

# Firm Heterogeneity and Costly Trade: An Estimation Strategy and Policy Experiments

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## ■ USA, 2000: African Growth and Opportunity Act

### \* Exporter - Madagascar

- Duty free & Quota free
- From 2000-2004: Exports to USA grew from \$170 to \$500 million
- Exports to ROW: from \$200 million to \$ 500 million

## ■ Europe, 2001: Everything but Arms Initiative

### \* Exporter - Bangladesh

- Duty free & Quota free
- From 2000 to 2004, exports to EU grew from \$1.3 to \$3.0 billion
- US Quotas: Exports to the USA increased by \$30 million:

## ■ Preferences increased trade to preference giver *and* to other markets

- Widespread trade agreements
  - \* Preferential treatment (EBA, GSP (MFN), AGOA)
  - \* Intended to help LDCs
  - \* Complex eligibility restrictions: ROOs
- Limited work evaluating them
  - \* Back of the envelope calculations (No entry)
  - \* Limited information available (on fixed costs, market entry costs, documentation costs, parameters of distributions which are critical for evaluation)
- What determines their effectiveness?

- Tractable partial equilibrium model ‘a la Melitz with two dimensions of heterogeneity:
  - \* Productivity and Firm/Market specific demand shocks: hierarchy violations
  - \* Respects complexity of trade policy environment, suitable for policy counterfactuals
- Cross-section data based estimation: extends applicability
  - \* Cost: ignore dynamics and information therein
  - \* Maybe ways to incorporate some such information
- Estimation procedure to obtain all structural parameters:
  - \* Structure of fixed costs paid to enter industry or market, to produce, and documentation costs
  - \* Parameters of underlying distributions of demand shocks and productivity
  - \* Elasticities of substitution

# The Application

- Woven Apparel producers in Bangladesh. US-EU over 90% of exports
- US has quotas so must meet ROOs, assembly needed, no preferences
- EU has preferences, tariffs 0 not 12-15%, no quotas, and “Yarn Forward” strict ROOs. Domestic cloth 20% price premium. Documentation costs.
- Size of US and EU potential market is similar

## ■ Exports

- \* Large effects of preferences by EU on BD exports
- \* Cross-market effects: Also raises BD exports to US by a lot, and welfare
- \* Fixed cost subsidies and exports: 40-1 leverage roughly across all such cost subsidies.

## ■ Welfare

- \* Welfare results: “win-win” scenarios possible
- \* Fixed cost subsidies differ in their welfare effects
- \* Broader policy relevance: trade as aid, role of US quotas

- Profit of firm:

$$\pi_{ij}(\phi, v_{ij}, t_{ij}, \tau_{ij}) = (1 - t_{ij}) \left( p_{ij}(\phi) - \frac{1}{(1-t_{ij})} \frac{1}{\rho_j} \frac{w\tau_{ij}}{\alpha\phi} \right) q_{ij}(\phi)$$

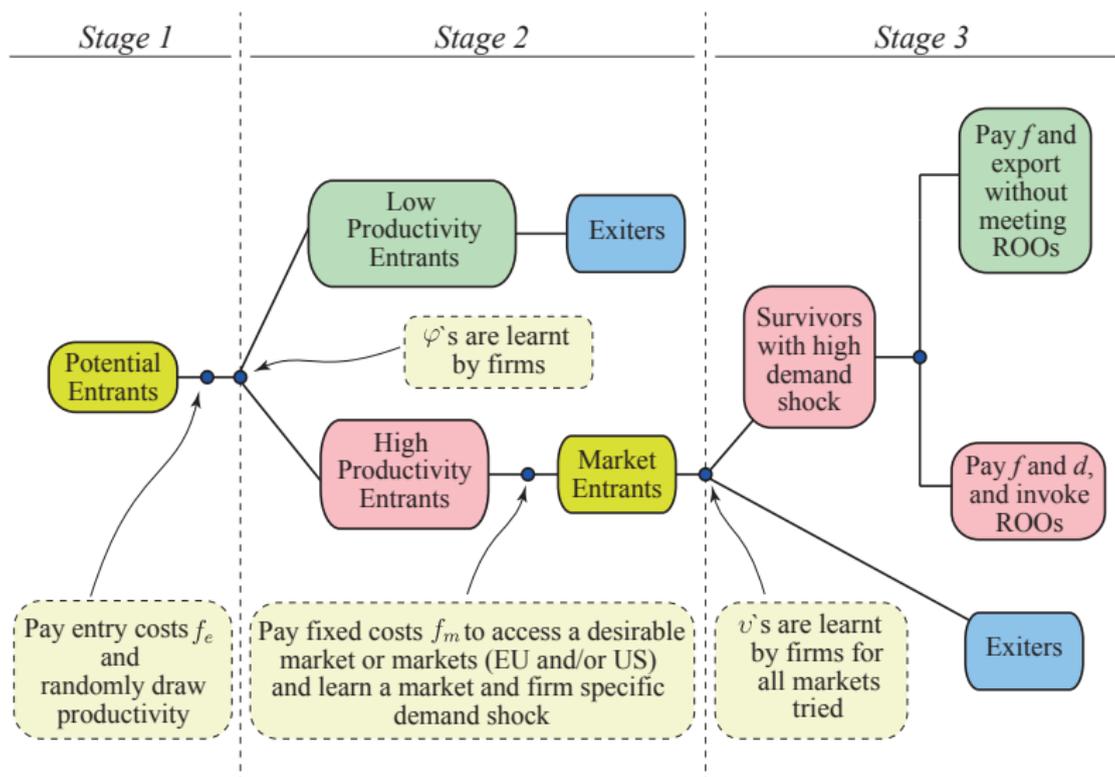
$$p_{ij}(\phi) = \frac{1}{(1 - t_{ij})} \frac{\sigma_j}{\sigma_j - 1} \frac{\tau_{ij}}{\alpha\phi}$$

- $t_{ij}$  is market specific tariff,  $\tau_{ij}$  are market specific transportation costs,  $\phi$  is firm specific productivity,  $\alpha \leq 1$  is cost disadvantage

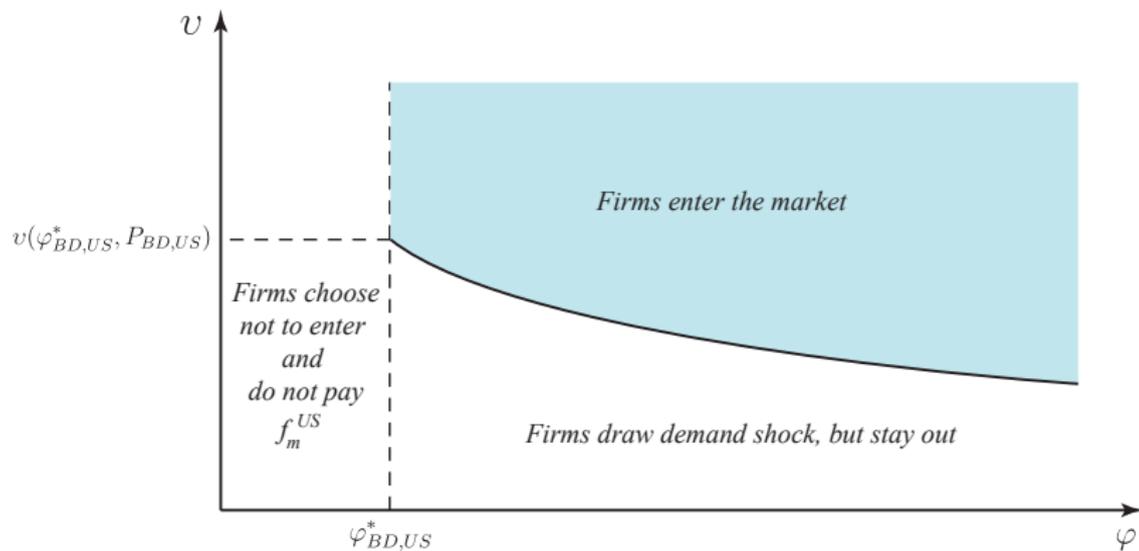
- Models ROO:

- \* If meet ROOs,  $\alpha < 1$ , and  $t_{ij} = 0$ .
- \* If do not meet ROOs,  $\alpha = 1$ , and  $t_{ij} > 0$ .

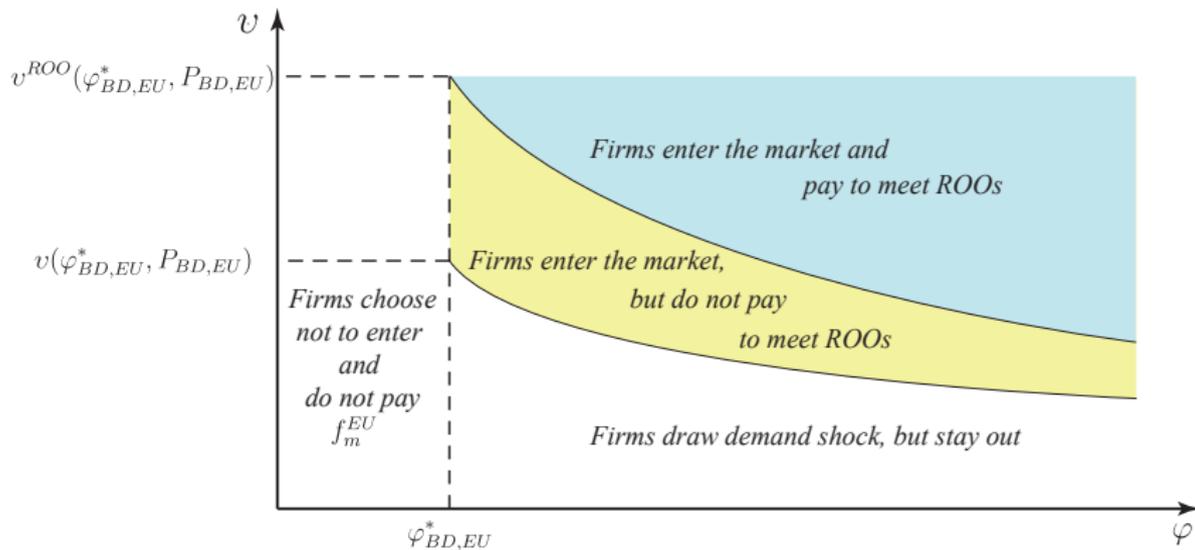
# Model Timing



# Stage 3: Trade-off Locus for US



# Stage 3: If ROO are an Option - Trade-off



- Two bounds for EU
- Only lower bound for US

Stage 2:

- $\phi$  is known by each firm,  $v_{ij}$  NOT known

Marginal firm:

$$\phi_{BD,EU}^* : E_v [\pi_{BD,EU}^{Total}(\phi, v, P_{BD,EU})] - f_m^{EU} = 0$$

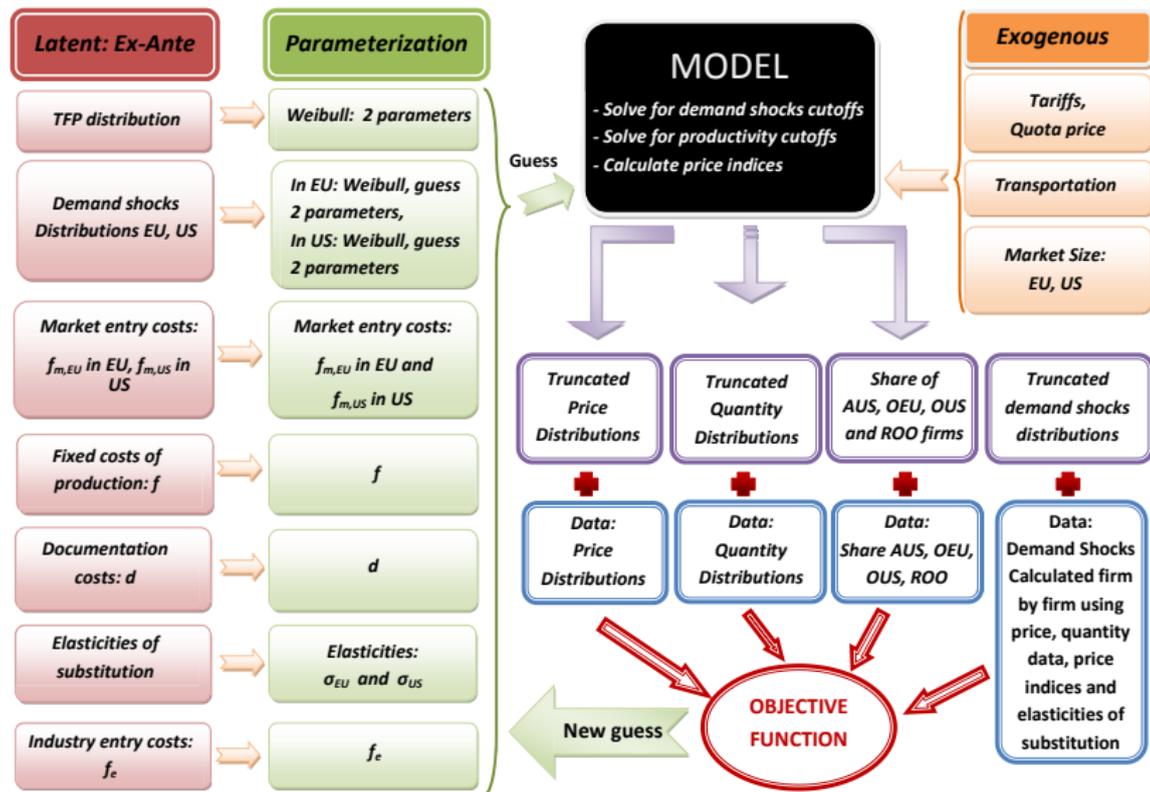
$$\phi_{BD,US}^* : E_v [\pi_{BD,US}(\phi, v, P_{BD,US})] - f_m^{US} = 0$$

Stage 1:  $\phi$  and  $v_{ij}$  NOT known

$$E_\phi [E_v [\text{Net Profit from EU market}]] + E_\phi [E_v [\text{Net Profit from US market}]] = f_e$$

- Bangladeshi customs data ("universe") for 2004 financial year. IGC project.
- Sector: Mens and boys cotton trousers (HS 620342)
  - \* About 800 firms.
  - \* Distribution of prices and quantities for AUS, OUS, OEU firms.
  - \* Shares of AUS, OEU and OUS firms.
  - \* Share of firms invoking ROO in EU market.
  - \* Do NOT use panel dimension of the data.
- UN Comtrade database
  - \* Total US and EU imports of woven apparel from Bangladesh
  - \* Total US and EU imports of woven apparel

# Estimation Outline



# Some Identification Intuition

- Matching shares of AUS, OUS, OEU firms helps match variance of demand shock distributions - more variance tends to raise OUS share.
- Matching shares of firms that meet ROOs helps identify  $\frac{d}{f}$ .
- Matching the position of the quantity distributions help pin down  $f$ .
- Matching distributions sheds light on remaining parameters.

# Some Exogenous Inputs

Table 1: Trade Policy Parameters

	$\alpha$	$t$	$t^{ROO}$	$\tau + \mu$
EU	0.85	0.12	0	1.14
US	1	0.2	0.2	1.14+0.07

- Distributions fit well overall
- US demand shocks mean and variance higher than in EU
- Marketing differences: Chain store effect?

# Other Estimates: Elasticities of Substitution

Elasticities of substitution		
	EU	US
$\sigma$	1.34	1.45
Std. Error	0.03	0.03

# Results: Structure of Fixed Costs

Fixed costs in absolute terms		
	<i>Estimate</i>	<i>Std. Error</i>
Market Entry Costs		
$f_m^{EU}$	251,250	19,054
$f_m^{US}$	67,869	5,237
Documentation Costs		
$d$	4,240	317
Industry Entry Costs		
$f_e$	77,348	5,372
Fixed Production costs		
$f$	6,404	476

- Two Scenarios: *Exogenous* and *Endogenous* quota license prices in US.
  - \* Changes in welfare muted with endogenous license prices: 70% of exogenous case.
- Complete removal of preferences for Bangladesh firms: Lose-Lose
  - \* Welfare loss \$481m in EU, \$69m in US endogenous license prices.
- Changing costs of meeting ROO
  - \* No yarn requirement: win-win. \$293m in EU and 6m in US
  - \* Double documentation costs: lose-lose. \$25m loss in EU and 1m in the US.
- Fixed cost compensation raises exports by 1.5 to 81.2 dollars per dollar spent. Later interventions more powerful.

# Long-run Equilibrium Implications of Policy Changes

	Baseline	No preferences	Higher doc. costs	No yarn req.
Tariff EU: ROO / NO	0% / 12%	12% / 12%	0% / 12%	0% or 12%
Tariff in US	20%	20%	20%	20%
Cost disadvantage	0.85	<b>1.00</b>	0.85	<b>1.00</b>
Documentation costs d/f	0.66	<b>0.00</b>	<b>1.32</b>	0.66
<i>Endogenous quota price setting</i>				
Quota license price (change)	=0.07	-100%	-5.7%	+43.4%
<i>EU imports from BD</i>	<i>482.3m</i>	<i>-31.7%</i>	<i>-1.5%</i>	<i>+17.1%</i>
<i>US imports from BD</i>	<i>233.6m</i>	<i>-11.9%</i>	<i>-0.1%</i>	<i>+1.1%</i>
Implied mass of entrants	4,712	-22.3%	-0.7%	+5.8
Price index in EU	100%	+19.1%	+0.87%	-9.38%
Price index in US	100%	+1.1	+0.01%	-0.1%
Share of ROO firms	70.2%	0%	57%	77.7%
Tariff Revenue in EU	447k	+8,742%	+125.9%	-34.2%
Tariff Revenue in US	46,728k	-11.9%	-0.1%	+1.1%
<i>Change in welfare EU</i>	—	<i>-480,936k</i>	<i>-25,208k</i>	<i>+293,418k</i>
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<i>Change in welfare EU</i>	—	<i>-707,595k</i>	<i>-37,343k</i>	<i>391,918k</i>
<i>Change in welfare US</i>	—	<i>-238,328k</i>	<i>-11,193k</i>	<i>82,650k</i>

# Short-run Equilibrium Implications of Policy Changes

	Baseline	No preferences	Higher doc. costs	No home yarn req.
Tariff EU: ROO / NO	0% / 12%	12% / 12%	0% / 12%	0% or 12%
Tariff in US	20%	20%	20%	20%
Cost disadvantage ( $\alpha$ )	0.85	<b>1.00</b>	0.85	<b>1.00</b>
Doc.costs ( $d/f$ )	<b>0.66</b>	<b>0.00</b>	<b>1.32</b>	0.66
<i>Change in mass of firms, %</i>				
Mass of exporters	485	0.00%	0.00%	-0.21%
<i>Change in cutoffs %</i>				
Product.cutoff, EU	0.8508	0.00	0.00%	0.00
Shock cutoff, EU	0.1866	+0.37%	0.00%	+0.37%
<i>Change in BD revenues before &amp; after tariff</i>				
$R_{BD,EU}$	482.3m	+0.97%	+0.01%	+4.64%
$(1 - t_{BD,EU})R_{BD,EU}$	481.8m	-11.06%	-0.11%	+4.68%
<i>Approximated change in welfare (\$)</i>				
Price index in EU	100%	-1.63%	-1.09%	-3.67%
Tariff revenues in EU	447k	+12,964%	+130%	-43%
Change in welfare, EU	—	+107,433k	+33,712k	+111.610k

# Long-run vs Short-run Effects

- Turning off entry channel changes dampens down effects
- Can lead to opposite welfare conclusions depending on parameters
- Removing preferences (+107m), *increasing* documentation costs (+34m), and removing Home Yarn requirements (+112m) *raise* EU welfare. No US effect by construction
  - \* Preference removal: LR (-) vs. SR (+)
  - \* Higher documentation costs: LR(-) vs. SR(+)
  - \* No Home-yarn requirement: LR(+) vs. SR(+)
- Fixed entry calculations might be quite misleading!

# Fixed Costs Compensation Efficiency

	Baseline	Ind. Entry	EU entry	US entry	Docum.	Fixed
Costs compensated:	—	$f_e$	$f_m^{EU}$	$f_m^{US}$	$d$	$f$
Original (estimated)	—	77,348	251,250	67,869	4,240	6,404
<i>Endogenous quota price case</i>						
<i>Compensation amnt.</i>	—	318	1,826	2,328	3,192	2,117
Market share in EU	482.3m	+0.11%	+1.68%	+1.30%	+1.37%	+6.54%
Market share in US	233.6m	+0.04%	+0.08%	+5.78%	+0.06%	+3.19%
Mass of entrants	4712	+0.22%	0.47%	2.62%	0.39%	12.34%
Tariff Revenue in EU	447k	+0.12%	+2.14%	+1.49%	-93.1%	+86.3%
Tariff Revenue in US	46,728k	+0.04%	+0.08%	+5.78%	+0.06%	+3.19%
Change in welfare EU	—	1.9m	28.5m	22.1m	22.7m	111.7m
Change in welfare US	—	0.2m	0.5m	33.4m	0.4m	18.4m
Policy efficiency	—	0.4	5.5	11.4	4.8	24.8
<i>Exogenous quota price case</i>						
<i>Compensation amnt.</i>		317	1,820	2,001	3,185	1,912
Market share in EU	482.3m	+0.28%	+2.07%	+8.59%	+1.76%	+14.69%
Market share in US	233.6m	+0.46%	+1.04%	+23.6%	+0.95%	+27.75%
Change in welfare EU	—	4.8m	35.2m	146.6m	29.4m	252.6m
Change in welfare US	—	2.6m	6.0m	136.8m	5.5m	159.8m
Policy efficiency	—	1.5	8.3	57.1	7.1	81.2

# Large Entry Effects: Logic

- Decomposition of policy experiment outcomes into extensive (via margins and via entry) & intensive margins.
  - \* Entry part of extensive margin does most of the work.
- Ex ante profits are very flat in mass of entry. Policy shifts curve up so large entry effects
  - \* Low substitution between BD firms means new entrants make room for themselves
  - \* Lower BD price means BD firms steal from ROW firms: small country assumption
    - This channel does less if substitutability in BD and ROW is reduced
  - \* Marginal TFP firms with marginal demand shock produces  $f$
  - \* So marginal firm produces more than  $f$  on average making marginal firms more important economically
- Quotas mute impact in US and in EU: US quotas prevent EU policies from being effective

# Relation to Krugman and Chaney

- Krugman (1980): homogeneous firms + low  $\sigma \Rightarrow$  tariff won't reduce imports much as goods poor substitutes
- Chaney (2008): heterogeneous firms + low  $\sigma \Rightarrow$  tariff reduces imports a lot as marginal firm has little disadvantage from high cost so sells a lot even if it's profits are low. Hence, large effect of tariff on trade flows.
- No free entry in Chaney! Most of action comes from entry margin.

# Policy importance:

- Trade facilitation vs direct aid as aid/development tool.
- Conversely, devastating impact of poor infrastructure, rule of law, corruption,..
- Such aid may also be in donor's narrow interest
- Approach can be used to evaluate policy interventions

THANK YOU!

$$\left[ \frac{1}{N} \sum_{i=1}^N m_i(X, \theta) \right] {}^t W \left[ \frac{1}{N} \sum_{i=1}^N m_i(X, \theta) \right] \longrightarrow \min_{\theta}$$

- Shares of firms across markets component:

$$m_{i,AUS}^{Share}(X, \theta) = I [Firm\ i\ is\ AUS, \theta] - S_{AUS}^e.$$

- Distributions component:

$$m_{ijk}^P(X, \theta) = I \left[ p_{ij} \in \left[ \ddot{p}_k^j(\theta), \ddot{p}_{k+\varepsilon}^j(\theta) \right] \right] - \varepsilon$$

$$m_{ijk}^q(X, \theta) = I \left[ q_{ij} \in \left[ \ddot{q}_k^j(\theta), \ddot{q}_{k+\varepsilon}^j(\theta) \right] \right] - \varepsilon,$$

$$m_{ijk}^v(X, \theta) = I \left[ v_{ij} \in \left[ \ddot{v}_{jk}^1(\theta, X), \ddot{v}_{jk+\varepsilon}^1(\theta, X) \right] \right] - \\ - I \left[ v_{ij} \in \left[ \ddot{v}_{jk}^2(\theta, X), \ddot{v}_{jk+\varepsilon}^2(\theta, X) \right] \right]$$

\* Where  $j \in \{OEU, AUS, OUS\}$ ,  $k$ -th percentile,  $\varepsilon$ -bin size.

- $W$  is *unitary* at the first step, and the *optimal* at the second.

# Results: Productivity Distributions

- AUS firms for both EU and US markets firms fit is good
- OEU, OUS firms distribution of price and quantity fits relatively badly
- Model has OEU and OUS firms being low productivity (high price) unlike data
  - \* High productivity firms need very bad EU or US shock to be OEU or OUS
- Capacity constraint in real world?
  - \* Only demand shock matters if there are capacity constraints
  - \* Lets high productivity (low price) firms sell to only one market
  - \* Limited quantity

# Results: Demand Shocks

Distribution of demand shocks				
	<i>EU</i>		<i>US</i>	
	Estimate	Std. Err.	Estimate	Std. Err.
Shape ( $\gamma$ )	0.32	0.008	0.17	0.003
Scale ( $\lambda$ )	1.39	0.087	0.57	0.020
<i>Implied means and Coefficient of Variation</i>				
Implied mean shock	10.4		421.8	
Coefficient of variation	4.9		30.7	

- $R_{BD,US}$  is total Bangladeshi sales to the US: COMTRADE
- $R_{US}$  is total exports of apparel to the US: COMTRADE

$$R_{BD,j} = \frac{(P_{BD,j})^{1-\sigma_j}}{(P_{BD,j})^{1-\sigma_j} + \sum_{i \in \Omega_{(-BD)}} [P_{i,j}]^{1-\sigma_j}} R_j.$$

- $(P_{BD,j})^{1-\sigma_j}$  comes from estimation.
- Solve for  $\sum_{i \in \Omega_{(-BD)}} [P_{i,j}]^{1-\sigma_j} = \bar{P}_{-BD,US}$ .
- In our simulations we keep this fixed in accordance with our partial equilibrium assumptions.

# Endogenous quota price: Setup

- Survey: Original quota price in the US market about 7%
  - \* This level is used in estimation
- Allow quota price to change, keeping Quantity old from BD to US constant ( $Q_{BD,US}$ )
  - \* Note: Export revenue changes via price index changes
- Solve for model unknowns & for a new quota price
- Compare results to exogenous quota price case

# Long-run Equilibrium Implications of Policy Changes

- No yarn requirement (win - win)
- Liberalizing preferences raises entrants by around 5.8% in industry
- 9.4% fall in price index in EU, and 0.1% fall in US from lower cost and price and more entry
- Large changes in cutoffs
- Welfare effects:
  - \* EU: TR falls by 34.2%, CS rises, welfare rises by \$391 million
  - \* US: TR rises by 1.1%, CS rises, welfare rises by \$83 million
- EU policy raises US welfare: win - win scenario
- US quotas would insulate: BD quotas made more binding. Also reduces positive impact on EU as less entry occurs.

# Long-run Equilibrium Implications of Policy Changes

	Baseline	No preferences	Higher doc. costs	No yarn req.
Tariff EU: ROO / NO	0% / 12%	12% / 12%	0% / 12%	0% or 12%
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Price index in EU	100%	+19.1%	+0.87%	-9.38%
Price index in US	100%	+1.1	+0.01%	-0.1%
Share of ROO firms	70.2%	0%	57%	77.7%
Tariff Revenue in EU	447k	+8,742%	+125.9%	-34.2%
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<i>Change in welfare US</i>	—	<i>-238,328k</i>	<i>-11,193k</i>	<i>82,650k</i>

# Long-run Equilibrium Implications of Policy Changes

- Removal of preferences (lose - lose)
- Reduces profits, less entry, price indices rise
- Welfare Effects
  - \* EU: TR increases by 8,742%, CS falls, welfare falls
  - \* US: TR falls 11.9%, CS falls, welfare falls
  - \* EU policy reduces US welfare: lose - lose
- US quotas provide insulation: BD quotas made less binding

# Long-run Equilibrium Implications of Policy Changes

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# Long-run Equilibrium Implications of Policy Changes

- Documentation costs double (lose - lose)
- Fewer firms meet ROOs so lower cost and price, but pay tariffs so higher price.
  - \* Small increase in price indices from less entry
  - \* Small changes in cutoffs
- Welfare Effects, Endogenous quota price
  - \* EU: TR rises by 125.9%, CS falls, welfare falls by \$25.0m
  - \* US: TR falls by 0.1%, CS falls, welfare falls by \$0.7m
- EU policy reduces US welfare
- US quotas would provide insulation: BD quotas made less binding.