

# Escaping the Losses from Trade: The Impact of Heterogeneity on Skill Acquisition

## Preliminary

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Joint Conference on Heterogeneity  
September 27, 2018

*The views expressed in this presentation are those of the authors and do not necessarily reflect the position of the Federal Reserve Board or the Federal Reserve System.*

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*Autor, Dorn & Hanson (2013), Krishna & Senses (2014), Pierce & Schott (2016), Burstein & Vogel (2017),...*
  - Potential losses from greater import competition
- ▶ Several **margins of adjustment** to overcome initial losses
  - Regional migration *Caliendo, Dvorkin & Parro (2017), Dix-Carneiro & Kovak (2018),...*
  - Switching industries and/or occupations *Dix-Carneiro (2014), Traiberman (2017),...*

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- **Evidence:** effects of trade shocks on **educational attainment**
  - Estimate import penetration effects on college enrollment
- Dynamic trade **model** with **heterogeneous households**
  - SOE model with HO-type comparative advantage
  - Aiyagari-OLG model with costly education choice



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- **Evidence:** effects of trade shocks on **educational attainment**
    - Estimate import penetration effects on college enrollment
  - Dynamic trade **model** with **heterogeneous households**
    - SOE model with HO-type comparative advantage
    - Aiyagari-OLG model with costly education choice
- **Quantify** the effects of **trade** on **skill acquisition** and **welfare**

# What We Find

- **Evidence:**

- ▶ Trade shocks are **more detrimental** for **less educated workers**
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- ▶ **Skill acquisition** responds to trade openness
  - ★ But it **takes time**: wealth inequality matters
- ▶ Endogenous **skill acquisition** and **wealth distribution** are key

# Literature Review

- ▶ Trade and human capital
  - ▶ Findlay & Kierzkowski (1983), Falvey et al. (2010), Harris & Robertson (2013), Blanchard & Willmann (2016), Danziger (2017)
  - ▶ Atkin (2016), [Greenland & Lopestri \(2016\)](#), Blanchard & Olney (2018)
- ▶ Trade and inequality
  - ▶ Helpman et al. (2010, 2017), Antràs et al. (2017)
  - ▶ Burstein et al. (2013), Burstein et al. (2016), [Burstein & Vogel \(2017\)](#)
- ▶ Trade shocks and labor market adjustments
  - ▶ Autor, Dorn & Hanson (2013), Pierce & Schott (2016), Artuç Chaudhuri & McLaren (2010), Caliendo, Dvorkin & Parro (2018),...
- ▶ Labor market conditions and skill acquisition
  - ▶ [Charles, Hurst & Notowidigdo \(2016\)](#)
- ▶ Trade and heterogeneous-agents macro models
  - ▶ [Lyon & Waugh \(2017, 2018\)](#)

# Outline

- ① Evidence
- ② Model
- ③ Dynamic effects of trade openness
- ④ Policies

# Evidence



## Measuring trade shocks – ADH (2013)

- Import penetration in region (market)  $i$  in period  $t$

$$\Delta IPW_{it} = \sum_j \frac{L_{ijt}}{L_{it}} \frac{\Delta M_{jt}}{L_{jt}}$$

$j$ : industry,  $M_{jt}$ : Chinese imports,  $L_{ijt}$ : workers in sector  $j$ ,

$$L_{it} = \sum_j L_{ijt}, \text{ and } L_{jt} = \sum_i L_{ijt}$$

- Instrument by imports to other high-income countries from China

▶ More

- ▶ Regions: 722 commuting zones.
- ▶ Periods: 1990-2000, 2000-2007.

# Estimating the effect of trade shocks

- o Effect of *import competition* on variable  $y_{it}$  ( $\beta$ )

$$\Delta y_{it} = \gamma_t + \beta \Delta IPW_{it} + \delta X_{it} + e_{it}$$

- ▶  $y_{it}$ : labor market outcomes (employment, labor income) and educational attainment
- ▶  $X_{it}$ : labor force characteristics + regional dummies

+ *labor market effects across different education groups*

- o Data from Census and *American Community Survey* (IPUMS)
- o Import penetration data from ADH (2013),  $\Delta IPW_{it}$ :
  - ▶ *Median*: \$1,140 in 1990-2000 and \$2,600 in 2000-2007
  - ▶ *IQR*: \$600 in 1990-2000 and \$1,500 in 2000-2007

# Effect on labor market opportunities

Employment decreases more for less educated workers

$\Delta y_{it}$ : change in fraction of pop employed by education, ages 30-55

	All	High School	Some Coll	2-y program	Bachelor
Employment	-0.42*** (0.13)	-0.48*** (0.17)	-0.29*** (0.09)	-0.34*** (0.09)	-0.09 (0.1)

**Notes:** "Some Coll" are all individuals with some college, "2-y program" are those who graduated from a 2 year program, and "Bachelor" are those with a bachelor degree or more; \*\*\* significant at 1%, \*\* at 5%, \* at 10%

- ▶ A \$1,000 increase in imports
  - ▶ Decreases employment by 42 bps
  - ▶ More detrimental for workers with less education
  - ▶ No effect for workers with bachelor degree or more

# Effect on labor market opportunities

Income also decreases more for less educated workers

$\Delta y_{it}$ : log change in labor income by education, ages 30-55

	All	High School	Some Coll	2-y program	Bachelor
All sectors	-0.63*** (0.20)	-1.16*** (0.34)	-0.55*** (0.21)	-0.91** (0.42)	-0.27 (0.24)

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- ▶ A \$1,000 increase in imports
  - ▶ Decreases labor income by 0.63%
  - ▶ Larger decline for less educated workers
  - ▶ No effect for workers with bachelor degree or more

▶ Sectors

# Effect on education

## Dealing with migration

### Issue:

- Individuals age 18-25 migrate often and in response to trade shock  
(change in composition of control and treatment groups)
  - 48% (50%) of freshmen in colleges > 100 mi away from perm home in 1990 (2015)
  - A \$1,000 increase in imports decreases pop 18-25 by 1.54%
- ACS does not include households leaving for college (unlike CPS)
  - Hard to link college students with region where come from

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### A possible solution:

- ACS reports last year region
  - Restrict to ages 18-25 in college with at most one year finished
  - Link to region last year
- ⇒ Testing for enrollment, not completion, and cannot see household's income

# Effect on education

Education increases in responses to a trade shock

$y_{it}$ : change college enrollment ages 18-25

	1990-2007	1990-2000	2000-2007
Enrollment	0.24** (0.08)	-0.02 (0.09)	0.16* (0.1)
Enrollment $_{t+1}$	-	0.47** (0.022)	-

Notes: ; \*\*\* significant at 1%, \*\* at 5%, \* at 10%

- ▶ A \$1,000 increase in imports
  - + Increases college enrollment by 24 bps
  - + Most effect comes from period 2000-2007
    - Total change during 2000-2007  $\approx$  330bps
  - + Similar results for HG completion in [Greenland & Lopresti \(2016\)](#)
  - + Significantly strong delayed effect on enrollment of 47 bps

# Model



# International trade model with heterogeneous households

- o Small open economy trading goods and financial assets

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- Firms: **services** and **manufacturing** sectors
  - + **Intermediate** goods → *Tradable* (differentiated across countries)
    - Inputs: college workers, non-college workers and capital
  - + **Final** goods → *Non-tradable*
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- **Households**: continuum & finitely-lived
  - ▶ **Education**: one-time investment in **college** at age  $j = 1$  (terms of services)
  - ▶ Work  $J_R$  periods *subject to* idiosyncratic **labor risk**
  - ▶ Fin **wealth** formed by *two assets*, inherited by newborn at  $J_R$  (bequest)
    - domestically produced **capital**
    - internationally traded one-period riskless **bonds**

## Firms – sector $i \in \{m, s\}$

- ▶ Final non-tradable goods technologies

$$Q_i = \left[ \omega_i^{\frac{1}{\eta_i}} D_i^{\frac{\eta_i-1}{\eta_i}} + (1 - \omega_i)^{\frac{1}{\eta_i}} (D_i^*)^{\frac{\eta_i-1}{\eta_i}} \right]^{\frac{\eta_i}{\eta_i-1}}$$

- +  $D_i$ : domestic intermediate and  $D_i^*$ : imported intermediate
- + Profit maximization:  $\max_{D_i, D_i^*} \{q_i Q_i - p_i D_i - p_i^* \tau_i D_i^*\}$
- +  $\tau_i$  iceberg cost  $\rightarrow$  control *trade openness*

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- ▶ Intermediate tradable goods technologies:  $Y_i = K_i^\alpha L_i^{1-\alpha}$  where

$$L_i = \left( \gamma_i L_{ic}^{\frac{\sigma-1}{\sigma}} + (1 - \gamma_i) L_{in}^{\frac{\sigma-1}{\sigma}} \right)^{\frac{\sigma}{\sigma-1}}$$

- ▶ Key assumption:  $\gamma_s > \gamma_m$  and  $\sigma > 1$   
 $\rightarrow$  services is more intensive in *skilled* labor (Cravino and Sotelo (2018))

# Households

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- ▶ Value of college ( $e = e^c$ ) age  $j = 1$ , capital  $k$ , bonds  $s$ , and productivity  $x$ :

$$V_1(k, s, x, u, e^c) = \max_{c_s, c_m, x_s, x_m, k', s'} \{U(c) + \beta \mathbb{E} [V_2(k', s', x', e^c) | x]\}$$

$$q_s(c_s + x_s) + q_m(c_m + x_m) + s' + q_x \kappa u \leq w_n x \frac{\bar{h}}{2} + r q_x k + (1 + r^*)s,$$

$$k' = x + (1 - \delta)k, \quad q_x k' + s' \geq \underline{a}_{1,c}, \quad c = \mathcal{C}(c_s, c_m), \quad x = \mathcal{X}(x_s, x_m)$$

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- ▶ Value of non-college ( $e = e^n$ ), or college ( $e = e^c$ ) and  $j \geq 2$

$$V_j(k, s, x, e) = \max_{c_s, c_m, b', s'} \{U(c) + \beta \mathbb{E} [V_{j+1}(k', s', x', e) | x]\}$$

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- ▶ **Terminal condition**  $V_{J_R+1}^e(k, s, x) = \mathbb{E}_{u,x} [\max \{V_1^c(k, s, x, u), V_1^n(k, s, x)\}]$

# Effect of Trade Openness

# Calibration

## → Particular case:

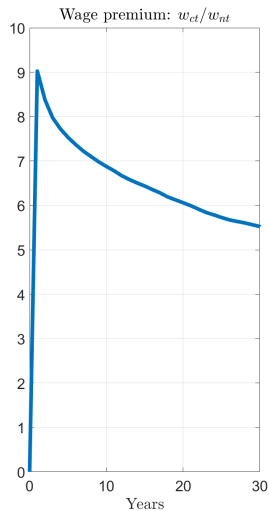
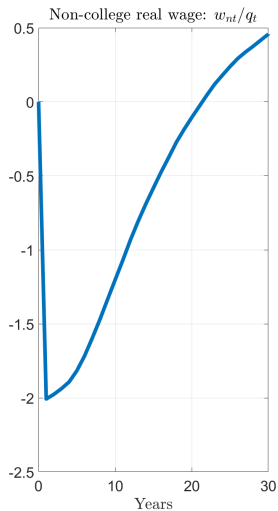
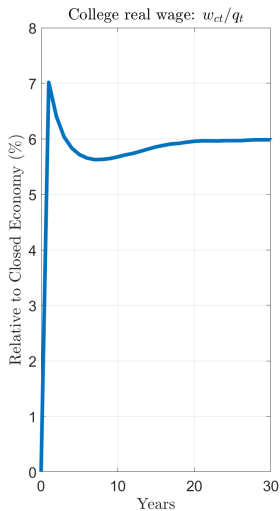
- ▶  $\mathcal{X}(x_s, x_m) = x_m$  and *financial autarky* ( $s = 0$ )
- Education cost  $\kappa$  to match  $\approx 30\%$  college graduates
- Borrowing limit
  - + Student loans:  $\underline{a}_{c,j} < 0$  ages  $j = 1, \dots, 5$   
→  $\underline{a}_{c,j} \approx 75\%$  of cost of education
  - + No borrowing  $\underline{a}_{e,j} = 0$  otherwise
- College labor weight:  $\gamma_s = 1 - \gamma_m = 0.7$  [▶ more](#)
- Exogenous demand for exports  $B_i^*(p_i) = \bar{B}_i^* p_i^{1-\eta_i^*}$

# Effects of Trade Shocks

## Exercise:

- At  $t = 0$  the economy is at a steady state with high  $\tau_m$
- At  $t = 1$ ,  $\tau_m$  unexpectedly decreases
  - ▶ A sudden and permanent shock
  - ▶ Manufacturing home-bias declines from 95% to 80%

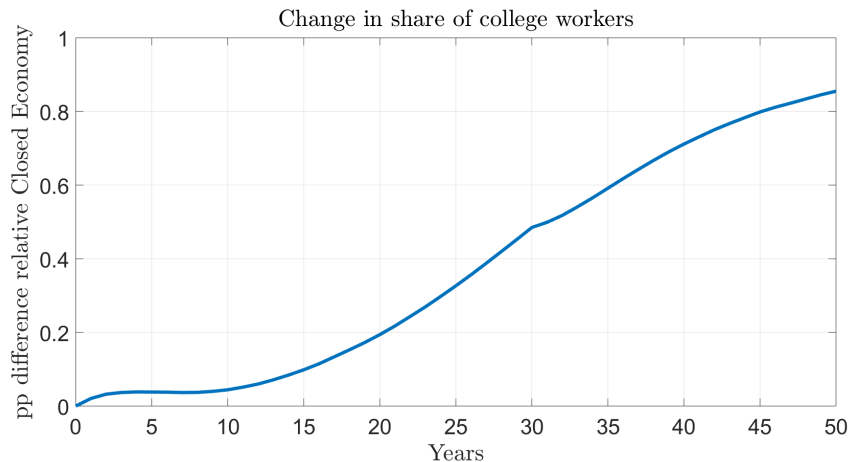
# Increase in inequality and “overshooting”



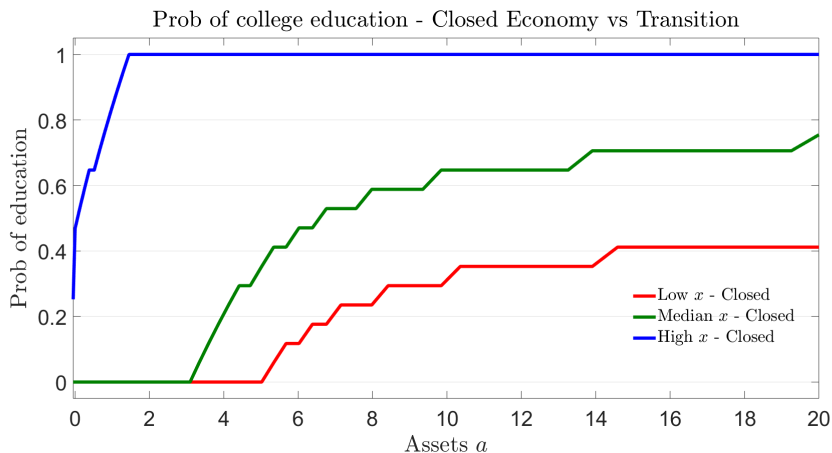
$q_t$  is the price of the consumption bundle  $\mathcal{C}(c_s, c_m)$



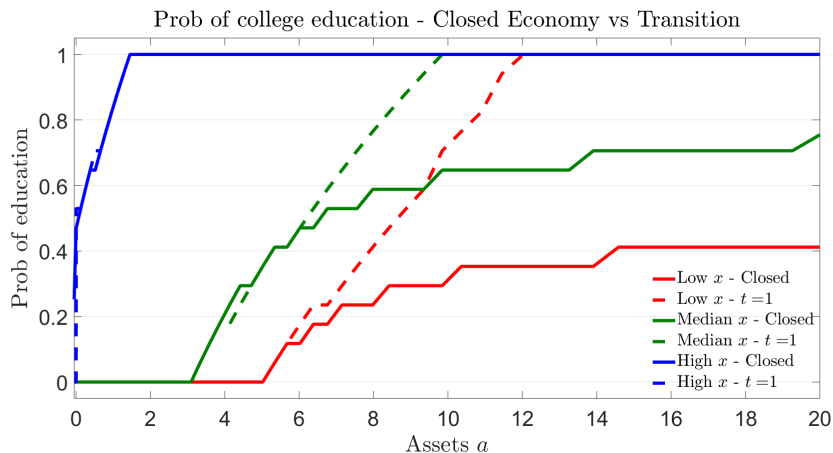
# College enrollment increases . . . but slowly



# Who gets more educated? The productive and wealthy

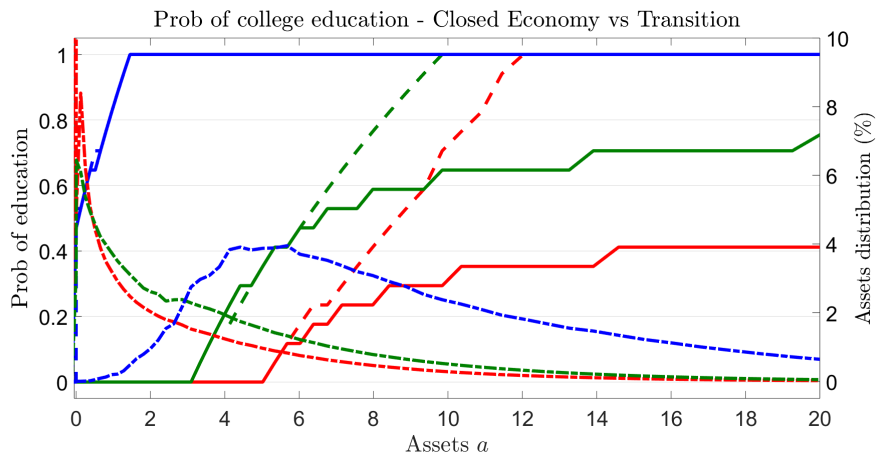


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# Winners and losers from trade openness...

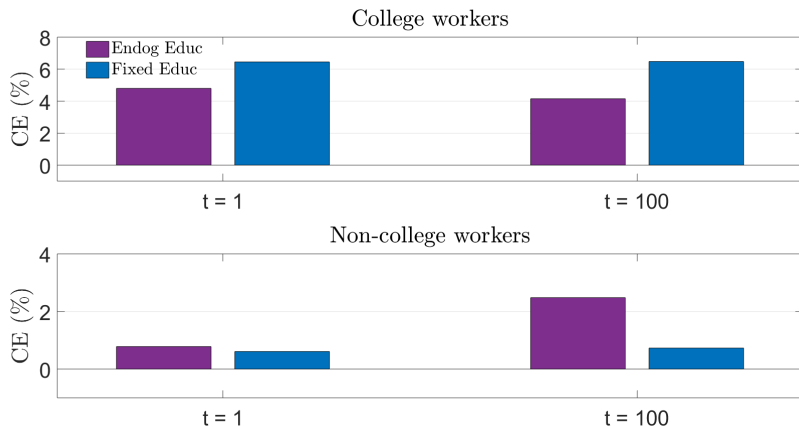
Consumption Equivalent



**Note:** *Lowest* and *Top* refer to wealth distribution computed within each age group

# Endogenous skill acquisition is crucial for welfare

Consumption Equivalent



# Policy Implications

# Which fiscal policy in the context of trade openness?

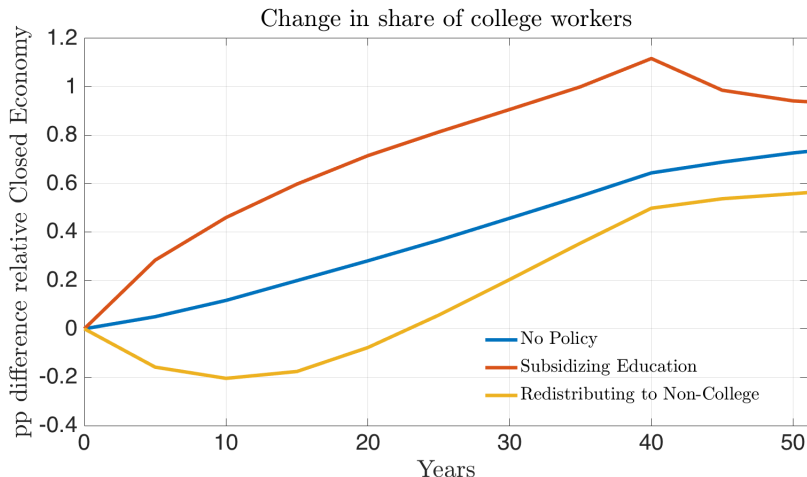
- ▶ Should the government subsidize education ?
  - ▶ To accelerate the transition
  - ▶ A fraction  $\phi_t$  of education cost subsidized by the government
  - ▶ Financed with a labor income tax  $\tau_t$

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  - ▶ A fraction  $\phi_t$  of education cost subsidized by the government
  - ▶ Financed with a labor income tax  $\tau_t$
  
- ▶ Should the government redistribute to non-college workers?
  - ▶ A lump-sum transfer  $T_t$  to all non-college with  $j \geq 2$  at  $t = 0$
  - ▶ Financed with a labor income tax  $\tau_t$
  - ▶ With the risk of slowing down the transition?

# Accelerating or slowing down the transition

Caveat: another calibration



# Conclusions

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- *Evidence*: trade shocks
  - ▶ are more detrimental to less educated workers
  - ▶ induce more skill acquisition
- *Model*: consistent with these findings
  - ▶ endogenous skill acquisition matters for welfare



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## Next steps:

- *Evidence*: linking 18-25 to household income (CPS, PSID, NLSY) → heterogeneous effects
- *Model*: Calibration, SOE with trade in financial assets, policy
- *Model*: adding multiple regions and ability to migrate

# Appendix

# Measuring Trade Shocks – Instrument

- Instrument for region  $i$  in period  $t$  by

$$\Delta IPW_{oit} = \sum_j \frac{L_{ijt-1}}{L_{it-1}} \frac{\Delta M_{ojt}}{L_{jt-1}}$$

- ▶  $j$ : industry,
- ▶  $M_{ojt}$ : Chinese's imports to *other* countries,
- ▶  $L_{ijt}$ : workers in sector  $j$ ,
- ▶  $L_{it} = \sum_j L_{ijt}$ , and
- ▶  $L_{jt} = \sum_i L_{ijt}$ .

▶ Return

## Income also decreases more for less educated workers

$y_{it}$ : log change in labor income by sector, ages 30-55

	All	High School	Some Coll	2-y program	Bachelor
All sectors	-0.63*** (0.20)	-1.16*** (0.34)	-0.55*** (0.21)	-0.91** (0.42)	-0.27 (0.24)
Manufacturing	-0.65* (0.37)	-1.00*** (0.60)	-0.56 (0.41)	-1.44 (0.93)	-0.38 (0.67)
No Manuf	-0.53*** (0.18)	-0.90*** (0.25)	-0.48** (0.21)	-0.58 (0.40)	-0.27 (0.26)

**Notes:** "Some Coll" are all individuals with some college, "2-y program" are those who graduated from a 2 year program, and "Bachelor" are those with a bachelor degree or more; \*\*\* significant at 1%, \*\* at 5%, \* at 10%

- Larger effects in non-manufacturing (bias problem?)
- Still larger decline for less educated workers
- No effect for workers with bachelor degree or more

▶ Return

# Calibration

- Technology:  $3Y_i = K_i^\alpha L_i^{1-\alpha}$  with  $L_i = \left( \gamma_i L_{ic}^{\frac{\sigma-1}{\sigma}} + (1 - \gamma_i) L_{in}^{\frac{\sigma-1}{\sigma}} \right)^{\frac{\sigma}{\sigma-1}}$

$$+ \alpha = 1/3, \sigma = 2, \gamma_s = 1 - \gamma_s = 0.7$$

- Final good:  $Q_i = \left[ \omega_i^{\frac{1}{\eta_i}} D_i^{\frac{\eta_i-1}{\eta_i}} + (1 - \omega_i)^{\frac{1}{\eta_i}} (D_i^*)^{\frac{\eta_i-1}{\eta_i}} \right]^{\frac{\eta_i}{\eta_i-1}}$

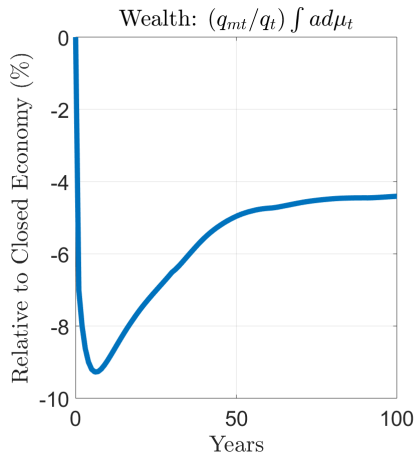
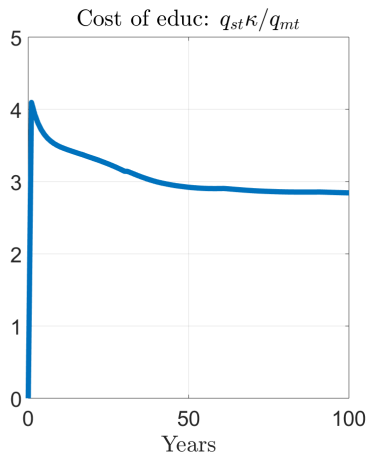
$$+ \omega_i = 0.7, \eta_i = 4$$

- Household

$$+ \mathcal{C}(c_s, c_m) = \left( \sum_i v_i^{\frac{1}{\rho}} c_i^{\frac{\rho-1}{\rho}} \right)^{\frac{\rho}{\rho-1}}, v_s = 1 - v_m = 0.6 \text{ and } \rho = 0.5$$

$$+ \ln x \sim AR(1) \text{ with } \rho_x = 0.85 \text{ and } \sigma_x = 0.25$$

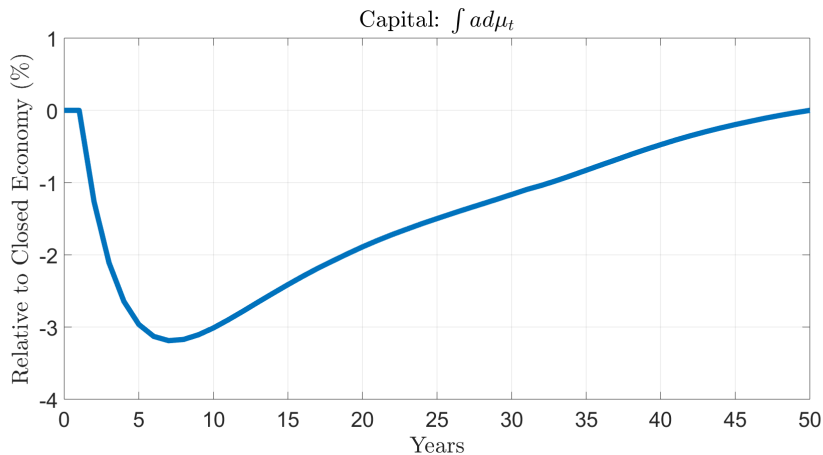
# Education becomes more costly and wealth initially decreases



► Home Bias

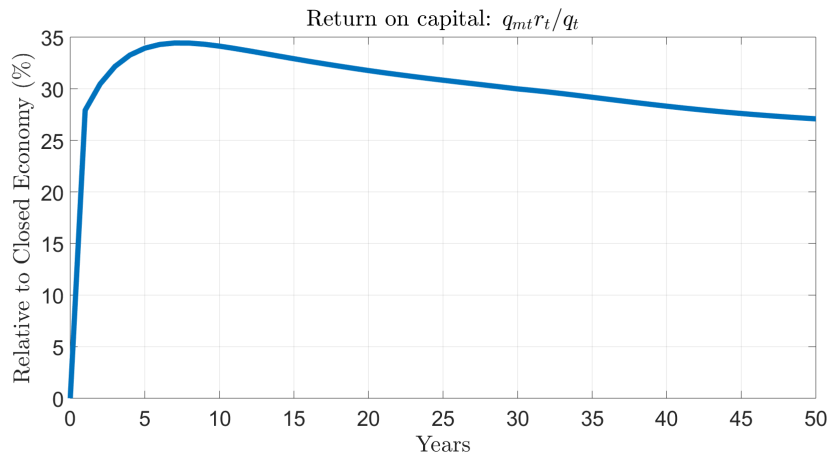
► Capital

# Capital accumulation



▶ Return

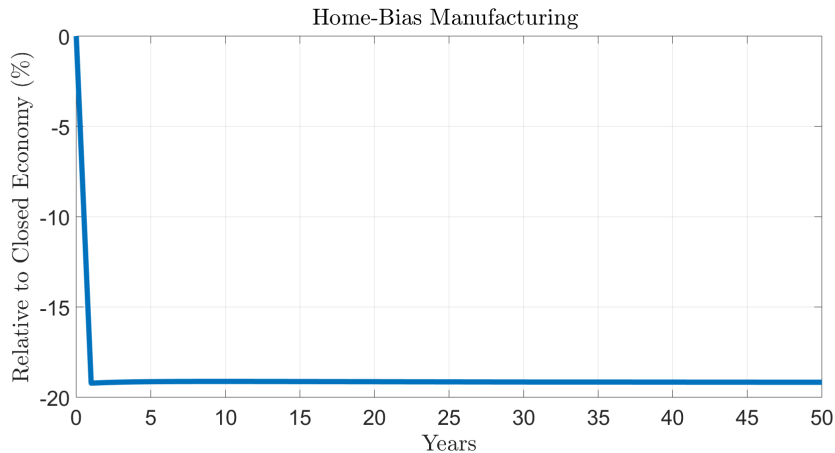
# Return on capital increases



▶ Return



# Home Bias Manufacturing Sector



▶ Return