# SMU ECONOMICS & STATISTICS WORKING PAPER SERIES



# Discussion of Balistreri, Hillberry, and Rutherford (2007): "Structural Estimation and Solution of International Trade Models with Heterogeneous Firms"

**Davin Chor** October 2007

# SMU ECONOMICS & STATISTICS WORKING PAPER SERIES



# Discussion of Balistreri, Hillberry, and Rutherford (2007): "Structural Estimation and Solution of International Trade Models with Heterogeneous Firms"

**Davin Chor** October 2007

Discussion of Balistreri, Hillberry, and Rutherford (2007): "Structural Estimation and Solution of International Trade Models with Heterogeneous Firms"

> Davin Chor (Singapore Management University)

> > EIIT, 12-14 Oct 2007

#### Overview and contributions

► Structural estimation of a multi-region Melitz model with heterogeneous firm industries

#### Overview and contributions

- Structural estimation of a multi-region Melitz model with heterogeneous firm industries
- Propose a solution method for computing the world trading equilibrium:
  - ▶ PE module: Solve for industry equilibrium taking general equilibrium variables (aggregate incomes, factor prices) as given
  - ▶ GE module: Solve for general equilibrium taking industry equilibrium variables (average industry productivity, prices, measure of firms) as given
  - Iterate between PE and GE modules until convergence.

#### Overview and contributions

- ▶ Structural estimation of a multi-region Melitz model with heterogeneous firm industries
- Propose a solution method for computing the world trading equilibrium:
  - ▶ PE module: Solve for industry equilibrium taking general equilibrium variables (aggregate incomes, factor prices) as given
  - ► GE module: Solve for general equilibrium taking industry equilibrium variables (average industry productivity, prices, measure of firms) as given
  - Iterate between PE and GE modules until convergence.
- ▶ Calibration strategy: Pin down some parameters based on the literature.

Estimate the remaining structural parameters ( $\theta$ , a, fixed costs of exporting) by NLLS to fit bilateral manufacturing trade flows in the GTAP database.

#### Overview and contributions (cont.)

- ▶ Implementation: Relatively aggregate observational units
  - ▶ 9 regions (CHN, NAF, LAM, EUR, EER, JKT, ROA, ANZ, ROW)
  - ▶ 7 sectors (only aggregate manufacturing with firm heterogeneity)

# Overview and contributions (cont.)

- ▶ Implementation: Relatively aggregate observational units
  - ▶ 9 regions (CHN, NAF, LAM, EUR, EER, JKT, ROA, ANZ, ROW)
  - 7 sectors (only aggregate manufacturing with firm heterogeneity)
- ▶ Counterfactuals: Reduction of ad valorem tariff barriers versus fixed cost barriers to trade in manufactures
  - Welfare gains much larger (4 times) with reduction of fixed costs of trade
  - Complementarity of reducing both fixed and variable trade costs
  - ▶ Interesting point: Biggest gainers appear to be developing regions as opposed to developed regions (presumably because of higher initial barriers)

#### General comments

► An important research agenda: Quantifying the welfare gains from trade liberalization in a setting with heterogeneous firms.

Theoretical set-up is a natural extension of Melitz (2003)

▶ Numerical computation of general equilibrium is conceptually neat.

Facilitated by neat aggregation in the Melitz model

▶ Plausible that gains from reducing fixed exporting costs are larger given relatively low level of recorded tariff barriers in GTAP (9.3%)

Consistent with prior evidence that the extensive margin (number of exporting firms) matters more than the intensive margin (exports per firm) in accounting for the magnitude of trade flows (Eg Eaton, Kortum and Kramarz (2004))

#### Specification choices

• Fixed costs:  $f_{rs} = f_r^p + f_s^x + f_{rs}^r$ 

 $f_{rs}^{r}$  computed as a residual to fit bilateral trade exactly.

#### Specification choices

- Fixed costs:  $f_{rs} = f_r^p + f_s^x + f_{rs}^r$ 
  - $f_{rs}^{r}$  computed as a residual to fit bilateral trade exactly.
- Does this parsimonious specification provide a good fit to the data? Would like to see plots of predicted trade flows when setting  $f_{rs}^r = 0$

against actual trade flows.

Are there dimensions along which the estimated model does a relatively poor job of fitting trade flows? (Possible mis-specification)

### Specification choices

• Fixed costs:  $f_{rs} = f_r^p + f_s^x + f_{rs}^r$ 

 $f_{rs}^{r}$  computed as a residual to fit bilateral trade exactly.

▶ Does this parsimonious specification provide a good fit to the data?

Would like to see plots of predicted trade flows when setting  $f_{rs}^{r}=0$ against actual trade flows.

Are there dimensions along which the estimated model does a relatively poor job of fitting trade flows? (Possible mis-specification)

▶ For eg:  $f_{rs}^r$  much larger in magnitude for EER and ROW (Table 5), so a lot more residual variance in trade flows unexplained for these regions.

Is it all due to fixed exporting costs, or is there something else systematically different about these regions?



 One possibility: Differences in technological capabilities Minimum productivity in Pareto distribution: b could be allowed to vary by exporting country (ie  $b_r$ )

- One possibility: Differences in technological capabilities Minimum productivity in Pareto distribution: b could be allowed to vary by exporting country (ie  $b_r$ )
- ▶ Another possibility: Differences in the sunk cost of firm entry in each country  $(f_r^e)$  instead of  $f^e$

- One possibility: Differences in technological capabilities Minimum productivity in Pareto distribution: b could be allowed to vary by exporting country (ie  $b_r$ )
- ▶ Another possibility: Differences in the sunk cost of firm entry in each country  $(f_r^e)$  instead of  $f^e$

Two side points:

- Presentation of fixed cost barriers: prefer if convert to monetary units  $(f_{rs}c_r \text{ instead of } f_{rs}).$
- Some parameters already calibrated. Why not also calibrate  $\theta$  and a from the literature, and leave only the fixed cost parameters to estimation?

Aggregation of regions: A limitation, as authors acknowledge.

May be the reason for the low distance elasticity obtained ( $\theta = 0.139$ ), when both  $\theta$  and a are estimated as free parameters.

Aggregation of regions: A limitation, as authors acknowledge.

May be the reason for the low distance elasticity obtained ( $\theta = 0.139$ ), when both  $\theta$  and a are estimated as free parameters.

- Problems with working with individual countries:
  - Could run into computational time issues
  - The problem of zeros could emerge

When trying to fit a zero, could end up with a lower bound instead of true value of fixed cost parameters.

Aggregation of regions: A limitation, as authors acknowledge.

May be the reason for the low distance elasticity obtained ( $\theta = 0.139$ ), when both  $\theta$  and a are estimated as free parameters.

- Problems with working with individual countries:
  - Could run into computational time issues
  - The problem of zeros could emerge When trying to fit a zero, could end up with a lower bound instead of true value of fixed cost parameters.

Compromise: Work with countries, but restrict to subset that accounts for most of world manufacturing trade (eg OECD + large developing countries)

Aggregation of regions: A limitation, as authors acknowledge.

May be the reason for the low distance elasticity obtained ( $\theta = 0.139$ ), when both  $\theta$  and a are estimated as free parameters.

- Problems with working with individual countries:
  - Could run into computational time issues
  - The problem of zeros could emerge When trying to fit a zero, could end up with a lower bound instead of true value of fixed cost parameters.

Compromise: Work with countries, but restrict to subset that accounts for most of world manufacturing trade (eg OECD + large developing countries)

Less keen on disaggregating sectors: Would have to worry about how parameters such as fixed costs might differ systematically across sectors.

#### Additional exercises

A petri dish with a lot of variables to look at.

- Decomposing the trade expansion to compute how much is explained by growth on the extensive margin vs the intensive margin.
- Can unilateral reduction of barriers to trade actually worsen welfare for that country?

#### Additional exercises

A petri dish with a lot of variables to look at.

- Decomposing the trade expansion to compute how much is explained by growth on the extensive margin vs the intensive margin.
- Can unilateral reduction of barriers to trade actually worsen welfare for that country?
- ▶ How important is firm heterogeneity (quantitatively) for welfare?
  - Sensitivity of the welfare results to heterogeneity parameter (vary a)
  - ▶ Comparison with Lai-Trefler (2002), Lai-Zhu (2004):  $a \to \infty$  and  $f_{rs} \to 0$

#### Additional exercises

A petri dish with a lot of variables to look at.

- ▶ Decomposing the trade expansion to compute how much is explained by growth on the extensive margin vs the intensive margin.
- Can unilateral reduction of barriers to trade actually worsen welfare for that country?
- ▶ How important is firm heterogeneity (quantitatively) for welfare?
  - Sensitivity of the welfare results to heterogeneity parameter (vary a)
  - ▶ Comparison with Lai-Trefler (2002), Lai-Zhu (2004):  $a \to \infty$  and  $f_{rs} \to 0$
- Comparison with different structural framework where head-to-head competition determines who exports to whom: Eaton-Kortum (2002), Alvarez-Lucas (2007)
  - ▶ Would like to see welfare gains in a hypothetical zero-gravity exercise (reducing  $\tau_{rs}(1+t_{rs})$  to 1, and  $f_{rs} \rightarrow 0$ )



#### Minor comments

- 1. Mention non-convexities: Natural question is uniqueness. Experimenting with different initial values in the algorithm should ease this concern.
- 2. A little more description of the variables taken from GTAP