firms



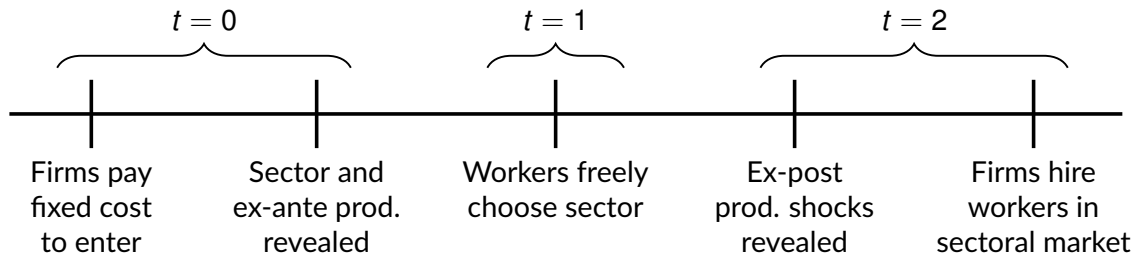
Model Summary

- **Goal:** Provide a tractable, quantitative model where:
 1. Individual firms subject to idiosyncratic shocks matter in labor markets
 2. Free entry is not an inequality constraint
- $i \in \mathcal{I}$ locations, $s \in [0, 1]$ sectors, $n \in \mathcal{N}$ firms



Model Summary

- **Goal:** Provide a tractable, quantitative model where:
 1. Individual firms subject to idiosyncratic shocks matter in labor markets
 2. Free entry is not an inequality constraint
- $i \in \mathcal{I}$ locations, $s \in [0, 1]$ sectors, $n \in \mathcal{N}$ firms



Workers

- There are ℓ_i workers in location i
- Choose sectoral labor allocation L_{is} to maximize expected utility, taking wages as given:

$$\mathbf{L}_i \in \operatorname{argmax}_{\mathbf{L}'_i \in \mathcal{L}} \mathbb{E} \left[\int_0^1 w_{is}(\omega) L'_{is} ds \right]$$

where

$$\mathcal{L} \equiv \left\{ \mathbf{L}'_i \mid \int_0^1 L'_{is} ds \leq 1 \right\}.$$

Denote the solution by w_i , the average wages in location i .

Firms

- At $t = 2$, choose labor to maximize profits, taking wages as given

$$\ell_{isn}(\omega) \in \operatorname{argmax}_{\ell'} \quad Z_{isn} \cdot a_{isn}(\omega) \cdot (\ell')^{1-\eta} - w_{is}(\omega)\ell'$$

Firms

- At $t = 2$, choose labor to maximize profits, taking wages as given

$$\ell_{isn}(\omega) \in \operatorname{argmax}_{\ell'} \quad z_{isn} \cdot a_{isn}(\omega) \cdot (\ell')^{1-\eta} - w_{is}(\omega)\ell'$$

where

$$z_{isn} \sim \mathcal{P}(z_i, \lambda),$$

Firms

- At $t = 2$, choose labor to maximize profits, taking wages as given

$$\ell_{isn}(\omega) \in \operatorname{argmax}_{\ell'} \quad \textcolor{blue}{Z}_{isn} \cdot \textcolor{brown}{a}_{isn}(\omega) \cdot (\ell')^{1-\eta} - w_{is}(\omega)\ell'$$

where

$$\textcolor{blue}{Z}_{isn} \sim \mathcal{P}(z_i, \lambda), \quad \log \textcolor{brown}{a}_{isn}(\omega) = \log \tilde{a}_{is}(\omega) + \log \tilde{a}_{isn}(\omega) \sim \mathcal{N}(0, \sigma_S^2) + \mathcal{N}(0, \sigma_N^2)$$

Firms

- At $t = 2$, choose labor to maximize profits, taking wages as given

$$\ell_{isn}(\omega) \in \operatorname{argmax}_{\ell'} \quad z_{isn} \cdot a_{isn}(\omega) \cdot (\ell')^{1-\eta} - w_{is}(\omega)\ell'$$

where

$$z_{isn} \sim \mathcal{P}(z_i, \lambda), \quad \log a_{isn}(\omega) = \log \tilde{a}_{is}(\omega) + \log \tilde{a}_{isn}(\omega) \sim \mathcal{N}(0, \sigma_S^2) + \mathcal{N}(0, \sigma_N^2)$$

- Continuum of firm entrants m_i pay a fixed cost of $\psi_i > 0$
- Randomly assigned a sector s so each sector has a finite number of firms N_{is} distributed Poisson

Firms

- At $t = 2$, choose labor to maximize profits, taking wages as given

$$\ell_{isn}(\omega) \in \operatorname{argmax}_{\ell'} \quad \textcolor{blue}{z}_{isn} \cdot \textcolor{brown}{a}_{isn}(\omega) \cdot (\ell')^{1-\eta} - w_{is}(\omega)\ell'$$

where

$$\textcolor{blue}{z}_{isn} \sim \mathcal{P}(z_i, \lambda), \quad \log \textcolor{brown}{a}_{isn}(\omega) = \log \tilde{a}_{is}(\omega) + \log \tilde{a}_{isn}(\omega) \sim \mathcal{N}(0, \sigma_S^2) + \mathcal{N}(0, \sigma_N^2)$$

- Continuum of firm entrants m_i pay a fixed cost of $\psi_i > 0$
- Randomly assigned a sector s so each sector has a finite number of firms N_{is} distributed Poisson
- Free entry implies expected profits equal fixed cost

$$\psi_i = \frac{\mathbb{E}[\int_{\mathcal{S}} \sum_n \pi_{isn}(\omega) ds]}{m_i}.$$

Equilibrium

A **local equilibrium** consists of wages $w_{is}(\omega)$, labor supply decisions L_{is} , entry decisions m_i , and labor demand decisions $\ell_{isn}(\omega)$ such that

- Workers maximize utility taking wages as given;
- Conditional on entry, firms maximize profits, taking prices and wages as given;
- Firms enter up to the point that expected profits are equal to the fixed cost of entering; and
- Goods and labor markets clear.

Today's Plan

How Does Granularity Lead to Agglomeration?

Model Description

Theoretical Results

A Quantitative, Granular Model of Economic Geography

Estimation of Granular Driven Agglomeration

Validation of the Mechanism

Quantification of Granular Driven Agglomeration

The Regional Production Function

We define a regional production function

$$Y_i(\ell, m) \equiv \max_{L'_s, \ell'_{sn}(\omega)} \int_0^1 \sum_{n \in \mathcal{N}_{is}} z_{isn} \cdot a_{isn}(\omega) \cdot \ell'_{sn}(\omega)^{1-\eta} ds,$$

such that labor markets clear.

The Regional Production Function

We define a regional production function

$$Y_i(\ell, m) \equiv \max_{L'_s, \ell'_{sn}(\omega)} \int_0^1 \sum_{n \in \mathcal{N}_{is}} z_{isn} \cdot a_{isn}(\omega) \cdot \ell'_{sn}(\omega)^{1-\eta} ds,$$

such that labor markets clear.

We will proceed in 3 steps:

1. If there are *labor market pooling effects*, then Y_i has IRS

The Regional Production Function

We define a regional production function

$$Y_i(\ell, m) \equiv \max_{L'_s, \ell'_{sn}(\omega)} \int_0^1 \sum_{n \in \mathcal{N}_{is}} z_{isn} \cdot a_{isn}(\omega) \cdot \ell'_{sn}(\omega)^{1-\eta} ds,$$

such that labor markets clear.

We will proceed in 3 steps:

1. If there are *labor market pooling effects*, then Y_i has IRS
2. If Y_i has IRS, then average wages are increasing in population

The Regional Production Function

We define a regional production function

$$Y_i(\ell, m) \equiv \max_{L'_s, \ell'_{sn}(\omega)} \int_0^1 \sum_{n \in \mathcal{N}_{is}} z_{isn} \cdot a_{isn}(\omega) \cdot \ell'_{sn}(\omega)^{1-\eta} ds,$$

such that labor markets clear.

We will proceed in 3 steps:

1. If there are *labor market pooling effects*, then Y_i has IRS
2. If Y_i has IRS, then average wages are increasing in population
3. If firms are granular, then there are *labor market pooling effects*

Labor Market Pooling

► Relation to Misallocation

Lemma

To second order,

$$Y_i(\ell, m) = \bar{z}_i \cdot \ell^{1-\eta} m^\eta \cdot \Phi(m),$$

Labor Market Pooling

► Relation to Misallocation

Lemma

To second order,

$$Y_i(\ell, m) = \bar{z}_i \cdot \ell^{1-\eta} m^\eta \cdot \Phi(m),$$

where

$$\Phi(m) = \mathbb{E}[a_{isn}(\omega)] + \frac{1-\eta}{2} \int_{\mathcal{S}} \frac{\bar{\ell}_{is}}{\ell_i} \sum_{n \in \mathcal{N}_{is}} \frac{\bar{\ell}_{isn}}{\bar{\ell}_{is}} \underbrace{\text{Cov}(\log a_{isn}(\omega), \log \ell_{isn}(\omega))}_{\text{Firm-level, across states of the world}} ds.$$

- Covariance summarizes how productively labor is used:

Labor Market Pooling

► Relation to Misallocation

Lemma

To second order,

$$Y_i(\ell, m) = \bar{z}_i \cdot \ell^{1-\eta} m^\eta \cdot \Phi(m),$$

where

$$\Phi(m) = \mathbb{E}[a_{isn}(\omega)] + \frac{1-\eta}{2} \int_{\mathcal{S}} \frac{\bar{\ell}_{is}}{\ell_i} \sum_{n \in \mathcal{N}_{is}} \frac{\bar{\ell}_{isn}}{\bar{\ell}_{is}} \underbrace{\text{Cov}(\log a_{isn}(\omega), \log \ell_{isn}(\omega))}_{\text{Firm-level, across states of the world}} ds.$$

- Covariance summarizes how productively labor is used:
 - If firms hire more labor when they are productive, average productivity is higher

Labor Market Pooling

► Relation to Misallocation

Lemma

To second order,

$$Y_i(\ell, m) = \bar{z}_i \cdot \ell^{1-\eta} m^\eta \cdot \Phi(m),$$

where

$$\Phi(m) = \mathbb{E}[a_{isn}(\omega)] + \frac{1-\eta}{2} \int_{\mathcal{S}} \frac{\bar{\ell}_{is}}{\ell_i} \sum_{n \in \mathcal{N}_{is}} \frac{\bar{\ell}_{isn}}{\bar{\ell}_{is}} \underbrace{\text{Cov}(\log a_{isn}(\omega), \log \ell_{isn}(\omega))}_{\text{Firm-level, across states of the world}} ds.$$

- Covariance summarizes how productively labor is used:
 - If firms hire more labor when they are productive, average productivity is higher

Definition

There are **labor market pooling effects** if the covariance is increasing in m .

Equilibrium and Agglomeration Benefits

- Workers are paid their marginal product,

$$w_i = \frac{\partial Y_i}{\partial \ell} = \frac{(1 - \eta) Y_i}{\ell_i}$$

Equilibrium and Agglomeration Benefits

- Workers are paid their marginal product,

$$w_i = \frac{\partial Y_i}{\partial \ell} = \frac{(1 - \eta) Y_i}{\ell_i}$$

- And firms get the rest,

$$\psi_i = \frac{\eta Y_i}{m_i}$$

Equilibrium and Agglomeration Benefits

- Workers are paid their marginal product,

$$w_i = \frac{\partial Y_i}{\partial \ell} = \frac{(1 - \eta) Y_i}{\ell_i}$$

- And firms get the rest,

$$\psi_i = \frac{\eta Y_i}{m_i}$$

Proposition

In any stable equilibrium, the average wages are increasing in population if and only if there are labor market pooling effects.

The Granular Origins of Agglomeration

Proposition

If firms are subject to idiosyncratic shocks, then average wages are increasing in population, i.e.

$$\frac{d \log w_i}{d \log \ell_i} > 0.$$

The Granular Origins of Agglomeration

Proposition

If firms are subject to idiosyncratic shocks, then average wages are increasing in population, i.e.

$$\frac{d \log w_i}{d \log \ell_i} > 0.$$

Intuition:

- In small markets, a firm likely hires a large portion of the local sectoral market

The Granular Origins of Agglomeration

Proposition

If firms are subject to idiosyncratic shocks, then average wages are increasing in population, i.e.

$$\frac{d \log w_i}{d \log \ell_i} > 0.$$

Intuition:

- In small markets, a firm likely hires a large portion of the local sectoral market
- In large markets, a firm can poach workers from firms in the same sector

The Granular Origins of Agglomeration

Proposition

If firms are subject to idiosyncratic shocks, then average wages are increasing in population, i.e.

$$\frac{d \log w_i}{d \log \ell_i} > 0.$$

Intuition:

- In small markets, a firm likely hires a large portion of the local sectoral market
- In large markets, a firm can poach workers from firms in the same sector
- Therefore, labor expands more in response to shocks in large markets

The Granular Origins of Agglomeration

Proposition

If firms are subject to idiosyncratic shocks, then average wages are increasing in population, i.e.

$$\frac{d \log w_i}{d \log \ell_i} > 0.$$

Proof Sketch:

The Granular Origins of Agglomeration

Proposition

If firms are subject to idiosyncratic shocks, then average wages are increasing in population, i.e.

$$\frac{d \log w_i}{d \log \ell_i} > 0.$$

Proof Sketch:

- $\implies \text{Cov}(\log a_{isn}(\omega), \log \ell_{isn}(\omega))$ is increasing in m

The Granular Origins of Agglomeration

Proposition

If firms are subject to idiosyncratic shocks, then average wages are increasing in population, i.e.

$$\frac{d \log w_i}{d \log \ell_i} > 0.$$

Proof Sketch:

- $\implies \text{Cov}(\log a_{isn}(\omega), \log \ell_{isn}(\omega))$ is increasing in m
- $\implies Y_i(\ell, m)$ has IRS

The Granular Origins of Agglomeration

Proposition

If firms are subject to idiosyncratic shocks, then average wages are increasing in population, i.e.

$$\frac{d \log w_i}{d \log \ell_i} > 0.$$

Proof Sketch:

- $\implies \text{Cov}(\log a_{isn}(\omega), \log \ell_{isn}(\omega))$ is increasing in m
- $\implies Y_i(\ell, m)$ has IRS
- \implies Agglomeration benefits

Size of the Mechanism

Proposition

The degree of increasing returns to scale are given by

$$\frac{\partial \log \Phi(m)}{\partial \log m} = -\frac{1}{2} \cdot \frac{1 - \eta}{\eta} \cdot \frac{\frac{\partial}{\partial \log m} \left[\int_{\mathcal{S}} \frac{\bar{\ell}_s}{\ell} H H I_s ds \right]}{\Phi(m)} \cdot \sigma_N^2$$

Size of the Mechanism

Proposition

The degree of increasing returns to scale are given by

$$\frac{\partial \log \Phi(m)}{\partial \log m} = -\frac{1}{2} \cdot \frac{1 - \eta}{\eta} \cdot \frac{\frac{\partial}{\partial \log m} \left[\int_{\mathcal{S}} \frac{\bar{\ell}_s}{\ell} H H I_s ds \right]}{\Phi(m)} \cdot \sigma_N^2$$

where

- σ_N^2 is the variance of the idiosyncratic shocks

Size of the Mechanism

Proposition

The degree of increasing returns to scale are given by

$$\frac{\partial \log \Phi(m)}{\partial \log m} = -\frac{1}{2} \cdot \frac{1-\eta}{\eta} \cdot \frac{\frac{\partial}{\partial \log m} \left[\int_S \frac{\bar{\ell}_s}{\ell} H H I_s ds \right]}{\Phi(m)} \cdot \sigma_N^2$$

where

- σ_N^2 is the variance of the idiosyncratic shocks
- λ is the pareto tail of firm productivity

Size of the Mechanism

Proposition

The degree of increasing returns to scale are given by

$$\frac{\partial \log \Phi(m)}{\partial \log m} = -\frac{1}{2} \cdot \frac{1-\eta}{\eta} \cdot \frac{\frac{\partial}{\partial \log m} \left[\int_S \frac{\bar{\ell}_s}{\ell} H H I_s ds \right]}{\Phi(m)} \cdot \sigma_N^2$$

where

- σ_N^2 is the variance of the idiosyncratic shocks
- λ is the pareto tail of firm productivity

Corollary

Marginal agglomeration benefits converge to 0 as the market grows, i.e. $\frac{d \log w_i}{d \log \ell_i} \rightarrow 0$ as $m_i \rightarrow \infty$.

Optimal Policy

Proposition

The optimal policy features a subsidy on entry proportional to profits τ_i^π given by

$$\tau_i^\pi = \frac{1}{\eta} \frac{\partial \log \Phi(m)}{\partial \log m} > 0.$$

Optimal Policy

Proposition

The optimal policy features a subsidy on entry proportional to profits τ_i^π given by

$$\tau_i^\pi = \frac{1}{\eta} \frac{\partial \log \Phi(m)}{\partial \log m} > 0.$$

As the location becomes infinitely large, the optimal subsidy converges to 0.

Optimal Policy

Proposition

The optimal policy features a subsidy on entry proportional to profits τ_i^π given by

$$\tau_i^\pi = \frac{1}{\eta} \frac{\partial \log \Phi(m)}{\partial \log m} > 0.$$

As the location becomes infinitely large, the optimal subsidy converges to 0.

- Why does the first welfare theorem fail?

Optimal Policy

Proposition

The optimal policy features a subsidy on entry proportional to profits τ_i^π given by

$$\tau_i^\pi = \frac{1}{\eta} \frac{\partial \log \Phi(m)}{\partial \log m} > 0.$$

As the location becomes infinitely large, the optimal subsidy converges to 0.

- Why does the first welfare theorem fail?
 - Entry is not Walrasian
 - Firms ask what their profits would be were they to enter, taking into account their effect on the wage distribution [► Details](#)

Taking Stock

Taking Stock

- Proved two qualitative results about granular economic geography:

Taking Stock

- Proved two qualitative results about granular economic geography:
 1. Average wages increase in the population
 2. The optimal policy is a subsidy on firm entry

Taking Stock

- Proved two qualitative results about granular economic geography:
 1. Average wages increase in the population
 2. The optimal policy is a subsidy on firm entry
- The strength of these forces depend on two key predictions:

Taking Stock

- Proved two qualitative results about granular economic geography:
 1. Average wages increase in the population
 2. The optimal policy is a subsidy on firm entry
- The strength of these forces depend on two key predictions:
 1. Firms are subject to idiosyncratic shocks
 2. Firms in larger markets can expand more in response to those shocks

Taking Stock

- Proved two qualitative results about granular economic geography:
 1. Average wages increase in the population
 2. The optimal policy is a subsidy on firm entry
- The strength of these forces depend on two key predictions:
 1. Firms are subject to idiosyncratic shocks
 2. Firms in larger markets can expand more in response to those shocks
- Turn to quantification with a richer model and test some of the predictions!

A Quantitative, Granular Model of Economic Geography

Extending the Baseline Model

- **Migration Across Regions:** [▶ details](#)
 - At $t = -1$, workers decide where to live
 - Elasticity is θ

Extending the Baseline Model

- **Migration Across Regions:** [▶ details](#)
 - At $t = -1$, workers decide where to live
 - Elasticity is θ
- **Imperfect Mobility Across Firms and Sectors:** [▶ details](#)
 - Labor perfectly elastic in the long run
 - Short run Elasticity across firms is κ
 - Short run Elasticity across sectors is ν

Extending the Baseline Model

- **Migration Across Regions:** [▶ details](#)
 - At $t = -1$, workers decide where to live
 - Elasticity is θ
- **Imperfect Mobility Across Firms and Sectors:** [▶ details](#)
 - Labor perfectly elastic in the long run
 - Short run Elasticity across firms is κ
 - Short run Elasticity across sectors is ν
- **Labor Market Competition:** [▶ details](#)
 - Firms with conduct $f \in \{p, c\}$ commit to a wage schedule in period 0
 - p is Perfect competition, c is Cournot competition

Theoretical Results

Perfect Competition

Imperfect Competition

Theoretical Results

Perfect Competition

- Qualitative results are the same

Imperfect Competition

Theoretical Results

Perfect Competition

- Qualitative results are the same
- Quantitative results shift:

$$\frac{\partial \log \Phi(m)}{\partial \log m} =$$

$$- \frac{1}{2} \frac{(1 - \eta) \left(\frac{1}{\nu} - \frac{1}{\kappa} \right)}{\left(\eta + \frac{1}{\kappa} \right) \left(\eta + \frac{1}{\nu} \right)} \frac{\partial \int_0^1 \frac{\bar{\ell}_{is}}{\ell_i} HHI_{is} ds}{\Phi(m)} \sigma_N^2$$

Imperfect Competition

Theoretical Results

Perfect Competition

- Qualitative results are the same
- Quantitative results shift:

$$\frac{\partial \log \Phi(m)}{\partial \log m} =$$
$$- \frac{1}{2} \frac{(1 - \eta) \left(\frac{1}{\nu} - \frac{1}{\kappa} \right)}{\left(\eta + \frac{1}{\kappa} \right) \left(\eta + \frac{1}{\nu} \right)} \frac{\partial \int_0^1 \frac{\bar{\ell}_{is}}{\ell_i} H H I_{is} ds}{\Phi(m)} \frac{\partial \log m}{\partial \log m} \sigma_N^2$$

Imperfect Competition

- Mechanism strengthened

Theoretical Results

Perfect Competition

- Qualitative results are the same
- Quantitative results shift:

$$\frac{\partial \log \Phi(m)}{\partial \log m} =$$
$$- \frac{1}{2} \frac{(1 - \eta) \left(\frac{1}{\nu} - \frac{1}{\kappa} \right)}{\left(\eta + \frac{1}{\kappa} \right) \left(\eta + \frac{1}{\nu} \right)} \frac{\partial \int_0^1 \frac{\bar{\ell}_{is}}{\ell_i} H H I_{is} ds}{\Phi(m)} \frac{\partial \log m}{\partial \log m} \sigma_N^2$$

Imperfect Competition

- Mechanism strengthened
- Workers face markdown

Theoretical Results

Perfect Competition

- Qualitative results are the same
- Quantitative results shift:

$$\frac{\partial \log \Phi(m)}{\partial \log m} = - \frac{1}{2} \frac{(1 - \eta) \left(\frac{1}{\nu} - \frac{1}{\kappa} \right)}{\left(\eta + \frac{1}{\kappa} \right) \left(\eta + \frac{1}{\nu} \right)} \frac{\partial \int_0^1 \frac{\bar{\ell}_{is}}{\ell_i} HHI_{is} ds}{\Phi(m)} \sigma_N^2$$

Imperfect Competition

- Mechanism strengthened
- Workers face markdown
- Optimal policy requires:
 - Wage subsidy
 - Entry subsidy **OR** tax

Estimation of Granular Driven Agglomeration

Data

- Japanese Census of Manufactures (CoM)
 - Annual survey of all manufacturing establishments with at least 4 employees
 - Employment, payroll, **shipment by product** (2,385 distinct categories)
- Sample Construction: 253,502 unique establishments
 - 2002-2019 + at least 10 employees
 - Manufacturing
- Local Labor Market:
 - JSIC 3-digit manufacturing industry \times commuting zone
 - 148 unique 3-digit manufacturing industries
 - 256 commuting zones

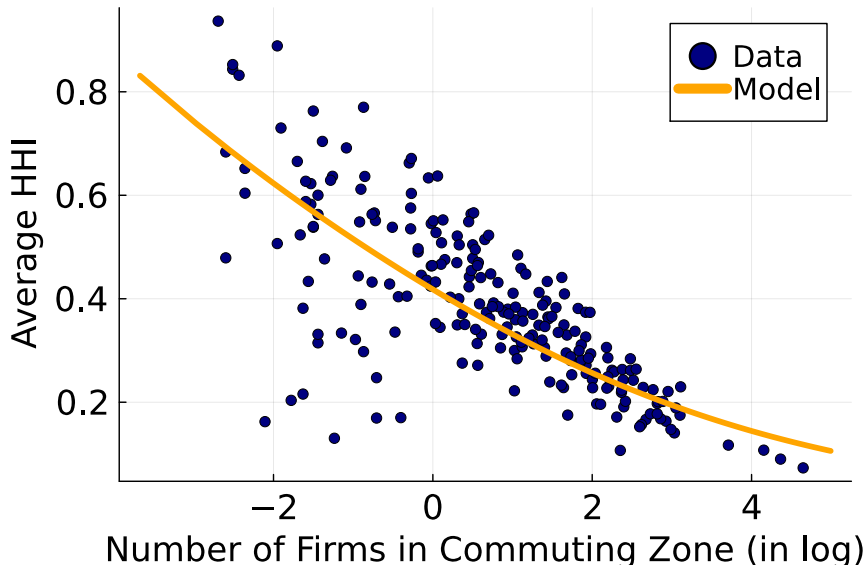
Parameters Estimation Summary

| Description | Parameter | Value | Source |
|---|--------------|-------|--------|
| A. Labor Demand | | | |
| Returns to scale | η | | |
| Ex-ante firm prod. tail | λ | | |
| Variance of sector shocks | σ_S^2 | | |
| Variance of idiosyncratic shocks | σ_N^2 | | |
| B. Labor Supply | | | |
| Short run labor elasticity across firms | κ | | |
| Short run labor elasticity across markets | ν | | |
| C. Economic Geography Parameters | | | |
| Migration elasticity | θ | | |
| Average Productivity | z_i | | |
| Amenity | \bar{u}_i | | |
| Entry costs | ψ_i | | |

Parameters Estimation Summary

| Description | Parameter | Value | Source |
|---|--------------|-------|---------------------------|
| A. Labor Demand | | | |
| Returns to scale | η | 0.13 | Profit Share (Data, FSSC) |
| Ex-ante firm prod. tail | λ | | |
| Variance of sector shocks | σ_S^2 | | |
| Variance of idiosyncratic shocks | σ_N^2 | | |
| B. Labor Supply | | | |
| Short run labor elasticity across firms | κ | | |
| Short run labor elasticity across markets | ν | | |
| C. Economic Geography Parameters | | | |
| Migration elasticity | θ | | |
| Average Productivity | z_i | | |
| Amenity | \bar{u}_i | | |
| Entry costs | ψ_i | | |

Estimating Firm Productivity Pareto Tail



Parameters Estimation Summary

| Description | Parameter | Value | Source |
|---|--------------|-------|---------------------------|
| A. Labor Demand | | | |
| Returns to scale | η | 0.13 | Profit Share (Data, FSSC) |
| Ex-ante firm prod. tail | λ | 10.5 | Average HHI (CoM) |
| Variance of sector shocks | σ_S^2 | | |
| Variance of idiosyncratic shocks | σ_N^2 | | |
| B. Labor Supply | | | |
| Short run labor elasticity across firms | κ | | |
| Short run labor elasticity across markets | ν | | |
| C. Economic Geography Parameters | | | |
| Migration elasticity | θ | | |
| Average Productivity | z_i | | |
| Amenity | \bar{u}_i | | |
| Entry costs | ψ_i | | |

Parameters Estimation Summary

Recall that

$$y_{isn}(\omega) = z_{isn} \cdot a_{isn}(\omega) \cdot \ell_{isn}(\omega)^{1-\eta}$$

Parameters Estimation Summary

Recall that

$$y_{isn}(\omega) = z_{isn} \cdot a_{isn}(\omega) \cdot \ell_{isn}(\omega)^{1-\eta}$$

Estimate productivity changes using first differences

$$\Delta \log \hat{a}_{s,n,t} \equiv \Delta y_{i,s,n,t} - (1 - \hat{\eta}) \Delta \log \ell_{i,s,n,t}$$

Parameters Estimation Summary

Recall that

$$y_{isn}(\omega) = z_{isn} \cdot a_{isn}(\omega) \cdot \ell_{isn}(\omega)^{1-\eta}$$

Estimate productivity changes using first differences

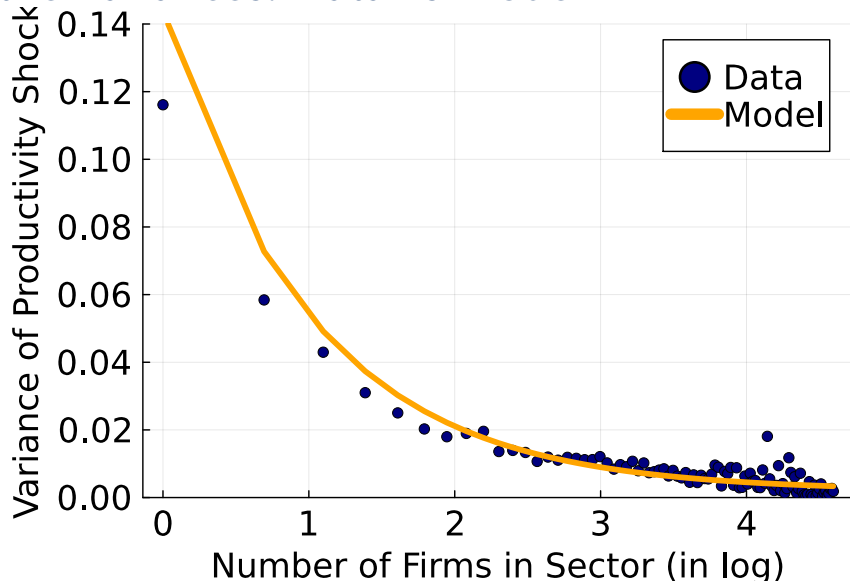
$$\Delta \log \hat{a}_{s,n,t} \equiv \Delta y_{i,s,n,t} - (1 - \hat{\eta}) \Delta \log \ell_{i,s,n,t}$$

Estimate σ_S^2 and σ_N^2 using GMM to match the estimated variance of

$$\frac{\sum_{n \in \mathcal{N}_{is}} \Delta \log \hat{a}_{s,n,t}}{N_{is}}$$

for $N = \{1, \dots, 99\}$.

Fits of the Variances: Data vs Model



Parameters Estimation Summary

| Description | Parameter | Value | Source |
|---|--------------|----------------------|---------------------------|
| A. Labor Demand | | | |
| Returns to scale | η | 0.13 | Profit Share (Data, FSSC) |
| Ex-ante firm prod. tail | λ | 10.5 | Average HHI (CoM) |
| Variance of sector shocks | σ_S^2 | 2.0×10^{-3} | Market shock |
| Variance of idiosyncratic shocks | σ_N^2 | 0.14 | variance (CoM) |
| B. Labor Supply | | | |
| Short run labor elasticity across firms | κ | | |
| Short run labor elasticity across markets | ν | | |
| C. Economic Geography Parameters | | | |
| Migration elasticity | θ | | |
| Average Productivity | z_i | | |
| Amenity | \bar{u}_i | | |
| Entry costs | ψ_i | | |

Estimating firm labor supply elasticity

- Within-market cross-firm labor supply elasticity: κ

$$\log \ell_{isn}(\omega) = \kappa \log w_{isn}(\omega) - (\kappa - \nu) \log w_{is}(\omega) - \nu \log w_i(\omega) + \tilde{\epsilon}_{isn}^w(\omega)$$

Estimating firm labor supply elasticity

- Within-market cross-firm labor supply elasticity: κ

$$\Delta \log \ell_{isnt} = \kappa \Delta \log w_{isnt} + \underbrace{\gamma_{ist}}_{\text{market FE}} + \tilde{\epsilon}_{isnt}^w$$

Estimating firm labor supply elasticity

- Within-market cross-firm labor supply elasticity: κ

$$\Delta \log \ell_{isnt} = \kappa \Delta \log w_{isnt} + \underbrace{\gamma_{ist}}_{\text{market FE}} + \tilde{\epsilon}_{isnt}^w$$

- Instrument for $\Delta \log w_{isnt}$ using a Bartik IV Δd_{isnt} . 1st stage F-stat 14.26

$$\Delta d_{isnt} = \sum_p \overline{s_{isn}^p} \cdot d_{pt}^{\text{national}}$$

- $\overline{s_{isn}^p}$: firm n 's product mix (median over time, 2002-2019), $\sum_p \overline{s_{isn}^p} = 1$
- $\Delta d_{pt}^{\text{national}}$: national-level log sales growths for product p

Estimating firm labor supply elasticity

- Within-market cross-firm labor supply elasticity: κ

$$\Delta \log \ell_{isnt} = \kappa \Delta \log w_{isnt} + \underbrace{\gamma_{ist}}_{\text{market FE}} + \tilde{\epsilon}_{isnt}^w$$

- Instrument for $\Delta \log w_{isnt}$ using a Bartik IV Δd_{isnt} . 1st stage F-stat 14.26

$$\Delta d_{isnt} = \sum_p \overline{s_{isn}^p} \cdot d_{pt}^{\text{national}}$$

- $\overline{s_{isn}^p}$: firm n 's product mix (median over time, 2002-2019), $\sum_p \overline{s_{isn}^p} = 1$
- $\Delta d_{pt}^{\text{national}}$: national-level log sales growths for product p
- Estimate: $\hat{\kappa} = 2.48(0.73)$
 - US: 6.52 (Lamadon et al, 2022), 10.85 (Berger et al 2022)
 - Brazil: 1.02 (Felix, 2022)

Estimating market labor supply elasticity

- Cross-market labor supply elasticity: ν

$$\log \ell_{is}(\omega) = \nu \log w_{is}(\omega) - \nu \log w_i(\omega) + \varepsilon_{is}^w(\omega)$$

where

$$\ell_{is}(\omega) = \left[\sum_{n \in \mathcal{N}_{is}} \left(\frac{\bar{\ell}_{isn}}{\bar{\ell}_{is}} \right)^{-\frac{1}{\kappa}} \ell_{isn}(\omega)^{\frac{1+\kappa}{\kappa}} \right]^{\frac{\kappa}{1+\kappa}}, \quad w_{is}(\omega) = \left[\sum_{n \in \mathcal{N}_{is}} \frac{\bar{\ell}_{isn}}{\bar{\ell}_{is}} w_{isn}(\omega)^{1+\kappa} \right]^{\frac{1}{1+\kappa}}$$

Estimating market labor supply elasticity

- Cross-market labor supply elasticity: ν

$$\Delta \log \ell_{ist} = \nu \Delta \log w_{ist} + \gamma_{it} + \gamma_{st} + \varepsilon_{ist}^w$$

where

$$\ell_{ist} = \left[\sum_{n \in \mathcal{N}_{is}} \left(\frac{\bar{\ell}_{isn}}{\bar{\ell}_{is}} \right)^{-\frac{1}{\hat{\kappa}}} \ell_{isnt}^{\frac{1+\hat{\kappa}}{\hat{\kappa}}} \right]^{\frac{\hat{\kappa}}{1+\hat{\kappa}}}, \quad w_{ist} = \left[\sum_{n \in \mathcal{N}_{is}} \frac{\bar{\ell}_{isn}}{\bar{\ell}_{is}} w_{isnt}^{1+\hat{\kappa}} \right]^{\frac{1}{1+\hat{\kappa}}}$$

Estimating market labor supply elasticity

- Cross-market labor supply elasticity: ν

$$\Delta \log \ell_{ist} = \nu \Delta \log w_{ist} + \gamma_{it} + \gamma_{st} + \varepsilon_{ist}^w$$

where

$$\ell_{ist} = \left[\sum_{n \in \mathcal{N}_{is}} \left(\frac{\bar{\ell}_{isn}}{\bar{\ell}_{is}} \right)^{-\frac{1}{\hat{\kappa}}} \ell_{isnt}^{\frac{1+\hat{\kappa}}{\hat{\kappa}}} \right]^{\frac{\hat{\kappa}}{1+\hat{\kappa}}}, \quad w_{ist} = \left[\sum_{n \in \mathcal{N}_{is}} \frac{\bar{\ell}_{isn}}{\bar{\ell}_{is}} w_{isnt}^{1+\hat{\kappa}} \right]^{\frac{1}{1+\hat{\kappa}}}$$

- IV for $\Delta \log w_{ist}$: $\sum_{n'} \frac{\bar{\ell}_{isn'}}{\bar{\ell}_{is}} \cdot \Delta d_{isn't}$. 1st stage F-stat 482

Estimating market labor supply elasticity

- Cross-market labor supply elasticity: ν

$$\Delta \log \ell_{ist} = \nu \Delta \log w_{ist} + \gamma_{it} + \gamma_{st} + \varepsilon_{ist}^w$$

where

$$\ell_{ist} = \left[\sum_{n \in \mathcal{N}_{is}} \left(\frac{\bar{\ell}_{isn}}{\bar{\ell}_{is}} \right)^{-\frac{1}{\hat{\kappa}}} \ell_{isnt}^{\frac{1+\hat{\kappa}}{\hat{\kappa}}} \right]^{\frac{\hat{\kappa}}{1+\hat{\kappa}}}, \quad w_{ist} = \left[\sum_{n \in \mathcal{N}_{is}} \frac{\bar{\ell}_{isn}}{\bar{\ell}_{is}} w_{isnt}^{1+\hat{\kappa}} \right]^{\frac{1}{1+\hat{\kappa}}}$$

- IV for $\Delta \log w_{ist}$: $\sum_{n'} \frac{\bar{\ell}_{isn'}}{\bar{\ell}_{is}} \cdot \Delta d_{isn't}$. 1st stage F-stat 482
- Estimate: $\hat{\nu} = 1.46(0.07)$
 - US: 4.57 (Lamadon et al, 2022), 0.42 (Berger et al, 2022)
 - Brazil: 0.80 for Brazil (Felix, 2022)

Parameters Estimation Summary

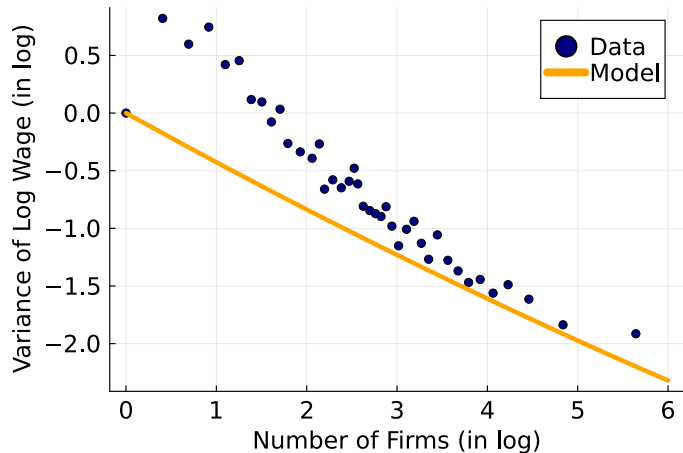
| Description | Parameter | Value | Source |
|---|--------------|----------------------|---------------------------|
| A. Labor Demand | | | |
| Returns to scale | η | 0.13 | Profit Share (Data, FSSC) |
| Ex-ante firm prod. tail | λ | 10.5 | Average HHI (CoM) |
| Variance of sector shocks | σ_S^2 | 2.0×10^{-3} | Market shock |
| Variance of idiosyncratic shocks | σ_N^2 | 0.14 | variance (CoM) |
| B. Labor Supply | | | |
| Short run labor elasticity across firms | κ | 2.48 | Product-level |
| Short run labor elasticity across markets | ν | 1.46 | Bartik shocks (CoM) |
| C. Economic Geography Parameters | | | |
| Migration elasticity | θ | | |
| Average Productivity | z_i | | |
| Amenity | \bar{u}_i | | |
| Entry costs | ψ_i | | |

Parameters Estimation Summary

| Description | Parameter | Value | Source |
|---|--------------|----------------------|---------------------------|
| A. Labor Demand | | | |
| Returns to scale | η | 0.13 | Profit Share (Data, FSSC) |
| Ex-ante firm prod. tail | λ | 10.5 | Average HHI (CoM) |
| Variance of sector shocks | σ_S^2 | 2.0×10^{-3} | Market shock |
| Variance of idiosyncratic shocks | σ_N^2 | 0.14 | variance (CoM) |
| B. Labor Supply | | | |
| Short run labor elasticity across firms | κ | 2.48 | Product-level |
| Short run labor elasticity across markets | ν | 1.46 | Bartik shocks (CoM) |
| C. Economic Geography Parameters | | | |
| Migration elasticity | θ | 3 | Redding (2016) |
| Average Productivity | z_i | | Exact hat algebra (2019) |
| Amenity | \bar{u}_i | | |
| Entry costs | ψ_i | | |

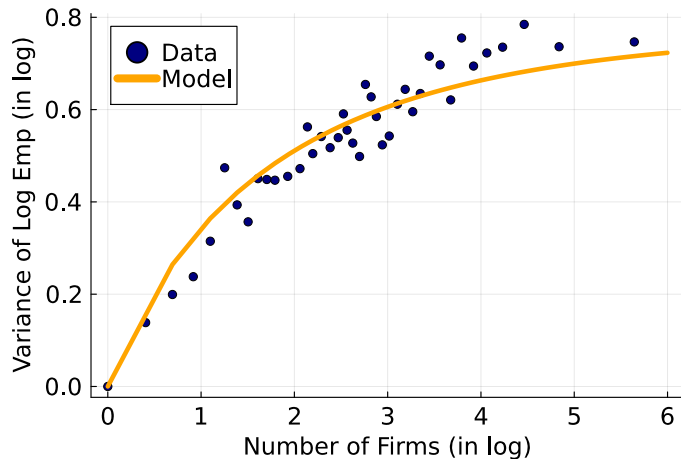
Validation of the Mechanism

Firms are Subject to Idiosyncratic Shocks ► math



$$\text{Var} \left(\log \left(\sum_{n \in \mathcal{N}_{is}} w_{isnt} \ell_{isnt} \right) \right)$$

Firms in Larger Markets Expand More - Correlation ► math



$$\sum_{n \in \mathcal{N}_{is}} \frac{\bar{\ell}_{isn}}{\bar{\ell}_{is}} \text{Var}(\log \ell_{isnt})$$

Firms in Larger Markets Expand More - Reduced Form ► math

$$\Delta \log \ell_{isnt} = \frac{1}{\eta + \frac{1}{\kappa}} \left(\Delta \log a_{isnt} - \frac{\frac{1}{\nu} - \frac{1}{\kappa}}{\eta + \frac{1}{\nu}} \frac{\bar{\ell}_{isn}}{\bar{\ell}_{is}} \Delta \log a_{isnt} \right)$$

So the implied ratio is

$$-\frac{\frac{1}{\nu} - \frac{1}{\kappa}}{\eta + \frac{1}{\nu}} = -0.35$$

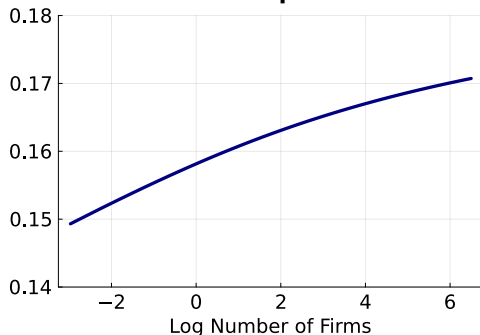
Firms in Larger Markets Expand More - Reduced Form ► math

| | $\Delta \log \ell_{isn,t+1}$ | | |
|---|------------------------------|-------------------|--|
| | (1) | (2) | |
| Shock | 0.048 (0.002) | 0.048 (0.002) | |
| Shock $\times \frac{\ell_{isn,t}}{\ell_{is,t}}$ | -0.021 (0.005) | -0.023 (0.005) | |
| Implied Ratio | -0.428 | -0.477 | $-\frac{\frac{1}{\nu} - \frac{1}{\kappa}}{\eta + \frac{1}{\nu}} = -0.35$ |
| 95% CI | [-0.615, -0.240] | [-0.651, -0.303] | |
| Observations | 1,740,782 | 1,511,376 | |
| Year & Firm FE | ✓ | ✓ | |
| Lag. Payroll Share | ✓ | ✓ | |
| $\Delta \log \ell_{isn,t}$ | | ✓ | |

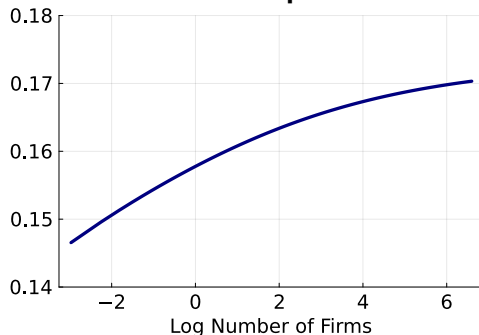
Quantification of Granular Driven Agglomeration

Estimated $\log \Phi^f(m)$ ▶ bertrand version

Perfect Competition



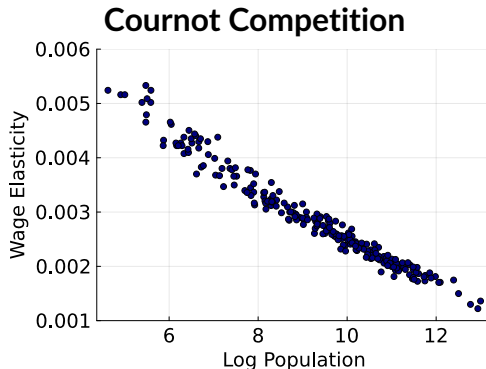
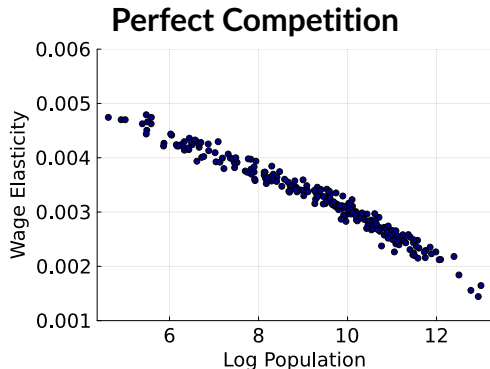
Cournot Competition



$$Y_i(\ell, m) = z_i \ell^{1-\eta} m^\eta \cdot \Phi(m)$$

Implied Wage Elasticity

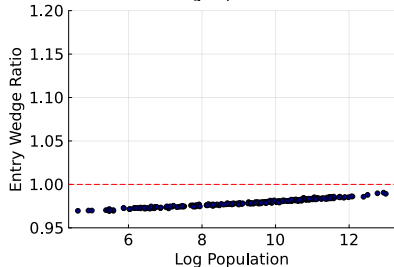
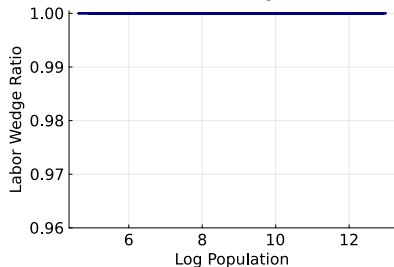
► bertrand version



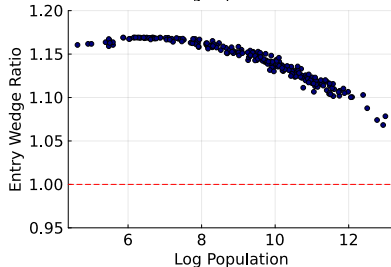
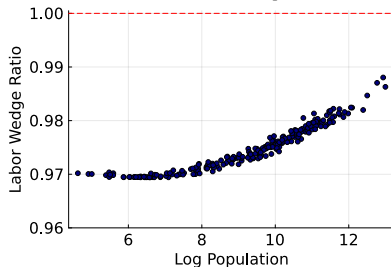
- 0.005 in smallest CZ = 10 – 25% of total agglomeration forces (0.02 – 0.05, Combes et al)

Factor Wedge Ratios ▶ bertrand version

Perfect Competition



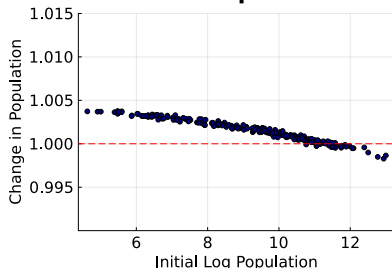
Cournot Competition



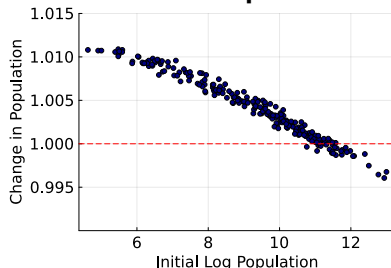
Effects of Optimal Policy

► bertrand version

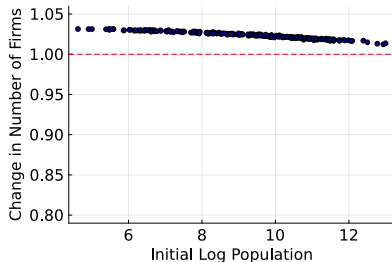
Perfect Competition



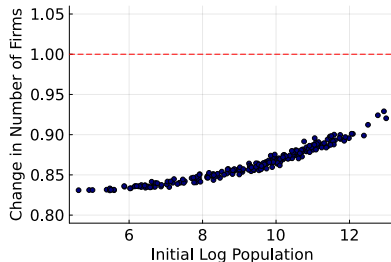
Cournot Competition



Perfect Competition



Cournot Competition



Conclusion

- Labor markets are over-exposed to firm shocks which implies:
 - Larger markets are more productive
 - Too few people live in small locations
- The key object:
 - Covariance between firm productivity and employment
- Quantitatively, granularity means:
 - Tokyo is 2.5% more productive than the smallest cities
 - Small cities should have 1% more people

Appendix

Relation to Misallocation [▶ back](#)

When firms are on their demand curves, one can relate the variance of wages to the covariance,

$$\int_0^1 \frac{\bar{\ell}_{is}}{\bar{\ell}_i} \text{Var}(\log w_s(\omega)) ds = \text{Var}(\log a_{sn}(\omega)) \\ - \eta \int_0^1 \frac{\bar{\ell}_{is}}{\bar{\ell}_i} \sum_{n \in \mathcal{N}_{is}} \frac{\bar{\ell}_{isn}}{\bar{\ell}_{is}} \text{Cov}(\log a_{isn}(\omega), \log \ell_{isn}(\omega)) ds$$

Relation to Misallocation [▶ back](#)

When firms are on their demand curves, one can relate the variance of wages to the covariance,

$$\int_0^1 \frac{\bar{\ell}_{is}}{\bar{\ell}_i} \text{Var}(\log w_s(\omega)) ds = \text{Var}(\log a_{sn}(\omega)) \\ - \eta \int_0^1 \frac{\bar{\ell}_{is}}{\bar{\ell}_i} \sum_{n \in \mathcal{N}_{is}} \frac{\bar{\ell}_{isn}}{\bar{\ell}_{is}} \text{Cov}(\log a_{isn}(\omega), \log \ell_{isn}(\omega)) ds$$

Then we rewrite the corollary:

Corollary

$Y_i(\ell, m)$ features increasing returns to scale if the average variance of $\log w_s(\omega)$ is decreasing in the number of firms.

Migration Across Regions Details [▶ back](#)

- There is a mass ℓ of workers in the country
- The fundamental utility of living in i is

$$u_i = \bar{u}_i w_i$$

where \bar{u}_i is the local amenities

- A worker gets utility $u_i \varepsilon_i$ from living in location i where ε_i is the idiosyncratic preference for location i distributed Fréchet with shape parameter θ
- Standard maximization problem implies migration,

$$\ell_i = \left(\frac{u_i}{u} \right)^\theta \ell,$$

where $u = (\sum u_i^\theta)^{1/\theta}$.

Imperfect Mobility Details [▶ back](#)

- Period 1, workers freely allocates labor across firms

$$\mathcal{L} \equiv \left\{ \mathbf{L}'_i \mid \int_0^1 \sum_{n \in \mathcal{N}_{is}} L'_{isn} ds \leq 1 \right\}.$$

Imperfect Mobility Details [▶ back](#)

- Period 1, workers freely allocates labor across firms

$$\mathcal{L} \equiv \left\{ \mathbf{L}'_i \mid \int_0^1 \sum_{n \in \mathcal{N}_{is}} L'_{isn} ds \leq 1 \right\}.$$

- In period 2, worker can then adjust labor subject to the constraint embedded in the set

$$\mathcal{L}_\Omega(\mathbf{L}_i) \equiv \left\{ \mathbf{L}'_i \mid 1 = \left(\int_0^1 L_{is}^{-\frac{1}{\nu}} L_{is}(\omega)^{\frac{1+\nu}{\nu}} ds \right)^{\frac{\nu}{1+\nu}}, \right.$$

$$\left. L_{is}(\omega) = \left(\sum_{n \in \mathcal{N}_{is}} \left(\frac{L_{isn}}{L_{is}} \right)^{-\frac{1}{\kappa}} L_{isn}(\omega)^{\frac{1+\kappa}{\kappa}} \right)^{\frac{\kappa}{1+\kappa}} \right\}.$$

Imperfect Mobility Details [▶ back](#)

- Period 1, workers freely allocates labor across firms

$$\mathcal{L} \equiv \left\{ \mathbf{L}'_i \mid \int_0^1 \sum_{n \in \mathcal{N}_{is}} L'_{isn} ds \leq 1 \right\}.$$

- In period 2, worker can then adjust labor subject to the constraint embedded in the set

$$\mathcal{L}_\Omega(\mathbf{L}_i) \equiv \left\{ \mathbf{L}'_i \mid 1 = \left(\int_0^1 L_{is}^{-\frac{1}{\nu}} L_{is}(\omega)^{\frac{1+\nu}{\nu}} ds \right)^{\frac{\nu}{1+\nu}}, \right.$$

$$\left. L_{is}(\omega) = \left(\sum_{n \in \mathcal{N}_{is}} \left(\frac{L_{isn}}{L_{is}} \right)^{-\frac{1}{\kappa}} L_{isn}(\omega)^{\frac{1+\kappa}{\kappa}} \right)^{\frac{\kappa}{1+\kappa}} \right\}.$$

- The worker chooses $L_i \in \mathcal{L}$ and $L_i(\omega) \in \mathcal{L}_\Omega(L_i)$ to maximize expected earnings taking wages $w_{isn}(\omega)$ as given

Perfect Competition Details

[▶ back](#)

- Compared to the baseline, firms now have individual wages
- Firms choose labor to maximize profits, taking wages as given

$$\ell_{isn}(\omega) \in \operatorname{argmax}_{\ell'} \quad Z_{isn} a_{isn}(\omega) (\ell')^{1-\eta} - w_{isn}(\omega) \ell'.$$

- Market clearing requires that labor clears firm by firm

$$\ell_{isn}(\omega) = L_{isn}(\omega) \ell_i.$$

Cournot Competition Details [▶ back](#)

- Firms commit to a wage profile across all states of the world ω in period 0, $\{w_{isn}(\omega)\}$.
- With Cournot competition, they take as given employment by the other firms in the sector and the wage opportunity in every other sector
- Firms have market power because after a good shock, they expand and have more market share
 - Firms have higher markdowns after good productivity shocks
 - Lower markdowns after bad productivity shocks

Bertrand Competition Details [▶ back](#)

- Firms commit to a wage profile across all states of the world ω in period 0, $\{w_{isn}(\omega)\}$.
- With Bertrand competition, they take as given wages by the other firms in the sector and the wage opportunity in every other sector
- Firms have market power because after a good shock, they expand and have more market share
 - Firms have higher markdowns after good productivity shocks
 - Lower markdowns after bad productivity shocks

Firm Labor Supply Elasticity Robustness [▶ back](#)

| | Dep. Var.: Log Employment Growth | | | |
|-------------------|----------------------------------|----------------|----------------|----------------|
| | (1) | (2) | (3) | (4) |
| Log Wage Growth | 2.51 (0.49) | 3.21 (0.78) | 3.07 (0.87) | 3.37 (1.09) |
| Observations | 1,850,914 | 1,581,528 | 1,850,914 | 1,581,528 |
| 1st Stage F-Stat. | 31.51 | 19.14 | 14.43 | 10.90 |
| Covariates | | ✓ | | ✓ |
| Weighted | | | ✓ | ✓ |

Market Labor Supply Elasticity Robustness

[▶ back](#)

| Dep. Var.: Market-level Log Employment Growth | | | | |
|---|----------------|----------------|----------------|----------------|
| | (1) | (2) | (3) | (4) |
| Market-level Log Wage Growth | 1.87 (0.22) | 2.13 (0.21) | 1.42 (0.12) | 1.87 (0.11) |
| Observations | 215,299 | 195,330 | 215,299 | 195,330 |
| 1st Stage F-Stat. | 83.56 | 108.40 | 158.63 | 270.78 |
| Covariates | | ✓ | | ✓ |
| Weighted | | | ✓ | ✓ |

Log Wage Bill Variance in the Model [▶ back](#)

- To log first order,

$$\Delta \log \left(\sum_{n \in \mathcal{N}_{is}} w_{isn}(\omega) \ell_{isn}(\omega) \right) \approx \frac{1 + \nu}{1 + \eta \nu} \sum_{n \in \mathcal{N}_{is}} \frac{\bar{\ell}_{isn}}{\bar{\ell}_{is}} \Delta \log a_{isn}(\omega).$$

- Taking the variance implies

$$\begin{aligned} \text{Var} \log \left(\sum_{n \in \mathcal{N}_{is}} w_{isn}(\omega) \ell_{isn}(\omega) \right) &\approx \frac{1 + \nu}{1 + \eta \nu} \left(\sigma_S^2 + HHI_{is} \sigma_N^2 \right) \\ &\approx \frac{1 + \nu}{1 + \eta \nu} \left(\sigma_S^2 + CN_{is}^{-2 \left(1 - \frac{1}{\lambda \eta} \right)} \sigma_N^2 \right) \end{aligned}$$

Log Employment Variance in the Model [▶ back](#)

- To log first order

$$\Delta \log \ell_{isn}(\omega) = \frac{1}{\eta + \frac{1}{\kappa}} \left(\Delta \log a_{isn}(\omega) - \frac{\frac{1}{\nu} - \frac{1}{\kappa}}{\eta + \frac{1}{\nu}} \sum_{n' \in \mathcal{N}_{is}} \frac{\bar{\ell}_{isn'}}{\bar{\ell}_{is}} \Delta \log a_{isn'} \right)$$

- Then tedious algebra implies

$$\begin{aligned} \sum_{n \in \mathcal{N}_{is}} \frac{\ell_{isn}}{\bar{\ell}_{is}} \text{Var}(\log \ell_{isn}(\omega)) &\approx \left(\frac{1}{\eta + \frac{1}{\kappa}} \right)^2 \sigma_S^2 + \left(\frac{1}{\eta + \frac{1}{\kappa}} \right) \sigma_N^2 \\ &\quad - \left(\frac{1}{\nu} - \frac{1}{\kappa} \right) \frac{\eta + \frac{1}{\kappa} + \eta + \frac{1}{\nu}}{\left(\eta + \frac{1}{\kappa} \right)^2 \left(\eta + \frac{1}{\nu} \right)^2} \cdot HHI_{is} \cdot \sigma_N^2 \end{aligned}$$

Reduced Form Labor Response in the Model [▶ back](#)

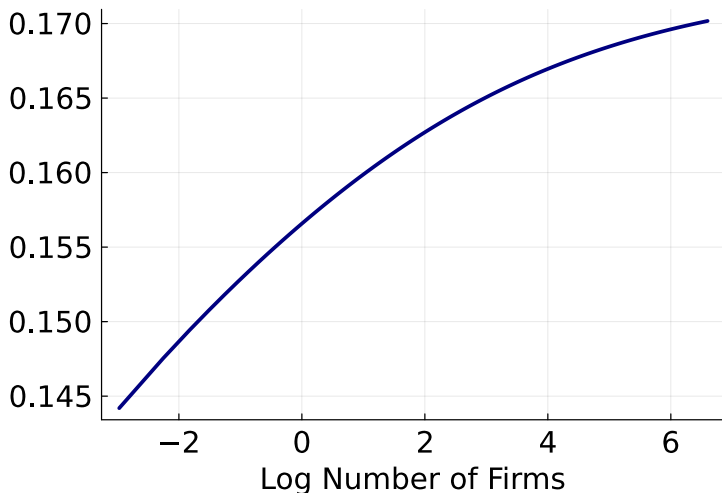
- To log first order

$$\begin{aligned}\Delta \log \ell_{isn}(\omega) &= \frac{1}{\eta + \frac{1}{\kappa}} \left(\Delta \log a_{isn}(\omega) - \frac{\frac{1}{\nu} - \frac{1}{\kappa}}{\eta + \frac{1}{\nu}} \sum_{n' \in \mathcal{N}_{is}} \frac{\bar{\ell}_{isn'}}{\bar{\ell}_{is}} \Delta \log a_{isn'} \right) \\ &= \frac{1}{\eta + \frac{1}{\kappa}} \left(\Delta \log a_{isn}(\omega) - \frac{\frac{1}{\nu} - \frac{1}{\kappa}}{\eta + \frac{1}{\nu}} \frac{\bar{\ell}_{isn}}{\bar{\ell}_{is}} \Delta \log a_{isn} \right)\end{aligned}$$

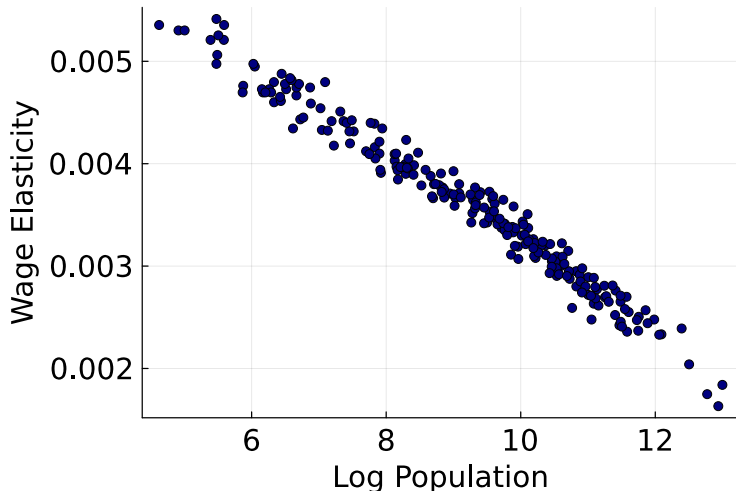
- Therefore, the implied ratio is

$$-\frac{\frac{1}{\nu} - \frac{1}{\kappa}}{\eta + \frac{1}{\nu}} = -0.359$$

Estimated $\log \Phi^f(m)$ - Bertrand [▶ back](#)



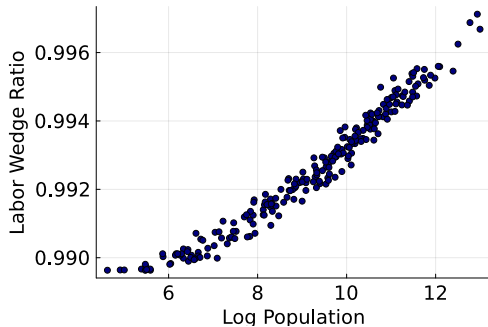
Implied Wage Elasticity - Bertrand

[▶ back](#)

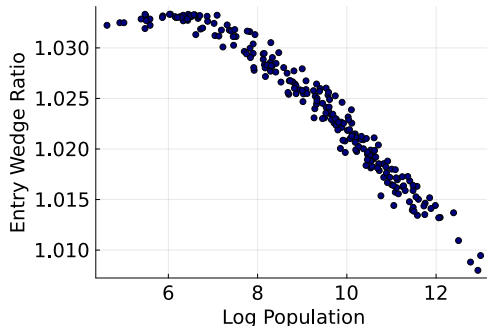
Factor Wedge Ratios - Bertrand

[▶ back](#)

Labor Wedge Ratio

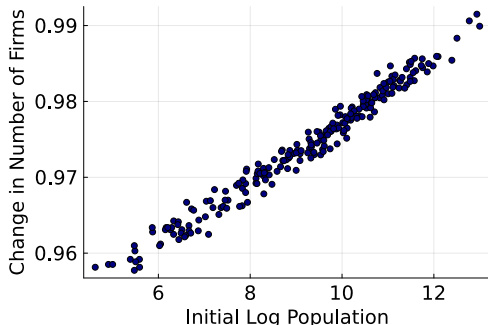


Entry Wedge Ratio

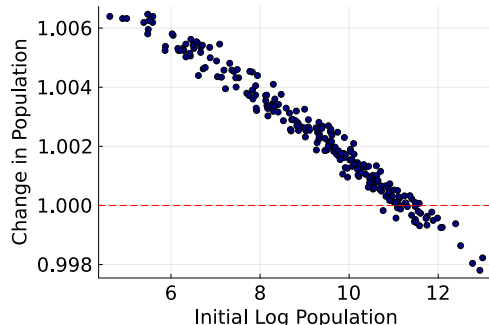


Effects of Optimal Policy - Bertrand [▶ back](#)

Change in Number of Firms



Changes in Population



Entry Details

[▶ back](#)

Average profits can be written:

$$\begin{aligned}\frac{\mathbb{E} \left[\int_0^1 \sum_{n \in \mathcal{N}_{is}} \pi_{isn}(\omega) \right]}{m_i} &= \frac{\sum_{N=0}^{\infty} \mathbb{E}[\sum_n \pi_{isn}(\omega) | N_{is} = N] p(N, m)}{m_i} \\&= \sum_{N=0}^{\infty} \pi_{i,N}^e \frac{N}{m_i} p(N, m) \\&= \sum_{N=0}^{\infty} \pi_{i,N+1}^e \frac{N+1}{m_i} \frac{m_i^{N+1} e^{-m_i}}{(N+1)!} \\&= \sum_{N=0}^{\infty} \pi_{i,N+1}^e p(N, m_i).\end{aligned}$$

Profits of Potential Entrants [▶ back](#)

To second order,

$$\mathbb{E}[\pi_{isn}(\omega)] \approx \bar{\pi}_{isn} \left[\zeta_s - \frac{1-\eta}{\eta^2} \text{Cov}(\log a_{isn}(\omega), \log w_{is}(\omega)) \right]$$

Therefore, operating firms (whose productivity shocks are correlated with wages) earn less profits than potentially operating firms.