

## BUILDING A DATASET FOR BILATERAL MARITIME CONNECTIVITY

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**Abstract** - This paper presents a unique database reporting the shortest liner shipping routes between any pair of countries for a reference sample of 178 countries over the 2006-2012 period. Computed maritime distances are retrieved using an original database containing all existing direct liner shipping connections between pairs of countries and the corresponding sea distance. The number of transshipments necessary to connect any country pair to allow for containerizable trade is also retrieved. The contribution of this database is threefold. First, it is expected to be a useful tool for a better appreciation of transport costs and access to regular container shipping services and their impact on trade. Secondly, as presented in this paper, it helps to describe and analyse the structure of the existing global network of liner shipping services for containerizable trade, i.e. most international trade in manufactured goods. Finally, our database is expected to facilitate the construction of a bilateral liner shipping connectivity index building on UNCTAD's original work.

**Key-words** - MARITIME TRANSPORT, SEA DISTANCE, TRADE COSTS, CONTAINERIZABLE TRADE

**JEL Classification** - C61, F1, L91

*This paper represents the personal views of the authors only, and not the views of the UNCTAD secretariat or its member States.*

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## 1. INTRODUCTION

Maritime transport is at the core of international trade in merchandises. Around 80% of volume of goods exchanged in the world are transported via sea (UNCTAD, 2008). Between 1970 and 2010, developing countries' share in the volume of seaborne exports rose from just 18 per cent to 56 per cent of the world's total (UNCTAD, 2013).

Containerizable transport services, in particular, are key for trade in manufactured goods and global value chains. Without access to regular "liner shipping" services that make use of standardized sea-containers, countries cannot competitively participate in globalized production. A recent empirical study confirmed the "[e]ffects of the Container Revolution on World Trade" (Bernhofen et al., 2013). As pointed out by *The Economist*, "[c]ontainers have been more important for globalisation than freer trade" (*The Economist*, 2013).

Several papers, such as inter alia Anderson and Van Wincoop (2004) and more recently Djankov and al. (2010) and Hummels and Schaur (2013), have emphasized the importance of transport costs and infrastructure in explaining trade and access to international markets. Different empirical strategies have been used to produce estimates of the overall level of transport costs. Some studies used the ratio between imports CIF and imports FOB to proxy transportation costs, the so-called cif/fob ratio (e.g. Baier and Bergstrand 2001, Hummels and Lugovskyy 2006). Estimates vary essentially with the level of product aggregation. A reasonable average estimate of such ratio computed based on total imports CIF and FOB at the country level ranges between 6 percent and 12 percent. At more disaggregated product levels their dispersion increases. Approximations of CIF/FOB ratios are higher for developing than for developed regions. UNCTAD estimates that in the last decade, freight costs amounted 6.4 per cent for developed countries' imports as compared to 10.6 per cent for Africa (UNCTAD, 2011). Based on the estimation of a gravity model using US data, Anderson and Van Wincoop (2003) found that transport costs correspond to an average ad valorem tax equivalent of 21%. These 21 percent include both directly measured freight costs and a 9% tax equivalent of the time value of goods in transit. Using a similar empirical approach, Clark and al (2004) estimates reveal that for most Latin American countries, transport costs are a greater barrier to U.S. markets than import tariffs. They also find that ports efficiency is an important determinant of shipping costs. Arvis and al. (2013) recent work is an extension of Jacks et al. (2011) contribution. As such, it represents the most comprehensive country-level analysis of trade costs and their components up to date. Their database includes 178 countries and covers the 1995-2010 period. Estimates of trade costs are inferred from the observed pattern of production and trade across countries. Results indicate that maritime transport connectivity and logistics performance are very important determinants of bilateral trade costs: UNCTAD's Liner Shipping Connectivity Index (LSCI) and the

World Bank's Logistics Performance Index (LPI)<sup>1</sup> are together a more important source of variation in trade costs than geographical distance, and the effect is particularly strong for trade relations involving the South.

In order to facilitate further and more extensive analysis of container transport services, trade costs and flows, we construct a unique database reporting the shortest maritime liner shipping routes between any pair of countries for a reference sample of 178 countries over the 2006-2012 period. In non-technical terms, a "liner shipping" service can be compared to a regular bus service, with a bus "line", with fixed departure times and with many other passengers on the same bus. This is comparable to the liner shipping service, where your container will be on the same ship as other containers belonging to many different owners. When we talk about liner shipping services (and the corresponding routes and distances), we look at a network of regular container shipping services. Thanks to containerization and the global liner shipping network, small and large importers and exporters of finished and intermediate containerizable goods from far away countries can trade with each-other, even if their individual trade transaction would not economically justify chartering a ship to transport a few containers from A to B. Thanks to regular container shipping services and transshipment operations in so-called hub ports, basically all countries are today connected to each other. To illustrate the point, think of the Paris Metro, which is also a network of "lines", and you can calculate how many "transshipments" you may need to get from Gare Montparnasse to Rue de la Pompe, and you can calculate the "shortest route" to get from Gare Montparnasse to Rue de la Pompe, even if there is no direct metro service between the two (Hoffmann, 2012).

Shortest routes are obtained by solving for the shortest path problem in the frame of the Graph mathematical theory applying the Dijkstra's algorithm. Computed maritime liner service distances are retrieved using an original database containing all existing direct liner service connections between pairs of countries and the corresponding sea distance between the two countries' respective main container ports. If a connection is qualified as "direct" it implies that there is no need for transshipment in a third country. Sea distance between pairs of countries represents the distance separating each coastal country's main port(s). In the cases of some large countries with several coast lines (e.g. USA, Canada et al) the main port retained varies according to the trade partner considered.

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<sup>1</sup> The World Bank's Logistics Performance Index (LPI) and UNCTAD's Liner Shipping Connectivity Index (LSCI) both aim in different ways to provide information about countries' trade competitiveness in the area of transport and logistics. However, the scope of the activities and countries covered, as well as the measurement approach, are rather different. In spite of these differences, both indexes are statistically positively correlated, with a partial correlation coefficient of +0.71. Information concerning UNCTAD's LSCI is available in UNCTAD's Review of Maritime Transport. A detailed description and data of the World Bank, LPI is available via the website <http://www.worldbank.org/lpi>.

Our results provide some interesting insights into the structure of the global liner shipping network. For instance, if we consider the data for 2012, about 13.3 per cent of the country pairs in our sample are connected directly, 9.6 per cent need one transshipment, 46.4 per cent two transshipments and 21 per cent three transshipments. This is to say that almost 70 per cent of country pairs are connected with no more than two transshipments and more than 90 per cent with no more than three transshipments.<sup>2</sup>

The rest of the paper is organized as follows. Next section presents our basic data and the algorithm used to compute maritime distances for connections without a direct service. Section 3 reviews some descriptive statistics and presents some stylized facts. The last section discusses immediate applications of our dataset and possible directions for further research.

## 2. DATA AND ALGORITHM

The resulting dataset includes 178 countries, 33 of which are landlocked. While landlocked countries have by definition no direct access to liner shipping services (their country level LSCI is not computed), they do of course also trade with overseas trading partners, making use of their neighbouring countries sea-ports. In order to be able to include land-locked countries in the analysis of trade and trade costs, they are also included in the database on maritime distances, assigning the distances from/to containerport in the transit country through which the largest share of overseas trade passes.

Six years are informed over the 2006-2012 period. The year 2007 is missing. Information on the number of transshipments necessary to connect any pair of countries is symmetric: if two transshipments are necessary to move containers from country C to country D, then the same number of transshipments is necessary to move containers in the opposite direction from D to C.

### *The Original Dataset*

The original dataset includes two variables for each pair of country. The first variable is the maritime distance between the main container ports. The second variable is a dummy variable that assumes the value 1 if a direct service between the two countries exists and 0 otherwise. Note that “direct” implies that there is no need for transshipment; however, the ship will usually call at other ports en route. The information on the existence or not of a direct connection is retrieved from the UNCTAD's Liner Shipping Connectivity Matrix (LSCM). The information contained in the latter database is obtained annually, in the month of May, through Lloyds List Intelligence.<sup>3</sup> The data covers the reported

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<sup>2</sup> These percentages are slightly different from earlier analysis (UNCTAD, 2013) because in this paper our data base includes land-locked countries, which are connected to the global shipping network through their neighbouring transit countries.

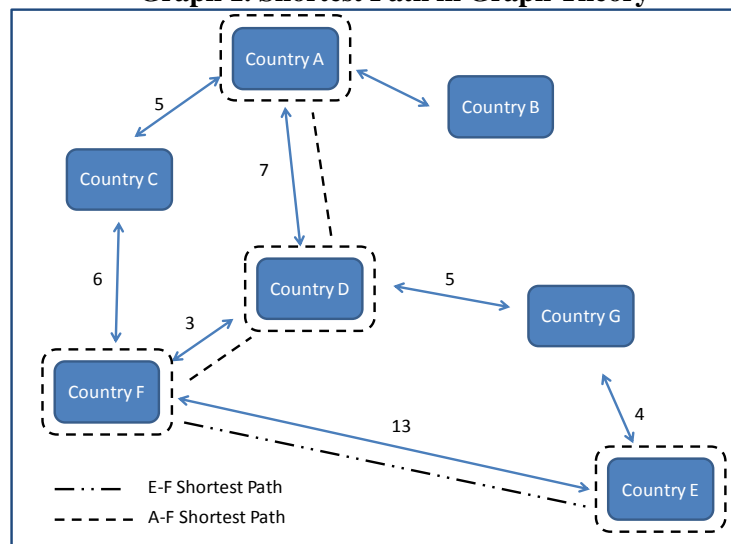
<sup>3</sup> Detailed information and access conditions are available through the website <http://www.lloydslist.com/ll/sector/containers/>. Until 2011 the data was obtained annually in the month of July through Containerization International On-line, which has since been incorporated into Lloyds List Intelligence.

deployment of all containerships at a given point in time. This methodology allows for comparisons over time, as the “sample” is always complete. UNCTAD started the systematic annual gathering of data in 2004 on the country level, and in 2006 on the pair-of-country level.

### The Algorithm

The original dataset informs exclusively on the existence or not of a direct connection between two countries. This is already an important indication of a country's connectivity. However, this would restrict the number of assessable trade relationships to 13.3 percent of all potential trade relationships. In order to complement the original information set we apply Dijkstra (1959) algorithm to our original data. Dijkstra's algorithm is the most celebrated algorithm for the solution of the *shortest path problem* in graph theory. For a given source (node) in a graph such as graph 1, the algorithm finds the shortest path between that node and every other node. For example, if the nodes of the graph represent countries and edge path costs represent sea distances between pairs of countries connected directly, Dijkstra's algorithm can be used to find the shortest route between one country and any other country. In other words, Dijkstra's algorithm allows us to identify the shortest route in terms of sea distance to cover connections between any two countries. Note that the shortest route will by default be a direct connection if it exists. As a consequence, the number of transshipments necessary to connect two countries is minimized.

**Graph 1. Shortest Path in Graph Theory**



Graph 1 illustrates the solution for connecting country A to country F. The shortest path goes through country D and the total sea distance covered equals 10. The total sea distance would correspond to our measure of maritime distance. Graph 1 also illustrates the solution of the shortest path between country E and country F. Despite the fact that total sea distance between E and F going

through countries G and D (i.e. 4+5+3) would be shorter than the direct distance between E and F (i.e. 13) the direct connection is retained by the algorithm. This hierarchy imposed to the algorithm reflects the fact that the cost of transshipment is likely to be much larger than the cost induced by the coverage of a longer distance but without transshipment. This constraint is in line with existing empirical findings. The analysis of Wilmsmeier and Hoffmann (2008) suggests that transshipment has the equivalent impact on freight rates as an increase in distance between two countries of 2,612 km.

### 3. DESCRIPTIVE STATISTICS AND STYLIZED FACTS

This section presents and briefly discusses some descriptive statistics and possible stylized facts using data on computed maritime distances and nature of connections. As mentioned before 178 countries make our reference sample. Information is available for the year 2006, and then for the years from 2008 to 2012.

#### 3.1. Connectivity: Number of Transshipments

Table 1 characterizes the nature of the connection between pairs of countries across years. Figures correspond to the share of the number of transshipments necessary to connect two countries in the overall number of country-pairs connections present in the sample, that is  $178 \times 177 (=31506)$  each year.

Over the whole period on average about 13 percent of country pairs are connected directly, about 10 percent need one transshipment, about 49 percent two transshipments and about 21 percent three transshipments. This is to say that about 72 percent of country pairs are connected with no more than two transshipments and around 93 percent with no more than three transshipments.

**Table 1. Number of transshipments  
(% share in total number of bilateral relationships)**

	2006	2008	2009	2010	2011	2012
0	13.3	13.8	13.2	13.6	13.3	13.3
1	9.5	9.9	9.7	10.3	9.7	9.6
2	49.0	49.6	49.5	50.0	49.0	46.4
3	21.2	22.0	21.6	20.2	20.8	21.0
4	5.7	4.4	5.2	5.2	6.5	6.9
5	1.0	0.3	0.6	0.6	0.8	1.9
6	0.3	0.0	0.2	0.1	0.0	0.6
7	0.1	0.0	0.0	0.0	0.0	0.3
8	0.0	0.0	0.0	0.0	0.0	0.1
Total	100.0	100.0	100.0	100.0	100.0	100.0

*Source: Authors' calculations.*

Looking at the average number of connections at the country level over the whole period of time as reported in Table 2 (left quadrant) we observe that this characteristic is actually common to several large advanced economies. Indeed, Great Britain is the country with the smallest average number of transshipments, followed by France, Belgium, Germany and three other EU countries. This ranking could be the result of a strong intra-EU trade effect. Nevertheless even when trade relationships with other EU members are not included those European countries stay amongst the top ten country list. The other top fifteen countries are the USA and seven East Asian countries. There is again clear intra-regional effect within the latter group of countries.

The right quadrant of Table 2 contains the corresponding bottom fifteen countries. The geographical composition is more heterogeneous and all continents are represented. The bottom list is not only made of landlocked countries and small island states.

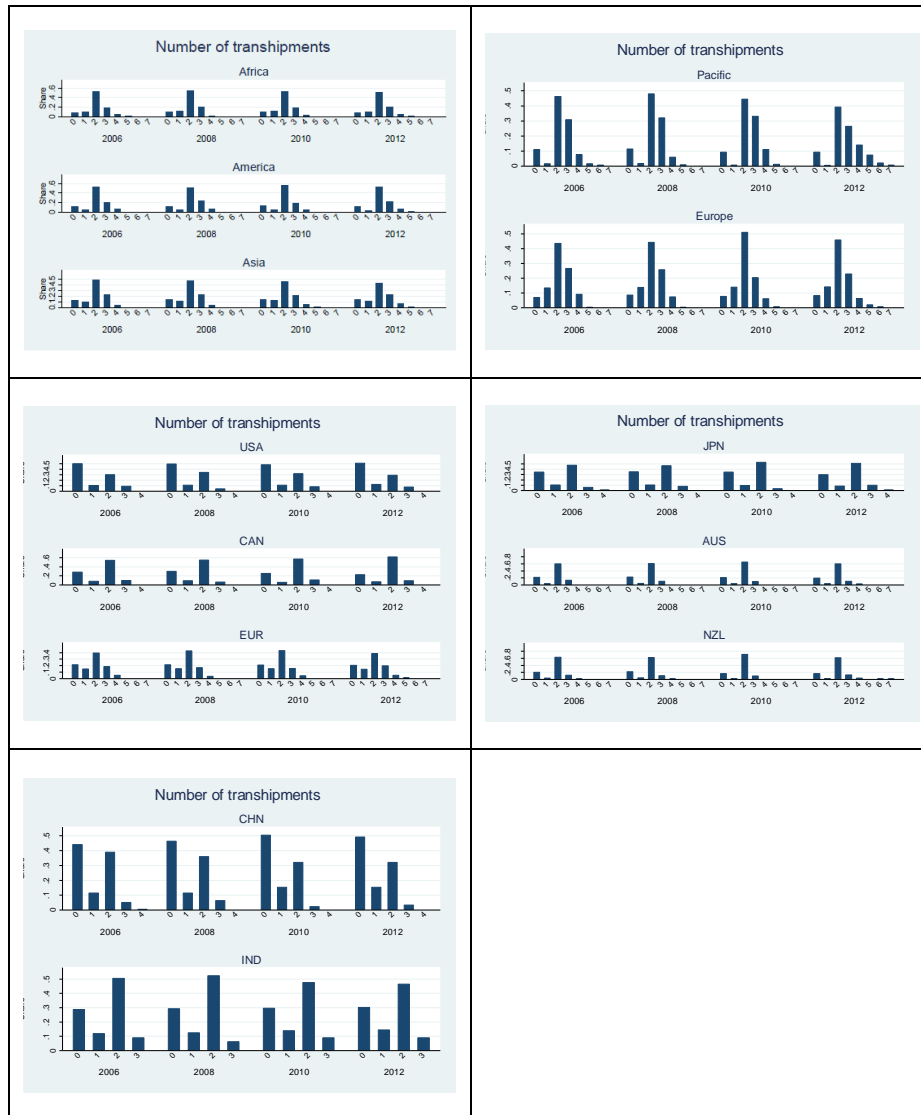
**Table 2. Top and Bottom Fifteen Countries:  
average number of Transshipments**

Top 15	Mean	Bottom 15	Mean
GBR	0.73	RWA	3.15
FRA	0.79	MWI	3.15
BEL	0.84	ZMB	3.15
DEU	0.87	BOL	3.16
NLD	0.88	ISL	3.16
ITA	0.92	TKM	3.20
ESP	0.93	NER	3.20
CHN, HKG SAR	0.95	BLZ	3.23
CHN	0.97	SVK	3.31
USA	0.98	HUN	3.31
KOR	1.07	BLR	3.32
MYS	1.11	NRU	3.42
SGP	1.13	MLI	3.53
CHN, TWN	1.19	MDA	3.62
Prov. of			
JPN	1.29	ARM	4.10

Table 4 and Table 5 report the top and bottom ten countries respectively in terms of number of direct connections. As far as the top countries are concerned figures do confirm what was shown in the previous table. Great Britain enjoys the largest number of direct connections in all four years reported despite the fact that between 2006 and 2012 it has lost 10 percent of them. No general trend pops up. Some countries have seen the number of direct connections increasing others have seen it decreasing (e.g. Great Britain). The group composition has only marginally changed over the period with the exit of Italy on one hand and

the entry of Malaysia on the other end. This is somehow in contrast with the bottom ten country group. Only five countries stayed in the latter group over the whole period.

**Figure 1. Number of Transshipments by Country/ Country-Groups**



*Source: Authors' calculations.*

A noticeable fact is the significant decrease after 2008 in the number of direct connections enjoyed by the group of the top ten. This could be clearly seen as a consequence of the collapse of world demand in the aftermath of the finan-



cial crisis started at the end of the year 2007. Counting the number of connections with a maximum of two transshipments generates slightly different results at both the top and the bottom of the country ranking. As shown in Table 3 economies such as Singapore, Brazil, Egypt, Taiwan (Republic of China) and Portugal, appear at least once amongst the list of the top ten. The composition of the worst performer country group varies quite significantly over the period as shown in Table 6. In addition, many of these countries were not in the bottom group when considering the number of direct connections. The maximum number of connexions is observed for Great Britain in 2006 and equals 177. The lowest number of connexions is observed for Nauru in 2010 and equals 29.

**Table 4. Top ten connected countries (selected years):  
number of direct connections**

2006		2008		2010		2012	
GBR	10	GBR	10	GBR	9	GBR	9
BEL	98	FRA	99	FRA	9	FRA	9
FRA	96	BEL	97	BEL	9	USA	9
DEU	93	DEU	96	CHN, HKG	8	NLD	8
USA	90	ESP	91	CHN	8	BEL	8
ESP	89	ITA	90	USA	8	CHN	8
NLD	89	USA	89	NLD	8	CHN, HKG	8
ITA	84	NLD	87	DEU	8	ESP	8
CHN, HKG	82	CHN	81	ITA	7	MYS	8
CHN	77	CHN, HKG	81	ESP	7	DEU	8

*Source: Authors' calculations.*

**Table 5. Bottom ten connected countries (selected years):  
number of direct connections**

2006		2008		2010		2012	
NRU	1	NRU	1	ALB	1	ALB	1
ALB	1	IRQ	2	MMR	2	QAT	2
MMR	2	QAT	2	IRQ	3	MMR	2
BHR	3	PLW	3	QAT	3	IRQ	3
IRQ	4	SOM	3	NRU	3	BRN	3
QAT	4	BHR	3	MDV	4	NRU	3
PLW	4	ALB	3	BGD	5	BGD	4
BLZ	4	KWT	4	PLW	5	MDV	4
BRN	4	SYC	4	SOM	6	PLW	5
KWT	4	BGD	4	BRN	6	SOM	6

*Source: Authors' calculations.*

As a general comment, we have that allowing for two transshipments considerably increases the number of reachable destinations especially for the most remote economies such as Albania and Nauru. In the former case this is explained by the proximity of an extremely well connected country such as Italy, which acts as a transit export platform. Nauru, despite an exponential increase of potential connections, remains the most remote economy.

**Table 5. Top ten connected countries (selected years):  
number of connections with a maximum of two transhipments**

2006		2008		2010		2012	
GBR	1	ESP	1	ESP	1	GBR	1
ESP	1	GBR	1	GBR	1	NLD	1
NLD	1	NLD	1	NLD	1	CHN,	1
ITA	1	BEL	1	BEL	1	MYS	1
BEL	1	FRA	1	PRT	1	KOR	1
FRA	1	ITA	1	FRA	1	FRA	1
CHN, TWN	1	DEU	1	BRA	1	ESP	1
DEU	1	CHN,	1	KOR	1	CHN,	1
CHN, HKG	1	PRT	1	CHN,	1	BEL	1
SGP	1	CHN,	1	EGY	1	DEU	1

*Source: Authors' calculations.*

**Table 6. Bottom ten connected countries (selected years):  
number of connections with a maximum of two transhipments**

2006		2008		2010		2012	
BLZ	34	NRU	41	NRU	29	NRU	30
NRU	36	BLZ	41	ARM	34	LTU	32
COD	38	ISL	41	IRQ	39	ISL	33
LVA	49	IRQ	44	GEO	42	EST	33
ISL	49	LVA	45	LTU	45	LVA	36
SUR	50	SUR	49	LVA	46	SLV	36
SOM	51	GUY	49	EST	47	ARM	36
ARM	54	SYC	52	ISL	47	NIC	38
MDV	57	SOM	54	PLW	48	ABW	39
GUY	59	HTI	56	BLZ	51	PLW	42

*Source: Authors' calculations.*

### 3.2. Sea and Maritime Distances

Maritime distance is an estimated sea distance. It is obtained by summing sea distances on all sea transport sections between two countries. When the connection is direct, maritime and sea distances perfectly coincide.

Table 7 and Table 8 contain some basic statistics qualifying estimated maritime distances for several countries or geographical groups of countries. Not surprisingly, countries in the Pacific region are characterized by the largest mean and median values of maritime distance. Together with the fact that countries in the region, including Australia and New-Zealand, do not rank very well in terms of average number of transhipments per connection, it makes the Pacific region the most remote one. On the other extreme of the distribution stand the USA, CAN and European countries. This corroborates previous results on the average number of transhipments per connection. As a consequence, the latter countries appear to be at the core of maritime connections. The Africa group statistics are comparable to those of the European Union although African countries do not present any comparable performance in terms of number of transhipments per connection.

Changes over the 2006-20012 period have not been dramatic in most cases. The largest ones are observed for countries in the Pacific region and for Asian countries.

**Table 7. Maritime Distance (estimated): 2006**

	Mean	Median	SD	CV	max	min
AUS	16464	16709	6089	0.37	26973	1985
Africa	10822	10060	5678	0.52	30843	141
America	12526	12203	6220	0.50	31636	117
Asia	12302	12114	5989	0.49	29228	143
CAN	9778	9834	4141	0.42	25148	1141
CHN	14575	15668	5361	0.37	22243	896
EUR	10455	9643	6107	0.58	32332	85
Europe	10004	9877	5685	0.57	28313	256
IND	10899	11119	5712	0.52	24746	941
JPN	15017	15972	5801	0.39	24007	1241
NZL	16899	17074	6010	0.36	28423	2280
Pacific	17551	18614	6817	0.39	33054	152
USA	9685	9688	4692	0.48	26197	165
Total	11926	11303	6276	0.53	33054	85

*Source: Authors' calculations.*

**Table 8. Maritime Distance (estimated): 2012**

	Mean	Median	SD	CV	Max	Min
AUS	16232	16281	5950	0.37	27254	1985
Africa	10974	10358	5673	0.52	31178	141
America	12588	12523	6144	0.49	30262	117
Asia	11796	11497	5863	0.50	30017	143
CAN	9883	10127	4117	0.42	21152	1141
CHN	14441	15709	5365	0.37	22031	896
EUR	10315	9505	6134	0.59	32493	85
Europe	9883	9584	5663	0.57	32232	256
IND	10965	11025	5873	0.54	24461	941
JPN	15288	15907	6158	0.40	25374	1241
NZL	17531	17438	6611	0.38	29515	2280
Pacific	16275	16900	6267	0.39	29921	152
USA	9451	9173	4487	0.47	21630	165
Total	11761	11219	6132	0.52	32493	85

*Source: Authors' calculations.*

Average maritime distance for the Pacific region has fallen by more than seven percent and median maritime distance by about nine percent. Average and median maritime distance for the Asian countries group fell by about 5 percent.

Overall, this trend can be considered positive. Although the number of direct connections has decreased for many countries, a geographically wider distribution of major transshipment ports has improved the options to connect trading partners with transshipments implying a lower distance to be travelled by the traded container – albeit also requiring a larger number of transshipments.

The financial crisis of 2008 despite its exceptional impact on overall aggregate demand and trade does not seem to have deeply affected maritime distances. This may come at a surprise considering the figures on the average number of transshipments reviewed previously. A clear exception is New Zealand, whose mean and median maritime distance have increased by more than 8 percent between 2008 and 2010 and have only marginally decrease since then.

**Table 9. Variations in Estimated Maritime Distances and Number of Transshipments**

	Variation	Maritime Distance (%)	Number of Transshipments (%)
2006-2012	>0	15	12.2
	<0	16	10.2
2006-2008	>0	13.5	8
	<0	14.4	12.3
2008-2010	>0	14	11.3
	<0	17	9.5
2010-2012	>0	13	13
	<0	12.6	7

*Source: Authors' calculations.*

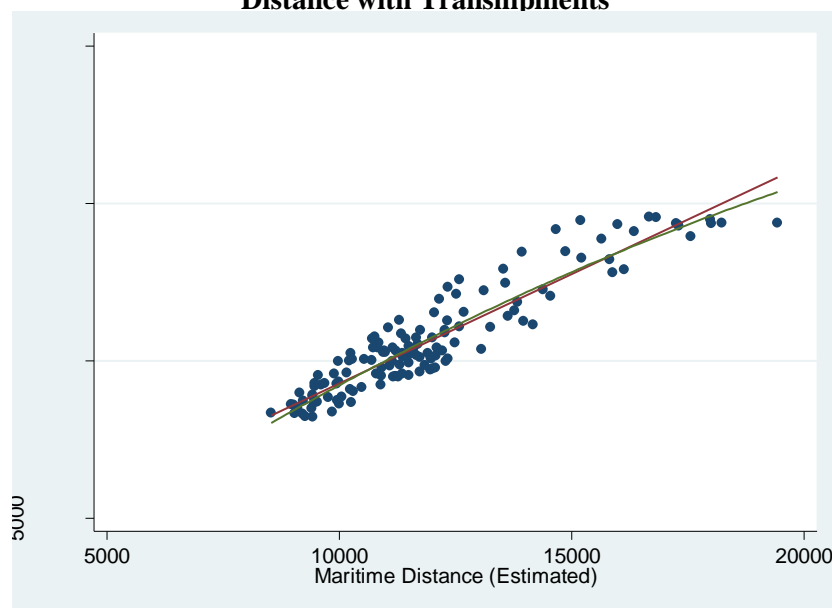
Looking at some details of variations in maritime distances and transshipments as reported in Table 9, however, reveals features consistent to a large extent with the series' average behaviour. Over the whole period under investigation, 30 percent of connections have varied in terms of maritime distance. Among these 30 percent, half of them lengthened and half of them shortened. Surprisingly enough the biennium following the financial crisis has been marked by a large share of shortened connections. Looking at the number of transshipments, about 22 percent of connections have varied over the 2006-2012 period. The number of transshipments necessary to connect two countries has increased for 12 percent of connections and has decreased for about 10 percent of them. The post financial crisis period has been characterized by an increasing share of connections necessitating a larger number of transshipments.

The direct sea-distance and the shortest connection distance with transshipment are by nature strongly correlated. The maritime distance with transshipments, however, tends to increase with respect to sea distance as the latter increases. The further away two countries are from each-other, the more likely it is that they need more transshipments to trade with each-other, and each transshipment implies some deviation from the shortest (direct) route. Figure 2 reproduces this relationship for a selection of years (left quadrant) and regions (right quadrant), which include the whole set of composing countries. The relationship appears to be relatively stable during the period under observation. The

pre-crisis period is characterized to some extent by larger maximum maritime distances than the post-crisis period. Turning to regional relationships some salient facts emerge. Sample means are indicated by vertical and horizontal dashed lines and the red curve connect fitted values based on a quadratic approximation. Pacific countries were found to be characterized by relatively large maritime distance. As shown in Figure 2 this is a consequence of essentially larger sea distances from most trade partners. As far as American countries are concerned the quadratic fit is almost a linear fit. This is to a large extent the reflection of a large number of direct connections to the USA, the geographical configuration of the continent and the existence of the Panama channel.

Note that the whole set of relationships between direct sea distance and maritime distances with transshipments presented above remain similar whether we include or not those country pairs with a direct maritime connection. In the latter case as mentioned previously the two distances by definition coincide.

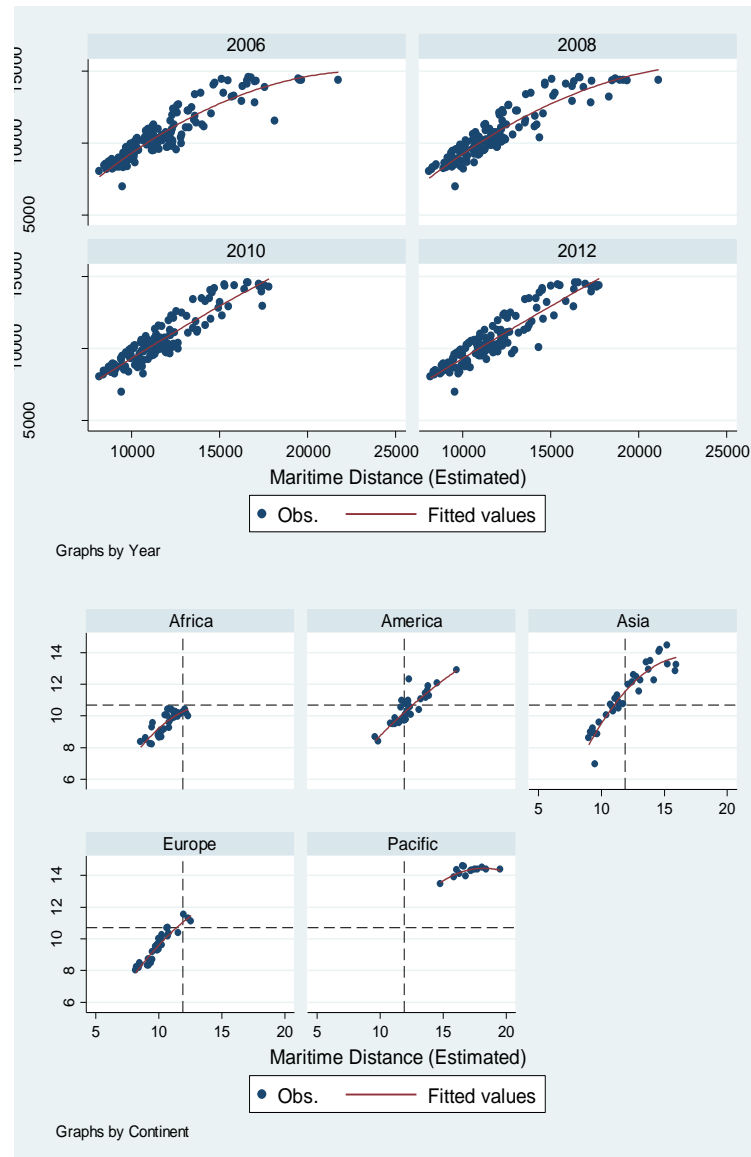
**Figure 2. Direct Sea Distance and Maritime (Estimated) Distance with Transshipments**



Source: Authors Calculations. Legend: The red line represents the linear fit of the relationship and the green line its quadratic fit.

The question of whether maritime distances with transshipment and the associated number of transshipments are correlated does not have an obvious answer. The linear and quadratic fit lines reported in Figure 4 both suggest that the two measures are only weakly correlated. The right quadrant reports similar fits when all direct connections are excluded. Even with that sub-sample the two distance measures remain only weakly correlated.

**Figure 3. Direct Sea Distance and Maritime (Estimated) Distance**



*Source: Authors Calculations. Legend: The red line represents the quadratic fit of the relationship.*

This result suggests that distance as such may not fully reflect the incidence of transport costs and it may have to be considered together with the number of transshipments in assessing the impact of transport costs on bilateral exchanges.

**Figure 4. Maritime Distance (Estimated) and Number of Transhipments (Country Averages)**



Source: Authors Calculations. Legend: The red line represents the linear fit of the relationship and the green line its quadratic fit.

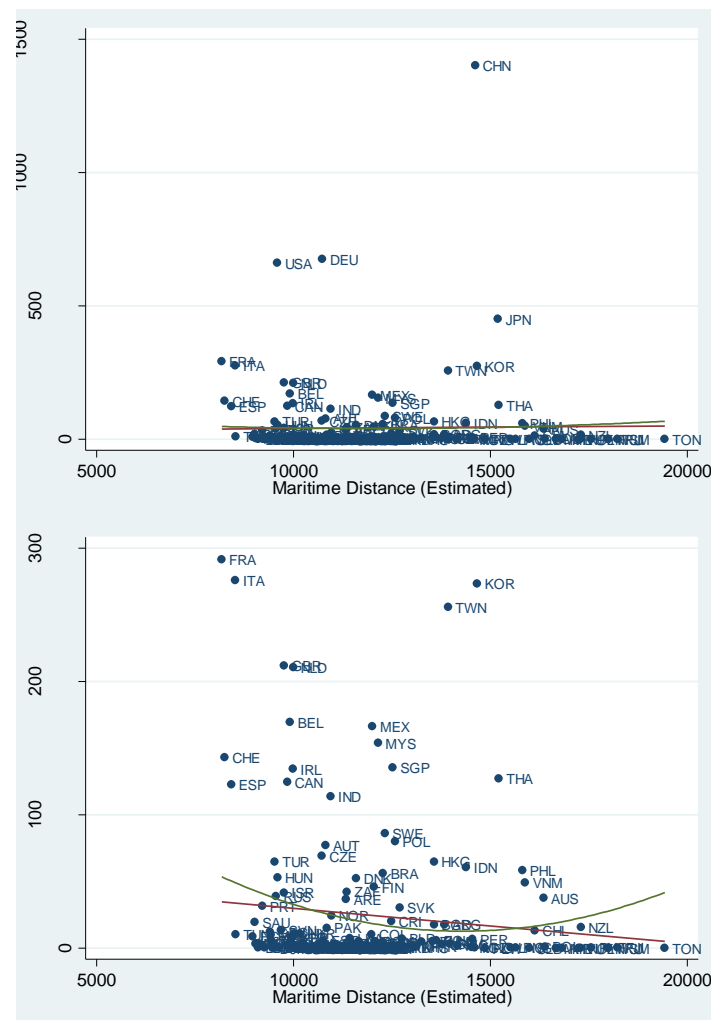
### 3.3. Trade, Maritime Distance and Transhipments

In the absence of extensive estimates of transport costs, distance has been used to proxy the latter. However, previous results revealed that additional information on maritime transport costs may be contained in the counting of transhipments necessary to move containers between any pair of countries.

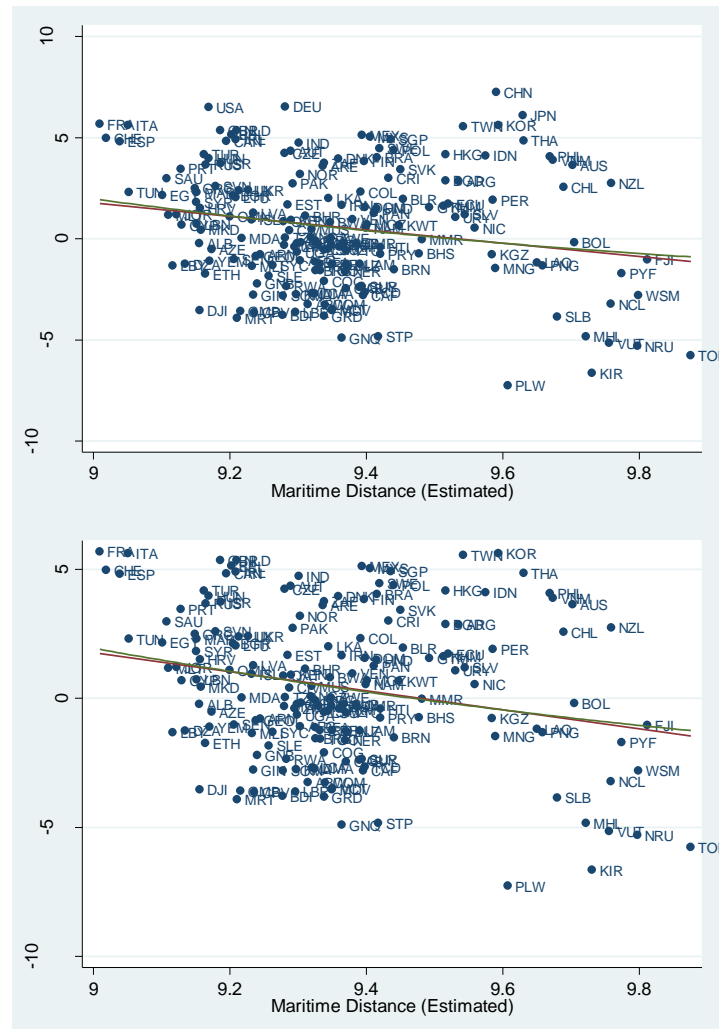
***The intensive margin of trade***

Figure 5 shows a scatter between total containerizable exports (period average) and the estimated average maritime distance. The left quadrant refers to the whole sample while the right quadrant refers to a sample without China, the USA, Japan and Germany. In the former case the unconditional relationship between exports and maritime distance appears to be positive although close to zero. When excluding the largest exporting countries, the unconditional relationship turns to be negative, as expected.

**Figure 5. Containerizable Exports and Maritime Distance (Estimated) for Liner Shipping Connections**







Source: Authors Calculations. Legend: Values in upper quadrants are in levels and values in lower quadrants are in natural logs. The red line represents the linear fit of the relationship and the green line its quadratic fit.

On the contrary, direct connections are likely to be positively associated with exports. Figure 7 reports the relationship between direct connections and containerizable exports. The association is clearly positive, at no surprise. Once again, the relationship does not seem to be driven by outliers. It remains clearly positive even after outliers such as the largest exporters are excluded from the sample (right quadrant).

Figure 6 illustrates the relationship between total containerizable exports and the number of transhipments. Whether we include (left quadrant) or not (right quadrant) the largest exporters the unconditional relationship is clearly negative.

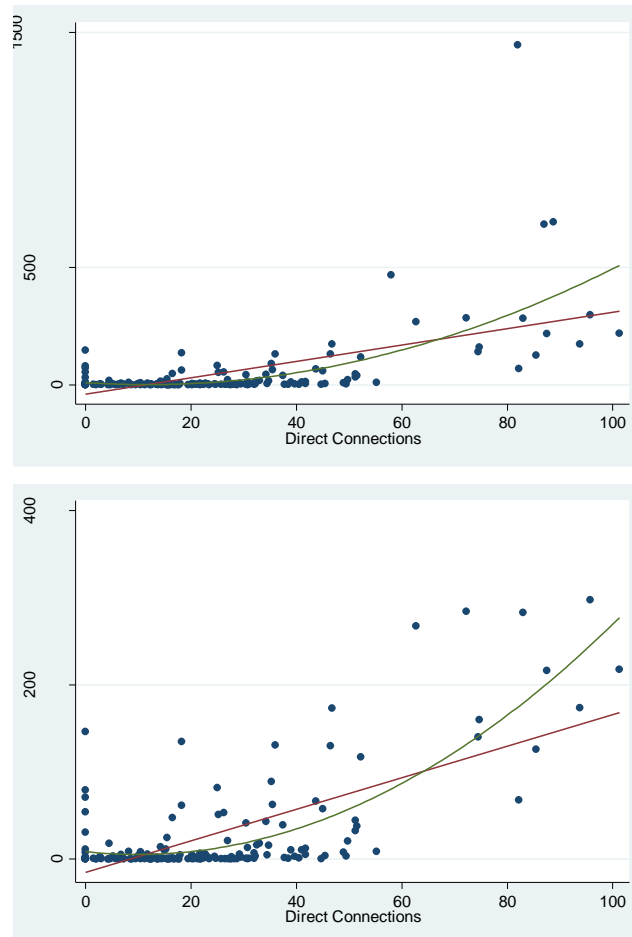
In other words, bilateral trade tends to decrease with the number of transshipments. Or, put differently, the direct connections tend to increase if demand (trade in containerizable goods) so requires.

On the contrary, direct connections are likely to be positively associated with exports. Figure 7 reports the relationship between direct connections and containerizable exports. The association is clearly positive, at no surprise. Once again, the relationship does not seem to be driven by outliers. It remains clearly positive even after outliers such as the largest exporters are excluded from the sample (right quadrant).

**Figure 6. Containerizable Exports and Number of Transshipments**



Source: Authors Calculations. Legend: The red line represents the linear fit of the relationship and the green line its quadratic fit.

**Figure 7. Containerizable Exports and Direct Connections**

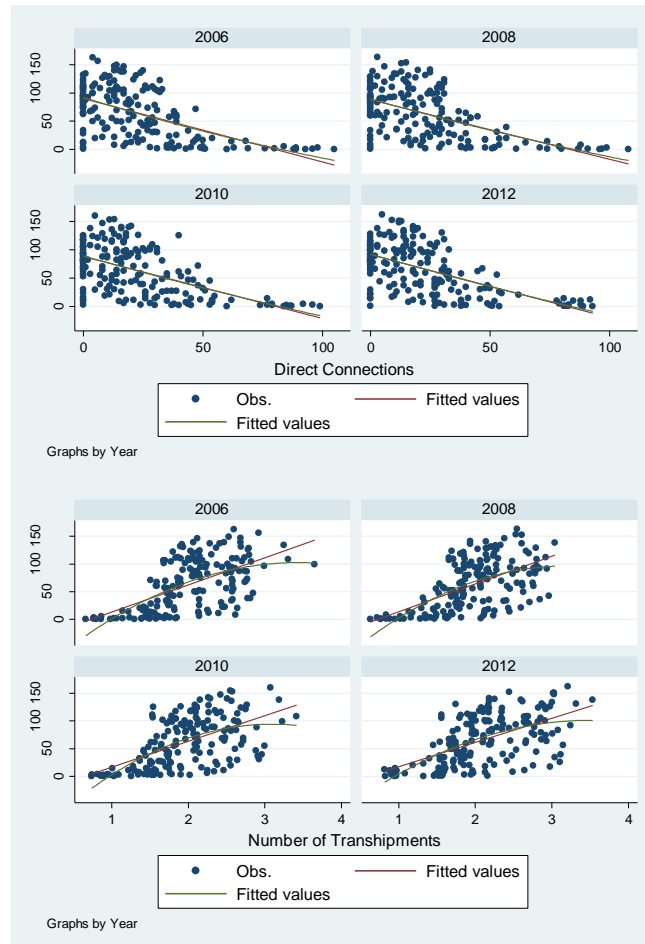
Source: Authors Calculations. Legend: The red line represents the linear fit of the relationship and the green line its quadratic fit.

### ***The extensive margin of trade***

Previous graphs were focused on active trade relationships. However, about one third of containerizable trade flows amongst countries in our sample are zero. Transports costs and their connectivity component may be good predictors of trade patterns at its extensive margin. This is visible through Figure 8. The number of direct connections does affect the incidence of zero trade (left quadrant). Countries characterized by a larger number of direct connections show a smaller number of zero trade flows. The right quadrant of Figure 8 reveals that as the average number of transshipments necessary to connect to any country increases, the incidence of zero trade flows also increases. Without talking

about causality, the creation of direct connections could help remote economies promoting their exports.

**Figure 8. Zero Trade and Maritime Connectivity**



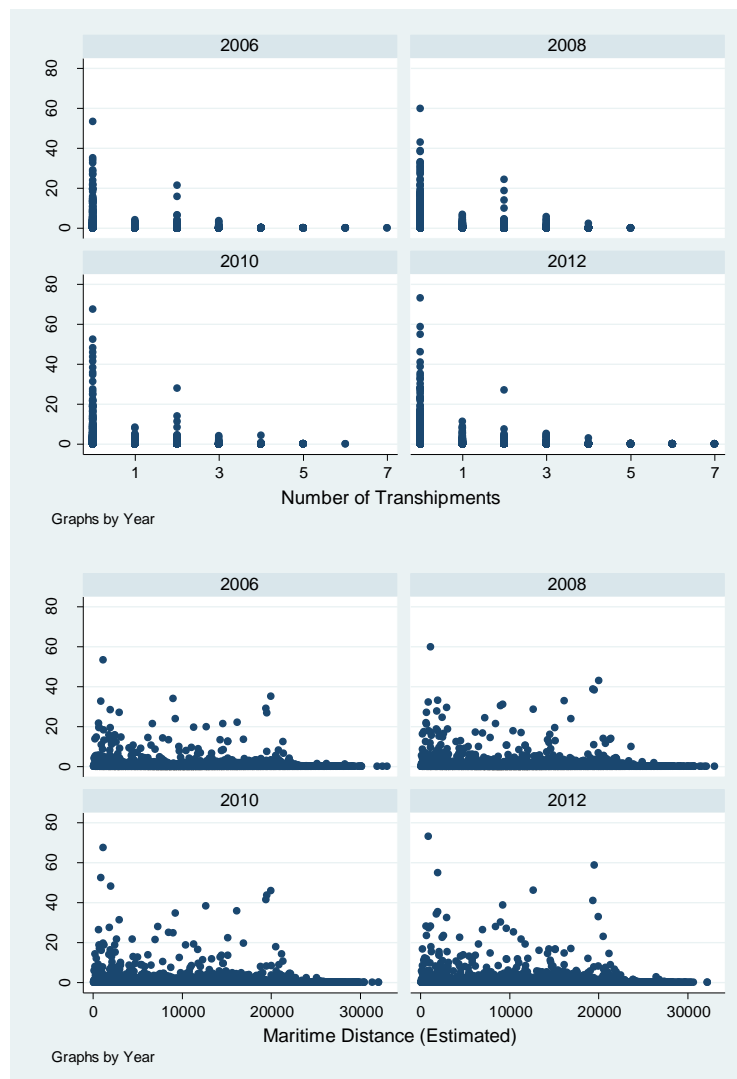
*Source: Authors Calculations. Legend: The red line represents the linear fit of the relationship and the green line its quadratic fit.*

### **Trade Imbalances**

About 20 percent of trade relationships are unilateral. This means that for about 20 percent of the country pairs represented in the data, a zero containerizable trade flow in one direction is associated with a positive trade flow in the opposite direction. This is an extreme illustration of asymmetric trade flows. However, all bilateral trade flows are asymmetric to some extent. Figure 9 reports for a selection of years the relationship between a measure of country pair trade unbalance, the number of transshipments to connect the country pair and

the corresponding maritime distance, respectively. Trade imbalances are measures by the absolute value of the difference (absolute) between the two trade flows. Nothing really significant comes out of a basic graphical analysis. If at all related, the relationship could be only slightly negative. Trade imbalances would tend to diminish as the number of transshipments and the maritime distance increase.

**Figure 9. Trade Imbalances and Connectivity**



Source: Authors Calculations. Legend: The red line represents the linear fit of the relationship and the green line its quadratic fit.

#### 4. APPLICATIONS AND FUTURE RESEARCH

Despite the importance of trade costs as drivers of the geographical pattern of economic activity, global value chains, and of exchanges of merchandise goods between countries, most contributions to their understanding remain piecemeal.

Traditionally sea distance is assumed to be among the main determinants of freight rates and thus also of the trade competitiveness of countries. Wilmsmeier and Hoffmann (2008) findings based on a sample of 189 freight rates of one company for the Caribbean, confirms to some extent the general positive correlation between distance and freight rates. However, sea distance explains only one-fifth of the variance of the freight rate. Other possible determinants of trade competitiveness are transport connectivity, defined as the access to regular and frequent transport services and the level of competition in the service supply. The typical basic set of variables to account for transport costs are sea (maritime) distance, various aspects of liner shipping connectivity, trade balance of containerizable goods, various aspects of port infrastructure endowment and the countries' general level of development. As mentioned previously Wilmsmeier and Hoffmann (2008) results also show that trade routes with only indirect services (i.e. including transshipments) induce higher transport costs. Unconditional correlations between our two measures and trade of containerizable goods presented in the previous section appear to be supportive of such conclusions.

In this context, the definition of the number of transshipments necessary to connect any country pair and the computation of the corresponding effective maritime distance for a sample of 178 countries during 6 years is a clear contribution to the empirics of trade. Our two variables could be of immediate use in the analysis of transport costs and their implications for bilateral trade. However, a clear causal relationship may be difficult to identify as there are most probably serious endogeneity issues related to either reverse causality or variable or both. A companion paper, Fugazza (2014), presents the first assessment of the impact of the nature of maritime connections on bilateral exports of containerizable goods using the dataset described above. Estimates suggest that the absence of a direct connection is associated with a drop in exports value varying between 42 and 55 per cent depending on the underlying empirical specification. Results also indicate that any additional transshipment is associated with a drop in exports value varying between 20 and 25 per cent. These results corroborate the fact that the quality of maritime connectivity is likely to be a preponderant determinant of foreign market access.

Connectivity has become an increasingly popular research project. However, a clearly established bilateral connectivity index for shipping is still missing. Our two variables can contribute to the establishment of such an index. The latter could be based on the combination of our two constructed variables and of some liner shipping connectivity aspects. This procedure is in line with a recent tentative index building on UNCTAD's country-level Liner Shipping Connectivity Index (LSCI) and would be called LSBCI (Liner Shipping Bilateral Connectivity Index). Generally speaking, four sets of components should be consid-

ered for the development of a bilateral index. First, the number of companies providing direct services between two countries should be represented. A simple version of this component would be a dummy variable which assumes the value 1 if a direct service exists at all, and 0 if not. A more “sophisticated” version would include the number of transshipments necessary to connect any pair of countries as computed in this paper. Second, the number of common connections between any country A and any country B should also be included. A simple version of this component would be a dummy variable which assumes the value 1 if exists an option to connect the two countries with one transshipment, and 0 if not. By the same token, the number of second level connections could be generated, i.e. how many options there are to get from country A to country B with two transshipments. Third, combinations of both countries’ LSCI, such as the product, or the geometric average of both countries’ index should be considered. The LSCI already includes 5 components, notably the number of ships, their TEU capacity, the size of the largest ship, the number of companies and the number of services. Finally, data on vessel deployment with transshipment options included should be used. Even for pairs of countries without a direct connection, it is possible to generate what are the “best” connections between them under specific criteria, such as the number of companies in the market or the largest ships deployed on the different legs of a connection with one or more transshipments. This represents an immediate application of the algorithm developed previously with an additional a “cost” reference. Instead of considering exclusively the sea distance, we would also consider the number of companies or the largest vessel size deployed in identifying the shortest path. The development of the country-level Liner Shipping Connectivity Index (LSCI) has shown to be useful for policy makers and researchers. It can help to illustrate trends in a country’s connectivity to the global liner shipping network. The development a similar type of index for pairs of countries would certainly enlarge the scope of the country level LSCI.

## REFERENCES

- Anderson, J., van Wincoop E., 2003, "Gravity with gravitas: a solution to the border puzzle", *American Economic Review*, 93, 170-192.
- Arvis J.-F., Shepherd B., 2011, "The air connectivity index: measuring integration in the global air transport network", *Policy Research Working Paper 5722*, The World Bank.
- Arvis J.-F., Shepherd B., Duval Y., Utoktham C., 2013, Trade costs and development: a new data set, *Economic Premise* (104), <http://siteresources.worldbank.org/EXTPREMNET/Resources/EP104.pdf>
- Baier S. L., Bergstrand J. H., 2001, "The growth of world trade: tariffs, transport costs, and income similarity" *Journal of International Economics*, 53(1), 1-27.
- Bernhofen D.M., El-Sahli Z., Kneller R., 2013, "Estimating the effects of the container revolution on world trade", CESifo Working Papers No. 4136. CESifo, Center for Economic Studies and Ifo Institute.
- Clark X., Dollar D., Micco A., 2004, "Port efficiency, maritime transport costs, and bilateral trade", *Journal of Development Economics*, 75(2), 417-450.

- Dijkstra E. W., 1959, "A note on two problems in connexion with graphs", *Numerische Mathematik*, 1, 269-271.
- Djankov S., Freund C., Pham C. S., 2010, "Trading on time", *Review of Economics and Statistics*, 92(1), 166-73.
- The Economist, 2013, The humble hero, 18 May issue.
- Fugazza, M., 2014, "Maritime connectivity and trade", Policy Issues in International Trade and Commodities Research Study Series No. 70, UNCTAD.
- Hoffmann J., 2012, "Corridors of the sea: an investigation into liner shipping connectivity", Les Corridors de Transport, Les océanides.
- Hummels D., Schaur G., 2012, "Time as a trade barrier", *NBER Working Paper* 17758, January 2012, <http://www.nber.org/papers/w17758.pdf>.
- Hummels, D., Lugovsky, V., 2006, "Are matched partner trade statistics a usable measure of transportation costs?", *Review of International Economics*, 14(1), 69-86.
- Jacks D., Meissner C., Novy D., 2011, "Trade booms, trade busts, and trade costs", *Journal of International Economics*, 83(2), 185-201.
- UNCTAD, 2008, *Transport Newsletter* #38, March 2008. [http://www.unctad.org/en/docs/sdtetlbmisc20081\\_en.pdf](http://www.unctad.org/en/docs/sdtetlbmisc20081_en.pdf).
- UNCTAD, 2013, *Review of Maritime Transport 2013*. Geneva: United Nations. <http://www.unctad.org/rmt>.
- Wilmsmeier G., Hoffmann J., 2008, "Liner shipping connectivity and port infrastructure as determinants of freight rates in the Caribbean", *Maritime Economics & Logistics*, 130-151.

### CONSTRUCTION D'UNE BASE DE DONNÉES SUR LA CONNECTIVITÉ MARITIME BILATÉRALE

**Résumé** - Cet article présente une base de données répertoriant les itinéraires maritimes les plus courts pour le transport de conteneurs entre paire de pays. L'échantillon de référence est constitué de 178 pays et couvre la période 2006-2012. Les distances maritimes sont calculées à partir d'une base de données originale comprenant toutes les connexions maritimes de ligne directes entre paires de pays ainsi que la distance maritime correspondante. Le nombre de transbordements nécessaires à la connexion de toute paire de pays est également calculé. L'intérêt de cette base de données est triple. Premièrement, elle permet une meilleure appréciation des coûts de transport et de l'accès aux services réguliers de transport en conteneurs en tant que déterminants du commerce bilatéral de produits conteneurisables. Deuxièmement, elle permet une description et une analyse plus fines du réseau mondial des services de transport maritime de ligne pour les produits en conteneur, qui sont essentiellement des produits manufacturés. Enfin, notre base de données devrait faciliter la construction d'un indice de connectivité maritime bilatérale.

**Mots-clés** - TRANSPORT MARITIME, COÛTS D'ÉCHANGE, COMMERCE CONTENEURISABLE, DISTANCE MARITIME