

# Productivity, Demand and Growth

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## Motivation: sources of aggregate economic growth

State of the art: aggregate growth driven by firm lifecycle dynamics

- Aggregate growth: R&D, creative destruction, selection, and reallocation
  - Aghion, Howitt (1992), Klette, Kortum (2004), Acemoglu et al. (2018), Akcigit, Kerr (2018)

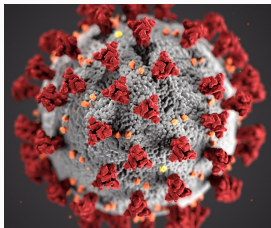
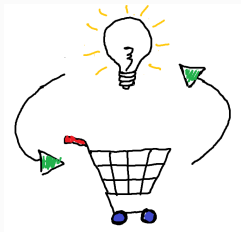
Data: firm selection and growth largely driven by demand side!

- e.g. Foster et al. (2008), Foster et al. (2016), Hottman et al. (2016), Cavenaile, Roldan-Blanco (forthcoming), Cavenaile et al. (2021), Eslava, Haltiwanger (2021)

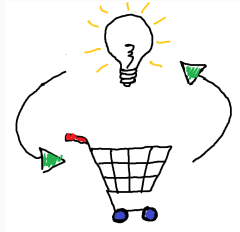
**This paper** brings frictional demand into an endogenous growth model

- firms invest into R&D to raise own productivity
- AND invest into increasing demand for own products

## Main idea in pictures - demand spurring innovation



## Main idea in pictures - innovation creating demand



## Our contribution

### Firm lifecycle dynamics driven by more than just productivity

- Add to the empirical results on interactions between market size, and firm-level R&D
  - Fiscal policy shocks as an instrument, study firm-level R&D over firm lifecycle

### Build endogenous growth model with frictional customer base accumulation

- analytically show new channel affecting R&D decisions
- **feedback loop between customer base and productivity at the firm-level**

### Quantitative results show that the customer base accumulation

- drives 20% of aggregate economic growth
- is the key determinant of the sensitivity of the economy to growth policies

# Roadmap

Theoretical framework

Quantitative Results

- Firm-level outcomes

- Aggregate growth

- Sensitivity to growth policies

Empirical Support for Key Model Predictions

Conclusion

## Representative household: max lifetime utility s.t. budget

- consumes composite good (price  $P = 1$ ), investments (firm equity), and supplies inelastically labor

$$C = \left[ \int_{j \in \Omega} b_j^{\frac{1}{\eta}} c_j^{\frac{\eta-1}{\eta}} dj \right]^{\frac{\eta}{\eta-1}}$$

- $\Omega_j$ : mass of firms (set of goods),  $\eta$ : elasticity of substitution between varieties
- $c_j$ : quantity of consumption variety produced by firm  $j$
- $b_j$ : “demand shifter (weight)” or tastes for good  $j$

Optimal decisions:

$$c_j = b_j p_j^{-\eta} C, \quad 1 = \beta(1 + R') \frac{C}{C'}$$

## Firms: Entry/exit, production and R&D as in Akcigit and Kerr (2018)

- Firms produce goods varieties  $c_j = q_j n_j$
- Pay fixed operating cost to continue
- Invest into R&D in order to improve  $q_j$ ,  $x_j$  is the success probability

$$\underbrace{s_j}_{\text{researchers}} = \underbrace{(n_j)^\sigma}_{\text{production employees}} \times \underbrace{x_j^\psi}_{\text{prob. of a success}}, \quad \psi > 1 \text{ and } \sigma > 0,$$

$$v(q_j, b_j) = \max_{p, c, x, b'} \left[ \begin{array}{c} p_j c_j - W_t (n_j + s_j) + \\ \frac{1-\delta}{1+R'} \mathbb{E} \left\{ x_j v^+(q_j(1+\lambda), b'_j) + (1-x_j) v^+(q_j, b'_j) \right\} \end{array} \right]$$



## Customer capital accumulation as in Foster et al. (2016)

- customer capital:  $b_j = \chi d_j^\gamma$
- exogenous component:  $\ln \chi' = \rho_\theta \ln \chi + \epsilon_j$ ,  $\epsilon_j \sim IID(0, \sigma_\epsilon^2)$
- endogenous component:  $\ln d'_j = (1 - \zeta) \underbrace{[(1 - \rho_d) \ln d_j + \pi_j]}_{\text{passive changes}} + \zeta \underbrace{\ln \left( \frac{c_j p_j}{C} \right)}_{\text{active changes}}$
- “passive changes” (growing-by-being, age effects)
  - $\pi_j$ : firm-specific, potentially varying, life-cycle growth factor
- “active changes” (growing-by-doing): **strategic pricing** [▶ details](#)

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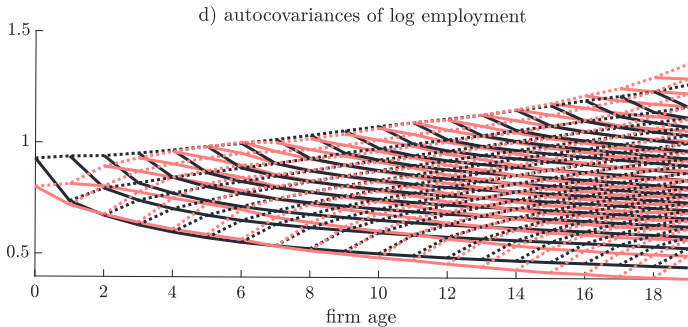
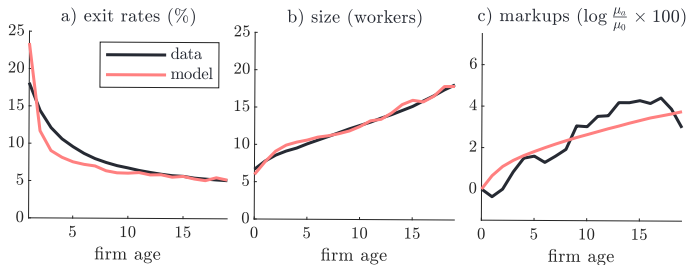
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## Parametrization strategy: Joint estimation

- Standard choices
  - step size,  $\lambda$ : aggregate growth (real GDP)
  - R&D cost elasticity,  $\psi$ : empirical studies suggest  $\psi = 2$
  - R&D cost scaling with size,  $\sigma$ : R&D share – firm size (**Compustat**)
- **Key novelty: separation between productivity and customer capital at the firm-level**
  - optimal pricing implies markup lifecycle profile:  $\zeta$  (**Compustat**)
  - match model to estimated profile from firm-level data (**Compustat**)
  - life-cycle profiles of size, exit and autocovariance structure to discipline remaining shocks (**BDS**)
  - following Sterk (r) al. (2021)

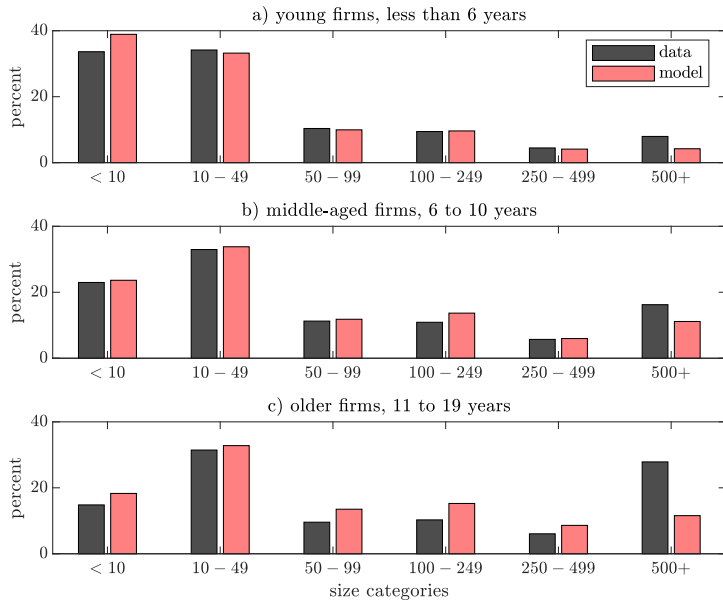
# Model fit: targeted moments



## Model fit: Other implied moments

	model	data
<i>A: Targeted moments</i>		
aggregate growth	1.45%	1.50%
aggregate R&D-output ratio	2.66%	2.20%
firm-level R&D-size relationship	-0.022	-0.028
<i>B: Untargeted firm dynamics moments</i>		
job creation rate	20%	17%
job destruction rate	20%	15%
job creation share from entry	11%	9%
job destruction share from exit	18%	17%

# Model fit: Untargeted firm-size distribution



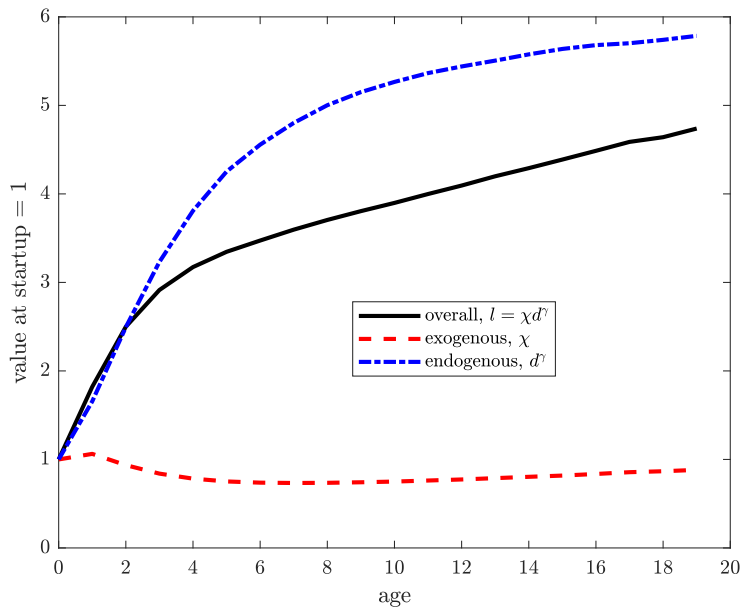
## Decomposing baseline results: A counterfactual economy

The key channel operates through expected demand growth at firm-level

- consider a **counterfactual**, “fixed-demand”, economy
  - expected demand = today’s demand, as in standard growth models
    - separately for passive, passive+active, all (passive+active+exogenous) demand
- otherwise all else equivalent to baseline model, including
  - *realizations* of demand shocks
  - equilibrium variables (wages, mass of firms, consumption, growth)

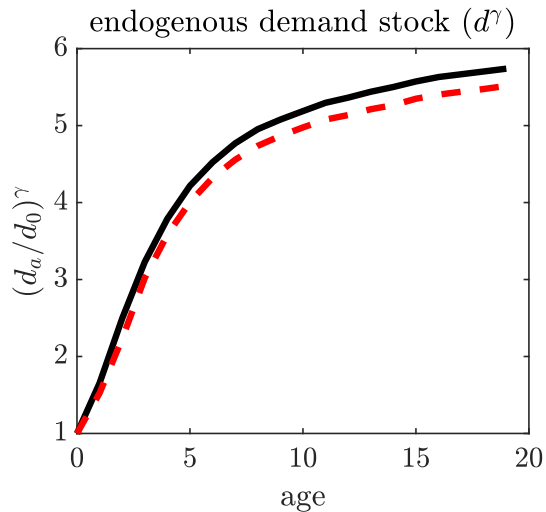
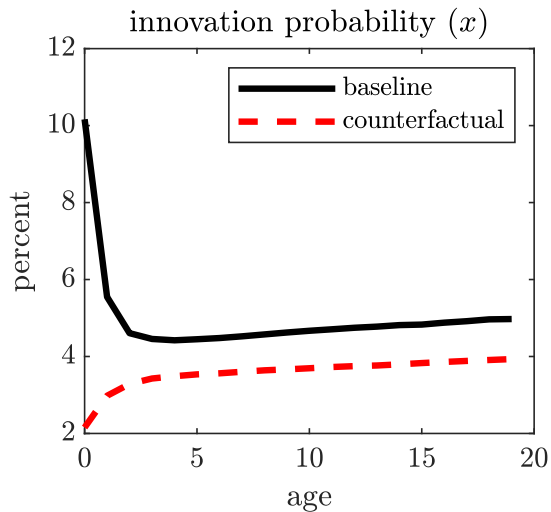
Baseline - counterfactual = (PE) impact of expected demand growth

## Demand stock accumulation over firms' life-cycle





## Endogenous R&D and demand accumulation at the firm-level



In the presence of customer accumulation, aggregate growth is **20% higher!**

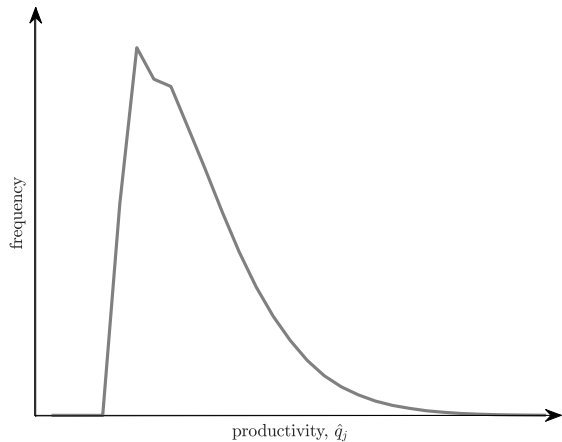
## Sensitivity to growth policies

Consider 2 examples of growth policies: (i) subsidize R&D, (ii) subsidize operation  
Compare baseline to “productivity-only” model (recalibrated to baseline targets)

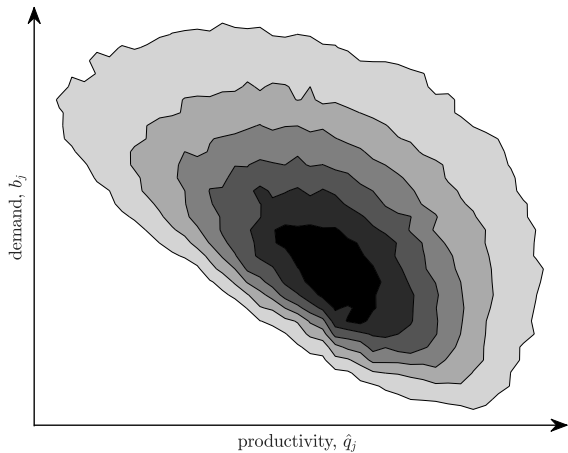
	innovation	firm exit	agg. growth
<hr/>			
<i>A: Operational cost subsidies</i>			
Baseline specification	+0.55	-0.33	-0.04
Restricted: Fixed demand stocks	+0.74	-1.42	-0.11
<i>B: R&amp;D subsidies</i>			
Baseline specification	+0.51	-0.14	+0.04
Restricted: Fixed demand stocks	+0.86	+0.98	+0.28
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# Customer base and the sensitivity to operation cost subsidies

(A) Restricted model



(B) Baseline model



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## Personal income tax cuts (Mertens and Ravn, 2013) as aggregate demand shocks

$$\log \left( \frac{\text{R\&D}_{j,t}}{\text{revenues}_{j,t}} \right) = \delta_j + \delta_t + \hat{g}_{j,t+1}^{(m)} + \hat{g}_{j,t+1}^{(m)} \times \text{age}_{j,t} + X_{i,t} + \eta_{j,t}$$

future revenue growth	0.032*** (0.007)	0.156*** (0.027)
log age	-0.010*** (0.002)	-0.002 (0.003)
log age × future revenue growth		-0.052*** (0.011)
additional controls	✓	✓
Observations	44,432	44,432
Within R <sup>2</sup>	0.32	0.32
firm fixed effects	✓	✓
time × industry fixed effects	✓	✓

## R&D subsidies across the US states (Wilson, 2009) and firm-level R&D intensity

$$\log \left( \frac{\text{R\&D}_{j,t}}{\text{revenues}_{j,t}} \right) = \tau_{s,t} + \log(\text{age})_{j,t} \times \tau_{s,t} + \log(\mu)_{j,t} \times \tau_{s,t} + X_{j,t} + \delta_j + \delta_s + \delta_t + \epsilon_{j,t}$$

R&D user cost	-0.014 (0.035)	-0.141*** (0.044)	-0.108** (0.052)
age × R&D user cost		0.048*** (0.010)	0.047*** (0.011)
average markup × R&D user cost			-0.050* (0.030)
additional controls	✓	✓	✓
firm fixed effects	✓	✓	✓
time × industry fixed effects	✓	✓	✓
state fixed effects	✓	✓	✓

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## Summary

### **Business dynamism driven by demand, not productivity alone**

- evidence on interactions between productivity, demand, and firm-level growth
- build endogenous growth model reflecting this
- analytically show how the new channel affects the R&D decisions

### **Quantitative results show that demand growth is important for**

- 20% of aggregate economic growth demand-driven
- a higher sensitivity of the economy to growth policies

### **We believe our paper opens the door to more research**

- new set of growth policies (monetary policy, procurement, transfers)?



## Endogenous demand

Optimal markup over marginal costs:

$$\mu_j = \underbrace{\frac{\eta}{\eta - 1}}_{\text{static markup}} - \beta(1 - \delta)(1 - \rho_d) \mathbb{E} \underbrace{\frac{q_j c_j' \varphi_j'}{q_j' c_j \varphi_j} \left[ \mu_j'(\zeta - 1) + \frac{\eta}{\eta - 1} - \zeta \right]}_{>0}$$

- firms choose low markups in expectation of high consumption growth
- over lifecycle, gradually increase markups towards static value
- → increasing life-cycle profile of markups (controlled by  $\zeta$ ) [▶ go back](#)