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Measuring the Pollution Terms of Trade with Technique Effects*

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Abstract

The pollution terms of trade (PTT) index first introduced and estimated by Antweiler (1996) allows to identify if trade-embodied emissions are on average larger in exports than in imports. His empirical results were based on the trade-composition (between-sector) part of the PTT and revealed rather paradoxically that exports of rich countries were on average dirtier than their imports. Using a new database on SO₂ manufacturing emissions that includes variation of emission intensities across countries, sectors and over time, this paper extends the earlier work by identifying two additional effects: the between-country and the technique effect. As it turns out, these two effects run opposite to the between-sector effect, and more than compensate it. Hence, the overall pattern is that high income countries tend to have lower PTT indices, meaning that their exports are cleaner than their imports, while in low income countries the reverse is observed.

Keywords: international trade, environment, pollution terms of trade
JEL Classification: F18, Q56

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1. Introduction

What is the pollution content of export and import flows? Do countries gain or lose from trade in polluting products? Antweiler (1996) proposed a simple, yet novel and rigorous approach to address these issues by defining the pollution terms of trade (PTT) index as the ratio between the average pollution content per dollar of exports and the average pollution content per dollar of imports. This index controls for trade imbalances and takes input-output relationships into account. In an era of globalization, one would expect dirty industries to locate preferentially in poor countries, where environmental protection is weaker. According to this “pollution-haven” pattern (e.g. Copeland and Taylor (2003)), rich (poor) countries would tend to exhibit a PTT index lower (larger) than 1 and would therefore experiment environmental gains (losses) from international trade. The empirical evidence reported by Antweiler's original application, which is based on a large range of pollutants (CO₂, SO₂, NO₂, lead, particulate matter, volatile organic compounds), came to the reverse conclusion, namely that most pollution-havens were in fact rich economies. As already discussed by Antweiler himself, a possible reason for this rather paradoxical result could come from data limitation. Indeed, because of lack of available data, he had to rely on US technological parameters, and apply them universally, as if there were no technological differences across countries. Relying on his own words the original PTT was only capturing the "trade-composition" part of PTT variation, not the "technological" part. Since then, although the calculation of input-output based embodied emissions has been burgeoning, there has been to our knowledge no systematic attempt to reconsider the issue of PTT estimates at the world-wide level.

This paper proposes to revisit PTT calculations, relying on the original analytical framework set by Antweiler (1996) and exploiting the largest possible set of newly available data for empirical evidence. The methodology is directly borrowed from Antweiler (1996), the basic difference being that, as we include time variation into the analysis, we present a decomposition of the PTT index into three components: a between-sector, a between-country, and a technique effect. The first effect corresponds to the "trade-composition" index measured by Antweiler, while the other two effects are simple correction terms that reflect technological differences across countries and over time. Regarding empirics, the sample period is 1990-2000 with a good coverage (62 developed and developing economies), and a particular care has been given to capturing technological heterogeneity. Trade and country-specific input-

output tables are taken from the Trade Production and Protection database of the World Bank (Nicita and Olarreaga, 2007), while country and time-specific polluting manufacturing emission intensities come from the recent database elaborated by Grether, Mathys and de Melo (2009). This allows to estimating each one of the three effects governing variations of the PTT index, but this time for a single pollutant: sulphur dioxide (SO₂). We also impose the consistency between trade and input-output data, and propose an original approach to control for reexports, which may bias trade-embodied emissions calculations in the presence of technological differences across countries. As it turns out, the new empirical evidence reverses the pattern observed by Antweiler, and confirms the importance of including the newly computed correction terms.

The next section outlines the theoretical derivation of the PTT index and discusses its properties. Section 3 shortly describes the data while section 4 reports the main results. Section 5 discusses robustness checks and alternative interpretations of the results, and the last section concludes.

2. Methodology

2.1 Between-country, between-sector and technical effects

Following Antweiler (1996), define I as the total number of industries. Then, for each country and year, the output vector, $Q_{[I \times 1]}$, is given by the usual expression,

$Q = BQ + D = (\tilde{I} - B)^{-1} D$, where $B_{[I \times I]}$ is the intermediate input coefficient matrix, $D_{[I \times 1]}$ is final demand and $\tilde{I}_{[I \times I]}$ is the identity matrix. Total SO₂ emissions embodied in a given final demand vector are given by: $PQ = P(\tilde{I} - B)^{-1} D = AD$, where $P_{[1 \times I]}$ is the vector of direct emission intensities (in kilos per US dollar) and $A_{[1 \times I]} = P(\tilde{I} - B)^{-1}$ is the vector of total emission intensities including input-output relationships.

Using c as a country index and t as time index, the pollution content per dollar of exports is given by:

$$F_{ct}^X = \frac{A_{ct} X_{ct}}{j_I' X_{ct}} \quad (1)$$

where $X_{ct[1 \times I]}$ is the export vector of country c at year t and j_I' is a unit vector $j_I' = [1, 1, \dots, 1]$.

Similarly the pollution content per dollar of imports is given by:

$$F_{ct}^M = \frac{\sum_{j \neq c} (A_{jt} M_{cjt})}{j_I' M_{ct}} \quad (2)$$

where $M_{jct[1 \times I]}$ is the vector of imports of country c from country j at time t .

The pollution terms of trade (PTT) index is then given by the ratio between the pollution content per dollar of exports and the pollution content per dollar of imports:¹

$$\chi_{ct} = \frac{F_{ct}^X}{F_{ct}^M} \quad (3)$$

If the PTT is larger than one, this means that country c 's exports are more pollution intensive than its imports. The reverse is true if the PTT index is smaller than one.

The PTT index captures three different effects. It reflects compositional effects in trade flows both between sectors and between countries, and it reflects technological changes over time. Hence, equation (3) can be decomposed in these three effects:

$$\chi_{ct} = \tilde{\chi}_{ct} \bar{\chi}_{ct} \hat{\chi}_{ct} \quad (4)$$

¹ Antweiler (1996) has multiplied the index by 100 and was hence working with a benchmark of 100.

where $\tilde{\chi}_{ct} = \left[\frac{A_{US,90} X_{ct}}{j_I X_{ct}} \right] / \left[\frac{A_{US,90} M_{ct}}{j_I M_{ct}} \right]$ stands for the between sector effect,

$\bar{\chi}_{ct} = \left[\frac{A_{c,90} X_{ct}}{A_{US,90} X_{ct}} \right] / \left[\frac{\sum_{j \neq c} (A_{j,90} M_{cjt})}{A_{US,90} M_{ct}} \right]$ identifies the between country effect and

$\hat{\chi}_{ct} = \left[\frac{A_{ct} X_{ct}}{A_{c,90} X_{ct}} \right] / \left[\frac{\sum_{j \neq c} (A_{jt} M_{cjt})}{\sum_{j \neq c} (A_{j,90} M_{cjt})} \right]$ reflects the technical effect. One is left with the first part,

$\tilde{\chi}_C$, when country specific and time varying emission intensities are not available as this was the case in the Antweiler (1996) study.²

2.2 Environmental gains and losses from trade

At first sight, as χ_{ct} is defined as a ratio between two emission intensities, its name may seem slightly improper, as the concept of “terms of trade” usually refers to a ratio between two price indices. Note however that the traditional terms of trade can also be interpreted in terms of a ratio between two quantities, i.e. the amount of import units per dollar over the amount of export units per dollar. This is precisely how the PTT index is defined, although one should beware of three differences: (i) the physical quantities involved are kilos of emissions, not units of goods, (ii) imports of goods correspond to export of emissions (which occur at home rather than abroad) and (ii) contrary to goods, emissions are not desirable. This implies in particular that everything else equal, an increase in PTT decreases the environmental position of the country, as for each emission unit sent abroad (through imports of goods), the domestic increase in emissions (through exports of goods) becomes larger.

Following this line of reasoning, Antweiler noted that trade may become an instrument to redistribute environmental damage across countries, instead of eliminating it. In this zero-sum game, the gains for a given country (the emissions sent abroad through imports of goods) correspond to losses for the rest of the world (due to emissions embodied in the partners’s exports). To illustrate the relationship with the concept of PTT, let us define the *net environmental gain* for country c , NEG_{ct} , by the difference between import-embodied emissions and export-embodied ones. Using equations (1) and (2) one obtains:

² Note that the product of the between country and the technical effects here corresponds to the technical effect in the Antweiler (1996) paper.

$$NEG_{ct} \equiv \left(\sum_{j \neq c} A_{jt} M_{jct} \right) - (A_{ct} X_{ct}) = F_{ct}^M (j_I' M_{ct}) - F_{ct}^X (j_I' X_{ct}) \quad (5)$$

Next, let us define *world trade-embodied emissions* as WEE_t , noting that it can be obtained as either the sum of export-embodied ($\sum_c A_{ct} X_{ct}$) or the sum of import-embodied

($\sum_c \sum_{j \neq c} A_{jt} M_{jct}$) emissions. Using equation (3), it is straightforward to show that the net environmental gain for country c expressed as a percentage of world trade-embodied emissions is given by:

$$\frac{NEG_{ct}}{WEE_t} \equiv \theta_{ct}^M [1 - \chi_{ct} \rho_{ct}] = \theta_{ct}^X \left[\frac{1}{\chi_{ct} \rho_{ct}} - 1 \right] \quad (6)$$

where θ_{ct}^M (θ_{ct}^X) is the share of country c in import (export) embodied emissions

$$\left(\theta_{ct}^M \equiv \left(\sum_{j \neq c} A_{jt} M_{jct} \right) / (WEE_t), \theta_{ct}^X \equiv (A_{ct} X_{ct}) / (WEE_t) \right) \text{ and } \rho_{ct} \text{ is the export-import ratio } \\ \left(\rho_{ct} \equiv (j_I' X_{ct}) / (j_I' M_{ct}) \right).^3$$

Equation (6) illustrates the inverse relationship between the PTT index and the net environmental gains from trade. In a long-run situation where trade is balanced ($\rho_{ct} = 1$), $PTT = 1$ is the threshold above (below) which the country becomes an environmental loser (winner). The larger the deviation from the threshold, the larger the associated gain or loss, with extreme gains or losses bounded by the import or export shares (θ_{ct}^M or θ_{ct}^X). If trade is unbalanced ($\rho_{ct} \neq 1$), the same reasoning applies, except that a country may now gain because its imports have a larger value than its exports. Consequently the threshold for PTT becomes $1 / \rho_{ct}$.

³ Of course the simplest expression for (NEG_{ct}/WEE_{ct}) is $\theta_{ct}^M - \theta_{ct}^X$, which is equivalent to (6) as

$\chi_{ct} \rho_{ct} = \theta_{ct}^X / \theta_{ct}^M$. Although this alternative expression does not illustrate the link with PTT, it confirms that the sum of the relative net gains across all countries is zero.

Although the above relationship provides a useful basis to interpret results (see the discussion in section 5), it also deserves some words of caution. First, as technology differs across countries, the domestic emissions that would be generated in case imported goods were produced locally would be different from those generated abroad. This suggests that in practice, redistributing world emissions through trade is not a zero-sum game, in line with the concerns of environmentalists. Second, as long shown by economists, trade itself is not a zero-sum game either: welfare does not only depend on emissions, so that the environmental net gains mentioned above only reflect a partial effect from trade. Third, a thorough analysis of the causes and consequences of PTT variations across countries would require a complete general equilibrium framework, although this is beyond the scope of the present paper.

3. Data Preparation

To be able to identify the three distinct components of the PTT index shown in equation (3), a first condition is that environmental data must contain a specific pollution coefficient for each sector in each country and over time. This type of data has been recently made available for direct SO₂ emissions (the P vector) by Grether, Mathys and de Melo (2009), combining information from various sources (Hettige et al (1995), Olivier and Berdowski (2001) and Stern (2006)).

A second condition is to rely on input-output figures that are both country-specific and consistent with trade data for a large sample of countries. The Trade, Production and Protection (TPP) database of the World Bank (Nicita and Olarreaga, 2007) is the most recent one satisfying these criteria. A number of adjustments were necessary to prepare the data for the empirical analysis. First, original input-output shares (of intermediate sales into total production) have been converted into input-output coefficients using the relevant output figures (these IO coefficients are needed to compute the A vector of total emission intensities). Second, trade data have been aggregated from the 28 ISIC-3 digit categories into the 17 input-output sectors reported in the TPP database (see the correspondence in table A1 in the Appendix). Third, simple ad hoc conventions were adopted to check material balances and to make sure that trade, production and input-output data are consistent with each other (e.g. no negative value added nor negative final demand for domestic or foreign goods). Most of these adjustments took the form of a reduction in input-output coefficients, so that the total

emission intensities used in the present paper may be considered as a lower bound (see the Appendix for the details).

A third condition to identify reliable PTT indices is to trace imports back to their original production site. Failing to do so may generate important biases in PTT calculations as reexports represent a substantial share of trade flows for certain countries and pollution intensities differ markedly from one country to another.⁴ Although COMTRADE data on reexports are only available a quarter of the TPP countries, we rely on this subsample to calibrate a simple and original allocation methodology that allows to control trade flows for reexports (see the Appendix on data preparation for the details).

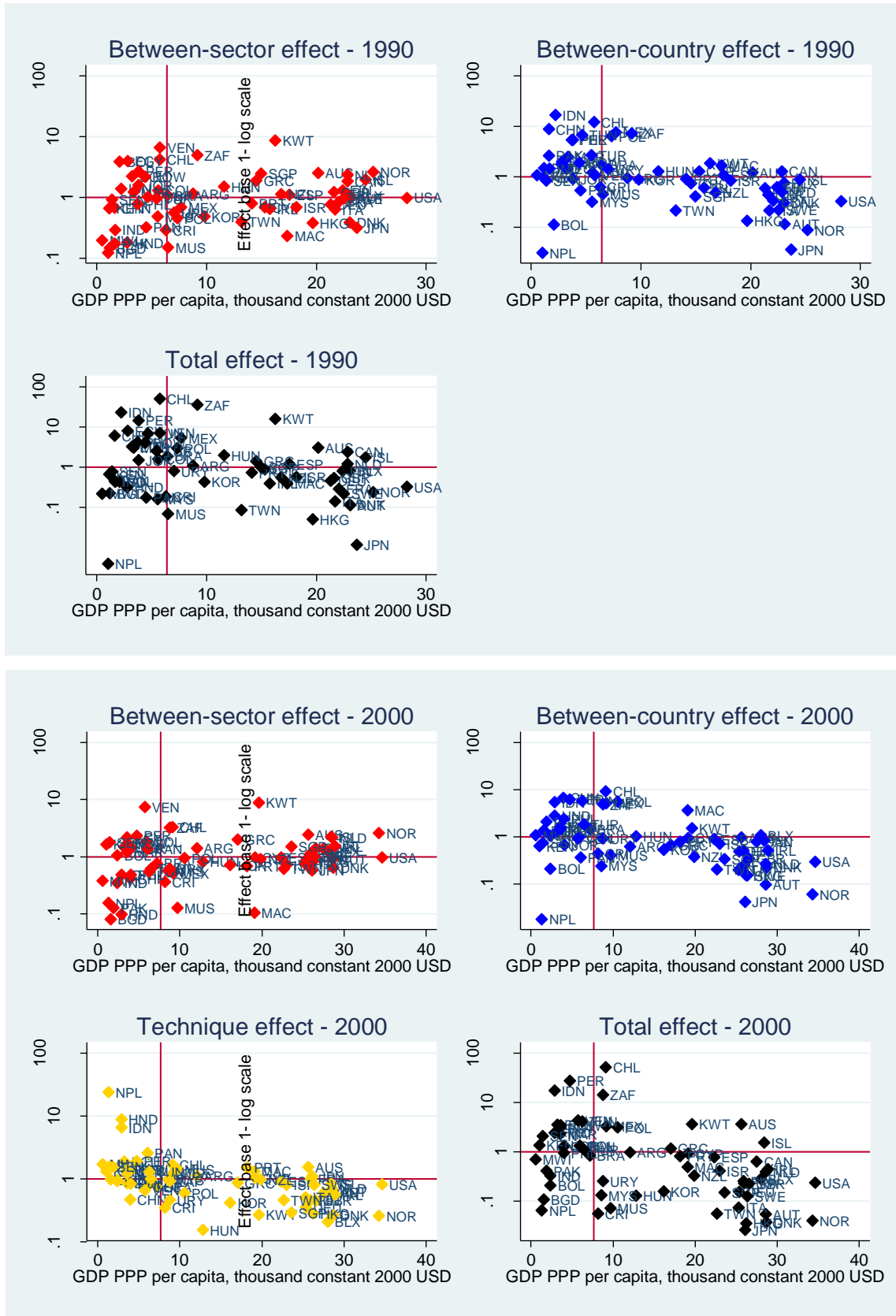
Following these adjustments, a consistent data set is made available on trade, pollution and production variables, covering 62 countries, 3 years (1990, 1995, 2000) and 17 manufacturing sectors.

4. Empirical Findings

The PTT index has been computed for each one of our 62 countries, for 1990 and 2000. Moreover, following equation (4), the different indices based on limited information have also been computed, providing a complete decomposition of the PTT index into three components. Detailed results are reported in Appendix Table A2. To ease interpretation and relate our results with the pollution-haven debate, we present our results with figures that plot the index against GDP per capita, as richer countries tend to adopt more stringent environmental policies (see e.g. Copeland and Taylor (2003)). Each panel is split into four quadrants by a horizontal line at the PTT=1 reference level and a vertical line representing average GDP per capita at the world-wide level. A distribution of points in the upper-left and bottom-right quadrants would be consistent with the pollution-haven view.

⁴ This was not a source of concern for Antweiler (1996) as he had to impose the same pollution intensities to every country because of lack of available data on pollution intensities.

Figure 1: PTT against GDP per capita by country, 1990 and 2000



Notes: cf. equation (4) in text for a definition of each effect / GDP per capita figures are taken from the World Bank Development Indicators, 2007.

Figure 1 reports the results at the country level. We start with the left upper panel, which represents the between-sector effect in 1990, i.e. the PTT index based on the assumption made by Antweiler, namely that US emission intensities for different industries are applicable to all other countries. This leads to a distribution of points that has no obvious orientation. If any, the relationship with GDP per capita appears to be slightly positive, restating the paradox that has been found by Antweiler, namely that rich countries have relatively dirty average exports compared to low income countries. When shifting to the right-hand side panel, representing the between-country effect, the opposite pattern emerges. Apart from Bolivia and Nepal, the large majority of poor countries locate above the horizontal line, and a substantial number of rich countries are below the same line. This suggests that compared to US figures, large emission intensities seem to be biased towards exports in poor countries and towards imports in rich countries, a pattern that is more akin to the pollution-haven view. The total effect in 1990 results from the combination of the two previous effects (there is no technique effect as this is the base year). Broadly speaking, the overall pattern looks closer to the between-country effect, suggesting an inverse relationship between PTT indices and GDP per capita.

The evidence for 2000 is reported in the lower part of the figure. The between-sector and between-country effects look quite similar to what was observed for 1990. The novelty comes from the technique effect, which exhibits a clear inverse relationship with GDP per capita. This suggests that technological changes over time reinforce the pollution-haven effect, leading to more export rather than import-embodied emissions in poor countries and the reverse in rich countries. This strengthens the average pollution-haven pattern of the total effect, that appears in the bottom-right panel of the figure.

Taking logs of equation (4), we also computed a simple variance decomposition of PTT indices. Whatever the year, the between-country effect represents a rough two-third of the total variance, while the technique and between-sector effects share the remaining third in roughly equal parts in 2000. Simple OLS regressions have been performed for each year. As reported in the first two lines of Table 1, when regressing $\ln(\text{PTT})$ over the natural logarithm of GDP per capita, and whatever the year, the elasticity coefficient is always significant, positive for the between-sector effect, and negative for the between-country and technique effects. For the total effect, it is negative, but only significant in 2000. When data are pooled together and fixed effects are introduced for each year and country, the coefficients keep the

same sign but they are not significant anymore (see last line of Table 1). This suggests that the pollution-haven pattern is only robust across countries, but not over time once country and year-specific effects have been controlled for.

**Table 1: Estimated elasticities between PTT and GDP per capita
(t-stat between parenthesis) ^{a)}**

Regression method	Dependent variable (see equation (4))			Total effect
	Between-sector effect	Between-country effect	Technique effect	
OLS ^{a)}				
1990	0.25*** (2.10)	-0.43*** (-2.84)	n.a.	-0.19 (-0.85)
2000	0.27** (2.41)	-0.39*** (-2.68)	-0.45*** (-5.35)	-0.58*** (-2.98)
Panel ^{b)}				
1990-2000	0.29 (1.12)	-0.25 (-1.61)	-0.77* (-1.74)	-0.74 (-2.98)

^{a)} results from OLS regressions of $\ln(\text{PTT})$ on a constant plus the natural logarithm of GDP per capita (63 observations: 62 countries plus the rest of the world)

^{b)} results from panel regressions of $\ln(\text{PTT})$ on the natural logarithm of GDP plus year and country dummies (63 observations times 3 years: 1990, 1995, 2000)

(***/**/*) significant at the 99%/95%/90% level / n.a.: not applicable

Overall, although the dispersion of results is quite large, country-level estimates suggest that if one is limited by US technology coefficients, PTT indices seem either unrelated or slightly positively related with GDP per capita. However, the evidence also suggests that the two effects that control for technological differences (the between-country and the technique effect) exhibit a negative relationship with per capita GDP, and that those effects prevail over the previous one in shaping a total pattern that is consistent with the pollution-haven argument, and significantly so regarding cross-country variation.

5. Discussion of Results

5.1 Alternative measurements

As mentioned in section 3 and presented in details in the Appendix, the results presented in section 4 rely on a double correction of (i) input-output (IO) coefficients (to insure consistency with trade data) and (ii) trade flows (to abstract from reexports). Both corrections

are duly motivated but, as a robustness exercise, we report below the PTT indices that are obtained in the three alternative cases where either one or both corrections are omitted.

In Figure 2, to improve readability, countries are reported by rank of GDP per capita rather than levels. For each country, the IO adjustment is represented by a switch from a hollow to a color-filled symbol, while the reexport adjustment is represented by a switch from a small square to a large diamond. Although most of the country dots are fairly close to one another, some countries experience large changes in PTT estimates. Most of these large changes (for Honduras, Costa Rica, Macao and Bangladesh) are found in the group of relatively poor countries and due to adjustments in IO coefficients, which is related to the poor quality of production data. For a limited number of relatively rich countries (Austria, Denmark and Sweden), the trade data adjustment leads to lower estimated PTTs, which suggests that the goods that they reexport have a larger PTT index than those that have reached their final destination.

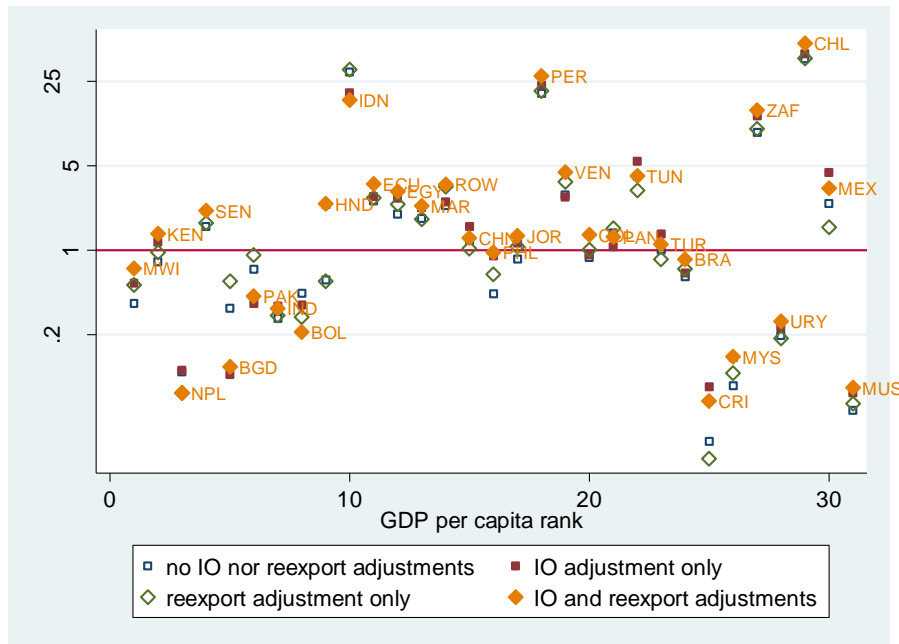
Overall, the two panels of Figure 2 confirm the regularity identified in section 4, namely that poor (rich) countries tend to exhibit a PTT index which is larger (smaller) than 1. When regressions are performed on the three alternative sets of PTT indices, the signs and significance of results are also very similar to those reported in Table 1. In short, the pattern identified in section 4 can be considered as reasonably robust.

5.2 Alternative representations

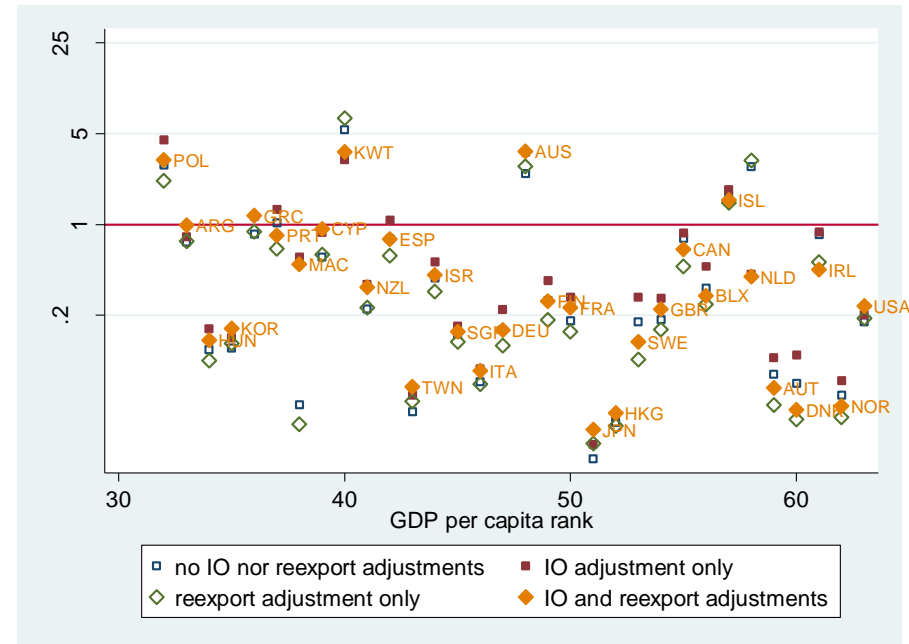
What happens when country size is taken into account? In Figure 3, which reports 2000 results for the total effect (as in the right-bottom panel of Figure 1), the size of each dot is proportional to the share of each country in world trade-embodied emissions. The pattern that emerges is now even clearer, with large poor countries such as Indonesia, China and Chile, exhibiting large PTT indices, while large rich countries like the USA, Germany and Japan are characterized by PTT indices which are lower than one. Weighing observations also translates into a stronger relationship in terms of OLS regression for 2000 (with respect to Table 1, the estimated elasticity is now -1.40 , rather than -0.58 , while the absolute value of the t-stat increases 2.98 from to 6.83), although results from the panel analysis remain non significant (but for the technique effect, which becomes significant at the 99% level).

Figure 2: PTT intervals according to different adjustment procedures, 2000

(a) 31 poorest countries

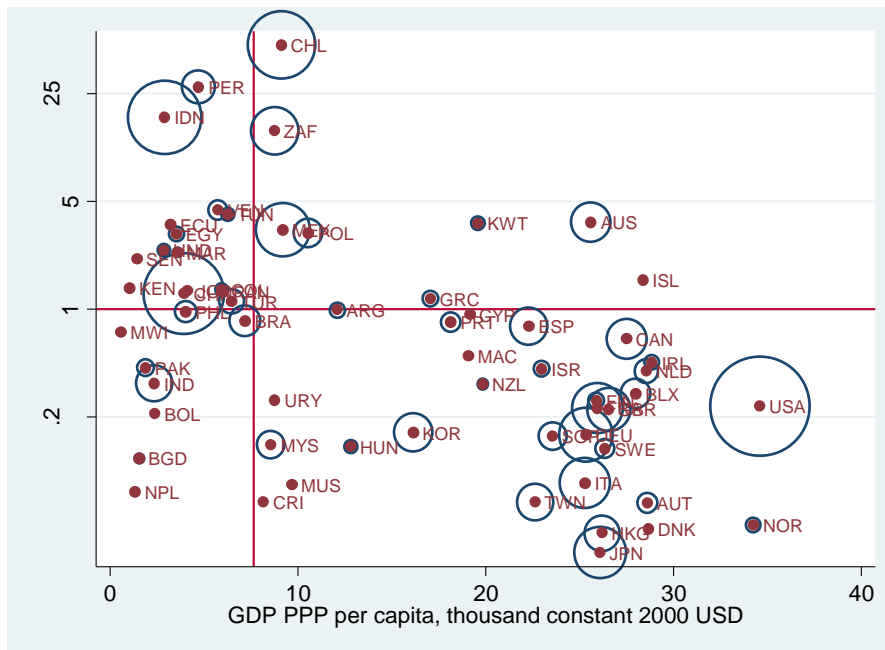


(b) 31 richest countries



Note: IO and reexport adjustments are described in the Appendix

Figure 3: Emission-weighted Total Effect, 2000



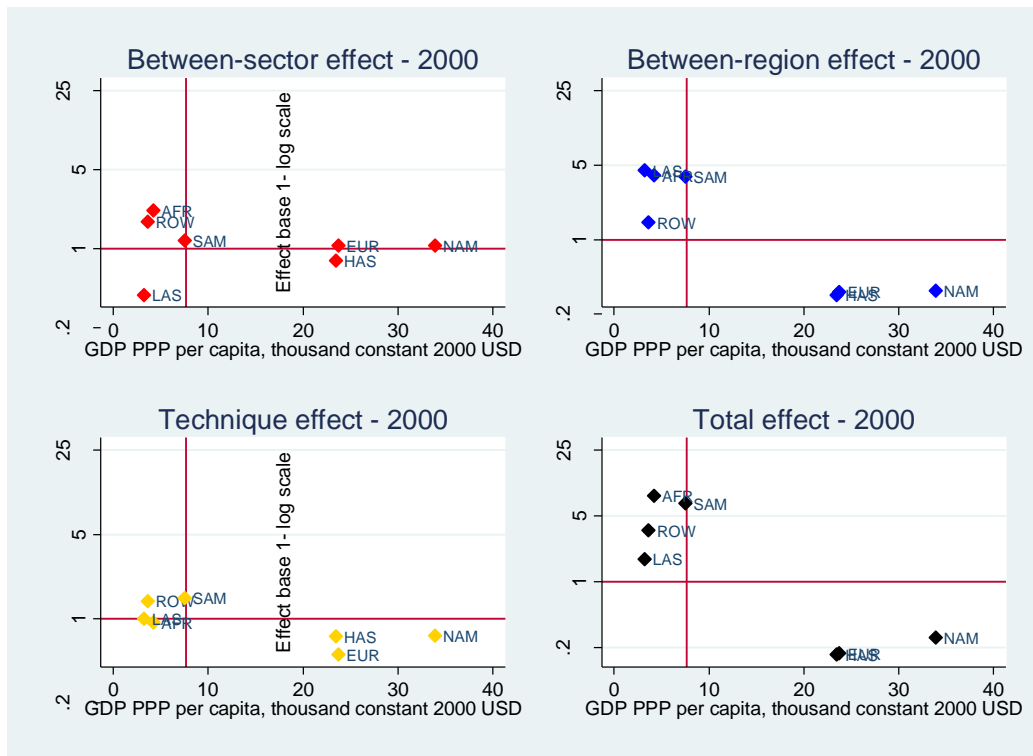
Note: Rest of the world countries are not considered in determining weights.

As an alternative way to abstract from the large number of countries, Figure 4 plots the same kind of graphs for 6 broad regions (see Appendix Table A3 for the country groupings). Here again, the picture that emerges is even clearer than in Figure 1. The between-sector evidence is inconclusive as regional dots are located in the four panels of the figure. For each other effect (including the total effect), the pattern is totally consistent with the pollution-haven view, as all points are located in the upper-left and the bottom-right panel of each figure.

5.3 Alternative interpretations

What can be inferred from the robust pattern identified so far? One possible interpretation, which is concerned with the causes of the phenomenon, is the pollution-haven hypothesis. According to this view, in a decade of trade liberalization like the 90s, “dirty” industries tend to locate preferentially in poor countries, because the latter adopt less stringent environmental policies than their richer partners, and this difference is stronger than all other determinants of comparative advantage in polluting products. A simple way to test this argument is to replace GDP per capita, which appears on the horizontal axis of Figure 2, by a more direct proxy of the stringency of environmental policy.

Figure 4: PTT against GDP per capita by region, 2000



Notes: cf. equation (4) in text for a definition of each effect. Regional definition: AFR: Africa, EUR: Europe, HAS: High Income Asia, LAS: Low Income Asia, NAM: North America, ROW: Rest of the World, SAM: South America / For a detailed country list by region see Appendix table A2.

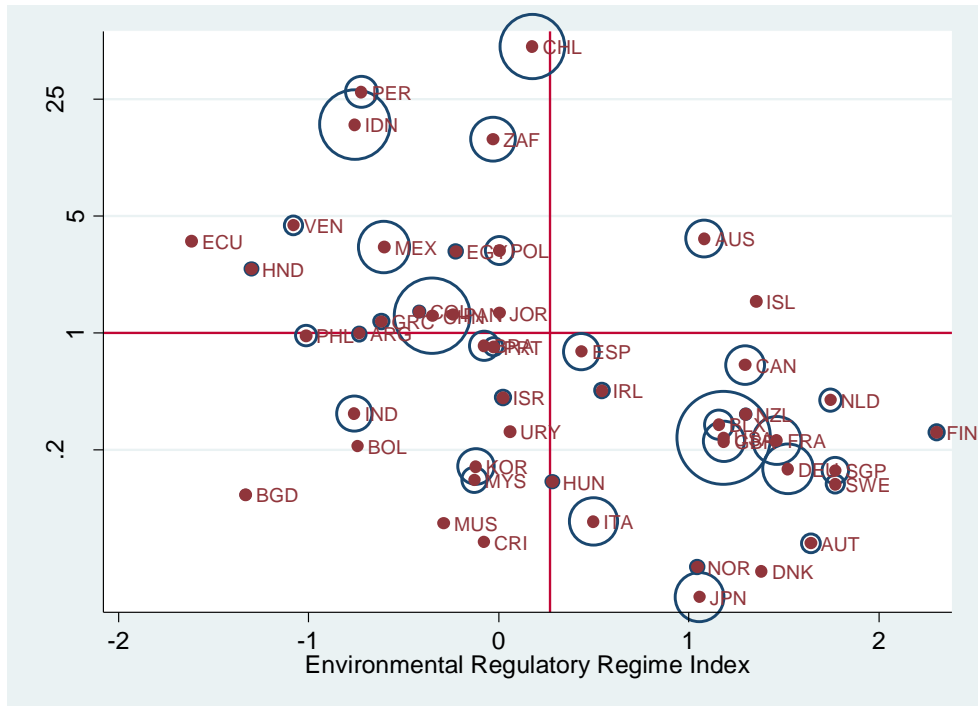
This is done in Figure 5(a), where 2000 PTT values are plotted against the value of the Environmental Regulatory Regime Index developed by Esty and Porter (2001). The downward-sloping pattern is clearly confirmed, with a highly (99%) significant elasticity coefficient of -3.2 (-1-4) for the weighted (unweighted) regression.⁵ However, a more appropriate test of the pollution haven hypothesis should be based on temporal variation. As illustrated by Figure 5(b), when 2000 levels are replaced by differences in the log values of PTT over the 1990-2000 period, the relationship tends to break down. The unweighted regression coefficient is smaller (-0.5) and only significant at the 95% level, while the weighted regression coefficient becomes positive and non significant⁶ This is in line with the results reported in Table 1, and with previous studies on SO₂ emissions that identified pollution-haven patterns in cross sections but not in time-series variations (e.g. Grether et al (2010)).

⁵ Regressions are based on a sample of 49 countries for which index figures are available, and we add 2 to the value of the environmental index to avoid taking logs of a negative value.

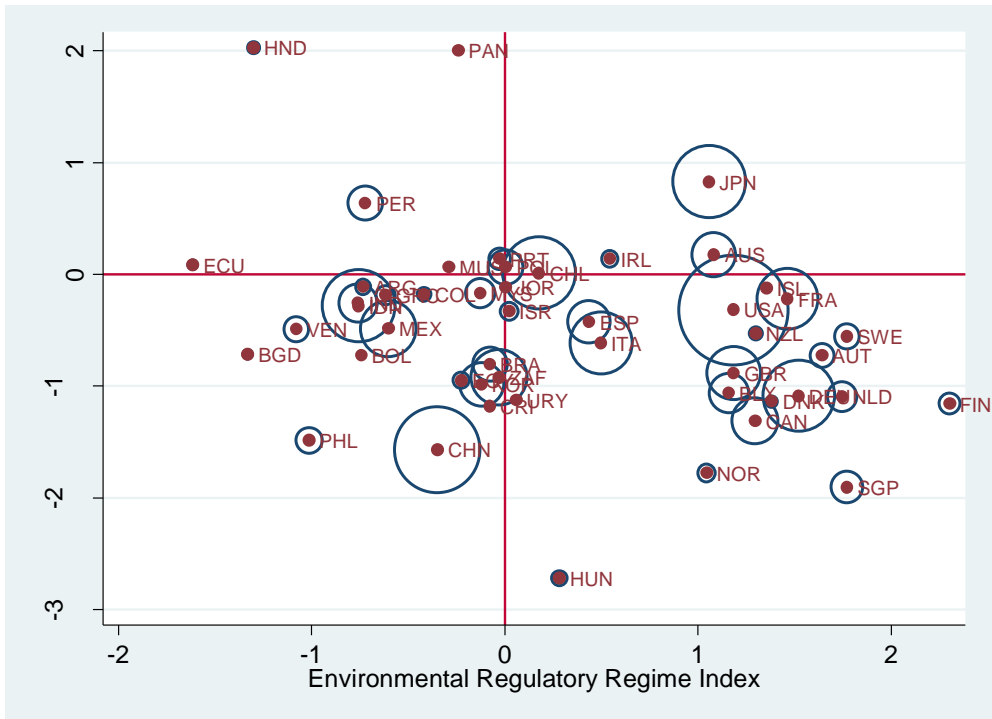
⁶ These results are robust to the use of alternative measures of environmental stringency indicators, like the Environmental Sustainability Index (Esty et al (2005)) or the survey index of the World Economic Forum (Cornelius and Schwab (2003)).

Figure 5: Pollution-haven Patterns

(a) Levels in 2000 (with trade-embodied emissions as weights)

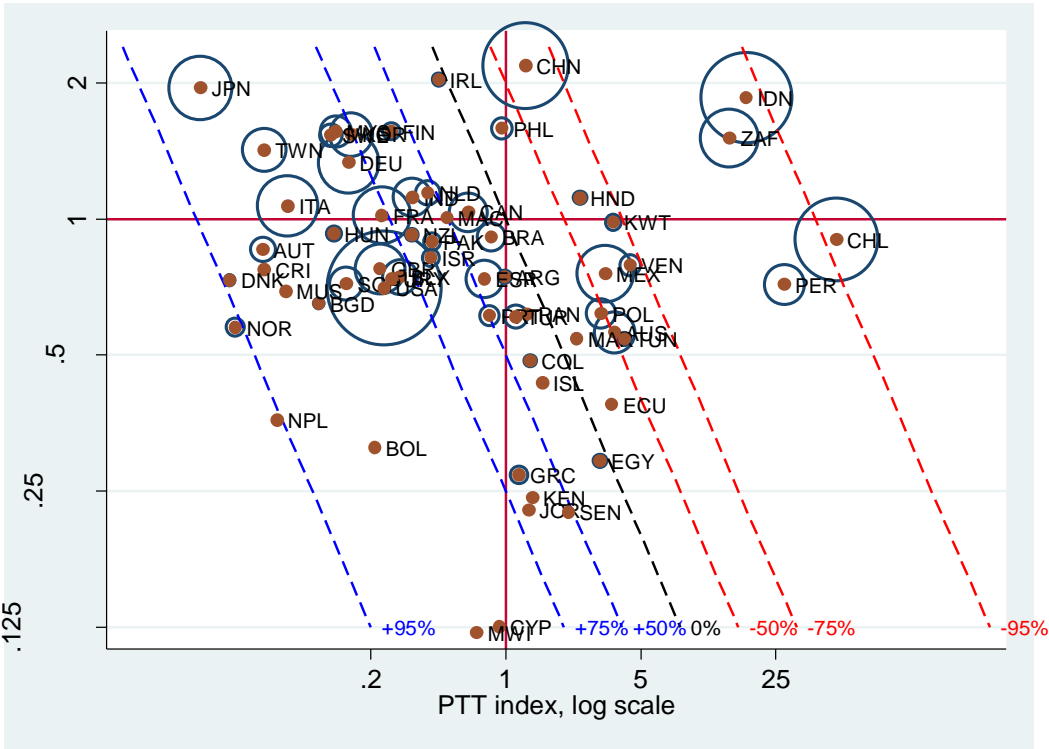


(b) Differences 2000-1990 (weights: trade-embodied emissions)



A second interpretation, which relates to the consequences of the observed pattern, is to rely on the zero-sum game described in subsection 2.2. According to this view, which is, as stated above, only an approximation of the welfare effects of trade in polluting products, a country experiments an environmental net gain if the emissions embodied in its imports are larger than those embodied in its exports. As shown by equation (6), this condition is fulfilled when the product between the PTT index (χ_{ct}) and the export over import ratio (ρ_{ct}) is smaller than 1. In Figure 6, as log scales are used on the axis, this is so for all countries which locate below the dashed downward-sloping diagonal ($\ln(\rho_{ct}) + \ln(\chi_{ct}) = 0$). The larger the dot (which is proportional to the share of the country in world import or export-embodied emissions depending whether the country is an environmental winner or loser), and the more it is distant from the diagonal, the larger the net environmental net gain or loss of the country (iso-curves for 50%, 75% or 95% of the maximum gain or loss – which corresponds to the emission share -- are also reported on the diagram). As it turns out, apart from India and Mauritius, most of the large environmental winners in 2000 are large rich countries, while most large environmental losers are large poor countries (apart from Australia).

Figure 6: Environmental Winners and Losers, 2000



Notes: the number associated with each dashed line is the effective percentage of the potential loss or gain, the latter being proportional to the surface of each circle. Hong Kong (winner) and the Rest of the World (loser) excluded from the diagram.

6. Conclusions

What is the pollution content of trade and how is it distributed across countries? This paper argues that the concept of the pollution terms of trade (PTT) introduced by Antweiler (1996) is a useful instrument that should be more frequently used to address these issues. In particular, it helps to shed light on the much debated "pollution-haven" argument according to which countries with lax environmental regulation tend to export "dirty" goods and import "clean" ones. Based on a rich database of SO₂ manufacturing emissions, and controlling for reexport activities, the paper proposes an answer in three steps.

In the first step, we propose a thought experiment in which there are no technological differences across countries (i.e. everyone is using the US technology). In such a simplified world, the notion of what is a "dirty" and what is a "clean" good is universal: it does not depend neither on the country nor on the time period. So everything boils down to the question of: how is trade structured across sectors? And there the evidence is unclear. Some relatively poor countries like Peru or Bolivia present indeed a dirty bias in their exports vis-à-vis their imports, but opposite cases like Poland or Honduras are almost as frequent. Thus within this simplified and technologically unified world there is no clear pollution-haven pattern.

However the world is technologically diverse. In the second step, we take technological differences across countries into account, so that what is considered as a dirtier or a cleaner good becomes country-specific. And the correction term related to this second step does present a clear pattern, as it is higher for poor countries. This means that the use of US technological parameters in the first step undermined the true PTT of poor countries in a systematic way. Inter-country differences in emission coefficients between poor and rich countries tend to be biased towards the export products of the former group, a pattern that is consistent with the pollution-haven conjecture.

The same pattern emerges in the third step, where we control for technological change over time. In this case also, the correction term is higher for poor countries (and dramatically so for certain cases like Honduras or Nepal), suggesting that pollution intensities reduction (most countries becoming cleaner over time) tends to be smaller for exports in poor countries, which is again sympathetic to the pollution-haven argument. The total effect is obtained by the

combination of the three steps. Although it is always possible to select a couple of countries that follow an inverse relationship, and although the relationship is not significant in a panel regression that controls for country-specific characteristics, the overall pattern that emerges across countries for the total effect is broadly consistent with the pollution-haven view.

A related issue is the net environmental gain that countries experience through trade, as import flows allow to send emissions abroad. After controlling for trade imbalances, the above-mentioned pattern suggests that most poor countries are environmental losers while rich countries locate on the winning side. Of course this zero-sum game perspective is debatable as it abstracts from other gains from trade and transboundary effects (SO₂ being a regional rather than a local pollutant). However, in a world that becomes ever more globalized and polluted, and where the opposition between North and South countries undermines the efficiency of international environmental agreements, policy makers need tools to inform the debate and design appropriate solutions. In such a context, the PTT index deserves more consideration and should be applied to other pollutants, notably CO₂.

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Appendix on data preparation

Import data being considered as more reliable than export data, all exports in this closed sample are estimated by mirror imports. Missing output data were extrapolated on the basis of simple rules already described in Grether et al (2009). All trade and output figures used in this paper correspond to 3-year moving averages around each “base” year (1990,1995,2000). This appendix describes first how input-output coefficients and/or production data were adjusted to make them consistent with trade data and second how all the available information was exploited to generate estimates of reexport flows and distribution across countries.

a) Adjusting input-output coefficients

Regarding input-output matrices, there are four inconsistencies in the original data leading to negative values of key variables for certain sectors:⁷

- (i) negative total absorption, obtained as the difference between output and net exports;
- (ii) negative expenses on imported intermediate inputs, obtained as the difference between expenses on intermediate inputs (from the input matrix) and expenses on domestic intermediate inputs (from the output matrix);
- (iii) negative sum of final demand on imported products plus reexports, obtained from the imports material balance (equation [A2] below);
- (iv) negative value added, obtained as the difference between production and intermediate expenses (from the output matrix⁸);
- (v) negative global final demand, obtained from the aggregate material balance (equation [A3] below);

These inconsistencies are eliminated by adjusting input-output coefficients (always in the same proportion for a given line or column) or the output level of the corresponding sector in a conservative fashion, i.e. by limiting the adjustment to what is just necessary to convert the negative key variable from negative to zero. Trade data are kept unchanged, as they are considered as more reliable.

The adjustment procedure runs as follows: A first output upward adjustment is performed for each case (i). Then cases (ii) and (iii) are treated by adjusting downwards the corresponding output (respectively input) matrix coefficient. For cases (iv) and (v), the “adjustment burden” is shared between an output increase or a decrease of the relevant input-output coefficient in an equal way. As those steps are interdependent, the procedure is repeated until all negative occurrences disappear.

The adjustment procedure converges after 6 iterations. For coefficients of the output matrix, the average decrease is less than 20% in more than 90% of the cases (the largest decrease being for Macao in 1995, with -24%). For coefficients of the input matrix, the average decrease is less than 27% in more than 90% of the cases (the largest adjustment is for the

⁷ Case (i) affects 3% of the observations, case (ii) 25%, cases (iii) and (v) around 20%, and case (iv) roughly 6%. Note that for 8 countries, the IO matrices were not available and had to be borrowed from a neighbouring similar country (Netherlands for Benelux, Greece for Hungary, Mexico for Brazil, Norway for Iceland, Turkey for Israel, Philippines for Mauritius, Cameroon for Senegal and Morocco for Tunes). On average, these 8 countries do not present a higher occurrence of inconsistencies than the rest of the sample.

⁸ There are no cases of negative value added based on the input matrix, apart from Argentina, where all input coefficients had to be decreased by 21%.

Philippines in 2000, with -48%). Regarding output figures, for more than 90% of the cases, the average increase in national production is smaller than 13% (the maximum is Honduras in 2000: plus 94%, then it drops to 73% and 64%, i.e. Panama in 1990 and 1995 respectively).

b) Estimating reexports

The objective here is to “clean” trade data from reexports, keeping only direct trade relationships between the originally producing country and the finally consuming country. For this purpose we have to solve two questions for each country and sector: how much of gross exports correspond to reexports? and where do these reexports come from and go to?

The first question is answered on the basis of material balances and some assumption on final demand structure. Making the distinction between domestic and foreign (i.e. imported) production, the following three material balance relationships must apply to any sector i :

$$q_i = v_i^d + f_i^d + x_i^d \quad [A1]$$

$$m_i = v_i^m + f_i^m + x_i^m \quad [A2]$$

$$q_i + m_i = v_i + f_i + x_i \quad [A3] = [A1] + [A2]$$

where q stands for domestic output, m for imports, x for exports, v for intermediate sales, f for final demand and a d (m) superscript indicates domestic (imported) production. Equations [A1] and [A2] look like a two-equation four-unknowns ($f_i^d, f_i^m, x_i^d, x_i^m$) system. As we know total exports and total final demand in each country, $x_i^d + f_i^d$ can be replaced by $x_i + f_i - (x_i^m + f_i^m)$ in [A1], so that we are left with two unknowns (x_i^m and f_i^m). However at this stage there is over-determination as both equations include the same sum of the two unknowns. We need to keep only [A1] or [A2], and impose some additional restriction. Our assumption is simply that reexports are a given share, noted ε , of final demand on imported goods (i.e. $x_i^{m*} = \varepsilon(m_i - v_i^m)$, subject to the constraints: $x_i^{m*} \leq x_i, f_i^{m*} \leq f_i$).⁹

We calibrated the value of ε relying on additional COMTRADE data, which were available for a subset of our sample countries (17 out of 62, see the note of table A3). These data suggest that the average share of reexport in gross exports is substantial and rising over time. Moreover, it differs markedly between “entrepôt” countries like Hong-Kong (where it rises on average from 66% in 1990 to 88% in 2000) and other countries (where the corresponding figures are 4% and 7.5%). Obtained by grid search, the values of ε that minimize the root mean squared error on the subset of reporting countries are 5% for non-entrepôt and 50% for entrepôt countries. For some countries, like Denmark or Benelux, this leads to a relatively high share of reexports in exports or imports (around 70%). The overall average reexport share at the world level, 11%, is perfectly in line with the orders of magnitude obtained from the subset of reporting countries.

This leaves us with the second question, namely, how to allocate national reexports across origin and destination countries. The best way to visualize the problem is to think about a 62x62 export matrix where each line (column) represents a country’s exports (imports). Consider the ideal case where A exports 100 to B which are then further reexported to C. If perfect information were available, reexport correction would consist in adjusting three cells

⁹ We also made the alternative and common conjecture that the share of intermediate sales in domestic expenses is the same for the national and the foreign good (i.e. $f_i^d / v_i^d = f_i^m / v_i^m = f_i / v_i$). However this led to unrealistically high estimates of total exports in gross exports (more than 40% on average).

in the export matrix: (i) reduce B's exports to C by 100, (ii) reduce A's exports to B by 100, and (iii) increase A's exports to C by 100. As this information is not available, we proceed by allocating these reductions and increases of trade flows proportionately columns or lines of the export matrix. This leads to the following seven-step procedure:

- (i) for every country (apart from the subset of reporting countries, where detailed info by CCOD is available), calculate the *potential* reduction of export flows, by allocating the original estimated amount of reexports proportionately along each line;
- (ii) for every country, calculate the *potential* reduction of import flows, by allocating the original estimated amount of reexports proportionately along each column;
- (iii) calculate, for each cell of the export matrix, the *individual average* reduction of the trade flow, which is the simple average between the potential reduction of exports and the potential reduction of imports.
- (iv) for every country, calculate the reduction of total exports and the reduction of total imports implied by point (iii), bounding these figures by the original estimated amount of reexports. Calculate the average between these two figures, which is called the *national average* reduction in total trade.
- (v) calculate reexport correction terms, i.e. allocate the national average reduction in total trade proportionately across all trading partners of a given country, the weight given to each cell being the product between the export and the import shares of the corresponding country (adjusted so that all diagonal elements are zero). This generates n correction terms per cell (n being the number of countries), which are summed up and added to obtain the *reexport re-allocation term* for each cell.
- (vi) proceed to the effective correction of each cell, by subtracting from the original figure the *individual average* reduction of trade flow (calculated in point (iii)) and adding to the results the *reexport re-allocation term* (calculated in point (v)).
- (vii) for every country, calculate the effective reduction of total exports and the effective reduction of total imports implied by point (vi). Taking the difference with the original estimated amount of reexports leads to the residual amount of reexports on the export side, or *export residual*, and to the residual amount of reexports on the import side, or *import residual*.

Start again with points (i)-(vii) in a new loop where the original estimated amount of reexports is replaced by the export residual in point (i) and by the import residual in point (ii) while in point (iv) the reduction of total exports or imports is bounded by the export or import residual (if the latter is negative, the corresponding reduction is set to zero). The procedure stops when the sum of the absolute value of the export and import residuals across all countries stops decreasing (or does it by less than 1 dollar per loop). This is usually achieved after less than 400 iterations (the maximum is 593 iterations for in 1990).

This procedure creates new trade routes (the share of positive cells in the export matrix rises from 70% to 93% on average), which is to be expected when re-export flows are disentangled. Moreover, it makes sure that in the end and for each country, exports and imports are reduced by the amount of reexports estimated when answering the first question raised above.

Table A1: Correspondence table between input-output and ISIC sectors

Input-output sector	ISIC 3-digit	Description
1	311/312	Food products
2	353/354	Petroleum
3	313/314	Beverages & Tobacco
4	321	Textiles
5	322	Wearing Apparel
6	323/324	Leather & Footwear
7	331/332	Wood & Furniture
8	341/342	Paper & Printing
9	351/352/355/356	Chemicals & Plastic
10	361/362/369	Non-metal minerals
11	371	Iron & Steel
12	372	Non-ferrous metals
13	381	Metal products
14	384	Transport equipment
15	382	Non-elect. machinery
16	383/385	Machinery & Professional equipment.
17	390	Other manufacturing products

Table A2: PTT indices for SO₂ emissions, 1990 / 2000

Country	1990				2000			
	Between-sector effect (1)	Between-country effect (2)	Technique effect (3)	Total effect (4)=(1)*(2)*(3)	Between-sector effect (1)	Between-country effect (2)	Technique effect (3)	Total effect (4)=(1)*(2)*(3)
Share of Variance	0.37	0.63	0	1	0.20	0.59	0.21	1
ARG	1.15	1.19	1.00	1.37	1.42	0.74	1.24	1.30
AUS	2.53	1.63	1.00	4.11	2.45	1.23	1.65	4.97
AUT	0.97	0.15	1.00	0.15	0.90	0.12	0.69	0.08
BGD	0.15	2.10	1.00	0.31	0.08	1.79	1.09	0.16
BLX	1.07	1.06	1.00	1.13	1.27	1.42	0.23	0.41
BOL	3.87	0.12	1.00	0.48	1.06	0.23	0.99	0.25
BRA	1.10	2.10	1.00	2.30	0.77	2.16	0.85	1.42
CAN	1.85	1.49	1.00	2.76	1.38	0.91	0.63	0.79
CHL	4.19	14.11	1.00	59.07	3.33	11.34	1.81	68.39
CHN	0.68	11.58	1.00	7.90	0.41	9.01	0.47	1.74
COL	1.31	1.72	1.00	2.24	1.83	1.15	0.78	1.64
CRI	0.29	0.71	1.00	0.21	0.36	0.53	0.38	0.07
CYP	0.69	2.07	1.00	1.42	0.96	1.40	1.19	1.60
DEU	0.76	0.81	1.00	0.62	0.87	0.64	0.39	0.22
DNK	0.39	0.40	1.00	0.15	0.64	0.31	0.29	0.06
ECU	2.24	1.80	1.00	4.03	1.46	1.52	2.01	4.45
EGY	3.97	2.75	1.00	10.92	2.19	2.65	0.98	5.70
ESP	1.11	1.44	1.00	1.60	0.97	1.17	0.98	1.11
FIN	1.30	1.01	1.00	1.31	1.12	0.70	0.51	0.40
FRA	0.85	0.45	1.00	0.38	0.92	0.32	1.09	0.32
GBR	1.22	0.60	1.00	0.74	1.42	0.44	0.51	0.31
GRC	1.88	1.09	1.00	2.05	2.01	0.96	0.95	1.84
HKG	0.38	0.15	1.00	0.06	0.83	0.18	0.30	0.04
HND	0.18	3.18	1.00	0.58	0.10	4.75	10.54	4.94
HUN	1.52	1.86	1.00	2.83	0.81	1.40	0.17	0.19
IDN	1.38	19.72	1.00	27.27	0.48	7.04	8.83	30.02
IND	0.29	3.83	1.00	1.13	0.34	1.56	0.94	0.51
IRL	0.64	0.76	1.00	0.49	1.55	0.64	0.61	0.61
ISL	1.99	2.10	1.00	4.18	2.25	1.32	1.08	3.20
ISR	0.69	1.37	1.00	0.94	0.71	1.19	0.92	0.78
ITA	0.63	0.32	1.00	0.20	0.74	0.26	0.54	0.11
JOR	1.61	1.48	1.00	2.38	1.44	1.08	1.56	2.42
JPN	0.32	0.05	1.00	0.01	0.58	0.05	1.18	0.04
KEN	0.67	3.37	1.00	2.26	1.66	1.24	1.60	3.29
KOR	0.49	1.09	1.00	0.53	0.71	0.68	0.44	0.21
KWT	8.65	3.00	1.00	25.96	8.91	1.94	0.28	4.88
MAC	0.23	1.81	1.00	0.42	0.10	4.06	1.47	0.62
MAR	1.23	3.05	1.00	3.76	1.21	2.06	1.36	3.38
MEX	0.69	8.97	1.00	6.17	0.51	6.17	1.30	4.10
MUS	0.15	0.79	1.00	0.12	0.13	0.66	1.69	0.14
MWI	0.20	1.24	1.00	0.25	0.38	1.38	1.93	1.02
MYS	0.49	0.40	1.00	0.20	0.56	0.31	1.02	0.18
NLD	2.39	0.61	1.00	1.46	2.17	0.31	0.76	0.51
NOR	2.64	0.12	1.00	0.31	2.58	0.08	0.27	0.05
NPL	0.12	0.04	1.00	0.00	0.15	0.03	26.82	0.11
NZL	1.12	0.60	1.00	0.67	0.91	0.45	1.04	0.42
PAK	0.17	3.82	1.00	0.66	0.13	3.15	2.09	0.84
PAN	0.33	0.81	1.00	0.26	1.37	0.48	2.84	1.86
PER	2.68	6.07	1.00	16.29	2.35	7.17	2.07	34.80
PHL	0.78	6.43	1.00	5.04	0.49	2.86	0.88	1.22
POL	0.46	16.14	1.00	7.42	0.94	7.45	0.66	4.62
PRT	0.80	1.18	1.00	0.94	0.69	1.02	1.65	1.16
ROW	2.17	1.89	1.00	4.10	1.72	1.46	1.39	3.50
SEN	0.92	2.28	1.00	2.09	1.77	1.01	1.79	3.19
SGP	2.48	0.53	1.00	1.30	1.52	0.48	0.32	0.23
SWE	0.97	0.29	1.00	0.28	1.02	0.19	0.88	0.17
TUN	1.02	8.90	1.00	9.09	0.55	8.12	1.45	6.49
TUR	0.96	3.78	1.00	3.61	0.61	2.57	1.08	1.70
TWN	0.39	0.27	1.00	0.11	0.61	0.26	0.48	0.07
URY	0.56	1.86	1.00	1.04	0.61	1.17	0.51	0.36
USA	0.99	0.41	1.00	0.41	0.97	0.37	0.86	0.31
VEN	6.69	1.23	1.00	8.23	7.38	1.04	0.68	5.27
ZAF	5.03	8.81	1.00	44.27	3.21	5.99	1.04	19.92

Notes: cf. equation (4) in text for the definition of each effect.

Table A3: Regional grouping of countries

N. America, NAM (2)	High Income Asia , HAS(10)	Europe, EUR (19)	Africa, AFR (8)	Low Income Asia, LAS (10)
Canada (CAN)	<i>Australia (AUS)</i>	Austria (AUT)	Egypt (EGY)	Bangladesh (BGD)
USA (USA)	<i>Hong Kong (HKG)</i>	Belgium & L. (BLX)	<i>Kenya (KEN)</i>	China (CHN)
	Israel (ISR)	<i>Cyprus (CYP)</i>	Morocco (MAR)	<i>India (IND)</i>
S. America, SAM (13)	Japan (JPN)	Denmark (DNK)	Mauritius (MAS)	Indonesia (IDN)
Argentina (ARG)	Korea (KOR)	Finland (FIN)	<i>Malawi (MWI)</i>	<i>Jordan (JOR)</i>
Bolivia (BOL)	<i>Kuwait (KWT)</i>	France (FRA)	Senegal (SEN)	Malaysia (MYS)
Brazil (BRA)	<i>Macau (MAC)</i>	Germany (DEU)	S. Africa (ZAF)	Nepal (NPL)
Chile (CHL)	<i>New Zealand (NZL)</i>	Great Britain (GBR)	Tunisia (TUN)	<i>Pakistan (PAK)</i>
Colombia (COL)	Singapore (SGP)	Greece (GRC)		<i>Philippines (PHL)</i>
Costa Rica (CRI)	<i>Taiwan (TWN)</i>	Hungary (HUN)		Turkey (TUR)
Ecuador (ECU)		Ireland (IRL)		
<i>Honduras (HND)</i>		Island (ISL)		
Mexico (MEX)		Italy (ITA)		
<i>Panama (PAN)</i>		Netherlands (NLD)		
Peru (PER)		Norway (NOR)		
Venezuela (VEN)		Poland (POL)		
Uruguay (URY)		Portugal (POR)		
		Spain (ESP)		
		Sweden (SWE)		

Note: Countries in italic are those reporting reexport data in the COMTRADE database.