

A Simple Model of Buyer-Seller Connections in International Trade

JGU International Economics Workshop

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Motivation

The Microeconomics of Globalization

Krugman (1979, 1980) marks the beginning of **firms in international trade** theory

Increasingly detailed and disaggregated datasets have made trade theory **more and more micro-oriented**

- new-exporters margin
- new-importers margin
- within-firm margins: quality, products, destinations, shipment size

Common simplification: **scant modeling** of trade-partner dimension

- exporters sell directly to consumers
- importers buy from anonymous markets

Emerging Networks Literature

Production Networks in Macroeconomics (Carvalho Tahbaz-Salehi, ARE 2019)

- fully specified networks / IO-linkages
- shock propagation (Carvalho et al. 2016), aggregate fluctuations (Acemoglu et al. 2012)

Cross-Border Firm-to-Firm Trade (Bernard Moxnes, ARE 2018)

- 'two-sided trade'
- partner-extensive margin, gravity of connections
 - Bernard Moxnes Ulltveit-Moe (2018)
 - Bernard Boler Dhingra (2019)
 - Blum Claro Horstmann (2012)
 - Carballo Ottaviano Martincus (2018)
 - Eaton Kortum Kramarz (2016)

Balls and Bins

Armenter and Koren (2014) ask:

Which stylized facts / moments in the data **should be used to test** theories of the extensive margin (firms, products, destinations)?

- **statistical model** of trade based on balls falling into bins
- **reproduces** important moments, such as the pattern of zeros or frequency of multiproduct exporters

Research Question and Results

Which moments in the data should be used to test theories of cross-border connections between firms?

A parsimonious re-interpretation of the Krugman (1980) model generates some of the seemingly surprising findings on the literature on cross-border connections, e.g.

- negative assortative matching
- stable normalized sales distribution

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The Model

Elements of Krugman (1980)

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- Utility is derived from consumption of differentiated varieties
- Demand in i for variety ω from j :

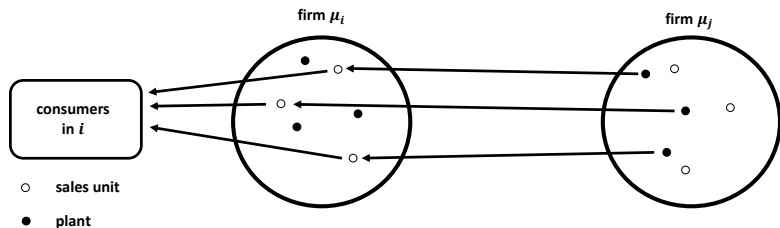
$$x_{ji}(\omega) = (p_{ji}^*(\omega)/P_i)^{-\sigma} Y_i/P_i \quad (1)$$

- $p_{ji}^*(\omega) = p_{ji}^* = \tau_{ji} p_j \quad \forall \omega \in \Omega_j$
- Ω_j is the set of varieties produced in j . All varieties in Ω_j are sold in i

1 Plants and Firms

- one plant \Leftrightarrow one variety
- firm: arbitrary positive mass (number) of plants and sales units (see next slide)
- N_j firms active in country j
- firm size μ_j
 - firm size determines number of plants and sales units a firm can accommodate
 - exogenous firm size $\mu_j \sim F(\mu)$, pdf: $f(\mu)$
 - identical across countries
 - label firm in j with mass of varieties μ_j 'firm μ_j '
 - average firm has $E(\mu)$ plants and $E(\mu)$ varieties
 - total number of varieties in j is $E(\mu)N_j$

2 Importing Firms



- production *and* distribution takes place **at the plant level**
 - export by producer in j , import and exclusive distribution by a sales unit in i
 - **random matching** between exporting and importing *plants*
 - with differing firm sizes, for an exporting plant the probability of being matched to an importing *firm* **differs across firms**
 - $\Pr[\mu_i \text{ imports } \omega] \propto \mu_i$
 - $\Pr[\mu_i \text{ imports } \omega \text{ from } \mu_j] \propto \mu_i \mu_j$
- ⇒ by LLN: interpret as fractions

3 Reporting Threshold

Value of firm-to-firm exports

$$X_{ji}(\mu_j, \mu_i) = \frac{\mu_i \mu_j}{L_i} (p_{ij}^*/P_i)^{1-\sigma} Y_i \quad (2)$$

- no fixed costs of exporting (as in Krugman 1980) → all varieties are traded
- mass of varieties sold by firm μ_j to μ_i : $\mu_j \mu_i / (E(\mu) N_i) = \mu_j \mu_i / L_i$

Notice:

- each firm trades with every foreign firm
- as μ_i and/or μ_j become very small, trade values approach zero

3 Reporting Threshold

Trade flows between firms are only recorded if they are **large enough**

- **reporting threshold** at the *firm-level*
- **trade between two firms** is *recorded* if and only if

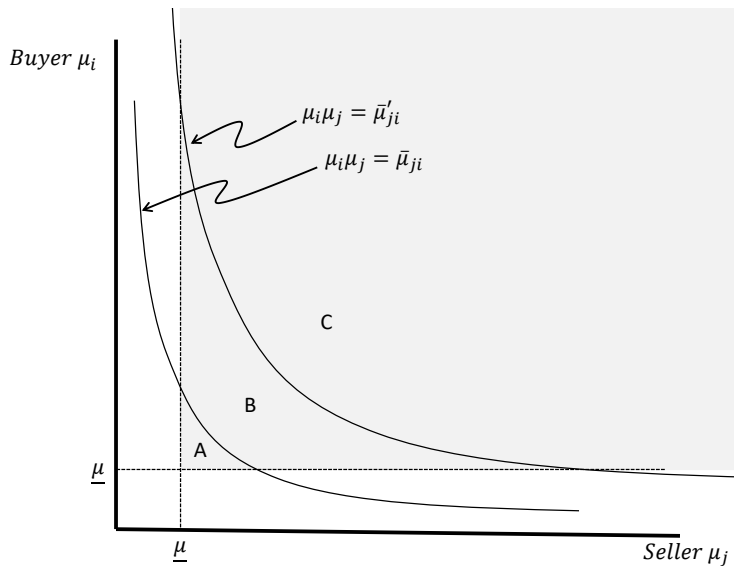
$$X_{ji}(\mu_j, \mu_i) > \bar{t} \quad (3)$$

$$\Leftrightarrow \mu_i \mu_j > \bar{\mu}_{ji} \quad (4)$$

$$\text{where } \bar{\mu}_{ji} = \frac{\bar{t}}{(p_{ij}^*/P_i)^{1-\sigma} Y_i / (L_i)}$$

- $\bar{\mu}_{ji}$ is
 - **decreasing** in importer p.c. income
 - **increasing** in iceberg trade costs and exporter marginal costs

Implications



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Fraction of firms in j *recorded as selling* to firm μ_i

$$S(j, \mu_i) = \int_{\bar{\mu}_{ji}/\mu_i}^{\infty} f(\mu) d\mu \quad (5)$$

Fraction of firms in i *recorded as buying* from μ_j

$$B(j, \mu_i) = \int_{\bar{\mu}_{ji}/\mu_j}^{\infty} f(\mu) d\mu \quad (6)$$

The Mass of Recorded Connections

Assumption: Pareto distribution of firm size

$$F(\mu) = 1 - (\mu/\underline{\mu})^{-\theta}$$

- Note that the joint pdf of *all* connections is $f(\mu_i, \mu_j) = f(\mu_i)f(\mu_j)$

Main Results

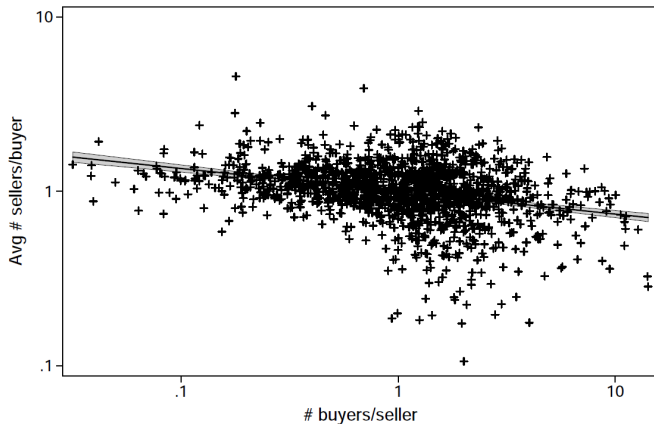
Main Results

We confront our model with a [set of stylized facts](#) from the literature on firm-to-firm connections.

- ① Positive link between firm exports and the number of partners
- ② Distribution of the number of partners
- ③ Negative assortative matching
- ④ Conditional sales distribution

3 Negative Assortative Matching

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Note: 2006 data. The figure shows all possible values of the number of buyers per Norwegian firm in a given market j , a_j , on the x-axis, and the average number of Norwegian connections among these buyers, $b_j(a_j)$, on the y-axis. Axes scales are in logs. Both variables are demeaned, i.e. we show $b_j(a_j)/\bar{b}_j$, where \bar{b}_j is the average number of Norwegian connections among all buyers in market j . The fitted regression line and 95% confidence intervals are denoted by the solid line and gray area. The slope coefficient is -0.13 (s.e. 0.01).

3 Negative Assortative Matching

In our model, the number of connections per firm increases with firm size μ_j

- along the x-axis, exporters become larger
- along the y-axis, importers become larger

For our model, the graph implies:

Larger exporters (who have more importers) should connect to smaller importers (who connect with fewer exporters)

3 Negative Assortative Matching

Our model:

- distribution of importer sizes for exporter of size μ_j :

$$F(\mu|\mu \geq \bar{\mu}_{ji}/\mu_j) = 1 - (\mu / \max\{\bar{\mu}_{ji}/\mu_j, \underline{\mu}\})^{-\theta}$$

- the χ^{th} percentile, defined through $F(\mu|\mu_\chi \geq \bar{\mu}_{ji}/\mu_j) = \chi$, is

$$\mu_\chi(\mu_j) = (1 - \chi)^{-1/\theta} \max\{\bar{\mu}_{ji}/\mu_j, \underline{\mu}\} \quad (7)$$

Implication:

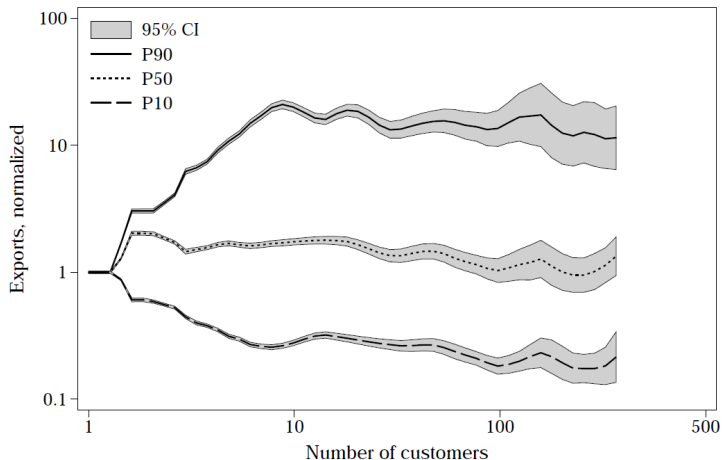
$$\frac{\partial \mu_\chi(\mu_j)}{\partial \mu_j} < 0 \quad \forall \chi \text{ if } \bar{\mu}_{ji}/\mu_j > \underline{\mu} \quad (8)$$

⇒ This implies **Negative Assortative Matching**

Intuition: Larger firms reach much deeper into the pool of potential trade partners than smaller firms, lowering the partner size at *any* percentile.

4 Conditional Sales Distribution

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Note: 2006 data. The figure shows the fitted lines from kernel-weighted local polynomial regressions of the x 'th percentile of within-firm-destination log exports on firm-destination log number of customers. Axes scales in logs. Exports are normalized, see footnote 4.

4 Conditional Sales Distribution

Our model:

Firm-to-firm sales from exporter μ_j to the importer at the χ^{th} percentile are given by

$$X(\mu_j, \mu_\chi(\mu_j)) = (1 - \chi)^{-1/\theta} \bar{t} \quad (9)$$

whenever $\bar{\mu}_{ji}/\mu_j > \underline{\mu}$ holds.

Observation: The absolute trade volume of an exporter to its χ^{th} percentile buyer is independent of the exporter's size.

Normalizing by the median sales of *any* exporting firm μ_{j_0} (e.g., the 'smallest' exporter) yields

$$\frac{X(\mu_j, \mu_\chi(\mu_j))}{X(\mu_{j_0}, \mu_{1/2}(\mu_j))} = (2(1 - \chi))^{-1/\theta} \quad (10)$$

Result: For a given exporting firm μ_j , the distribution of firm-to-firm sales, normalized by the median sales of an arbitrary exporting firm μ_{j_0} , is independent of μ_j .

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Conclusion

We show that a parsimonious re-interpretation of the Krugman (1980) model can reproduce some of the prominent stylized facts from the firm-to-firm trade literature.

Next steps:

- use Colombian firm-level data to **replicate** the stylized facts from the literature
- **develop** further testable implications of our model
- **test** new implications in the data

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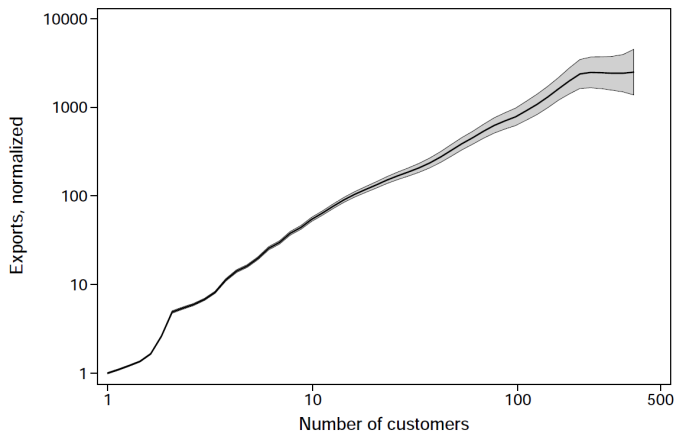
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1 Firm Exports and the Number of Partners

1 Firm exports and the number of partners



Note: 2006 data. The figure shows the fitted line from a kernel-weighted local polynomial regression of firm-destination log exports on firm-destination log number of customers. Axes scales are in logs. Exports are normalized, see footnote 4.

Source:

1 Firm exports and the number of partners

Exports by firm μ_j

$$\begin{aligned} X_{ji}(\mu_j) &= \int_{\bar{\mu}_{ji}/\mu_j}^{\infty} X_{ji}(\mu_j, \mu_i) f(\mu_i) d\mu_i \\ &= \frac{\theta}{\theta - 1} \left(\frac{p_{ji}}{P_i} \right)^{1-\sigma} Y_i \frac{\mu_j}{L_i} \underline{\mu}^{\theta} [\bar{\mu}_{ji}/\mu_j]^{1-\theta} \end{aligned} \quad (11)$$

Number of importers for a firm μ_j

$$N_i B(\mu_j, i) = N_i \int_{\bar{\mu}_{ji}/\mu_j}^{\infty} f(\mu_i) d\mu_i = N_i \underline{\mu}^{\theta} [\bar{\mu}_{ji}/\mu_j]^{-\theta} \quad (12)$$

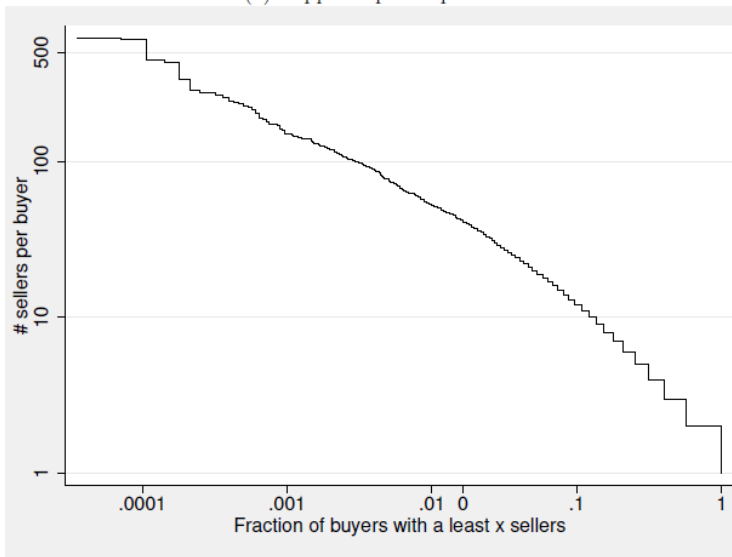
Relationship between firm exports and the number of partners

$$X_{ji}(\mu_j) = \frac{\theta}{\theta - 1} \bar{t} B(\mu_j, i) \quad (13)$$

Firm μ_j 's exports to i increase in the *share* of firms connected to in i with *unit elasticity*.

2 Distribution of the Number of Partners

2 Distribution of the number of partners



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Importer of size μ_i has $S(j, \mu_i)N_j$ suppliers

$$S(j, \mu_i)N_j = N_j \underline{\mu}^\theta \bar{\mu}_{ji}^{-\theta} \mu_i^\theta. \quad (14)$$

The share of firms with at least as many connections as μ_i is equal to the fraction of firms that is larger than μ_i

$$\Pr[\mu \geq \mu_i] = 1 - F(\mu_i) = \mu_i^{-\theta} \underline{\mu}^\theta \quad (15)$$

Combining the two gives

$$N_j S(j, \mu_i) = N_j \underline{\mu}^{2\theta} \bar{\mu}_{ji}^{-\theta} \Pr[\mu \geq \mu_i]^{-1} \quad (16)$$

The relationship between number of connections and fraction of firms with more connections

- is negatively sloped
- has unit elasticity