

# Immigration, Task Specialization and Total Factor Productivity

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# Introduction

Immigration is central to the modern American public policy debate

- ▶ Much research focuses on labor market effects (wages and employment)
- ▶ Dearth of research focusing on productivity effects and their timing

## And Yet...

Historical (and contemporary) anecdotes abound,

- ▶ Andrew Carnegie, Nikola Tesla, Sergey Brin, Albert Einstein, Elon Musk, ...

# The Question

**But,**

Those anecdotes are all about **high-skill immigrants**...

## **Question(s)**

- (i) What are the **short and longer-run** effects of immigration on measured TFP?
- (ii) How do these effects depend on the **skill composition** of the immigrant flow and the **stance of immigration policy**?

# Outline

## Illustrative Model

- ▶ Task based framework that endogenizes TFP
  - (i) Reconciles contradictory evidence in literature
  - (ii) Immigration may hurt or help factor productivity → A “Laffer Curve” for immigration policy

## Empirics

- ▶ Dynamic TFP responses to immigration shocks
  - (i) Instrumental variables + Local Projection → LPIV estimator

## Next Steps

- ▶ Quantitative “Ricardo-Roy” model based on the illustrative model here
- ▶ Counterfactual immigration policies
  - ▷ Vary skill composition of migrant inflows keeping inflow size fixed
  - ▷ Vary size of inflows while keeping skill composition fixed

# Literature

**Immigration and Growth/TFP:** Borjas (2019), Peri (2012)

**Shift-Share Designs and Immigration:** Card (2001); Borusyak et al. (2024); Peri (2012); Peri and Sparber (2009)

**Task Composition and Growth:** Acemoglu and Restrepo (2019, 2018)

**Dynamic Treatment Effects:** Jordà and Taylor (2024); Ramey (2016)

**Task Complementarity & Ricardo-Roy Models:** Costinot and Vogel (2015, 2010)

# Illustrative Model

# One Sector Model: Final Good Tech

Three factors of production: Foreign born, native born & physical capital

Intermediate labor services (tasks)  $l(i)$  combine with capital  $K$  to produce  $Y$ ,

$$Y = K^\theta \left\{ \left( \int_0^1 l(i)^\rho di \right)^{\frac{1}{\rho}} \right\}^{1-\theta} \quad \rho \in (0, 1), \quad \theta \in (0, 1)$$

**Preview:** For any given capital stock  $K$  TFP,  $Z$  is labor-augmenting,

$$Y = K^\theta \{ZL\}^{1-\theta}$$

and endogenously depends on allocation task allocation between foreign and native-born

# Simple Model - Task Technology

Final good producer purchases labor services  $l(i)$  from **perfectly competitive** intermediate producers with tech

$$l(i) = \alpha^D z^D(i) d(i) + \alpha^F z^F(i) f(i)$$

- (i)  $d(i)$  is domestic labor demanded and  $f(i)$  is foreign-born labor demanded
- (ii)  $\alpha^D, \alpha^F$  parametrize absolute advantage

**Assumption:** Domestic labor has **comparative advantage (CA)** in certain tasks, i.e.

$$\frac{z^D(i')}{z^F(i')} > \frac{z^D(i)}{z^F(i)}, \quad \text{all } i' > i$$



# Simple Model - Task Specialization

Comparative advantage suggests foreign born and domestic born want to specialize

- ▶ Starting point: Complete specialization
- ▶ Later Quantitative Model (Ricardo-Roy): Partial specialization by Extreme Value shocks

→ Our assumption on comp. advantage implies a “cutoff” task  $l$  such that,

$$\begin{cases} d(i) = 0 & \text{and} & f(i) > 0 & \text{for} & i < l \\ d(i) > 0 & \text{and} & f(i) = 0 & \text{for} & i \geq l \end{cases}$$

**No Arbitrage:** Minimum unit costs are the same using either factor at cutoff  $l$ ,

$$\rightarrow \frac{\alpha^D z^D(l)}{\alpha^F z^F(l)} = \frac{w^D}{w^F}$$

## Simple Model - TFP and Task Allocation

With supply  $F$  of foreign born and supply  $D$  of domestic born equilibrium output (at market clearing wages) is,

$$\begin{aligned} Y &= K^\theta \left( Z(I) \left\{ \lambda(I)^{1-\rho} (\alpha^F F)^\rho + [1 - \lambda(I)]^{1-\rho} (\alpha^D D)^\rho \right\}^{\frac{1}{\rho}} \right)^{1-\theta} \\ &= K^\theta (Z(I) L(I))^{1-\theta} \end{aligned}$$

where

$$Z(I) = \left( \int_0^I z^F(i)^{\frac{\rho}{1-\rho}} di + \int_I^1 z^D(i)^{\frac{\rho}{1-\rho}} di \right)^{\frac{1-\rho}{\rho}}$$

and

$$\lambda(I) = \frac{\int_0^I z^F(i)^{\frac{\rho}{1-\rho}} di}{\int_0^I z^F(i)^{\frac{\rho}{1-\rho}} di + \int_I^1 z^D(i)^{\frac{\rho}{1-\rho}} di}$$

# Equilibrium of the Simple Model

An equilibrium of the illustrative model is a set of quantities  $\{l(i), d(i), f(i)\}_{i \in [0,1]}$ , task prices  $\{p(i)\}_{i \in [0,1]}$ , factor prices  $\{w^D, w^F\}$  and a cutoff task  $l$  such that

- (i) Final goods and labor-service producers maximize profits
- (ii) The markets for labor services, domestic born workers and foreign born workers clear
- (iii) The cutoff task  $l$  satisfies the no-arbitrage condition

# Effects of Migration on TFP

## Proposition ( $dl/dF > 0$ )

*The measure of tasks allocated to foreign-born labor rises with supply of foreign born labor.*

► Proof

## Proposition (Migration “Laffer Curve”)

*There exists a cutoff task  $I^*$  for which  $dZ/dF \geq 0$  when  $I \leq I^*$  and  $dZ/dF \leq 0$  when  $I \geq I^*$ . This  $I^*$  is defined by  $z^D(I^*)/z^F(I^*) = 1$ .*

► Proof

# A Sufficient Statistic for Policy

That  $Z$  increases iff  $z^D(I)/z^F(I) < 1$ ,

→ Regressing measured TFP on plausibly exogenous migration flows can yield conclusions about whether productivity stands to rise or fall following proposed migration policy

**If TFP Rises for  $\Delta F > 0$**

⇒  $I < I^*$  i.e. policy is “too tight” relative to a productivity-maximizing policy

▶ Alternative Criterion

Let us now turn to an empirical framework that implements this test...

# Empirics

# Measuring TFP

The log of output in state  $s$  at time  $t$  can be written,

$$\ln Y_{st} = \mathbb{E}[\ln Y_t | K_t, F_t, D_t] + u_{st}$$

Expression for output in the simple model above suggests,

$$\mathbb{E}[\ln Y_t | K_t, F_t, D_t] = \theta \ln K_t + \frac{1-\theta}{\rho} \ln \left( \lambda_t^{1-\rho} (\alpha^F F_t)^\rho + [1 - \lambda_t]^{1-\rho} (\alpha^D D_t)^\rho \right)$$

# State-Level TFP Measure

Using a panel of US states we can write

$$u_{st} = \delta_s + \gamma_t + e_{st}$$

The **specification** of interest is then

$$\ln Y_{st} = \delta_s + \gamma_t + \theta \ln K_t + \frac{1-\theta}{\rho} \ln \left( \lambda_t^{1-\rho} (\alpha^F F_t)^\rho + [1 - \lambda_t]^{1-\rho} (\alpha^D D_t)^\rho \right) + e_{st}$$

$$\rightarrow \hat{Z}_{s,t} = \exp \left( \frac{\hat{\delta}_s + \hat{e}_{s,t}}{1-\hat{\theta}} \right)$$



# Data and Sample

## **GDP by State:**

Source: Bureau of Economic Analysis (BEA)

## **Capital by State:**

Constructed from:

- (i) Value added by industry by state (BEA)
- (ii) Fixed asset accounts by industry (BEA)

## **Foreign/Domestic Labor:**

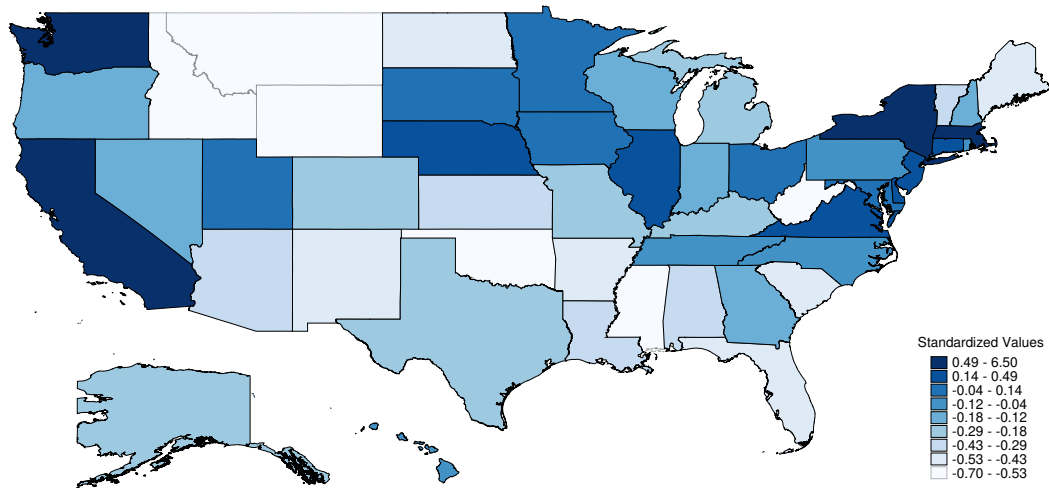
Source: ACS (Ruggles et al., 2024) for 2000-2022, CPS (Flood et al., 2024) for 1994-1999, 2023, 2024

## **Sample:**

Period, 1994-2023

Full time workers ( $\geq 35$  hours per week), Age 16+

# TFP Estimates, 2019



# Local Projections of TFP on Migration Flows

Interested in estimating **dynamic treatment effect**

$$\hat{z}_{s,t+h} = \phi_s + \eta_t + \beta_h f_{s,t+1} + v_{s,t}, \quad h = 1, 2, \dots$$

where

$$(i) \hat{z}_{s,t+h} = \frac{\hat{z}_{s,t+h} - \hat{z}_{s,t}}{\hat{z}_{s,t}},$$

$$(ii) f_{s,t+1} = \frac{F_{s,t+1} - F_{s,t}}{L_{s,t}} \text{ where } L_{s,t} \text{ is employment in state } s$$

**Threat to Identification:**  $\mathbb{E}(v_{s,t} | f_{s,t+1}) \neq 0$

→ Namely, factors which cause higher TFP growth are correlated with migration flows

# A Shift Share Instrument

Let  $i$  index various migrant groups (Canada, Mexico, etc). Decompose  $f_{s,t+1}$  as

$$f_{s,t+1} = \sum_i w_{i,s,t} g_{i,s,t+1}$$

where  $w_{i,s,t} = F_{i,s,t}/L_{s,t}$  and  $g$  is the growth rate of group  $i$  in state  $s$

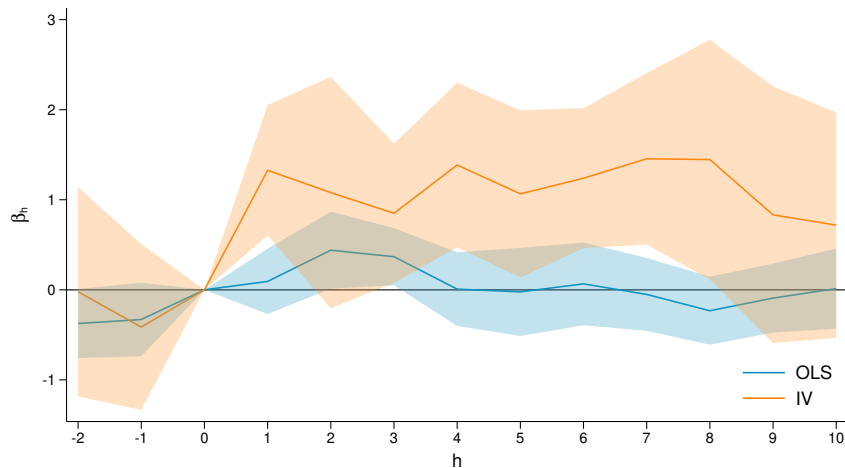
Then, a shift-share instrument for  $f_{s,t+1}$  is given by

$$x_{s,t+1} = \sum_i w_{i,s,t-j} G_{i,t+1} \quad \text{some } j \in \{0, 1, \dots\}$$

(i)  $w_{i,s,t-1} \equiv F_{i,s,t-1}/L_{s,t-1}$

(ii)  $G_{i,t+1}$  is the national growth rate of migrant group  $i$

# Dynamic Effects of Immigration on TFP



Standard errors clustered by year, 90% confidence. Shift-share IV constructed using  $j = 1$ .

# Next Steps

# Next Steps

## Empirics:

- ▶ Implement H-1B visa lottery instrument
- ▶ Incorporate ONET data: What is the task content of immigrant occupations? Does comparative advantage vanish at higher skill levels? The H-1B instrument should shed light on this

## Quantitative Model:

- ▶ Build prototype Ricardo-Roy model. Empirical tests in this slide-deck suggest that we are below  $I^*$ . How much should we loosen migration policy to achieve  $I^*$ ?

# Appendix



## Proof of $dl/dF > 0$

### Proof.

Using market clearing and the no-arbitrage condition,  $l$  is implicitly defined by

$$\left( \frac{\alpha^D z^D(l)}{\alpha^F z^F(l)} \right)^{\frac{1}{1-\rho}} = \frac{F \int_l^1 z^D(i)^{\frac{\rho}{1-\rho}} di}{D \int_0^l z^F(i)^{\frac{\rho}{1-\rho}} di}.$$

By inspection, an increase in  $F$  will increase the right hand side of this relation. Since this is an equilibrium condition and  $z^D(l)/z^F(l)$  is assumed to increase in  $l$ , it must be that  $l$  rises to restore equality. [◀ Return](#) □

## Existence of $I^*$

### Proof.

Using the expression for  $Z(I)$  we have that

$$\frac{dZ}{dF} = \frac{1-\rho}{\rho} Z^{1-\frac{\rho}{1-\rho}} \left( \frac{dI}{dF} \right) \left( z^F(I)^{\frac{\rho}{1-\rho}} - z^D(I)^{\frac{\rho}{1-\rho}} \right)$$

Since  $dI/dF \geq 0$  it follows that TFP rises when

$$z^D(I)/z^F(I) \leq 1.$$

◀ Return



## A Ramsey Problem

Let lower case letters denote per-capita terms and  $N = D + F$ . A policy which maximizes per capita welfare in the static economy is given by

$$\max_{f, I, y} \quad y \quad \text{s.t.}$$

$$y = k^\theta \left( Z(I) \left\{ \lambda(I)^{1-\rho} (\alpha^F f)^\rho + [1 - \lambda(I)]^{1-\rho} (\alpha^D d)^\rho \right\}^{\frac{1}{\rho}} \right)^{1-\theta}$$

$$1 = d + f$$

$$f \leq \bar{f}$$

$$Z(I) = \int_0^I z(i)^{F \frac{\rho}{1-\rho}} di + \int_I^1 z(i)^{D \frac{\rho}{1-\rho}} di$$

$$\left( \frac{\alpha^D z^D(I)}{\alpha^F z^F(I)} \right)^{\frac{1}{1-\rho}} = \frac{f \int_I^1 z^D(i)^{\frac{\rho}{1-\rho}} di}{d \int_0^I z^F(i)^{\frac{\rho}{1-\rho}} di}$$

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