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# SERVICES DEVELOPMENT AND COMPARATIVE ADVANTAGE IN MANUFACTURING

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## ABSTRACT

Most manufacturing activities use inputs from the financial and business services sectors. But these services sectors also compete for resources with manufacturing activities, provoking concerns about deindustrialization attributable to financial services in developed countries like the United States and United Kingdom, and business services in developing countries like India and the Philippines. This paper examines the implications of services development for the export performance of manufacturing sectors. We develop a methodology to quantify the indirect role of services in international trade in goods and construct new measures of revealed comparative advantage based on value-added exports. We show that the development of financial and business services intensively but not of other manufacturing sectors. We also find that a country can partially overcome the handicap of an underdeveloped domestic services sector by relying more on imported services inputs. Thus, lower services trade barriers in developing countries can help to promote their manufacturing exports.

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### I. Introduction

On the face of it, services play a relatively small role in international trade. Conventional trade statistics show that services trade currently accounts for only one-fifth of cross-border trade (Loungani et al., 2017). However, a significant part of goods trade includes trade in embodied services. In the United States, for example, more than a quarter of intermediate inputs purchased by manufacturers were from the services sector (USITC, 2013). For certain manufacturing sectors, such as computers and electronic products, this percentage — a measure of "services intensity" — is as high as 47.6 percent. Drawing on the Trade in Value-added Database (TiVA, 1995-2011), Miroudot and Cadestin (2017) show that services inputs account for about 37 percent of the value of manufacturing exports in the sample of 62 countries covered. The development of the domestic services sector, as well as access to imported services inputs, can, therefore, be expected to influence comparative advantage in manufacturing trade. This paper seeks to understand this indirect role of services development drawing upon new measures based on newly available data.

The impact of services development is not straightforward. On the one hand, as services are used as inputs in the production of manufactured goods, services development can help to increase manufacturing production. On the other hand, since services and manufacturing compete for resources, the development of the former can be at the expense of the latter. For example, it is evident that the development of the services sector has drawn resources away from manufacturing not just in developed countries like the United States and the United Kingdom, but also in developing countries like India.<sup>1</sup>

We focus on two services sectors that are crucial for modern economic development: financial services and business services. Both have emerged as skill-intensive, dynamic, internationally traded services. These two services sectors are often regarded as the pillars of modern economies, and their value-added shares in GDP have a strong positive correlation with countries' income levels. The two sectors also represent the tension we discussed above in the sharpest form. On the one hand, manufacturing performance is critically dependent on the domestic availability of these services. On the other, these are the sectors that often provoke "deindustrialization" concerns – financial services in industrial countries like the United States and United Kingdom, and business services in developing countries like India and the Philippines.

<sup>&</sup>lt;sup>1</sup> See, for example, Kochhar et al. (2006).

Well-functioning financial sectors are critical in mobilizing resources, stimulating investment, and at the same time helping firms (and households) better managing their risks. As shown in Appendix 1, the business services sector covers a variety of critical activities, ranging from software consulting and data processing to management consultancy, engineering and R&D services. Intensive use of these modern services can help manufacturing firms increase productivity, reduce the cost of doing business, expand their choices within a longer geographic distance, differentiate their products from those of their competitors,<sup>2</sup> strengthen their after-sale customer services, etc.<sup>3</sup> USITC (2013) shows that business services accounted for nearly half of all services purchased by manufacturing sectors in the U.S. in 2008.

Our first hypothesis is that, while the overall effect of services development on the performance of manufacturing sectors is ambiguous, the effect is more likely to be positive for manufacturing sectors that use the services inputs more intensively. We develop a methodology to quantify the indirect role of services in international trade in goods using a framework developed by Koopman, Wang, and Wei (2014) and Wang, Wei, and Zhu (2013) that generalizes the vertical specialization measures proposed by Hummels, Ishii and Yi (2001). We use a suitably modified version of revealed comparative advantage (RCA) to measure the competitiveness of manufacturing sectors. We improve on the traditional Balassa (1965) RCA and construct new measures of RCA based on value-added exports (RCA\_VAX) rather than gross exports. These measures take into account both domestic production sharing (such as the use of service inputs in manufacturing production) and international production sharing (such as the use of imported foreign inputs in domestic production).

In our econometric analysis of the impact of services development on the RCA of manufacturing sectors, the key explanatory variable is an interaction between a measure of the development of financial (or business) services and the financial (or business) services input intensity of each manufacturing sector. We find that domestic services development indeed has a mixed effect on manufacturing export RCA: in manufacturing sectors with low embodied services, services development reduces manufacturing export RCA; however, in sectors with a high degree

 $<sup>^2</sup>$  To differentiate a product from others, firms need to invest more in R&D, quality-upgrading, and advertisement. The groups of manufacturing sectors with high embodied financial and business services as listed in Appendix 3 indeed produce more differentiated products than those sectors with low services input intensity. In addition, combining pure manufacturing and after-sale services is also a way to differentiate itself from competitors.

<sup>&</sup>lt;sup>3</sup> See the next section for discussion in the literature on how producer services may affect firms' productivity.

of embodied services, services development increases manufacturing RCA. Figure 1 provides a visual illustration of this relationship in the case of financial services. We see a negative association between manufacturing RCA and a measure of financial development for a sector with low financial services input intensity (SII), but a positive association for a sector with high SII.

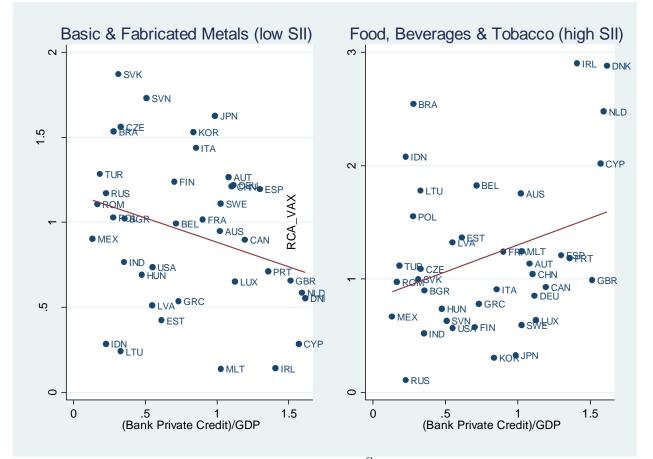


Figure 1: RCA against Bank Private Credit to GDP (D<sup>f1</sup>), year 2005. The vertical axis represents the RCA based on value-added exports (VAX) for Basic & Fabricated Metals sector and Food, Beverages & Tobacco sector, respectively. The horizontal axis represents a measure of financial development – the ratio of bank private credit to GDP from the World Bank Global Financial Development Database (GFDD).

Furthermore, we distinguish embodied domestic services inputs from embodied foreign services inputs. When domestic firms have access to foreign services, they may at least partially bypass their own inefficient services provision by relying more on imported services inputs. As our second hypothesis, we expect to see a more positive effect of access to foreign services inputs on manufacturing export performance in countries with lower levels of domestic services development. This is also supported by our empirical analysis. The rest of the paper is organized as follows. We review the relevant literature in Section II. In Section III, we present our hypotheses and describe the data. The empirical analysis is carried out in Section IV. We conclude in Section V.

#### **II.** Literature review

This paper is related to at least two strands of the literature: one is on the estimation of services embodied in traded goods; the other is on the role of services in economic development.

Research on services embodied in traded goods, based on the Leontief inverse, can be traced back to Grubel (1988) who examined Canadian exports in 1973 and 1983. He found that, over that decade, Canadian embodied services exports had increased substantially to the point where Canada enjoyed a surplus in embodied services trade but had a deficit in direct trade in services. Urata and Kiyota (2003) examined the embodied services in total gross trade for several major services categories of five Asian economies – China, Malaysia, the Philippines, Singapore, and Thailand – in 1990. They found that embodied services accounted for a large share of total services trade for each country. Francois and Woerz (2008) examined the role of services as inputs in manufacturing sectors. They found a significant and strong positive effect of increased business services openness (i.e. greater levels of imports) on some industries, supporting the notion that offshoring of business services may promote the competitiveness of the most skill and technology intensive industries in the OECD countries. Francois et al. (2013) demonstrated that the ratio of value-added exports to gross exports is significantly higher than one in services sectors, suggesting an important role of services sectors in downstream sectors through forward inter-industrial linkages. Their studies cover many countries and provide some interesting insights.

These earlier studies used single national input-output tables, rather than an international input-output table as in this paper, so they could not break down the inputs according to their origins or address the mismeasurement problem (double counting) in services inputs due to two-way trade in intermediate products (Koopman, Wang, and Wei, 2014). In addition, they can only consider how much a service sector's value-added is embodied in manufacturing exports but not whether parts of the exported value-added return to the exporting country. In the current paper, we make use of the recently developed approach of Koopman, Wang, and Wei (2014) and the newly constructed World Input-Output Database (WIOD) to measure more precisely the embodied

services and indirect trade through other sectors.<sup>4</sup> With the multi-country input-output table and the information about the origins of inputs, we can study embodied domestic and foreign services and their interaction with domestic services development. Stehrer, Foster, and Vries (2012) and Timmer et al. (2013) also use a similar method and the WIOD data to estimate the shares of services, income and jobs in a country that are directly and indirectly related to the production of manufacturing goods, but their work is primarily descriptive without connecting embodied services to the performance of manufacturing sectors.

On the role of services in economic development, Hoekman and Mattoo (2008) review the literature, focusing on channels through which openness to trade in services may increase the productivity of a firm, an industry and an economy as a whole. The existing studies show that the access to low-cost and high quality producer services can promote economic growth. Based on an industry level analysis of the U.S., Amiti and Wei (2009a) find that service offshoring by highincome countries tends to raise their manufacturing sectors' productivity. While services offshoring has both positive and negative effects on domestic employment, Amiti and Wei (2009b) show that, at least for the case of the United States, it tends to enhance domestic employment on average because the enlarged domestic production due to improved efficiency from offshoring (the scale effect) dominates a direct substitution effect (loss of certain domestic jobs now performed by foreign workers). Arnold, Javorcik, and Mattoo (2011), using firm-level data from the Czech Republic for the period 1998-2003, find a positive effect of services sector reforms on the productivity of domestic firms in downstream manufacturing. The manufacturing-services linkage is measured using information on the degree to which manufacturing firms rely on intermediate inputs from services industries. Arnold et al. (2012) use a similar methodology to show that services reforms had significant and positive effects on the productivity of manufacturing firms in India. Fernandes and Paunov (2012), using the annual manufacturing survey of Chilean firms, find a positive effect of substantial FDI inflows in producer services sectors on the total factor productivity (TFP) of Chilean manufacturing firms. Their findings also suggest that services FDI fosters innovation activities in manufacturing and offers opportunities for laggard firms to catch up with industry leaders. Debaere et al. (2013) find that greater availability of services increases manufacturing firms' foreign sourcing of materials, which may in turn enhance manufacturing

<sup>&</sup>lt;sup>4</sup> See Dietzenbacher et al. (2014) and Timmer et al. (2015) for more information on the construction of the WIOD.

productivity. Using Swedish firm level data, Lodefalk (2014) shows that in-house and outsourced services help to increase export intensity measured by the share of merchandise exports in total sales. Finally, a recent paper by Bamieh et al. (2017) show that more intensive use of producer services appears to be positively associated with resilience to greater import competition.

In this paper, we study particularly the roles of financial services and business services in manufacturing production. On financial services, Rajan and Zingales (1998) and a number of follow-up studies find that industries that are particularly dependent on financing grow relatively faster in countries with more developed financial markets. Beck (2003), Manova (2008), and Chor (2010) show that financially-developed countries are more successful exporters in industries that depend more on external capital funding.<sup>5</sup> Ju and Wei (2011) show in a general equilibrium model that, for economies with low-quality institutions, finance is a key driver of the real economy and a source of comparative advantage. Buera et al. (2011) demonstrate in a model that sectors with more financing needs are disproportionately vulnerable to financial frictions. A growing literature on credit constraints demonstrates that access to external finance helps to increase firms' export performance (e.g., Amiti and Weinstein, 2011). Using firm-level evidence, Manova, Wei, and Zhang (2015) show that credit constraints reduce exports in developing countries, and multinational firms that do not rely on local financial systems tend to be more successful exporters in sectors where credit constraints are more binding. All of these papers suggest that financial services development is a source of comparative advantage.

Our approach differs from Rajan and Zingales (1998) and these other papers in two major ways. First, we consider modern business services sectors in addition to financial services. For most countries in our sample, business services as a share of GDP are generally on par with or greater than financial services. Second, even for financial services, we measure the intensity of use in manufacturing sectors differently from Rajan and Zingales in order to maintain consistency with our measure of business services intensity. In particular, their measure of financial dependence is about the intrinsic needs for externally raised funds relative to total funding needs for long-term investment. In an Input-output context, the financial services sector only provides financial services in value-added terms, rather than the amount of external finance raised. Financial services

<sup>&</sup>lt;sup>5</sup> Based on a non-parametric estimation, however, Shen (2013) shows that the effect is even stronger for financially underdeveloped countries than financially developed countries due to diminishing returns.

may facilitate an investment deal, but is different from investment. Therefore, their measures and ours reflect two different concepts.<sup>6</sup>

Business services cover a wide range of activities as listed in Appendix 1. There are many case studies on how a certain type of business services promotes the economic performance at firm, state or national level (see USITC, 2013). However, comprehensive empirical analyses covering most of the major economics at a detailed industry level are rare, probably owning to the lack of detailed services data.

In the existing literature, the estimation of embodied services and the empirical analyses on their linkage to manufacturing export performance are somewhat disconnected. The former estimates the embodied services, but does not examine empirically how services input intensity affects the performance of downstream sectors. The latter, on the other hand, uses some proxies of inter-sectoral linkage or the direct inputs in gross output to examine the effects of services reforms on downstream manufacturing sectors without quantifying precisely services input intensity. The current paper connects the two literatures: we measure precisely services input intensity as the ratio of embodied services to manufacturing value-added, considering both direct and indirect input usages; then, we directly quantify the effect of services development on the export performance of manufacturing sectors. In addition, the second hypothesis in this paper considers how the access to foreign services markets may help developing countries to bypass their possibly inefficient domestic services provision.<sup>7</sup> Such a bypass effect is also discussed in a theoretical model by Ju and Wei (2010); they derive the conditions under which financial globalization can

<sup>&</sup>lt;sup>6</sup> We compare our embodied financial services measures with the external financial dependence measures used by Rajan and Zingales (1998) for the U.S. and find a very weak correlation between them, using a concordance between ISIC Rev. 1 and the WIOD sectors (constructed by authors). The simple correlation coefficient is actually negative at -0.32 or -0.36, depending on whether we consider only embodied domestic financial services inputs or embodied domestic and foreign financial services inputs. A note of caution is that our sample period (1995-2007) differs from theirs (1970s and 1980s). Although we tried narrowing the gap as much as we can by picking their measure for year 1980 and ours for 1995, the weak correlation can be partially due to the different time coverages.

<sup>&</sup>lt;sup>7</sup> By distinguishing domestic from foreign services input, we implicitly assume that they are incomplete substitutes. The magnitude of the Armington elasticity of substitution between domestic and foreign varieties depends on several factors such as the time windows (long run vs. short run) and the level of product disaggregation. In general, estimates of the elasticity are usually quite small at macroeconomic level. This is why, for example, Obstfeld and Rogoff (2007) found that rebalancing the U.S. current account would require a 30 percent depreciation of U.S. dollar. Even at sector level, the suggested Armington elasticity in Global Trade Analysis Project (GTAP Commodity Model) is less than two for most of the services categories, generally lower than those of manufacturing sectors (Hertel, 1997). The U.S. International Trade Commission (e.g., USITC-128 Sector Model) uses similar estimates for financial and business services sectors (Donnelly et al., 2004).

serve as a substitute for reforms of domestic financial system. This is also broadly consistent with the theory of comparative advantage – countries with under-developed services sectors benefit from imported services, but our paper shows that these benefits may go beyond services sectors through inter-sectoral linkages.

### III. Empirical strategy and the data

In this section, we test empirically the following two hypotheses.

Hypothesis 1: Greater domestic services development promotes export competitiveness more in those manufacturing sectors that use services as inputs more intensively.

Hypothesis 2: The positive effect of embodied foreign services inputs on manufacturing export competitiveness is stronger in countries with lower levels of domestic services development, especially for manufacturing sectors with a high level of services input intensity.

Although the above two hypotheses seem to be straightforward, the predictions are not unambiguous as discussed in the introduction. The development in services can, on the one hand, draw resources away from manufacturing sectors, and, on the other hand, can also enhance the productivity of manufacturing when more productive services are used as inputs. Whether the net effect is positive or negative is an empirical question.

As for the second hypothesis, how the effects of foreign services on domestic manufacturing sectors are influenced by the level of development of the domestic services sector is not straightforward either. Whether the effect is dampened or enhanced can depend on whether domestic and foreign services are substitutes or complements. We seek to establish some robust patterns on these questions.

In the following, we will lay out our empirical strategy, explain the measures of the key variables and describe the data.

#### *III.1 Empirical strategy*

In our empirical analysis, we use a modified definition of revealed comparative advantage (RCA) to measure the export competitiveness of individual manufacturing sectors. We will explain our modifications after stating our specification.

To test Hypotheses 1, we estimate the effect of services development (D) on manufacturing export performance (RCA), and analyze how this effect depends on services input intensity as measured by the ratio of embodied domestic services in total final demand to manufacturing value-added (or simply *SII*; see a later section for more details). Our baseline regression specification is:

(1)  $RCA_{jst} = \beta_0 + \beta_1 D_{jt} + \beta_2 SII_{jst} + \beta_3 D_{jt} * SII_{jst} + Z\gamma + a_j + a_s + a_t + e_{jst}$ where subscripts *j*, *s*, and *t* refer to exporting country, manufacturing sector and year respectively; *SII* may measure a benchmark country's (U.S.) or each country j's own services input intensity. In some regressions, we will average the measure over time so as to focus on cross-country patterns. In other regressions, we will allow it to vary both over time and across countries. Z is a vector of control variables;  $a_j$ ,  $a_s$ ,  $a_t$  are the country, manufacturing sector and year dummies or fixed effects; and  $e_{jst}$  is an i.i.d. error term. As a robustness check, we also use time-varying country and sector fixed effects (i.e., country\*year and sector\*year).<sup>8</sup> The key parameter of interest is,  $\beta_3$ , which under Hypothesis 1, is positive. This interaction term captures how the impact of service sector development varies with services input intensity of manufacturing sectors.

Our second hypothesis suggests that the effect of *D* on *RCA* depends not only on *SII*, but also on the access to foreign services markets. To capture the relative importance of foreign services inputs compared to domestic services inputs, we measure access to foreign services markets by the share of embodied foreign services in total embodied (domestic and foreign) services in a manufacturing sector of a country (*forsh*).<sup>9</sup> To facilitate the interpretation of the results (and avoid having triple interactions in a regression), we focus on the manufacturing sectors with a high services input intensity. This is justified since the first test will have established that services development is less relevant when a sector relies less on services as inputs. For completeness, we will run and report the same regressions for all other sectors with low *SII* to show how the results

<sup>&</sup>lt;sup>8</sup> For now, we do not use country\*sector fixed effects in these regressions for at least two reasons. First, the positions of countries in terms of RCA and key explanatory variables are quite stable during our sample period and there is limited variation in these variables' over time. For example, the variations of RCA within country\*sector are less than a quarter of the variations between country\*sector. Second, interpolation is often used to fill the data between benchmark years for the WIOD, so the within variations for a sector of a country may not be very informative (Timmer 2012). Instead, we include in our regressions several variables that vary across countries and sectors to control for the heterogeneity at country\*sector level. We will revisit this issue later in the section on robustness checks.

<sup>&</sup>lt;sup>9</sup> For instance, a country with low embodied foreign services does not necessarily mean that this country is not open to foreign markets, especially when it also uses limited domestic services inputs. The low foreign services input intensity of this country is probably just because the technology it adopts requires little services inputs. Therefore, the share of embodied foreign services can capture better a country's openness or access to foreign services markets.

differ. The specification of the regressions is similar to equation (1), except that we replace *SII* with *forsh* as follows:

(2) 
$$RCA_{jst} = \theta_0 + \theta_1 forsh_{jst} + \theta_2 D_{jt} + \theta_3 D_{jt} * forsh_{jst} + \mathbf{Z}\boldsymbol{\gamma} + a_j + a_s + a_t + e_{jst}$$

According to Hypothesis 2,  $\theta_1$  is expected to be positive, while  $\theta_3$  should be negative.

### III.2 Measures of RCA

The original concept of RCA was proposed by Balassa (1965). Conventional export RCA of a country j's sector s is defined as the share of gross exports (X) of sector s in j's total gross exports relative to the world average share of the same sector s in world gross exports as follows:

$$RCA_X_{js} = \left(\frac{X_{js}}{\sum_{s=1}^N X_{js}}\right) / \left(\frac{\sum_{i=1}^G X_{is}}{\sum_{s=1}^N \sum_i^G X_{is}}\right), \text{ where country } i, j = 1, 2, ..., G; \text{ sector } s=1, 2, ..., N$$

where G is the total number of countries in the world and N is the total number of sectors. The RCA measure has been used extensively in the literature to measure the competitiveness of a country in a particular sector. When the RCA exceeds one, the country is deemed to have a revealed comparative advantage in that sector; when it is below one, the country is deemed to have a revealed comparative disadvantage in that sector.

Koopman, Wang, and Wei (2014) and Wang, Wei, and Zhu (2013) point out that the traditional RCA ignores production sharing in two ways. First, it ignores the fact that a country-sector's value-added may be exported indirectly via the country's exports in other sectors. Second, it ignores the fact that a country-sector's gross exports partly reflect foreign content. For these reasons, the traditional measure does not accurately capture whether the export of a specific sector's value-added from a particular country is truly above or below the world average. A conceptually correct measure of comparative advantage needs, on the one hand, to exclude foreign-originated value-added and pure double-counted terms in gross exports, and, on the other hand, to include indirect exports of a sector's value-added through other sectors of the exporting country. When a country uses imported intermediate goods intensively to produce for its exports, Koopman, Wang and Wei (2014) show that RCA based on gross exports can be misleading. As double counting of certain value-added components appears to rise over time as percent of the official trade statistics, the traditional computation of RCA becomes increasingly less accurate. The gross export decomposition method suggested by Koopman, Wang and Wei (2014) provides a way to

remove the distortion of double counting by focusing on domestic value-added in exports. We calculate RCA based on *valued added exports (VAX) in gross exports*, rather than gross exports, for country j in sector s as follows (i, j = 1, 2, ..., G; s = 1, 2, ..., N).

$$RCA\_VAX_{js} = \left(\frac{VAX_{js}}{\sum_{s=1}^{N} VAX_{js}}\right) / \left(\frac{\sum_{i=1}^{G} VAX_{is}}{\sum_{s=1}^{N} \sum_{i}^{G} VAX_{is}}\right)$$

The above new RCA measure is the share of a country-sector's forward-linkage based measure of VAX in the country's total VAX relative to that sector's total VAX of all countries as a share of global VAX. VAX are produced at home but ultimately absorbed abroad.<sup>10</sup>

The conventional RCA measure based on gross exports (the dependent variable) can cause an endogeneity problem because the embodied services (an explanatory variable) are part of gross manufacturing exports. Our paper addresses this endogeneity problem because manufacturing RCA is based on the value-added by the factors employed in manufacturing sectors, not including the embodied services in gross exports which are contributed by the factors employed in services sectors. Intuitively, we focus on how services help factors employed in manufacturing sectors to create value by improving their productivity, reducing costs, or both.<sup>11</sup>

Algebraically, the value-added exports based measure of RCA (which we will label as RCA\_VAX) differs from the conventional, gross exports based measure (which we label as RCA\_X). But are the differences empirically important? After we compute both measures, a simple t-test rejects the null hypothesis that RCA\_X = RCA\_VAX with a p-value at 0.0017. We also calculate a ratio as RCA\_VAX / RCA\_X. It shows that RCA\_VAX is on average 25% larger than RCA\_X in our sample. For 58% of the observations, RCA\_VAX is bigger than RCA\_X, with the rest falling into the opposite case. For 10% of the observations, RCA\_VAX is less than 74% of RCA\_X. For another 10% of the observations, RCA\_VAX is more than 1.68 times larger than RCA\_X. The first diagram in Figure 2 is a histogram of RCA\_VAX/RCA\_X for all of the observations in our sample (except some outliers as explained in the notes of the figure). It shows

<sup>&</sup>lt;sup>10</sup> VAX in this paper (based on forward-linkage based GDP or value-added decomposition) is different from the backward-linkage based VAX in Wang, Wei, and Zhu (2013). The right decomposition of GDP should be based on forward-linkage, while the right gross trade flow decomposition should be based on backward-linkage. VAX in Wang, Wei, and Zhu (2013) is bounded by gross exports, while the VAX in our current paper is not. At aggregate level, however, the two types of VAX should be the same and always bounded by a country's total gross exports.

<sup>&</sup>lt;sup>11</sup> Miroudot and Cadestin (2017) provide a detailed discussion on how services help manufacturing sectors to create values by facilitating exchange among users and by solving problems and bringing tailored solutions. See also Heuser and Mattoo (2017) for a review of services in global value chains.

that, for a large portion of observations in our sample, RCA\_VAX/RCA\_X differs significantly from 1. Figure 2 also provides the scatter plots of RCA\_VAX against RCA\_X for each of the 14 WIOD manufacturing sectors in 2005. For every sector, there are countries that locate considerably away from the 45 degree line. We conclude that the differences between the two RCA measures is economically and statistically significant.

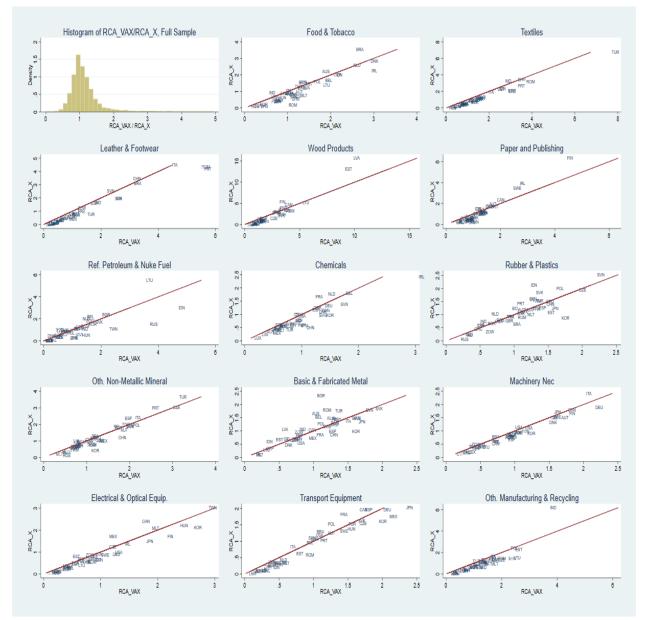


Figure 2: The histogram shows the distribution of RCA\_VAX/RCA\_X for all countries, sectors and years used in our analysis but drops about 1% of the observations as outliers when this ratio is larger than 5. All of the scatter plots of RCA\_VAX against RCA\_X for each manufacturing sector use only the data for year 2005. The straight lines are the 45 degree lines. Each country is labeled with its 3-digit ISO code.

## III.3: Measurement of embodied services and services input intensity (SII)

We compute embodied services in manufacturing sectors using a method developed by Koopman, Wang and Wei (2014) and Wang, Wei, and Zhu (2013) that generalizes the vertical specialization measures proposed by Hummels, Ishii and Yi (2001). Assume a world with G countries, in which each country produces goods in N tradable sectors. Goods and services produced in each sector can be consumed directly or used as intermediate inputs, and each country exports both intermediate and final goods to other countries. All gross outputs (X) produced by a country must be used as intermediate goods/services or as final goods/services (F), i.e.,

(3) 
$$X_i = \sum_{j=1}^{G} (A_{ij} X_j + F_{ij}), \quad i, j = 1, 2, ..., G$$

where  $X_i$  is the N×1 gross output vector of country i,  $F_{ij}$  is the N×1 vector for final goods and services produced in country i and consumed in country j, and  $A_{ij}$  is the N×N input-output coefficient matrix, giving intermediate use in j of goods and services produced in i.

The G-country, N-sector production and trade system can be written as an inter-country input-output (ICIO) model in block matrix notation as follows.

(4) 
$$\begin{bmatrix} X_1 \\ X_2 \\ \vdots \\ X_G \end{bmatrix} = \begin{bmatrix} A_{11} & A_{12} & \cdots & A_{1G} \\ A_{21} & A_{22} & \cdots & A_{2G} \\ \vdots & \vdots & \ddots & \vdots \\ A_{G1} & A_{G2} & \cdots & A_{GG} \end{bmatrix} \begin{bmatrix} X_1 \\ X_2 \\ \vdots \\ X_G \end{bmatrix} + \begin{bmatrix} F_{11} + F_{12} + \cdots + F_{1G} \\ F_{21} + F_{22} + \cdots + F_{2G} \\ \cdots \\ F_{G1} + F_{G2} + \cdots + F_{GG} \end{bmatrix}$$

After rearranging, we have

$$(5) \qquad \begin{bmatrix} X_1 \\ X_2 \\ \vdots \\ X_G \end{bmatrix} = \begin{bmatrix} I - A_{11} & -A_{12} & \cdots & -A_{1G} \\ -A_{21} & I - A_{22} & \cdots & -A_{2G} \\ \vdots & \vdots & \ddots & \vdots \\ -A_{G1} & -A_{G2} & \cdots & I - A_{GG} \end{bmatrix}^{-1} \begin{bmatrix} \sum_{j=1}^G F_{1j} \\ \sum_{j=1}^G F_{2j} \\ \vdots \\ \sum_{j=1}^G F_{2j} \end{bmatrix} = \begin{bmatrix} B_{11} & B_{12} & \cdots & B_{1G} \\ B_{21} & B_{22} & \cdots & B_{2G} \\ \vdots & \vdots & \ddots & \vdots \\ B_{G1} & B_{G2} & \cdots & B_{GG} \end{bmatrix} \begin{bmatrix} F_1 \\ F_2 \\ \vdots \\ F_G \end{bmatrix}$$

where *I* is an NxN identity matrix, and  $B_{ij}$  denotes the N×N block Leontief inverse matrix, which is the total requirement matrix that gives the amount of gross outputs in producing country *i* required for a one-unit increase in final demand in destination country *j*.

Let  $V_i$  be the N×1 direct value-added coefficient vector. Each element of  $V_i$  gives the ratio of direct domestic value-added to gross output (exports) for country i at sector level. This is equal to

one minus the intermediate input share from all countries (including domestically produced intermediates):

(6) 
$$V_i = (u - \sum_{j=1}^G A_{ji}u)$$

where *u* is an Nx1 unit vector of 1. Putting all  $V_i$  in the diagonal and denoting it with a hatsymbol  $(\hat{V}_i)$ , we can define a GN×GN matrix of direct domestic value-added coefficients for all countries as,

(7) 
$$\hat{V} = \begin{bmatrix} \hat{V}_1 & 0 & \cdots & 0 \\ 0 & \hat{V}_2 & \cdots & 0 \\ \vdots & \vdots & \ddots & \vdots \\ 0 & 0 & \cdots & \hat{V}_G \end{bmatrix}$$

Putting final demand in the diagonals, we can define another GN×GN matrix of all countries' final demand as

(8) 
$$\hat{F} = \begin{bmatrix} \hat{F}_1 & 0 & \cdots & 0 \\ 0 & \hat{F}_2 & \cdots & 0 \\ \vdots & \vdots & \ddots & \vdots \\ 0 & 0 & \cdots & \hat{F}_G \end{bmatrix}$$

Then the decomposition of value-added in final demand can be conducted by following equation:

$$\hat{VB}\hat{F} = \begin{bmatrix} \hat{V}_{1} & 0 & \cdots & 0 \\ 0 & \hat{V}_{2} & \cdots & 0 \\ \vdots & \vdots & \ddots & \vdots \\ 0 & 0 & \cdots & \hat{V}_{G} \end{bmatrix} \begin{bmatrix} B_{11} & B_{12} & \cdots & B_{1G} \\ B_{21} & B_{22} & \cdots & B_{2G} \\ \vdots & \vdots & \ddots & \vdots \\ B_{G1} & B_{G2} & \cdots & B_{GG} \end{bmatrix} \begin{bmatrix} \hat{F}_{1} & 0 & \cdots & 0 \\ 0 & \hat{F}_{2} & \cdots & 0 \\ \vdots & \vdots & \ddots & \vdots \\ 0 & 0 & \cdots & \hat{F}_{G} \end{bmatrix}$$

$$= \begin{bmatrix} \hat{V}_{1}B_{11}\hat{F}_{1} & \hat{V}_{1}B_{12}\hat{F}_{2} & \cdots & \hat{V}_{1}B_{1G}\hat{F}_{G} \\ \hat{V}_{2}B_{21}\hat{F}_{1} & \hat{V}_{2}B_{22}\hat{F}_{2} & \cdots & \hat{V}_{2}B_{2G}\hat{F}_{G} \\ \vdots & \vdots & \ddots & \vdots \\ \hat{V}_{G}B_{G1}\hat{F}_{1} & \hat{V}_{G}B_{G2}\hat{F}_{2} & \cdots & \hat{V}_{G}B_{GG}\hat{F}_{G} \end{bmatrix}$$

where  $\hat{VB}\hat{F}$  is a GN×GN square matrix that gives the estimates of sector and country sources of value-added in a country's total final demand. Each block matrix  $\hat{V}_i B_{ij} \hat{F}_j$  is an N×N square matrix, with each element representing the value-added from a source sector of a source country directly 15

or indirectly used by an absorbing sector in a destination country's total final demand (both domestic and foreign). Because we assume that the same technology is used in the production meeting a country's domestic demand and foreign demand (exports), we use total final demand, which is the sum of domestic final demand and final export demand, to calculate embodied services ratios.

Based on equation (9), for each manufacturing sector s, we create the following measure of domestic services input intensity in manufacturing sectors in country i:

(10) 
$$SII_{js}^{service} = v_j^{service} b_{jjs}^{service} f_{js} / VA_{js}, \ j = 1, 2, ..., G$$

where  $v_j^{service} b_{jjs}^{service} f_{js}$ , an element in equation (9), refers to country j's domestic services values embodied in country j's total final demand in a manufacturing sector (subscript s);  $VA_{js}$  is the total value-added created by the factors employed in the manufacturing sector s in the exporting country j (or j's GDP of its manufacturing sector s). *SII* defined in formula (10) is a scalar for a specific services and manufacturing sector in a country j in a given year. The numerator on the right hand side of formula (10) refers to the value-added contributed directly and indirectly by the factors employed in a services sector, while the denominator measures the value-added contributed by factors employed in a manufacturing sector of a particular country. Therefore, the numerator is not a part of the denominator and the *SII* measure is not bounded by one, although it is always less than one in the data. It would be bounded by one if we used the gross manufacturing output in the denominator, and the *SII* of one services sector would likely be negatively correlated to the *SII* of other goods or services sectors, and so omitted variable bias can be a problem if we do not include all other sectors in our analysis. The strategy we adopt to measure *SII* as in formula (10) can help us to avoid this problem and keep our specification simple.

It is tempting to use a country's own services input intensity (*SII*) directly in the regression. But there are a number of issues with such a strategy. *SII* of a country with underdeveloped services sectors (e.g., financial repression) may not be able to capture the required services input intensity along the manufacturing production possibility frontier. Hence, instead of using countries' own services input intensities, we use U.S. services input intensity for all the countries under the assumption that the U.S. is among the countries with the least financial and business services transaction costs and frictions. If inter-sectoral linkage is considered as a feature of the production technology, it should be the same across countries in the absence of services under-development. Adopting a similar strategy, Rajan and Zingales (1998) measure industries' dependence on external funds using only U.S. data for all countries covered by their analysis. Figure 3 shows a scatter plot of the domestic financial services input intensity in manufacturing against the business services input intensity for each of the WIOD countries in 2005.<sup>12</sup> As we expect, U.S. embodied services ratios are among the highest for both financial and business services.

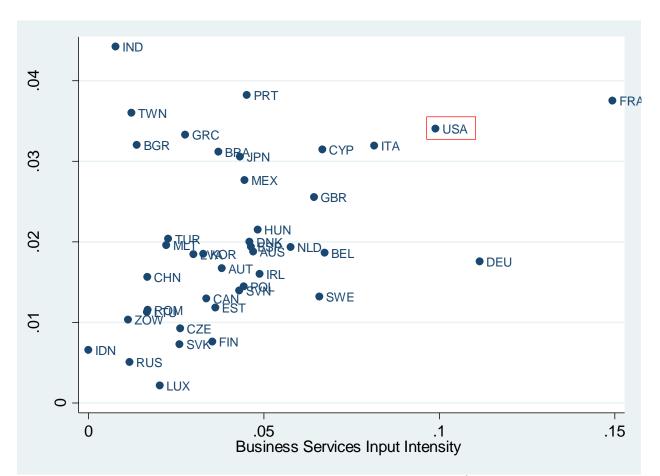


Figure 3: Scatter plot of average financial services input intensity  $(SII^{f})$  against average business services input intensity  $(SII^{b})$  for all manufacturing sectors, year 2005. Each country is labeled with its 3-digit ISO code. Data Source: WIOD.

Another problem with using countries' own services input intensity is a potential endogeneity issue because a country's embodied services and services development can also be affected by its own manufacture performance. For example, a country like India with comparative disadvantage

<sup>&</sup>lt;sup>12</sup> The countries covered by the WIOD and their ISO codes are listed in Appendix 2.

in manufacturing may choose to specialize in services, which in turn will promote services development and reduce embodied services due to the weakness of manufacturing sectors. The maintained assumption we need is that the financial and business service sectors in the United States are well developed, so that the usage of these services observed in a given manufacturing sector reflects its intrinsic technical demand, rather than the supply constraints in the service sector. When we use only U.S. embodied services, the feedback or reverse causality to the U.S. embodied services from other countries' manufacturing export RCA is not a significant concern. In our regression sample, we will drop all U.S. observations to further alleviate the endogeneity problem. Finally, as another justification for using U.S. measures, the U.S. is arguably one of the countries with the most reliable data.

We will either use the time-varying U.S. services input intensities or take their averages over years. An advantage of the former measure is that it retains the time variations, while the later measure can smooth out temporal fluctuations and hence is less sensitive to outliers. The variations in the U.S. services input intensities over the years are small for most of the WIOD sectors and some of the input-output data in the WIOD are filled in based on interpolation. Therefore, we will take the averaged measure as the benchmark and use the time-varying measure only as a robustness check. When average U.S. SII<sub>s</sub> is used, this variable will drop out of regressions with sector or time-varying sector fixed effects. When time-varying sector fixed effects are used, SII<sub>st</sub> will also be dropped.

Note that even a measure based on U.S. data is still a proxy intending to capture the potential linkage between services and manufacturing sectors. A noisy measure, however, should create a bias against finding a significant effect of services intensity on manufacturing RCA. Should we be able to find a better measure, the effect is likely to be even stronger.

In our empirical analysis, for each manufacturing sector s, we also use the share of foreign embodied services in the total embodied domestic and foreign services as follows (for country j):

(11) 
$$forsh_{js}^{service} = \sum_{i,i\neq j}^{G} v_i^{service} b_{ijs}^{service} f_{js} / \sum_{i=1}^{G} v_i^{service} b_{ijs}^{service} f_{js}$$

The denominator in equation (11) sums  $v_i^{service} b_{ijs}^{service}$  over all source countries i=1, 2, ..., G, including j itself, while the nominator leaves out country j's own (domestic) embodied services.

## III.4 Measures of domestic services development (D)

Our main services development measure (D) is defined as the average value-added per worker. It is calculated as total value-added divided by total number of employees for financial or business services based on the data from the WIOD and its Socio-Economic Accounts (SEA). It is commonly used as a measure for labor productivity in services sectors, which should be closely linked to the levels of services development.

Alternatively, we use the shares of financial or business services value added in GDP to measure domestic services development. Services sectors, especially modern ones like financial and business services, usually account for larger shares in total value-added in countries with more developed services sectors. A higher share of financial or business services value-added is a typical feature of a modern economy, and hence capture the level of development of these sectors. However, this may not always be the case for other sectors, such as agricultural and manufacturing, as suggested by the literature on structural change (see, e.g., Kongsamut, Rebelo and Xie (2001), among others).

We also use other measures of services development to check for the robustness of our results when data are available. Following the tradition in the literature, as in Rajan and Zingales (1998), we adopt two alternative measures for financial services development using the data from the World Bank Global Financial Development Database (GFDD). GFDD is an extensive dataset of financial system characteristics for 203 economies from 1960 to 2010. The first measure is the bank private credit to GDP ratio, which is defined as the share of financial resources provided to the private sector by domestic banks in a country's GDP, originally from the International Financial Statistics of the IMF.<sup>13</sup> The second measure is the share of the bank private credit and stock market capitalization in GDP. Stock market capitalization refers to the total value of all listed shares in a stock market based on Standard & Poor's Global Stock Markets Factbook and supplemental S&P data.

## III.5 Data and some stylized facts on embodied services

<sup>&</sup>lt;sup>13</sup> Domestic money banks comprise commercial banks and other financial institutions that accept transferable deposits, such as demand deposits.

The primary data source for this study is the WIOD (2013 Version) which covers 35 industries for 40 countries over 1995-2007, so our data structure is a panel at country-sector level over 13 years (see Appendixes 1 and 2 for lists of WIOD sectors and countries).<sup>14</sup> The original 2013 version of the WIOD data cover years 1995-2009, but we drop the data for 2008-2009 to avoid potential complication resulting from the 2008 global financial crisis. We consider all of the manufacturing sectors (WIOD sectors 3-16), and focus on two types of modern services: financial intermediation services (WIOD sector 28) and other business services sector (WIOD sector 30).

To illustrate the importance of embodied services and to motivate our empirical analysis, Online Data Appendix Table A1 shows some data on the gross exports (X) and value-added exports (VAX) of financial services for WIOD countries over 1995-2007. We further separate VAX into direct value added exports (dVAX) and indirect value added exports through all other sectors (indVAX).<sup>15</sup> The last row reports the world total for all the WIOD economies. Overall, VAX of services are 53 percent higher than the gross exports, and indirect VAX are 88 percent higher than the direct VAX. Among the 40 WIOD countries/regions excluding ROW (the rest of the world), only three of them (Ireland, Luxembourg, and U.K.) have direct VAX higher than indirect VAX. The BRICs (Brazil, Russia, India, and China), Japan, Korea, Lithuania, Turkey, and Taiwan have much higher indirect VAX than direct VAX (especially China, Russia, and Turkey). Financial services in these countries may have reached an intermediate level of development at which they can compete in the domestic market but not yet internationally. It could also be that restrictions on cross-border imports in these countries oblige goods producers to use domestically produced services. For instance, if firms in China have no easy access to foreign financial services due to high service trade barriers, they will have to use domestic financial services (e.g., loans from state-owned banks).

The Online Data Appendix Table A2 for business services, analogous to Table A1, presents a similar pattern. Japan and some emerging economics (e.g., Mexico, Russia, and especially

<sup>&</sup>lt;sup>14</sup> Romania is not covered by the regressions due to missing employment data. Because the U.S. is used as the benchmark country to define services input intensity, it is also dropped from most of the regressions to alleviate potential endogeneity problem as explained in Section III.3. More details on sample coverage are discussed in the Online Data Appendix.

<sup>&</sup>lt;sup>15</sup> VAX can be bigger than X because it includes not only direct exports of a service sector, but also the indirect valueadded exports of services through other sectors.

Turkey) have much higher indirect business services VAX than direct VAX.<sup>16</sup> Most of the highincome countries such as the United States and the United Kingdom export a large volume of business services both directly and indirectly. By comparison, developing or emerging economies export significantly less business services, with the exception of India. India has developed an internationally competitive business services industry which has large direct VAX. However, India's indirect services exports are small, as domestic manufacturing sectors use relatively limited modern services and manufacturing exports are also weak.

Tables A3 and A4 are two similar tables for some manufacturing sectors with high or low services input intensity, respectively. Using information from Appendix 3, we select two manufacturing sectors with high financial and business services intensity: Food, Beverages and Tobacco (WIOD sector 3) & Leather and Footwear (WIOD sector 5); we also select two other manufacturing sectors with low financial and business services intensity: Other Non-Metallic Mineral (WIOD sector 11) & Basic and Fabricated Metal (WIOD sector 12). A few things stand out. First, VAX is always smaller than X for these sectors, although in theory the forward-linkage based VAX is not bounded by X. This is different from what we see in Tables A1 & A2, where VAX is mostly higher than X. This implies that services are used to a significant extent as inputs in other sectors and are exported indirectly, but manufactured goods are used to a limited extent as inputs and are exported indirectly through other sectors. The indirect VAX to direct VAX ratio (ratio2) is mostly less than one. Services sectors appear to be more upstream than manufacturing sectors.<sup>17</sup>

Other major determinants of manufacturing RCA considered in this paper are constructed based on standard trade theories. The total factor productivity (TFP) captures the Ricardian source of comparative advantage and it is estimated using the dual approach as in Hsieh (2002) for each WIOD manufacturing sector. It is calculated as an average of the growth rate of labor price or wage ( $g_W$ ) and the growth rate of capital rental rate ( $g_R$ ), weighted by the share of payment to labor

<sup>&</sup>lt;sup>16</sup> Japan is well-known for its competitive manufacturing but relatively inefficient services sectors. See, for example, a report at <u>https://www.economist.com/node/3219857</u>. As a result, Japan exports business services mainly indirectly through manufacturing sectors.

<sup>&</sup>lt;sup>17</sup> Compared to Table A4 for sectors with low SII, VAX/X or ratio in Table A3 is lower, probably because sectors 3 & 5 use a lot of services as inputs which contribute to their larger gross exports (X) and hence smaller VAX/X ratio. We also calculate the average VAX/X ratio for all of the manufacturing sectors. This ratio is negatively correlated with manufacturing sectors' financial and business SII, with a simple correlation coefficient of -0.8. Consistent with what we see from Tables A3 & A4, manufacturing sectors with high SII tend to have lower VAX/X ratios.

(s<sub>L</sub>) and capital (s<sub>K</sub>): TFP =  $s_K * g_R + s_L * g_W$ . For this method to be valid, no assumptions are needed for the relations between factor prices and social marginal products or about the production function form as long as the total factor payments add up to total output (i.e., Y = R\*K + W\*L). We expect to see a positive association between TFP and RCA.

We also include two variables to capture the Heckscher-Ohlin (HO) source of comparative advantage based on factor endowment including capital-labor ratio (K/L) and skill ratio which is defined as the share of the wage payment to high skill workers in total wage payment. These variables vary across countries and sectors and over time. Following Chor (2010), HO\_SK is defined as the product of a country's economy-wide skill ratio and the skill ratio of a particular manufacturing sector in the same country; and HO\_K/L is defined as the product of a country's overall K/L and the K/L of a particular manufacturing sector in the same country. Chor (2010) finds that countries that are more skill abundant exhibit higher volumes of bilateral exports in more skill-intensive industries; similarly, countries that have more physical capital per worker tend to export more in capital-intensive industries. Similar findings can be found in Romalis (2004). Therefore we would expect to obtain positive coefficients from the two HO variables.

The scale economy effect as suggested by the new trade theory is captured by a manufacturing sector's total employment size, measured in logarithms.<sup>18</sup> We expect to see a positive correlation between this variable and RCA.

In addition, to capture the increasingly important role of cross-border value chains, we also include a measure for GVC participation. Wang et al. (2017) propose a framework to decompose total production activities into different types, depending on whether they are for pure domestic demand, traditional international trade, simple GVC activities (intermediate inputs that cross a border only once before being embodied in final products), and complex GVC activities (intermediate inputs that cross borders at least twice before being embodied in final products). Then they construct indices of GVC participation to measure the degree of a sectors' GVC participation – a concept similar to the vertical specialization (VS1) as in Hummels, Ishii, and Yu (2001) but with a few important improvements. We include a measure of forward industrial linkage based GVC participation to estimate how a country/sector's engagement in GVC activities

<sup>&</sup>lt;sup>18</sup> To retain zero values, we use log(employment\*1000+1) in the regressions. We multiply employment by 1000 because the original unit of measurement of employment in the WIOD-SEA database is 1000 workers.

strengthens its overall export performance. Instead of using the simple GVC index or the complex GVC index, we use a comprehensive measure which addes up the two indexes. Finally, we also control for the levels of countries' overall development using the GDP per capita data from the Penn World Tables.

These control variables are mostly constructed or estimated using data from the WIOD and its Socio-Economic Accounts (SEA). More details on the variables, data sources, sample coverage, and variable summary statistics can be found in the Online Data Appendix.

#### **IV. Empirical results**

In this section, we will test empirically our first hypothesis, carry out various robustness checks, address the endogeneity problem, and then test the second hypothesis.

### *IV.1. Baseline results*

In Table 1, we estimate the specification in equation (1). The dependent variable is manufacturing export RCA calculated based on VAX. The U.S. domestic services input intensity is averaged over 1995-2007 and treated as time-invariant. The financial (business) services development measure (D) is defined as services value-added per worker. Because the embodied services measures are based on U.S. data, we drop the observations for the U.S. from the regressions to alleviate the potential endogeneity problem. To facilitate the interpretation of the coefficients, we report the standardized beta coefficients (i.e., the point estimate of a coefficient times the standard deviation of the regressor in question and divided by the standard deviation of the dependent variable). With this standardization, the coefficient can be directly read as the number of standard deviations the dependent variable will change if the regressor in question is increased by one standard deviation in the sample.

In the first three columns of Table 1, we consider financial services (f), business services (b), and the combined financial and business services (fb) respectively. Country, year, and manufacturing sector dummies are all included in the first three regressions. Standard errors are always robust to heteroscedasticity and are also clustered by country to address the potential serial and inter-sectoral correlations in the error terms for a particular country.

The coefficient of services development (D) is always negative but insignificant at the 10% level. The coefficient of the key interaction term is always positive and highly significant. The results imply that financial services development reduces manufacturing RCA when embodied financial services are sufficiently low. This is not surprising given the definition of RCA: services development tends to increase a country's services export RCA and should lower some manufacturing sectors' export RCA if these manufacturing sectors do not benefit much from services development due to their low services input intensity. When embodied services in a sector are sufficiently high, greater services development can increase that manufacturing sector's RCA. These results provide strong support for our first hypothesis. The last three columns of Table 1 are analogous to the first three regressions except that we include time-varying country and time-varying sector fixed effects and cluster the standard errors by country\*year. As a result, services development measures and log(GDP/capita) are dropped from the regressions. The three regressions.

The control variables in Table 1 have the expected signs. Consistent with trade theories, manufacturing productivity (*TFP*), Heckscher-Ohlin type of variables (*HO\_SK* and *HO\_K/L*), the measure of scale economy (*log(employment)*) and GVC participation increase a country's comparative advantage in manufacturing exports.<sup>19</sup> Their effects are mostly significant at the 10% level. Interestingly, *log(GDP/capita)* does not have a significant effect. Among all of the variables, both the economic significance and the size of the standardized beta coefficient of D\*SII are among the highest ones, only next to log(employment) and GVC participation variables.

	(1)	(2)	(3)	(4)	(5)	(6)
$\mathbf{D}^{\mathrm{f}}$	-0.097					
	(0.183)					
D <sup>f</sup> *SII <sup>f</sup>	0.209***			0.238***		
	(0.002)			(0.000)		
$D^b$		-0.082				
		(0.217)				
D <sup>b</sup> *SII <sup>b</sup>		0.223***			0.233***	
		(0.001)			(0.000)	
$\mathbf{D}^{\mathrm{fb}}$			-0.115			
			(0.116)			

<sup>&</sup>lt;sup>19</sup> Wang et al. (2017) construct indices for simple, complex and overall GVC participation. We use only the overall measure in our regressions. The results are robust to other measures.

Dfb*SIIfb			0.249***			0.268***
			(0.000)			(0.000)
log(GDP/capita)	0.000	-0.027	-0.021			
	(0.999)	(0.874)	(0.900)			
TFP	0.023*	0.023*	0.024*	0.048***	0.048***	0.048***
	(0.094)	(0.095)	(0.087)	(0.002)	(0.002)	(0.002)
HO_SK	0.076	0.064	0.065	0.162***	0.149***	0.147***
	(0.139)	(0.228)	(0.225)	(0.000)	(0.000)	(0.000)
HO_K/L	0.075***	0.079***	0.079***	0.077***	0.080***	0.081***
	(0.004)	(0.002)	(0.003)	(0.000)	(0.000)	(0.000)
log(employment)	1.899***	1.896***	1.910***	1.941***	1.934***	1.949***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
GVC Participation	0.408***	0.398***	0.402***	0.427***	0.416***	0.421***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Country FEs	Yes	Yes	Yes			
Sector FEs	Yes	Yes	Yes			
Year FEs	Yes	Yes	Yes			
Country*Year FEs				Yes	Yes	Yes
Sector*Year FEs				Yes	Yes	Yes
Observations	6,184	6,184	6,184	6,184	6,184	6,184
R-squared	0.561	0.562	0.564	0.575	0.575	0.577

Table 1: The effects of services development on manufacturing export RCA (the baseline regressions). The dependent variable is manufacturing export RCA\_VAX. D<sup>f</sup> (D<sup>b</sup>) refers to financial (business) services value-added per worker. D<sup>fb</sup> refers to financial & business services value-added per worker. SII<sup>f</sup> (SII<sup>b</sup>) is the ratio of the U.S. embodied domestic financial (business) services to U.S.' manufacturing value-added, averaged over 1995-2007. SII<sup>fb</sup> = SII<sup>f</sup> + SII<sup>b</sup>. All WIOD manufacturing sectors 3-16 are covered (not grouped together). The standardized beta coefficients rather than the regular regression coefficients are reported. The p-values based on robust standard errors in parentheses, clustered by country in the first three regressions, and clustered by country\*year in the last three regressions. \*\*\* p<0.01, \*\* p<0.05, \* p<0.1.

## IV.2. Robustness checks: alternative measures of D and SII

In this section, we perform various robustness checks. In Table 2, we use several alternative measure of services development. To save space, we report here only the results from regressions using time-varying country and time-varying sector dummies. The results from regressions using separate country, sector and year dummies are similar and available upon request. In the first three columns, domestic services development (D) is defined as the share of services value-added in GDP (D<sup>f</sup>, D<sup>b</sup>, or D<sup>fb</sup>). Our previous results continue to hold well. The coefficients of the interaction term D\*SII are always positive and significant at the 1% level, similar to the results in Table 1.

(0.000) D <sup>b</sup> *SII <sup>b</sup> 0.246***	)	(5)	(4)	(3)	(2)	(1)	
D <sup>b</sup> *SII <sup>b</sup> 0.246***							D <sup>f</sup> *SII <sup>f</sup>
						(0.000)	
(0,000)					0.246***		D <sup>b</sup> *SII <sup>b</sup>
(0.000)					(0.000)		

Dfb*SIIfb			0.378***		
			(0.000)		
$D^{f1*}SII^{f}$			× /	0.211***	
				(0.000)	
$D^{f2}*SII^{f}$				. ,	0.224***
					(0.000)
TFP	0.049***	0.048***	0.048***	0.052***	0.048***
	(0.002)	(0.002)	(0.002)	(0.001)	(0.003)
HO_SK	0.166***	0.169***	0.165***	0.175***	0.177***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
HO_K/L	0.079***	0.077***	0.080***	0.083***	0.083***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
log(employment)	1.930***	1.924***	1.954***	1.932***	1.946***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
GVC Participation	0.431***	0.427***	0.433***	0.427***	0.428***
-	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Country*Year FEs	Yes	Yes	Yes	Yes	Yes
Sector*Year FEs	Yes	Yes	Yes	Yes	Yes
Observations	6,198	6,198	6,198	5,782	5,755
R-squared	0.574	0.574	0.580	0.578	0.577

Table 2: Robustness check (1), alternative measure of services development. The dependent variable is manufacturing export RCA\_VAX. D<sup>f</sup> (D<sup>b</sup>) refers to the share of financial (business) services value-added in GDP. D<sup>fb</sup> refers to the share of financial & business services value-added in GDP (D<sup>fb</sup> = D<sup>f</sup> + D<sup>b</sup>). D<sup>f1</sup> refers to the ratio of bank credits to private sectors to GDP. D<sup>f2</sup> is the ratio of bank credits to private sectors and stock market capitalization to GDP. SII<sup>f</sup> (SII<sup>b</sup>) is the ratio of the U.S. embodied domestic financial (business) services to U.S.' manufacturing value-added, averaged over 1995-2007. SII<sup>fb</sup> = SII<sup>f</sup> + SII<sup>b</sup>. The standardized beta coefficients rather than the regular regression coefficients are reported. The p-values based on robust standard errors in parentheses, clustered by country\*year. All WIOD manufacturing sectors 3-16 are covered (not grouped together). \*\*\* p<0.01, \*\* p<0.05, \* p<0.1.

In the last two columns in Table 2, we use another two alternative measures for financial services as discussed in Section III.4. Because such a measure is not available for the corresponding WIOD business services sector, we perform this robustness check only for financial services. Our previous findings still hold very well.

In Table 3, we examine the sensitivity of our results to alternative measures of services input intensity (SII). We consider here financial and business services separately. Although other countries have generally a much lower average SII than the US, the ranking of manufacturing sectors by SII as listed in the Appendix 3 is not very different across countries. Therefore we would expect to see robust findings from regressions using different countries' SII data.

	Time-varying U.S. SII	Own time-varying SII	Average U.K.'s SII	
	(1) (2)	(3) (4)	(5) (6)	
D <sup>f</sup> *SII <sup>f</sup>	0.208***	0.071***	0.111***	

	(0.000)		(0.000)		(0.005)	
$D^{b*}SII^{b}$		0.190***		0.112***		0.179***
		(0.000)		(0.000)		(0.000)
TFP	0.048***	0.048***	0.049***	0.050***	0.047***	0.046***
	(0.002)	(0.002)	(0.002)	(0.001)	(0.003)	(0.003)
HO_SK	0.163***	0.155***	0.147***	0.148***	0.144***	0.138***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
HO_K/L	0.077***	0.079***	$0.084^{***}$	0.082***	0.072***	0.074***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
log(employment)	1.932***	1.920***	1.930***	1.930***	1.968***	1.965***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
GVC Participation	0.427***	0.418***	0.430***	0.432***	0.426***	0.422***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Country*Year FEs	Yes	Yes	Yes	Yes	Yes	Yes
Sector*Year FEs	Yes	Yes	Yes	Yes	Yes	Yes
Observations	6,184	6,184	6,352	6,352	6,186	6,186
R-squared	0.574	0.573	0.570	0.571	0.571	0.574

Table 3: Robustness check (2), using alternative financial or business services input intensity measures. The dependent variable is manufacturing export RCA\_VAX. D<sup>f</sup> (D<sup>b</sup>) refers to financial (business) services value-added per worker. In regressions (1)-(2), SII<sup>f</sup> (SII<sup>b</sup>) is the ratio of the U.S. embodied domestic financial (business) services to U.S.' manufacturing value-added (not averaged over years). In regressions (3)-(4), SII<sup>f</sup> (SII<sup>b</sup>) measures each country's own services input intensity (not averaged over years). In regressions (5)-(6), SII<sup>f</sup> (SII<sup>b</sup>) is the ratio of the U.K. embodied domestic financial (business) services to U.K.' manufacturing value-added, averaged over 1995-2007. All WIOD manufacturing sectors 3-16 are covered (not grouped together). U.S. observations are dropped from regressions (1)-(2) and the U.K. observations are dropped from regressions (5)-(6). The standardized beta coefficients rather than the regular regression coefficients are reported. The p-values based on robust standard errors in parentheses, clustered by country\*year. \*\*\* p<0.01, \*\* p<0.05, \* p<0.1.

In the first two regressions of Table 3, we replace the *average* U.S. SII with *time-varying* U.S. SII; our main findings remain unchanged, with a slightly smaller coefficient of the interaction term than the corresponding one reported in Table 1. Although the services input intensity of the U.S. is arguably the best choice to capture the role of financial and business services in manufacturing sectors, it is still useful to check the robustness of the results when countries' own SII measures are used. Regressions (3)-(4) in Table 3 are analogous to those in the first two columns, except that we replace U.S. SII with each country's own SII (time-varying). Despite the issue of using a country's own SII as discussed earlier, a benefit is that we can measure the actual SII of each country instead of approximating its potential SII using the U.S. measure. We no longer drop the U.S. observations from this regression. The interaction terms remain positive and significant at the 1% level, but the magnitude of the coefficient is much smaller than the one reported in the first two columns, probably because a country's own SII may not capture well the

potential role of services in manufacturing sectors if services sectors are under-developed as we would expect.<sup>20</sup> In the last two columns, we use the average SII of the U.K., another developed country with competitive services sectors. The results are similar to those when the U.S. data are used: the magnitude of  $D^*SII$ 's coefficient is smaller than what is reported in Table 1 when the U.S. SII data are used.

Finally, although we focus on financial and business services in this paper, we also check the robustness of our findings to other types of services, including sales services (s), transportation services (t), and communication services (c). Appendix 1 provides a list of other services considered in this paper. Table 4 reports the results from regressions using the same specifications as in Table 1. The results are broadly consistent with what we found from financial and business services. Column 4 of Appendix 3 lists the U.S.'s average SII for the additional three types of services categories combined. They are mostly smaller than the financial and business SII but the two are comparable in size. Interestingly, the ranking of U.S. manufacturing sectors based on the SII are the same for the two groups of services (financial & business vs. sales & transportation & communication), keeping in mind that the rankings can differ, at least slightly, when we use more narrowly defined services categories. This implies that a manufacturing sector using intensively financial and business services also tends to use more other types of services in general. Hence it is not surprising to see similar results across different types of services.

	(1)	(2)	(3)	(4)	(5)	(6)
D <sup>s</sup>	-0.026					
	(0.753)					
D <sup>s</sup> *SII <sup>s</sup>	0.206***			0.219***		
	(0.003)			(0.000)		
$\mathbf{D}^{t}$		-0.063				
		(0.422)				
D <sup>t</sup> *SII <sup>t</sup>		0.210***			0.226***	
		(0.002)			(0.000)	
D <sup>c</sup>			-0.061			
			(0.396)			
D <sup>c</sup> *SII <sup>c</sup>			0.184***			0.195***
			(0.005)			(0.000)
log(GDP/capita)	0.015	0.034	0.025			
-	(0.931)	(0.856)	(0.889)			
TFP	0.023*	0.024*	0.024*	0.049***	0.048***	0.050***

 $<sup>^{20}</sup>$  If we also drop U.S. observations from regressions (3)-(4) in Table 3 to make it more comparable to previous regressions using U.S. SII, the results do not change much. The coefficient of the interaction terms is only a bit larger (0.075 and 0.135) and coefficients of other variables are very similar.

	(0.095)	(0.082)	(0.085)	(0.002)	(0.002)	(0.001)
HO_SK	0.062	0.076	0.085*	0.145***	0.148***	0.169***
	(0.240)	(0.125)	(0.088)	(0.000)	(0.000)	(0.000)
HO_K/L	0.079***	0.075***	0.082***	0.080***	0.077***	0.084***
	(0.006)	(0.004)	(0.002)	(0.000)	(0.000)	(0.000)
log(employment)	1.907***	1.913***	1.885***	1.945***	1.953***	1.924***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
<b>GVC</b> Participation	0.411***	0.412***	0.410***	0.430***	0.431***	0.429***
-	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Country FEs	Yes	Yes	Yes			
Sector FEs	Yes	Yes	Yes			
Year FEs	Yes	Yes	Yes			
Country*Year FEs				Yes	Yes	Yes
Sector*Year FEs				Yes	Yes	Yes
Observations	6,184	6,184	6,184	6,184	6,184	6,184
R-squared	0.562	0.562	0.560	0.575	0.576	0.573

Table 4: Robustness checks (3) - other services. The dependent variable is manufacturing export RCA\_VAX. D<sup>s</sup>, D<sup>t</sup>, and D<sup>c</sup> refer to services value-added per worker for sales services (s), transportation services (t), and communication services (c), respectively. SII<sup>s</sup>, SII<sup>t</sup>, SII<sup>c</sup> are the ratios of the U.S. embodied domestic sales/transportation/communication services to U.S.' manufacturing value-added, averaged over 1995-2007. All WIOD manufacturing sectors 3-16 are covered (not grouped together). The standardized beta coefficients rather than the regular regression coefficients are reported. The p-values based on robust standard errors in parentheses, clustered by country in the first three regressions, and clustered by country\*year in the last three regressions. \*\*\* p<0.01, \*\* p<0.05, \* p<0.1.

#### IV.3. The endogeneity of domestic services development

The domestic services development variable (D) is potentially endogenous. For instance, a country like India with comparative disadvantage in manufacturing (lower RCA) may choose to specialize in services, which in turn will promote services development leading to a higher D, which tends to weaken manufacturing exports (even lower RCA). The coefficients for D in Table 1, although insignificant, suggest such a negative relationship. In the law and finance literature, as legal origins are found to be a key determinant of financial development (e.g., La Porta et al., 1997, 1998), researchers have used legal origins to instrument for a country's financial development (e.g., Beck, Demirguc-Kunt, and Levine, 2003). Following this literature, we use the common law and the civil law legal origin dummies as instruments, taking socialist legal origin as the default category. The data on legal origins come from La Porta et al. (1999). Because we have an interaction term D\*SII in the regression, we also use the interactions between legal origin dummies with D as instruments.

The results are reported in Table 5. In the first three regressions, domestic services development (D) is measured by value-added per worker in the service sector. As a robustness check, it is measured by the share of service value-added in GDP in the last three regressions. Note that the D variable itself is dropped from all these regressions because we always include country\*year fixed effects. The large first-stage F statistics imply that the instruments are strong. The regressions also pass the Hansen J over-identification test, although only weakly for financial services. We cannot reject the null that the instruments are uncorrelated with the error term at the 1% level, implying that the instruments are valid. Our previous findings continue to hold as well. The coefficients of the key interaction term, D\*SII, remain positive and highly significant; their magnitude is even larger than that from corresponding OLS regressions reported in Tables 1 and 2. The results for other variables are very similar to what we have found earlier.

	D = Value-added per worker			D = Share	of service val	ue-added in GDP
	(1)	(2)	(3)	(4)	(5)	(6)
D <sup>f</sup> *SII <sup>f</sup>	0.350***			0.537***		
	(0.000)			(0.000)		
D <sup>b</sup> *SII <sup>b</sup>		0.508***			1.077***	
		(0.000)			(0.000)	
D <sup>fb</sup> *SII <sup>fb</sup>			0.447***			0.733***
			(0.000)			(0.000)
TFP	0.047***	0.047***	0.048***	0.049***	0.046***	0.048***
	(0.001)	(0.001)	(0.001)	(0.001)	(0.003)	(0.001)
HO_SK	0.159***	0.126***	0.132***	0.159***	0.166***	0.160***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
HO_K/L	0.077***	0.083***	0.083***	0.083***	0.076***	0.082***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
log(employment)	1.963***	1.980***	1.986***	1.983***	2.012***	2.007***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
GVC Participation	0.428***	0.404***	0.417***	0.439***	0.432***	0.439***
*	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Country*Year FEs	Yes	Yes	Yes	Yes	Yes	Yes
Sector*Year FEs	Yes	Yes	Yes	Yes	Yes	Yes
1 <sup>st</sup> stage F-statistic	311.91	168.9	373.5	209.83	29.84	99.52
(p-value)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Hansen J statistic	5.45	0.124	0.537	5.329	0.273	0.176
(p-value)	(0.020)	(0.725)	(0.464)	(0.021)	(0.601)	(0.675)
Observations	6,184	6,184	6,184	6,198	6,198	6,198
R-squared	0.528	0.518	0.528	0.509	0.442	0.523

Table 5: Robustness checks (4) - 2SLS regression results. The dependent variable is manufacturing export RCA\_VAX. Common law and civil law legal origin dummies and their interactions with SII are used as instruments for variable D\*SII. The standardized beta coefficients rather than the regular regression coefficients are reported. The p-values based on robust standard errors in parentheses, clustered by country\*year. \*\*\* p<0.01, \*\* p<0.05, \* p<0.1.

#### IV.4. Other robustness checks

In this sub-section, we will perform some additional robustness checks and explain why we do not adopt these specifications in our baseline regressions.

First, since *SII* varies over time,  $D \times SII$  will vary by country, sector and year. It is natural to consider including country\*sector fixed effects in addition to country\*year and sector\*year fixed effects. This specification explores the variations in RCA from a change in SII within a sector based on the benchmark country (U.S.) and the change in D in each country.

Second, manufacturing sectors may also use imported foreign services. To enrich our analysis, for each manufacturing sector s, we also construct the following foreign services input intensity (FSII) using the terms and notations as in section III.3:

(12) 
$$FSII_{js}^{service} = \sum_{i,i\neq j}^{G} v_i^{service} b_{ijs}^{service} f_{js} / VA_{js}, \ j = 1, 2, ..., G$$

where  $v_i^{service} b_{ijs}^{service} f_{js}$ , an element in equation (9), refers to country i's domestic services values embodied in country j's total final demand in a manufacturing sector (subscript s). The numerator in equation (12) sums  $v_i^{service} b_{ijs}^{service}$  over all source countries i=1, 2, ..., G, except country j itself so as to capture total imported services embedded in the manufacturing sector in question.  $VA_{js}$  is country j's GDP produced by its manufacturing sector s. In addition to D\**SII*, we include another interaction term D\*FSII in one equation.

The above two additions allow us to check the robustness of our results to a more "complete" specification using both SII and FSII, with a full set of fixed effects including country\*sector, country\*year, and sector\*year dummies. We consider financial and business services together and report the results in Table 6. In the first two regressions, the dependent variable is the RCA\_VAX calculated based on value-added exports (VAX). The U.S. SII and FSII are used in the first regression, while each country's own SII and FSII are used in the second regression. In both regressions, the coefficients of D\*SII remain positive and highly significant as before, while the coefficients of D\*FSII are always insignificant at the 10% level. This is one of the reasons why we choose not to include FSII in the regressions with SII, but rather consider the share of foreign services inputs in total embodied domestic and foreign services later when testing the hypothesis 2.

Finally, in the last column of Table 6, we report the results from a regression using RCA\_X based on gross exports (X) as the dependent variable, as has been used in the literature, with the

same specifications as in the first two regressions. Now even the interaction D\*SII turns highly insignificant. This contrasts sharply with the results in the first regression using RCA\_VAX. The results are similar if we drop D\*FSII from the regression. These differences show the importance of using value-added exports (VAX) instead of gross exports (X) to construct RCA.

Although the results from regressions using country\*sector fixed effects continue to support our previous findings, we do not want to rely solely on the within variations. This exercise with more comprehensive controls requires sufficient variation in SII and D to obtain significant results. Given the limited variations in our key variables over time as discussed in footnote 8, including the full set of fixed effects is demanding and may lead to useful information being discarded. The country\*year fixed effects also bring other challenges. For example, in our previous 2SLS regressions using average SII, we cannot use country-specific time-invariant legal origin dummies as instruments any longer because they and their interaction with SII will be fully absorbed by country\*sector fixed effects. As a result, we choose not to include the country\*sector fixed effects in our baseline regressions.

	Dep Var = RCA	_VAX	Dep Var = RCA_X
	(1)	(2)	(3)
	U.S. SII & FSII	Own SII & FSII	U.S. SII & FSII
$D^{fb}*SII^{fb}$	0.123***	0.076***	-0.002
	(0.007)	(0.000)	(0.973)
Dfb*FSIIfb	-0.060	-0.013	0.002
	(0.131)	(0.412)	(0.959)
TFP	0.045***	0.045***	0.018***
	(0.000)	(0.000)	(0.001)
HO_SK	0.115***	0.105***	0.118***
	(0.000)	(0.000)	(0.000)
HO_K/L	0.052***	0.053***	0.051***
	(0.009)	(0.009)	(0.000)
log(employment)	0.802***	0.799***	0.343***
	(0.000)	(0.000)	(0.000)
<b>GVC</b> Participation	0.134***	0.136***	0.133***
-	(0.001)	(0.001)	(0.002)
Country*Year FEs	Yes	Yes	Yes
Sector*Year FEs	Yes	Yes	Yes
Country*Sector FEs	Yes	Yes	Yes
Observations	6,184	6,352	6,184
R-squared	0.964	0.964	0.961

Table 6: Robustness check (5). The dependent variable is manufacturing export RCA\_VAX in regressions (1) and (2), but RCA\_X in regression (3). D<sup>fb</sup> refers to financial & business services value-added per worker. In regressions (1) and (3), SII<sup>fb</sup> (FSII<sup>fb</sup>) is the ratio of the U.S.'s embodied domestic (foreign) financial & business services to U.S. manufacturing value-added, averaged over 1995-2007. In regression (2), SII<sup>fb</sup> (FSII<sup>fb</sup>) is the ratio of each country's own embodied

domestic (foreign) financial & business services to its manufacturing value-added, averaged over 1995-2007. All WIOD manufacturing sectors 3-16 are covered (not grouped together). The standardized beta coefficients rather than the regular regression coefficients are reported. The p-values based on robust standard errors in parentheses, clustered by country\*year. \*\*\* p<0.01, \*\* p<0.05, \* p<0.1.

## IV.5. Testing hypothesis 2

In this sub-section, we test the second hypothesis, which states that in certain circumstances, countries may bypass their own inefficient domestic services sectors by relying on imported foreign services. As defined in equation (11), the share of embodied foreign services in total embodied services (forsh) is used to measure the degree of a country's access to foreign services markets. Because our story is relevant only to the sectors that use a significant amount of services as inputs, in the baseline regression, we consider only the first seven manufacturing sectors with high services input intensity as listed in Appendix 3.<sup>21</sup> We examine how the interaction between foreign services and domestic services development affects manufacturing export RCA based on specification (2) and report the results in Table 7. Here we consider financial and business services together and include country\*year and sector\*year dummies. The first regression covers only the seven manufacturing sectors with high SII, while the second regression covers the other seven sectors with low SII. The coefficient of  $D^*$  is negative and significant at the 1% level in the first regression. This shows that the benefit of foreign services inputs on manufacturing export RCA decreases with the level of domestic services development, suggesting that foreign and domestic services inputs are at least partially substitutable. Together with a positive coefficient of forsh, this also implies that the access to foreign services can help a country to bypass underdeveloped domestic services provision. In the second regression, the coefficient on  $D^*$  forsh is insignificant. This is to be expected, because services development and access to foreign services markets should matter less for these sectors that use little services as inputs (low SII). These results provide further support to the second hypothesis.

	(1) High Service Intensive Sectors	(2) Low Service Intensive Sectors
forsh <sup>fb</sup>	0.478***	-0.042

<sup>&</sup>lt;sup>21</sup> The sector rankings are identical if we consider only financial or only business services, or if we consider both embodied domestic and foreign services.

	(0.000)	(0.661)	
D <sup>fb</sup> *forsh <sup>fb</sup>	-1.647***	-0.144	
	(0.000)	(0.456)	
TFP	0.064***	0.038	
	(0.002)	(0.111)	
HO_SK	0.092***	0.114***	
	(0.000)	(0.008)	
HO_K/L	0.079***	0.082***	
	(0.000)	(0.000)	
log(employment)	2.106***	1.705***	
	(0.000)	(0.000)	
GVC Participation	0.199***	0.731***	
	(0.000)	(0.000)	
Country*Year FEs	Yes	Yes	
Sector*Year FEs	Yes	Yes	
Observations	3,146	3,180	
R-squared	0.633	0.630	

Table 7: Effects of embodied *foreign* services on manufacturing export RCA\_VAX. Variable forsh is defined as the share of embodied foreign financial & business services in the total embodied domestic and foreign financial & business services for each country. The first regression covers MORE services intensive manufacturing sectors (the first seven sectors in Appendix 3), while the last regression covers LESS services intensive manufacturing sectors (the last seven sectors in Appendix 3). D<sup>fb</sup> refers to financial & business services value-added per worker. The standardized beta coefficients rather than the regular regression coefficients are reported. The p-values based on robust standard errors in parentheses, clustered by country\*year. \*\*\* p<0.01, \*\* p<0.05, \* p<0.1.

# V. Concluding remarks

In this paper, we examine how the development of domestic services sectors may affect the export performance of downstream manufacturing sectors, taking into account the services input intensities of manufacturing sectors. We focus on two types of modern services, i.e., financial services and business services, whose shares in an economy normally increase with the level of a country's development.

We show that the indirect exports of services are surprisingly high for a number of countries, especially developing or emerging economies, even though most of these countries' direct exports of services are relatively small. We also find that the manufacturing sectors that use these services intensively as inputs benefit more from domestic services development. These findings suggest that policy makers should take into account the linkages among sectors, not look at them in isolation as can happen with the "silo" approach to trade negotiations (Hoekman and Jackson, 2013).

Industrial countries have been strong in exporting services, both directly and indirectly. For example, according to the Online Data Appendix Table A2, the U.S. is not only the largest direct exporter of business services in the world, but also the largest indirect exporter of business services (actually twice as large), suggesting an important role of business services in U.S.' manufacturing activities. However, developing and emerging economies have significantly lagged behind, with India being the only exception as a significant direct exporter of business services. Services development in these latter countries would not only strengthen their service sectors but also promote manufacturing sectors.

Countries such as China that may be concerned with the durability of their manufacturing export success may consider building stronger service sectors as a way to upgrade their manufacturing sectors to an even higher level of sophistication. According to the Online Data Appendix Table A2, China's business services exports in value-added terms, relative to its exports in gross terms, are less impressive compared to the corresponding figure for financial services shown in Table A1. Both of its direct and indirect business services exports are only 8-9 percent of the corresponding numbers of the United States. Drawing from the firm level data in ORBIS, Miroudot and Cadestin (2017) show that China is the only country in their sample which has a majority of the manufacturing firms (77 percent in 2013) selling only goods, with little bundling of goods and services, as seen with Apple iPhones/iPads and Apple Stores. To strengthen the manufacturing sector, countries may need to have a favorable business environment that facilitates services upgrading, including but not limited to R&D, marketing, advertising, inventory management, quality control, production scheduling, after-sale technical supports, and follow-up customer services.

With significant improvement in transportation and communication technologies and increasing services outsourcing activities, some developing countries such as India have developed competitive services sectors. For example, Indian financial services RCA\_VAX since 1997 has been greater than one, while the corresponding numbers for China is always less than one. For business services after 2000, Indian RCA\_VAX has been about three times as high as the corresponding Chinese numbers. For developed countries that have the same strength in service sectors as India, our paper suggests that the manufacturing sectors that use these services intensively tend to have a strong revealed comparative advantage. However, different from most

of the other WIOD countries, Indian gross exports of business services are actually larger than its total value-added exports, suggesting relatively little embodied business services in other sectors, as shown by the direct and indirect ratio of Indian business services exports in the Online Data Appendix Table A2. There is a plenty of room left for India, Philippines and other similar countries to take advantage of their competitive services sectors during their industrialization process.

We also provide evidence for a bypass effect, that is, countries may bypass their inefficient domestic services sectors by making use of imported services inputs. This suggests that nations with under-developed services may take advantage of globalization in services. Countries that hesitate to liberalize their services sectors in the hope of protecting their inefficient domestic services sectors may hurt the competitiveness of their manufacturing sectors.

Although this paper focuses only on the services-manufacturing linkages, many other important research questions could also be studied using a similar methodology. With the intercountry input-output tables, we have complete information on how countries and sectors are interlinked to each other. We expect to see more studies along this line of research.

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Sec #	Descriptions
3	Food, Beverages and Tobacco
4	Textiles and Textile Products
5	Leather, Leather and Footwear
6	Wood and Products of Wood and Cork
7	Pulp, Paper, Paper, Printing and Publishing
8	Coke, Refined Petroleum and Nuclear Fuel
9	Chemicals and Chemical Products
10	Rubber and Plastics
11	Other Non-Metallic Mineral
12	Basic Metals and Fabricated Metal
13	Machinery, Nec
14	Electrical and Optical Equipment
15	Transport Equipment
16	Manufacturing, Nec; Recycling
19	Sale, Maintenance and Repair of Motor Vehicles and Motorcycles; Retail Sale of Fuel
20	Wholesale Trade and Commission Trade, Except of Motor Vehicles and Motorcycles
21	Retail Trade, Except of Motor Vehicles and Motorcycles; Repair of Household Goods
23	Inland Transport
24	Water Transport
25	Air Transport
26	Other Supporting and Auxiliary Transport Activities; Activities of Travel Agencies
27	Post and Telecommunications
28	Financial Intermediation (see Appendix 1 for its coverage)
30	Renting of M&Eq and Other Business Activities (see Appendix 1 for its coverage)

Appendix 1: Manufacture (sec 3-16) and service sectors (sec 19-30) covered by this paper

Service sectors classification:

- Sales services: sectors 19-21
- Transportation services: sectors 23-26
- Communication services: sector 27
- Financial services: sector 28 (see below for sub-categories)
- Business services: sector 30 (see below for sub-categories)

Detailed ISI	Detailed ISIC sectors inside financial services (WIOD sector 28)				
6511	Central banking				
6519	Other monetary intermediation				
6591	Financial leasing				
6592	Other credit granting				
6599	Other financial intermediation n.e.c.				
6601	Life insurance				
6602	Pension funding				
6603	Non life insurance				
6711	Administration of financial markets				
6712	Security dealing activities				
6719	Activities auxiliary to financial intermediation n.e.c.				
6720	Activities auxiliary to insurance and pension funding				

Detailed ISIC sectors inside financial services (WIOD sector 28)

Detailed	ISIC sectors inside business services (WIOD sector 30)
7111	Renting of land transport equipment
7112	Renting of water transport equipment
7113	Renting of air transport equipment
7121	Renting of agricultural machinery and equipment
7122	Renting of construction and civil engineering machinery and equipment
7123	Renting of office machinery and equipment (including computers)
7129	Renting of other machinery and equipment n.e.c.
7130	Renting of personal and household goods n.e.c.
7210	Hardware consultancy
7220	Software consultancy and supply
7230	Data processing
7240	Data base activities
7250	Maintenance and repair of office, accounting and computing machinery
7290	Other computer related activities
7310	Research and experimental development on natural sciences and engineering (NSE)
7320	Research and experimental development on social sciences and humanities (SSH)
7411	Legal activities
7412	Accounting, book-keeping and auditing activities; tax consultancy
7413	Market research and public opinion polling
7414	Business and management consultancy activities
7421	Architectural and engineering activities and related technical consultancy
7422	Technical testing and analysis
7430	Advertising
7491	Labour recruitment and provision of personnel
7492	Investigation and security activities
7493	Building-cleaning activities
7494	Photographic activities
7495	Packaging activities
7499	Other business activities n.e.c.

Code	Country	Code	Country	Code	Country	Code	Country
AUS	Australia	DNK	Denmark	IRL	Ireland	POL	Poland
AUT	Austria	ESP	Spain	ITA	Italy	PRT	Portugal
BEL	Belgium	EST	Estonia	JPN	Japan	ROM	Romania
BGR	Bulgaria	FIN	Finland	KOR	South Korea	RUS	Russia
BRA	Brazil	FRA	France	LTU	Lithuania	SVK	Slovakia
CAN	Canada	GBR	UK	LUX	Luxembourg	SVN	Slovenia
CHN	China	GRC	Greece	LVA	Latvia	SWE	Sweden
CYP	Cyprus	HUN	Hungary	MEX	Mexico	TUR	Turkey
CZE	Czech Rep.	IDN	Indonesia	MLT	Malta	TWN	Taiwan
DEU	Germany	IND	India	NLD	Netherlands	USA	United States

Appendix 2: Countries & Codes in WIOD

Appendix 3: Manufacturing sectors' domestic SII in the U.S., average over 1995-2007

			SII for Sales,	
WIOD		SII for Financial	Transportation, and	1 for
sector	Manufacturing Sector Description	& Business	Communication	High SII
		Services	Services	Sectors
5	Leather, Leather and Footwear	.315	.255	1
3	Food, Beverages and Tobacco	.291	.281	1
15	Transport Equipment	.236	.206	1
13	Machinery, Nec	.196	.165	1
16	Manufacturing, Nec; Recycling	.189	.162	1
4	Textiles and Textile Products	.171	.142	1
14	Electrical and Optical Equipment	.168	.115	1
9	Chemicals and Chemical Products	.128	.088	0
7	Pulp, Paper, Paper, Printing & Publishing	.122	.079	0
8	Coke, Refined Petroleum & Nuclear Fuel	.091	.079	0
6	Wood and Products of Wood and Cork	.045	.052	0
10	Rubber and Plastics	.043	.034	0
11	Other Non-Metallic Mineral	.020	.018	0
12	Basic Metals and Fabricated Metal	.019	.016	0

### **Online Data Appendix (not for publication)**

Most of the data used in this paper are computed by authors based on the World Input-Output Database (WIOD, 2013 version) and the Socio-economic Accounts database (SEA, 2012 version) for 40 countries. Web address: <u>http://www.wiod.org/</u>

#### I. Data for dependent variables

- 1) Gross exports (X) by country, sector over years: The WIOD
- 2) Value-added exports (VAX): from the UIBE GVC Index, estimated based on the data from the WIOD. Web address: <u>http://rigvc.uibe.edu.cn/english/D\_E/database\_database/index.htm</u>
- 3) Revealed comparative advantage (RCA) using X or VAX based on Balassa method (country *i*, *j* = 1, 2, ..., *G*; sector *s*=1, 2, ..., *N*).

$$RCA_X_{js} = \left(\frac{X_{js}}{\sum_{s=1}^N X_{js}}\right) / \left(\frac{\sum_{i=1}^G X_{is}}{\sum_{s=1}^N \sum_i^G X_{is}}\right)$$
$$RCA_VAX_{js} = \left(\frac{VAX_{js}}{\sum_{s=1}^N VAX_{js}}\right) / \left(\frac{\sum_{i=1}^G VAX_{is}}{\sum_{s=1}^N \sum_i^G VAX_{is}}\right)$$

### IV. Data for explanatory variables

- Domestic services input intensity (SII) and foreign services input intensity (FSII): estimated based on the data from the WIOD. See equations (10)-(12) and pages 14-18 in the paper. SII = embodied domestic services in a manufacturing sector s / manufacturing sector s' GDP The default measure of SII is based on the data of the benchmark country (the U.S.). We also use each country's own SII and or the U.K.'s SII data to check the robustness of the results. FSII = embodied foreign services in a manufacturing sector s / manufacturing sector s' GDP forsh = SII/(SII+FSII): the share of foreign services inputs in total embodied services in a manufacturing sector. We use each country's own data to measure FSII and forsh.
- Domestic services development (D) measured by services value-added per worker engaged in a services sector (in 1000 national currency): services value-added are estimated based on the WIOD (Data source: <u>http://rigvc.uibe.edu.cn/english/D\_E/database\_database/index.htm</u>); the number of workers engaged in a services sector are from the WIOD-SEA.
- 3) Alternative measure of domestic services development (D) measured by the share of services value-added in GDP: estimated based on data from the WIOD. Web address: http://rigvc.uibe.edu.cn/english/D\_E/database\_database/index.htm
- 4) Alternative measures of financial services development used by Rajan & Zingales (1998):  $D^{f1}$  = ratio of bank private credit to GDP;  $D^{f2}$  = (Bank private credit + Stock market capitalization)/GDP). Data source: the World Bank Global Financial Development Database.
- 5) log(GDP per capita): based on the PPP Converted GDP Per Capita (Chain Series), at 2005 constant prices from the Penn World Table 6.0.
- 6) Total factor productivity (TFP) estimated based on the dual approach as in Hsieh (2002). It is calculated as a weighted average of the growth rates of labor prices ( $g_W$ ) and capital prices ( $g_R$ ), weighted by the share of payment to labor ( $s_L$ ) and capital ( $s_K$ ): TFP = = $s_K*g_R+s_L*g_W$ . The factor shares ( $s_K$  and  $s_L$ ) are calculated based on factor payments. The prices/returns to L and K (or wage W and rental rates R) are calculated using factor payments divided by the corresponding engaged factor amount. The growth rates in W an R are calculated based on log differentials over time. Therefore, the growth rates for first year in our sample, 1995, cannot

be calculated, and accordingly TFP estimates for 1995 become missing. The data of fixed capital stocks (K), total hours worked by labor engaged (L), and the payments to labor and capital for all WIOD countries at sector level over years are from the WIOD-SEA.

- 7) HO\_SK and HO\_K/L: Heckscher-Ohlin variables constructed following Chor (2010). HO\_SK is defined as the product of a country j's economy-wide skill ratio,  $(SK)_j$ , and the skill ratio of a particular manufacturing sector in the same country,  $(SK)_{js}$  (i.e., HO\_SK =  $(SK)_j^*(SK)_{js}$ , where SK or skill ratio is the payment to high skill workers divided by the payment to all workers (in a manufacturing sector). HO\_K/L is defined as the product of a country j's overall capital/labor ratio,  $(K/L)_j$ , and the capital/labor ratio of a particular manufacturing sector in the same country,  $(K/L)_{js}$  (i.e., HO\_K/L =  $(K/L)_j^*(K/L)_{js}$ , where K/L is the payment to capital divided by the payment to labor. All of the data on payment to capital and labor at different skill levels are from the WIOD-SEA database.
- 8) The scale economy variable, log(employment), is calculated as log(employment\*1000+1). We add one to retain the zeros when no worker works in a sector. We multiply employment by 1000 because the original employment data from the SEA are measured in 1000 workers.
- 9) GVC participation index are estimated by Wang et al. (2017). We use a measure of forward industrial linkage based GVC participation to estimate how a country/sector's engagement in GVC activities strengthens its overall export performance.

## V. Data for instruments of domestic services development (D)

- 1) legor\_com: common law legal origin dummy. Data are from La Porte et al. (1999). Web source: https://scholar.harvard.edu/shleifer/publications/quality-government
- 2) legor\_civ: civil law legal origin dummy. Data source: same as above.
- 3) legor\_soc: socialist legal origin dummy (the default category). Data source: same as above.

# VI. The sample covered by our analysis

The U.S. as the benchmark country is dropped from our baseline regressions using U.S. SII. Romania is also dropped from our sample due to missing employment data. Hence our baseline regressions cover 38 out of the 40 WIOD countries. Our TFP is estimated based on information on the growth rates of the returns to capital and labor. When calculating the growth rates of returns, we lose the first year in our sample, 1995. Hence, our sample covers the period of 12 years (1996-2007). Our full sample with 14 manufacturing sectors (WIOD sectors 3-16) should have totally 6384 observations (=38\*14\*12). Because the payment to capital is negative for quite a few countries in different sectors, it becomes missing for 200 observations when we calculate the growth rate of capital return using log differentials which are needed to calculate TFP. Therefore, the number of observations in our baseline regressions is 6184 (= 6384 - 200). In regressions using each country's own SII, the U.S. is covered, and hence the number of observations will be higher (39\*14\*12-200=6352), as in regressions (3) and (4) in Table 3.

The following four tables list the direct and indirect exports of financial services, business services, and some manufacturing sectors. They are discussed in section III.5 in the paper.

	X		Ratio1 =	/	,	Ratio2 =
Country	(gross export)	VAX	VAX/X	dVAX	indVAX	indVAX/dVAX
AUS	210	579	2.76	133	447	3.74
AUT	564	686	1.22	334	352	1.00
BEL	620	896	1.45	327	569	1.65
BGR	20	47	2.37	13	34	2.69
BRA	72	457	6.30	47	410	8.68
CAN	487	984	2.02	275	709	2.59
CHN	53	1774	33.62	34	1740	42.94
CYP	4	12	2.72	3	8	2.79
CZE	45	104	2.32	20	84	4.77
DEU	1151	2644	2.30	529	2115	3.56
DNK	122	282	2.30	76	206	2.83
ESP	438	847	1.93	284	563	1.82
EST	8	15	1.91	5	10	1.87
FIN	33	122	3.76	21	101	3.56
FRA	790	1925	2.44	405	1520	3.96
GBR	5050	4339	0.86	2591	1748	0.54
GRC	39	87	2.27	28	59	2.21
HUN	52	118	2.28	29	89	3.74
IDN	139	271	1.95	103	168	1.95
IND	101	683	6.77	78	605	7.46
IRL	1597	1171	0.73	831	341	0.38
ITA	552	1604	2.90	331	1273	3.57
JPN	789	3603	4.57	522	3081	6.25
KOR	199	976	4.91	119	857	6.58
LTU	2	12	6.45	1	11	9.35
LUX	2910	849	0.29	640	209	0.32
LVA	8	16	1.96	5	10	2.09
MEX	181	512	2.83	119	393	3.70
MLT	7	11	1.49	4	7	1.97
NLD	820	1244	1.52	442	803	1.58
POL	114	219	1.92	70	148	2.55
PRT	93	235	2.52	65	170	2.76
ROM	24	67	2.82	17	50	3.07
RUS	5	152	29.25	4	149	49.65
SVK	20	37	1.89	12	25	2.01
SVN	9	38	4.35	6	33	4.66
SWE	372	532	1.43	247	285	1.08
TUR	7	251	34.48	5	247	45.46
TWN	95	1197	12.55	75	1122	13.78
USA	10116	11897	1.18	5624	6273	1.07
ROW	2382	4798	2.01	1598	3199	1.93
ТОТ	30300	46293	1.53	16070	30223	1.88

Table A1: Total direct & indirect value-added export (VAX) of financial service, 1995-2007

Notes: The export values in this table are for financial services sector (WIOD sector 28) in 100 million U.S. dollars at 2005 constant price, using the U.S. GDP deflator from the Federal Reserve Economic Data (website address: http://research.stlouisfed.org/fred2). X is total gross exports. VAX is total value-added exports. dVAX is direct value-added exports. indVAX is indirect value-added exports through other sectors.

<u> </u>	X	X7 A X7	Ratio1 =	13.7 4.37	· 13.7 A 37	Ratio2 =
Country	(gross export)	VAX	VAX/X	dVAX	indVAX	indVAX/dVAX
AUS	512	1128	2.20	250	879	3.60
AUT	1012	1184	1.17	579	604	1.11
BEL	1964	2657	1.35	964	1693	1.76
BGR	11	26	2.41	8	18	2.23
BRA	303	665	2.19	193	472	2.38
CAN	1322	2380	1.80	812	1568	1.93
CHN	1765	1921	1.09	757	1164	1.33
CYP	12	21	1.78	8	13	1.66
CZE	274	352	1.28	121	231	1.97
DEU	3821	12761	3.34	2596	10166	3.74
DNK	429	680	1.59	236	444	1.80
ESP	1576	1957	1.24	924	1033	1.08
EST	27	38	1.41	15	24	1.62
FIN	474	654	1.38	278	376	1.25
FRA	3138	8361	2.66	1801	6560	3.69
GBR	6748	9602	1.42	4635	4966	1.06
GRC	99	130	1.31	53	77	1.39
HUN	287	388	1.35	163	225	1.38
IDN	29	48	1.63	17	32	1.31
IND	1588	1279	0.81	1084	195	0.19
IRL	1563	1321	0.85	862	458	0.51
ITA	1713	4178	2.44	965	3212	3.29
JPN	1011	4660	4.61	608	4052	7.06
KOR	591	1624	2.75	374	1249	3.27
LTU	16	25	1.55	10	15	1.87
LUX	231	240	1.04	121	118	0.90
LVA	14	25	1.85	7	18	2.67
MEX	88	793	9.06	63	730	12.17
MLT	24	24	1.02	15	9	0.67
NLD	3266	3954	1.21	1896	2058	1.06
POL	258	511	1.98	148	363	2.28
PRT	175	299	1.70	92	206	2.16
ROM	106	119	1.12	52	66	1.23
RUS	72	524	7.27	45	480	12.01
SVK	85	121	1.42	43	78	1.86
SVN	50	99	2.00	27	70	2.68
SWE	1444	1903	1.32	811	1092	1.27
TUR	1.34	146	109.57	1	146	148.14
TWN	423	516	1.22	216	300	1.61
USA	9517	20777	2.18	6230	14547	2.20
ROW	9776	8234	0.84	5458	2776	0.51
TOTAL	55815	96323	1.73	33535	<b>62788</b>	1.87

Table A2: Total direct & indirect value-added export (VAX) of business service, 1995-2007

Notes: The export values in this table are for business service sector (WIOD sector 30) in 100 million U.S. dollars at 2005 constant price, using the U.S. GDP deflator from the Federal Reserve Economic Data (website address: http://research.stlouisfed.org/fred2). X is total gross exports. VAX is total value-added exports. dVAX is direct value-added exports. indVAX is indirect value-added exports through other sectors.

	Х	VAX	Ratio1 =			Ratio2 =
Country	(gross export)	(value-added exports)	VAX/X	dVAX	indVAX	indVAX/dVAX
AUS	1656	617	0.37	499.089	117.703	0.24
AUT	638	265	0.42	218.756	46.1621	0.21
BEL	2225	739	0.33	571.601	167.742	0.29
BGR	75	29	0.38	22.2225	6.8221	0.31
BRA	2311	843	0.36	637.913	205.499	0.32
CAN	1770	815	0.46	592.857	222.096	0.37
CHN	4071	2077	0.51	990.675	1086.46	1.10
CYP	38	15	0.39	12.8356	2.20884	0.17
CZE	294	128	0.44	81.9917	45.7667	0.56
DEU	4941	1887	0.38	1543.71	343.729	0.22
DNK	1758	595	0.34	512.73	82.0623	0.16
ESP	2143	677	0.32	499.708	177.584	0.36
EST	60	20	0.34	17.1528	3.24623	0.19
FIN	205	112	0.55	63.3442	49.0072	0.77
FRA	4791	1599	0.33	1299.6	299.275	0.23
GBR	2616	1303	0.50	975.982	326.532	0.33
GRC	181	59	0.32	46.5704	12.2119	0.26
HUN	255	88	0.34	63.7534	23.9361	0.38
IDN	1098	549	0.50	406.96	142.345	0.35
IND	922	255	0.28	188.907	65.761	0.35
IRL	1447	561	0.39	457.327	103.267	0.23
ITA	4025	1551	0.39	1085.99	464.537	0.43
JPN	320	552	1.72	129.696	422.165	3.26
KOR	662	287	0.43	152.262	134.758	0.89
LTU	81	35	0.43	28.4086	6.09379	0.21
LUX	80	30	0.37	29.6651	0.364167	0.01
LVA	32	15	0.46	10.5561	4.15573	0.39
MEX	605	334	0.55	238.72	94.982	0.40
MLT	17	8	0.46	5.90263	2.06591	0.35
NLD	4724	1550	0.33	1280.25	269.72	0.21
POL	753	284	0.38	207.14	76.3639	0.37
PRT	501	198	0.39	151.559	46.3096	0.31
ROM	129	87	0.67	52.9534	33.9444	0.64
RUS	99	64	0.65	32.715	31.5184	0.96
SVK	138	53	0.38	41.1339	12.0521	0.29
SVN	85	37	0.44	28.5756	8.68974	0.30
SWE	394	191	0.48	136.519	54.4838	0.40
TUR	584	245	0.42	182.064	62.5506	0.34
TWN	399	151	0.38	116.861	33.8116	0.29
USA	4905	1898	0.39	1345.91	552.359	0.41
ZOW	12624	4436	0.35	3521.52	914.558	0.26
ТОТ	64654	25237	0.39	18482.09	6754.899	0.37

Table A3: Direct & indirect VAX of manufacturing sectors 3 & 5 (with high SII), 1995-2007

Notes: The export values in this table are for two WIOD manufacturing sectors 3 (Food, Beverages and Tobacco) & 5 (Leather and Footwear) in 100 million U.S. dollars at 2005 constant price. *X* is total gross exports. *VAX* is total value-added exports. *dVAX* is direct value-added exports. *indVAX* is indirect value-added exports through other sectors.

Table A4. L		VAX of manufacturin	-	$11 \alpha 12 (W)$	100  SH	
~	Х	VAX	Ratio1 =			Ratio2 =
Country	(gross export)	(value-added exports)	VAX/X	dVAX	indVAX	indVAX/dVAX
AUS	1920	900	0.47	589.171	311.119	0.53
AUT	1730	956	0.55	701.073	254.831	0.36
BEL	3461	1286	0.37	1021.63	264.453	0.26
BGR	219	66	0.30	48.7508	17.5144	0.36
BRA	1519	1074	0.71	606.168	467.778	0.77
CAN	4073	2241	0.55	1484.12	756.912	0.51
CHN	5435	4699	0.86	1290.45	3408.44	2.64
CYP	26	12	0.46	10.0616	1.99486	0.20
CZE	1054	536	0.51	328.896	206.773	0.63
DEU	11714	7746	0.66	4646.8	3098.82	0.67
DNK	626	411	0.66	282.504	128.37	0.45
ESP	2456	1760	0.72	865.997	893.721	1.03
EST	49	21	0.43	15.4525	5.53757	0.36
FIN	940	502	0.53	303.802	198.413	0.65
FRA	4590	3297	0.72	1677.53	1619.94	0.97
GBR	3629	2650	0.73	1534.12	1115.91	0.73
GRC	229	105	0.46	71.0804	33.6734	0.47
HUN	390	182	0.47	118.267	63.4104	0.54
IDN	496	197	0.40	173.442	23.5688	0.14
IND	1282	727	0.57	378.938	347.575	0.92
IRL	224	149	0.66	88.7054	60.1249	0.68
ITA	5740	4141	0.72	1983.96	2156.61	1.09
JPN	7967	7060	0.89	2663.67	4395.91	1.65
KOR	2451	2024	0.83	618.727	1405.56	2.27
LTU	28	14	0.50	11.8089	2.18443	0.18
LUX	425	145	0.34	129.839	14.6965	0.11
LVA	47	18	0.38	13.9866	4.01187	0.29
MEX	1423	1050	0.74	572.598	477.409	0.83
MLT	3	2	0.64	1.14616	0.873129	0.76
NLD	2283	1092	0.48	836.275	255.77	0.31
POL	1123	576	0.51	361.724	214.499	0.59
PRT	415	245	0.59	152.444	92.4503	0.61
ROM	392	154	0.39	111.224	42.657	0.38
RUS	2538	1571	0.62	953.391	617.212	0.65
SVK	494	217	0.44	163.856	53.2312	0.32
SVN	294	143	0.49	99.6685	43.3023	0.43
SWE	1693	998	0.59	626.745	371.189	0.59
TUR	1289	646	0.50	430.114	215.448	0.50
TWN	2305	1198	0.52	576.291	621.68	1.08
USA	6274	7049	1.12	2389.55	4659.14	1.95
ZOW	13080	6623	0.51	4237.11	2385.61	0.56
ТОТ	96323	64479	0.67	33171.09	31308.32	0.94

Table A4: Direct & indirect VAX of manufacturing sectors 11 & 12 (with low SII), 1995-2007

Notes: The export values in this table are for two WIOD manufacturing sectors 11 (Other Non-Metallic Mineral) & 12 (Basic & Fabricated Metal) in 100 million U.S. dollars at 2005 constant price. *X* is total gross exports. *VAX* is total value-added exports. *dVAX* is direct value-added exports. *indVAX* is indirect value-added exports through other sectors.

Variables	Mean	Std. Dev.	Min	Max
RCA_VAX	1.132	1.026	0	12.397
RCA_X	1.153	1.271	0	19.785
SII <sup>f</sup> (U.S.)	0.036	0.025	0.004	0.100
SII <sup>b</sup> (U.S.)	0.109	0.074	0.011	0.309
SII <sup>fb</sup> (U.S.)	0.145	0.097	0.015	0.406
SII <sup>f</sup> (own)	0.026	0.031	0	0.530
SII <sup>b</sup> (own)	0.045	0.045	0	0.339
SII <sup>fb</sup> (own)	0.071	0.063	0	0.559
forsh <sup>f</sup> (own)	0.405	0.196	0.036	0.999
forsh <sup>b</sup> (own)	0.485	0.210	0.081	1.000
forsh <sup>fb</sup> (own)	0.438	0.191	0.066	0.999
Df (VA/worker)	74.02	50.33	4.989	358.4
D <sup>b</sup> (VA/worker)	39.18	25.82	2.507	162.5
Dfb (VA/worker)	48.39	31.61	3.471	211.0
Df (VA/GDP)	0.055	0.033	0.012	0.289
D <sup>b</sup> (VA/GDP)	0.069	0.031	0.012	0.154
Dfb (VA/GDP)	0.124	0.049	0.040	0.391
$D^{f1}$	0.713	0.458	0.072	2.010
$D^{f2}$	1.239	0.761	0.086	4.072
log(GDP/capita)	9.757	0.746	7.378	11.363
TFP	0.073	0.174	-1.185	2.228
HO-SK	0.058	0.041	0.000	0.256
HO-K/L	2.040	13.02	0.000	196.28
log(employment)	11.16	2.088	2.738	16.901
<b>GVA</b> Participation	0.303	0.197	0	3.870
legor_com	0.161	0.367	0	1
legor_civ	0.552	0.497	0	1

Table A5: Descriptive statistics of key variables (for WIOD countries over 1996-2007)

Notes: The summary statistics for most of the variables in this table are based on the sample used in the baseline regressions in Table 1 (6184 observations), covering 14 manufacturing sectors of 38 WIOD countries over 1996-2007. The first year 1995 in our data is dropped when we calculate the growth rates of capital and labor returns which are used in the TFP calculation. Two WIOD countries are not covered: U.S. is dropped as the benchmark country to define services input intensity; Romania is also dropped due to lack of employment data. The six SII and *forsh* variables with "(own)" in the variable names are based on a bit larger sample used in regressions (3) & (4) of Table 3 (6352 observations), without dropping the U.S. Some subscripts i, j, s, etc. a not shown for simplicity.