

# **Aggregation in Heterogeneous-Firm Models**

## **Theory and Measurement**

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# Investment in General Equilibrium

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**This paper:** theory & measurement for strength of **GE aggregation**

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- Estimate cross-sectional tax stimulus regressions [*à la* Zwick-Mahon (2017)]

$$\log(i_{jt}) = \underbrace{\beta_{ZM}}_{\approx -7\%} \times \text{cost of capital}_{jt} + \text{controls} + \text{error}$$

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## 3. Applications: state dependence in monetary & fiscal policy transmission

# Theory

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- At the end of the talk: extension to **financial frictions**
  - Similar result: limit case where  $\frac{dI}{d\text{shock}} \perp \# \text{ of borr.-constrained firms}$

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$$\max \quad \mathbb{E}_0 \left[ \sum_{t=0}^{\infty} \left( \prod_{s=0}^{t-1} \frac{1}{1 + r_s^b} \right) d_{jt} \right]$$

such that

$$d_{jt} = x_t y_{jt} - w_t \ell_{jt} - q_t i_{jt} - \phi(k_{jt}, k_{jt-1})$$

$$y_{jt} = z_t e_{jt} (k_{jt-1}^\alpha \ell_{jt}^{1-\alpha})^\nu$$

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- **Rest:** representative household, sticky prices & wages, Taylor rule, ...

*Smets-Wouters (2007), Justiniano-Primiceri-Tambalotti (2010), ...*

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## Assumption

► Nested Models

Let  $\mathbf{p} = (\mathbf{r}, \mathbf{x}, \mathbf{w}, \mathbf{q})$  denote a price path. There exists a function  $\mathcal{P}(\bullet)$ , independent of the production block, s.t. an equilibrium is a path  $\mathbf{C}$  with

$$C_t = Y_t(\mathbf{p}; \mathbf{z}) - I_t(\mathbf{p}; \mathbf{z}) \equiv C_t^s, \quad \text{for } t = 0, 1, 2, \dots$$

where  $\mathbf{p} = \mathcal{P}(\mathbf{C})$ .

# Exact Aggregation

R3 To build intuition: **reduced-form model of lumpy investment**

- Special adjustment costs: fraction  $\xi \in (0, 1)$  of firms has infinite adjustment costs, the rest zero
- $1 - \xi = \#$  of adjusters is reduced-form stand-in for changes in  $\mu_0$

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$$\hat{\mathbf{l}}_\xi(\mathbf{p}; \mathbf{z}) - \hat{\mathbf{l}}_0(\mathbf{p}; \mathbf{z}) = -\xi \times \hat{\mathbf{l}}_0(\mathbf{p}; \mathbf{z}), \quad \text{for any } (\mathbf{p}, \mathbf{z})$$

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- **Not necessarily in GE**

## Proposition

Impose R1 - R3, and let  $\nu \rightarrow 1$  or  $\bar{r} + \delta \rightarrow 0$ . Then the equilibrium price paths  $\mathbf{p}$  and the investment path  $\mathbf{I}$  are independent of  $\xi$ . ▶ vs. House (2014)

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- **Q:** How does **p** respond to changes in  $\xi$ ?

$$\mathbf{Y}(\mathcal{P}(\mathbf{C}); \mathbf{z}) - \mathbf{I}(\mathcal{P}(\mathbf{C}); \mathbf{z}) = \mathbf{C}$$



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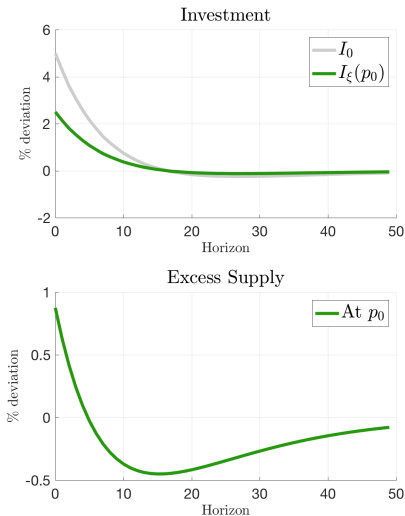
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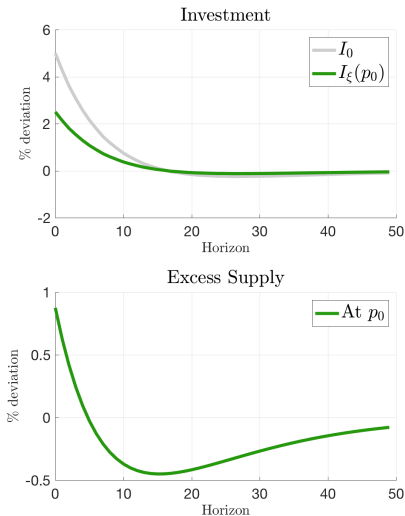
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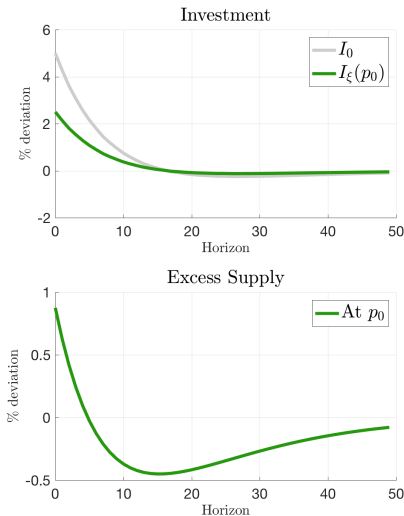
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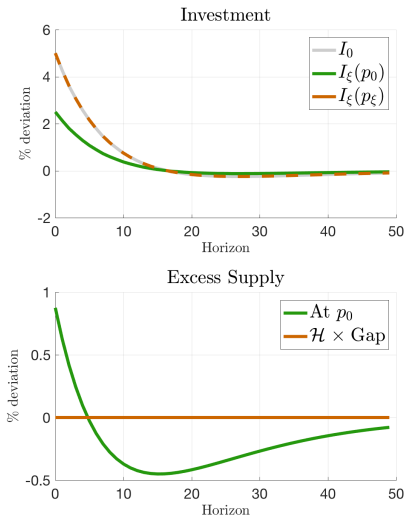
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Same eq'm characterization with general fixed costs:

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→ Thus:  $I$  is highly elastic around eq'm price path of rep.-firm economy



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⏟  
Distinguish using response of  $\mathbf{r}$  to  $\mathbf{z}$ ? Here instead: **measure  $\beta$ !**

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  - Policy: ability to temporarily write-off/tax-deduct investment at a faster rate
  - Research design: DiD using heterogeneity in treatment by  $\delta_j$  [Zwick-Mahon]

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$\beta_{ZM} \approx -7\%$ . What does that tell us?

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## Proposition

*Extend the baseline model to allow for permanent heterogeneity in  $\{\delta_j\}$ . Let*

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*where  $q$  is the cost of capital and  $\tilde{\mu}$  is the truncated firm state distribution.*

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A2 All firms respond identically to the **movements in p** induced by the policy.

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$$\beta_{ZM} \xrightarrow{p} \tilde{\beta} + \underbrace{\frac{\text{Cov}_{\tilde{\mu}(s)} \left( \left( \frac{\partial \log(i_t(s))}{\partial q_t} - \tilde{\beta} \right) q_t(s), q_t(s) \right)}{\text{Var}_{\tilde{\mu}(s)}(q_t(s))}}_{\text{selection effect}}$$

# Estimand Interpretation

$$\log(i_{jt}) = \alpha_j + \delta_t + \beta_{ZM} \times q_{jt}(\delta_j) + \text{error}$$

A1 Investment is equally price-elastic at all (adjusting) firms.

A2 All firms respond identically to the movements in  $\mathbf{p}$  induced by the policy.

## Proposition

Extend the baseline model to allow for permanent heterogeneity in  $\{\delta_j\}$ . Let

$$\tilde{\beta} \equiv \int_{s: i_t(s) > 0} \frac{\partial \log(i_t(s))}{\partial q_t} d\tilde{\mu}(s)$$

where  $q$  is the cost of capital and  $\tilde{\mu}$  is the truncated firm state distribution. Then, to first order,

$$\beta_{ZM} \xrightarrow{p} \tilde{\beta} + \underbrace{\frac{\text{Cov}_{\tilde{\mu}(s)} \left( \left( \frac{\partial \log(i_t(s))}{\partial q_t} - \tilde{\beta} \right) q_t(s), q_t(s) \right)}{\text{Var}_{\tilde{\mu}(s)}(q_t(s))}}_{\text{selection effect}} + \underbrace{\frac{\text{Cov}_{\tilde{\mu}(s)} \left( \frac{\partial \log(i_t(s))}{\partial \mathbf{p}} \hat{\mathbf{p}}, q_t(s) \right)}{\text{Var}_{\tilde{\mu}(s)}(q_t(s))}}_{\text{heterogeneous GE exposure}}$$

# Results

$$\log(i_{jt}) = \alpha_j + \delta_t + \beta_{ZM} \times q_{jt}(\delta_j) + \text{error}$$

- **Headline number:**  $\beta_{ZM} \approx -7\%$  [Details, Robustness & Extensions](#)
  - Estimation details: “universe” (corporate tax return data), pool two bonus depreciation episodes,  $b_{jt}$  at 4-digit industry level
  - Extensions/robustness: Compustat, dynamics, GDP & trend interactions, extensive margin,  $b_{jt}$  at firm level ...

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- **Interpretation:**  $|\beta| \leq |\beta_{ZM}|$ 
  1. Back-of-the-envelope (Model + A1):  $\beta = \beta_{ZM} \approx -7\%$
  2. Indirect inference (Model +  $\approx$  A2):  $\beta \approx -5\%$ 
    - Add  $\beta_{ZM}$  as estimation target (“identified moment”) in rich het.-firm model with two depreciation types, persistent  $z$  shocks, aggregate effects, in recession, ...
    - Upward bias due to selection effect, GE exposure effect is small



# **Applications**

# Monetary Policy: Pushing on a String

**Q:** Why does monetary policy seem to “push on a string” in recessions?

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  1. “**PE calibration**”:  $\mathbb{E}(i)$ ,  $\sigma(i)$ , spike rate, inaction rate
  2. “**GE calibration**”:  $\beta_{ZM}$  plus standard non-production block

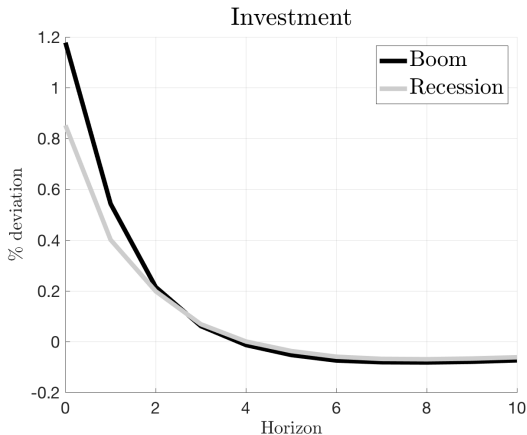
# Monetary Policy: Pushing on a String

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  1. “**PE calibration**”:  $\mathbb{E}(i)$ ,  $\sigma(i)$ , spike rate, inaction rate
  2. “**GE calibration**”:  $\beta_{ZM}$  plus standard non-production block
- Find: pushing-on-a-string in **PE** & **GE**
  - $i$  is 70% more responsive **given prices**, and 40% more responsive in **GE**
  - Without  $\beta_{ZM}$  targeted: asymmetry disappears [*Smets-Wouters + Khan-Thomas*]

# Monetary Policy: Pushing on a String

**Q:** Why does monetary policy seem to “push on a string” in recessions?



# Fiscal Policy & Firm Cash Flow

- In paper: theory & measurement with **financial frictions** [▶ Details](#)

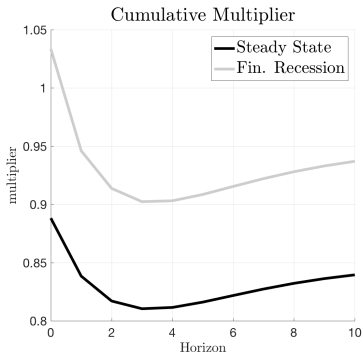
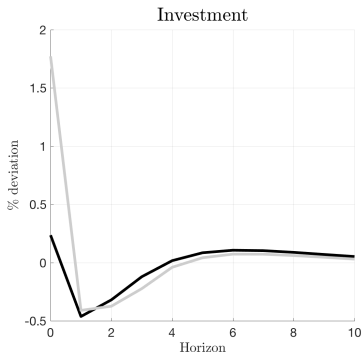
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# Conclusions

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## 1. Investment price elasticities are central to **GE aggregation**

- Applies to smoothing for lumpy investment/durables & financial frictions
- Reduces disagreement in previous work to measurable “sufficient statistic”

*Khan-Thomas (2008), Bachmann-Caballero-Engel (2013), Winberry (2018)*

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# Conclusions

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## 2. Preferred **direct measurement** suggests weak GE price effects

## 3. Implications: **$\mu_0$ matters** – but in which direction?

- Pro- or counter-cyclical? lumpiness vs. cash-flow effects
- Matters because investment takes center stage in (monetary) policy stimulus

*[e.g. Christiano-Eichenbaum-Evans, Kaplan-Moll-Violante, ...]*

# Appendix

# Model Closure

- Explicit closure: medium-scale NK-DSGE model

*close to Smets-Wouters (2007) and Justiniano-Primiceri-Tambalotti (2010)*

- With mild additional restrictions this model satisfies R2:

## Lemma

*Suppose that:*

1. *Labor disutility is linear.*
2. *The coefficient on output in the Taylor rule is 0.*
3. *There are no aggregate capital adjustment costs.*

*Then, to first order, the full structural model satisfies R2. If prices and wages are flexible, then R2 is satisfied globally.*

# Relation to House (2014)

- Flat investment curve logic is related to House (2014)
  - He shows: in investment re-set model with  $\delta \rightarrow 0$  investment timing is infinitely elastic w.r.t.  $q$
  - Implies: in eq'm model of investment market distribution  $\mu_0$  is irrelevant
- How does our result generalize this?
  1. Rich GE model closure, rather than just investment market
  2. Aggregation not just for long-lived capital goods, also for linear revenue f'n
  3. Result is generic: infinite elasticity around rep.-firm eq'm price path, doesn't matter what friction delivers a gap given prices



# General Equilibrium Adjustment $\mathcal{H}$

- $\mathcal{H}$  combines supply and demand price elasticities:

$$\mathcal{H} = \frac{\partial \mathcal{P}}{\partial \mathbf{C}} \times (\mathbf{I} - \mathcal{G})^{-1}$$

where

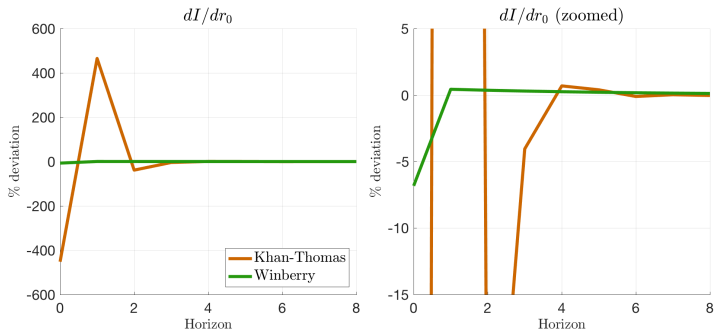
$$\mathcal{G} \equiv \underbrace{\begin{pmatrix} \frac{\partial C^s}{\partial r} & \frac{\partial C^s}{\partial p^I} & \frac{\partial C^s}{\partial w} & \frac{\partial C^s}{\partial q} \end{pmatrix}}_{\text{Supply Elasticity}} \times \underbrace{\begin{pmatrix} \frac{\partial r}{\partial C} & \frac{\partial p^I}{\partial C} & \frac{\partial w}{\partial C} & \frac{\partial q}{\partial C} \end{pmatrix}}_{\text{Inverse Demand Elasticity}}$$

- Note: unique left-inverse of  $(\mathbf{I} - \mathcal{G})$  is guaranteed if eq'm is unique
- R1-R3: for  $\nu = 1$  or  $\bar{r} + \delta = 0$ , the map  $\mathcal{H}$  is column rank-deficient, with

$$\{\hat{\mathbf{C}}_{\xi}^s(\mathbf{p}_0; \mathbf{z}) - \hat{\mathbf{C}}_0^s(\mathbf{p}_0; \mathbf{z}) \in \text{null}(\mathcal{H})\}$$

# Khan-Thomas (2008) vs. Winberry (2018)

What do PE price elasticities look like in previous work?

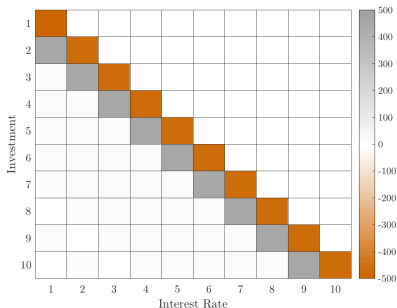


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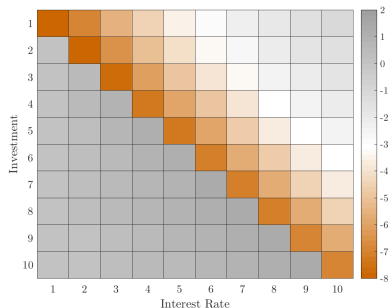
# Khan-Thomas (2008) vs. Winberry (2018)

The implied GE adjustment matrices look dramatically different:

(a) Khan & Thomas (2008)



(b) Winberry (2018)



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# Standard Calibration Targets

- Investment lumpiness
  - All previous work matches  $\mathbb{E}(i)$ ,  $\sigma(i)$ , spike rate, inaction rate
  - Implies: price elasticity  $\perp$  lumpiness
- Aggregate prices
  - Winberry (2018): real rate is acyclical
  - Concerns
    1. Cyclical conditional on  $z$  is ill-measured
    2. Theory: arbitrary rate cyclical is consistent with aggregation
- Investment rate dispersion
  - Dispersed  $e$  + high elasticity  $\Rightarrow$  dispersed  $i$
  - Direct evidence on  $e$  suggests large dispersion  $\Rightarrow$  need small elasticities

# Bonus Depreciation

- What is bonus depreciation?
  - In general: for every \$ of investment reduce future tax liabilities
  - With bonus depreciation: tax reductions come earlier = PV benefit
- Computation of exposure term:

$$q_{jt}(\delta_j) = \sum_{t=0}^{\infty} \zeta^t \left( \prod_{q=0}^{\infty} \frac{1}{1 + r_{q-1}^b} \right) \tau_t^b(\delta_j)$$

- Formal equivalence to reduction in price of capital:

## Lemma

*The paths of all aggregates in response to an unexpected bonus depreciation shock with firm-specific schedules  $\{\tau_{jt}^b\}_{t=0}^{\infty}$  are identical to response paths after a period-0 firm-specific investment subsidy shock with*

$$\tau_{j0}^i = \tau_{j0}^b + \sum_{t=1}^{\infty} \zeta^t \left( \prod_{q=1}^{\infty} \frac{1}{1 + r_{q-1}^b} \right) \tau_{jt}^b$$

# Estimation Details

- We extend the baseline analysis of Zwick & Mahon (2017):
  1. Compustat sample: larger firms, arguably less financially constrained
  2. Quarterly, dynamics: less time aggregation, learn about all entries of  $\mathcal{H}$
  3. More controls: partial out heterogeneous exposure to aggregate conditions

EXTENSION OF ZWICK & MAHON (2017)

Dependent Variable:	$\log(i_{j,t})$	$\log(i_{j,t+1})$	$\log(i_{j,t+2})$	$\log(i_{j,t+3})$	$\log(i_{j,t+4})$
$z_{n,t}$	1.64*** (0.28)	1.19*** (0.28)	0.78*** (0.29)	0.31 (0.29)	-0.12 (0.30)
GDP Interaction	x	x	x	x	x
Trend Interaction	x	x	x	x	x
Firm & Time FEs	x	x	x	x	x
Observations	406,807	401,428	390,561	381,156	372,078
R-squared	0.85	0.85	0.85	0.86	0.86

# Monetary Policy Application

- Standard NK parameterization for non-production (demand) block  
→ Robustness: habits,  $\phi_y > 0$ , non-linear labor disutility

DEMAND BLOCK PARAMETERIZATION

Parameter	Description	Value
$\beta$	Discount rate	1/1.04
$h$	Habit formation	0
$\gamma$	CRRA coefficient	1
$\varphi$	Frisch elasticity	$\infty$
$\epsilon_p$	Goods substitutability	10
$\theta_p$	Price adjustment cost	40
$\epsilon_w$	Wage substitutability	10
$\theta_w$	Wage adjustment costs	100
$\kappa$	Aggregate $K$ adjustment costs	0
$\rho_{tr}$	Taylor rule persistence	0.75
$\phi_\pi$	Taylor rule inflation coefficient	1.5
$\phi_y$	Taylor rule output coefficient	0

# Monetary Policy Application

- Firm block: target **PE moments** + **GE price sensitivity**

PARAMETER VALUES

Parameter	Description	Value
<i>Fixed Parameters</i>		
$1 - \xi$	Firm exit rate	0.065
$\delta$	Depreciation rate	0.067
$\alpha$	Capital share	0.310
$\nu$	Returns to Scale	0.870
$\rho$	Productivity persistence	0.890
$\sigma$	Productivity dispersion	0.250
$\mu_0$	Mean initial productivity	-0.375
$\sigma_0$	Initial productivity dispersion	0.330
<i>Fitted Parameters</i>		
$\kappa$	Quadratic adjustment costs	0.762
$\vartheta$	Investment irreversibility	0.781
$\bar{\xi}$	Upper bound on fixed costs	0.450
$a$	Size of region without fixed costs	0.030
$k_0$	Capital of entrants	0.600

TARGETED MOMENTS

Target	Data	Model
<i>Price Sensitivity</i>		
Bonus depreciation estimand	2.890	2.984
<i>Micro Investment</i>		
Average investment rate	0.104	0.087
Std. of investment rates	0.160	0.147
Spike rate	0.144	0.108
Inaction rate	0.237	0.184
<i>Employment Distribution</i>		
Employment share of age-1 firms	0.016	0.028



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$\theta_w$	Wage adjustment costs	100
$\kappa$	Aggregate $K$ adjustment costs	0
$\rho_{tr}$	Taylor rule persistence	0.75
$\phi_\pi$	Taylor rule inflation coefficient	1.5
$\phi_y$	Taylor rule output coefficient	0

# Financial Frictions

- **Theory**

- Allow for constraints on borrowing & dividend issue:

$$b_{jt} \leq \Gamma(q_t k_{jt-1}, \pi_{jt})$$

$$d_{jt} \geq \underline{d}$$

- Aggregation theorem for fringe  $\xi$  of firms relying on retained earnings

- **Measurement**

- Problem:  $q_{jt}(\delta_j)$  ceases to be a sufficient statistic for stimulus policy
- Approach: model simple form of bonus depreciation without additional state variable, then implement indirect inference

# Fiscal Policy Application

- Firm block: target **PE moments** + **GE price sensitivity**

PARAMETER VALUES		
Parameter	Description	Value
<i>Fixed Parameters</i>		
$\underline{d}$	Dividend constraint	0
<i>Fitted Parameters</i>		
$\kappa$	Quadratic adjustment costs	1.280
$\vartheta$	Investment irreversibility	0.790
$\bar{\xi}$	Upper bound on fixed costs	0.00
$a$	Size of region without fixed costs	0.00
$\theta$	Earnings-based borrowing constraint	3.000
$k_0$	Capital of entrants	0.420
$b_0$	Debt of entrants	0.180

TARGETED MOMENTS		
Target	Data	Model
<i>Price Sensitivity</i>		
Bonus depreciation response	2.890	3.348
<i>Micro Investment</i>		
Average investment rate	0.104	0.136
Std. of investment rates	0.160	0.131
Spike rate	0.144	0.257
Inaction rate	0.237	0.205
<i>Financial Frictions</i>		
Earnings-based borrowing constraint	3.000	3.000
Entrants debt/output	1.280	1.501
<i>Employment Distribution</i>		
Employment share of age-1 firms	0.016	0.018

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