# Market size, Competition, and the Product Mix of Exporters

Thierry Mayer, Marc J. Melitz, and Gianmarco I.P. Ottaviano

# Broader Context for Analysis of Product-Level Decisions in Trade

- Firms' choice of product quality, range of products, and product mix is just one of many "technology" dimensions (broadly defined) that interact with internalization strategy of firms
- Also:
  - Integration with suppliers
  - Labor screening for worker ability
  - Skill-bias of technology
  - Innovation and R&D
- Aggregate trading environment then affects measured technology through those firm-level choices
- In a dynamic environment there is also an important feedback loop between technology and international market participation
- Product range and product mix is an attribute of "technology" that can now be measured quite accurately – as well as its interactions with international market participation

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#### Evidence on Multi-Product Firms and Trade

Multi-product firms dominate world trade flows:

Table 3: Distribution of French exporters over products and markets9

Share of French exporters in 2003 (total number exporters: 99259)

	Number of countries							
No. of products	1	5	10+	Total				
1	29.61	0.36	0.22	34.98				
5	0.76	0.45	0.62	4.73				
10+	0.95	0.89	10.72	18.57				
Total	42.59	4.12	15.54	100				

Share of French exports in 2003 (total exports: 314.3 billion €)

	Number of countries						
No. of products	1	5	10+	Total			
1	0.7	0.08	0.38	1.86			
5	0.3	0.08	1.06	1.97			
10+	0.28	0.45	76.3	81.36			
Total	2.85	1.55	85.44	100			

Source: EFIM.

- Most product creation and destruction occurs within existing firms
  - Bernard, Redding, & Schott (2009) and Broda & Weinstein (2008)

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- Firms respond to market conditions by adjusting the product margin
  - Changes in domestic and export market conditions over time:
     Macroeconomic shocks and trade liberalization
  - Differences in export market conditions: in response to 'gravity' variables such as economic distance and destination market size

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  - Stable over time and across markets: firms adjust product margin at the 'bottom'

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  - Highly skewed
  - Stable over time and across markets: firms adjust product margin at the 'bottom'
- Firms also respond to market conditions by adjusting their product mix
  - If skewed distribution across products is indicative of productivity/quality differences, then changes in product mix can have important repercussions on firm productivity and welfare

# The Effects of Trade Liberalization in North America on Multi-Product Firms

Bernard, Redding, & Schott (2008) for the U.S.; Baldwin & Gu (2009) for Canada; Iacovone & Javorcik for Mexico

Induces firms to reduce product scope

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- Increases skewness of production runs across products
  - Possibly due to composition effects between exported and non-exported goods
  - ... or increased skewness for both export and domestic sales

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- Increases skewness of production runs across products
  - Possibly due to composition effects between exported and non-exported goods
  - ... or increased skewness for both export and domestic sales
- Evidence for Mexico:
  - Increased skewness in the distribution of export sales
    - Highest export increases for products (within firms) with highest export shares
  - Intensive margin effect in product mix responses dominates effect of extensive product margin

#### What We Do in This Paper

- Develop a multi-country model with multi-product firms and arbitrary differences in geography
- Explains the link:

  - ullet Toughness of competition  $\longrightarrow$  skewness of firm product mix
  - Skewness of firm product mix firm productivity

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  - Skewness of firm product mix → firm productivity
- When firms export to 'tougher' markets:
  - Firms skew their export sales towards their 'better' products
  - Firms no longer export 'marginal' products
  - Firm productivity increases (combination of both effects)

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- When firms export to 'tougher' markets:
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  - Firms no longer export 'marginal' products
  - Firm productivity increases (combination of both effects)
- We find very strong confirmation for the effects of market size and geography on the skewness of French exporters' product mix
  - Indirect evidence of large differences in competitive environment across export market destinations

#### Literature Review

#### Competition effect (endogenous markups)

- Feenstra & Ma (2008) and Eckel & Neary (2010) incorporate cannibalization effect of increasing product range
- In our model, there is no cannibalization as firms produce a discrete number of varieties and never attain finite mass
- Competition effect comes from demand side: mass of competing sellers and their average price
- Main advantage of simplifying assumption:
  - Can solve for multi-country asymmetric world equilibrium
- Nocke & Yeaple (2008) and Baldwin & Gu (2009) also incorporate competition effect but with symmetric products

## Literature Review (Cont.)

Nested C.E.S. preferences with a continuum of firms and products

- No differences in the toughness of competition across markets or due to trade liberalization
- ullet No effects of competition on the skewness of the product mix
- Focus on effects of trade on the product scope decision (and potential effect of trade costs on the product mix)

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#### Outline

#### Theory

- Closed economy
  - Introduce preferences and firm product ladder
  - Effect of market size on competition and firm product mix
- Open economy
  - Skip two-country version and effect of trade liberalization (similar to effect of bigger market size in closed economy)
  - Effects of market size and geography on exporter's product mix

#### **Empirics**

• Effects of market size and geography on French exporters' product mix

#### Preferences and Demand

- ullet Continuum of differentiated varieties  $i\in\Omega$  and a homogeneous good (numeraire)
- Consumer utility and individual consumption levels:

$$U = q_0^c + \alpha \int_{i \in \Omega} q_i^c di - \frac{1}{2} \gamma \int_{i \in \Omega} (q_i^c)^2 di - \frac{1}{2} \eta \left( \int_{i \in \Omega} q_i^c di \right)^2$$

- Leads to linear residual demand curves for each variety i
  - With threshold prices (goods can be priced out of the market)
  - Endogenous price elasticity of demand
  - Both respond to the "toughness" of competition in the market (# of competing products and their average price)

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#### Firms and Products

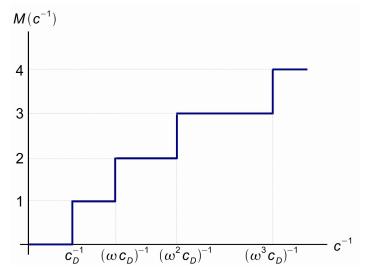
- A firm can produce multiple varieties/products
- Production of additional varieties moves a firm away from its unique 'core' competency
- ... which entails additional customization costs
- Each additional variety/product produced entails an additional customization cost (geometric step  $\omega^{-1}$ ,  $\omega \in (0,1)$ )
- A firm with core competency c produces its core product at that cost and each subsequent variety at an additional cost
- There is no upper bound limit on the number of products a firm can produce

#### Production and Firm Behavior

- One factor of production: labor (inelastically supplied)
- ullet Prior to entry, identical firms face some initial uncertainty concerning their future core competency c
- Firms must pay sunk investment cost to enter (no other restrictions to entry)
- Firm core competency is then learned/revealed
- Firm then decides how many varieties (possibly none) to produce

## Firm Survival and Product Range Decision

ullet Firm survival follows cutoff rule:  $c \leq c_D$ 



## Comparative Statics for the Closed Economy

- Increases in market size, technology (better productivity draws, lower entry costs), and variety substitutability lead to decreases in the survival cutoff  $c_D$  and increases in the mass of varieties produced/sold
- --- tougher competition and higher aggregate productivity

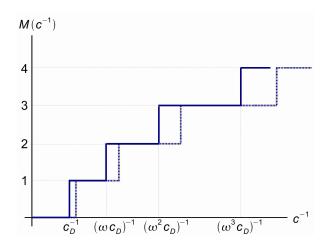
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- All firms respond to the tougher competition by decreasing the number of products produced
- $\bullet \longrightarrow \mathsf{Focus}$  on core competency associated increase in average firm productivity
- ullet Lower average prices and markups (distribution of markups shifts  $\searrow$ )
- Welfare rises (higher productivity, product variety, and lower markups)
- If market size increases, then output and sales per variety increase

# Effect of Tougher Competition on Product Range



## Effect of Tougher Competition on Product Mix

- This increase in the competitive environment is also associated with additional within-firm reallocations across products
- Consider the effect on the product sales for a given firm:
  - A firm reallocates output and sales towards its 'core' product (share of products closer to the core increases)
    - Increased skewness of product mix
    - Leads to increase in firm-level productivity (over and above effects from product scope)
- These effects are driven by the upward shift in price elasticities across the firm's product line

#### Open Economy

- Consider an open economy with an arbitrary number of countries (with different sizes)
- Markets are segmented but firms can export any of their products
- Exporting involves two types of bilateral trade costs:
  - Proportional iceberg trade costs (same for all products exported in a bilateral trading pair)
  - Additional customization cost (increasing across product line)

#### Open Economy Equilibrium

- The toughness of competition in each market (characterized by the survival cutoff for domestic firms) now depends on
  - Own market size
  - Technology (distribution of productivity draws and entry costs)
  - Product substitution
  - all vary in same way as in the closed economy
- Additionally, the toughness of competition also depends on geographic remoteness (a function of the bilateral matrix of trade costs)

#### Exporters' Product Mix Across Destinations

- Consider the effect of the toughness of competition in an export market on the product export sales for a given firm:
  - Tougher competition in an export market induces firms to skew their export sales towards their core products
  - $\bullet \hspace{0.2in} \longrightarrow \mathsf{Again}, \hspace{0.1in} \mathsf{due} \hspace{0.1in} \mathsf{to} \hspace{0.1in} \mathsf{shift} \hspace{0.1in} \mathsf{up} \hspace{0.1in} \mathsf{in} \hspace{0.1in} \mathsf{all} \hspace{0.1in} \mathsf{price} \hspace{0.1in} \mathsf{elasticities} \hspace{0.1in} \mathsf{across} \hspace{0.1in} \mathsf{product} \hspace{0.1in} \mathsf{range}$

#### Data on French Exporters

- Comprehensive customs data for firm-product exports to 181 destinations in 2003
- Exclude service and wholesale/distribution firms (keep manufacturing and agriculture)
- Products recorded at 8-digit level (over 10,000 product codes)

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  - ullet Ratio 1/2 and 1/3 based on destination specific ranking
  - Skewness/entropy statistic (Theil, Herfindahl, Std dev logged) over all of the firm's export sales to a destination

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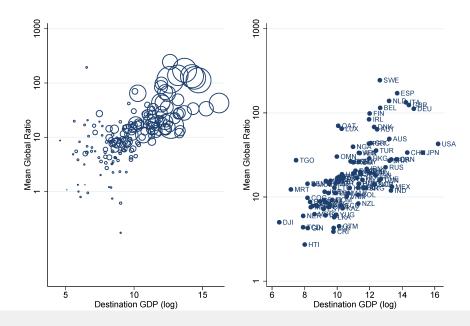
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  - Skewness/entropy statistic (Theil, Herfindahl, Std dev logged) over all of the firm's export sales to a destination
- Test for the effects of toughness of competition (market size and geography)
- Measure of geography: Foreign supply potential

# Correlations Between Local and Global Rankings

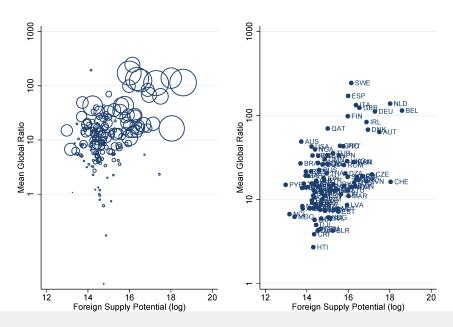
Table 1: Spearman Correlations Between Global and Local Rankings

Firms exporting at least:		7	# product	s	
to $\#$ countries	1	2	5	10	50
1	67.93%	67.78%	67.27%	66.26%	59.39%
2	67.82%	67.74%	67.28%	66.28%	59.39%
5	67.55%	67.51%	67.2%	66.3%	59.43%
10	67.02%	67%	66.82%	66.12%	59.46%
50	61.66%	61.66%	61.64%	61.53%	58.05%

#### Mean Global Sales Ratio and Destination Market Size



# Mean Global Sales Ratio and Foreign Supply Potential



## Baseline: Global and Local Sales Ratio

Dep. Var.	(	(2)	(3)	(4)	(5)	(c)
Dep. Var.	(	tio of core				(6)
			to second p			
		Global rati			Local ratio	
ln GDP	0.092***	0.083***	0.107***	0.073***	0.057***	0.077***
	(0.013)	(0.012)	(0.010)	(0.008)	(0.005)	(0.006)
ln supply potential	0.067***	-0.017	0.044***	0.080***	0.018	0.068***
п заррту россина	(0.016)	(0.024)	(0.014)	(0.016)	(0.016)	(0.013)
	(0.010)	(0.021)	(0.011)	(0.010)	(0.010)	(0.010)
ln distance		-0.063			-0.046*	
		(0.043)			(0.023)	
		0.010			0.100	
contiguity		0.013			-0.108	
		(0.051)			(0.081)	
colonial link		-0.060			-0.041	
		(0.051)			(0.043)	
common language		0.023			-0.048	
		(0.050)			(0.038)	
RTA		0.066			0.004	
ILIA		(0.059)			(0.033)	
		(0.000)			(0.000)	
common currency		0.182***			0.335***	
		(0.047)			(0.037)	
both in GATT		0.006			-0.033	
		(0.046)			(0.026)	
ln freeness of trade			0.096***			0.028
			(0.026)			(0.017)

## Baseline: Global and Local Sales Ratio

Table 2: Global ra	Table 2: Global ratio of core product $(m = 0)$ to $m'$ product sales' regressions						
	(1)	(2)	(3)	(4)	(5)	(6)	
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		Global rati			Local ratio		
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			(0.026)			(0.017)	

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		Global rati			Local ratio	
ln GDP	0.092***	0.083***	0.107***	0.073***	0.057***	0.077***
	(0.013)	(0.012)	(0.010)	(0.008)	(0.005)	(0.006)
ln supply potential	0.067***	-0.017	0.044***	0.080***	0.018	0.068***
in suppry potential	(0.016)	(0.024)	(0.014)	(0.016)	(0.016)	(0.013)
	(0.010)	(0.024)	(0.014)	(0.010)	(0.010)	(0.010)
ln distance		-0.063			-0.046*	
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			(0.020)	1		(0.017)

#### Global Sales Ratio

Table 3: Global ratio of core product (m=0) to  $m^\prime$  product sales' regressions

	I		<i>)</i>		- 0
	(1)	(2)	(3)	(4)	(5)
ln GDP	0.107***	0.155***	0.110***	0.096***	0.098***
	(0.010)	(0.031)	(0.011)	(0.012)	(0.011)
1	0.044***	0 111***	0.020***	0.000*	0.026**
ln supply potential	0.044***	0.111***	0.038***	$0.022^{*}$	0.036**
	(0.014)	(0.033)	(0.014)	(0.012)	(0.016)
ln freeness of trade	0.096***	0.020	0.113***	0.137***	0.092***
III II college of trade					
	(0.026)	(0.057)	(0.032)	(0.038)	(0.026)
ln GDP per cap					0.025
m GD1 per cap					
					(0.018)
m' =	1	2	1	1	1
Destination GDP/cap	all	all	top $50\%$	top $20\%$	all
Observations	56092	5688	50622	40963	56092
Within $\mathbb{R}^2$	0.005	0.018	0.004	0.002	0.005

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#### Local Sales Ratio

Table 4: Local ratio of core product (m = 0) to m' product sales' regressions

	(4)	(0)	(0)	(4)	<b>/</b> E\
	(1)	(2)	(3)	(4)	(5)
ln GDP	0.077***	0.100***	0.083***	0.061***	0.066***
	(0.006)	(0.012)	(0.011)	(0.016)	(0.008)
ln supply potential	0.068***	0.064***	0.051***	0.028*	0.057***
	(0.013)	(0.022)	(0.018)	(0.016)	(0.014)
ln freeness of trade	0.028	0.013	0.059	0.092*	0.025
	(0.017)	(0.042)	(0.039)	(0.052)	(0.017)
ln GDP per cap					0.029**
					(0.013)
m' =	1	2	1	1	1
Destination GDP/cap	all	all	top $50\%$	top $20\%$	all
Observations	96876	49554	84706	64652	96876
Within R <sup>2</sup>	0.007	0.009	0.005	0.002	0.007

#### Local Sales Ratio

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## Theil Index

Table 5: Theil index regressions

Table 9. Then index regressions							
	(1)	(2)	(3)	(4)	(5)	(6)	
ln GDP	0.141***	0.019***	0.047***	0.052***	0.047***	0.041***	
	(0.010)	(0.001)	(0.002)	(0.002)	(0.003)	(0.003)	
ln supply potential	0.125*** (0.023)	0.016*** (0.002)	0.037*** (0.004)	0.033*** (0.004)	0.023*** (0.004)	0.031*** (0.004)	
ln freeness of trade	0.096***	0.007*	0.021**	0.032**	0.045**	0.021**	
ii irechess of trade	(0.036)	(0.004)	(0.009)	(0.013)	(0.022)	(0.009)	
ln GDP per cap						$0.013^{**}$ $(0.005)$	
						(0.003)	
Dep. Var.	s.d. $\ln x$	herf	theil	theil	theil	theil	
Destination GDP/cap	all	all	all	top $50\%$	top $20\%$	all	
Observations	82090	82090	82090	73029	57076	82090	
Within $\mathbb{R}^2$	0.107	0.164	0.359	0.356	0.341	0.359	

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	Table	o. ruen m	Table 5. Then index regressions						
	(1)	(2)	(3)	(4)	(5)	(6)			
ln GDP	0.141***	0.019***	0.047***	0.052***	0.047***	0.041***			
	(0.010)	(0.001)	(0.002)	(0.002)	(0.003)	(0.003)			
ln supply potential	0.125***	0.016***	0.037***	0.033***	0.023***	0.031***			
	(0.023)	(0.002)	(0.004)	(0.004)	(0.004)	(0.004)			
1 C C 1	0.006***	0.005*	0.001**	0.000**	0.045**	0.001**			
ln freeness of trade	0.096***	$0.007^{*}$	0.021**	0.032**	$0.045^{**}$	0.021**			
	(0.036)	(0.004)	(0.009)	(0.013)	(0.022)	(0.009)			
In CDP nor con						0.019**			
iii GDF pei cap									
						(0.005)			
Den Var	ed ln r	herf	theil	theil	theil	theil			
Destination GDP/cap	all	all	all	top 50%	top 20%	all			
Observations	82090	82090	82090	73029	57076	82090			
Within R <sup>2</sup>	0.107	0.164	0.359	0.356	0.341	0.359			