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Konstantins Benkovskis and Julia Wörz "Made in China" How does it affect our understanding of global market shares?





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Abstract

We propose a comprehensive decomposition of changes in a country's global market shares that accounts for the value added content of trade. We perform the analysis by combining two datasets – disaggregated trade data from UN Comtrade with internationally integrated Supply and Use Tables from the WIOD. The inclusion of international fragmentation alters the underlying story behind changes in market shares. The ongoing global outsourcing affects market shares directly by shifting production from G7 to BRIC countries. Moreover, accounting for the providers of the value added alters the balance between price and non-price drivers of market shares. Changes in relative quality of countries' exports are often due to the use of intermediate inputs. For instance, the seemingly improved relative quality of BRIC export goods largely arose from intermediate inputs rather than from improvements in the quality of domestic production. In most cases, the dynamics of the value-added market shares is dominated by price factors.

Keywords: value added content of trade, fragmentation, non-price factors, China, BRIC, G7 **JEL-codes:** C43, F12, F15, L15, O47

Non-technical summary

Our paper contributes to the discussion of export competitiveness by proposing a comprehensive measure that offers two refinements over traditionally used measures: First, it reflects the modern organisation of production in global value chains. In our analysis, we move beyond the traditional view that equates countries with producers and account for changes in the value added content of trade. In other words, we measure the exporting country's *value added in the respective export flow* rather than gross exports inclusive of imported intermediates. In today's globalized worlds, export performance is clearly affected by a country's ability to integrate and position itself well in international production chains. Some recent case studies suggest that the share of domestic value added could be extremely small for certain countries and certain products, rendering data on gross export flows inadequate for a thorough analysis of competitiveness. Therefore we use global market shares of value added in gross exports as our measure of revealed competitiveness.

Second, our measure visualizes the contributions of underlying determinants of competitiveness. Changes in global market shares cannot be assessed by simply looking at price and cost factors, structural factors such as changing quality of a country's export goods or assessing a country's ability to react to changes in consumer tastes play an important role as well. In line with the OECD definition: "Competitiveness is a measure of a country's advantage or disadvantage in selling its products in international markets", we analyse the basket of determinants which leads to an increase or decrease in export market shares.

Our paper contributes to the literature uncovering the underlying drivers of global market shares while taking into account the international fragmentation of production at the same time. We decompose changes in export market shares in value added terms into various components and reflect the international fragmentation of production in two ways: by using weights calculated from trade in value-added, and by introducing a specific term accounting for shifts in global value chains. To perform this task, we combine two datasets – highly disaggregated trade data from UN Comtrade with internationally integrated Supply and Use Tables from the WIOD.

Changing the focus from traditional gross to value added export market shares does not alter the general picture much – developing countries are still gaining market shares at the expense of advanced economies. But the inclusion of international fragmentation alters the underlying story to quite some extent which carries important policy implications.

First, our results show that the global production process is gradually shifting toward developing countries, thus outsourcing as such is contributing positively to market share

changes (in value added terms) in the BRIC countries and is thus eroding G7 countries' market shares. We observe significant shifts from developed countries to China (also Brazil and India, although with smaller magnitude), especially in radio, television and communication equipment, office machinery and computers, other machinery and equipment. BRICs are not the unique destination for outsourcing. For example, the final assembly of motor vehicles shifts from large European countries to the Czech Republic and Slovakia, Mexico acts as a final assembly destination for US value added, while Korea plays the same role for value added from Japan.

Second, accounting for the ultimate providers of value added in exported goods alters the balance between price and non-price drivers of global market shares. Our results show that negative contributions of other non-price factors (that are loosely interpreted as losses in relative quality of production) for developed countries are in fact lower than claimed before. G7 countries remain important suppliers of high quality intermediates in fragmented production lines. In particular, Canada, Germany, the UK and the US are well able to the keep relative quality of their produced goods unchanged. Only Italy and France pose an exception to this trend. After controlling for shifts in production chains one can observe that the seemingly stable or improving "quality" of Brazil's, Russia's and India's exports arises from the insourcing of higher-quality products rather than from improvements in the quality of their domestic production. China's gains in market shares are striking regardless which view is chosen. Also the contribution of other non-price factors remains impressive even after accounting for the role of global value chains. Still, the phenomenon of "Made in China" plays an important role. While we overestimate possible gains in quality and taste when we restrict attention to gross exports, we also underestimate China's price competitiveness as well as the effect of foreign value added which is imported mostly from developed countries.

1 Introduction

Within roughly two decades China has risen from being a relatively unimportant low-cost and low-quality producer to become the world's largest supplier of goods. This enormous gain in world market shares is often ascribed to the fact that China still has relatively lower production costs, thus alluding to its price competitiveness. More recently, there is also evidence for improving quality of Chinese exporters (Pula and Santabarbara, 2011; Fu et al., 2012; Benkovskis and Wörz, 2014b). Another development that is often overlooked in such analyses is the fact that China has integrated deeper into global production networks (global value chains – GVCs) over the same period, thus the label "Made in China" also covers inputs produced by other countries. This stylized fact is not limited to China and implies that outsourcing and specialization, i.e. the positioning of a specific country within GVCs, plays important role for export success.

As a consequence, the picture has become considerably more complicated: changes in global market shares can no longer be assessed by simply looking at price and cost factors, it is even not sufficient anymore to control for the changing quality of a country's export goods or to assess a country's ability to meet changes in consumer tastes. In today's globalized world, export performance is also affected by a country's ability to integrate and position itself well in international production chains.

Thus, the correct assessment of factors behind changes in global market shares meets entirely new challenges. Crucial questions like the following have to be answered in order to give a complete picture: How big is a country's value added share in the products it sells in international markets? How is a country's market share affected if its value added share changes over time as a result of international fragmentation? Clearly, data on gross trade flows alone fail to answer these questions. Moreover, they may provide misleading conclusions, as the internationalization of production diminishes the domestic component of exports. Some recent case studies suggest that the share of domestic value added could be extremely small for certain countries and certain products (see e.g. the famous iPod example analysed by Linden et al., 2009). Therefore data on gross export flows is no more an adequate representative of a country's ability to produce goods for the world market.

The number of studies on GVCs and their effect on trade still remains small, although it has been growing rapidly in recent years. The early approach by Hummels et al. (2001) to explore vertical specialization was expanded and deepened by Koopman et al. (2010; 2014), Daudin et al. (2011), Johnson and Noguera (2012), and Stehrer (2012). They all confirm the

importance of cross-border production linkages and stress the misleading nature of gross trade data.

More recent studies go beyond the calculation of value-added content of trade and modify some basic economic indicators in compliance with the new concept. Providing a unifying framework for previously proposed concepts to identify GVC integration, Koopman et al. (2014) compare revealed comparative advantage (RCA) indices based on gross and value-added trade. They report results for two sectors (metal products and real estate activities) and show that conventional calculations tend to overestimate the competitive position of emerging economies (China and India), while underestimating ranking positions for developed countries (United States, Japan). In this context, attention is also paid to alternative calculations of real effective exchange rates (REER) in the presence of GVCs. Both, deflators as well as the relevant weighting of trading partners are affected by the move from gross to value added trade. Bems and Johnson (2012) extend the benchmark framework of Armington (1969) and McGuirk (1987) by allowing for cross-border inputs on the supply side, and define a REER for trade in value added. They propose a value-added REER that uses weights reflecting value-added trade patterns and GDP deflators (prices for value added). This value-added REER (or "REER in Tasks", as named by Bayoumi et al., 2013) is calculated for 42 countries between 1970 and 2009 and yields important differences compared to the conventional approach. According to their results, the depreciation of the US REER and the appreciation of the Chinese REER were both more pronounced since 2000 under the value added perspective than when looking at the traditional CPI-based REERs. Bayoumi et al. (2013) follow the intuition of Thorbecke (2011) and take into account changes of imported intermediate input prices to construct a so-called "REER in Goods". Bayoumi et al. (2013) again report significant differences to the conventional REER and signal an even larger increase in China's real effective exchange rate.

Our paper contributes to the literature by uncovering the underlying drivers of global market shares taking into account the international fragmentation of production. To our knowledge, this is the first attempt to merge decomposition of changes in gross market shares (which basically distinguish between changes in demand and supply structures and pure growth or performance effects, see for example Cheptea et al., 2014) with the new concept of value added in trade. Despite some similarities to methodology proposed by Bems and Johnson (2012), our approach differs from the value-added REER in several aspects. First, we work with highly disaggregated trade data. Hence, we can relax the restrictive assumptions of McGuirk (1987) that are still necessary for REER calculations: changes in individual product

prices can differ from those of an aggregated price index and the elasticity of substitution varies for each commodity in our analysis. Second, our decomposition extends beyond price factors as we evaluate the abovementioned factors that can affect changes in observed market shares: price and cost factors, extensive margin, shifts in global demand structure and global production chains, changes in the set of competitors, and, finally, residual non-price factors that to a large extent (but not solely) can be attributed to quality and taste factors. Hence, we obtain a complex view on a country's global market shares over time.

The starting point is the decomposition of changes in gross export market shares recently developed by Benkovskis and Wörz (2014b). According to the empirical analysis of Benkovskis and Wörz (2014b), price factors fail to explain changes in gross market share dynamics. Thus, residual non-price factors (like quality and taste) play the dominant role in explaining the competitive gains of BRIC countries and the concurrent decline in the G7's share of world exports. This analysis, however, can be significantly affected by shifts in international production chains. Imagine the situation when the final assembly of a high-quality product is moved from US to China. The trade data will report a significant increase in China's exports (both in value and volume terms) accompanied by a growing export price. Despite low domestic value added content in China's exports of the high-quality product, this situation will be interpreted as a rise in quality of China's production and a corresponding decline in US quality. The analysis based solely on gross trade data may lead to wrong policy conclusions. Therefore we augment the decomposition by a term that makes such shifts in national value-added explicit. Moreover, we use different weighting scheme that accounts for value added in exports instead of gross exports.

Our approach combines data from two sources. Similar to traditional analyses, we make full use of highly disaggregated bilateral trade data in the UN Comtrade database. We extract export data at the most detailed 6-digit HS level, thus our analysis is based on more than 5,000 products for each possible pair of trading partners in the world. In addition, we make further use of the recently constructed World Input-Output database (WIOD, see Timmer et al., 2012; Dietzenbacher et al., 2013), which covers 27 EU countries and 13 other major countries for the period from 1995 to 2011. By combining these two data sources, we are able to incorporate global value chains (GVCs) into the decomposition of changes in market shares.

Limitations of our approach are mostly determined by data availability. While the use of detailed UN Comtrade data (together with WIOD data) allows relaxing assumptions of a one-for-all elasticity of substitution and disentangling the contribution of price competitiveness, it

comes with a high cost. The statistics on trade in services is by far less detailed and does not provide information on prices, thus we have no final use of services in our analysis (but we still assess an indirect value-added of services sectors in the final use of commodities). Further, detailed data is unavailable for consumption of domestic commodities; consequently, we miss value-added embodied in the production of such goods.

The paper proceeds as follows: Section 2 motivates the use of two data sources in decomposing global market shares and discusses virtues and drawbacks of each source. Section 3 describes the methodology in detail, while section 4 reports the results and section 5 concludes.

2 Joining two data sources – why and how?

Joining trade data with input-output data is not new in the literature. For example, various vintages of the Global Trade Analysis Project (GTAP) database contain country-specific input-output tables and bilateral international trade data by industry for several benchmark years, with the latest database offering data for 129 regions, 57 commodities and two reference years, 2004 and 2007 (Narayanan et al., 2012). Koopman et al. (2010; 2014), Daudin et al. (2011), and Johnson and Noguera (2012) use this data to measure value-added trade. The more recently established World Input-Output Database (WIOD) combines information from national supply and use tables, National Accounts time series on industry output and final use, and bilateral trade in goods and services for 40 countries, 59 commodities and over a time-series from 1995 to 2011 (see Timmer et al., 2012; Dietzenbacher et al., 2013, for more details on the database and Stehrer, 2012, for empirical calculations based on WIOD). We will make use of this dataset, although our paper differs substantially from both approaches. In short, we combine WIOD data with highly disaggregated bilateral commodity trade data. This is similar to Koopman et al. (2014) who also use the most detailed level of disaggregation to identify intermediate goods; however, we do it for an additional reason – disaggregated trade data is needed to interpret unit values as prices of cross-border transactions.

There is another distinction between our paper and the vast literature on vertical specialisation: disaggregated trade data remains our main source of information, while inputoutput data serves as a useful extension. We want to retain the numerous virtues of very detailed commodity trade data – high degree of harmonization across countries, timeliness, world-wide coverage, availability of price information (unit values) – as these features make disaggregated trade data a natural choice for the assessment of a country's performance on a global market. The dataset of UN Comtrade contains annual data on imports² of 191 countries from 238 countries between 1996 and 2012.³ We use trade data from this data set at the six-digit level of the Harmonized System (HS) introduced in 1996 (5,132 products).

The use of highly detailed trade data allows to disentangle price and non-price drivers of export market share changes; however, the use of trade data also implies several limitations. One of those is the disregard of international production fragmentation, which may alter the assessment of a country's performance on external markets dramatically. The WIOD data, although available for a considerably smaller set of countries (40 countries, including all EU-27 members), at a lower level of disaggregation (59 products according to CPA classification), and with a time lag (offering annual data between 1995 and 2011), can fill this gap.⁴ The data from WIOD gives an opportunity to calculate the share of country *k* in the production of good *g* exported by country *c* using the inverse Leontieff transformation, which allows to switch from gross export market share changes. In other words, we trace a country's value added globally. Thus, we will be able to infer something about the performance of domestic producers (not exporters) on external markets, which should improve our understanding of strong and weak sides of a country.

The lower level of disaggregation in WIOD imposes some difficulties, and we need to assume an equal structure of value added for all HS 6-digit level products within a broad CPA category. This is a very strong assumption, but we have no alternative for a broad analysis at the macro level. To some extent, we homogenise the structure of value added within a broad CPA category by restricting the analysis to final use products (see discussion in section 3.1). Another limitations is the lower country coverage (now calculations can be done for 40 exporter and producer countries instead of 189), but this is an acceptable limitation for us as

 $^{^2}$ Since our theoretical framework is developed from consumer's utility maximization problem we analyse changes in export market shares using information on import data of partner countries. This has the further advantage that import data is often better reported, especially since the majority of world imports is still flowing into advanced economies with better reporting systems.

³ WIOD handles mainland China and special administrative regions (SARs) of China, i.e. Hong Kong and Macao as one economic entity (see Dietzenbacher et al., 2013). In order to harmonize the trade data from UN Comtrade with WIOD, we merged imports of China, Hong Kong and Macao, while flows between China and the SARs were netted out. Thus, our trade database contains imports of 189 countries from 236 exporting countries.

⁴ Note that imports of goods in UN Comtrade database is reported in c.i.f. prices, while imports in World Input-Output tables in WIOD are converted from c.i.f. prices to f.o.b. prices (see Dietzenbacher et al., 2013). To overcome this inconsistency, we added international trade and transport margins (i.e. difference between c.i.f. and f.o.b. prices) to inputs. While WIOD provides information about the geographical origin of trade and transport margins, it does not specify the industry that provides international trade and transport services. We attributed all trade and transport margins to wholesale trade (which contributed to approximately half of provided services according to Streicher and Stehrer, 2012). Alternative assumptions on trade and transport margins do not affect results significantly.

we are primarily interested in the performance of the world's major exporters, and especially EU members which are fully covered in WIOD. A final limitation is given by the time dimension as WIOD data ends at 2011.

3 A comprehensive, GVC-compatible decomposition of global market shares

This section describes the methodology we propose to evaluate the performance of a country's producers on external markets. It largely builds on the recently developed decomposition of changes in gross export market shares (see Benkovskis and Wörz, 2014b). We extend this approach to include also the effects of international fragmentation of production in the decomposition. We proceed like this: In the first step, we refine the measurement of market share by tracing each exporter's value added through the entire global value chain (see section 3.1). Second, we distinguish between extensive versus the intensive margin of export growth (see section 3.2). We need to isolate extensive margin developments since those cannot be decomposed further in our theoretical framework. Third, we scrutinize the intensive margin: market shares arising from the intensive margin are affected by shifts in global demand structure (changes in the composition of global trade) and by growth in bilateral trade relationships. The last effect (i.e. the intensive margin of changes in market share of a specific exporter in a specific importing countries) is then split into four components: price effects, changes in the set of competitors, residual non-price effects and a term which captures shifts in a country's integration in global production chains (i.e. changes in the amount of the respective producer's value added in global production chains, see section 3.3).

3.1. Value-added export market share

The international fragmentation of production changed the nature of the international economy dramatically and gross exports are no longer a valid indicator of a country's external performance. In the majority of cases, goods exported by a specific country are only partly produced domestically, in some cases the fraction of domestic value added is very small (see e.g. Linden et al., 2009). This calls for a refined indicator which is able to capture the ongoing fragmentation process. In this paper, we propose to focus on market shares of value-added in exports, i.e. gross exports corrected for the source of value added.

Hummels et al. (2001) provide one of the first systematic evidences on vertical specialisation and measure the value of imported inputs embodied in exported goods. This approach captures forward linkages but also misses an important part of vertical specialisation

as exports of one country may be used as inputs into another country's production of export goods (backward linkages). Recently, Koopman et al. (2010; 2014), Daudin et al. (2011), and Johnson and Noguera (2012) proposed new approaches to assess value-added trade.

Two important measures are worth being mentioned here. The first one is called "value added in gross exports" (VAS, as denoted in Koopman et al., 2010; closely related to value added in trade, as named by Stehrer, 2012) and decomposes gross exports by producer countries:

$$VAS = V \cdot B \cdot X = V \cdot (I - A)^{-1} \cdot X, \tag{1}$$

$$V = \begin{bmatrix} V_1 & 0 & \cdots & 0 \\ 0 & V_2 & \cdots & 0 \\ \vdots & \vdots & \ddots & \vdots \\ 0 & 0 & \cdots & V_K \end{bmatrix}, \quad V_r = u \left(I - \sum_s A_{sr} \right), \quad X = \begin{bmatrix} diag(X_1) & 0 & \cdots & 0 \\ 0 & diag(X_2) & \cdots & 0 \\ \vdots & \vdots & \ddots & \vdots \\ 0 & 0 & \cdots & diag(X_K) \end{bmatrix},$$

where VAS is a $K \times KN$ matrix that provides disaggregated value added by producer country in gross exports for each exporting country and sector, K is the number of countries and N is number of sectors. V is $K \times KN$ block-diagonal matrix, V_r is $1 \times N$ direct value-added coefficient vector and each element gives the share of direct domestic value added in total output of country r in each sector (r = 1, ..., K). Input-output coefficients are comprised in the $KN \times KN$ matrix A, which is constructed from the $N \times N$ blocks A_{rs} . Those blocks contain information on intermediate use by country s of the goods produced in country r. X is a $KN \times KN$ diagonal matrix of gross exports, and X_r is a $N \times 1$ vector of country r's exports by sector. Finally, B is the Leontieff inverse matrix $B = (I - A)^{-1}$, and u is a 1×N unity vector. So, the VAS measure captures all upstream sectors' contributions to value added in gross exports.

The second measure, introduced by Johnson and Noguera (2012), is termed "valueadded exports" or "value-added trade" (VAX). It is closely related to value added in gross exports (VAS), but differs insofar as it reflects how a country's exports are used by importers. As defined by Koopman et al. (2014, p.462), value-added exports "... is value added produced in source country s and absorbed in destination country r". This is given by:

$$VAX = \hat{V} \cdot B \cdot Y = \hat{V} \cdot (I - A)^{-1} \cdot Y,$$

$$\hat{V} = \begin{bmatrix} \hat{V}_1 & 0 & \cdots & 0 \\ 0 & \hat{V}_2 & \cdots & 0 \\ \vdots & \vdots & \ddots & \vdots \\ 0 & 0 & \cdots & \hat{V}_K \end{bmatrix}, \quad \hat{V}_r = diag(V_r),$$
(2)

where VAX is $K \times KN$ matrix that provides disaggregated value added by producer country in final consumption for each country and each sector. Y is the $KN \times K$ final demand matrix. It

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contains blocks Y_{sr} , which is the $N \times 1$ final demand vector that gives demand in country *r* for final goods shipped from country *s*.

Although seemingly similar, the two indicators (*VAS* and *VAX*) give different results, as *VAS* focuses on gross exports – thus including exports and intermediate goods and therefore double-counting some value-added activities – while *VAX* focuses on final use, including the a country's demand for its own production (which is given by the diagonal element of *VAX;* Koopman et al., 2014, p.480, suggest that these elements should be excluded from the analysis).

Despite these clear conceptual underpinnings, we face a difficult choice in the empirical implementation: should we use highly detailed trade data (i.e. rely on *VAS*) or more aggregated, but double-accounting-free final demand data (basing our indicator on *VAX*)? The main advantage when using data on gross export flows available from commodity trade statistics is that we can work with prices (unit values) and volumes on a very detailed level. This information allows us to identify the contribution of price and non-price factors for the overall performance of value-added exports (see Benkovskis and Wörz, 2014b). Obvious drawbacks of this choice are the complete lack of data on trade in services on the one hand and double-counting due to exports of intermediate products on the other hand.⁵ In contrast, with final demand data we avoid the double-counting problem and we can include information on services. However, we will not be able to study price and non-price contributions due to the lack of detailed price and volume data.

In this paper we propose to use the *VAS* indicator from equation (1), although we modify it such that we avoid double-counting of value-added. Double-counting occurs when a country provides value added in exports of intermediate goods that are further used in the exports of final goods. Clearly, this problem can be eliminated by analysing only gross exports of final use products. Since we obtain trade data at a very fine level of disaggregation, we can exclude exports of intermediate products (according to the BEC⁶) and focus on products for final use. This seems justified, as the Leontieff transformation traces value added through all importing and exporting countries. The production of one final product may include value added from multiple countries whereby the value added from a specific country

⁵ The WIOD data shows that the problem of double-counting is rather serious, as value-added exports exceeded exports in value-added approximately 2.5 times for almost all countries in 2011.

⁶ We define the following groups as final use products: primary food and beverages mainly for household consumption (111), processed food and beverages mainly for household consumption (122), capital goods except transport equipment (41), passenger motor cars (51), other transport equipment (52), and consumer goods not elsewhere specified (6). As a result, 1,920 HS 6-digit level products out of 5,132 are classified as final use products, of which 682 are consumption products and 1,238 are capital goods.

can cross the same national border more than once (i.e. if an intermediate good is exported for processing and re-imported to be further processed at home before being exported to final assembly).

While avoiding double-counting, confining ourselves to trade in final goods only has two drawbacks. First, trade data allows to analyse final products of foreign origin, but provides no information on domestic products. Therefore, we miss the value added embodied in exports of intermediate products that are further processed and consumed in the same country. This is a significant loss of information and it is impossible to fill this gap with disaggregated data. This drawback should be kept in mind while interpreting the results. Second, final use of domestic goods and of services is missing, but this does not imply that we totally exclude service sectors from the analysis. We still assess the indirect value-added of services sectors in final use of commodities.⁷

Summarizing the discussion above, in building our comprehensive index we propose to solve the problem of international fragmentation by relying on a country k's market share in terms of value added in gross exports of final use products (VASF) rather than gross exports. Thus, we make use of the advantage of the *VAS* index insofar as we use highly disaggregated trade data for both, values and quantities to distinguish between price and non-price factors. At the same time we avoid double counting by ignoring intermediate goods. Our measure of value added market share is defined as follows:

$$MS_{k,t}^{VASF} = \frac{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}{\sum_{v \in C} \sum_{i \in I} \sum_{g \in G} \sum_{c \in C} P(i)_{gc,t} M(i)_{gc,t} V(v)_{gc,t}} = \frac{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t}},$$
(3)

where $MS_{k,t}^{VASF}$ is VASF market share of a country k, i is a running index for importing countries, g denotes the final use product, c the exporting country and v stands for valueadded contributing countries. Note the differentiation between producing country k (the contributor of value added) and exporting country c. $M(i)_{gc,t}$ represents the quantity of country i's final goods imports from exporting country c (or country c's final goods exports to country

⁷ The *VAS* index reduced to final use products provides close approximation to *VAX*. Of course, one needs to exclude final use of services and final use of domestic products to make this comparison correct, since we miss detailed information on international trade in services and domestic use while calculating VASF. After two abovementioned necessary corrections, the ratio of VASF to *VAX* in 2011 is 1.04 for Germany, 1.01 for France, 0.93 for the UK, 0.97 for Italy, 0.90 for Canada, 1.12 for Japan, 0.98 for the US. The difference is larger for BRIC countries: ratio of 0.85 for Brazil, 1.16 for China, 0.74 for India and 0.64 for Russia. The large discrepancy for Russia is obviously driven by the fact that all fuels and lubricants (BEC 3) were treated as intermediate products. One should also to take into account different prices of trade flows (imports in c.i.f. for UN Comtrade and f.o.b. in WIOD), and the fact that WIOD is based on the National Accounts concept. Overall, these ratios are rather stable since 2000 (with exception of China, for which the ratio stabilizes only around 2007). VASF to *VAX* ratios prior to 2000 have larger discretion from unity that may reflect lower relevance of BEC revision 4 classification (2003) for earlier data.

i), while $P(i)_{gc,t}$ is the price of the respective trade flow. $V(k)_{gc,t}$ stands for the share of country k in the production of a specific good g exported by country c. Note, that $V(k)_{gc,t}$ includes both direct and indirect contributions of country k and is evaluated as an element of $V \cdot (I - A)^{-1}$ from equation (1), assuming that the value-added structure of country c's final exports does not depend on the respective destination.⁸ Finally, I, G and C are the sets of importing countries, final use HS 6-digit products, and exporting countries respectively whereby the latter set coincides with the set of producing countries. Therefore, the numerator of (3) shows the value-added of country k in total world's exports of final products, while the denominator represents total world exports of final goods.

3.2. Intensive and extensive margins

Having derived a country k's world market share in value added terms, we then follow the framework of Benkovskis and Wörz (2014b) and expand equation (3) in order to split changes in these market shares into the contributions arising from the extensive and the intensive margin:

$$dMS_{k,t}^{VASF} = \frac{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t}} \frac{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t-1} M(i)_{gc,t-1}}{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t}} V(k)_{gc,t}} \frac{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t-1} M(i)_{gc,t-1} V(k)_{gc,t-1}}{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}} \frac{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t-1} M(i)_{gc,t-1} V(k)_{gc,t-1}}{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}} \frac{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t-1} M(i)_{gc,t-1} V(k)_{gc,t-1}}{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}} \frac{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t-1} M(i)_{gc,t-1} V(k)_{gc,t-1}}}{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t-1} M(i)_{gc,t-1} V(k)_{gc,t-1}}},$$

$$dIM_{k,t}^{VASF} = \frac{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t-1} M(i)_{gc,t-1} V(k)_{gc,t-1}}},$$

where $dEM_{k,t}^{VASF}$ denotes extensive margin of the value added in gross exports of final goods market share changes, $dIM_{k,t}^{VASF}$ the intensive margin, $G(i)_{c,t,t-1}$ is the subset of final use products shipped from country *c* to country *i* in both periods, *t* and *t*-1.

In a globally integrated world, the extensive margin concept is less clear, since all producers are providing at least some value added to virtually all products (due to Leontieff inverse matrix B in equation (1)). The extensive margin is still defined on a product level (i.e. new or disappearing product exported to a certain destination), but its contribution to changes in VASF market shares is distributed across all producers according to value added structure. Generally, the necessity to isolate the extensive margin contribution is driven by the fact that

⁸ As mentioned in section 2, $V(k)_{gc,t}$ is calculated from the WIOD database by assuming identical value added structure of all final use products g in the HS 6-digit classification falling within the same CPA category.

it cannot be decomposed further into price and non-price factors in Armington (1969) framework.

The extensive margin equation is similar to Feenstra's (1994) index accounting for changes in import variety, but redefined for the value-added case. The extensive margin is defined as the change in the ratio of country k's value added in total exports to value-added in traditional exports. Value added in traditional products is the value added in final use products exported by any country to any destination market in both periods t and t-1. The ratio increases (decreases) over time if the share of value added in disappeared products is smaller (greater) than the share of value added in newly exported products. In this case, the contribution of the extensive margin to changes in VASF market share is positive (negative). The intensive margin is obtained as the residual and simply represents the growth of country k's value added in traditional final use products compared to growth of total world trade in final use goods.

While extensive margin cannot be decomposed any further in our framework (ideally, one would need to relate market entries and exits with firm-level characteristics), more can be done with intensive margin.

3.3. Further decomposition of the intensive margin

A country's exports along the intensive margin may grow or diminish because of changes in exports of country *k* to recipient country *i*. This refers to the intensive margin in any bilateral trade relationship $dIM(i)_{k,t}$ (i.e. the contribution of intensive margin growth to changes in VASF market share in a single destination country *i*). However, the aggregation of bilateral trade relationships to obtain an exporter's world market share is further complicated by the fact that the structure of world trade changes over time. In other words, changes in trade value between third countries affect an individual exporter's global market share. Thus, as a first step in the decomposition of the intensive margin, we distinguish between the bilateral intensive margin and changes in the global weight of each exporter's bilateral trading partner. To account for the latter effect, we explicitly allow for different growth rates of various destination markets (importing countries). The term $dDS(i)_t$ captures changes in the intensive margin due to shifts in the recipient country's share in world imports:

$$dIM_{k,t}^{VASF} = \sum_{i \in I} s(i)_{k,t-1}^{X} dDS(i)_{t} dIM(i)_{k,t}^{VASF},$$
(5)

$$dDS(m)_{t} = \frac{\sum_{c \in C} \sum_{g \in G} P(m)_{gc,t} M(m)_{gc,t}}{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t}} \frac{\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t-1} M(i)_{gc,t-1}}{\sum_{c \in C} \sum_{g \in G} P(m)_{gc,t-1} M(m)_{gc,t-1}}, \quad s(i)_{k,t}^{X} = \frac{\sum_{g \in G} P(i)_{gk,t} M(i)_{gk,t}}{\sum_{i \in I} \sum_{g \in G} P(i)_{gk,t} M(i)_{gk,t}}$$

$$dIM(i)_{k,t}^{VASF} = \frac{\sum_{c \in C} \sum_{g \in G(i)_{c,t,t-1}} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}{\sum_{c \in C} \sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t}} \frac{\sum_{c \in C} \sum_{g \in G} P(i)_{gc,t-1} M(i)_{gc,t-1}}{\sum_{c \in C} \sum_{g \in G(i)_{c,t,t-1}} P(i)_{gc,t-1} V(k)_{gc,t-1}} V(k)_{gc,t-1}}$$

where $s(i)_{k,t}^{X}$ is the share of partner country *i* in exporter *k*'s exports.

We then proceed by decomposing the bilateral intensive margin $(dIM(i)_{k,t})^{VASF}$ into four factors: price factors, changes in the set of competitors for the same product at the same destination market, shifts in the integration into global value chains, and other non-price factors. This decomposition is done by solving the consumer utility maximization problem of the importing country *i* as in Benkovskis and Wörz (2014a).

We depart from a nested, three-level, CES utility function. Consumers gain utility from consuming domestic and imported goods. For simplicity we assume one homogenous domestic good and a composite import good with a constant elasticity of substitution among the two at the outer nest. At the second level, consumers can choose between different import goods $g \in G$ with a constant elasticity of substitution between goods $(\gamma(i))$.⁹ At the inner nest, each product can be sourced from a different exporter whereby source countries represent individual varieties of a good denoted by $c \in C$. The elasticity of substitution between varieties is given by $\sigma(i)_g$. Further, a valuation parameter $Q(i)_{gc,t}$ is added at the inner nest such that imports of a certain variety are weighted by non-price factors that reflect product quality, consumers' tastes, labelling, etc.¹⁰

The solution to the utility maximisation problem in the importing country subject to the consumer's budget constraint gives a minimum unit-cost function, which corresponds to the price of utility obtained from imported good g. The important point to note is that minimum unit cost depends not only on prices, but also on non-price factors as a better quality or higher valuation by the consumer offsets for a higher price in terms of derived utility.

We apply this import price index to export prices of source countries, which allows to decompose the bilateral intensive margin into various components, including price and nonprice factors. Equation (6) summarizes the decomposition of bilateral intensive margin

⁹ The nesting order follows one used by Broda and Weinstein (2006). Although the order, when consumers first choose between products, seems more natural and intuitive, the nesting order we use is driven by the data availability. Since we do not have detailed statistics on consumption of domestic products, domestic and imported goods should be separated at the first stage.

¹⁰ As our theoretical framework is based on consumer utility maximization only, we cannot differentiate between product quality and consumer taste for certain products. This could be done in a framework where firms' behaviour is modelled explicitly like in Feenstra and Romalis (2014), or by obtaining information on products' characteristics like in Sheu (2014). However, both approaches would limit the empirical application of our decomposition as such a more complicated theoretical framework requires additional information typically obtained from micro data on firms or products. Such information is in general not available for a global analysis of trade flows.

(technical details of the derivation are outlined in appendix sections A.1 and A.2 as they follow in essence Benkovskis and Wörz, 2014b):

$$dlM(i)_{k,r}^{VASF} = \underbrace{PP(i)_{k,r}^{VASF}}_{i} \underbrace{CC(i)_{k,r}^{VASF}}_{i} \underbrace{QQ(i)_{k,r}^{VASF}}_{i} \underbrace{QQ(i)_{k,r}^{VASF}}_{i} \underbrace{VV(i)_{k,r}^{VASF}}_{i} =$$

$$= \underbrace{\sum_{g \in G(i)_{k,r,r-1}} \sum_{c \in C} \left[w(k,i)_{gcr}^{VASF} \left(\frac{\pi(i)_{gcr}}{\prod_{m \in C(i)_{g}} \pi(i)_{gmrl}^{W(i)_{mrr}}} \right)^{1-\sigma(i)_{g}} \left(\frac{\prod_{r \in C(i)_{g}} \pi(i)_{gmrl}^{W(i)_{mrr}}}{\prod_{r \in C(i)_{g}} \pi(i)_{gmrl}^{W(i)_{mrr}} \frac{\pi(i)_{gmrl}^{W(i)_{mrr}}}{\prod_{r \in C(i)_{g}} \pi(i)_{gmrl}^{W(i)_{mrr}} \frac{\pi(i)_{gmrl}^{W(i)_{mrr}}}{\prod_{r \in C(i)_{g}} \pi(i)_{gmrl}^{W(i)_{mrr}} \frac{\pi(i)_{gmrl}^{W(i)_{mrr}}}{\prod_{r \in C(i)_{g}} \pi(i)_{gmrl}^{W(i)_{gmrl}} \frac{\pi(i)_{grr}}{\prod_{r \in C(i)_{g}} \pi(i)_{gmrl}^{W(i)_{gmrl}} \frac{\pi(i)_{gmrl}}{\prod_{r \in C(i)_{g}} \pi(i)_{gmrl}} \right)^{1-\sigma(i)_{gmrl}} \times \\ \times \underbrace{\sum_{g \in G(i)_{k,r,r-1}} \sum_{c \in C} \left[w(k,i)_{gcr}^{VASF} \frac{q(i)_{gcr}}{\prod_{m \in C(i)_{g}} q(i)_{gmrl}} \left(\frac{\prod_{m \in C(i)_{g}} q(i)_{gmrl}^{W(i)_{gmrl}}}{\prod_{r \in C(i)_{g}} \prod_{m \in C(i)_{g}} \pi(i)_{gmrl}} \right)^{1-\sigma(i)_{gmrl}} \right)^{1-\sigma(i)_{gmrl}} \times \\ \times \underbrace{\sum_{g \in G(i)_{k,r,r-1}} \sum_{c \in C} \left[w(k,i)_{gcr-1}^{VASF} \frac{q(i)_{gcr-1}}{\prod_{m \in C(i)_{g}} q(i)_{gmrl}} \left(\frac{\prod_{m \in C(i)_{gmrl}} q(i)_{gmrl}^{W(i)_{gmrl}} \frac{1}{\prod_{r \in C(i)_{gmrl}} \pi(i)_{gmrl}} \frac{1}{\prod_{r \in$$

where $PP(i)_{k,t}^{VASF}$ is the contribution of price factors, $CC(i)_{k,t}^{VASF}$ the contribution of changes in the set of exporters (i.e. changes in the set of competitors from the exporting countries point of view), $QQ(i)_{k,t}^{VASF}$ the contribution of other non-price factors (changes in taste or quality), and $VV(i)_{k,t}^{VASF}$ is the contribution of geographical shifts in international production chains. Finally, $w(i)_{gc,t}$ and $w(i)_{g,t}$ are Sato-Vartia weights representing the structure of country *i*'s imports, $\lambda(i)_{j,t}$ is Feenstra's (1994) seminal term that takes into account utility gains arising from changes in varieties available to consumers in country *i*'s.¹¹

Let us illustrate the interpretation of the decomposition in equation (6): The first term represents the contribution of price factors to country k's global market shares and is similar to the term derived by Armington (1969). This term is analogous to a real effective exchange rate based on unit values and accounting for market characteristics – relative price changes have larger consequences in markets with a higher elasticity of substitution. Note that we refer to relative price changes for VASF of country k, not about gross exports (in contrast to

¹¹ This decomposition is similar to the one proposed in Benkovskis and Wörz (2014b), but it offers two important innovations: First, due to the different weighting scheme (accounting for value added in exports), the interpretation of all components changes. Second, we obtain a separate term that identifies shifts in global value chains.

Benkovskis and Wörz, 2014b).¹² Therefore, we use value-added weights that are calculated as the ratio of value added in the particular trade link relative to total value added exported to country i.

The second term captures the contribution of changes in the set of competitors to gains or losses in country k's VASF market shares. This term accounts for changes in the set of competitors in all final product markets, which is tantamount to increasing or decreasing variety from the consumer's point of view. Hence, it influences consumers' choice among various final use products and thus affects an exporter's ability to sell.

The third term represents the contribution of other non-price factors (such as taste, labelling, quality and the like) to a country's global market shares. Again, value-added weights are used to calculate the aggregate contribution. We would like to stress that we take into account relative changes in other non-price factors for any final use product exported by any country and aggregate these results using the VASF structure of country k.¹³ Despite the fact that the valuation parameter capturing other non-price factors is unobservable, the third term can be calculated as a residual (note, that all other components are observable):

$$QQ(i)_{k,t}^{VASF} = \frac{dIM(i)_{k,t}^{VASF}}{PP(i)_{k,t}^{VASF} CC(i)_{k,t}^{VASF} VV(i)_{k,t}^{VASF}} =$$

$$= \sum_{g \in G(i)_{c,t,t-1}} \sum_{c \in C} \left(w(k,i)_{gc,t}^{VASF} \frac{\mu(i)_{gc,t}}{\prod_{g \in G} \prod_{c \in C(i)_{g}} \mu(i)_{gc,t}^{w(i)_{gc,t}}} \left(\frac{\pi(i)_{gc,t}}{\prod_{m \in C(i)_{g}} \pi(i)_{gm,t}^{w(i)_{gm,t}}} \right)^{\sigma(i)} \left(\frac{\prod_{m \in C(i)_{g}} \pi(i)_{gm,t}^{w(i)_{gm,t}}}{\prod_{j \in G} \prod_{m \in C(i)_{g}} \mu(i)_{jm,t}^{w(i)_{jm,t}} W(i)_{j,t}}} \right)^{\gamma(i)} \times \\ \times \left(\frac{\lambda(i)_{g,t}}{\lambda(i)_{g,t-1}} \right)^{\frac{\sigma(i)_{g} - \gamma(i)}{1 - \sigma(i)_{g}}} \prod_{j \in G} \left(\frac{\lambda(i)_{j,t}}{\lambda(i)_{j,t-1}} \right)^{\frac{(\gamma(i) - \sigma(i)_{j})w(i)_{j,t}}{1 - \sigma(i)_{g}}} \right),$$
(7)

 $\mu(i)_{gc,t} = M(i)_{gc,t} / M(i)_{gc,t-1}.$

Equation (7) reflects the fact that observed variables contain useful information for the derivation of a proxy that captures the impact of other non-price factors in shaping a country's position. We can see that price dynamics is an important proxy (but not the determinant) of changes in relative quality or taste. If the price of a good imported from one country rises faster than the price of the same good imported from another country, this indicates either improving quality of or increasing preference for the first country's good. Moreover, when different varieties are close substitutes, the role of relative prices as a proxy for relative

¹² In the empirical implementation we are forced to assume that price changes of the final product are equally distributed at all stages in the international production chain due to data limitations.

¹³ One restrictive assumption we make here is that quality changes are identical on all stages of production. This is analogous to the assumption above concerning the distribution of price changes along the production chain.

quality increases. It should be noted, however, that relative price is not the sole indicator of relative taste and quality. Changes in relative quantity of a single variety in total consumption also reflect the perception of changes in relative taste and quality. Increasing consumption of a certain variety is a clear sign of improving taste or quality, and relative quantity gains importance when the elasticity of substitution is small. Equation (7) shows how unobservable changes in other non-price factors are proxied for by changes in relative prices and real market shares. The last two terms of equation (7) are less intuitive. They are driven by the interaction between taste/quality and variety. Our calculations show that the role of the last two terms is negligible in empirical estimations.

Although the first three terms in equation (6) above represent the same determinants of global market share as those resulting from the decomposition proposed in Benkovskis and Wörz (2014b), the different weighting scheme implies an important change in interpretation: Equation (6) analyses market shares of all final use products exported by all countries, taking into account country k's value added in each exported product when aggregating the measure to the country level. Hence, the focus shifts from country k's direct exports to a broader perspective, as – at least theoretically – virtually all exported final use products in the world may contain some (indirect) input from country k.

Finally, an additional term appears in equation (6) as a consequence of shifting the focus from gross to value added exports. The last term $VV(i)_{k,t}$ measures shifts in global value chains. It implies that an increase in country *k*'s value-added in the production of exports positively affects VASF market share. Such an increase can be achieved either by a higher domestic content in country *k*'s gross exports or by more active involvement in GVCs leading to a higher value-added share in other countries' exports of final use products. We calculate growth in VASF market share for each exported final use product and then aggregate to the country level using Laspeyres-weights of country *k*'s value added exports in final goods ($w(k,i)_{gc,t}$ VASF).

To sum up, from the exporter's point of view, the intensive margin of changes in export market share is decomposed into five parts: global demand shifts, price factors, changes in the set of competitors, other non-price factors, and shifts in global production chains.

Let us make a final technical remark on the elasticities of substitution (σ 's and γ 's). We estimate elasticities of substitution between varieties (σ 's) following the approach proposed by Feenstra (19994) and developed by Broda and Weinstein (2006) and Soderbery (2010, 2012). Technical details on the methodology and obtained estimates for 20 largest destination countries are provided in Appendix A.4. The elasticity of substitution between goods (γ 's) are

calibrated to 2 for all destination markets, which is below the median substitutability among varieties (see Appendix, Table A.1). This also corresponds to the elasticity used by Romer (1994). Benkovskis and Wörz (2014b) showed that the conclusions about the decomposition of gross exports market share changes are robust for alternative (and reasonable) values of γ 's.

4 Results

We apply the proposed decomposition to global trade over the period 1996 to 2011. We present cumulative changes in world market shares for the G7 and four largest emerging economies for both, gross export markets shares and market shares based on value added in exports. The evolution of market shares and the decomposition of changes therein are illustrated by charts 1–3. The first column in each chart reports the decomposition of VASF market share changes, and the difference between VASF and gross export market share changes and its decomposition is exhibited in the third column. Chart 1 shows the results for European G7 countries (France, Germany, Italy and the UK), Chart 2 is devoted to the non-European G7 (Canada, Japan and the US), and Chart 3 describes the decomposition for largest emerging economies (Brazil, China, India and Russia).¹⁴

4.1. Cumulative changes in gross versus value added export market shares

Let us first compare total cumulative changes in VASF markets shares over the period 1996-2011 to total cumulative changes in gross export market shares (solid lines in all charts). As a first important observation, G7 countries lose market shares, while BRIC countries gain. This holds true for both, gross and value added market shares. As a second observation, the difference between changes in cumulative VASF and gross export market shares in final goods is surprisingly small.¹⁵

¹⁴ The log-linear approximation of the VASF market share decomposition is described in Appendix, section A.3. Note that for computational reasons the sum of these contributions does not exactly correspond to changes in VASF market shares (as it should theoretically) due to the log-linear approximation and missing information on unit values.

¹⁵ Note that this does not imply that gross export and VASF market shares are similar – in fact the level of gross export and VASF market shares differs significantly. Our results only suggest that both market shares exhibit similar dynamics.





Source: WIOD, UN Comtrade, authors' calculations



Chart 2. Decomposition of gross exports and value-added in gross exports market share changes of final use products for non-European G7 countries

Source: WIOD, UN Comtrade, authors' calculations

However, we can still observe several interesting regularities. In some G7 countries (Canada, the UK and to a lesser extent the US) the difference between the two lines is more pronounced and VASF market share dynamics report smaller losses than suggested by conventional gross export market shares (see the third column in Charts 1 and 2). These countries show the strongest degree of outsourcing¹⁶ among the G7-countries in our data in 2011; also Canada and the UK show a pronounced decrease in the share of directly exported

¹⁶ We calculate the degree of outsourcing as the ratio between value added embodied in domestic exports of final use products and total value added embodied in world exports of final use products. The decrease of this ratio implies that a country moves upstream in the global value chain and thus increases its indirect participation in the production (and export) of final use products.

goods over the observation period.¹⁷ Thus, the better performance in value added terms can be attributed to the outsourcing of final production stages to other countries and is in line with evidence that these countries move upstream along the value chain, away from the final consumer (see De Backer and Miroudot, 2013). In line with their lower degree of outsourcing, the difference between VASF market shares and export market shares is marginal for other European G7 countries (France, Germany, Italy) and for Japan. It is further interesting to note that Germany performs slightly better in gross exports as compared to VASF market shares.

As for the BRIC countries, VASF market shares suggest smaller gains for China and Brazil in the middle of the sample period as compared to gains in gross export market shares, whereas in 2011 cumulative gains in VASF terms matched or even outperformed cumulative gains in gross export terms. China is clearly the most downstream country in the entire sample in the sense that it shows the lowest degree of outsourcing -almost 90% of Chinese VASF exports arise from final assembly in China¹⁸ and China has gained enormous importance as a destination for final assembly by other exporters. Likewise, Germany appears to have gained importance as final assembly exporter - China and Germany are the only two partners featuring among the top-five destinations for indirect exports via foreign final assembly for all countries in our sample. Potentially this downstream movement in the production chain explains the worse performance of value added market shares compared to gross export market shares for Germany. For Brazil and even more so for Russia, VASF market share growth indicated considerably larger gains than gross export market share growth. Russia has by far the highest degree of outsourcing, only less than 30% of all exports are due to final assembly in the country in 2011, which is obvious given its export structure. Hence, the case of Russia is hard to analyse, as the main positive (indirect) contribution to this rise in market shares stems from exports of mineral products. Apart from the dominance of the oil price in driving this result, it also potentially reflects restructuring in Russia's oil industry which has moved away from selling (lower value added) crude oil towards exporting refined (and hence higher value added) oil products. According to Russian customs statistics, the share of oil products in Russian exports of oil and oil products has risen from 25% to 40% between 2003 and 2013 at the expense of the share of crude oil. However, the positive picture drawn here for the Russian economy may still be elusive, as there has been little restructuring in the rest

¹⁷ In 2011, the share of value added embodied in domestic exports of final use products was 67.2% of total value added of world exports of final use products for the UK, 70.9% for the US, 72.0% for Canada, 76.1% for Germany, 77.0% for France, 78.1% for Italy, and 79.3% for Japan. The largest decline between 1996 and 2011 was observed for Canada (12.7pp) and the UK (12.4pp).

¹⁸ In 2011, the share of value added embodied in domestic exports of final use products was 27.9% of total value added of world exports of final use products for Russia, 60.7% for Brazil, 73.7% for India, and 87.6% for China.

of the economy (see also Robinson, 2011). The fact that the Russian economy remains highly concentrated on energy products is also reflected in falling world market shares in final products in our results.



Chart 3. Decomposition of gross exports and value-added in gross exports market share changes of final use products for BRIC countries



4.2. Contributions of shifts in global production chains

Our discussion so far suggests that the increasing international fragmentation of production matters for a country's global market shares. Let us now take a closer look at individual factors shaping VASF market share gains or losses in our sample. In general, price and residual non-price factors contribute most strongly to changes in both, gross export and VASF market shares. However, shifts in global production chains also give a non-negligible positive contribution to changes in market shares of BRIC countries (see Chart 3, column 2), while their contribution is often negative for the G7 countries (France, Germany, Italy, Japan and the US since 2003, see Charts 1–2, column 2). In the case of developed countries, GVC-shifts show a positive contribution only for Canada as well as the UK during the pre-crisis period. By analysing the geographical location of the final assembly, we observe significant shifts from developed countries to China, especially in the following industries: radio, television and communication equipment, office machinery and computers, other machinery and equipment.¹⁹ The same process is observed for Brazil and India, although the magnitude is much smaller. It is interesting to note a shift in the final assembly of motor vehicles from large European countries to the Czech Republic and Slovakia, as well as an increasing integration of motor vehicles production between European G7 countries. We also see the increasing role of Mexico as a final assembly for US value added; similarly, the data show an increasing role of Korea for value added from Japan. However, one should not get an impression that emerging countries increase their presence only at the final stage of the production chain - the process of integration has many dimensions, although with different intensity. For example, China gains greater importance as a provider of intermediate inputs for radio, television and communication equipment assembled in Mexico and Korea, while India increases its value added by participating in television and communication equipment, as well as office machinery and computers made in China.

4.3. Determinants of changes in global market shares for BRICs

The analysis of other factors also gives useful insights into the implications of fragmentation in production for global market shares. If we focus on gross export market shares for BRIC countries (see Chart 3, column 1), the main common feature is an increase in other non-price factors relative to their competitors. Although other non-price factors reflect the unexplained (residual) part of the analysis, it can be loosely related with changes in relative quality of

¹⁹ Detailed results for product groups are available upon request

production or consumer tastes. China, for instance, enjoys the most pronounced increase in other non-price factors, which is in line with conclusions from other researchers on improving quality of exports (see e.g. Pula and Santabárbara, 2011, Fu et al., 2012). Price competitiveness also has a positive, although secondary role in skyrocketing China's gross export market share. We also observe smaller, but still positive contributions of other non-price factors for India since 2004. Results for Brazil show a dominant contribution of price and cost factors before 2003, while non-price factors improve afterwards (although the cumulative contribution still remains negative due to losses in relative quality in the first half of the sample). Growing oil prices negatively affect Russia's price competitiveness, while we do not observe strong gains in non-price factors with respect to final goods gross exports.²⁰

The story changes significantly when GVCs enter the analysis (see Chart 3, columns 2 and 3). The huge VASF markets share gains of China are still positively affected by non-price factors, but the size of the contribution reduces dramatically and two thirds of gains are driven by price and costs factors. Thus, introduction of international fragmentation reduces the unexplained part of global market shares dynamics for China (although the positive contribution of other non-price factors still may signal the important role of quality improvements). As regards other BRIC countries, the other non-price factors do not play any positive role now. The third column of Chart 3 shows that analyses based on conventional gross trade flows overestimate the contribution of other non-price factors for BRICs. We interpret this finding from two different angles. First, the abovementioned improvement in quality or consumer valuation of export products from emerging economies arose mainly from the outsourcing of higher-quality production stages rather than from improvements in domestic production. Second, the role of other non-price factors (evaluated as residual) declined, since introducing global value chains into analysis improves our ability to explain dynamics of market shares by changes in relative prices. The contribution of price and cost factors to market share gains is underestimated when the international fragmentation of production is ignored.

These findings conflict with Bems and Johnson (2012) and Bayoumi et al. (2013), who report a higher appreciation for China when using REER in Tasks and REER in Goods.²¹ This outcome, however, is mostly driven by the fact they compare their modified REER indices

²⁰ Ahrend (2006) concludes that competitiveness gains of Russia are concentrated in narrowed sectors of raw commodities. This may explain the bad performance in exports of final use products which we observe here.

²¹ More specifically, Bems and Johnson (2012) report that China's value-added REER appreciated by 20pp more than the traditional REER between 2000 and 2009. Bayoumi et al. (2013) also claim higher appreciation, although the difference with conventional REER is smaller.

(based on GDP deflators) with traditional CPI-based REERs (as mentioned above). As noted by Bems and Johnson (2012), the difference between CPI and GDP deflators can be decomposed into the difference between value added versus gross output prices on the one hand (reflecting the change in the concept from gross to value added trade) and difference between gross output prices and consumer prices on the other hand (simply reflecting an approximation error, as the CPI is usually chosen for pragmatic rather than economic reasons). While this decomposition cannot be done for China, we observe from their results that the second component dominates in the case of Germany, the UK, as well as Japan and the US before 2005 (see Bems and Johnson, 2012, Figure 3). Moreover, the "REER in Tasks" for China appreciates more strongly again because of the difference between CPI and GDP deflators, while the change in weighting structure by itself implies a lower appreciation (see Bems and Johnson, 2012, Figure 3). Thus, our results do not contradict the findings of Bems and Johnson (2012) and Bayoumi et al. (2013), but rather emphasize the importance of an appropriate benchmark for comparisons. Unteroberdoerster et al. (2011) follow Thorbecke (2011) and calculate a so-called "integrated effective exchange rate (IEER)" to take account of vertical linkages. They use same price indices for REER and IEER, which makes their outcome more transparent and comparable to ours. Unteroberdoerster et al. (2011) find that the IEER for China appreciated more slowly in recent years than the traditional REER, confirming our results in Chart 3.

4.4. Determinants of changes in global market shares for G7

Results for the G7 countries broadly mirror those for the BRIC economies (see Charts 1 and 2). Gross trade data suggest losses in market shares for final use products. Most of these losses in gross export market shares arise from other non-price factors (except for Canada and the US), while prices and costs are of secondary importance (although the negative contribution appears sizeable for Italy, Canada and the US). If one believes that other non-price factors mostly reflect quality and taste, then developed countries are confronted by a decline in the relative quality of or consumers' valuation for their exports.²² These losses become much smaller when market shares are calculated in value added terms, however. Again, on the one hand we can argue that developed countries indirectly contribute to the production of high-quality products in developing countries. The most striking cases are

²² Please note that we only capture dynamics here and cannot make any statement about the ordering of absolute quality of goods produced by G7 versus BRICs. Thus, in absolute terms we still expect a sizeable "quality gap" to prevail between G7 and BRIC exports on average.

Canada, Germany the UK and the US that show no changes or even a moderate increase in relative quality of their domestic production. We found only two exceptions among G7 members – France and Italy – that experienced worse contributions of non-price factors in value added terms. On the other hand, our results indicate that changes in VASF market shares are better explained by price and cost factors. We reveal more pronounced market share losses due to price and cost factors for several G7 countries (Germany, Japan, the UK, the US) when the value added concept is used. As before, these results seemingly contradict Bems and Johnson (2012) and Bayoumi et al. (2013), who report more favourable relative price dynamics for the US and Germany. But again these adjustments in assessment are mostly due to the switch from CPI to GDP deflator, while the isolated effect of changes from gross to value-added weights gives the opposite outcome for the US and suggests almost no changes for Germany (see Bems and Johnson, 2012, Figure 3).

5 Conclusions

Changing the focus from traditional gross to value added export market shares does not alter the general picture much – developing countries are still gaining market shares at the expense of advanced economies. But the inclusion of international fragmentation alters the underlying story to quite some extent which carries important policy implications. First, our results show that the global production process is gradually shifting toward developing countries, thus outsourcing as such is contributing positively to market share changes (in value added terms) in the BRIC countries and is thus eroding G7 countries' market shares. We observe significant shifts from developed countries to China (also Brazil and India, although with smaller magnitude), especially in radio, television and communication equipment, office machinery and computers, other machinery and equipment. BRICs are not the unique destination for outsourcing. For example, the final assembly of motor vehicles shifts from large European countries to the Czech Republic and Slovakia, Mexico acts as a final assembly destination for US value added, while Korea plays the same role for value added from Japan.

Second, the use of VASF market shares and switch to the weighting scheme based on value added in exports improves the ability of cost and price factors to explain dynamics of market shares, especially for BRIC countries. Accordingly, this reduces the importance of non-price factors. In the traditional view (based on gross exports), relative prices explain small part of changes in global market shares and the largest contribution come from the residual non-price factors. This unexplained part could be loosely associated with changes in quality (in a broad sense, including consumers' valuation or taste). Thus, G7 appear to have

declining relative quality while BRICs show large gains in relative quality of exported products. When we assess export strength in value added terms, these gains in residual non-price factors by emerging market producers turn out to be smaller or even negative, while increased market shares of BRICs relies to a larger extent on price factors and a positive impact from shifts in global value chains.

More specifically, our GVC-adjusted measure of price competitiveness indicates higher price competitiveness gains for the BRIC countries, France and Italy compared to the conventional approach, while we find a more negative impact from price and cost factors for Germany, Japan, the UK and the US. The findings by Bems and Johnson (2012) and Bayoumi et al. (2013) seemingly contradict our conclusions, but the gap between their REER in Tasks/Goods and the conventional REER is mostly due to shift from CPI to GDP deflator. The sole adjustment of weights according to value added concept changes the assessment of price competitiveness for China and the US in line with our results. Also Unteroberdoerster et al. (2011) confirms a lower real appreciation for China when adjusting for the effect of vertical linkages.

Our results also show that relative quality losses of developed countries are in fact lower than claimed before (again, loosely relating residual contribution of non-price factor to broad quality). G7 countries remain important suppliers of high quality intermediates in fragmented production lines. In particular, Canada, Germany, the UK and the US are well able to the keep relative quality of their produced goods unchanged. Only Italy and France pose an exception to this trend. After controlling for shifts in production chains one can observe that a stable or improving "quality" of Brazil's, Russia's and India's exports arises from the insourcing of higher-quality products rather than from improvements in the quality of their domestic production. China's gains in market shares are striking regardless which view is chosen. Also the contribution of other non-price factors remains impressive even after accounting for the role of global value chains. Still, the phenomenon of "Made in China" plays an important role. While we overestimate possible gains in quality and taste when we restrict attention to gross exports, we also underestimate China's price competitiveness as well as the effect of foreign value added which is imported mostly from developed countries.

Thus, we are now able to answer our initial question: to what extent do we have to revise our view on global market shares dynamics after introducing GVCs into the analysis? Quite a lot! The ongoing global outsourcing affects market shares directly by shifting production from developed to developing countries. Unfortunately, we are not able to uncover driving forces of this process within our framework and this should require more attention in

further researches. Moreover, accounting for ultimate provider of value added in global production chains alters the balance between price and non-price drivers of global market shares. Changes in relative quality of countries' exports are mainly due to intermediate inputs, not due to domestic production. The dynamics of the value-added market shares in most cases is dominated by price and cost factors.

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Appendix

A.1 Consumers utility function and import price index

We use a constant elasticity of substitution (CES) utility function for a representative household from importing country i consisting of three nests (similar to Broda and Weinstein, 2006):

$$U(i)_{t} = \left(D(i)_{t}^{\frac{\kappa(i)-1}{\kappa(i)}} + M(i)_{t}^{\frac{\kappa(i)-1}{\kappa(i)}} \right)^{\frac{\kappa(i)}{\kappa(i)-1}}, \quad \kappa(i) > 1,$$
(A1)

$$M(i)_{t} = \left(\sum_{g \in G} M(i)_{g,t}^{\frac{\gamma(i)-1}{\gamma(i)}}\right)^{\frac{\gamma(i)}{\gamma(i)-1}}, \quad \gamma(i) > 1,$$
(A2)

$$M(i)_{g,t} = \left(\sum_{c \in C} Q(i)^{\frac{1}{\sigma(i)_g}}_{gc,t} M(i)^{\frac{\sigma(i)_g-1}{\sigma(i)_g}}_{gc,t}\right)^{\frac{\sigma(i)_g}{\sigma(i)_g-1}}, \quad \sigma(i)_g > 1 \quad \forall \quad g \in G,$$
(A3)

where $D(i)_t$ is the domestic good, $M(i)_t$ is composite imports and $\kappa(i)$ is the elasticity of substitution between domestic and foreign goods, $M(i)_{g,t}$ is the subutility from consumption of imported good g, $\gamma(i)$ is elasticity of substitution among import goods, $Q(i)_{gc,t}$ is the taste and quality parameter, and $\sigma(i)_g$ is elasticity of substitution among varieties of good g.

After solving the utility maximization problem subject to the budget constraint, the minimum unit-cost function, which corresponds to the price of utility obtained from import good g, can be represented by

$$P(i)_{g,t} = \left(\sum_{c \in C(i)_{g,t}} Q(i)_{g,t} P(i)_{g,t}^{1-\sigma(i)_g}\right)^{\frac{1}{1-\sigma(i)_g}}, \ P(i)_t = \left(\sum_{g \in G} P(i)_{g,t}^{1-\gamma(i)}\right)^{\frac{1}{1-\gamma(i)}}$$
(A4)

where $P(i)_{g,\underline{t}}$ denotes minimum unit-cost of import good g, $P(i)_{\underline{t}}$ is minimum unit-cost of total imports, and $C(i)_{g,\underline{t}}$ is the subset of all varieties of goods consumed in period t. The import price index for a good g is defined as $\pi(i)_{g,t} = P(i)_{g,t}/P(i)_{g,t-1}$, while total import price index – as $\pi(i)_t = P(i)_t/P(i)_{t-1}$.

Benkovskis and Wörz (2014a) extend the work by Feenstra (1994) and Broda and Weinstein (2006) by relaxing the assumption of unchanged taste or quality. They introduce an import price index that adds a term to capture changes in taste and quality:

$$\pi(i)_{g,t} = \prod_{c \in C(i)_g} \pi(i)_{gc,t}^{w(i)_{gc,t}} \left(\frac{\lambda(i)_{g,t}}{\lambda(i)_{g,t-1}} \right)^{\frac{1}{\sigma(i)_g - 1}} \prod_{c \in C(i)_g} \left(\frac{Q(i)_{gc,t}}{Q(i)_{gc,t-1}} \right)^{\frac{w(i)_{gc,t}}{1 - \sigma(i)_g}}, \quad \pi(i)_t = \prod_{g \in G} \pi(i)_{g,t}^{w(i)_{g,t}}, \quad (A5)$$

where $\pi(i)_{gc,t} = P(i)_{gc,t}/P(i)_{gc,t-1}$ and Sato-Vartia weights $w(i)_{gc,t}$ and $w(i)_{g,t}$ are computed using cost shares $s(i)_{gc,t}^{M}$ and $s(i)_{g,t}^{M}$ in the two periods as follows:

$$w(i)_{gc,t} = \frac{\left(s(i)_{gc,t}^{M} - s(i)_{gc,t-1}^{M}\right) / \left(\ln s(i)_{gc,t}^{M} - \ln s(i)_{gc,t-1}^{M}\right)}{\sum_{c \in C(i)_{g}} \left(\left(s(i)_{gc,t}^{M} - s(i)_{gc,t-1}^{M}\right) / \left(\ln s(i)_{gc,t}^{M} - \ln s(i)_{gc,t-1}^{M}\right)\right)}, \quad s(i)_{gc,t}^{M} = \frac{P(i)_{gc,t} M(i)_{gc,t}}{\sum_{c \in C(i)_{g}} P(i)_{gc,t} M(i)_{gc,t}},$$

$$w(i)_{g,t} = \frac{\left(s(i)_{g,t}^{M} - s(i)_{g,t-1}^{M}\right) / \left(\ln s(i)_{g,t}^{M} - \ln s(i)_{g,t-1}^{M}\right)}{\sum_{g \in G} \left(\left(s(i)_{g,t}^{M} - s(i)_{g,t-1}^{M}\right) / \left(\ln s(i)_{g,t}^{M} - \ln s(i)_{g,t-1}^{M}\right)\right)}, \quad s(i)_{g,t}^{M} = \frac{\sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t}}{\sum_{g \in G} \sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t}},$$

while $\lambda(i)_{g,t}$ and $\lambda(i)_{g,t-1}$ are Feenstra's (1994) index accounting for changes in variety:

$$\lambda(i)_{g,t} = \frac{\sum_{c \in C(i)_g} P(i)_{gc,t} M(i)_{gc,t}}{\sum_{c \in C(i)_{g,t}} P(i)_{gc,t} M(i)_{gc,t}}, \quad \lambda(i)_{g,t-1} = \frac{\sum_{c \in C(i)_g} P(i)_{gc,t-1} M(i)_{gc,t-1}}{\sum_{c \in C(i)_{g,t-1}} P(i)_{gc,t-1} M(i)_{gc,t-1}}.$$

The important point to note is that the import price index (defined as a change in minimum unit costs) depends not only on prices (unit values), but also on non-price factors as a better quality or higher valuation by the consumer offsets for a higher price in terms of derived utility.

A.2. Decomposition of the intensive margin of value-added export market share changes

The share of country k's VASF exports in total imports of a country *i*, $IM(i)_{k,t}$, can be rearranged in the following way:

$$IM(i)_{k,t}^{VASF} = \frac{\sum_{c \in C} \sum_{g \in G(i)_{c,t,t-1}} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}{\sum_{c \in C} \sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t}} \frac{\sum_{c \in C} \sum_{g \in G(i)_{c,t,t-1}} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}{P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}} = \frac{\sum_{c \in C} \sum_{g \in G(i)_{c,t,t-1}} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}{P(i)_{g,t} M(i)_{g,t}} = \frac{\sum_{c \in C} \sum_{g \in G(i)_{c,t,t-1}} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}{P(i)_{g,t} M(i)_{g,t}} = \frac{\sum_{c \in C} \sum_{g \in G(i)_{c,t,t-1}} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}{P(i)_{gt,t} M(i)_{g,t}} = \frac{\sum_{c \in C} \sum_{g \in G(i)_{c,t,t-1}} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}{P(i)_{gt,t} M(i)_{gt,t}} = \frac{\sum_{c \in C} \sum_{g \in G(i)_{c,t,t-1}} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}{P(i)_{gt,t} M(i)_{gt,t}} = \frac{\sum_{c \in C} \sum_{g \in G(i)_{c,t,t-1}} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}{P(i)_{gt,t} M(i)_{gt,t}} = \frac{\sum_{c \in C} \sum_{g \in G(i)_{c,t,t-1}} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}{P(i)_{gt,t} M(i)_{gt,t}} = \frac{\sum_{c \in C} \sum_{g \in G(i)_{c,t,t-1}} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}{P(i)_{gt,t} M(i)_{gt,t}} = \frac{\sum_{c \in C} \sum_{g \in G(i)_{c,t,t-1}} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}}{P(i)_{gt,t} M(i)_{gt,t}} P(i)_{gc,t} M(i)_{gt,t}} = \frac{\sum_{c \in C} \sum_{g \in G(i)_{c,t,t-1}} P(i)_{gc,t} M(i)_{gc,t} P(i)_{gt,t} P(i)_{gc,t} P(i)_{gt,t} P(i)_{gt,t} P(i)_{gt,t}}{P(i)_{gt,t} P(i)_{gt,t} P(i)_{gt,t}} P(i)_{gt,t} P(i)_{g$$

The first order conditions of the consumer utility maximization problem (A1)-(A3) s.t. budget constraints are the following:

$$M(i)_{gc,t} = Q(i)_{gc,t} P(i)_{gc,t}^{-\sigma(i)_{g}} M(i)_{g,t}^{1 - \frac{\sigma(i)_{g}}{\gamma(i)}} U(i)_{t}^{\frac{\sigma(i)_{g}}{\kappa(i)}} M(i)_{t}^{\frac{\sigma(i)_{g}}{\kappa(i)} - \frac{\sigma(i)_{g}}{\kappa(i)}} \lambda(i)_{t}^{-\sigma(i)_{g}},$$
(A7)

where $\lambda(i)_t$ is Lagrange multiplier. By rearranging and summing over *c* one can obtain the following expression:

$$M(i)_{g,t} = P(i)_{g,t}^{-\gamma(i)} U(i)_{t}^{\frac{\gamma(i)}{\kappa(i)}} M(i)_{t}^{\frac{\gamma(i)}{\kappa(i)}} \lambda(i)_{t}^{\gamma(i)}.$$
(A8)

From (A6), (A7) and (A8) follows that country k's VASF exports share in total imports of a country i is driven by minimum unit-costs, taste and quality parameters and value-added share of country k in the production of various goods exported to destination market i:

$$IM(i)_{k,t}^{VASF} = \sum_{c \in C} \sum_{g \in G(i)_{c,t,t-1}} \frac{P(i)_{gc,t}^{1-\sigma(i)_g} Q(i)_{gc,t} V(k)_{gc,t}}{P(i)_{g,t}^{1-\sigma(i)_g}} \frac{P(i)_{gc,t}^{1-\gamma(i)}}{P(i)_{g,t}^{1-\gamma(i)}}.$$
(A9)

Using the fact that $dIM(i)_{k,t}^{VASF} = IM(i)_{k,t}^{VASF} / IM(i)_{k,t-1}^{VASF}$:

$$dIM(i)_{k,t}^{VASF} = \sum_{c \in C} \sum_{g \in G(i)_{c,t,t-1}} w(k,i)_{gc,t}^{VASF} \frac{P(i)_{gc,t}^{1-\sigma(i)_g} Q(i)_{gc,t} V(k)_{gc,t}}{P(i)_{gc,t-1}^{1-\sigma(i)_g} Q(i)_{gc,t-1} V(k)_{gc,t-1}} \frac{\pi(i)_{g,t}^{1-\gamma(i)}}{\pi(i)_{g,t}^{1-\sigma(i)_g} \pi(i)_t^{1-\gamma(i)}},$$

$$w(k,i)_{gc,t}^{VASF} = \frac{P(i)_{gc,t-1} M(i)_{gc,t-1} V(k)_{gc,t-1}}{\sum_{g \in G(i)_{c,t,t-1}} \sum_{c \in C} P(i)_{gc,t-1} M(i)_{gc,t-1} V(k)_{gc,t-1}}.$$
(A10)

Combining (A10) with import price index in (A5), one can obtain VASF market share decomposition described in (6).

A.3. Log-linear approximation of VASF market share decomposition

The system of equations (4)-(7) has an unpleasant property as it is a combination of sums and multiplications. For empirical applications it is more convenient to work with a log-linear approximation of the VASF market share decomposition:²³

$$dms_{k,t}^{VASF} \approx dem_{k,t}^{VASF} + pp_{k,t}^{VASF} + cc_{k,t}^{VASF} + qq_{k,t}^{VASF} + vv_{k,t}^{VASF} + ds_{k,t},$$
(A11)

where log changes of country k's market shares changes $(dms_{k,t}^{VASF})$ are defined as

$$dms_{k,t}^{VASF} = \ln\left(\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}\right) - \ln\left(\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t-1} M(i)_{gc,t-1} V(k)_{gc,t-1}\right) - \ln\left(\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t}\right) + \ln\left(\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t-1} M(i)_{gc,t-1}\right).$$
(A12)

These are decomposed into six parts. The extensive margin of log changes of country *k*'s market share changes, $dem_{k,t}^{VASF}$, is defined as:

$$dem_{k,t}^{VASF} = \ln\left(\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}\right) - \ln\left(\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t-1} M(i)_{gc,t-1} V(k)_{gc,t-1}\right) - \ln\left(\sum_{i \in I} \sum_{c \in C} \sum_{g \in G(i)_{c,t,t-1}} P(i)_{gc,t} M(i)_{gc,t} V(k)_{gc,t}\right) + \ln\left(\sum_{i \in I} \sum_{c \in C} \sum_{g \in G(i)_{c,t,t-1}} P(i)_{gc,t-1} M(i)_{gc,t-1} V(k)_{gc,t-1}\right).$$
(A13)

The intensive margin is decomposed into the remaining five components: First, the contribution of shifts in global demand structure to market shares' log changes, $ds_{k,t}$:

$$ds_{k,t} = \sum_{i \in I} \tilde{s}(i)_{k,t}^X ds(i)_t,$$
(A14)

$$ds(m)_{t} = \ln\left(\sum_{c \in C} \sum_{g \in G} P(m)_{gc,t} M(m)_{gc,t}\right) - \ln\left(\sum_{i \in I} \sum_{c \in C} \sum_{g \in G} P(i)_{gc,t} M(i)_{gc,t}\right) -$$

 $^{^{23}}$ We log-linearize around the constant steady state (no changes in volumes or prices between periods *t* and *t*-1). Although the log-linear approximation works well only for small changes, it is still valid in this application. First, we apply log-linear approximation for year-to-year changes in volumes or prices, which are much smaller than cumulated changes over a longer time period. Second, the results reported in Charts 1-3 show the adequacy of log-linear approximation for G7 and BRIC countries as the sum of all components closely follows the log-changes in total market shares (it should be noted that missing unit values data induce large part of the discrepancy).

$$-\ln\left(\sum_{c\in C}\sum_{g\in G}P(m)_{gc,t-1}M(m)_{gc,t-1}\right)+\ln\left(\sum_{i\in I}\sum_{c\in C}\sum_{g\in G}P(i)_{gc,t-1}M(i)_{gc,t-1}\right).$$

Second, the price component of market shares' log changes, $pp_{k,t}^{VASF}$:

$$pp_{k,t}^{VASF} = \sum_{i \in I} \tilde{s}(i)_{k,t}^{X} pp(i)_{k,t}^{VASF},$$

$$pp(i)_{k,t}^{VASF} = \sum_{g \in G(i)_{c,y,y-1}} \sum_{c \in C} w(k,i)_{gc,t}^{VASF} \left[\left(1 - \sigma(i)_{g} \right) \ln \pi(i)_{gc,t} - \left(\gamma(i) - \sigma(i)_{g} \right) \sum_{m \in C(i)_{j}} w(i)_{gm,t} \ln \pi(i)_{gm,t} \right] - \left(1 - \gamma(i) \sum_{i \in G} \sum_{m \in C(i)_{i}} w(i)_{jm,t} w(i)_{j,i} \ln \pi(i)_{jm,i},$$
(A15)

where weights $\tilde{s}(i)_{k,t}^{X}$ are defined as Tornquist shares of country k's export structure: $\tilde{s}(i)_{k,t}^{X} = 0.5s(i)_{k,t}^{X} + 0.5s(i)_{k,t-1}^{X}$.

Third, the effect of a changing set of competitors for market shares' log changes, $cc_{k,t}^{VASF}$:

$$cc_{k,t}^{VASF} = \sum_{i \in I} \sum_{g \in G(i)_{c,y,y-1}} \sum_{c \in C} \widetilde{s}(i)_{k,t}^{X} w(k,i)_{gc,t}^{VASF} \frac{\gamma(i) - \sigma(i)_{g}}{1 - \sigma(i)_{g}} (\ln \lambda(i)_{g,t} - \ln \lambda(i)_{g,t-1}) + \sum_{i \in I} \widetilde{s}(i)_{k,t}^{X} w(k,i)_{gc,t}^{VASF} \frac{(1 - \gamma(i))w(i)_{g,t}}{1 - \sigma(i)_{g}} \sum_{j \in G} (\ln \lambda(i)_{j,t} - \ln \lambda(i)_{j,t-1}).$$
(A16)

Fourth, the contribution of other non-price factors for market shares' log changes, $qq_{k,t}^{VASF}$: $qq_{k,t}^{VASF} = \sum_{i \in I} \tilde{s}(i)_{k,t}^{X} qq(i)_{k,t}^{VASF}$, (A17)

$$qq(i)_{k,t}^{VASF} = \sum_{g \in G(i)_{c,y,y-1}} \sum_{c \in C} w(k,i)_{gc,t}^{VASF} \left(\ln \mu(i)_{gc,t} + \sigma(i)_{g} \ln \pi(i)_{gc,t} + (\gamma(i) - \sigma(i)_{g}) \sum_{m \in C(i)_{j}} w(i)_{gm,t} \ln \pi(i)_{gm,t} \right) - \sum_{j \in G} \sum_{m \in C(i)_{g}} w(i)_{jm,t} w(i)_{j,t} \ln \mu(i)_{jm,t} - \gamma(i) \sum_{j \in G} \sum_{m \in C(i)_{g}} w(i)_{jm,t} w(i)_{j,t} \ln \pi(i)_{jm,t} + \left(\sum_{g \in G(i)_{c,y,y-1}} \sum_{c \in C} w(k,i)_{gc,t}^{VASF} \frac{\sigma(i)_{g} - \gamma(i)}{1 - \sigma(i)_{g}} (\ln \lambda(i)_{g,t} - \ln \lambda(i)_{g,t-1}) + \frac{(\gamma(i) - \sigma(i)_{g})w(i)_{g,t}}{1 - \sigma(i)_{g}} \sum_{j \in G} (\ln \lambda(i)_{j,t} - \ln \lambda(i)_{j,t-1}) \right).$$

Fifth, shifts in global value chains and their implication for log changes in market shares, $vv_{k,t}^{VASF}$:

$$vv_{k,t}^{VASF} = \sum_{i \in I} \sum_{g \in G(i)_{c,y,y-1}} \sum_{c \in C} \widetilde{s}(i)_{k,t}^{X} w(k,i)_{gc,t}^{VASF} \left(\ln V(k)_{gc,t} - \ln V(k)_{gc,t-1} \right)$$
(A18)

A.4. Elasticities of substitution between varieties

We estimate elasticities of substitution between varieties according to the methodology proposed by Feenstra (1994) and later applied by Broda and Weinstein (2006). To derive the elasticity of substitution, one needs to specify both demand and supply equations. The demand equation is defined by re-arranging the minimum unit-cost function in terms of market share, taking first differences and ratios to a reference country *l*:

$$\Delta \ln \frac{s(i)_{gc,l}^{M}}{s(i)_{gl,l}^{M}} = -(\sigma(i)_{g} - 1) \Delta \ln \frac{P(i)_{gc,l}}{P(i)_{gl,l}} + \varepsilon(i)_{gc,l},$$
(A19)

where $\varepsilon(i)_{gc,t} = \Delta \ln Q(i)_{gc,t} + \zeta(i)_{gc,t}$, and $\zeta(i)_{gc,t}$ is an error term (due to e.g. measurement error) in the demand equation. Following Feenstra (1994) and Broda and Weinstein (2006) we treat $\varepsilon(i)_{gc,t}$ as an unobserved random variable, reflecting changes in the quality of product variables. Note, that $Q(i)_{gc,t}$ reflects fundamental characteristics of a particular variety and should be treated as exogenous.

The export supply equation relative to country *l* is given by:

$$\Delta \ln \frac{P(i)_{gc,t}}{P(i)_{gl,t}} = \frac{\omega(i)_g}{1 + \omega(i)_g} \Delta \ln \frac{s(i)_{gc,t}^M}{s(i)_{gl,t}^M} + \delta(i)_{gc,t},$$
(A20)

where $\omega(i)_g \ge 0$ is the inverse supply elasticity assumed to be the same across partner countries, and $\delta(i)_{gc,t}$ is an error term of supply equation which is assumed to be independent of $\varepsilon(i)_{gc,t}$.

A nasty feature of the system of (A19) and (A20) is the absence of exogenous variables to identify and estimate elasticities. To get the estimates, we transform the system of two equations into a single equation by exploiting the insight of Leamer (1981) and the independence of errors $\varepsilon(i)_{gc,t}$ and $\delta(i)_{gc,t}$.²⁴ This is done by multiplying both sides of the equations. After transformation, the following equation is obtained:

$$\left(\Delta \ln \frac{P(i)_{gc,l}}{P(i)_{gl,l}} \right)^2 = \theta_1 \left(\Delta \ln \frac{s(i)_{gc,l}^M}{s(i)_{gl,l}^M} \right)^2 + \theta_2 \left(\Delta \ln \frac{P(i)_{gc,l}}{P(i)_{gl,l}} \right) \left(\Delta \ln \frac{s(i)_{gc,l}^M}{s(i)_{gl,l}^M} \right) + u(i)_{gc,l},$$

$$\theta_1 = \frac{\omega(i)_g}{\left(1 + \omega(i)_g \right) \sigma(i)_g - 1}, \quad \theta_2 = \frac{1 - \omega(i)_g \left(\sigma(i)_g - 2 \right)}{\left(1 + \omega(i)_g \right) \left(\sigma(i)_g - 1 \right)}, \quad u(i)_{gc,l} = \varepsilon(i)_{gc,l} \delta(i)_{gc,l}.$$
(A21)

Note that the evaluation of θ_1 and θ_2 leads to inconsistent estimates, as relative price and relative market share are correlated with the error $u(i)_{gc,t}$. Broda and Weinstein (2006) argue that it is possible to obtain consistent estimates by exploiting the panel nature of data and define a set of moment conditions for each good g. If estimates of elasticities are imaginary or of the wrong sign the grid search procedure is implemented. Broda and Weinsten (2006) also address the problem of measurement error and heteroskedasticity by adding a term inversely related to the quantity and weighting the data according to the amount of trading flows. A recent papers by Soderbery (2010, 2012), however, reports that this methodology generates

²⁴ The independence assumption relies on the assumption that taste and quality does not enter the residual of the relative supply equation $(\delta(i)_{gc,t})$. If this does not hold, then errors are not independent, since changes in taste and quality enter $\varepsilon(i)_{gc,t}$. The assumption of the irrelevance for the supply function seems realistic for taste (if we ignore the possibility that taste is manipulated by advertisement; however, advertisement costs can be viewed as fixed, which should reduce the correlation with the error term). But it is difficult to argue that changes in physical quality of a product should not affect the $\delta(i)_{gc,t}$. The empirical literature did not address this issue until now and the size of induced bias is unclear.

severely biased elasticity estimates (median elasticity of substitution is overestimated by over 35%). Soderbery (2010, 2012) proposes the use of a Limited Information Maximum Likelihood (LIML) estimator instead. Where estimates of elasticities are not feasible ($\hat{\theta}_i < 0$), nonlinear constrained LIML is implemented. Monte Carlo analysis performed by Soderbery (2010, 2012) demonstrates that this hybrid estimator corrects small sample biases and constrained search inefficiencies. It further shows that Feenstra's (1994) original method of controlling measurement error with a constant and correcting for heteroskedasticity by the inverse of the estimated residuals performs well. We thus follow Soderbery (2010, 2012) and use hybrid estimator combining LIML with a constrained nonlinear LIML to estimate elasticities of substitution between varieties using the Feenstra's (1994) method.

 Table A.1. Elasticities of substitution between varieties for final use products (top 20 world importers in 2011)

	No. of estimated elasticities	Mean	Minimum	Maximum	25 th percentile	Median	75 th percentile
United States	1522	53.60	1.0275	50285	1.65	2.39	4.08
China	1628	56.68	1.0015	58183	1.95	2.86	4.96
Germany	1730	9.23	1.0300	1016	2.26	3.44	5.93
Japan	1624	37.95	1.0336	38064	1.91	2.91	5.17
United Kingdom	1817	4.80	1.0119	283	1.81	2.59	4.51
France	1796	148.35	1.0246	99102	1.99	3.00	5.10
Italy	1806	17.60	1.0151	13594	1.92	2.88	5.02
Korea	1576	88.04	1.0677	64247	2.17	3.24	5.77
Netherlands	1668	14.44	1.0012	8248	1.88	2.67	4.71
Belgium	1051	125.35	1.0947	79794	2.31	3.39	6.08
India	1266	97.39	1.0018	68340	2.11	3.04	5.33
Canada	1330	104.41	1.0013	92132	2.28	3.51	6.44
Singapore	1243	112.47	1.0385	49908	1.90	2.83	4.88
Spain	1796	47.75	1.0166	64044	2.00	2.94	4.98
Mexico	1344	45.02	1.0016	22629	1.78	2.64	4.61
Russia	1611	116.52	1.0600	88274	2.33	3.59	6.85
Turkey	1502	14.03	1.0932	8350	2.19	3.11	4.88
Australia	1120	287.57	1.0801	97024	1.75	2.62	4.82
Thailand	1064	85.81	1.0173	40641	2.01	2.91	5.11
Brazil	1459	71.66	1.0524	34870	2.20	3.25	5.57

Note: Calculated using UN Comtrade data for disaggregated imports of 189 countries using equation (A21). The estimates are based on data between 1996 and 2012 for 236 exporters (China includes mainland China, Hong Kong and Macao).

Competitiveness Research Network

This paper presents research conducted within the Competitiveness Research Network (CompNet). The network is composed of economists from the European System of Central Banks (ESCB) - i.e. the 29 national central banks of the European Union (EU) and the European Central Bank – a number of international organisations (World Bank, OECD, EU Commission) universities and think-tanks, as well as a number of non-European Central Banks (Argentina and Peru) and organisations (US International Trade Commission). The objective of CompNet is to develop a more consistent analytical framework for assessing competitiveness, one which allows for a better correspondence between determinants and outcomes.

The research is carried out in three workstreams: 1) Aggregate Measures of Competitiveness; 2) Firm Level; 3) Global Value Chains CompNet is chaired by Filippo di Mauro (ECB). Workstream 1 is headed by Pavlos Karadeloglou (ECB) and Konstantins Benkovskis (Bank of Latvia); workstream 2 by Antoine Berthou (Banque de France) and Paloma Lopez-Garcia (ECB); workstream 3 by João Amador (Banco de Portugal) and Frauke Skudelny (ECB). Monika Herb (ECB) is responsible for the CompNet Secretariat. The refereeing process of CompNet papers is coordinated by a team composed of Filippo di Mauro (ECB), Konstantins Benkovskis (Bank of Latvia), João Amador (Banco de Portugal), Vincent Vicard (Banque de France) and Martina Lawless (Central Bank of Ireland). The paper is released in order to make the research of CompNet generally available, in preliminary form, to encourage comments and suggestions prior to final publication. The views expressed in the paper are the ones of the author(s) and do not necessarily reflect those of the ECB, the ESCB, and of other organisations associated with the Network.

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