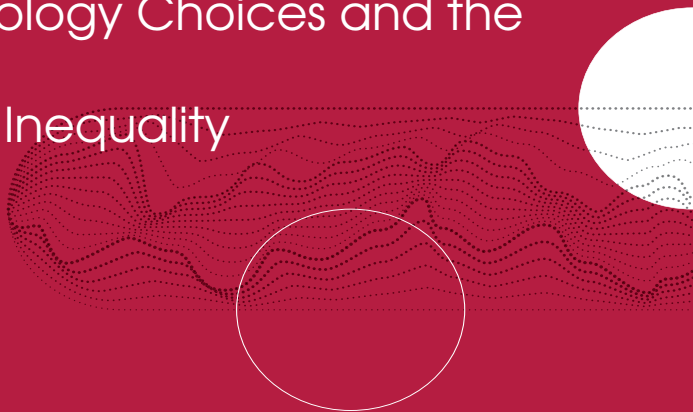


# Endogenous Technology Choices and the Dynamics of Wage Inequality

Jan Witajewski-Baltvilks



- An increase in supply of skills and college wage premium in most OECD countries.

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- A country that witnessed higher increase in number of college graduates than other countries saw:
  - fall in premium relative to the other countries immediately after increase in supply
  - increase in premium relative to the other countries a decade later

- skill-bias of the global technological paradigm
- at country level, firms can choose between more and less skill-biased production methods
- sharp increase in supply of skills incentivise firms to adopt more skill-biased production.

- response of skill premium to skills supply increase is smaller in the long-run than in the short-run.
- non-global mechanisms can explain part of the growth in the premium across OECD

# College Premium and Relative Supply of College Skills in US

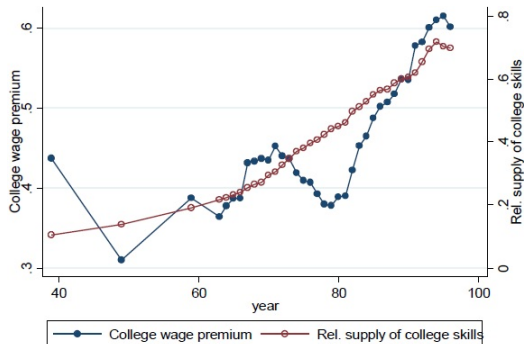


Figure: College premium and relative supply of college skills in US between 1939 and 1996

- ① theoretical model
- ② its calibration
- ③ econometric exploration

Technology Choice and Skill Premium Dynamics

**The Dynamic Model**

Quantitative Analysis



- One product, many production methods.
- Production method  $i$  takes the form

$$F_i = [(A_{is}L_s)^\sigma + (A_{iu}L_u)^\sigma]^{\frac{1-\theta}{\sigma}} k^\theta$$

where  $L_s$  and  $L_u$  stand for skilled and unskilled labour inputs

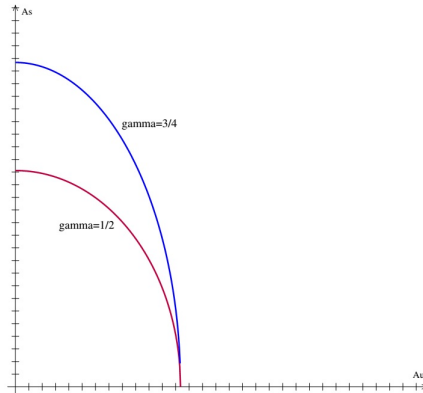
- Each production method is characterized by a different pair  $(A_s, A_u)$  (unit productivities)

# Available production methods



- The set of available production methods is determined by the global technology paradigm
- it is described by:

$$\frac{1}{\gamma} A_{is}^{\omega} + A_{iu}^{\omega} \leq B \quad (1)$$



- supply of skills follows the process:

$$\log \left( \frac{L_s}{L_u} \right) \Big|_t = \log \left( \frac{L_s}{L_u} \right) \Big|_{t-1} + \mu + \xi_t \quad (2)$$

- Firm cannot switch the technology on the spot
- The firm's value function:

$$\begin{aligned} \log \left( \frac{w_s}{w_u} \right) \Big|_t &= -(1 - \sigma) \log \left( \frac{L_s}{L_u} \right) \Big|_t + \frac{\sigma}{\omega - \sigma} \log(\gamma) \Big|_{t-1} + \\ &\quad + \frac{\sigma}{\omega - \sigma} E_{t-1} \left[ \log \left( \frac{L_s}{L_u} \right) \Big|_t \right] \end{aligned} \quad (3)$$

- Equilibrium skill premium is driven by three forces:
  - diminishing returns to skills
  - skill-bias of technological paradigm
  - firm's expectation about today's supply of skills driving technology choice.

$$\log\left(\frac{w_s}{w_u}\right)\Big|_t = -(1 - \sigma) \log\left(\frac{L_s}{L_u}\right)\Big|_t + \frac{\sigma}{\omega - \sigma} \log(\gamma)\Big|_{t-1} + \frac{\sigma}{\omega - \sigma} \left( \log\left(\frac{L_s}{L_u}\right)\Big|_{t-1} + \mu \right)$$

- Equilibrium skill premium is driven by three forces:
- **diminishing returns to skills**
- **skill-bias of technological paradigm**
- **firm's expectation about today's supply of skills driving technology choice.**

Technology Choice and Skill Premium Dynamics

The Dynamic Model

Quantitative Analysis

- The empirical model can be directly derived from the baseline model:

$$\begin{aligned} \log \left( \frac{w_s}{w_u} \right) \Big|_t &= -(1 - \sigma) \log \left( \frac{L_s}{L_u} \right) \Big|_t + \frac{\sigma}{\omega - \sigma} \log(\gamma) \Big|_{t-1} + \\ &+ \frac{\sigma}{\omega - \sigma} E_{t-1} \left[ \log \left( \frac{L_s}{L_u} \right) \Big|_t \right] \end{aligned} \quad (4)$$

- Two identification issues:
  - Separate the **negative effect due to diminishing returns to skills** and **positive effect of adjusting technology choice**.
  - Separate **the effect of change in technological possibilities** and **the effect of adjusting technology choices**.



- The empirical model is:

$$\Delta w_{it} = \alpha_1 \Delta l_{it} + \alpha_2 \Delta l_{it-5} + \alpha_3 \Delta l_{it-10} + \hat{d}_t + \Delta \varepsilon_{it} \quad (5)$$

- equivalent to

$$\begin{aligned}(\Delta w_{it} - \Delta w_t) &= \alpha_1 (\Delta l_{it} - \Delta l_t) + \alpha_2 (\Delta l_{it-5} - \Delta l_{t-5}) \\ &\quad + \alpha_3 (\Delta l_{it-10} - \Delta l_{t-10}) + (\Delta \varepsilon_{it} - \Delta \varepsilon_t)\end{aligned}$$

- It isolates out the global factors (e.g. change in global technology paradigm).

- EU KLEMS (2008 release)
- 23 countries
- 1970 and 2005 (unbalanced).

	(1)	(2)	(3)
skills supply growth {t}	-0.804***	<b>-0.825***</b>	-0.803***
skills supply growth {t-5}	-0.255*	-0.224	-0.253*
skills supply growth {t-10}	0.218**	0.217**	0.225**
d85		-0.006	
d90		-0.03	
d95		0.013	
d00		0.013	
year			0.001
constant	0.167***	0.163***	-1.466

**Table:** The dependent variable is five years change of college wage premium (in logs).

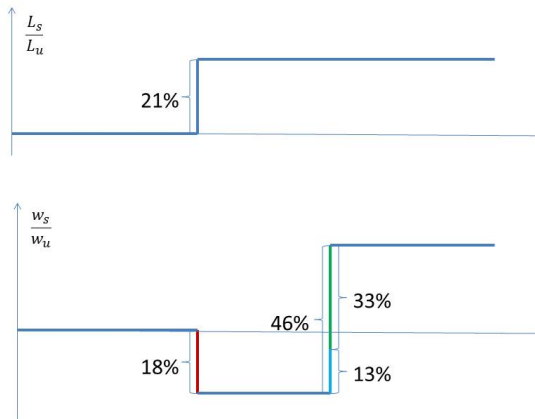
	(1)	(2)	(3)
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**Table:** The dependent variable is five years change of college wage premium (in logs).

$$\Delta \log \left( \frac{w_s}{w_u} \right)_t = -0.82 \Delta \log \left( \frac{L_s}{L_u} \right) \Big|_t + 0.11 +$$
$$0.22 \left( \Delta \log \left( \frac{L_s}{L_u} \right) \Big|_{t-10} \right)$$





- Estimation of the model - a possibility result
- Are there other possibilities?

$$\begin{aligned}(\Delta w_{it} - \Delta w_t) &= \alpha_1 (\Delta l_{it} - \Delta l_t) + \alpha_2 (\Delta l_{it-10} - \Delta l_{t-10}) \\ &+ (\Delta \varepsilon_{it} - \Delta \varepsilon_t)\end{aligned}$$

- Alternative explanations:

- bias due to inclusion of endogenous variable [discussion](#)
- serial correlation of the error term [discussion](#)
- reverse causality [discussion](#)
- alternative mechanisms: spillover [discussion](#), endogenous adoption [discussion](#)

- Countries with faster growth of college graduates witness also faster growth of college premium ten years later.
- The most likely candidate to explain this pattern is the endogenous technology choice hypothesis:
  - At any point in time a firm has an option to switch between production methods.
  - After increase in supply of college graduates firms decided to switch to more skill-biased production methods.
- The estimation shows that this switch can account for 1/3 of the growth in skill premium in OECD countries.
- Future Work





- Contribution to the literature on skill-biased technology change (Acemoglu (2002); Aghion (2002); Goldin and Katz (2008))
  - Show that switch to skill-biased production method (that lead to increase in skill premium) can happen even without change in technological paradigm
- Contribution to the literature on Endogenous Technology Choice (Samuelson (1965), Caselli and Coleman (2007), Peri (2009))
  - Elaborate and estimate a dynamic model (prediction on dynamics of wage inequality; the model is based on Caselli and Coleman static model)
  - Present a piece of empirical evidence to support the hypothesis.
  - Set the microfoundation for the model: How R&D sector can generate variety of production methods.

- Suppose that the error term in skill premium regression is the IMA(1,1) process:

$$\Delta \varepsilon_{it} = \eta_{it} + \beta \eta_{it-10} \quad (7)$$

- Intuitively  $\beta > 0$  implies that there is a process whose impact on skill premium is not completed after 10 years.
- Moreover the process cannot affect all countries equally (e.g. ICT), since this is controlled for.
- Candidates:
  - Loss of importance of trade unions
  - Globalization

	(2)	(4)
skills supply growth {t}	-0.825***	-0.822***
skills supply growth {t-5}	-0.224	-0.222
skills supply growth {t-10}	0.217**	0.213
d85	-0.006	-0.007
d90	-0.03	-0.028
d95	0.013	0.015
d00	0.013	0.013
supply of skills (level)		
change in union density		<b>-0.034</b>
change in export to gdp ratio		<b>-0.006</b>
constant	0.163***	0.161***

**Table:** The dependent variable is five years change of college wage premium (in logs).



$$\Delta w_{it} = \alpha_1 \Delta l_{it} + \alpha_2 \Delta l_{it-10} + \hat{d}_t + \Delta \varepsilon_{it}$$

- Since  $\Delta l_{it}$  may be correlated with the error term, all estimators are biased
- What is the sign of the bias for  $\alpha_2$  estimator?
- The asymptotic bias is

$$\begin{aligned} E[\hat{\alpha}_2 - \alpha_2] &= \\ &= \frac{-1}{\det} E[(\Delta l_{it} - \Delta l_t)(\Delta l_{it-10} - \Delta l_{t-10})] E[(\Delta l_{it} - \Delta l_t)(\Delta \varepsilon_{it} - \Delta \varepsilon_t)] \end{aligned}$$

- Therefore we would expect the sign of the bias to be negative.

- Skill supply will be correlated with future skill premium if workers predict future changes of skill premium.
- Workers would need to predict that growth of skill premium in their country will be higher than in other countries. They would need to know it 10 years ahead.
- If students in 1975 predict a sharp increase in skill premium in 1985 why students in 1970 would not be able to predict it?

- The higher is the number of workers the more productive they are.
- Some effect should be visible after 5 years - disproved by data

[back](#)

- Countries with higher number of skilled workers want to adopt ICT faster than other countries.
- Growth of Skill premium would need to depend on the *level* of supply of skills.

	(5)	(6)
skills supply growth {t}	-0.793***	-0.786***
skills supply growth {t-5}	-0.242	-0.242
skills supply growth {t-10}	0.191**	0.183*
d85	-0.018	-0.021
d90	-0.034	-0.031
d95	-0.001	0.000
d00	0.006	0.003
supply of skills (level)	<b>-0.041*</b>	<b>-0.042*</b>
change in union density		-0.053
change in export to gdp ratio		0.004
constant	0.274***	0.272***

**Table:** The dependent variable is five years change of college wage premium (in logs).

- The data shows that in recent year positive correlation between skill supply growth and skill premium growth decade later seems to vanish.
  - More labour mobility across countries?
  - Technological Change greases Technological Choice?
- Microfoundation and more evidence for the trade-off between more and less skill-biased technologies.



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# THANK YOU

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