# Beyond the Iceberg Hypothesis: Opening the Black Box of Transport Costs

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#### Motivation

- ▶ Trade costs have a central role in international economic analysis
  - Declining over the second half of the 20<sup>th</sup> century (Jacks et al., 2008, Novy, 2013)
  - But still significant: Average international trade costs = a 74% markup over production costs (Anderson & Van Wincoop, 2004)
- ▶ What exactly are "trade costs"?
  - Transaction costs, policy costs, time costs, and transport costs per se
- ► Transport costs are a sizeable share of international trade costs
  - Amount to  $\simeq 30\%$  of international trade costs  $\Leftrightarrow$  A 21% markup over production costs
- ⇒ If much trade policy barriers have been removed, the transport cost component of trade costs remains sizeable

#### The paper: On international transport costs



# Motivation (cont')

- Standard modeling of trade costs: As an ad-valorem tax-equivalent
  - As a constant percentage of the producer price per unit traded
  - ⇔ Part of the "iceberg cost" hypothesis (Samuelson, 1954)
    - \* With p the import price,  $\widetilde{p}$  the export price, q the quantity traded and  $\tau>1$  the trade cost
    - $\Rightarrow$  Multiplicative costs:  $pq = \tau \widetilde{p}q$
- Yet... A debated question
- Would not trade costs rather exhibit an additive structure ?
  - Why would it be more costly to transport from Milan to Paris, a pair of Italian shoes at price €300 than a pair of Italian shoes at price €50?
  - Pricing shipping often includes an additive component
    - UPS: A \$125 fee charged for a 2 pound package from Oslo to NYC (Irrarazabal et al., 2015)
    - $\Rightarrow$  Additive costs:  $pq = (t + \widetilde{p})q$



- Recent empirical evidence in support of the additive structure of trade costs
  - Irrarazabal et al. (2015), Hummels & Skiba (2004), Martin (2012)
- The structure (additive vs iceberg) of transport costs is not anecdotal
  - Additive costs play an important role in shaping the pattern of trade flows (Alchian & Allen, 1964)
  - Strong normative implications, notably w.r.t. the welfare gains of trade liberalization (Sorensen, 2014)
- ⇒ Transport costs are likely to display an additive component, but precisely... by how much?

One objective of the paper: Provide an answer to this question



# Our paper in one question (and 3 answers)

- Do additive transport costs matter?
  - Provide an empirical decomposition of the structure of transport costs
  - Using the US imports database over 1974-2013 (air/vessel)
- ⇒ Yes, they do
- (1) In terms of size: Additive costs are sizeable
  - Additive cost: 1.8% and 2.9% of the export price, in air / vessel
  - Roughly 50% of the overall transport costs
- (2) In terms of quality of fit: With the additive component included,
  - The estimated iceberg component is reduced by a factor of 2
  - A substantially better "goodness-of-fit"



#### (3) In accounting for the time trend of transport costs

- The modelling of the additive component of transport costs is key
- Because it changes the result of excluding the trade composition effects when characterizing the time trend
  - \* The decrease in TC over time is mostly attributable to the decrease in the "pure" transport costs,
  - \* Rather than to trade composition effects
- A result in sharp contrast with Hummels (2007)

All our results: Provide new quantitative evidence about the importance of the additive component in international transport costs

#### Related literature: Two related strands

- Challenging the dominant role of iceberg costs in international trade
  - Hummels and Skiba (2004) (sectoral data), Martin (2012) (firm-level data)
  - The closest to us: Irarrazabal, Moxnes and Opromolla (2015)
  - $\Rightarrow$  In support of the additive cost component assumption
  - ≠ Our results: Quantitatively estimate the value of the additive costs
    - A broader view of the magnitude of additive costs
  - ⇒ Additive costs do matter quantitatively, throughout the period
- Studying the patterns of trade costs over time
  - Hummels (2007), Behar and Venables (2011)
  - What lies behind the decrease in transportation costs observed in the recent decades?
  - Hummels (2007): Mostly due to trade composition effects
  - ≠ Our results: Trade composition effects only a minor role
  - Why such a difference?
  - ⇒ Key role of the modelling of the additive component



#### Plan of the talk

- Data Sources
- ► Empirical Methodology
- Results
- Conclusion



#### Data sources

- Our measure of international transport costs: The difference between the "export" price and the "import" price of US imports
- Database: US Imports of Merchandise database
  - The export (fas) price,  $\widetilde{p}$ : the price for one kg of merchandise at the country export point
  - The import (cif) price, p: the price for one kg of merchandise at the entry in the US
  - Yearly basis, from 1974 to 2013, SITC 5-digit classification level, by transport mode (air or vessel)
- $\Rightarrow$  Our dependent variable: Based on the ratio  $p/\widetilde{p}$
- ► The RHS is at the 3-digit classification level
  - Estimation at the 4-digit level on some selected years as robustness
  - Approximatively 200 sectors (3 digits), from around 200 countries
    - \* Around 600-700 sectors at the 4-digit level



#### More on our database

- Implications (and limitations)
  - Only cover international transport costs
  - Among transport costs, insurance + handling + quantitative freight costs (e.g. not those related to the time value of goods)
- ► A rich database to exploit
  - US imports, long time period: Broad view of international trade flows
  - A reliable database, already used by Hummels (2007), but on a shorter length of time
  - Have both the import and the export prices
  - $\Rightarrow$  Allows the estimate the levels of both the ad-valorem and the additive transport costs
    - ≠ Irarrazabal et al. (2015)



# Empirical specification (1)

#### The equation at the root of the estimation

Relate the import price p to the export price  $\widetilde{p}$  given both additive (per-kg) costs t and ad-valorem costs  $\tau$ :

$$p = \tau \widetilde{p} + t$$
, with  $\tau \ge 1$ ,  $t \ge 0$ 

- From country i, for a product k (at the k = 5-digit classification level, and for a given transport mode)
- ▶ Rewrite to get:

$$\frac{\rho_{ik}}{\widetilde{\rho}_{ik}} - 1 = \tau_{ik} - 1 + \frac{t_{ik}}{\widetilde{\rho}_{ik}} \tag{1}$$

- ⇒ For each year over 1974-2013
  - The equation is also mode (air or vessel) specific



# Empirical specification (2)

#### The estimation strategy

- ▶ Make some simplifying assumptions to get the estimated equation
- ▶ About the specification of both additive and multiplicative costs
  - (1) Separability between the origin country i and the product k dimensions (ss in Irarrazabal et al., 2015)
  - (2) All products k in a 3-digit sector s share the same structure of costs
  - $\Leftrightarrow$  Write  $t_{ik}$  and  $\tau_{ik}$  as:

$$\tau_{ik} = \tau_i \times \tau_{s(k)}, \qquad t_{ik} = t_i + t_{s(k)} \tag{2}$$

- About the specification of the error term
  - Given the constraint  $\frac{\bar{p}_{ik}}{\bar{p}_{ik}}-1>0$ , the error term should be always positive and multiplicative
  - ⇒ The equation of interest becomes:

$$rac{
ho_{ik}}{\widetilde{
ho}_{ik}} - 1 = \left( au_i imes au_{s(k)} - 1 + rac{t_i + t_{s(k)}}{\widetilde{
ho}_{ik}}
ight) imes \exp(\epsilon_{ik})$$

- With  $\epsilon_{ik}$  following a normal law centered on 0



► Taking logs, we finally estimate the following equation

$$\ln\left(\frac{\rho_{ik}}{\widetilde{\rho}_{ik}}-1\right) = \ln\left(\tau_i \times \tau_{s(k)} + \frac{t_i + t_{s(k)}}{\widetilde{\rho}_{ik}}-1\right) + \epsilon_{ik}$$
(3)

- $au_i$ ,  $au_{s(k)}$ ,  $t_i$ ,  $t_{s(k)}$  are the parameters (i.e., fixed effects) to be estimated
- ▶ A non-linear equation (due to the additive costs)
- ⇒ Estimation using non-linear squares
  - At the basis of the method: Approximate the model by a linear one and refine the parameters by successive iterations
  - The criterion for convergence: That the sum of the squares of the residuals does not increase from one iteration to the next
- ▶ Eliminate potential influence of outliers: Exclude the 5 percent of the upper and lower tails of the distribution

# Empirical specification (3)

# How to characterize the importance of additive costs relatively to ad-valorem?

- ▶ Estimate Equation (5) constraining t = 0
- ⇒ Estimate two models
- (A) With additive costs excluded (only ad-valorem costs):

$$\ln\left(\frac{\rho_{ik}}{\widetilde{\rho}_{ik}}-1\right) = \ln\left(\tau_i \times \tau_{\mathfrak{s}(k)}-1\right) + \epsilon_{ik}^{ice} \tag{4}$$

(B) With additive costs included:

$$\ln\left(\frac{p_{ik}}{\widetilde{p}_{ik}}-1\right) = \ln\left(\tau_i \times \tau_{s(k)} + \frac{t_i + t_{s(k)}}{\widetilde{p}_{ik}}-1\right) + \epsilon_{ik}$$
 (5)

- \* Under Model (B),  $\simeq$  800 fixed effects to estimate
- \* For each year over 1974-2013, by transport mode (air/vessel)



- After running the estimates, we re-built:
  - (A) With only iceberg costs (from Equation (4)):

$$\widehat{ au}_{is}^{ice} = \widehat{ au}_i imes \widehat{ au}_s$$

(B) With additive costs included (from Equation (5)):

$$\widehat{ au}_{is}^{adv} = \widehat{ au}_i imes \widehat{ au}_s, \qquad \widehat{t}_{is} = \widehat{t}_i + \widehat{t}_s$$

- Taking the weighted average over the sector-country dimension, we finally get, by year and transport mode:
  - With only iceberg costs:  $\widehat{\tau}^{\textit{ice}}$
  - When additive costs are included:  $\hat{\tau}^{adv}$ ,  $\hat{t}$

## Question, and answers

- ▶ Do additive costs matter?
- ▶ How we answer (yes) to this question

## Result 1: Size of additive transport costs

- ▶ Estimate the values of both the ad-valorem and the additive components
  - Average values over 1974-2013, in percent of the export price More details

Mean value over 1974-2013				
# digit	3 digits		4 digits (*)	
Mode	Vessel	Air (**)	Vessel	Air
Model (A) - With only Ad-Valorem Transport Costs ( $\widehat{\tau}^{ice}$ , in %)				
Mean	5.8	5.1	6.0	4.9
Median	5.1	4.2	5.2	3.7
Model (B) - With Additive & Ad-Valorem Transport Costs				
Ad-valorem term $(\widehat{ au}^{adv}, in \ \%)$				
Mean	3.2	2.5	3.3	2.4
Median	2.8	1.8	2.8	1.6
Additive term $(\hat{t}/\tilde{p}, \text{ in } \%)$				
Mean	2.9	1.8	2.8	1.9
Median	1.9	0.7	1.7	8.0
Data $(p/\widetilde{p}, in \%)$				
Mean	5.3	5.0	5.6	3.9
Median	4.3	2.0	4.4	1.9
# obs.	29279	28207	29317	27680
# origin country	188	191	188	189
# products	230	211	666	567



### Interpretation

#### ► Size of overall transport costs

- Add  $\simeq$  a 5% margin over the export price
- Lower than the 21% markup taken from Anderson & Van Wincoop (2004) (AWM), but
  - AVW decompose the 21% markup in 9% of time costs and 11% in pure freight costs
  - \* Their 11% markup: A "rough" estimate, based on Hummels (2001) with 1994 data
  - \* Our data are only for the US, which presumably has lower trade costs
- ⇒ Our work: A precise estimation of international transport costs
  - Going deeper into the structure of international transport costs



#### ▶ International transport costs: A sizeable additive component

- 48.2% of total costs in average for vessel, 42.3% for air
- A result that holds throughout the period See Figure 1
- Omitting the additive term substantially biases the iceberg component upwards (Table 1)
  - \* The ad-valorem cost is reduced by a factor of 2 when additive transport costs are included in the estimation
  - From 5.8% to 3.2% in maritime transport (mean value over the period)
  - \* From 5.1% to 2.5% in Air transport
- ▶ Opening the black box of transport costs ► More on this
  - Iceberg cost: 2.5% and 3.2% of the export price in Air & Vessel resp.
  - Additive cost: 1.8% and 2.9% of the export price
- ⇒ Valuable insights for related papers more theoretically-oriented, in need for calibration



## Result 2: Quality of fit

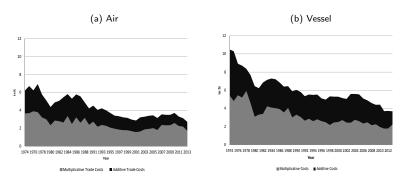
#### A better quality of fit with the additive component included

- Compare the goodness-of-fit of Model (B) (with additive TC)
   vs Model (A) (without additive TC)
- Various measures of goodness of fit
  - \* The  $R^2$  (the larger the value, the better the fit)
  - Standard Error of Regression (SER) (the smaller the value, the better the fit)
  - \* The Akaike Information Criterion (the lower AIC, the better the fit)
  - \* The log-likelihood ratio test ( $H_0$ : both models are equivalent)
- ⇒ A systematically better goodness of fit when including the additive component

  - Even when taking into account the additional degrees of freedom



## Result 3: Characterizing the time trend of TC



- Lower overall transport costs in Air than in Vessel
- Downward trend for both modes since 1974
  - \* A 50% decrease in Air, a 60% decrease in Vessel over the period



## Time trends in transport costs & composition effects

- ▶ Does it mean a decrease in transport costs *per se*? Not necessarily
- ▶ The change in overall transport costs over time:
  - Depend on the evolution of per product- per partner costs,
  - But also on the composition of trade flows
    - Over time, import more goods that are cheaper to transport, and/or from countries with which it is cheaper to trade
- ⇒ Necessary to eliminate the composition effects of trade flows, to isolate the evolution of transport costs per se
- ⇒ What we do, in accordance with Hummels (2007)

