# Comparative advantage in routine production

#### Liza Archanskaia\*, Jo Van Biesebroeck\*, Gerald Willmann\*\*

\*KU Leuven \*\*Universität Bielefeld

September 19, 2017







### Our starting point

- We want to understand why countries at a similar level of development and with similar factor endowments specialize in different types of goods
- We want to understand why countries with similar endowments appear to adjust very differently to the ongoing process of globalization and technological change

#### • Our approach:

- $\rightarrow\,$  A key feature of both processes (trade integration & technological change) is that they trigger labor reallocation
- $\rightarrow\,$  We know that labor reallocation is costly, our hypothesis is that the extent of barriers to worker mobility may be country-specific

#### Our starting point

- We want to understand why countries at a similar level of development and with similar factor endowments specialize in different types of goods
- We want to understand why countries with similar endowments appear to adjust very differently to the ongoing process of globalization and technological change
- Our approach:
  - $\rightarrow\,$  A key feature of both processes (trade integration & technological change) is that they trigger labor reallocation
  - $\rightarrow\,$  We know that labor reallocation is costly, our hypothesis is that the extent of barriers to worker mobility may be country-specific

# Main findings

- Theory:
  - Comparative advantage predictions for countries that are identical in every respect, except for their ability to smooth labor reallocation
  - Ø Microfoundations for differential smoothing are in preparation
- Empirics:
  - Characterizing industries by routine-intensity and countries by substitution elasticity passes 'sniff test'
  - 2 Countries differ starkly in the routine-intensity of their net exports
  - 3 Cultural or institutional differences predict this type of specialization

# Main findings

- Theory:
  - Comparative advantage predictions for countries that are identical in every respect, except for their ability to smooth labor reallocation
  - Ø Microfoundations for differential smoothing are in preparation
- Empirics:
  - Characterizing industries by routine-intensity and countries by substitution elasticity passes 'sniff test'
  - ② Countries differ starkly in the routine-intensity of their net exports
  - S Cultural or institutional differences predict this type of specialization
- Implications:
  - Institutional characteristics that facilitate labor market transitions may be a source of comparative advantage
  - Workers benefit relatively more from technological change and trade integration in countries with flexible labor markets

# Main findings

- Theory:
  - Comparative advantage predictions for countries that are identical in every respect, except for their ability to smooth labor reallocation
  - Ø Microfoundations for differential smoothing are in preparation
- Empirics:
  - Characterizing industries by routine-intensity and countries by substitution elasticity passes 'sniff test'
  - ② Countries differ starkly in the routine-intensity of their net exports
  - S Cultural or institutional differences predict this type of specialization
- Implications:
  - Institutional characteristics that facilitate labor market transitions may be a source of comparative advantage
  - Workers benefit relatively more from technological change and trade integration in countries with flexible labor markets

# Roadmap

- Literature review
- 2 The model
  - Nested CES production function
  - Equilibrium
  - Normalizing the CES
  - Comparative advantage predictions
  - Microfounding country-level differences in substitutability (to come)
- Impirical evidence
  - Plausibility of parameter assumptions
  - Pattern of trade: Estimate country ranking in terms of routine-intensity of exports
  - Relate country ranking to country characteristics ('endowments')

#### trade

#### Heckscher-Ohlin framework: importance of endowments

- Sectors differ in factor intensities (which are universal)
- Countries differ in endowments (which are fixed)
- Different relative autarky prices provide incentive for trade
  - Country endowed with a lot of X specializes in X-intensive good
- Most important sources of comparative advantage may be man-made
  - Porter (1990): Country with strong universities specializes in knowledge-intensive goods
  - Nunn (2007): Country with strong rule of law specializes in contract-intensive goods (which use a lot of differentiated inputs)
  - Costinot (2009): Country with high-quality workforce specializes in complex goods (which require a lot of training to master many tasks)

#### trade

#### Heckscher-Ohlin framework: importance of endowments

- Sectors differ in factor intensities (which are universal)
- Countries differ in endowments (which are fixed)
- Different relative autarky prices provide incentive for trade
  - Country endowed with a lot of X specializes in X-intensive good
- Most important sources of comparative advantage may be man-made
  - Porter (1990): Country with strong universities specializes in knowledge-intensive goods
  - Nunn (2007): Country with strong rule of law specializes in contract-intensive goods (which use a lot of differentiated inputs)
  - Costinot (2009): Country with high-quality workforce specializes in complex goods (which require a lot of training to master many tasks)

#### • HO model shows equilibrium (or frictionless) specialization, while

• Cuñat & Melitz (2012): Country with flexible labor market specializes

#### trade

#### Heckscher-Ohlin framework: importance of endowments

- Sectors differ in factor intensities (which are universal)
- Countries differ in endowments (which are fixed)
- Different relative autarky prices provide incentive for trade
  - Country endowed with a lot of X specializes in X-intensive good
- Most important sources of comparative advantage may be man-made
  - Porter (1990): Country with strong universities specializes in knowledge-intensive goods
  - Nunn (2007): Country with strong rule of law specializes in contract-intensive goods (which use a lot of differentiated inputs)
  - Costinot (2009): Country with high-quality workforce specializes in complex goods (which require a lot of training to master many tasks)
- HO model shows equilibrium (or frictionless) specialization, while
  - Cuñat & Melitz (2012): Country with flexible labor market specializes in volatile sectors

#### labor

#### Labor market perspective: importance of K-L substitution

• Labor literature on job polarization & technical change:

- Technological change (innovation) leads to labor displacement from routine tasks (Autor, Levy, Murnane, 2003; Acemoglu & Autor, 2013)
- Strong employment protection laws discourage firms from investing in high-risk, high-return projects (Bartelsman, Gauthier, De Wind 2016)
- Dynamic: labor has comparative advantage in new tasks → opposite effects of automation and innovation (Acemoglu & Restrepo, 2016)

#### • Related applications:

- Macro: high K-L substitutability becomes more valuable once countries have accumulated more  $K \rightarrow$  leads to higher GDP per capita (Klump et al., 2000)
- Trade: strength of financial institutions leads to investment in higher-risk, higher-return projects (Bonfiglioli et al., 2016)

#### labor

#### Labor market perspective: importance of K-L substitution

• Labor literature on job polarization & technical change:

- Technological change (innovation) leads to labor displacement from routine tasks (Autor, Levy, Murnane, 2003; Acemoglu & Autor, 2013)
- Strong employment protection laws discourage firms from investing in high-risk, high-return projects (Bartelsman, Gauthier, De Wind 2016)
- Dynamic: labor has comparative advantage in new tasks → opposite effects of automation and innovation (Acemoglu & Restrepo, 2016)
- Related applications:
  - Macro: high K-L substitutability becomes more valuable once countries have accumulated more  $K \rightarrow$  leads to higher GDP per capita (Klump et al., 2000)
  - Trade: strength of financial institutions leads to investment in higher-risk, higher-return projects (Bonfiglioli et al., 2016)

### The structure of production

- We borrow two-tiered production function from the labor literature
- Production technology of final goods is Cobb-Douglas

$$Y_g = z A_g^{1-eta} M_g^eta$$

- Abstract tasks are carried out by non-routine labor  $A_g = L_g^a$
- Routine tasks are produced with CES production function

$$M_g = Z \left[ \alpha \left( K_g \right)^{\mu} + (1 - \alpha) \left( L_g^m \right)^{\mu} \right]^{1/\mu}$$

- Standard assumptions:
  - Routine-intensity  $\beta$  is sector, but not country-specific  $\rightarrow \beta_{g}$
  - $\mu \in [0,1]$ , such that elasticity of substitution  $\sigma = (1-\mu)^{-1} > 1$

## The structure of production

- We borrow two-tiered production function from the labor literature
- Production technology of final goods is Cobb-Douglas

$$Y_g = z A_g^{1-eta} M_g^eta$$

- Abstract tasks are carried out by non-routine labor  $A_g = L_g^a$
- Routine tasks are produced with CES production function

$$M_g = Z \left[ lpha \left( K_g \right)^{\mu} + (1 - lpha) \left( L_g^m \right)^{\mu} 
ight]^{1/\mu}$$

- Standard assumptions:
  - Routine-intensity  $\beta$  is sector, but not country-specific  $\rightarrow \beta_g$
  - $\mu \in [0,1]$ , such that elasticity of substitution  $\sigma = (1-\mu)^{-1} > 1$
- Novel assumptions:
  - Countries have the same efficiency (z, Z) and endowments (K/L)
  - K-L substitutability  $\sigma$  is country, but not sector-specific ightarrow  $\sigma_i$

# The structure of production

- We borrow two-tiered production function from the labor literature
- Production technology of final goods is Cobb-Douglas

$$Y_g = z A_g^{1-eta} M_g^eta$$

- Abstract tasks are carried out by non-routine labor  $A_g = L_g^a$
- Routine tasks are produced with CES production function

$$M_g = Z \left[ lpha \left( K_g \right)^{\mu} + (1 - lpha) \left( L_g^m \right)^{\mu} 
ight]^{1/\mu}$$

- Standard assumptions:
  - Routine-intensity  $\beta$  is sector, but not country-specific  $\rightarrow \beta_g$
  - $\mu \in [0,1]$ , such that elasticity of substitution  $\sigma = (1-\mu)^{-1} > 1$
- Novel assumptions:
  - Countries have the same efficiency (z, Z) and endowments (K/L)
  - K-L substitutability  $\sigma$  is country, but not sector-specific  $\rightarrow \sigma_i$

# Two-tiered production function

• Assumptions of sector-specific  $\beta_g$  and country-specific  $\sigma_i$  lead to

$$Y_{ig} = z' (L^a_{ig})^{1-eta_g} \left[ (1-lpha) (L^m_{ig})^{\mu_i} + lpha (K_{ig})^{\mu_i} 
ight]^{rac{eta_g}{\mu_i}}$$

- Solve in 2 steps
  - Assume existence of competitive routine input sector,  $M_{i1} + M_{i2} = [\cdot \cdot \cdot]^{\frac{1}{\mu_i}}$ . Get equilibrium factor-ratio, or equivalently, the  $L_i^m/M_i$  ratio as a function of endowments and the relative price.
  - ② Standard Heckscher-Ohlin in final goods markets: utility maximization & cost minimization allocates  $L_i^a (= \overline{L} L_i^m)$  and  $M_i$  over the two sectors

### 1. Competitive routine input sector

• price = cost of production factors

$$P_{i}^{m} = \frac{1}{Z_{i}} \left[ \alpha_{i}^{-\frac{1}{1-\mu_{i}}} r_{i}^{-\frac{\mu_{i}}{1-\mu_{i}}} + (1-\alpha_{i})^{\frac{1}{1-\mu_{i}}} w_{i}^{-\frac{\mu_{i}}{1-\mu_{i}}} \right]^{\frac{\mu_{i}-1}{\mu_{i}}}$$

- $\rightarrow$  Can express equilibrium conditions in  $\left(\frac{w}{P^m}\right)$  or in  $\left(\frac{w}{r}\right)$
- Capital is only useful in routine production; can solve directly for the factor supply equation (production factors for the final good sectors)

$$\frac{L_i^a}{M_i} = \frac{\bar{L} - L_i^m}{M_i} = f\left(\frac{\bar{L}}{\bar{K}}, \frac{w}{r}\right) = \frac{\frac{\bar{L}}{\bar{K}} - \left[\frac{w_i/(1 - \alpha_i)}{r_i/\alpha_i}\right]^{-\frac{1}{1 - \mu_i}}}{Z_i \alpha_i^{\frac{1}{\mu_i}} \left\{1 + \frac{w_i}{r_i} \left[\frac{w_i/(1 - \alpha_i)}{r_i/\alpha_i}\right]^{-\frac{1}{1 - \mu_i}}\right\}^{\frac{1}{\mu_i}}}$$

## 1. Competitive routine input sector

• price = cost of production factors

$$P_{i}^{m} = \frac{1}{Z_{i}} \left[ \alpha_{i}^{-\frac{1}{1-\mu_{i}}} r_{i}^{-\frac{\mu_{i}}{1-\mu_{i}}} + (1-\alpha_{i})^{\frac{1}{1-\mu_{i}}} w_{i}^{-\frac{\mu_{i}}{1-\mu_{i}}} \right]^{\frac{\mu_{i}-1}{\mu_{i}}}$$

 $\rightarrow$  Can express equilibrium conditions in  $\left(\frac{w}{P^m}\right)$  or in  $\left(\frac{w}{r}\right)$ 

• Capital is only useful in routine production; can solve directly for the factor supply equation (production factors for the final good sectors)

$$\frac{L_i^a}{M_i} = \frac{\bar{L} - L_i^m}{M_i} = f\left(\frac{\bar{L}}{\bar{K}}, \frac{w}{r}\right) = \frac{\frac{\bar{L}}{\bar{K}} - \left[\frac{w_i/(1-\alpha_i)}{r_i/\alpha_i}\right]^{-\frac{1}{1-\mu_i}}}{Z_i \alpha_i^{\frac{1}{\mu_i}} \left\{1 + \frac{w_i}{r_i} \left[\frac{w_i/(1-\alpha_i)}{r_i/\alpha_i}\right]^{-\frac{1}{1-\mu_i}}\right\}^{\frac{1}{\mu_i}}}$$

Solving the model only requires allocating L<sub>1</sub><sup>a</sup> and M<sub>1</sub> (need 2 equations)
 (with L<sub>2</sub><sup>a</sup> = L<sup>a</sup> - L<sub>1</sub><sup>a</sup> and M<sub>2</sub> = M - M<sub>1</sub>)

• F.o.c. in utility maximization, assuming Cobb-Douglas utility (with  $\theta_g$ )

$$\frac{Q_1}{Q_2} = \frac{\theta_1}{1-\theta_1} \frac{P_2}{P_1}$$

ightarrow with some algebra we can replace  $P_1/P_2$  by a function of  $w/P^m$ 

- Solving the model only requires allocating L<sub>1</sub><sup>a</sup> and M<sub>1</sub> (need 2 equations)
   (with L<sub>2</sub><sup>a</sup> = L<sup>a</sup> L<sub>1</sub><sup>a</sup> and M<sub>2</sub> = M M<sub>1</sub>)
- F.o.c. in utility maximization, assuming Cobb-Douglas utility (with  $\theta_g$ )

$$\frac{Q_1}{Q_2} = \frac{\theta_1}{1-\theta_1} \frac{P_2}{P_1}$$

 $\rightarrow$  with some algebra we can replace  $P_1/P_2$  by a function of  $w/P^m$ 

• F.o.c. in cost minimization, assuming CD production fct. (with  $\beta_g$ )

$$\frac{M_g}{L_g^a} = \frac{\beta_g}{1 - \beta_g} \frac{w}{P^m} \quad \text{for } g = 1, 2$$

 $\rightarrow$  with PFs can solve for conditional factor demands  $L_1^a = f(Y_1, \frac{w}{P^m}, \beta),...$ 

- Solving the model only requires allocating L<sub>1</sub><sup>a</sup> and M<sub>1</sub> (need 2 equations)
   (with L<sub>2</sub><sup>a</sup> = L<sup>a</sup> L<sub>1</sub><sup>a</sup> and M<sub>2</sub> = M M<sub>1</sub>)
- F.o.c. in utility maximization, assuming Cobb-Douglas utility (with  $\theta_g$ )

$$\frac{Q_1}{Q_2} \quad = \quad \frac{\theta_1}{1-\theta_1} \, \frac{P_2}{P_1}$$

 $\rightarrow$  with some algebra we can replace  $P_1/P_2$  by a function of  $w/P^m$ 

 $\bullet\,$  F.o.c. in cost minimization, assuming CD production fct. (with  $\beta_{\rm g})$ 

$$rac{M_g}{L_g^a} = rac{eta_g}{1-eta_g}rac{w}{P^m} \qquad ext{for } g=1, \ 2$$

 $\rightarrow$  with PFs can solve for conditional factor demands  $L_1^a = f(Y_1, \frac{w}{P^m}, \beta),...$ 

• After some more algebra we find the (relative) factor demand equation

$$\frac{L_i^a}{M_i} = \frac{\sum_g \theta_g (1 - \beta_g)}{\sum_g \theta_g \beta_g} \frac{P_i^m}{w_i}$$

Archanskaia, Van Biesebroeck, Willmann

CA in routine input production

- Solving the model only requires allocating L<sub>1</sub><sup>a</sup> and M<sub>1</sub> (need 2 equations)
   (with L<sub>2</sub><sup>a</sup> = L<sup>a</sup> L<sub>1</sub><sup>a</sup> and M<sub>2</sub> = M M<sub>1</sub>)
- F.o.c. in utility maximization, assuming Cobb-Douglas utility (with  $\theta_g$ )

$$\frac{Q_1}{Q_2} \quad = \quad \frac{\theta_1}{1-\theta_1} \, \frac{P_2}{P_1}$$

 $\rightarrow$  with some algebra we can replace  $P_1/P_2$  by a function of  $w/P^m$ 

 $\bullet\,$  F.o.c. in cost minimization, assuming CD production fct. (with  $\beta_{\rm g})$ 

$$rac{M_g}{L_g^a} = rac{eta_g}{1-eta_g}rac{w}{P^m} \qquad ext{for } g=1, \ 2$$

 $\rightarrow$  with PFs can solve for conditional factor demands  $L_1^a = f\left(Y_1, \frac{w}{P^m}, \beta\right),...$ 

• After some more algebra we find the (relative) factor demand equation

$$\frac{L_i^a}{M_i} = \frac{\sum_g \theta_g (1 - \beta_g)}{\sum_g \theta_g \beta_g} \frac{P_i^m}{w_i}$$

Archanskaia, Van Biesebroeck, Willmann

# Price equilibrium

 Equating the factor demand and supply equations gives an implicit solution for the equilibrium factor price ratio ω<sub>i</sub><sup>\*</sup> = (w<sub>i</sub>/r<sub>i</sub>)<sup>\*</sup> as a function of endowments and parameters (preferences & technology)

$$\omega_i^* = c \left[ \frac{\bar{L}}{\bar{K}} - (1+c) \left[ \frac{1-\alpha_i}{\alpha_i} \right]^{\frac{1}{1-\mu_i}} (\omega_i^*)^{\frac{-1}{1-\mu_i}} \right]^{-1}$$

with  $c = \frac{\sum_{g} \theta_g (1 - \beta_g)}{\sum_{g} \theta_g \beta_g}$  and  $\frac{\overline{L}}{\overline{K}}$  assumed not country-specific

## Properties of CES function

- When predicting comparative advantage from comparative statics of  $\frac{\partial(Y_1/Y_2)}{\partial\sigma}$  or  $\frac{\partial(P_1/P_2)}{\partial\sigma}$ , need to incorporate that  $\frac{\partial\alpha}{\partial\sigma} \neq 0$ 
  - Note that equilibrium equation contained  $\alpha_i$
- CES is defined as production function with the following property:

$$\sigma = \frac{d \ln(K/L)}{d \ln(F_k/F_l)}$$

- It can be re-written as second-order differential equation in *F*(*K*, *L*); solution contains two integration constants
- The elasticity of substitution is implicitly defined as a point elasticity, related to one particular point on one particular isoquant
- Requiring a CES to go through one particular point, say  $\{Y_0, K_0, L_0, w_0/r_0\}$ , pins down the two integration constants:  $\alpha_i(\sigma_i) \& Z_i(\sigma_i)$

## Properties of CES function

- When predicting comparative advantage from comparative statics of  $\frac{\partial(Y_1/Y_2)}{\partial\sigma}$  or  $\frac{\partial(P_1/P_2)}{\partial\sigma}$ , need to incorporate that  $\frac{\partial\alpha}{\partial\sigma} \neq 0$ 
  - Note that equilibrium equation contained  $\alpha_i$
- CES is defined as production function with the following property:

$$\sigma = \frac{d\ln(K/L)}{d\ln(F_k/F_l)}$$

- It can be re-written as second-order differential equation in *F*(*K*, *L*); solution contains two integration constants
- The elasticity of substitution is implicitly defined as a point elasticity, related to one particular point on one particular isoquant
- Requiring a CES to go through one particular point, say  $\{Y_0, K_0, L_0, w_0/r_0\}$ , pins down the two integration constants:  $\alpha_i(\sigma_i) \& Z_i(\sigma_i)$

### Work with normalized CES

• Klump, McAdam, Willman (2012):

(a) 
$$Y = Y_0 \left[ (1 - s_0) \left( \frac{K}{K_0} \right)^{\mu} + s_0 \left( \frac{L^m}{L_0^m} \right)^{\mu} \right]^{\frac{1}{\mu}}$$
 with  $s_0 = \frac{w_0 L_0^m}{Y_0}$ 

Figure 1. Isoquants of Normalized CES Production Functions.

(b) or substitute 
$$\alpha(\sigma_i) = \frac{(K/L)^{1-\mu_i}}{(K/L)^{1-\mu_i} + \omega_i}$$
 and  $Z(\sigma_i) = \dots$ 

# Comparative advantage predictions

- Comparative advantage depends on factor abundance
- $\sigma$  in the CES is inherently a property about adjustment: it dampens the factor price reduction needed to fully employ the abundant factor

$$\frac{\partial w/r}{\partial \sigma} < 0 \qquad \text{if } \frac{w/(1-\alpha)}{r/\alpha} > 1, \quad \text{i.e. if labor is expensive (scarce)} \\ \frac{\partial w/r}{\partial \sigma} > 0 \qquad \text{if } \frac{w/(1-\alpha)}{r/\alpha} < 1, \quad \text{i.e. if labor is cheap (abundant)}$$

- If labor is scarce (in both countries), the high- $\sigma$  country specializes in the non-routine intensive sector. It can fully employ capital, with a limited increase in the w/r ratio (decrease in r/w). Hence the  $P^M/w$  ratio falls less and abstract labor remains relatively affordable
- If capital is scarce (in both countries), the high- $\sigma$  country specializes in the routine intensive sector

# Comparative advantage predictions

- Comparative advantage depends on factor abundance
- $\sigma$  in the CES is inherently a property about adjustment: it dampens the factor price reduction needed to fully employ the abundant factor

$$\frac{\partial w/r}{\partial \sigma} < 0 \qquad \text{if } \frac{w/(1-\alpha)}{r/\alpha} > 1, \quad \text{i.e. if labor is expensive (scarce)} \\ \frac{\partial w/r}{\partial \sigma} > 0 \qquad \text{if } \frac{w/(1-\alpha)}{r/\alpha} < 1, \quad \text{i.e. if labor is cheap (abundant)}$$

- If labor is scarce (in both countries), the high- $\sigma$  country specializes in the non-routine intensive sector. It can fully employ capital, with a limited increase in the w/r ratio (decrease in r/w). Hence the  $P^M/w$  ratio falls less and abstract labor remains relatively affordable
- If capital is scarce (in both countries), the high- $\sigma$  country specializes in the routine intensive sector

#### Implications

• Comparative statics on changes in w/r, imply changes in  $w/P^M$  that go in the same direction

$$L \text{ scarce} \Rightarrow \frac{\partial w/r}{\partial \sigma} < 0 \Rightarrow \frac{\partial w/P^M}{\partial \sigma} < 0 \Rightarrow \text{ specialize in non-}M$$

- Capital deepening tilts comparative advantage in the high- $\sigma$  country towards the non-routine intensive sector
  - If it had a comparative advantage there: it strengthens
  - If it had the reverse comparative advantage: scope for trade weakens
  - If it had no comparative advantage initially: capital deepening creates it

#### Implications

• Comparative statics on changes in w/r, imply changes in  $w/P^M$  that go in the same direction

$$L \text{ scarce} \Rightarrow \frac{\partial w/r}{\partial \sigma} < 0 \Rightarrow \frac{\partial w/P^M}{\partial \sigma} < 0 \Rightarrow \text{ specialize in non-}M$$

- Capital deepening tilts comparative advantage in the high- $\sigma$  country towards the non-routine intensive sector
  - If it had a comparative advantage there: it strengthens
  - If it had the reverse comparative advantage: scope for trade weakens
  - If it had no comparative advantage initially: capital deepening creates it

## Thought experiment

Initially, two countries produce the same output bundle

- Implicitly normalizes the CES function
- No scope for trade between identical countries; prices have adjusted to support the allocation in consumption & production

• Add capital to both countries (or make capital more productive)

- to clear K market: r falls, relative wage  $\omega_i$  increases
- $\bullet\,$  change is most pronounced in the low- $\sigma\,$  country
- ightarrow makes L relatively expensive in the low- $\sigma$  country
- ightarrow makes M relatively expensive in the high- $\sigma$  country

# Thought experiment

Initially, two countries produce the same output bundle

- Implicitly normalizes the CES function
- No scope for trade between identical countries; prices have adjusted to support the allocation in consumption & production

• Add capital to both countries (or make capital more productive)

- to clear K market: r falls, relative wage  $\omega_i$  increases
- ${\, \bullet \,}$  change is most pronounced in the low- $\sigma$  country
- ightarrow makes L relatively expensive in the low- $\sigma$  country
- ightarrow makes M relatively expensive in the high- $\sigma$  country
- HO-type predictions for trade patterns: countries export the good that uses its abundant factor more intensively (which is cheap)
  - high- $\sigma$  country has become relatively labor abundant
  - ${\, \bullet \,}$  high-  $\sigma$  country specializes in the non-routine intensive good

# Thought experiment

Initially, two countries produce the same output bundle

- Implicitly normalizes the CES function
- No scope for trade between identical countries; prices have adjusted to support the allocation in consumption & production

• Add capital to both countries (or make capital more productive)

- to clear K market: r falls, relative wage  $\omega_i$  increases
- change is most pronounced in the low- $\sigma$  country
- ightarrow makes L relatively expensive in the low- $\sigma$  country
- ightarrow makes M relatively expensive in the high- $\sigma$  country
- HO-type predictions for trade patterns: countries export the good that uses its abundant factor more intensively (which is cheap)
  - $\bullet\,$  high- $\sigma\,$  country has become relatively labor abundant
  - ${\, \bullet \,}$  high-  $\sigma$  country specializes in the non-routine intensive good

#### Intuition from labor adjustment

- Extra K can only be deployed in the production of routine tasks, freeing up labor to be redeployed in abstract tasks
  - $\Delta L^a = -\Delta L^m > 0$
  - $\Delta L^a$  is absorbed by shifting the output ratio towards the non-routine intensive sector
- This adjustment is easier and goes furthest in the high- $\sigma$  country
  - that is the key property of  $\sigma$  in the CES production function: there is less of a productivity penalty if factor ratios move away from equality
- For product markets to clear, the relative price of the non-routine intensive good falls (or increases less), relative to the low-σ country
- $\bullet\,$  The high- $\sigma\,$  country becomes an exporter of the non-routine intensive good
  - the factor price ratio  $w/P^m$  equalizes through a divergence in the K/L ratio in routine production

# Possible mechanisms to micro-found (low) $\sigma$

Recall 
$$\sigma = \frac{d \ln(K/L)}{d \ln(F_k/F_l)}$$

#### • Simplest mechanism: Variation in severance pay incurred by the firm

- Labor market rigidities—e.g. mobility costs, rigid work practices, search costs—drive a wedge between average and marginal wages and reduce adjustments to shocks
- Legal obligation to retrain workers after termination to split burden of educating workers who transition from  $L^m$  to  $L^a$  between the firm and society at large (financed by taxes)
- In countries with low bargaining power for labor, workers can appropriate less of the returns to (K-biased) innovations and firms will choose more risky projects (as they can adjust K/L to take advantage of innovations)

## Possible mechanisms to micro-found (low) $\sigma$

Recall 
$$\sigma = \frac{d \ln(K/L)}{d \ln(F_k/F_l)}$$

- Simplest mechanism: Variation in severance pay incurred by the firm
- Labor market rigidities—e.g. mobility costs, rigid work practices, search costs—drive a wedge between average and marginal wages and reduce adjustments to shocks
- Legal obligation to retrain workers after termination to split burden of educating workers who transition from  $L^m$  to  $L^a$  between the firm and society at large (financed by taxes)
- In countries with low bargaining power for labor, workers can appropriate less of the returns to (K-biased) innovations and firms will choose more risky projects (as they can adjust K/L to take advantage of innovations)

# Two-tiered production function

 $\bullet$  Assumptions of sector-specific  $\beta_{\rm g}$  and country-specific  $\sigma_i$  lead to

$$Y_{igt} = z' \; (L^a_{igt})^{1-eta_g} \left[ (1-lpha) (L^m_{igt})^{\mu_i} + lpha (\mathcal{K}_{igt})^{\mu_i} 
ight]^{rac{eta_g}{\mu_i}}$$

- Verify whether there is empirical support for these assumptions
- Using EU-KLEMS data
  - For 20 countries, 33 sectors, 25 years
  - Assume high-skill workforce is  $L^a$  ( $L^m = L L^a$ )
  - Calculate  $\frac{L^a}{L^a + L^m}$  and  $\ln\left(\frac{K}{L^m}\right)$
  - Estimate  $\beta_{ig}$  and  $\mu_{ig}$  exploiting only time-series variation
- ANOVA analysis provides support that
  - Country FE have most explanatory power for variation in  $\ln \left(\frac{K}{I^m}\right) \& \mu_{ig}$
  - Sector FE have most explanatory power for variation in  $\frac{L^a}{L^a + L^m} \& \beta_{ig}$

# ANOVA

	Sum of squares					F-statistic (N,1)		
	Dep.Var.	Sector	Country	Year	Sec	tor	Country	Year
		(33)	(20)	(25)	(33	3)	(20)	(25)
(a) Observable variables								
$\frac{\overline{L^a}}{\overline{L^a + Im}}$	9.98	5.41	2.84		62.	03	53.69	
L +L		(54.2%)	(28.5%)		(0.0	0)	(0.00)	
$\ln\left(\frac{K}{L^m}\right)$	3843	466	789	1118	114	73	320.63	363.49
(- )		(12.1%)	(20.5%)	(29.1%)	(0.0	0)	(0.00)	(0.00)
(b) Estimated parameters								
$\beta_{ig}$	25.52	5.30	2.67		6.0	3	5.01	
0		(20.8%)	(10.5%)		(0.0	0)	(0.00)	
$\sigma_{ig}$	1636	191	217		1.0	3	1.93	
(if < 20)		(11.7%)	(13.3%)		(0.4	3)	(0.01)	

### Reduced form evidence in two-step analysis

- We follow the 2-step approach of Costinot (2009):
- Step 1: Retrieve pattern of specialization, i.e. ranking of countries in terms of routine versus non-routine intensity of (net) exports
- <u>Step 2</u>: Explain country rankings using country characteristics that proxy for  $\sigma$  (institutional, cultural, organizational, labor-market features,...)
- Could do it in 1 step: regress exports on 'sector<sub>g</sub>  $imes \sigma_i$ -proxy'
  - Useful to gauge quantitative importance of this channel relative to other HO-inspired channels from the literature
  - E.g. Nunn (2007) and Chor (2010)

### Reduced form evidence in two-step analysis

- We follow the 2-step approach of Costinot (2009):
- Step 1: Retrieve pattern of specialization, i.e. ranking of countries in terms of routine versus non-routine intensity of (net) exports
- <u>Step 2</u>: Explain country rankings using country characteristics that proxy for  $\sigma$  (institutional, cultural, organizational, labor-market features,...)
- Could do it in 1 step: regress exports on 'sector<sub>g</sub>  $\times \sigma_i$ -proxy'
  - Useful to gauge quantitative importance of this channel relative to other HO-inspired channels from the literature
  - E.g. Nunn (2007) and Chor (2010)

# Step 1: retrieve routine intensity of exports

- Estimate on two separate samples
  - 43 largest exporters *i* and all importers *j* (small countries are grouped)
  - Within EU trade
- Key explanatory variable: industry ranking w.r.t. routine intensity  $r_g$ 
  - Using task codifiability ranking of Autor, Levy, Murnane (2003)
  - 140 US census industries, 77 in manufacturing
  - Correlated positively with skill intensity, but not identical (ho=-0.62)
  - Matched to HS 4-digit trade data and aggregated to industry

• We run the following regression:

 $\ln EXP_{gij} = \tau_{ij} + \tau_{gj} + \gamma_i r_g + \epsilon_{gij}$ 

- $\hookrightarrow$  Estimated separately for 1995, 2005, 2015 to see whether patterns are stable (using 2-year average exports to smooth outliers)
- $\,\,\hookrightarrow\,\, au_{ij}$  captures bilateral barriers and exporter characteristics
- $\,\,\hookrightarrow\,\, au_{gj}$  captures variation in import barriers and preferences

#### • CA pattern is given by ranking of exporter fixed effects: $\gamma_i$

# Step 1: retrieve routine intensity of exports

- Estimate on two separate samples
  - 43 largest exporters *i* and all importers *j* (small countries are grouped)
  - Within EU trade
- Key explanatory variable: industry ranking w.r.t. routine intensity rg
  - Using task codifiability ranking of Autor, Levy, Murnane (2003)
  - 140 US census industries, 77 in manufacturing
  - Correlated positively with skill intensity, but not identical (ho=-0.62)
  - Matched to HS 4-digit trade data and aggregated to industry
- We run the following regression:

 $\ln EXP_{gij} = \tau_{ij} + \tau_{gj} + \gamma_i r_g + \epsilon_{gij}$ 

- $\hookrightarrow$  Estimated separately for 1995, 2005, 2015 to see whether patterns are stable (using 2-year average exports to smooth outliers)
- $\,\,\hookrightarrow\,\, au_{ij}$  captures bilateral barriers and exporter characteristics
- $\,\hookrightarrow\,\,\tau_{\rm gj}$  captures variation in import barriers and preferences
- CA pattern is given by ranking of exporter fixed effects:  $\gamma_i$

# Country ranking in terms of routineness $(\gamma_i)$ for 2005



#### (a) Countries with negative correlation -- specializing in non-routine intensive industries

#### (b) Countries with positive correlation -- specializing in routine intensive industries



# Evolution of routineness ranking (1995 versus 2015)



X-axis: 1995 corr. coef.

(Slight convergence or weakening of routiness-based comparative advantage)

# Within EU ranking by routineness $(\gamma_i)$



(Large differences, but shrinking over time)

#### Step 2: connect pattern of CA to country characteristics

- Which institutional or cultural dimensions explain the cross-country variation in the routine-intensity of exports?
- We test the following dimensions  $(I_i)$ 
  - Quality of institutions: 'Rule of law'
  - Quality of the workforce: 'Ability to perform' (Costinot, 2009)
  - S Cultural traits: LT orientation; 1/uncertainty avoidance (Hofstede, '80)
  - Lack of frictions in other domain: 'Internal migration' (mobility)
  - S Labor market regulations: strictness of employment protection (OECD)
- We run the following regression:

$$\ln \hat{\gamma}_i = \delta_0 + \delta_1 I_i + \epsilon_i$$

 $\,\hookrightarrow\,$  Recall that  $\hat{\gamma}_i$  increases in routine-intensity of exports: expect  $\delta_1 < 0$ 

# Country characteristics that explain $\hat{\gamma}_i$ in full sample

	(1)	(2)	(3)	(4)	(5)
log(GDP/capita)	-0.619***	-0.168	-0.482***	-0.553***	-0.372*
	(2.7)	(0.8)	(4.0)	(3.3)	(1.7)
Rule of law	0.009				
	(0.1)				
Quality of workforce		-0.538***			
		(2.6)			
Hofstede/culture			-0.375***		
·			(3.1)		
Internal migration				-0.195	
				(1.2)	
Strictness of EPL					-0.149
					(0.7)
Observations	43	43	42	26	26
Adjusted $R^2$	0.34	0.44	0.44	0.30	0.15

• Coefficients are standardized  $\beta$  coeff. that measure effects in SE, t-stats in brackets

• Without GDP/capita control, coefficient on 'Rule of law' is -0.512\*\*\*

• Results similar in 1995/2015; using 1/SE as weights; controlling for Rule of law

# Country characteristics that explain $\hat{\gamma}_i$ within EU

	(1)	(2)	(3)	(4)	(5)
log(GDP/capita)	-0.330	0.027	-0.632***	-0.264	-0.317*
	(1.1)	(0.1)	(4.1)	(1.2)	(1.8)
Rule of law	-0.384				
	(1.3)				
Quality of workforce		-0.569			
		(1.3)			
Hofstede/culture			-0.190		
			(1.2)		
Internal migration				-0.365	
-				(1.6)	
Strictness of EPL				( )	0.607***
					(3.4)
Observations	27	16	26	18	18
Adjusted R <sup>2</sup>	0.43	0.19	0.43	0.18	0.45

• Coefficients are standardized  $\beta$  coeff. that measure effects in SE, t-stats in brackets

• Without GDP/capita control, all coefficients become (strongly) significant

• Except for 'Strictness of EPL' most magnitudes are similar to full sample results

#### What do we learn?

- We learn that institutions which facilitate labor reallocation across tasks may be a source of comparative advantage
  - Countries that adjust more smoothly to technological change (e.g. better K) specialize in production of non-routine-intensive goods
  - 2 Workers in such countries benefit more from opening up to trade
- Way forward: connect  $\sigma$  to the magnitude of adjustment costs
  - Current approach is reduced form: countries differ in K-L substitutability, but this is a feature of the production function
  - 2 Microfoundation of  $\sigma$ : worker- or employer-side friction that reduces the sensitivity of K/L ratio to changes in w/r
  - If this changes the incentives for automation or K accumulation, the mechanism would be re-enforcing

#### What do we learn?

- We learn that institutions which facilitate labor reallocation across tasks may be a source of comparative advantage
  - Countries that adjust more smoothly to technological change (e.g. better K) specialize in production of non-routine-intensive goods
  - 2 Workers in such countries benefit more from opening up to trade
- Way forward: connect  $\sigma$  to the magnitude of adjustment costs
  - Current approach is reduced form: countries differ in K-L substitutability, but this is a feature of the production function
  - **②** Microfoundation of  $\sigma$ : worker- or employer-side friction that reduces the sensitivity of K/L ratio to changes in w/r
  - If this changes the incentives for automation or K accumulation, the mechanism would be re-enforcing