## A Financing Channel of Gains From Trade

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December 2022



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## Motivation

 $\mbox{\bf Trade}$  is a source of growth because it reallocates factors in the economy

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This paper: wealth from trade can accumulate factors  $\Rightarrow$  growth

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Tracing factor accumulation ⇒ dynamic gains that impact both the traded & non-traded sectors:

- 1. Larger gains from trade
- 2. Causal link explaining the "Levine-Renelt puzzle"

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How much growth does it generate domestically?

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 $\Longrightarrow$  Shock to Peruvian firm profits

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FTA is a trade cost shock to Peruvian firms

#### We identify:

1. "First stage": FTA impacts traded-sector firm exports & imports

2. Savings: Traded-sector firm profitability impacts banks

3. Re-investment: Banks impact non-traded firm sector growth

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  - $\Rightarrow$  Real firm outcomes [not today]

#### Related literature

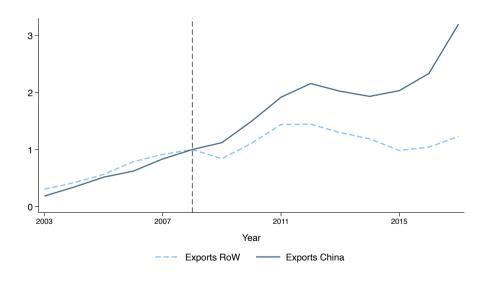
#### Static and dynamic gains from trade:

- Smith (1776), Baldwin (1992), Eaton Kortum (2002), Melitz (2003), Arkolakis Costinot Rodriguez-Clare (2012), Ossa (2012), Caliendo Parro (2012), Melitz Redding (2014), Anderson Larch Yotov (2015), Alvarez (2017), Alessandria Choi Ruhl (2018), Ravikumar Satacreu Sposi (2019)
- ⇒ Empirical analysis tracing capital accumulation through banking sector

#### Trade and finance:

- Beck (2003), Levchenko Lewis Tesar (2010), Amiti Weinstein (2011), Chor Manova (2012), Schmidt-Eisenlohr (2013), Manova (2013), Antràs Foley (2014), Paravisini Rappoport Schnabl Wolfenzon (2014), Chaney (2016), Eaton Kortum Neiman Romalis (2016), Paravisini Rappoport Schnabl (2020), Xu (2022)
- ⇒ Trade impacts the financial sector

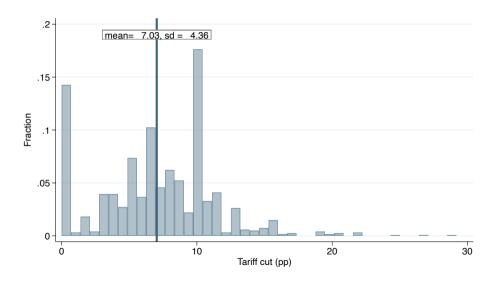
# FTA Institutional Context



# Peru's top exports industries & tariff cut

Description	Value (billions pre-FTA)	Tariff rate (pp pre-FTA)
Metals, gold	4.68	0
Copper ores & concentrates	3.17	0
Copper, refined	2.27	2
Fish meals/pellets	1.35	3.5
Zinc ores & concentrates	1.35	0
Petroleum oils	0.85	6.67
Molybdenum ores	0.79	0
Petroleum gases	0.69	6.5
Lead ores & concentrates	0.58	0
Tin, unwrought	0.52	3
Coffee	0.49	8
T-shirts, cotton	0.44	14

# Distribution of tariff cut



# **Total Peruvian firm profits**

$$\Delta \pi_{i} = \Delta Revenue_{i} - \Delta Costs_{i}$$

$$\Delta \pi_{i}(TC_{k,c}, TC_{k,p}) = \underbrace{\Delta Sales_{D,i} + \Delta Sales_{X,i}}_{f(TC_{k,p})} - \underbrace{\Delta Costs_{M,i}}_{f(TC_{k,p})}$$

 $TC_{k,c}$ :  $\Delta$  tariff to export to China

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#### Direction of effects on profits:

 $\Delta Sales_{D,i}:$  -

 $\Delta Sales_{X,i}:+$ 

 $\Delta Costs_{M,i}:+$ 

Data & Empirical strategy

#### Data: 2004 to 2017

- 1. Customs data: firm i imports & exports by product p to/from countries c
- 2. **Credit registry**: bank *b* loans matched to firm *i*
- 3. Bank balance sheets: bank b loans, size, profits, etc.
- 4. Firm characteristics & outcomes:
  - Currently: loans at the firm level & EEA (Encuesta Economica Nacional)
    - "Census" for large & medium firms,
    - $\bullet~\approx 60\%$  of total credit & 50% of exports
  - In progress: real outcomes from firm balance sheets

**Trade cost shock**: varies by product k & destination country c:

Tariff 
$$Cut_{kct} = \begin{cases} 0 & \text{if destination is not China} \\ TC_k & \text{if destination is China & year } \geq 2009 \end{cases}$$

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$$\mathsf{TC}_i^{\mathit{direct}} = \sum_k \mathsf{TC}_k \cdot \omega_{ki}$$
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# Identification: bank exposure exogeneity

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Firm shocks orthogonal to bank characteristics relevant for bank outcomes on average after 2008

#### Identification threats

**Identifying assumption:** Firm tariff-cut exposures orthogonal to bank characteristics relevant for bank outcomes after 2008 on average

**Example of threats to identification:** High TC<sub>i</sub> firms are important to...

- Banks less exposed to the US in 2008
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### We verify:

- No pre-trends in outcomes
- Firm exposure correlation with bank characteristics [Graph]
  - Foreign liability exposure (Schnabl 2012)
  - Exports market specialization in China (Paravisini Rappoport Schnabl 2021)
  - Product demand booms in China
  - Size, geographic location, foreign ownership
- Controlling for potential confounders

# Results

#### **Outcomes**

- 1. Exports growth
- 2. Banking sector growth
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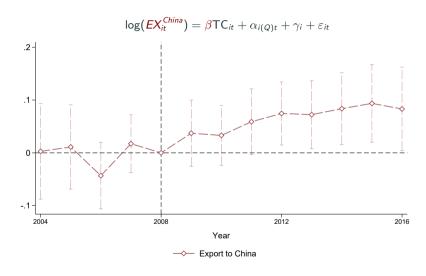
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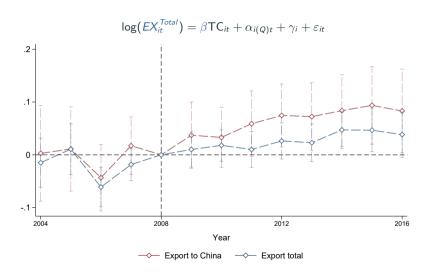
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- SEs two-way clustered by product & destination





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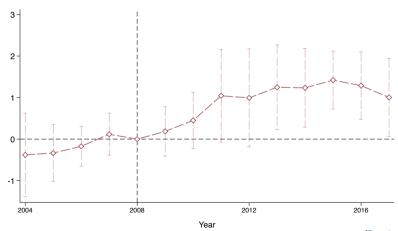
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[Distribution of  $TC_b$ ]

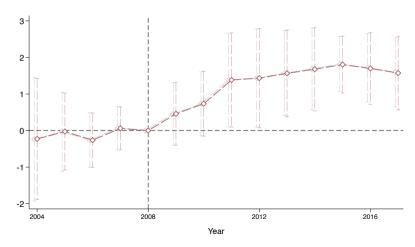
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 $[{\sf Benchmarking\ magnitudes}]$ 

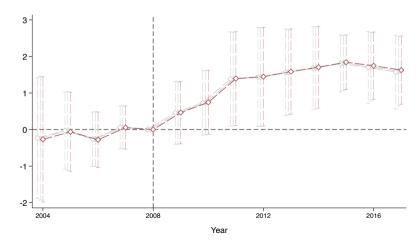
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 $u_{b(\mathit{China})t}$ : China specialization-year  $\Rightarrow$  differential shocks to China-specialized banks



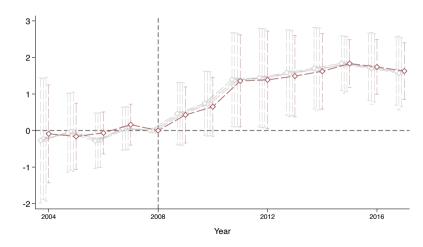
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 $\nu_{b(LiabF)t}$ : foreign liability-year  $\Rightarrow$  differential shocks to banks with high share of foreign liabilities



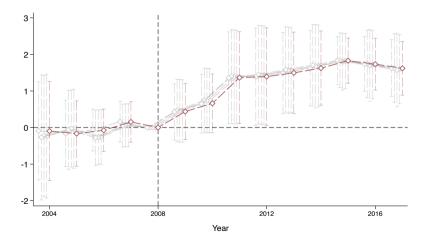
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 $\nu_{b(X')t}$ : all controls



## Channels for increased bank lending

 $Hypothesized\ channel\ for\ bank\ growth:\ firm\ profits\ decrease\ non-performing\ loans\ \&\ increase\ savings$ 

$$\log(\mathsf{Outcome}_{bt}) = \beta \mathsf{TC}_{bt} + \gamma_b + \alpha_{b(Q)t} + \varepsilon_{bt}$$

	ROA	Asset	Net worth	Credit
	(1)	(2)	(3)	(4)
$Bank\;shock{\times}Year_{\geq 2009}$	0.0181** (0.00802)	0.525*** (0.128)	0.418*** (0.134)	0.703*** (0.202)
Fixed Effects				
Bank	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Controls	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
$Bank\ size{\times}Year$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Observations	619	619	619	619

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- 4. Firm outcomes

$$\log(\textit{Loans}_{\textit{i}(T,NT)bt}) = \beta \mathsf{TC}_{\textit{bt}} + \alpha_{\textit{b}(Q)t} + \delta_{\textit{it}} + \gamma_{\textit{ib}} + \varepsilon_{\textit{ibt}}$$

- Loans $_{i(T,NT)bt}$ : loans to firm i in sector T (traded) or NT (non-traded) by bank b
- $\mathsf{TC}_{bt} = \sum_{i} \mathsf{TC}_{i} \cdot \omega_{bi}$

**Endogeneity concern**: banks lending to firms with high TC<sub>i</sub> grew after 2008 for other reasons

$$\log(Loans_{i(T,NT)bt}) = \beta \mathsf{TC}_{bt} + \alpha_{b(Q)t} + \delta_{it} + \gamma_{ib} + \varepsilon_{ibt}$$

- Loans $_{i(T,NT)bt}$ : loans to firm i in sector T (traded) or NT (non-traded) by bank b
- $\mathsf{TC}_{bt} = \sum_{i} \mathsf{TC}_{i} \cdot \omega_{bi}$

Endogeneity concern: banks lending to firms with high TC<sub>i</sub> grew after 2008 for other reasons

•  $\alpha_{b(Q)t}$ : pre-shock bank size Quartile imes year FE

$$\log(\textit{Loans}_{\textit{i}(T,NT)bt}) = \beta \mathsf{TC}_{\textit{bt}} + \alpha_{\textit{b}(Q)t} + \frac{\delta_{\textit{it}}}{\epsilon_{\textit{ib}}} + \gamma_{\textit{ib}} + \varepsilon_{\textit{ibt}}$$

- Loans $_{i(T,NT)bt}$ : loans to firm i in sector T (traded) or NT (non-traded) by bank b
- $\mathsf{TC}_{bt} = \sum_{i} \mathsf{TC}_{i} \cdot \omega_{bi}$

**Endogeneity concern**: banks lending to firms with high  $TC_i$  grew after 2008 for other reasons

- $\alpha_{b(Q)t}$ : pre-shock bank size Quartile  $\times$  year FE
- $\delta_{it}$ : firm shocks  $\Rightarrow$  absorbs "credit demand"

$$\log(\textit{Loans}_{\textit{i}(T,\textit{NT})\textit{bt}}) = \beta \mathsf{TC}_{\textit{bt}} + \alpha_{\textit{b}(\textit{Q})\textit{t}} + \delta_{\textit{it}} + \gamma_{\textit{ib}} + \varepsilon_{\textit{ibt}}$$

- Loans $_{i(T,NT)bt}$ : loans to firm i in sector T (traded) or NT (non-traded) by bank b
- $\mathsf{TC}_{bt} = \sum_{i} \mathsf{TC}_{i} \cdot \omega_{bi}$

**Endogeneity concern**: banks lending to firms with high TC<sub>i</sub> grew after 2008 for other reasons

- $\alpha_{b(Q)t}$ : pre-shock bank size Quartile  $\times$  year FE
- $\delta_{it}$ : firm shocks  $\Rightarrow$  absorbs "credit demand"
- $\gamma_{ib}$ : within-bank-firm relationships  $\Rightarrow$  restricts variation to relationships that exist throughout

$$\log(\textit{Loans}_{\textit{i}(T,NT)bt}) = \beta \mathsf{TC}_{\textit{bt}} + \alpha_{\textit{b}(Q)t} + \delta_{\textit{it}} + \gamma_{\textit{ib}} + \varepsilon_{\textit{ibt}}$$

- Loans $_{i(T,NT)bt}$ : loans to firm i in sector T (traded) or NT (non-traded) by bank b
- $\mathsf{TC}_{bt} = \sum_{i} \mathsf{TC}_{i} \cdot \omega_{bi}$

**Endogeneity concern**: banks lending to firms with high  $TC_i$  grew after 2008 for other reasons

- $\alpha_{b(Q)t}$ : pre-shock bank size Quartile  $\times$  year FE
- $\delta_{it}$ : firm shocks  $\Rightarrow$  absorbs "credit demand"
- ullet  $\gamma_{ib}$ : within-bank-firm relationships  $\Rightarrow$  restricts variation to relationships that exist throughout
- SEs clustered by bank

$$\log(\textit{Loans}_{\textit{i}(T,NT)bt}) = \beta \mathsf{TC}_{bt} + \alpha_{b(Q)t} + \delta_{it} + \gamma_{ib} + \varepsilon_{ibt}$$

Sample	AII
	(1)
Bank shock×Year≥2009	0.124***
	(0.0114)
Fixed Effects	
$Bank{ imes}Firm$	$\checkmark$
$Firm \!  imes \! Year$	$\checkmark$
Bank size×Year	$\checkmark$
Observations	4,397,494

[Firm classification]

$$\log(\textit{Loans}_{\textit{i}(T,NT)bt}) = \beta \mathsf{TC}_{\textit{bt}} + \alpha_{\textit{b}(Q)t} + \delta_{\textit{it}} + \gamma_{\textit{ib}} + \varepsilon_{\textit{ibt}}$$

Sample	All	Exporter	Non exporter	
	(1)	(2)	(3)	
Bank shock×Year>2009	0.124***	0.172***	0.139***	
	(0.0114)	(0.0462)	(0.0114)	
Fixed Effects				
$Bank{ imes}Firm$	$\checkmark$	$\checkmark$	✓	
$Firm \! \times \! Year$	$\checkmark$	$\checkmark$	✓	
$Bank\ size{\times}Year$	$\checkmark$	$\checkmark$	$\checkmark$	
Observations	4,397,494	223,670	4,173,824	

 $[\mathsf{Firm}\ \mathsf{classification}]$ 

$$\log(\textit{Loans}_{\textit{i}(T,NT)bt}) = \beta \mathsf{TC}_{\textit{bt}} + \alpha_{\textit{b}(Q)t} + \delta_{\textit{it}} + \gamma_{\textit{ib}} + \varepsilon_{\textit{ibt}}$$

Sample	All	Exporter	Non exporter	EEA	Tradable (EEA)	Non tradable (EEA)
	(1)	(2)	(3)	(4)	(5)	(6)
Bank shock×Year≥2009	0.124***	0.172***	0.139***	0.209***	0.164***	0.355***
	(0.0114)	(0.0462)	(0.0114)	(0.0371)	(0.0410)	(0.0830)
Fixed Effects						
$Bank{ imes}Firm$	$\checkmark$	$\checkmark$	✓	$\checkmark$	✓	✓
$Firm \times Year$	$\checkmark$	$\checkmark$	✓	$\checkmark$	✓	✓
$Bank\ size{\times}Year$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	✓
Observations	4,397,494	223,670	4,173,824	445,069	297,677	147,392

[Firm classification]

## Accounting for entry & exit: midpoint growth

Midpoint growth rates allow for (dis)aggregation into subsamples with a "balanced" sample:

$$\Delta Y_i = \frac{Y_{i,post} - Y_{i,pre}}{[(Y_{i,pre} + Y_{i,post}) \times 0.5]}$$

- $Y_{post}$ : average "post" ( $t \ge 2009$ )
- $Y_{pre}$ : average "pre" (t < 2009)

$$\Delta(\textit{Loans}_{\textit{ib}}^{\textit{sample}}) = eta_{\textit{sample}} \mathsf{TC}_b + \delta_i + \gamma_{b(Q)} + \varepsilon_{\textit{ib}}$$

Sample	All
	(1)
Bank shock	0.308***
	(0.00388)
Fixed Effects	
Firm	$\checkmark$
Bank size	$\checkmark$
Observations	1,241,028

Bank size Observations

1,241,028

$$\beta_{AII} = 0.308$$
Sample 
$$AII = 0.308$$

$$(1)$$
Bank shock 
$$0.308*** = 0.00388$$

$$Fixed Effects$$
Firm

 $\Delta(Loans_{ib}^{sample}) = \beta_{sample} \mathsf{TC}_b + \delta_i + \gamma_{b(Q)} + \varepsilon_{ib}$ 

$$\Delta(\textit{Loans}_{\textit{ib}}^{\textit{sample}}) = \beta_{\textit{sample}} \mathsf{TC}_b + \delta_i + \gamma_{\textit{b}(Q)} + \varepsilon_{\textit{ib}}$$
 
$$\beta_{\textit{AII}} = 0.308 \; ; \; \beta_{\textit{Exp}} = 0.253 \; ; \; \beta_{\textit{Non-Exp}} = 0.322$$

Sample	AII	Exporter	Non exporter
	(1)	(2)	(3)
Bank shock	0.308***	0.253***	0.322***
	(0.00388)	(0.0116)	(0.00418)
Fixed Effects			
Firm	$\checkmark$	$\checkmark$	✓
Bank size	✓	$\checkmark$	$\checkmark$
Observations	1,241,028	45,683	1,195,345

$$\Delta(\textit{Loans}_{\textit{ib}}^{\textit{sample}}) = eta_{\textit{sample}} \mathsf{TC}_b + \delta_i + \gamma_{b(Q)} + \varepsilon_{\textit{ib}}$$

Sample	AII	Exporter	Non exporter	EEA	Tradable (EEA)	Non tradable (EEA)
	(1)	(2)	(3)	(4)	(5)	(6)
Bank shock	0.308*** (0.00388)	0.253*** (0.0116)	0.322*** (0.00418)	0.318*** (0.00918)	0.367*** (0.0159)	0.295*** (0.0112)
Fixed Effects						
Firm	✓	$\checkmark$	✓	✓	✓	✓
Bank size	$\checkmark$	$\checkmark$	✓	$\checkmark$	✓	✓
Observations	1,241,028	45,683	1,195,345	84,470	29,751	54,719

### Bank loans to each sector: midpoint growth decomposition

$$\Delta(\textit{Loans}_{\textit{ib}}^{\textit{sample}}) = \beta \mathsf{TC}_{\textit{b}}^{\textit{sample}} + \delta_{\textit{i}} + \gamma_{\textit{b}(Q)} + \varepsilon_{\textit{ib}}$$
 
$$\beta_{\textit{AII}} = \underbrace{\omega_{\textit{Exp}}\beta_{\textit{Exp}}}_{\beta_{\textit{Exp}}} + \underbrace{\omega_{\textit{Non-Exp}}\beta_{\textit{Non-Exp}}}_{\beta_{\textit{Non-Exp}}}$$

	All
	(1)
Bank shock	0.308*** (0.00388)
Fixed Effects	(*******)
Firm×Year	✓
$Bank\;size{\times}Year$	✓
Observations	1,241,028

## Bank loans to each sector: midpoint growth decomposition

$$\Delta(\textit{Loans}^{\textit{sample}}_{\textit{ib}}) = \beta \mathsf{TC}^{\textit{sample}}_{\textit{b}} + \delta_{\textit{i}} + \gamma_{\textit{b}(\textit{Q})} + \varepsilon_{\textit{ib}}$$
 
$$\beta_{\textit{All}} = \underbrace{\omega_{\textit{Exp}}\beta_{\textit{Exp}}}_{\beta_{\textit{Exp}}} + \underbrace{\omega_{\textit{Non-Exp}}\beta_{\textit{Non-Exp}}}_{\beta_{\textit{Non-Exp}}}$$

 $\Rightarrow$  92% of the magnitude of the impact on lending goes to non-exporters

	AII (1)	Exporter share (2)	Non exporter share (3)
Bank shock	0.308***	0.0235***	0.284***
	(0.00388)	(0.00116)	(0.00377)
Fixed Effects			
$Firm \!  imes \! Year$	$\checkmark$	✓	✓
Bank size×Year	$\checkmark$	✓	✓
Observations	1,241,028	1,241,028	1,241,028

### Bank loans to each sector: midpoint growth decomposition

$$\Delta(\textit{Loans}^{\textit{sample}}_{\textit{ib}}) = \beta \mathsf{TC}^{\textit{sample}}_{\textit{b}} + \delta_{\textit{i}} + \gamma_{\textit{b}(\textit{Q})} + \varepsilon_{\textit{ib}}$$
 
$$\beta_{\textit{All}} = \underbrace{\omega_{\textit{Exp}}\beta_{\textit{Exp}}}_{\beta_{\textit{Exp}}} + \underbrace{\omega_{\textit{Non-Exp}}\beta_{\textit{Non-Exp}}}_{\beta_{\textit{Non-Exp}}}$$

- $\Rightarrow$  92% of the magnitude of the impact on lending goes to non-exporters
- $\Rightarrow$  62% goes to non-traded firms (in the EEA)

	AII (1)	Exporter share (2)	Non exporter share (3)	EEA (4)	Tradable share (5)	Non tradable share (6)
Bank shock	0.308*** (0.00388)	0.0235*** (0.00116)	0.284*** (0.00377)	0.318*** (0.00918)	0.120*** (0.00549)	0.199*** (0.00780)
Fixed Effects						
$Firm \!  imes \! Year$	$\checkmark$	✓	✓	$\checkmark$	✓	✓
$Bank\;size{\times}Year$	$\checkmark$	✓	✓	$\checkmark$	✓	✓
Observations	1,241,028	1,241,028	1,241,028	84,470	84,470	84,470

### **Outcomes**

- 1. Exports growth
- 2. Banking sector growtl
- 3. Transmission of loans to non-traded sector
- 4. Firm outcomes

$$\log(Y_{it}) = \beta TC_{it}^{indirect} + \alpha_i + \gamma_{i(X)t} + \widehat{\nu_{it}} + \varepsilon_{it}$$

- Yit: firm outcomes; today: total loans
- $\mathsf{TC}^{indirect}_{it} = \sum_b \mathsf{TC}_b \cdot \frac{\mathit{loans}_{bi}}{\mathit{loans}_i}$

$$\log(Y_{it}) = \beta \mathsf{TC}_{it}^{indirect} + \alpha_i + \gamma_{i(X)t} + \widehat{\nu_{it}} + \varepsilon_{it}$$

- Yit: firm outcomes; today: total loans
- $\mathsf{TC}^{indirect}_{it} = \sum_b \mathsf{TC}_b \cdot \frac{loans_{bi}}{loans_i}$

**Endogeneity concern**:  $Y_{it}$  are affected by exposure to bank b for reasons other than  $TC_b$ 

$$\log(Y_{it}) = \beta \mathsf{TC}_{it}^{indirect} + \alpha_i + \gamma_{i(X)t} + \widehat{\nu_{it}} + \varepsilon_{it}$$

- Yit: firm outcomes; today: total loans
- $\mathsf{TC}_{it}^{\mathit{indirect}} = \sum_b \mathsf{TC}_b \cdot \frac{\mathit{loans}_{bi}}{\mathit{loans}_i}$

**Endogeneity concern**:  $Y_{it}$  are affected by exposure to bank b for reasons other than  $TC_b$ 

•  $\alpha_i$ : firm FE

$$\log(Y_{it}) = \beta \mathsf{TC}_{it}^{indirect} + \alpha_i + \gamma_{i(X)t} + \widehat{\nu_{it}} + \varepsilon_{it}$$

- Yit: firm outcomes; today: total loans
- $\mathsf{TC}_{it}^{indirect} = \sum_b \mathsf{TC}_b \cdot \frac{loans_{bi}}{loans_i}$

**Endogeneity concern**:  $Y_{it}$  are affected by exposure to bank b for reasons other than  $TC_b$ 

- $\alpha_i$ : firm FE
- $\gamma_{i(X)t}$ : firm characteristics (size quartile)  $\times$  year  $\Rightarrow$  restricts comparison to within firm groups

$$\log(Y_{it}) = \beta \mathsf{TC}_{it}^{indirect} + \alpha_i + \gamma_{i(X)t} + \widehat{\nu_{it}} + \varepsilon_{it}$$

- Yit: firm outcomes; today: total loans
- $\mathsf{TC}_{it}^{indirect} = \sum_b \mathsf{TC}_b \cdot \frac{loans_{bi}}{loans_i}$

**Endogeneity concern**:  $Y_{it}$  are affected by exposure to bank b for reasons other than  $TC_b$ 

- $\alpha_i$ : firm FE
- $\gamma_{i(X)t}$ : firm characteristics (size quartile)  $\times$  year  $\Rightarrow$  restricts comparison to within firm groups
- $\widehat{\nu_{it}}$ : estimated FEs from bank-firm regression  $\Rightarrow$  controls for firm demand shocks

$$\log(Y_{it}) = \beta \mathsf{TC}_{it}^{indirect} + \alpha_i + \gamma_{i(X)t} + \widehat{\nu_{it}} + \varepsilon_{it}$$

- Yit: firm outcomes; today: total loans
- $\mathsf{TC}^{indirect}_{it} = \sum_b \mathsf{TC}_b \cdot \frac{loans_{bi}}{loans_i}$

**Endogeneity concern**:  $Y_{it}$  are affected by exposure to bank b for reasons other than  $TC_b$ 

- $\alpha_i$ : firm FE
- $\gamma_{i(X)t}$ : firm characteristics (size quartile)  $\times$  year  $\Rightarrow$  restricts comparison to within firm groups
- $\widehat{\nu_{it}}$ : estimated FEs from bank-firm regression  $\Rightarrow$  controls for firm demand shocks
- SEs clustered by firm

[Distribution of  $TC_i$ ]

$$\log(\textit{Loans}_{\textit{it}}) = \beta \mathsf{TC}_{\textit{it}} + \alpha_{\textit{i}} + \gamma_{\textit{i(Q)}t} + \varepsilon_{\textit{it}}$$

	All
	(1)
Firm shock×Year <sub>≥2009</sub>	0.153***
	(0.00694)
Fixed Effects	
Firm	✓
Firm size×Year	✓
$Industry{\times}Year$	_
$Region\!\times\!Year$	_
Controls	
Firm×Year fixed effect	_
Observations	1,903,976

$$\log(\textit{Loans}_{\textit{it}}) = \beta \mathsf{TC}_{\textit{it}} + \alpha_{\textit{i}} + \gamma_{\textit{i}(Q)t} + \varepsilon_{\textit{it}}$$

	All	Non exporter
	(1)	(2)
$Firm\ shock{\times}Year_{\geq 2009}$	0.153***	0.136***
	(0.00694)	(0.00697)
Fixed Effects		
Firm	✓	✓
$Firm\ size {\times} Year$	✓	✓
$Industry{\times}Year$	_	_
$Region \times Year$	_	_
Controls		
Firm×Year fixed effect	_	_
Observations	1,903,976	1,810,964

$$\log(\textit{Loans}_{\textit{it}}) = \beta \mathsf{TC}_{\textit{it}} + \alpha_{\textit{i}} + \gamma_{\textit{i}(Q)t} + \varepsilon_{\textit{it}}$$

	All	Non exporter	EEA
	(1)	(2)	(3)
Firm shock×Year≥2009	0.153***	0.136***	0.0751**
	(0.00694)	(0.00697)	(0.0335)
Fixed Effects			
Firm	✓	✓	✓
$Firm\ size {\times} Year$	✓	✓	✓
$Industry{\times}Year$	_	_	_
$Region\!\times\!Year$	_	_	_
Controls			
Firm×Year fixed effect	_	_	_
Observations	1,903,976	1,810,964	201,314

$$\log(\textit{Loans}_{\textit{it}}) = \beta \mathsf{TC}_{\textit{it}} + \alpha_{\textit{i}} + \gamma_{\textit{i(Q)t}} + \widehat{\nu_{\textit{it}}} + \varepsilon_{\textit{it}}$$

	All	Non exporter	EEA			Non tradable (EEA)	
	(1)	(2)	(3)	(4)	(5)	(6)	(7)
Firm shock $\times$ Year $_{\geq 2009}$	0.153*** (0.00694)	0.136*** (0.00697)	0.0751** (0.0335)	0.201*** (0.0522)	0.238*** (0.0562)	0.232*** (0.0570)	0.109*** (0.0374)
Fixed Effects							
Firm	✓	✓	✓	✓	✓	✓	✓
Firm size $\times$ Year	✓	✓	✓	✓	✓	✓	✓
$Industry \times Year$	_	_	_	_	✓	✓	✓
$Region \times Year$	_	_	_	_	✓	✓	✓
Controls							
Firm×Year fixed effect	_	_	_	_	_	_	✓
Observations	1,903,976	1,810,964	201,314	69,958	69,958	33,128	33,128

$$\log(Loans_{it}) = \beta \mathsf{TC}_{it} + \alpha_i + \gamma_{i(Q)t} + \widehat{\nu_{it}} + \varepsilon_{it}$$

All	Non exporter	EEA			Non tradable (EEA)	
(1)	(2)	(3)	(4)	(5)	(6)	(7)
0.153*** (0.00694)	0.136*** (0.00697)	0.0751** (0.0335)	0.201*** (0.0522)	0.238*** (0.0562)	0.232*** (0.0570)	0.109*** (0.0374)
✓	✓	✓	✓	✓	✓	✓
✓	✓	✓	✓	✓	✓	✓
_	_	_	_	✓	✓	✓
_	_	_	_	✓	✓	✓
_	_	_	_	_	_	✓
1,903,976	1,810,964	201,314	69,958	69,958	33,128	33,128
	(1) 0.153*** (0.00694)	(1) (2) 0.153*** 0.136*** (0.00694) (0.00697)	(1) (2) (3)  0.153*** 0.136*** 0.0751** (0.00694) (0.00697) (0.0335)	(1) (2) (3) (4)  0.153*** 0.136*** 0.0751** 0.201*** (0.00694) (0.00697) (0.0335) (0.0522)	(1) (2) (3) (4) (5)  0.153*** 0.136*** 0.0751** 0.201*** 0.238*** (0.00694) (0.00697) (0.0335) (0.0522) (0.0562)	(1) (2) (3) (4) (5) (6)  0.153*** 0.136*** 0.0751** 0.201*** 0.238*** 0.232*** (0.00694) (0.00697) (0.0335) (0.0522) (0.0562) (0.0570)

### Recap

- Peru's FTA with China is the setting for a trade-induced profit shock
- Exposure to the tariff cut measured for:
  - Sectors (direct)
  - Exporting firms (direct)
  - Banks (indirect)
  - Non-exporting firms (indirect)
  - $\Longrightarrow$  Growth in financial capital and firm borrowing (& real outcomes)

### Conclusion & future work

This paper so far: identifies and traces factor accumulation in the domestic economy following trade expansion

#### Future work:

- Empirical: import tariffs, import competition, tax authority data on real firm outcomes
- Theoretical: quantifying the gains using our estimated parameters in a framework with capital accumulation

# Thank you!

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### FTA and firm profits

 $TC_{k,c}$ :  $\Delta$  tariff to China

 $TC_{k,p}$ :  $\Delta$  tariff to Peru

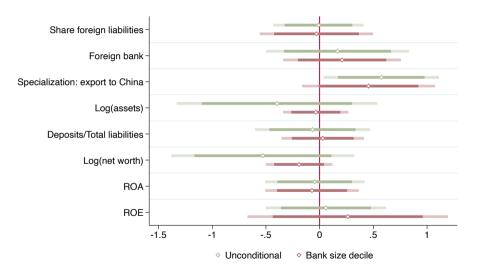
$$\Delta \pi_{i} = \underbrace{\frac{\Delta Sales_{D,i}}{\Delta Sales_{D,i}} + \underbrace{\Delta Sales_{X,i}}_{f\left(TC_{k,p}\right)} - \underbrace{\frac{\Delta Costs_{M,i}}{f\left(TC_{k,p}\right)}}_{f\left(TC_{k,p}\right)}$$

 $\Delta \textit{Sales}_{D,i}: +/-$  depending on import competition effect (if  $\textit{TC}_{k,p} \approx \textit{TC}_{k,c}$ )

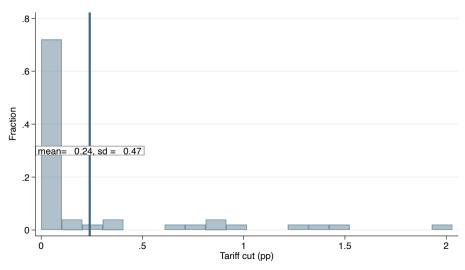
 $\Delta Sales_{X,i}:+$ 

 $\Delta Costs_{M,i}$ : –

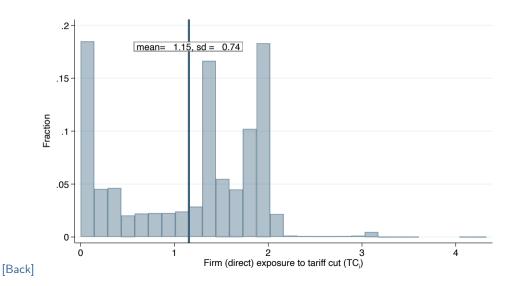
### Bank covariate balance



# Bank-level distribution of exposure to tariff cut



# Firm-level distribution of exposure to tariff cut



## **Classification of firms**

### Firms in credit registry:

	Exporters	Non-exporters
Ever e	xport from 2004–2017	Never export from 2004–2017

### Firms in the EEA:

Traded sector	Non-traded sector
Agriculture	Travel agencies
Wholesale & retail	Education
Oil (hydrocarbons)	Construction
Fishing	Hotels
Manufacturing	Electricity
Aquaculture	Transportation
	Education (universities)
	Restaurants
	Services

$$\log(EX_{kct}) = \beta TC_{pct} + \delta_{pt} + \alpha_{pc} + \varepsilon_{pct}$$

- $EX_{pct}$ : exports from Peru in product p to destination c in year t
- Tariff Cut<sub>pct</sub>:
  - Non-China trade: 0
  - China trade: varies by product k (mean 7.0 and sd 4.4)

Endogeneity concern: TC<sub>pt</sub> correlated with unobserved expected product growth or demand

$$\log(EX_{kct}) = \beta TC_{pct} + \delta_{pt} + \alpha_{pc} + \varepsilon_{pct}$$

- $EX_{pct}$ : exports from Peru in product p to destination c in year t
- Tariff Cut<sub>pct</sub>:
  - Non-China trade: 0
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$$\log(EX_{kct}) = \beta \mathsf{TC}_{pct} + \delta_{pt} + \alpha_{pc} + \varepsilon_{pct}$$

- $EX_{pct}$ : exports from Peru in product p to destination c in year t
- Tariff Cut<sub>pct</sub>:
  - Non-China trade: 0
  - China trade: varies by product k (mean 7.0 and sd 4.4)

Endogeneity concern: TC<sub>pt</sub> correlated with unobserved expected product growth or demand

•  $\delta_{pt}$ : product growth shocks  $\Rightarrow$  within-product-year variation

$$\log(\textit{EX}_\textit{kct}) = \beta \mathsf{TC}_\textit{pct} + \delta_\textit{pt} + \alpha_\textit{pc} + \varepsilon_\textit{pct}$$

- $EX_{pct}$ : exports from Peru in product p to destination c in year t
- Tariff Cut<sub>pct</sub>:
  - Non-China trade: 0
  - China trade: varies by product k (mean 7.0 and sd 4.4)

Endogeneity concern: TC<sub>pt</sub> correlated with unobserved expected product growth or demand

- $\delta_{\it pt}$ : product growth shocks  $\Rightarrow$  within-product-year variation
- ullet  $lpha_{
  m pc}$ : average trade in product-destination  $\Rightarrow$  deals with correlation between product char. & tariff

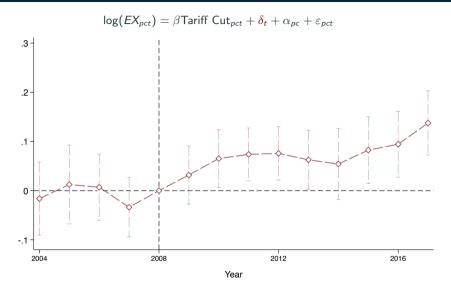
$$\log(EX_{kct}) = \beta \mathsf{TC}_{pct} + \delta_{pt} + \alpha_{pc} + \varepsilon_{pct}$$

- $EX_{pct}$ : exports from Peru in product p to destination c in year t
- Tariff Cut<sub>pct</sub>:
  - Non-China trade: 0
  - China trade: varies by product k (mean 7.0 and sd 4.4)

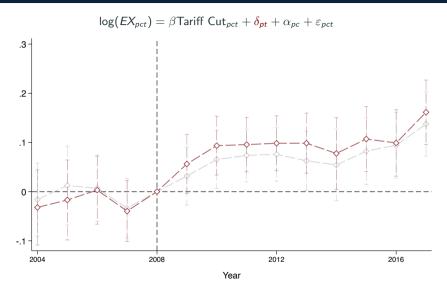
### Endogeneity concern: TC<sub>pt</sub> correlated with unobserved expected product growth or demand

- $\delta_{pt}$ : product growth shocks  $\Rightarrow$  within-product-year variation
- ullet  $\alpha_{\it pc}$ : average trade in product-destination  $\Rightarrow$  deals with correlation between product char. & tariff
- SEs two-way clustered by product & destination

## **Growth in relative exports**



## **Growth in relative exports**



# Product exports using midpoint growth

$$\Delta \textit{EX}_{\textit{pc}} = \beta \mathsf{TC}_{\textit{pc}} + \alpha_{\textit{p}} + \varepsilon_{\textit{pc}}$$

Unit of analysis	Product					
Margin of export	All	Entry	Exit	Continuous		
	(1)	(2)	(3)	(4)		
Tariff Cut×Year <sub>≥2009</sub>	0.0775*** (0.00771)	0.0135*** (0.00312)	0.00293** (0.00140)	0.0611*** (0.00699)		
Fixed Effects						
Product	✓	$\checkmark$	✓	$\checkmark$		
Firm	_	_	_	_		
Observations	5,563	5,563	5,563	5,563		

## Product exports using midpoint growth

$$\Delta EX_{pc} = \beta \mathsf{TC}_{pc} + \alpha_p + \varepsilon_{pc}$$

 $\Rightarrow$  Entry & exit account for small ( $\approx$  8%) of total change in product exports

Unit of analysis	Product					
Margin of export	All	Entry	Exit	Continuous		
	(1)	(2)	(3)	(4)		
Tariff Cut×Year <sub>≥2009</sub>	0.0775*** (0.00771)	0.0135*** (0.00312)	0.00293** (0.00140)	0.0611*** (0.00699)		
Fixed Effects						
Product	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$		
Firm	_	_	_	_		
Observations	5,563	5,563	5,563	5,563		

# Firm-product exports using midpoint growth

$$\Delta EX_{ipc} = \beta TC_{pc} + \alpha_p + \gamma_i + \varepsilon_{ipc}$$

Unit of analysis		Pro	Firm			
Margin of export	All	Entry	Exit	Continuous	All	
	(1)	(2)	(3)	(4)	(5)	(6)
Tariff Cut×Year <sub>≥2009</sub>	0.0775*** (0.00771)	0.0135*** (0.00312)	0.00293** (0.00140)	0.0611*** (0.00699)	0.0775*** (0.00127)	0.0717*** (0.000724)
Fixed Effects						
Product	✓	$\checkmark$	$\checkmark$	✓	✓	$\checkmark$
Firm	_	_	_	_	_	$\checkmark$
Observations	5,563	5,563	5,563	5,563	394,745	394,745

# Firm-product exports using midpoint growth

$$\Delta EX_{ipc} = \beta TC_{pc} + \alpha_p + \gamma_i + \varepsilon_{ipc}$$

 $\Rightarrow$  Firm-level characteristics  $(\gamma_i)$  like anticipated growth do not explain impact of tariff cut

Unit of analysis		Pro	Firm			
Margin of export	All	Entry	Exit	Continuous	All	
	(1)	(2)	(3)	(4)	(5)	(6)
Tariff Cut×Year <sub>≥2009</sub>	0.0775*** (0.00771)	0.0135*** (0.00312)	0.00293** (0.00140)	0.0611*** (0.00699)	0.0775*** (0.00127)	0.0717*** (0.000724)
Fixed Effects						
Product	✓	✓	$\checkmark$	✓	✓	✓
Firm	_	_	_	_	_	$\checkmark$
Observations	5,563	5,563	5,563	5,563	394,745	394,745

### Benchmarking magnitudes

### Exposures:

- Average firm  $TC_{it} = 1.15$
- Average bank  $TC_{bt} = 0.24$

#### Estimated elasticities:

- Elasticity of exports with respect to direct firm exposure:  $\approx 0.1 \Rightarrow$  average firm has 11.5% higher exports
- ullet Elasticity of credit with respect to direct bank exposure:  $pprox 0.7 \Rightarrow$  average bank has 17% more credit

Rescaling the average bank effect: 17% more credit to firms that experienced 52.9% more exports