

The Long Run Effects of Trade Liberalization on Income Volatility and Occupational Mobility

Marcos Cerón, Eduardo García, Paulo Lins

University of Rochester

Applied Reading Group, 2020

Outline

1 Income Volatility

■ Introduction

■ Data

■ Measuring Regional Income Volatility

■ Measuring Regional Tariff Reduction

■ Main Econometric Specification and Identification

2 Occupational Mobility

■ Introduction

■ Data and Measuring Regional Occupational Mobility

■ Main Econometric Specification

3 Conclusions and Steps to Follow

Trade Liberalizations and Labor Markets

- ▶ Most trade liberalization analyses have focused on its impact on **average earnings**.
- ▶ Its effect on **income inequality** has also been studied (though considerably less).
- ▶ Little is known about its impact on **income volatility**.

Why is it Important?

Definition [Income Volatility]:

Variance of the **unpredictable component** of my income.

Example: Suppose,

$$\bullet y_t = y_t^{\text{Det.}} + \mu_t$$

$$\bullet \mu_t \sim \text{i.i.d.}(0, \sigma^2)$$

For **risk-averse** agents,

$$\uparrow \sigma^2 \Rightarrow \downarrow U(y_t)$$

What is known about Income Volatility and Trade?

Contemporaneous effects:

Mexico [Krebs (2010; REST)] and the US [Krishna (2014; RES)]:

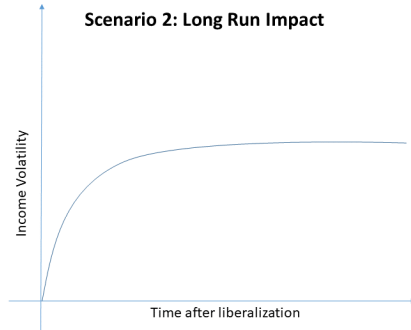
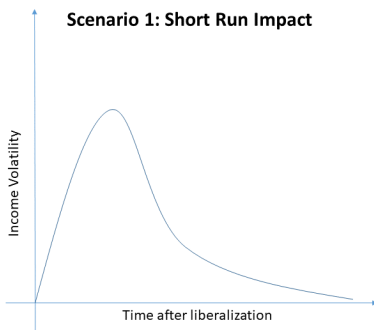
$$\downarrow \text{Tariffs}_t \Rightarrow \uparrow \text{Inc. Vol.}_t$$

Channels:

- ▶ Capital and labor **reallocation** across firms/sectors;
- ▶ \downarrow Tariffs $\Rightarrow \uparrow$ Exposure to **external shocks**.

Long-run effects of trade liberalization on Income Volatility?

Long vs. Short Run (Possible Scenarios)



Brazilian Trade Liberalization (1990-95)

Ideal to study trade policy changes' effects on labor markets:

- ▶ **Unilateral** and **unexpected**,
- ▶ **Large decline** in average tariffs (30.5% → 12.8%),
- ▶ **Steadiness** in the tariffs post-1995. [▶ Average tariffs](#)
- ▶ **Heterogeneity** in tariff cuts across industries. [▶ Tariff cuts per sector](#)
- ▶ Previous **“tariffication”**:
 - ▶ Non-tariff trade barriers were **replaced** by tariffs.

Impulse Response Function

Main econometric specification:

$$\hat{\sigma}_{r,t}^2 - \hat{\sigma}_{r,1991}^2 = \theta_t RTR_r + \Gamma' Z_{r,t} + \gamma_t (\hat{\sigma}_{r,1990}^2 - \hat{\sigma}_{r,1986}^2) + \alpha_{s,t} + \varepsilon_{r,t}$$

for each $t \in \{1992, 1993 \dots 2017\}$.

Notation:

- ▶ $\hat{\sigma}_{r,t}^2$: **Income volatility** in region r at time t ;
- ▶ RTR_r : Regional **tariff reduction** (1990-95);
- ▶ $Z_{r,t}$: Regional **controls**;
- ▶ $\hat{\sigma}_{r,1990}^2 - \hat{\sigma}_{r,1986}^2$: **Pre-trend** control;
- ▶ $\alpha_{s,t}$: State time-varying fixed effects.

Outline

1 Income Volatility

- Introduction

- Data

- Measuring Regional Income Volatility

- Measuring Regional Tariff Reduction

- Main Econometric Specification and Identification

2 Occupational Mobility

- Introduction

- Data and Measuring Regional Occupational Mobility

- Main Econometric Specification

3 Conclusions and Steps to Follow

Relação Anual de Informações Sociais (RAIS)

- ▶ (+) Annual **administrative dataset** (1986-2018) [Brazilian Ministry of Labor].
- ▶ (+) Job records including:
 - ▶ Worker and establishment **identifiers**,
 - ▶ **Workers**: Earnings, age, tenure, education, gender, occupation...
 - ▶ **Firms**: Geographic location, sector and size.
- ▶ (+) Firms fined for not reporting RAIS. Workers need it for government benefits.
- ▶ (+) RAIS is a **census**.
- ▶ (−) No information on **informal sector** [50% of labor force].

Outline

1 Income Volatility

- Introduction
- Data
- Measuring Regional Income Volatility
- Measuring Regional Tariff Reduction
- Main Econometric Specification and Identification

2 Occupational Mobility

- Introduction
- Data and Measuring Regional Occupational Mobility
- Main Econometric Specification

3 Conclusions and Steps to Follow

How are regions defined?

- ▶ Micro-regions defined by the **Brazilian Statistical Agency** (IBGE);
- ▶ Groups economically integrated contiguous municipalities;
- ▶ **475 micro-regions**;
- ▶ **Local labor market** \Rightarrow 3.4% lived and worked in different micro-regions.

Measuring Income Volatility

We assume the following **Mincer equation**:

$$\log y_{i,j,r,t} = \alpha_{j,t} + \beta'_{t,r} \cdot x_{i,j,t} + u_{i,j,r,t}$$

i : individual; j : firm; r : region; and t : period.

Notation:

- ▶ $x_{i,j,t}$: Worker **observable characteristics**,
- ▶ $\beta'_{t,r}$: Time-varying region-varying coefficients,
- ▶ $\alpha_{j,t}$: Firm time-varying firm fixed effects,
- ▶ $u_{i,j,r,t}$: **Stochastic term**.

Measuring Income Volatility - Krebs (2010; REST)

The stochastic term is further **decomposed**:

$$u_{i,j,r,t} = \omega_{i,j,r,t} + \eta_{i,j,r,t}$$

1 Persistent component: Random walk:

$$\begin{aligned} \bullet \omega_{i,j,r,t} &= \omega_{i,j,r,t-1} + \varepsilon_{i,j,r,t} \\ \bullet \varepsilon_{i,j,r,t} &\sim \mathcal{N}(0, \sigma_{r,t}^2) \end{aligned}$$

Income Process Literature:

Güvenan (2009); Storesletten (2004) [$\hat{\rho} \approx 1$].

2 Transitory component: Isolates measurement error:

$$\bullet \eta_{i,j,r,t} \sim \mathcal{N}(0, \tilde{\sigma}_{r,t}^2).$$

Measuring Income Volatility - Krebs (2010; REST)

The stochastic term is further **decomposed**:

$$u_{i,j,r,t} = \omega_{i,j,r,t} + \eta_{i,j,r,t}$$

1 Persistent component: Random walk:

$$\begin{aligned} \bullet \omega_{i,j,r,t} &= \omega_{i,j,r,t-1} + \varepsilon_{i,j,r,t} \\ \bullet \varepsilon_{i,j,r,t} &\sim \mathcal{N}(0, \sigma_{r,t}^2) \end{aligned}$$

Income Process Literature:

Güvenan (2009); Storesletten (2004) [$\hat{\rho} \approx 1$].

2 Transitory component: Isolates measurement error:

$$\bullet \eta_{i,j,r,t} \sim \mathcal{N}(0, \tilde{\sigma}_{r,t}^2).$$

Estimation – GMM

Thus,

$\hat{\sigma}_{r,t}^2$: estimate of **income volatility** in region r at time t .

Notice that,

$$\begin{aligned}\Delta_s u_{i,j,r,t} = u_{i,j,r,t+s} - u_{i,j,r,t} &= \varepsilon_{i,j,r,t+1} + \varepsilon_{i,j,r,t+2} + \cdots \varepsilon_{i,j,r,t+s} \\ &\quad + \eta_{i,j,r,t+s} - \eta_{i,j,r,t}\end{aligned}$$

Moment conditions are:

$$\begin{aligned}\Rightarrow \text{Var}[\Delta_s u_{i,j,r,t}] = \\ \sigma_{r,t+1}^2 + \sigma_{r,t+2}^2 + \cdots + \sigma_{r,t+s}^2 + \tilde{\sigma}_{r,t}^2 + \tilde{\sigma}_{r,t+s}^2\end{aligned}$$

Outline

1 Income Volatility

- Introduction
- Data
- Measuring Regional Income Volatility
- **Measuring Regional Tariff Reduction**
- Main Econometric Specification and Identification

2 Occupational Mobility

- Introduction
- Data and Measuring Regional Occupational Mobility
- Main Econometric Specification

3 Conclusions and Steps to Follow

Regional Tariff Reduction (RTR_r)

Following Kovak (2013; AER):

$$RTR_r = - \sum_k \beta_{r,k} [\ln(1 + \tau_{k,1995}) - \ln(1 + \tau_{k,1990})]$$

$$\text{where } \beta_{r,k} = \frac{\lambda_{r,k} \cdot \frac{1}{\phi_k}}{\sum_i \lambda_{r,i} \cdot \frac{1}{\phi_i}}.$$

►► Papers

Notation:

- k : industry,
- $\lambda_{r,k}$: industry k 's **share of regional labor** (pre-liber.)
[Source: 1991 Census],
- ϕ_k : industry k 's cost share of **non-labor factors** (pre-liber.)
[Source: 1990 National Accounts (IBGE)].

Regional Tariff Reduction – Dix-Carneiro (2017; AER)

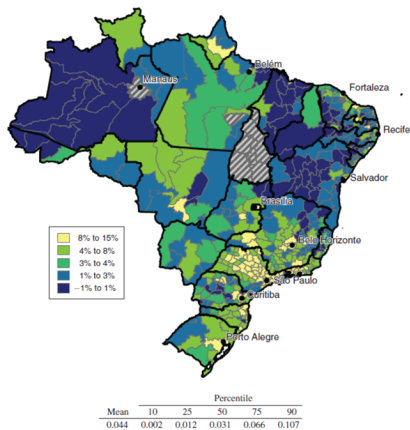


FIGURE 2. REGIONAL TARIFF REDUCTIONS

Outline

1 Income Volatility

- Introduction
- Data
- Measuring Regional Income Volatility
- Measuring Regional Tariff Reduction
- **Main Econometric Specification and Identification**

2 Occupational Mobility

- Introduction
- Data and Measuring Regional Occupational Mobility
- Main Econometric Specification

3 Conclusions and Steps to Follow

Impulse Response Function

Main econometric specification:

$$\hat{\sigma}_{r,t}^2 - \hat{\sigma}_{r,1991}^2 = \theta_t RTR_r + \Gamma' Z_{r,t} + \gamma_t (\hat{\sigma}_{r,1990}^2 - \hat{\sigma}_{r,1986}^2) + \alpha_{s,t} + \varepsilon_{r,t}$$

for each $t \in \{1992, 1993 \dots 2017\}$.

Notation:

- ▶ $\hat{\sigma}_{r,t}^2$: **Income volatility** in region r at time t ;
- ▶ RTR_r : Regional **tariff reduction** (1990-95);
- ▶ $Z_{r,t}$: Regional **controls**;
- ▶ $\hat{\sigma}_{r,1990}^2 - \hat{\sigma}_{r,1986}^2$: **Pre-trend** control;
- ▶ $\alpha_{s,t}$: State time-varying fixed effects.

Possible Confounders

Tariff cuts' exogeneity:

- ▶ **Highly correlated** $[-0.9]$ with the pre-lib. tariff levels;
- ▶ Pre-lib. tariff levels date **from 1957** (Kume 2003).

Potential Confounder:

- ▶ Drive Income volatility across regions within a state;
- ▶ **Correlated** RTR_r ;
- ▶ **Not captured** by Pre-Trend control.

Nonetheless, control for other post-liberalization shocks:

- ▶ Global commodity price boom.

Outline

1 Income Volatility

- Introduction
- Data
- Measuring Regional Income Volatility
- Measuring Regional Tariff Reduction
- Main Econometric Specification and Identification

2 Occupational Mobility

- Introduction
- Data and Measuring Regional Occupational Mobility
- Main Econometric Specification

3 Conclusions and Steps to Follow

How does Regional Occupational Mobility Respond?

- ▶ Do the effects of trade liberalization on occ. mobility **fade or persist**?

Outline

1 Income Volatility

- Introduction
- Data
- Measuring Regional Income Volatility
- Measuring Regional Tariff Reduction
- Main Econometric Specification and Identification

2 Occupational Mobility

- Introduction
- Data and Measuring Regional Occupational Mobility
- Main Econometric Specification

3 Conclusions and Steps to Follow

Classificação Brasileira de Ocupações (CBO)

- ▶ Brazil's **occupational classification** system (Ministry of Labor).
- ▶ Three editions: 1994, 2002 and 2010.
- ▶ **Describes** for each occupation (4-digit CIIU):
 - ▶ **Activities** performed,
 - ▶ **Skills and educational level** required,
 - ▶ **Resources**, equipment and utensils employed,
 - ▶ 6-digit CIIU code of occupations that compose it.

CBO Example – Electrical/Electronic Engineers

CIU Code: 2143

Description:

- ▶ Execute electrical, electronic and telecommunications services.
- ▶ Install, administer and inspect systems and equipment,
- ▶ Study electrical, electronic and telecommunication processes...

Formation and Experience:

- ▶ Formation in Electric, electronic or telecommunications engineering.
- ▶ On average, 4 years of experience for engineers...

Resources:

- ▶ Internet access, e-mail...

Occupations:

- ▶ 2143-05 Electrical engineer; 2143-10 Electronic Engineer...

Measuring Regional Occupational Mobility

Extensive margin:

- ▶ $m_{r,t}$: % of workers changing occupation in region r at time t .

Coarse measure \Rightarrow not all occupation switches are the same.

Notion of Distance:

Baker \rightarrow Chef

\neq

Banker \longrightarrow Construction Worker.

Distance between Occupations – Gothman et al. (2010)

Occupation O is **characterized** by vector:

$$q_O = (q_{O,1}; q_{O,2}; \cdots q_{O,19})$$

Where,

$q_{O,i}$: **Intensity** of task “ i ” in occupation “ O ”
 (% of workers in “ O ” performing task “ i ”) [▶ Example](#)

Definition:

$$\text{Dist}_{O,O'} = 1 - \text{Ang}_{O,O'} = 1 - \frac{\sum_i q_{O,i} q_{O',i}}{(\sum_j q_{O,j}^2 \times \sum_k q_{O',k}^2)^{1/2}}$$

Adaptation using the Brazilian CBO

Electrical/Electronic Engineers:

CIIU Code: 2143

Description:

- ▶ Activity 1
- ▶ Activity 2
- ▶ Activity 3
- ▶ Activity 4
- ▶ Activity 5

Adaptation using the Brazilian CBO

Electrical/Electronic Engineers:

CIIU Code: 2143

Description:

- ▶ Activity 1
- ▶ Activity 2
- ▶ Activity 3
- ▶ Activity 4
- ▶ Activity 5

Task 1

Task 2

Task 3

Classification via text analysis [Mihayvol (2019; ISCO)].

Distance between Occupation (using CBO)

1 Redefine intensities:

$\tilde{q}_{O,i}$ = % of **activities** in task “i” for occupation “O”.

$$\tilde{q}_O = (3/5, 1/5, 1/5)$$

2 Adjust distances accordingly,

$$\widetilde{\text{Dist}}_{O,O'} = 1 - \frac{\sum_i \tilde{q}_{O,i} \tilde{q}_{O',i}}{(\sum_j \tilde{q}_{O,j}^2 \times \sum_k \tilde{q}_{O',k}^2)^{1/2}}$$

3 Important: Check $\widetilde{\text{Dist}}_{O,O'}$ and $\text{Dist}_{O,O'}$ in GQCS or other.

Outline

1 Income Volatility

- Introduction
- Data
- Measuring Regional Income Volatility
- Measuring Regional Tariff Reduction
- Main Econometric Specification and Identification

2 Occupational Mobility

- Introduction
- Data and Measuring Regional Occupational Mobility
- Main Econometric Specification

3 Conclusions and Steps to Follow

Regional Response of Occupational Mobility

1 Definition: $m_{r,t}$: Average $\widetilde{\text{Dist}}_{O,O'}$ in region r at time t .

2 Impulse Response Function:

$$m_{r,t} - m_{r,1991} = \theta_t RTR_r + \Gamma' Z_{r,t} + \gamma_t (m_{r,1990} - m_{r,1986}) + \alpha_{s,t} + \varepsilon_{r,t}$$

for each $t \in \{1992, 1993 \dots 2002\}$.

Notation:

- ▶ RTR_r : Regional tariff reduction,
- ▶ θ_t : Parameter of interest.

Conclusions and Steps to Follow

Conclusions:

- ▶ Brazil's liberalization: ideal to study **long-run effects** on labor markets.
- ▶ Long-run effects on Income Volatility and Occup. Mobility are **yet to be understood**.

Steps to follow:

- 1 Calculate $\hat{\sigma}_{r,t}^2$ and $m_{r,t}$ from data.
- 2 Estimate the Impulse Response Functions,
- 3 Study **mechanisms**.

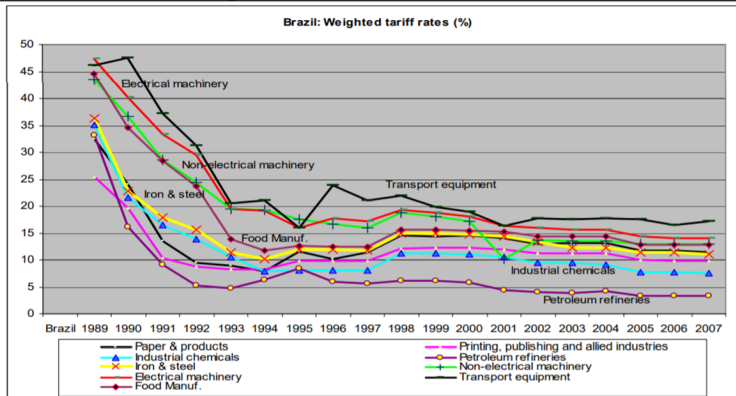
Other Ideas:

- ▶ **Monetize** $\hat{\sigma}_{r,t}^2$ and $m_{r,t}$.

Thank you!

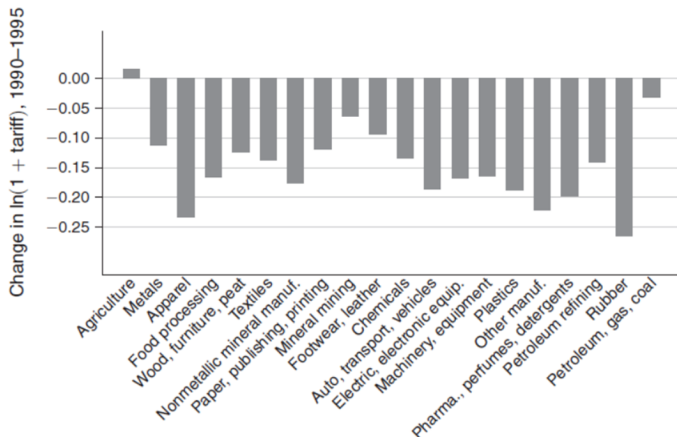
Average tariffs in Brazil – Chandra (2009; WB)

Figure 13: Brazil – trade liberalization



Source: TRAINS database

Tariff Changes per Industry – Kume (2003)



Example – German Qualification and Career Survey

Summary Statistics of Task Data

	Mean	Standard Deviation	Example	
			Teacher (%)	Baker (%)
Analytical tasks:	55.02	49.75	63.7	32.4
Research, evaluate, or measure	25.11	43.37	34.0	13.6
Design, plan, or sketch	10.21	30.28	17.6	3.6
Correct texts or data	23.85	42.62	39.6	6.4
Calculate or do bookkeeping	26.02	43.87	11.3	22.5
Program	8.35	27.66	8.4	.4
Execute laws or interpret rules	7.85	26.89	17.2	.8
Analytical is main task	31.56	46.48	15.9	13.1
No. observations	52,718		1,067	472

SOURCE.—Qualification and Career Surveys, 1979, 1985, 1991/92, 1997/98.

Papers that use RTR_r

- ▶ Kovak (2013; AER);
- ▶ Dix-Carneiro and Kovak (2017; AER);
- ▶ Dix-Carneiro and Kovak (2019; IER);
- ▶ Dix-Carneiro, Soares and Ulyssea (2018; AEJ).

Tariff measures per industry: Kume, Piani and Souze (2003; IPEA).

◀ Regional Tariff Reduction