

# *Market structure and monetary non-neutrality*

**Simon Mongey**

**New York University**

University of Melbourne

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## Introduction

### Key question in macroeconomics

- How do changes in nominal spending affect output vs. inflation?
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### Motivation

#### 1. Markets dominated by a few large firms

▶ Fig. - Distributions of concentration

e.g. Mayonnaise, Ohio, 2005:Q1 - Hellman's 45%, Kraft 33% (IRI data)

#### 2. Increasing concentration - Philippon Gutierrez (2017), Autor et al. (2017)

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- How does market structure affect transmission of monetary shocks?

# Approach

## Quantitative model

- Firm heterogeneity - Idiosyncratic productivity shocks
- Nominal rigidity - Menu cost of changing prices
- Exogenous changes in nominal spending - Shocks to money supply
- **New - Two 'large' firms in each sector. Dynamic oligopoly.**

▶ Literature

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- Compare: Oligopoly vs. Monopolistic competition
- Calibrate to match same data on good-level price dynamics
  - Frequency of adjustment, Size of adjustment, Average markup

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### Main finding

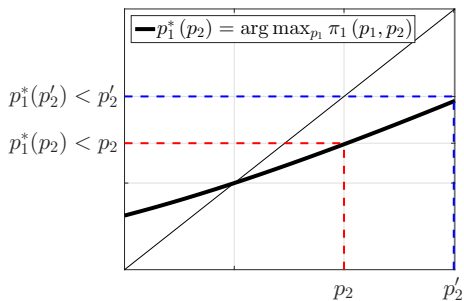
- **2.5 times larger output fluctuations under duopoly**



# Dynamic complementarity

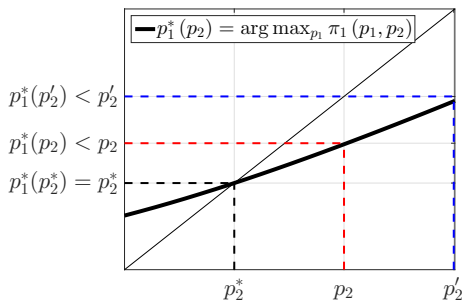
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## Static complementarity



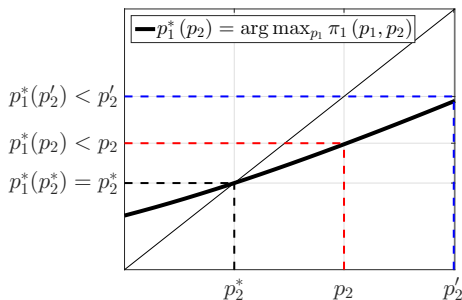
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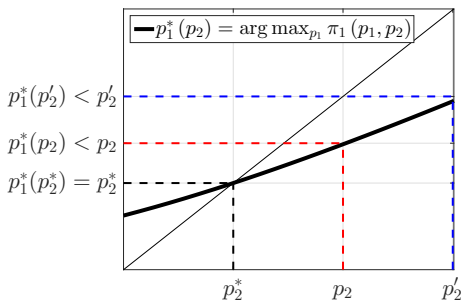


+ Menu costs

→ Wipe out small gains from best responses

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## Static complementarity



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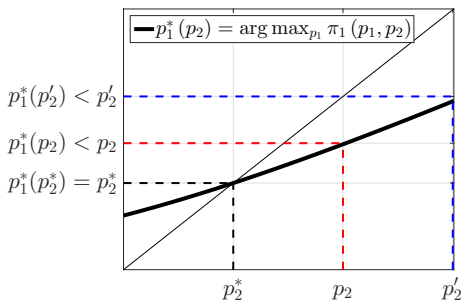
→ Wipe out small gains from best responses

+ Dynamic oligopoly

→ Follow competitor's price

# Dynamic complementarity

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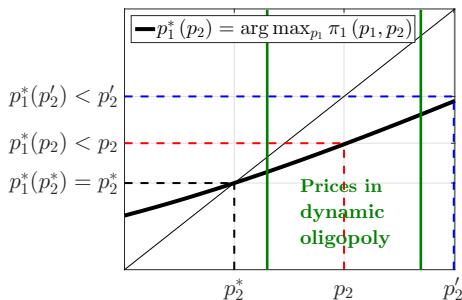
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# Dynamic complementarity

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Dynamic complementarity → Slow response of  $P$



## Dynamic complementarity → Slow response of $P$

### Monopolistic competition

- Increase in money → Firm's relative price falls

#### 1. Extensive

- Firms with low prices more likely to change their price

#### 2. Intensive

- Price increases are larger to make up for increase in agg. prices

## Dynamic complementarity → Slow response of $P$

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### Duopoly

- Increase in money → Competitor's relative price falls

1. Reduces desired price increase → ↓ Intensive

2. Reduces value of a price increase → ↓ Extensive

## Three additional results

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### 1. Welfare

- Output is 10 ppt higher with no menu costs
- 75% due to higher markups, only 25% due to price dispersion
- Suggests a different focus for welfare analysis

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- MC menu cost models with SC can generate large real effects
- But implausible parameter values to match good-level data
- **Addresses a challenge in the literature** (Nakamura Steinsson '10)

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### 3. Empirical relationship (Carlton '86, Bils Klenow '04)

- Lower menu costs needed in the duopoly model
- *Across-region Within-product* correlations support model (IRI data)
- **Better understand heterogeneity in price flexibility**

# Outline

1. Model
2. Simulations
3. Calibration
4. Decompose the effects of monetary shocks
5. Three additional results

## Environment

### Representative household

- Preferences Nested CES: Sectors  $j \in [0, 1]$ , goods  $i \in \{1, 2\}$

### Heterogeneous Firms

- Technology Good  $ij$  is produced by firm  $i$  in sector  $j$  using labor
- Productivity Firm-specific  $z_{ij}$ . Evolves stochastically.
- Menu cost Pay a cost  $\zeta$  to change price

### Monetary policy

- Money  $M$  grows at rate  $g' = M' / M$

$$\log g' = (1 - \rho_g) \log \bar{g} + \rho_g \log g + \sigma_g \varepsilon'_g$$



# Household

## Flow utility

$$U(C, N) = \log C - N$$

$$C = \left[ \int_0^1 C_j^{\frac{1-\theta}{\theta}} dj \right]^{\frac{\theta}{1-\theta}}, \quad \theta > 1$$

$$C_j = \left[ c_{1j}^{\frac{1-\eta}{\eta}} + c_{2j}^{\frac{1-\eta}{\eta}} \right]^{\frac{\eta}{1-\eta}}, \quad \eta > \theta$$

## Total nominal expenditure

$$PC = \int_0^1 [p_{1j}c_{1j} + p_{2j}c_{2j}] dj \leq M$$

► Details - Recursive household problem with dynamic budget constraint → Discount factor

## Household - Solution

### Labor supply

$$\frac{W}{P} = -\frac{U_N(C, N)}{U_C(C, N)} \leftrightarrow W = PC = M$$

### Demand

$$d_{ij} = \left(\frac{p_{ij}}{P_j}\right)^{-\eta} \left(\frac{P_j}{P}\right)^{-\theta} C$$

where

$$P_j = \left[ p_{1j}^{1-\eta} + p_{2j}^{1-\eta} \right]^{\frac{1}{1-\eta}}$$
$$P = \left[ \int_0^1 P_j^{1-\theta} dj \right]^{\frac{1}{1-\theta}}$$

## Household problem - Solution

### Markups

$$\underbrace{\mu_{ij} = \frac{P_{ij}}{W/z_{ij}}}_{\text{Firm}}, \quad \underbrace{\mu_j = \frac{P_j}{W}}_{\text{Sector}}, \quad \underbrace{\mu = \frac{P}{W} = \frac{1}{W/P}}_{\text{Aggregate}}$$

### Profits

$$\frac{\pi_{ij}}{W} = \underbrace{\left(\frac{\mu_{ij}}{\mu_j}\right)^{-\eta} \left(\frac{\mu_j}{\mu}\right)^{-\theta}}_{\text{Demand } d_{ij}} \underbrace{\frac{1}{\mu} (\mu_{ij} - 1)}_{\text{Per-unit profit}}$$

where

$$\mu_j = \left[ \mu_{1j}^{1-\eta} + \mu_{2j}^{1-\eta} \right]^{\frac{1}{1-\eta}}$$

$$\mu = \left[ \int_0^1 \mu_j^{1-\theta} dj \right]^{\frac{1}{1-\theta}}$$

► Technical details

## Household problem - Solution

### Markups

$$\underbrace{\mu_{ij} = \frac{P_{ij}}{W/z_{ij}}}_{\text{Choice today}}, \quad \underbrace{\bar{\mu}'_{ij} = \frac{P_{ij}}{W'/z'_{ij}}}_{\text{State tomorrow}}$$

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## Firm problem

### Markov states

- Sector      Markups  $\bar{\mu}_i, \bar{\mu}_{-i}$        $x = (\bar{\mu}_i, \bar{\mu}_{-i})$
- Aggregate      Distribution  $\lambda(x)$ , money growth  $g$        $X = (\lambda, g)$

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### Competitor's policies

- Markup adjustment  $\mathbf{1}_{-i}^{adj}(x, X, \xi_{-i}) \in \{0, 1\}$
- Markup conditional on adjustment  $\mu_{-i}^*(x, X) \in \mathbb{R}_+$



## Firm problem

### Value

$$V_i(x, X, \xi_i) = \max_{\mathbf{1}_i^{adj} \in \{0,1\}} \mathbf{1}_i^{adj} [V_i^{adj}(x, X) - \xi_i] + (1 - \mathbf{1}_i^{adj}) V_i^{stay}(x, X)$$

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### Value of adjusting price

$$V_i^{adj}(x, X) = \max_{\mu_i^* \in \mathbb{R}_+} \int_0^{\bar{\xi}} \left[ \pi(\mu_i^*, \mu_{-i}(x, X, \xi_{-i}), \mu(X)) + \beta \mathbb{E} [V_i(x', X', \xi'_i)] \right] dF(\xi_{-i})$$

$$\mu_{-i}(x, X, \xi_{-i}) = \underbrace{\mathbf{1}_{-i}^{adj}(x, X, \xi_{-i}) \mu_{-i}^*(x, X)}_{\text{Competitor adjusts}} + \underbrace{(1 - \mathbf{1}_{-i}^{adj}(x, X, \xi_{-i})) \bar{\mu}_{-i}}_{\text{Competitor stays}}$$

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## Solution

- Probability of price adjustment  $\gamma_i(x, X) = \int_0^{\bar{\xi}} \mathbf{1}_i^{adj}(x, X, \xi_i) dF(\xi_i)$
- Markup conditional on adjustment  $\mu_i^*(x, X)$

## Recursive equilibrium

- Symmetric demand, value, adjustment prob. and markup functions

$$d(x, X), V(x, X), \gamma(x, X), \mu^*(x, X)$$

- Transition function for the distribution of sectors  $\lambda' = \Gamma_\lambda(X, \lambda)$
- Aggregate markup function  $\mu(X)$

such that

1.  $W = PC = M$  + Markup definitions  $\leftrightarrow \mu(X) = \frac{1}{c(X)}$
2. Firm policies and values are **Markov-Perfect** at the sectoral level
3. Demand functions are consistent with household optimization
4. Transition function for  $\lambda$  is consistent with policies and processes
5. Aggregate mark-up is consistent with (i) mark-up policies, (ii)  $\lambda$

► Details - Computation

## Monopolistically competitive market structure

- Continuum of sectors  $j \in [0, 1]$
- Continuum of firms within each sector  $i \in [0, 1]$

$$\mu_j = \left[ \int_0^1 \mu_{ij}^{1-\eta} di \right]^{\frac{1}{1-\eta}}$$

- Competitive equilibrium
- Same
  - Household problem
  - Shocks
  - Parameters:  $\bar{\zeta}, \sigma_z, \eta, \theta$

## Illustrative simulation

### Show

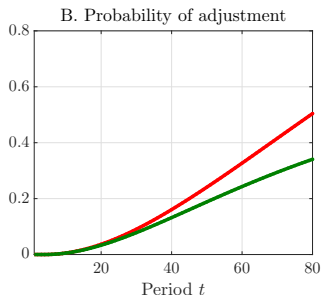
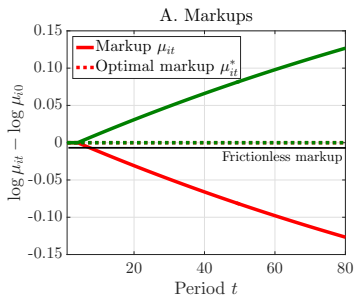
- **Micro** MPE policies attain high markups in equilibrium
- **Macro** Weaker intensive and extensive response to  $\uparrow M$

### Setup

- Fix paths for shocks  $z_{it} \rightarrow \bar{\mu}_{it}$
- Fix paths for menu costs  $\bar{\zeta}_{it} = \bar{\zeta}$
- No aggregate shocks or inflation  $g_t = 0$
- Show paths for equilibrium policies
  - (i) Optimal markup  $\mu^*(\bar{\mu}_{1t}, \bar{\mu}_{2t})$
  - (ii) Probability of adjustment  $\gamma(\bar{\mu}_{1t}, \bar{\mu}_{2t})$

*Note: Using estimated parameters (next)*

# Monopolistic competition



## Markups

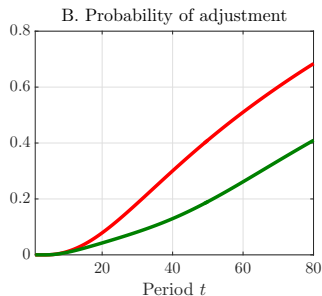
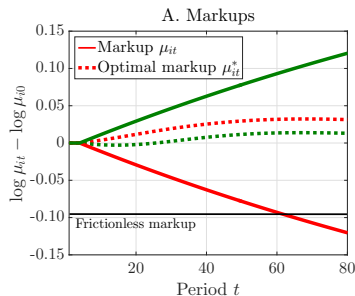
- Same optimal price  $\mu_L^* = \mu_H^*$

## Adjustment

- Precautionary motive  $\gamma_L > \gamma_H$

► Profit functions

# Duopoly



## Markups

- Dynamic complementarity
- Policies support high markups

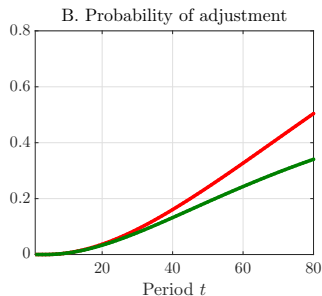
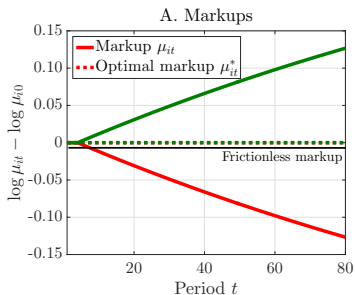
## Adjustment

- High  $\gamma_L$  to incentivize low  $\gamma_H$

► Profit functions



# Monopolistic competition - $\uparrow M$

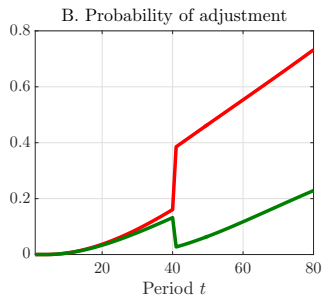
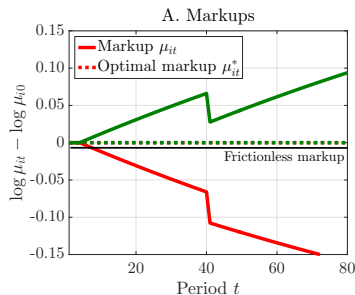


Intensive margin

Extensive margin

► Profit functions

# Monopolistic competition - $\uparrow M$



## Intensive margin

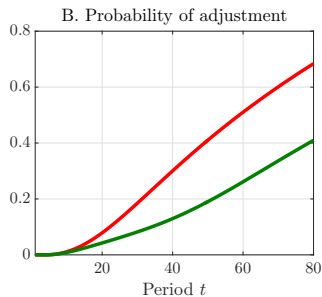
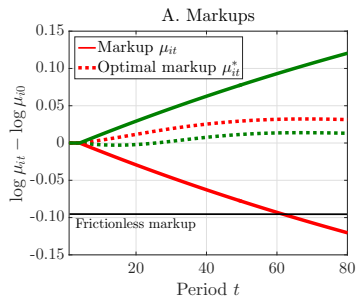
- Optimal price adjustment  $\Delta p_L = \mu_L^* / \mu_L$  increases by  $\Delta M$

## Extensive margin

- Jump in  $\gamma_L$  shifts price change dist. to price increases

► Profit functions

# Duopoly - $\uparrow M$

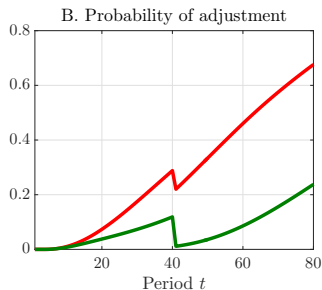
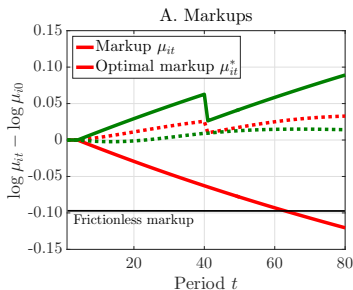


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► Profit functions

## Duopoly - $\uparrow M$



### Intensive margin

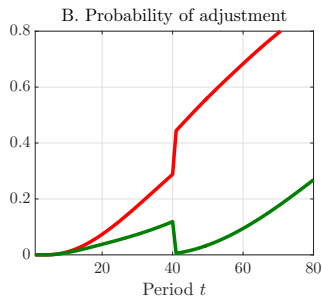
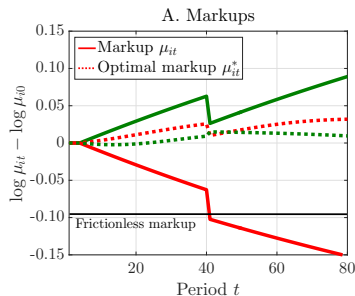
- Dynamic complementarities: Falling  $\mu_H$  reduces  $\mu_L^*$

### Extensive margin

- Lower value of adjustment  $V_L^{adj} - V_L^{stay}$  reduces  $\gamma_L$

► Profit functions

## Duopoly - $\uparrow M$



### Intensive margin

- Optimal adjustment  $\Delta p_L = \mu_L^* / \mu_L$  increases by less than  $\Delta M$

### Extensive margin

- Dampened increase in  $\gamma_L$

## Calibration - What contributes to larger output effects?

---

### Static complementarity

- More substitutable within sectors  $\eta$ , less across sectors  $\theta$

### Dynamic complementarity

- *Which features help firms to track each other's prices in the MPE?*
- Larger menu costs  $\bar{\xi}$
- Smaller idiosyncratic shocks  $\sigma_z$
- Lower trend money growth  $\bar{g}$ ?
- Lower volatility of money growth  $\sigma_g$ ?
- State-dependent (menu cost), rather than Calvo

## Calibration - Strategy (monthly)

### Parameters chosen externally

- Money growth parameters  $\rho_g = 0.6$ ,  $\sigma_g = 0.002$ ,  $\bar{g} = 1.025^{1/12}$
- Cross-sector elasticity  $\theta = 1.5$

### Parameters calibrated internally

- Menu cost  $\bar{\xi}$ , Size of shocks  $\sigma_z$
- Within-sector demand elasticity  $\eta$

### Moments

- Average **absolute size** of regular price changes (IRI) - **10%**
- Average **frequency** of regular price changes (IRI) - **13%**
- Average markup  $\mathbb{E}[\mu_{it}] = 1.30$

▶ Robustness to  $\eta$  in MC model

▶ Data details

▶ Identification of  $\sigma_z, \bar{\xi}, \eta$

## Quantifying the real effects of monetary shocks

- Money supply and nominal demand

$$M_t = P_t C_t$$

- Log deviation from steady-state trend ( $\bar{g} > 0$ )

$$m_t = p_t + c_t$$

- Exogenous  $std[m_t]$
- Endogenous  $std[c_t], std[p_t]$
- Model: Aggregate demand  $\rightarrow$  Price and Output responses



## Calibration - Parameters and results

		Duopoly	MC
<b>A. Parameter</b>			
Across sector demand elasticity	$\theta$	1.5	1.5
Within sector demand elasticity	$\eta$	10.5	4.5
Size of menu cost	$\bar{\zeta}$	0.17	0.21
Size of idiosyncratic shocks	$\sigma_z$	0.04	0.04
<b>B. Moments matched</b>			
Average markup	$\mathbb{E}[\mu_{it}]$	1.30	1.30
Frequency of price change		0.13	0.13
Ave. absolute size of price change		0.10	0.10
<b>C. Results</b>			
Std. deviation consumption	$std[C_t]$	0.31	0.13
Average - Frictionless markup	$\mathbb{E}[\mu_{it}] - \mu_f$	0.10	0.02

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1. 10 ppt larger markups than frictionless economy  $\rightarrow$  Lower output

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- \* **2.5 times** larger output fluctuations (Data: US 1969-2016,  $std[c_t] = 1.01$ )
- 1. **10 ppt** larger markups than frictionless economy  $\rightarrow$  Lower output
- 2. **Same size shocks** deliver observed size of price change

## Calibration - Parameters and results

		Duopoly	MC
<b>A. Parameter</b>			
Across sector demand elasticity	$\theta$	1.5	1.5
Within sector demand elasticity	$\eta$	10.5	4.5
Size of menu cost	$\bar{\zeta}$	0.17	0.21
Size of idiosyncratic shocks	$\sigma_z$	0.04	0.04
<b>B. Moments matched</b>			
Average markup	$\mathbb{E}[\mu_{it}]$	1.30	1.30
Frequency of price change		0.13	0.13
Ave. absolute size of price change		0.10	0.10
<b>C. Results</b>			
Std. deviation consumption	$std[c_t]$	0.31	0.13
Average - Frictionless markup	$\mathbb{E}[\mu_{it}] - \mu_f$	0.10	0.02

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- 3. **25 percent** smaller menu costs deliver same frequency of price change

## Calibration - Parameters and results

		Duopoly	MC	MC'
<b>A. Parameter</b>				
Across sector demand elasticity	$\theta$	1.5	1.5	1.5
Within sector demand elasticity	$\eta$	10.5	4.5	10.5
Size of menu cost	$\bar{\zeta}$	0.17	0.21	0.17
Size of idiosyncratic shocks	$\sigma_z$	0.04	0.04	0.04
<b>B. Moments matched</b>				
Average markup	$\mathbb{E}[\mu_{it}]$	1.30	1.30	1.12
Frequency of price change		0.13	0.13	0.19
Ave. absolute size of price change		0.10	0.10	0.05
<b>C. Results</b>				
Std. deviation consumption	$std[c_t]$	0.31	0.13	0.06
Average - Frictionless markup	$\mathbb{E}[\mu_{it}] - \mu_f$	0.10	0.02	0.01

- \* **2.5 times** larger output fluctuations (Data: US 1969-2016,  $std[c_t] = 1.01$ )
- 1. **10 ppt** larger markups than frictionless economy → Lower output
- 2. **Same size shocks** deliver observed size of price change
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## Accounting for inflation

### Questions

1. Lower price response due to smaller **extensive** or **intensive** margin?
2. Which sectors ( $\mu_{1j}, \mu_{2j}$ ) dampen each margin the most?

### Decomposition *à la* Caballero-Engel (2007)

- One-time unforeseen  $\Delta M_t > 0$

$$\pi_t \approx \sum_{i=1}^N \omega_i \left[ \underbrace{\tilde{\gamma}_{it} (x_{it} - \bar{x}_{it})}_{1. \text{ Intensive}} + \underbrace{\bar{x}_{it} (\gamma_{it} - \tilde{\gamma}_{it})}_{2. \text{ Extensive}} + \underbrace{(\gamma_{it} - \tilde{\gamma}_{it}) (x_{it} - \bar{x}_{it})}_{3. \text{ Covariance}} \right]$$

where  $x_{it} = \log p_{it}^* - \log p_{it-1}$ , is the **desired price change**

## Accounting for inflation

$$\pi_t \approx \sum_{i=1}^N \omega_i \left[ \underbrace{\bar{\gamma}_{it} (x_{it} - \bar{x}_{it})}_{1. \text{ Intensive}} + \underbrace{\bar{x}_{it} (\gamma_{it} - \bar{\gamma}_{it})}_{2. \text{ Extensive}} + \underbrace{(\gamma_{it} - \bar{\gamma}_{it}) (x_{it} - \bar{x}_{it})}_{3. \text{ Covariance}} \right]$$

	Intensive %	Extensive %
Fraction of the difference: $\pi_t^{Mon} - \pi_t^{Duo}$	36	45
Fraction of each margin by $(\mu_{1j}, \mu_{2j})$		
Low-Low	-90	-73
Low-High / High-Low	142	122
High-High	48	51

### Result

- Extensive and intensive margin components dampened  $\approx$  equally
- Low markup sectors become more flexible



## Relation to some of the literature

The duopoly mechanism does not deliver amplification through

- More kurtosis in dist. of price changes (Alvarez Bihan Lippi, 2016) ▶+
- Excess curvature in demand as under Kimball (Klenow Willis, 2016) ▶+

... but does depend on firm's ability to choose when to change prices

- Dynamic complementarities weaker under Calvo ▶+

... and is qualitatively consistent with previous empirical work

- Strategic complementarities in pricing (Gopinath Itskhoki, 2010)
- Counter-cyclical  $\mu$ 's and conc. (Barro Tenreiro, '06; Rotemberg Woodford, '91)
- Prices stickier for differentiated (final) goods (Bils Klenow, 2004)

## Additional results

### 1. Large output losses; menu costs lead to higher markups

▶ Results

### 2. Strategic complementarities in the literature

▶ Results

### 3. Empirical relationship between concentration and flexibility

▶ Results

## Conclusion

### Market structure quantitatively important for understanding

- Aggregate price flexibility following nominal spending shocks
- Firm level price flexibility following idiosyncratic shocks
- Cross-sectional heterogeneity in price flexibility

### Market structure important for macroeconomics

- Increasing concentration and falling labor share  
Autor, Dorn, Katz, Patterson, Van Reenen (2016)
- Increasing concentration and weakening Tobin's  $Q$   $\leftrightarrow$  Investment  
Philippon Gutierrez (2016)

Need macroeconomic models that can speak to these changes!

THANK YOU!

## Household - Solution

Preferences -  $\downarrow z_{ij}$ ,  $\uparrow$  Cost,  $\uparrow$  Demand

$$C = \left[ \int_0^1 C_j^{\frac{1-\theta}{\theta}} dj \right]^{\frac{\theta}{1-\theta}}, \quad C_j = \left[ \left( \frac{c_{1j}}{z_{1j}} \right)^{\frac{1-\eta}{\eta}} + \left( \frac{c_{2j}}{z_{2j}} \right)^{\frac{1-\eta}{\eta}} \right]^{\frac{\eta}{1-\eta}}$$

Demand

$$d_{ij} = z_{ij}^{1-\eta} \left( \frac{p_{ij}}{P_j} \right)^{-\eta} \left( \frac{P_j}{P} \right)^{-\theta} C$$

where

$$P_j = \left[ \left( z_{1j} p_{1j} \right)^{1-\eta} + \left( z_{2j} p_{2j} \right)^{1-\eta} \right]^{\frac{1}{1-\eta}}$$

$$P = \left[ \int_0^1 P_j^{1-\theta} dj \right]^{\frac{1}{1-\theta}}$$

# 1. Output loss due to nominal rigidity

$$Y = \frac{1}{\mu} \quad , \quad \mu = \left[ \int_0^1 \mu_j^{1-\theta} dj \right]^{\frac{1}{1-\theta}} \quad , \quad \mu_j = \left[ \mu_{1j}^{1-\eta} + \mu_{2j}^{1-\eta} \right]^{\frac{1}{1-\eta}}$$

		Mon. Comp.	Duopoly
(1)	Output	0.76	0.75
(2)	... under no dispersion	<b>0.77</b>	<b>0.77</b>
(3)	... with no menu costs	0.78	0.83
(3)-(1)	Output loss due to nominal rigidity	2.4%	9.7%

## Result

- Nearly **10% output losses** due to nominal rigidity in oligopoly
- **1st order** - 75% accounted for by higher markups
- **2nd order** - 25% accounted for by price dispersion

▶ [Back - Additional results](#)

## 2. Strategic complementarities in MC models

### Strategic complementarities

*“Substantial nominal rigidity can arise from a combination of strategic complementarities and nominal frictions” - Ball Romer (1990)*

### Klenow Willis (2016), Burstein Hellwig (2007)

*“Recent work has cast doubt on SC as a source of amplification in menu cost models, by showing that introducing SC’s can make it difficult match size, freq. for plausible values of  $\bar{\xi}$  and  $\sigma_z$ ...this challenge is a serious one” - Nakamura Steinsson (2010)*

### This paper

- Smaller  $\bar{\xi}$  and  $\sigma_z$  under duopoly
- And  $\uparrow \text{std}[c_t]$  through strategic complementarity
- How? Complementarity is between  $\mu_{1jt}$  and  $\mu_{2jt}$ , not  $\mu_{it}$  and  $\mu_t$

▶ Back - Additional results

### 3. Market concentration and price flexibility



### 3. Market concentration and price flexibility

#### 1. Oligopoly

- Lower menu cost in duopoly model
- Prices change less when firms behave strategically
- [Here](#) 1 firm = Non-strategic, 2 firms = Strategic,  $\infty$  firms = Non-strategic

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- More competition  $\rightarrow$  More elastic demand  $\rightarrow$  More price changes

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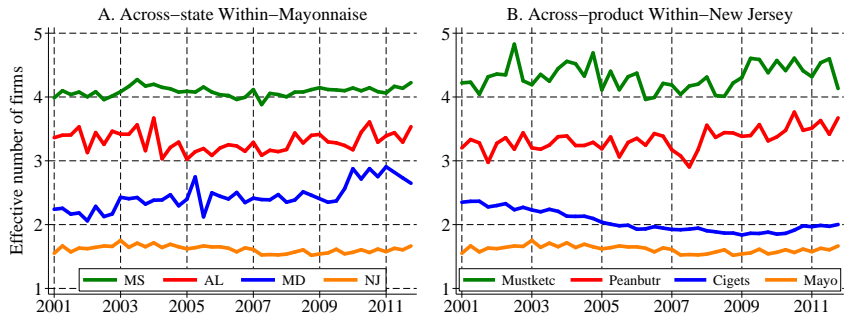
#### 2. Elasticity

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#### Examine correlation structure of IRI data

- U-shaped r'ship between freq of price change and concentration
- Hump-shaped r'ship between size of price change and concentration

### 3. Heterogeneity in market concentration



- Effective number of firms = Inverse Herfindahl Index
- ✓ Variation across states, within product categories
- ✓ Variation across product categories, within states

See: Bronnenburg Dhar Dubé (JPE '09), Bronnenburg Dubé Gentzkow (AER '12)

▶ Robust - Revenue share of top firm

▶ Fig. Cross/within region variation in (i) frequency, (ii) size of price changes

### 3. Regression

	Across-state w/in product		Across-product w/in state	
	Size (%)	Frequency	Size (%)	Frequency
Eff. number of firms	0.244*** (0.037)	-0.912*** (0.161)	0.201*** (0.043)	-0.900*** (0.181)
Eff. number of firms <sup>2</sup>	<b>-0.048***</b> (0.010)	<b>0.171***</b> (0.043)	<b>-0.038***</b> (0.012)	<b>0.228***</b> (0.072)
Observations	32,016	32,016	32,016	32,016
R-squared	0.100	0.106	0.036	0.031
Quarter FE	✓	✓	✓	✓
Rev <sub>pst</sub> control	✓	✓	✓	✓

- Standard errors clustered at **State × Product** level

### Result

- Hump-shaped profiles of price flexibility by market concentration
- Robust to either specification

▶ Estimating equations

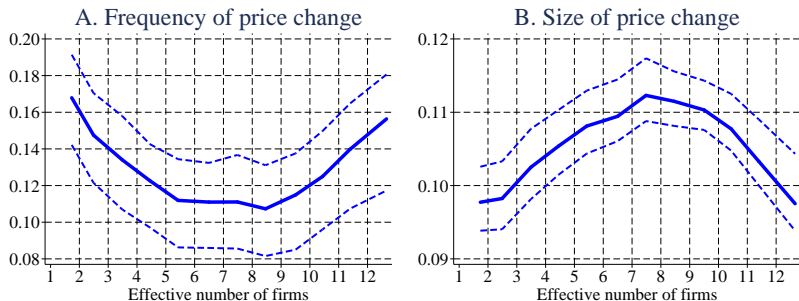
▶ Unweighted

▶ Number of goods weighted

▶ No rev. control

▶ Revenue share

### 3. Average predicted values: Across-state w/in product



Note Solid lines plot the revenue weighted mean of predicted (A.) frequency (B) size of price change from across-state within-product regression. Means are computed within *Effective number of firms* bins of width one. Dashed lines give 25<sup>th</sup>/75<sup>th</sup> percentiles.

#### Model has a causal interpretation of correlations in the data

- Oligopoly forces strong at a small handful of firms, then weaken
- Market structure important for understanding price flexibility

▶ [Back - Additional results](#)

## Extension - Endogenous entry

### Resolve two issues

- **Data** Many small firms with high turnover
- **Theory** Threat of entry may affect pricing:  $\uparrow M, \uparrow \pi$ 
  - Kokovin Parenti Thisee Zhelobodko (2015)

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### 1. Preferences

$$C = \left[ \gamma^{\frac{1}{\eta}} \left[ (z_1 c_1)^{\frac{\eta-1}{\eta}} + (z_2 c_2)^{\frac{\eta-1}{\eta}} \right] + (1 - \gamma)^{\frac{1}{\eta}} C_f^{\frac{\eta-1}{\eta}} \right]^{\frac{\eta}{\eta-1}}$$



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### 2. Endogenous measure $\delta$ of atomistic, one-period firms $k \in [0, \delta]$

$$C_f = \left[ \int_0^{\delta} c_{fk}^{\frac{\rho-1}{\rho}} dk \right]^{\frac{\rho}{\rho-1}}, \quad p_{fk}^* = \frac{\rho}{\rho-1} M, \quad P_f = \delta^{-\frac{1}{\rho-1}} \frac{\rho}{\rho-1} M$$

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### 3. Free-entry determines size of fringe $\pi^f(p_1, p_2, z_1, z_2, M, \delta) - \phi = 0$

## Extension - Exchange-rate pass-through

### Question in trade literature

- Question Euro devalues 10c, BMW reduces US prices by 2.5c?
- Answer BMW competes with Ford, Ford unaffected by shock

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### 1. Preferences

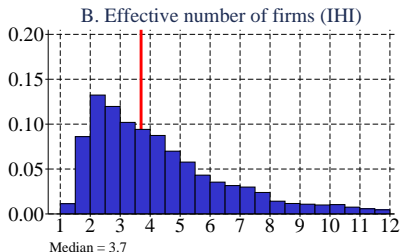
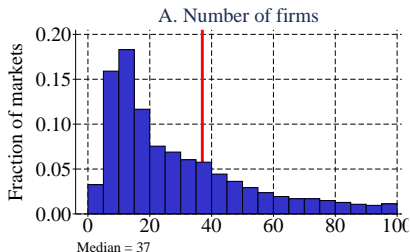
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### 2. Marginal cost

$$mc_j = \frac{W^{1-\alpha_j} (W^*)^{\alpha_j}}{z} + E = \log \left( \frac{W}{W^*} \right) \rightarrow mc_j = \frac{W}{\exp(\alpha_j E)}$$

## Data - Markets are highly concentrated

- **Market** 31 IRI product cat. ( $p$ )  $\times$  46 states ( $s$ )  $\times$  40 quarters ( $t$ )
- **Firm** First 6 digits of barcode (within a product category)
- **Example** In the market for **Mayonnaise** in **Ohio**, **2005:Q1**, of **14 firms**, **Hellmann's** had a **45% revenue share**
- **Example** Herfindahl index of **0.43**, Inverse herfindahl index of **2.3**

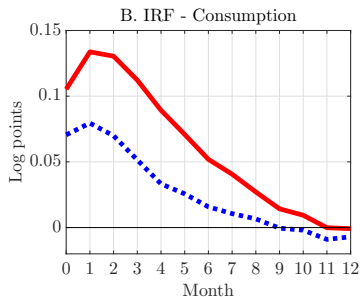
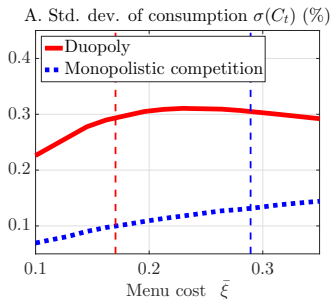


▶ Back - Introduction

▶ Comparison to 6 digit NAICS



# Market structure and monetary non-neutrality



## Results

- Consumption fluctuations are 2.5 times as large
- Cumulative response of output is 2.4 times as large

► Back - Calibration

# Literature

## 1. Monopolistic competition, menu-costs

- Monetary** Golosov Lucas (2007), Nakamura Steinsson (2010), Midrigan (2011), Vavra (2014)  
Alvarez et al. (2016 ×5), Klenow Willis (2016), Burstein Hellwig (2007)
- Inter'l** Itskhoki Gopinath (2010), Itskhoki Mukhin (2016), Berger Vavra (2016)

### New - Dynamic oligopoly

## 2. Oligopoly, flexible prices

- Trade** Atkeson Burstein (2008), Edmond Midrigan Xu (2015), Pennings (2015)
- IO** Hottman Redding Weinstein (2016)

### New - Nominal rigidity

## 3. Dynamic oligopoly, nominal rigidity

- Maskin-Tirole '88, Jun Vives '04, Einav Somaini '13, Nakamura Zerom '10, Neiman '11

### New - Equilibrium macroeconomic model

## Household

$$\mathbf{W}(S, B) = \max_{\{c_{ij}\}, N, \{B(S')\}} \log C - N + \beta \mathbb{E} [\mathbf{W}(S', B(S'))]$$

where

$$C = \left[ \int_0^1 C_j^{\frac{\theta-1}{\theta}} dj \right]^{\frac{\theta}{\theta-1}}, \quad \theta > 1$$

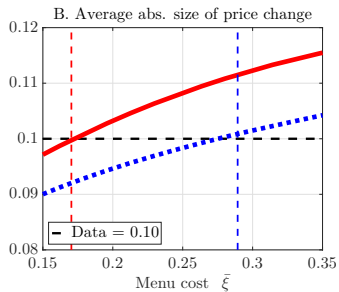
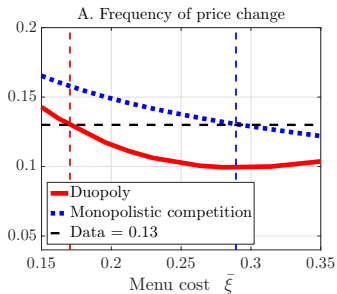
$$C_j = \left[ c_{1j}^{\frac{\eta-1}{\eta}} + c_{2j}^{\frac{\eta-1}{\eta}} \right]^{\frac{\eta}{\eta-1}}, \quad \eta > \theta$$

subject to a nominal budget constraint

$$\underbrace{\int_0^1 [p_{1j}c_{1j} + p_{2j}c_{2j}] dj}_{=M(S)} + \sum_{S'} Q(S, S') B(S') \leq B(S) + W(S)N + \Pi(S)$$

▶ Back - Household preferences

# Menu cost comparative statics



## Calibration - Identification

### Increasing $\xi$

- Costly to adjust. Adjust less often. Widen bounds.
- $\uparrow$  Size,  $\downarrow$  Frequency

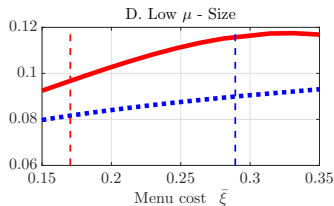
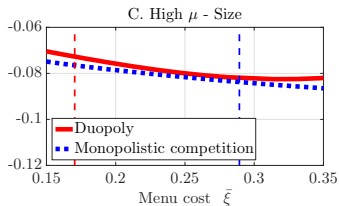
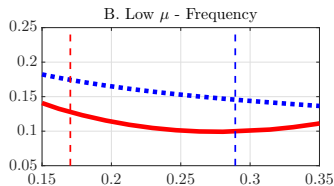
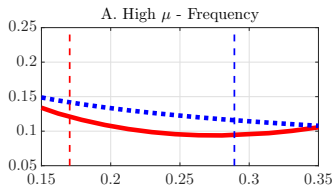
### Increasing $\sigma_z$

- (i) Given bounds. Hit bounds more often.  $\uparrow$  Frequency
- (ii) Hit bounds more often  $\rightarrow$  Widen bounds  $\uparrow$  Size
  - But... Wider bounds  $\rightarrow$   $\downarrow$  Frequency
  - Turns out, direct effect dominates

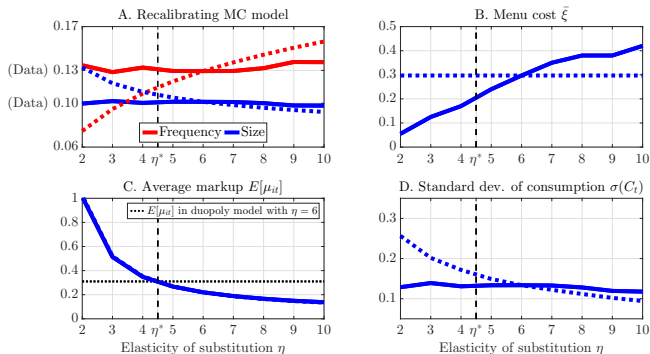
### Increasing $\eta$

- Increase average markup

# Menu cost comparative statics



# Benchmarking models - Robustness



- (A) For each  $\eta$ , choose  $\bar{\xi}$  and  $\sigma_z$  to match the data.
- (B) Lower  $\downarrow \eta \rightarrow$  Profits less sensitive to prices  $\rightarrow$  Require lower  $\downarrow \bar{\xi}$
- (C) Can match  $\mathbb{E}[\mu_{it}] = 1.30$  from duopoly model with  $\eta^* = 4.5$
- (D) **Result** When  $\bar{\xi}$  and  $\sigma_z$  are recalibrated  $\sigma(C_t)$  is unaffected

► Back - Calibration strategy

# Recursive equilibrium - Computation

## Krusell-Smith

- Conjecture price function for  $\mu(S)$

$$\log \mu(S) - \log \bar{\mu} = \alpha_g (\log g(S) - \log \bar{g}) + \alpha_\mu (\log \mu(S_{-1}) - \log \bar{\mu})$$

- Reduces aggregate state to  $S = (\mu_{-1}, g)$

## MPE policy functions

- Approximate expected value function  $V^e(\mu_1, \mu_2, \mu, g)$

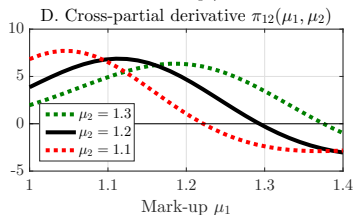
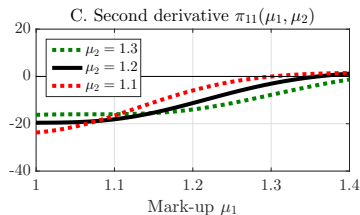
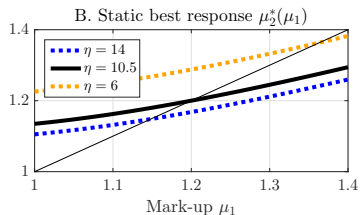
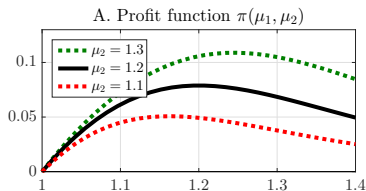
$$V^e(\mu_1, \mu_2, \mu, g) = \int V \left( \frac{\mu_1}{e^{\varepsilon'_1 + g'(g, \varepsilon'_g)}}, \frac{\mu_2}{e^{\varepsilon'_2 + g'(g, \varepsilon'_g)}}, \mu, g'(\mu, \varepsilon'_g) \right) dF(\varepsilon'_1, \varepsilon'_2, \varepsilon'_g)$$

- Cubic splines in  $\mu_1, \mu_2$ . Linear splines in  $\mu, g$
- Guess initial pricing policies  $\mu_{-i}^{(0)'(\mu_i, \mu_{-i}, S)}$  and  $\gamma_{-i}^{(0)'(\mu_i, \mu_{-i}, S)}$
- Given competitor policies, use collocation algorithm to solve for value functions
- Determines new  $\mu_{-i}^{(1)'(\mu_i, \mu_{-i})}$  and  $\gamma_{-i}^{(1)'(\mu_i, \mu_{-i})}$
- Continue, until  $\mu_{-i}^{(k+1)'(\mu_i, \mu_{-i})} = \mu_{-i}^{(k)'(\mu_i, \mu_{-i})}$  and  $\gamma_{-i}^{(k+1)'(\mu_i, \mu_{-i})} = \gamma_{-i}^{(k)'(\mu_i, \mu_{-i})}$

► Back - Recursive equilibrium



# Profit function properties



- Panel B - Best response slope between 0 and 1
- More elastic demand  $\uparrow \eta \rightarrow$  (i)  $\downarrow \mu^*$ , (ii)  $\uparrow$  slope

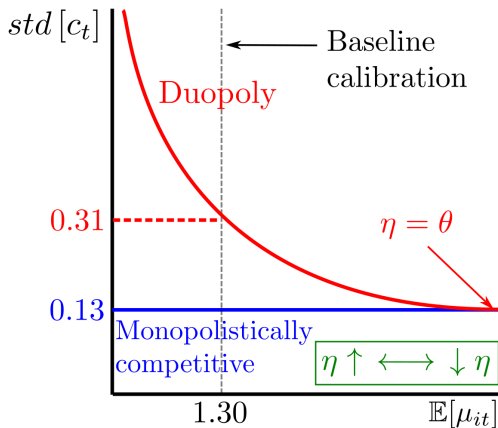
# Calibration and results

		Duopoly	Monopolistic competition			
			Base	Alt. I	Alt. II	Alt. III
<b>A. Parameter</b>						
Elasticity of demand	$\eta$	<b>10.5</b>	4.5	<b>10.5</b>	<b>10.5</b>	<b>6</b>
Size of menu cost	$\bar{\zeta}$	<b>0.17</b>	0.21	<b>0.17</b>	0.42	0.29
Size of shocks	$\sigma_z$	<b>0.04</b>	0.04	<b>0.04</b>	0.04	0.04
<b>B. Moments matched</b>						
Average markup	$\mathbb{E}[\mu_{it}]$	<b>1.30</b>	<b>1.30</b>	1.12	1.13	1.22
Frequency of price change		<b>0.13</b>	<b>0.13</b>	0.19	<b>0.13</b>	<b>0.13</b>
Size of price change		<b>0.10</b>	<b>0.10</b>	0.05	<b>0.10</b>	<b>0.10</b>
<b>C. Results</b>						
Std. deviation consumption	$\sigma(C_t)$	0.31	0.13	0.06	0.13	0.13
Average - Frictionless markup	$\mathbb{E}[\mu_{it}] - \mu^*$	0.10	0.02	0.01	0.02	0.02

- I Parameters same as estimated duopoly model
- II Same  $\eta_m = \eta_d$  re-calibrated  $\bar{\zeta}_m, \sigma_{z,m}$
- III Both models have flexible price markup of **1.20**

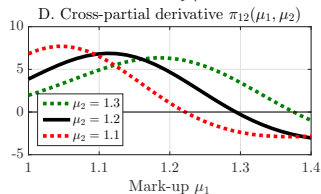
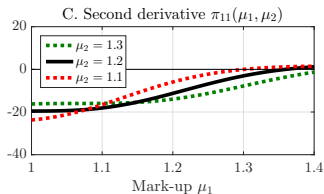
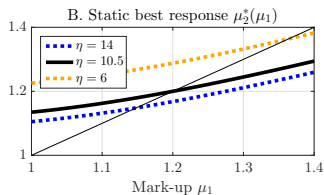
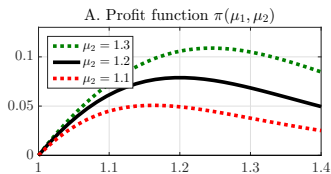
▶ Back - Calibration

## Robustness to target $\mathbb{E}[\mu_{it}]$



▶ Back - Calibration

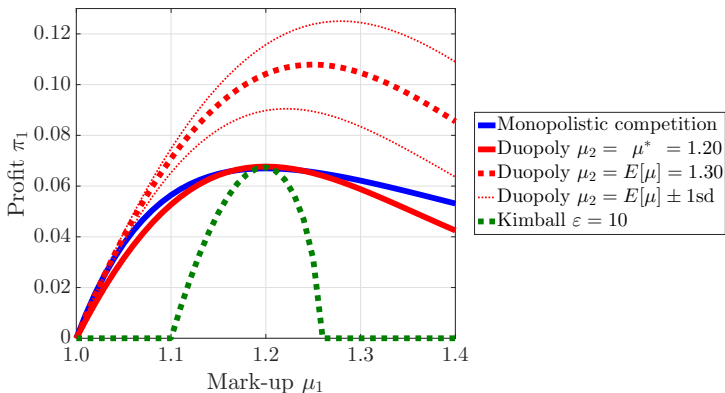
# Profit function properties



- Strategic complementarity driven by  $\pi_{12} > 0$
- Weird property of CES demand functions - Panel D
- As markups increase,  $\pi_{12}$  falls, then becomes negative

▶ [Back - Markups and Values](#)

## Relation to Kimball-style strategic complementarity



- Duopoly demand function super-elasticity  $\varepsilon \in [0.3, 0.7]$
- Literature Klenow Willis -  $\varepsilon = 10$ , Gopinath Itskhoki -  $\varepsilon = 4$

▶ Back - Additional results

▶ Back - Example  $\mu$  policies

# Empirical - Data details

## - IRI data

- An observation is at the **UPC × Category × Store** level
- Stores: 2,000, Years: 2001-2012, Categories: 31
- e.g. Mayonnaise, 2001. Firms: 72, UPCs: 402

## - Observations removed

- Absolute size of price change greater than 99<sup>th</sup> percentile
- Data missing at  $t - 1$

## - Regular price changes

- Price change set to zero  $\Delta \log p_{ict} = 0$
- Possible measurement error:  $\Delta |\log p_{ict}| < 0.001$
- Promotional flag  $Promo_{ict} = 1$
- Items coming off promotion  $Promo_{ict-1} = 1$  &  $Promo_{ict} = 0$

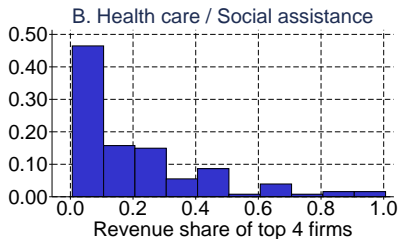
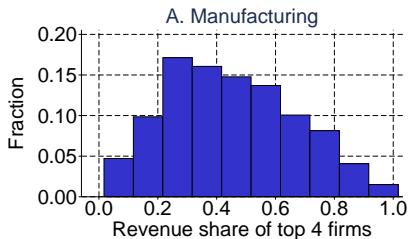
## - Statistics

- All statistics computed monthly for each product category  $c$
- Data is weekly, statistics reported monthly using week three of each month
- e.g. Frequency  $freq_{ct}$  is fraction of  $c$  goods changing price at  $t$

$$freq_{ct} = \sum_{i \in c} \mathbf{1} [d \log p_{ict} \neq 0] / N_{ct}$$

## Comparison to Census Manufacturing

- Data National NAICS 6-digit revenue share of 4 largest firms
- ✓ Few industries are national, e.g. Manufacturing
- ✗ Most industries are local, e.g. Health care

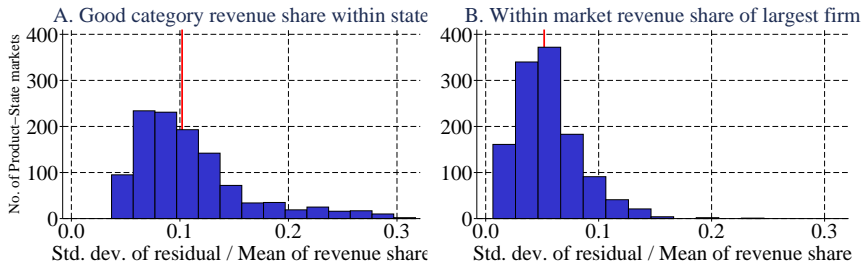


Source: 2007 Economic Census, 6-digit NAICS classification, national level

▶ Back - Introduction

▶ Back - Inverse herfindahl

# Category vs. Firm Revenue Share Fluctuations

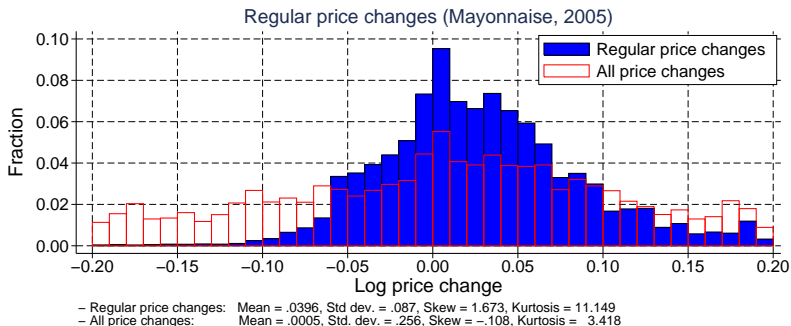


- For each state  $s$ , product category  $p$ , take
- A. Revenue share of product category  $r_{pst} / r_{st}$
- B. Within product category revenue share of largest firm  $r_{pst}^1 / r_{pst}$
- Compute coefficient of variation
- \* Standard deviation computed after removing cubic time trend

▶ Back - Calibration

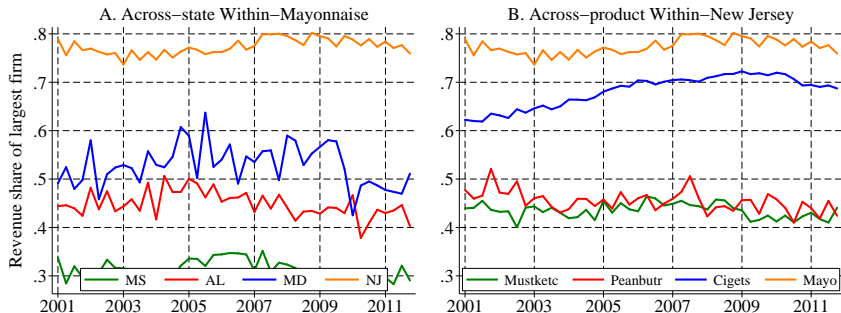


# Empirical - Distribution of price changes



► Back - Empirical - Size of price changes

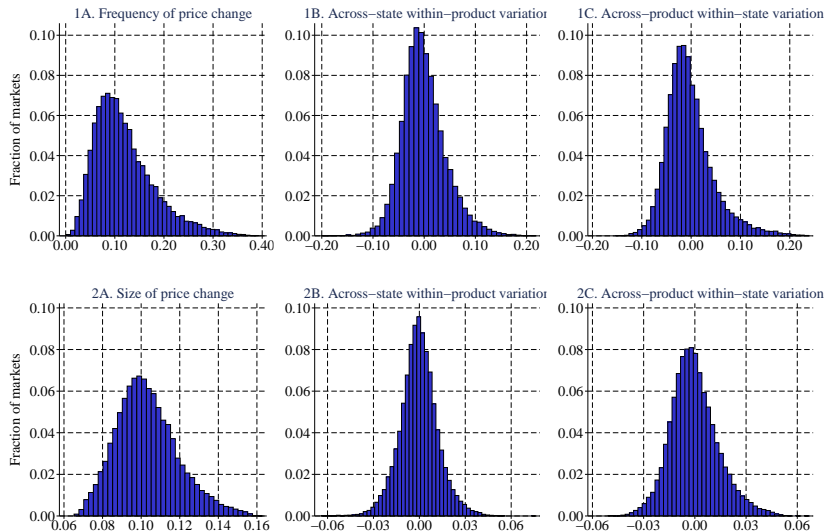
### 3. Variation in market concentration - Share top firm



- ✗ Little time-series variation
- ✓ Variation **across states**, within product categories
- ✓ Variation **across product categories**, within states

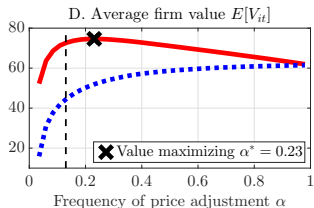
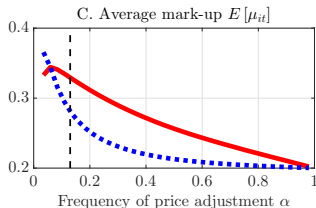
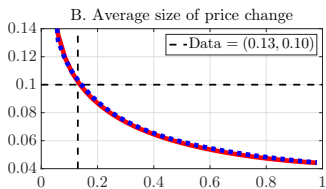
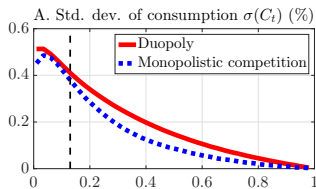
▶ [Back - Variation in concentration](#)

### 3. Variation in price flexibility



▶ [Back - Variation in concentration](#)

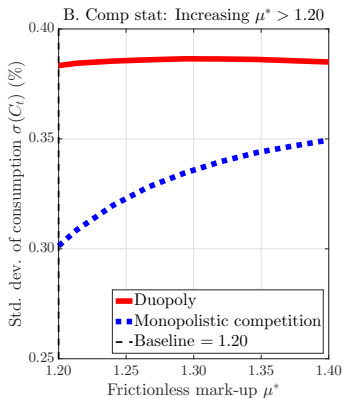
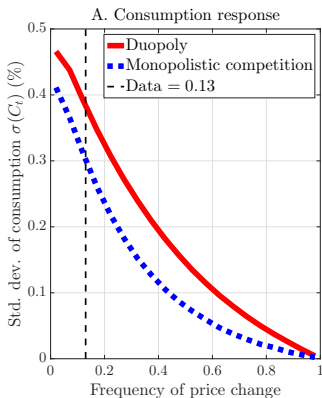
## Varying nominal rigidity in a Calvo rigidity $\alpha$



- DC and MC models converge as  $\alpha \rightarrow 1$
- Optimal exogenous frequency of price adjustment  $\alpha^* = 0.23$

▶ Back - Additional results

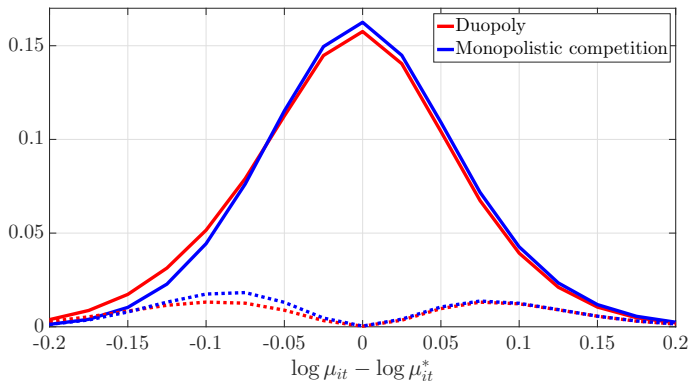
# Comparative statics in Calvo model



- MC - Increasing  $\uparrow \mu^* \rightarrow$  Less substitutable  $\rightarrow P$  responds slowly
- DC - Increasing  $\uparrow \mu^* \rightarrow$  Less substitutable  $\rightarrow p_i$  more flexible

► Back - Additional results

## Distribution of price gaps [solid] and changes [dotted]



- MC - Random  $\xi$  model is between Golosov-Lucas and Midrigan
- DC - Left skewness due to lower price flexibility at low  $\mu$  firms

▶ [Back - Additional results](#)

## Regression - Estimating equations

### Across-state, within-product

- Remove quarter  $t$  mean for each product category, taken across states

$$\left(y_{pst} - \bar{y}_{pt}^s\right) = \alpha_t + \beta_1 \left(x_{pst} - \bar{x}_{pt}^s\right) + \beta_2 \left(x_{pst} - \bar{x}_{pt}^s\right)^2 + \varepsilon_{pst}$$

### Across-product, within-state

- Remove quarter  $t$  mean for each state, taken across product categories

$$\left(y_{pst} - \bar{y}_{st}^p\right) = \alpha_t + \beta_1 \left(x_{pst} - \bar{x}_{st}^p\right) + \beta_2 \left(x_{pst} - \bar{x}_{st}^p\right)^2 + \varepsilon_{pst}$$

### Additional details

- $y_{pst}$  - Size and frequency of price change
- $x_{pst}$  - Measures of market concentration
- Standard errors clustered at **State**  $\times$  **Product** level

▶ Back - Main regression

▶ Data details

## Regression results - Uniformly weighted

	Across-state w/in product		Across-product w/in state	
	Size (%)	Frequency	Size (%)	Frequency
Eff. number of firms	0.205*** (0.018)	-0.664*** (0.088)	0.138*** (0.042)	-0.667*** (0.133)
Eff. number of firms <sup>2</sup>	-0.018*** (0.004)	0.014 (0.017)	-0.017 (0.014)	0.099 (0.070)
Observations	32,016	32,016	32,016	32,016
R-squared	0.061	0.078	0.009	0.016
Quarter FE	✓	✓	✓	✓
Rev <sub>pst</sub> control	✓	✓	✓	✓

- Standard errors clustered at **State** × **Product** level

### Result

- Hump-shaped profiles of price flexibility by market concentration
- Robust to either source of variation

▶ [Back - Main regression](#)



## Regression results - Number of goods weighted

	Across-state w/in product		Across-product w/in state	
	Size (%)	Frequency	Size (%)	Frequency
Eff. number of firms	0.186*** (0.034)	-0.516*** (0.134)	0.147*** (0.051)	-0.661*** (0.176)
Eff. number of firms <sup>2</sup>	-0.024*** (0.007)	0.026 (0.031)	-0.030** (0.015)	0.177** (0.074)
Observations	32,016	32,016	32,016	32,016
R-squared	0.061	0.078	0.009	0.016
Quarter FE	✓	✓	✓	✓
Rev <sub>pst</sub> control	✓	✓	✓	✓

- Standard errors clustered at **State × Product** level

### Result

- Hump-shaped profiles of price flexibility by market concentration
- Robust to either source of variation

▶ [Back - Main regression](#)

## Regression results - No revenue control

	Across-state w/in product		Across-product w/in state	
	Size (%)	Frequency	Size (%)	Frequency
Eff. number of firms	0.244*** (0.038)	-0.956*** (0.181)	0.220*** (0.043)	-0.894*** (0.181)
Eff. number of firms <sup>2</sup>	-0.048*** (0.010)	0.183*** (0.050)	-0.041*** (0.012)	0.227*** (0.072)
Observations	32,016	32,016	32,016	32,016
R-squared	0.100	0.095	0.028	0.031
Quarter FE	✓	✓	✓	✓
Rev <sub>pst</sub> control	✗	✗	✗	✗

- Standard errors clustered at **State** × **Product** level

### Result

- Hump-shaped profiles of price flexibility by market concentration
- Robust to either source of variation

▶ [Back - Main regression](#)

## Regression results - Rev. share top firm

	Across-state w/in product		Across-product w/in state	
	Size (%)	Frequency	Size (%)	Frequency
Rev. share top firm	-1.411*** (0.428)	7.727*** (2.015)	-1.436*** (0.392)	6.099*** (2.286)
Rev. share top firm <sup>2</sup>	-9.739*** (1.964)	16.939** (7.817)	-3.546 (3.126)	13.318 (17.419)
Observations	32,016	32,016	32,016	32,016
R-squared	0.133	0.107	0.027	0.016
Quarter FE	✓	✓	✓	✓
Rev <sub>pst</sub> control	✓	✓	✓	✓

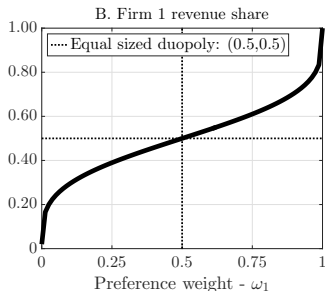
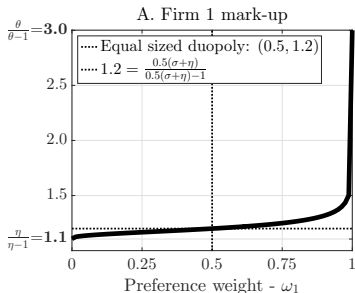
- Standard errors clustered at **State** × **Product** level

### Result

- Hump-shaped profiles of price flexibility by market concentration
- Robust to either source of variation

▶ [Back - Main regression](#)

## Static Nash - Varying $\omega_1$



### Preferences

$$C = \left[ \int_0^1 C_j^{\frac{\theta-1}{\theta}} dj \right]^{\frac{\theta}{\theta-1}} \quad C_j = \left[ \omega_1 c_{1j}^{\frac{\eta-1}{\eta}} + (1-\omega_1) c_{2j}^{\frac{\eta-1}{\eta}} \right]^{\frac{\eta}{\eta-1}}$$

- As  $\omega_1 \rightarrow 1$ ,  $\mu_1$  converges to monopolistically comp. markup under  $\theta$
- As  $\omega_1 \rightarrow 0$ ,  $\mu_1$  converges to monopolistically comp. markup under  $\eta$

► Back - Nested models