

# TRADE SHOCKS AND FIRMS: NEGLECTED MARGINS OF ADJUSTMENT

**Beata Javorcik**  
Oxford and CEPR

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# HOW DO FIRMS ADJUST TO TRADE SHOCKS?

- The literature has mainly focused on
  - exit of the least productive firms and reallocation of market shares towards more productive ones (Pavcnik 2002, Melitz 2003)
  - dropping the least performing products and expanding the best performing ones (Bernard, Redding, and Schott (2010 and 2011, Eckel and Neary 2010, Mayer, Melitz, and Ottaviano 2014)
- This talk will focus on other margin of adjustment:
  - provision of trade credit
  - evasion of border taxes
  - changes to the domestic supplier base

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  - **provision of trade credit**
  - **evasion of border taxes**
  - **changes to the domestic supplier base**

# Don't Throw in the Towel, Throw in Trade Credit

Banu Demir and Beata Javorcik  
Journal of International Economics (2018)

# TRADE CREDIT AS A MARGIN OF ADJUSTMENT

- In response to an exogenous increase in competition in export markets
  - exporters extend **trade credit** and drop prices
  - provision of **trade credit** generates a dampening effect on the price response

## ANECDOTAL EVIDENCE

Advice given to exporters by the US Department of Commerce:

- *“Insisting on cash-in-advance could, ultimately, cause exporters to lose customers to competitors who are willing to offer more favorable payment terms to foreign buyers”*
- *“Open account terms (i.e., providing trade credit) may help win customers in competitive markets”*

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# END OF THE MULTI-FIBRE AGREEMENT: SHOCK FOR TURKISH EXPORTERS

- The MFA, a system of bilateral quotas governing the global trade in textiles and clothing since 1974, was dismantled in 2005. The decision was taken during the Uruguay Round which finished in 1994
- Turkish exports have not been subject to any quota restrictions since 1996 (when Turkey formed a customs union with the EU)
- Chinese exports were subject to MFA quotas which were abolished (with some exceptions) on **1 January 2005**
- Quota fill rates varied from below 10% to 100% in 2004, higher rates indicating greater constraint on Chinese exporters  $\implies$  a greater increase in competitive pressures after the quota removal



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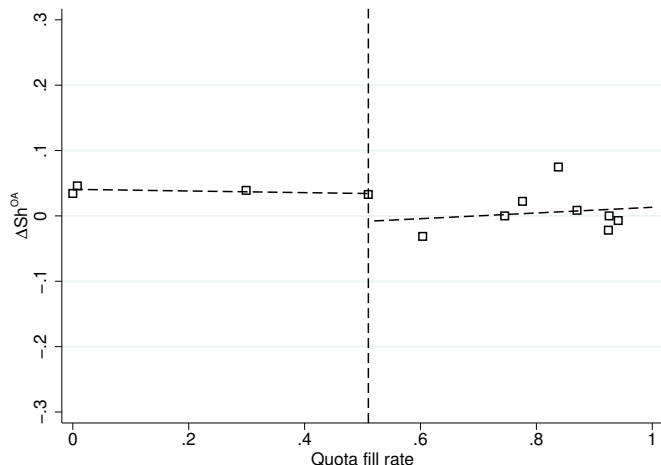
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# DATA

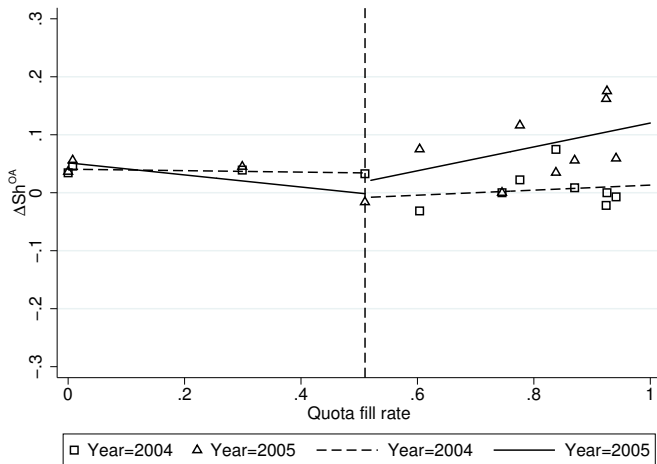
- Universe of Turkey's exports of T&C to EU15 for 2003-2005
- Data disaggregated by firm, product (6-digit HS product code), destination country and year
  - value (free-on-board)
  - quantity (measured in specified units, e.g. number, pair, etc.)
  - **financing terms**: cash in advance, **open account**, letter of credit, and documentary collection
- Data on quota fill rates from *Système Intégré de Gestion de Licenses*

# CHANGE IN SHARE OF EXPORTS WITH TRADE CREDIT BEFORE THE END OF THE MFA ( $t = 2004$ )



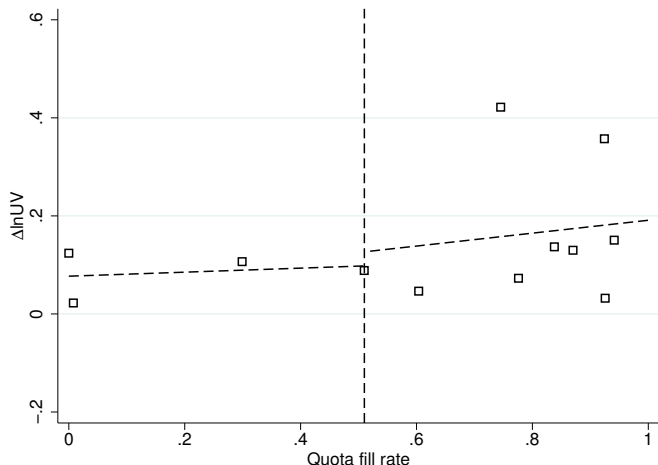
Notes:  $\Delta Sh^{OA}$  denotes annual change in the share of exports on OA terms. A marker represents average  $\Delta Sh^{OA}$  over firms, products and destination countries for a given quota-fill rate and year. Lines represent fitted values of (unconditional) linear predictions. The vertical line represents the quota fill rate of 0.5 as of 2004.

# CHANGE IN SHARE OF EXPORTS WITH TRADE CREDIT BEFORE AND AFTER THE END OF THE MFA



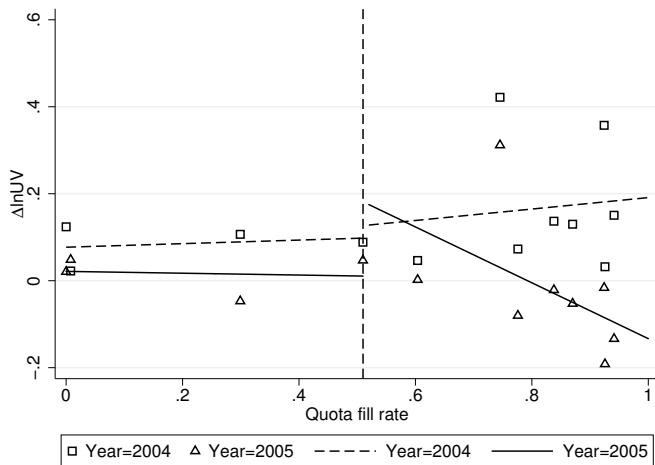
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# CHANGE IN AVERAGE PRICES BEFORE THE END OF THE MFA ( $t = 2004$ )



*Notes:*  $\Delta \ln UV$  denotes annual change in the logarithm of unit values. A marker represents average  $\Delta \ln UV$  over firms, products and destination countries for a given quota-fill rate and year. Lines represent fitted values of (unconditional) linear predictions. The vertical line represents the quota fill rate of 0.5 as of 2004.

# CHANGE IN AVERAGE PRICES BEFORE AND AFTER THE END OF THE MFA



Notes:  $\Delta \ln UV$  denotes annual change in the logarithm of unit values. A marker represents average  $\Delta \ln UV$  over firms, products and destination countries for a given quota-fill rate and year. Lines represent fitted values of (unconditional) linear predictions. The vertical line represents the quota fill rate of 0.5 as of 2004.



## DIFFERENCE-IN-DIFFERENCES APPROACH

- Baseline equation for  $t = \{2004, 2005\}$

$$\Delta X_{ijdt} = \beta_0 + \beta_1 Post_t * Treat_j + \alpha_{dt} + \alpha_j + \alpha_{it} + \epsilon_{ijdt}$$

- $\Delta X_{ijdt}$  denotes change in outcome variable  $X$  at the firm-product-destination level at time  $t$ 
  - share of exports with trade credit ( $Sh^{OA}$ )
  - unit value ( $\ln UV$ )
- $Post_t$  is a binary variable that is equal to one for  $t = 2005$ , and zero otherwise
- $Treat_j$  is an indicator for quota-constrained products
- We expect  $\beta_1 > 0$  for  $X = Sh^{OA}$ , and  $\beta_1 < 0$  for  $X = \ln UV$
- Standard errors clustered at the product level

# DEFINING TREATMENT

- 1 Binary treatment:

$$Treat_j = 1, \text{ if Quota fill rate}_{j,t=2004} > 0.5$$

$$Treat_j = 0, \text{ Otherwise}$$

- 2 Product-specific quota fill rate in 2004: Quota fill rate<sub>*j,t=2004*</sub>

# BASELINE RESULTS: TRADE CREDIT

$$\Delta Sh_{ijdt}^{OA} = \beta_0 + \beta_1 Post_t * Treat_j + \alpha_{dt} + \alpha_j + \alpha_{it} + \epsilon_{ijdt}$$

	(1)	(2)	(3)	(4)
<i>Post<sub>t</sub> * Treat<sub>j</sub></i>	<b>0.0489***</b> (0.0149)	<b>0.0375*</b> (0.0195)		
<i>Post<sub>t</sub> * Quota fill rate<sub>j,t=2004</sub></i>			<b>0.0631***</b> (0.0174)	<b>0.0467*</b> (0.0239)
N	17852	17852	17852	17852
<i>R</i> <sup>2</sup>	0.0258	0.234	0.0259	0.234
Country-year FE	+	+	+	+
Product FE	+	+	+	+
Firm-year FE		+		+

# BASELINE RESULTS: PRICES

$$\Delta \ln UV_{ijdt} = \beta_0 + \beta_1 Post_t * Treat_j + \alpha_{dt} + \alpha_j + \alpha_{it} + \epsilon_{ijdt}$$

	(1)	(2)	(3)	(4)
<i>Post<sub>t</sub> * Treat<sub>j</sub></i>	<b>-0.0669***</b> (0.0236)	<b>-0.0745***</b> (0.0284)		
<i>Post<sub>t</sub> * Quota fill rate<sub>j,t=2004</sub></i>			<b>-0.0985***</b> (0.0279)	<b>-0.0839**</b> (0.0370)
N	17852	17852	17852	17852
<i>R</i> <sup>2</sup>	0.0511	0.271	0.0513	0.271
Country-year FE	+	+	+	+
Product FE	+	+	+	+
Firm-year FE		+		+

# HIGH INITIAL SHARE OF SALES ON CREDIT $\implies$ LESS ROOM FOR ADJUSTING FINANCING

- Test whether flows with a high initial share of sales on trade credit experienced a larger fall in prices

$$\begin{aligned}\Delta \ln UV_{ijdt} &= \phi_0 + \phi_1 ShQ_{ijd,t=0}^{OA} * Post_t * Treat_j \\ &+ \phi_2 Post_t * Treat_j + \phi_3 ShQ_{ijd,t=0}^{OA} * Post_t \\ &+ \phi_4 ShQ_{ijd,t=0}^{OA} * Treat_j + \phi_5 ShQ_{ijd,t=0}^{OA} + \alpha_{dt} + \alpha_j \\ &+ \alpha_{it} + e_{ijdt},\end{aligned}$$

- $ShQ_{ijd,t=0}^{OA}$  average share of OA exports for a flow  $ij$  over 2002-2003

Dependent variable:	$\Delta \ln UV_{ijdt}$	$\Delta \ln UV_{ijdt}$
$ShQ_{ijd,t=0}^{OA} * Post_t * Treat_j$	<b>-0.111*</b> (0.0589)	<b>-0.122*</b> (0.0730)
$Post_t * Treat_j$	0.00275 (0.0470)	-0.0301 (0.0518)
$ShQ_{ijd,t=0}^{OA} * Post_t$	0.0458 (0.0325)	0.00157 (0.0436)
$ShQ_{ijd,t=0}^{OA} * Treat_t$	0.0205 (0.0328)	-0.00206 (0.0438)
$ShQ_{ijd,t=0}^{OA}$	0.00848 (0.0178)	0.0226 (0.0253)
N	13790	13790
$R^2$	0.0538	0.276
Country-year FE	+	+
Product FE	+	+
Firm-year FE		+

## TAKE AWAYS

- Provision of trade credit is a margin of adjustment that can give firms a competitive edge
- Price response to shocks can be affected by provision of trade credit
- Ignoring the trade credit channel can lead to mismeasurement of price responses

# Forensics, Elasticities and Benford's Law

Banu Demir and Beata Javorcik (2018)



# EVASION AS ANOTHER MARGIN OF ADJUSTMENT

- Evidence consistent with an increase in evasion after an unexpected increase in import taxes in Turkey
- Three methods for detecting evasion
  - “missing trade” approach of Fisman and Wei (2004)
  - Benford’s Law
  - comparing price and trade cost elasticities

## EXOGENOUS SHOCK

- Resource Utilization Support Fund (RUSF) is a tax collected since 1988 when foreign credit is utilized to finance the cost of imported goods
- Only imports with external financing are subject to RUSF
- RUSF applies to ordinary imports (processing imports have always been exempted)
- On 13 October 2011, RUSF was *unexpectedly* raised from 3% to 6% of transaction value

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## MEASURING EXPOSURE TO THE SHOCK

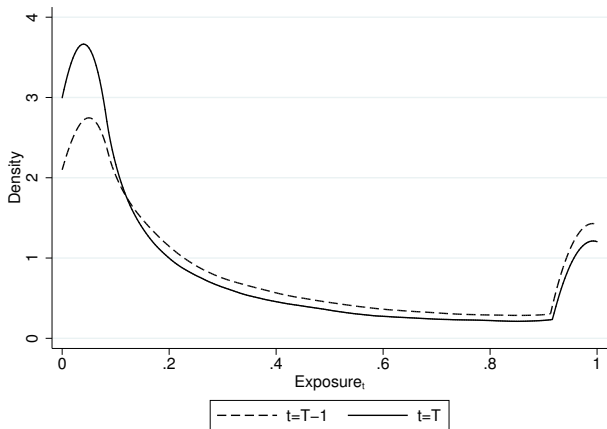
- Construct *Exposure* using monthly value of Turkey's ordinary imports in USD disaggregated by
  - importing firm,
  - 6-digit HS product,
  - source country,
  - payment method (e.g. CIA, OA, LC, etc.).
- Define the share of annualized imports of product  $h$  from country  $c$  coming with external financing at time  $t = \{T - 2, T - 1, T\}$ .

$$Exposure_{hct} = \frac{\sum_{m \in \{OA, AC, DLC\}} M_{hcmt}}{\sum_m M_{hcmt}}$$

- *Exposure* constructed for about
  - 150 source countries (all of them members of WTO),
  - 4,700 6-digit HS product codes,
  - 75,000 country-product pairs.

# SHARE OF ORDINARY IMPORTS WITH EXTERNAL FINANCING (*hc* LEVEL)

$$\overline{Exposure}_{hc,t=T-1} = 0.195; \overline{Exposure}_{hc,t=T} = 0.137$$



## “MISSING TRADE” APPROACH (FISMAN AND WEI, 2004)

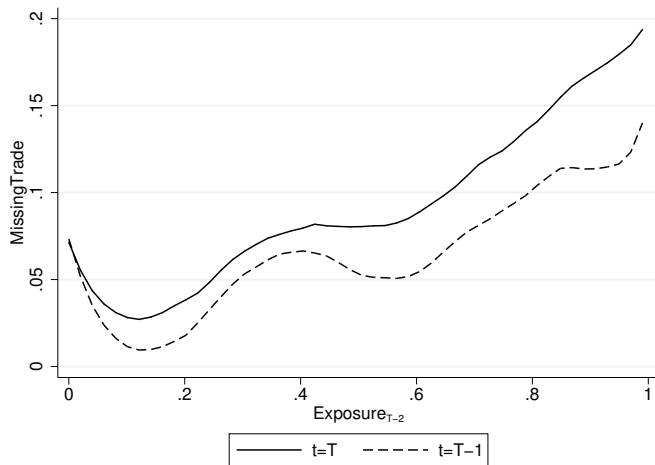
- Consider Turkey's imports of product  $h$  from country  $c$  at time  $t$

$$MissingTrade_{hct} = \ln X_{hct}^c - \ln M_{hct}^{TUR}$$

- $\ln X_{hct}^c$  is logarithm of country  $c$ 's exports of product  $h$  to Turkey as reported by  $c$ .
- $\ln M_{hct}^{TUR}$  is the logarithm of imports of  $h$  from  $c$  as reported by Turkey.
- COMTRADE data on imports of 4,295 products from 98 countries



# MISSING TRADE AND EXPOSURE



*Notes:* Figure shows *MissingTrade* at time  $T$  and  $T - 1$  as a function of *Exposure* constructed for  $T - 2$  at the country-product level. The figure is obtained from local polynomial regressions with Epanechnikov kernel.

## ESTIMATING EQUATION

- Estimate:

$$\begin{aligned} \text{MissingTrade}_{hct} &= \gamma_0 + \gamma_1 1\{t = T\} * \text{Exposure}_{hc,T-2} \\ &+ \alpha_{ht} + \alpha_{ct} + \alpha_{hc} + \varepsilon_{hct} \end{aligned}$$

- Include three periods:  $t = \{T - 2, T - 1, T\}$
- $\text{Exposure}_{hc,t=T-2}$  is share of imports of product  $p$  from country  $c$  coming with external financing at time  $t = T - 2$
- $\gamma_1 > 0$  consistent with an increase in tax evasion after the hike in the RUSF tax rate in October 2011

# EVIDENCE CONSISTENT WITH EVASION

	(1)	(2)	(3)
Missing Trade in	Value	Quantity	Price
$1\{t = T\} * Exposure_{hc,T-2}$	<b>0.062**</b> (0.028)	0.022 (0.035)	<b>0.040*</b> (0.020)
N	70089	70089	70089
$R^2$	0.812	0.787	0.711
	<b>Placebo:</b>	<b>Processing</b>	<b>trade</b>
Missing Trade in	Value	Quantity	Price
$1\{t = T\} * Exposure_{hc,T-2}$	0.028 (0.030)	0.000 (0.037)	0.027 (0.020)
N	23913	23913	23913
$R^2$	0.858	0.838	0.761
Fixed effects	hxt,cxt,hxc	hxt,cxt,hxc	hxt,cxt,hxc

Notes: \*, \*\*, \*\*\* represent significance at the 10, 5, and 1 percent levels, respectively. Robust standard errors are clustered at the country and 4-digit HS product level.

# BENFORD'S LAW

- Benford's law describes the distribution of first digits in economic or accounting data
- It naturally arises when data are generated by an exponential process or independent processes are pooled together.
- Why do we expect it to hold in our data?
  - “Second-generation” distributions, i.e. combinations of other distributions, conform with Benford's law, e.g. quantity x price (Hill 1995)
  - Distributions where mean is greater than median, and skew is positive (Durtschi et al. 2004)
  - A  $\chi^2$  test can't reject that the law holds in our data prior to the shock and post-shock for the flows not subject to the tax

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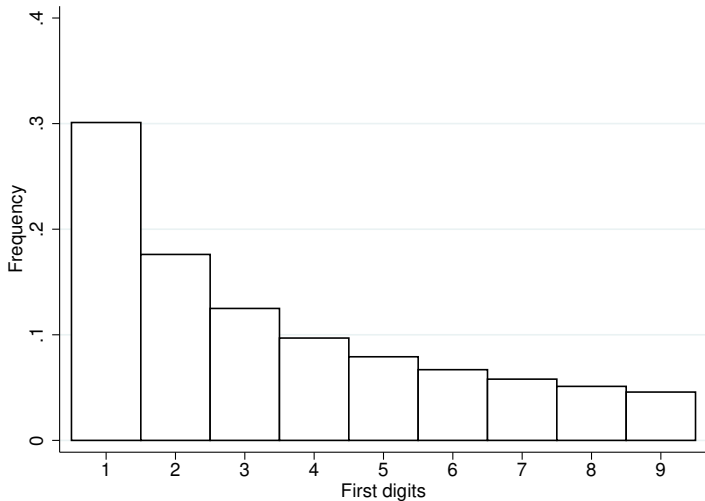
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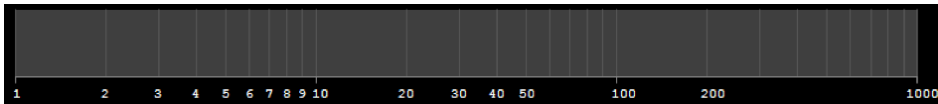
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# BENFORD'S DISTRIBUTION OF FIRST DIGITS

$$P(\text{First digit is } d) = \log_{10}(1 + 1/d)$$



# WHY DOES IT WORK?





# MEASURING DEVIATIONS FROM BENFORD'S LAW

- Define

$$D = \sum_{d=1}^9 (f_d - \hat{f}_d)^2$$

- $\hat{f}_d$ : observed fraction of digit  $d$  in the data
  - $f_d$ : fraction predicted by Benford law
- Trade values generated by a standard Armington-type trade model comply with Benford's law in the absence of tax evasion.

# MEASURING DEVIATIONS FROM BENFORD'S LAW IN THE DATA

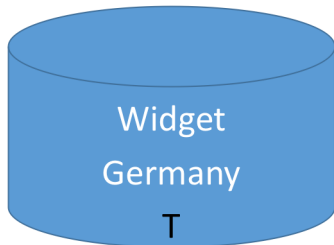
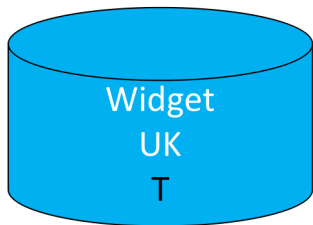
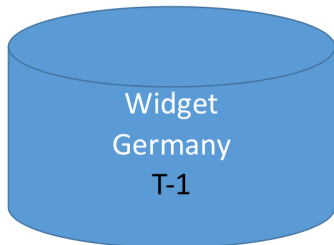
- Remember

$$D = \sum_{d=1}^9 (f_d - \hat{f}_d)^2$$


- $\hat{f}_d$ : observed fraction of digit  $d$  in the data
- $f_d$ : fraction predicted by Benford law
- Use monthly firm-product-country-payment method level Turkish import data
- Calculate  $D$  for each  $hct$

## CONSTRUCTING BINS

Sort observations into bins (*hct*)



# CONSTRUCTING BINS

A large red cylinder is centered on the page. Inside the cylinder, there is a list of five text entries, each describing an import transaction. The text is white and centered within the cylinder's volume.


Firm 1 importing 1000 widgets from UK on OA in Jan 2011  
Firm 1 importing 3000 widgets from UK on OA in Dec 2010  
Firm 1 importing 4500 widgets from UK on DLC in Dec 2010  
Firm 2 importing 50 widgets from UK on OA in Feb 2011  
Firm 2 importing 80 widgets from UK on OA in April 2011

## CONSTRUCTING BINS



\$10,349    \$455,577    \$1,000,000    \$60,123    \$82,000    \$78,999  
\$550,340    \$55,507    \$1,000,000    \$120,003    \$34,400    \$1,200  
\$110,999    \$455,403    \$1,000,000    \$640,100    \$45,000  
\$10,050    \$5,977    \$2,000,000    \$104,123    \$789    \$29,200

# CONSTRUCTING BINS



A red cylindrical container is shown, containing a grid of numbers. The numbers are arranged in four rows and six columns. The numbers are: Row 1: \$10,349, \$455,577, \$1,000,000, \$60,123, \$82,000, \$78,999; Row 2: \$550,340, \$55,507, \$1,000,000, \$120,003, \$34,400, \$1,200; Row 3: \$110,999, \$455,403, \$1,000,000, \$640,100, \$45,000; Row 4: \$10,050, \$5,977, \$2,000,000, \$104,123, \$789, \$29,200.

\$10,349	\$455,577	\$1,000,000	\$60,123	\$82,000	\$78,999
\$550,340	\$55,507	\$1,000,000	\$120,003	\$34,400	\$1,200
\$110,999	\$455,403	\$1,000,000	\$640,100	\$45,000	
\$10,050	\$5,977	\$2,000,000	\$104,123	\$789	\$29,200

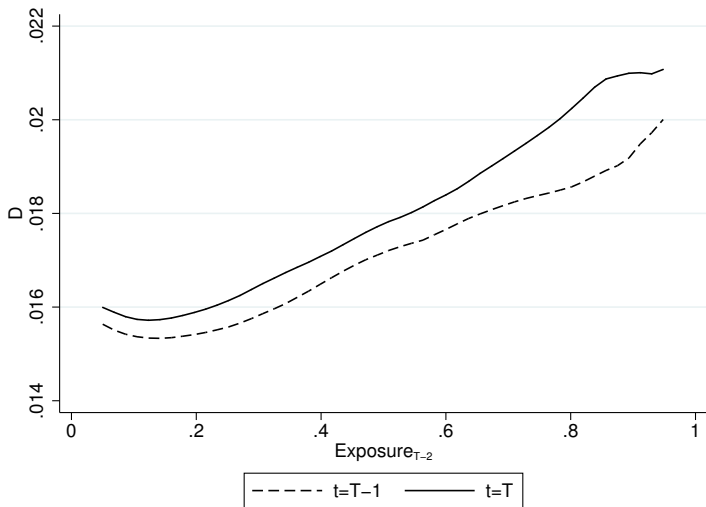
# MEASURING DEVIATIONS FROM BENFORD'S LAW

- Define

$$D = \sum_{d=1}^9 (f_d - \hat{f}_d)^2$$

- $\hat{f}_d$ : observed fraction of digit  $d$  in the data
- $f_d$ : fraction predicted by Benford law
- Use monthly firm-product-country-payment method level Turkish import data
- Calculate  $D$  for each  $hct$
- Keep only  $hc$  pairs with  $n > 30$

# DEVIATIONS FROM BENFORD'S LAW AND EXPOSURE



*Notes:* Figure is obtained from local polynomial regression with Epanechnikov kernel of  $D$ .



## ESTIMATING EQUATION

- Construct  $D_{hct}$  and estimate:

$$\begin{aligned} D_{hct} &= \theta_0 + \theta_1 1\{t = T\} * Exposure_{hc,T-2} \\ &+ \alpha_{ht} + \alpha_{ct} + \alpha_{hc} + e_{hct} \end{aligned}$$

- $\theta_1 > 0$  consistent with an increase in tax evasion after the hike in the RUSF tax rate in October 2011

	Baseline	Processing
$1\{t = T\} * Exposure_{hc,T-2}$	<b>0.00286***</b> (0.00107)	0.0000811 (0.000719)
N	26369	12468
$R^2$	0.645	0.798
Fixed effects	hxt,cxt,hxc	hxt,cxt,hxc
Cluster	cxHS4	cxHS4

Notes: \*, \*\*, \*\*\* represent significance at the 10, 5, and 1 percent levels, respectively. Robust standard errors are clustered at the country and 4-digit HS product level.

## A THOUGHT EXPERIMENT

- Consider a random sample with characteristics similar to an average bin in our sample before the shock. e.g.  $D = 0.0172$ .
- Add “faked” observations: each digit occurring with equal probability.
- What is the fraction of “faked” observations required to generate the estimated increase in  $D$  due to an increase in *Exposure* from zero to one?
- About 40%!

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- **About 40%!**

# ROBUSTNESS CHECK: SECOND-DIGIT TEST

	Baseline	Processing	First two digits
$1\{t = T\} * Exposure_{hc,T-2}$	<b>0.00286</b> *** (0.00107)	0.0000811 (0.000719)	<b>0.00069</b> * (0.00037)
N	26369	12468	26369
$R^2$	0.645	0.798	0.882
Fixed effects	hxt,cxt,hxc	hxt,cxt,hxc	hxt,cxt,hxc
Cluster	cxHS4	cxHS4	cxHS4

Notes: \*, \*\*, \*\*\* represent significance at the 10, 5, and 1 percent levels, respectively. Robust standard errors are clustered at the country and 4-digit HS product level.

## TAKE AWAYS

- Evasion is another margin of adjustment
- Ignoring evasion will lead to underestimating the effects of policy shocks
- Evasion induces a bias in the estimation of trade cost elasticity of import demand, leading to miscalculation of gains from trade

# Financial Constraints and Propagation of Shocks in Production Networks

Banu Demir, Beata Javorcik, Tomasz Michalski  
and Evren Ors (2018)

# RUSF SHOCK AND THE DOMESTIC SUPPLIER BASE

- Data covering quasi-totality of supplier-customer links
- Considers both direct and indirect effects
- Shows that even a small cost-push shock can have a substantial impact on local sourcing relationships



## MEASURING FIRM-LEVEL DIRECT EXPOSURE

- A “Bartik-type” variable where **firm-level** exposure is predicted based on its import composition and the exposure of a given variety:

$$Exposure_{f,T-2} = \sum_v \omega_{fv,T-2} \times Exposure_{j,T-2}$$

- $\omega_{fv,T-2}$  is the share of imports of variety  $j$  in firm  $f$ 's total costs at  $t = T - 2$
- total costs = labor costs + domestic purchases + imports

## ESTIMATION STRATEGY: DIRECT EFFECT

- Estimating equation:

$$\Delta_{2011-l} \ln Y_{f_{sr}} = \beta_0 + \beta_l Exposure_{f_{sr}, T-2} + \alpha_{sr} + e_{f_{sr}}$$

- $Y$  is an outcome variable for firm  $f$  operating in one of the 22 two-digit manufacturing NACE industries ( $s$ ), and located in one of the 81 regions ( $r$ ), with  $l=\{2012, 2013, 2014\}$ .
- Standard errors clustered at the sector-region level

# IMPACT OF THE SHOCK ON FIRM SALES

Dep vrb: $\Delta_{2011-l} \ln Sales_{f_{sr}}$	(1)	(2)	(3)
	$l = 2012$	$l = 2013$	$l = 2014$
$Exposure_{f_{sr}, T-2}$	<b>-0.235***</b> (0.0830)	<b>-0.264***</b> (0.0943)	0.159 (0.152)
$R^2$	0.0370	0.0433	0.0398
N	28270	28270	28270
Fixed effects	sr	sr	sr

Notes: \*, \*\*, \*\*\* represent significance at the 10, 5, and 1 percent levels, respectively.

# IMPACT ON INPUT SOURCING

Dep var:	(1) $\Delta_{2011-l} \left( \frac{M}{Sales} \right)_{f_{sr}}$	(2) $\Delta_{2011-l} \left( \frac{DomPurch}{Sales} \right)_{f_{sr}}$ $l = 2012$	(3) $NewDomSupp_{f_{sr},l}$
$Exposure_{f_{sr},T-2}$	<b>-0.327*</b> (0.188)	<b>0.356***</b> (0.0742)	<b>10.99***</b> (2.549)
$R^2$	0.0473	0.0397	0.0400
		$l = 2013$	
$Exposure_{f_{sr},T-2}$	<b>-0.718***</b> (0.208)	<b>0.477***</b> (0.111)	<b>23.20***</b> (3.920)
$R^2$	0.0530	0.0444	0.0440
		$l = 2014$	
$Exposure_{f_{sr},T-2}$	<b>-0.971***</b> (0.246)	<b>0.665***</b> (0.105)	<b>50.39***</b> (5.544)
$R^2$	0.0490	0.0457	0.0556
N	28270	28270	28270
Fixed effects	sr	sr	sr

Notes: *DomPurch* denotes the total value of total domestic purchases, and *NewDomSupp* denotes the number of new domestic supplier links established. \*, \*\*, \*\*\* represent significance at the 10, 5, and 1 percent levels, respectively.

# NETWORK EFFECTS

Dep var: $\Delta_{2011-l} \ln Sales_{f_{sr}}$	(1)	(2)	(3)
	$l = 2012$	$l = 2013$	$l = 2014$
$Exposure_{f_{sr}, T-2}$	<b>-0.247***</b> (0.0683)	<b>-0.226***</b> (0.0837)	-0.129 (0.145)
$Exposure_{f_{sr}, T-2}^{Suppliers}$	<b>-0.318***</b> (0.105)	<b>-0.250**</b> (0.105)	<b>-0.355**</b> (0.161)
$Exposure_{f_{sr}, T-2}^{Buyers}$	-0.0448 (0.0214)	0.0408 (0.0482)	0.0009 (0.0590)
$R^2$	0.0452	0.0505	0.0521
N	28270	28270	28270
Fixed effects	sr	sr	sr

Notes: \*, \*\*, \*\*\* represent significance at the 10, 5, and 1 percent levels, respectively.

# FINANCING CONSTRAINTS AS A PROPAGATION CHANNEL

Dep var: $\Delta_{2011-l} \ln Sales_{f_{sr}}$	(1)	(2)	(3)
	$l = 2012$	$l = 2013$	$l = 2014$
$Exposure_{f_{sr},T-2}$	<b>-0.233***</b> (0.0690)	<b>-0.231***</b> (0.0836)	0.188 (0.329)
$HighLiq_{f_{sr},T-2} * Exposure_{f_{sr},T-2}$	<b>0.207**</b> (0.100)	<b>0.231*</b> (0.134)	0.382 (0.370)
$HighLiq_{f_{sr},T-2}$	-0.0170*** (0.00319)	-0.0224*** (0.00645)	-0.0573*** (0.0158)
$R^2$	0.0399	0.0472	0.0404
N	28270	28270	28270
Fixed effects	sr	sr	sr

Notes: Ease of access to liquidity measured with the quick ratio, defined as the ratio of the sum of cash, marketable securities and accounts receivable to current liabilities. \*, \*\*, \*\*\* represent significance at the 10, 5, and 1 percent levels, respectively.

# NETWORK EFFECTS WITH FINANCING CONSTRAINTS

Dep var: $\Delta_{2011-l} \ln Sales_{f_{sr}}$	(1)	(2)	(3)
	$l = 2012$	$l = 2013$	$l = 2014$
$Exposure_{f_{sr}, T-2}$	<b>-0.216***</b> (0.0600)	<b>-0.232***</b> (0.0886)	-0.0408 (0.117)
$Exposure_{f_{sr}, T-2}^{Suppliers, LowLiq}$	<b>-0.335***</b> (0.106)	<b>-0.341**</b> (0.136)	<b>-0.411***</b> (0.151)
$Exposure_{f_{sr}, T-2}^{Suppliers, HighLiq}$	-0.143 (0.0925)	-0.122 (0.149)	-0.077 (0.150)
$Exposure_{f_{sr}, T-2}^{Buyers, LowLiq}$	-0.0114 (0.0146)	-0.0398 (0.0438)	0.0174 (0.0115)
$Exposure_{f_{sr}, T-2}^{Buyers, HighLiq}$	0.0337 (0.0389)	0.0131 (0.0117)	0.0122 (0.0305)
$R^2$	0.0427	0.0497	0.0492
N	28270	28270	28270
Fixed effects	sr	sr	sr

Notes: \*, \*\*, \*\*\* represent significance at the 10, 5, and 1 percent levels, respectively.

## TAKE AWAYS

- Even a small cost-push shock can have substantial consequences for local sourcing relationships
- The shock is propagated downstream by firms facing financial constraints



# CONCLUSIONS

- Firms adjust to globalization-induced shocks through a variety of margins
  - **provision of trade credit**
  - **evasion of border taxes**
  - **changes to the domestic supplier base**
- Ignoring these margins gives a distorted picture of adjustment and in some cases affects calculation of welfare effects of trade policies