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Trade dependence, liberalization and exports diversification in developing countries

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Abstract

This paper explores the relationship between trade liberalization and exports diversification in developing and Sub-Saharan African (SSA) countries. The non-parametric analyses indicate that developing countries that are more open to trade (based on trade intensity) tend to have more diversified exports structures than those that are classified as less open. However, for SSA the non-parametric test shows that countries that are more open to trade have less diversified exports structures. Regarding the parametric analysis, the findings provide further evidence that trade liberalization, in the form of lower tariffs, contributes to exports diversification in developing countries, and the results for the long term are even stronger for SSA countries. With regards to trade intensity, the parametric estimations also confirm the results that trade is associated with diversification in developing countries and in SSA countries in the short term; however, for SSA it actually leads to concentration in the long term, consistent with the non-parametric results. The empirical analyses also show that human capital, GDP per capita and institutions, play important roles in exports diversification.

Key words: Exports diversification; trade policy; trade openness; structural economic transformation; SSA

JEL classification numbers: C33, F63, O19, O55



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1. Introduction

Sub-Saharan African (SSA) countries have traditionally depended on a narrow range of primary products and a relatively small number of markets for their exports. The development implications of exports concentration in products, sectors, and markets are potentially significant, not only for SSA but for developing countries in general. Concentration in sectors with a limited scope to ignite productivity and product quality could result in low growth and may preclude the possibilities of achieving sustained employment creation and income upgrading (Imbs and Wacziarg 2003, Hausmann et al 2007). Furthermore, a lack of diversification may increase vulnerability to adverse external shocks, and hence affect exports earnings and macroeconomic stability. Thus, for vulnerable countries such as those of SSA, diversification into manufacturing and more technology intensive sectors, including agroindustry, has the potential to promote economic growth, create jobs and reduce dependence on primary commodities.

This paper examines the role of trade and trade policy in the diversification process in developing countries. It employs both parametric and non-parametric techniques to shed light on the relationship between trade, trade policy and diversification in a sample of 144 developing countries over the period 1970-2015. It also incorporates the roles of other structural and policy variables that may affect exports diversification, controlling for the direct impact of the studied relationships in Sub-Saharan Africa (SSA). This study is important in at least two respects. The first is that although the role of trade and trade policy in the development process is well documented, there is less empirical research on their roles in fostering export diversification or structural transformation, particularly in Africa and the Least Developed Countries (LDCs). Over the past three decades, African countries and LDCs have increased their dependence on trade and have also adopted more liberal trade regimes.¹ Yet, they have not made any significant progress in terms of diversifying their export structure, suggesting that the realization of any potential benefits of trade for diversification is not necessarily automatic and may depend on domestic policies and the macroeconomic environment facing a country. In this context, there is the need to provide empirical evidence on the role of trade in the diversification process in Africa and LDCs. The second reason why this study is important is that unlike existing studies, this paper employs both non-parametric and parametric techniques to examine the nexus between trade and diversification.

Theoretically, the relationship between trade and diversification depends on the model or framework considered. Traditional trade models suggest that trade fosters specialization via efficient reallocation of employment, capital and resources across sectors, in line with a country's comparative advantage. But more recent theoretical models suggest that trade can facilitate diversification. For example, Teigner (2018) shows that changes in productivity and reductions in trade barriers affect sectoral reallocation and hence growth and transformation. Using a general equilibrium framework, Dessy et. al. (2010) also demonstrate that trade can promote diversification and transformation in developing countries.

Empirical research shows that diversification in exports and in domestic production have been conducive to economic growth, although a vast heterogeneity is observed amongst developing country groups and regions. Increased diversification is also associated with lower output volatility and greater macroeconomic stability (e.g. Agosin et al, 2012). Therefore, trade can potentially play a central role in developing countries' development prospects. But whether trade fosters or hinders diversification in developing countries is a question that has to be answered at the empirical level. To this end, this paper attempts to shed new light on the question using a variety of econometric techniques. The paper proceeds as follows. Section 2 provides a brief survey of the literature. Section 3 examines the trends in trade and exports diversification in the sample. Sections 4 and 5 present the empirical analyses. Section 6 concludes.

¹ In the LDCs for example, total trade as a percentage of GDP increased from an average of about 61 percent in the period 1970-74 to 83 percent in the period 2006-2010. However, the diversification of their exports (measured by the Theil index) changed marginally from 4.6 to 4.4 over the same period.

2. What does the literature say about trade and diversification in developing countries?

Concerns about the harmful effects of high dependence on primary commodity exports are founded on the assumption that primary commodity exporters are affected by the secular deterioration in their terms of trade, and primary exports may be characterized by high price volatility and low productivity growth (Prebisch, 1950, 1959; Singer, 1950). Sachs and Warner (2001) argue that the so-called Dutch-disease leads to concentration in resource exports, implying fewer possibilities for productivity growth, hence representing a transfer of income from developing to developed countries.² In this setting, import substitution and export promotion policies have been adopted by governments of developing countries, with varying degrees of success, as strategies to reduce exports concentration and promote manufacturing sector development.

The literature shows that exports diversification has the potential to positively contribute to growth and development through several channels. First, increased investment in a broad range of activities and sectors enhance the sources of income and contributes to mitigating the adverse effects of export instability and fluctuations in the terms of trade - particularly in Africa and the LDCs (Edwards, 2009). Second, diversification can serve as a distributional instrument to channel revenues from mineral and resource-based sectors to other sectors of the economy, thus building the foundation for a stable inflow of revenues while accounting for intergenerational equity (Page, 2008). Third, the diversification of exports is also associated with reduced fluctuations in foreign exchange earnings, increases in GDP and employment, higher value addition and improvements in the quality of manufactured products (Hausmann et al 2006; Osakwe, 2007; Elhiraika and Mbate, 2014).

Empirical research confirms the theoretical predictions that international trade in goods and factor services is explained by differences in comparative advantages across countries. But, some argue that without a minimum level of development, the benefits of exports promotion and diversification will not be realized (e.g. Edwards, 1993, Imbs and Wacziarg, 2003).

Exports diversification entails not only increasing the variety of goods exported but also moving into goods of higher quality and new markets (Bernard et al, 2004; Hausmann et al, 2007; Brenton and Newfarmer, 2009). More sophisticated exports baskets and higher technology intensity are more likely to act as catalysts for broad-based economic growth. Sectors that observe high sophistication or high-technology intensity are likely to act as an engine of growth and promote inter-sectoral and extra-sectoral linkages, rather than isolated enclaves, provided the right macroeconomic conditions and structural factors are in place (Anand et al, 2012; Hausmann, Hwang, and Rodrik 2007). However, these linkages are complex, particularly in low-income countries, where challenges such as a low-skilled labour force, poor macroeconomic management and institutional constraints persist (Santos-Paulino, 2017).

Some studies suggest that there are higher positive externalities associated with the manufacturing sector when compared with other sectors (e.g., Greenaway, Morgan, and Wright; 1999; Levine and Raut, 1997). For instance, Fosu (1990) provides evidence of the positive effects of manufacturing exports on growth for developing countries as compared to primary sector exports. But, export industries in low-income countries tend to be small in scale and relatively unsophisticated, and they often specialize in products that cannot be produced easily or competitively in the developed world (Nicita and Rolo, 2015), hence the importance of diversifying and upgrading their economic structures and exports baskets.

Hausmann et al (2007) show that diversification into new production and export activities, as well as improving the quality (and sophistication) of export baskets, determine economic growth across countries. For Africa, Osakwe (2007) finds that aid, the quality of infrastructure, resource endowments, and in some cases

² The Dutch disease refers to the negative impact the expanding primary-commodity sector may have on other tradable sectors. It also might lead to deindustrialization as industries other than commodities or resources exploitation transfer to cheaper locations due to higher costs from inflation and currency appreciation.

institutional factors, determine diversification in the region. Contrary to existing evidence, however, that study does not find a significant impact of geography on diversification. The paper also highlights the role of regional integration and cooperation particularly for infrastructure development, which in turn could be conducive to diversification. Elhiraika and Mbate (2014) empirically explore the long-run determinants of export diversification for a sample of 53 African countries for 1995-2011. System GMM panel data estimates provide evidence supporting the importance of per capita income, infrastructure, public investment, human capital and the institutional framework as significant drivers of export diversification and transformation.

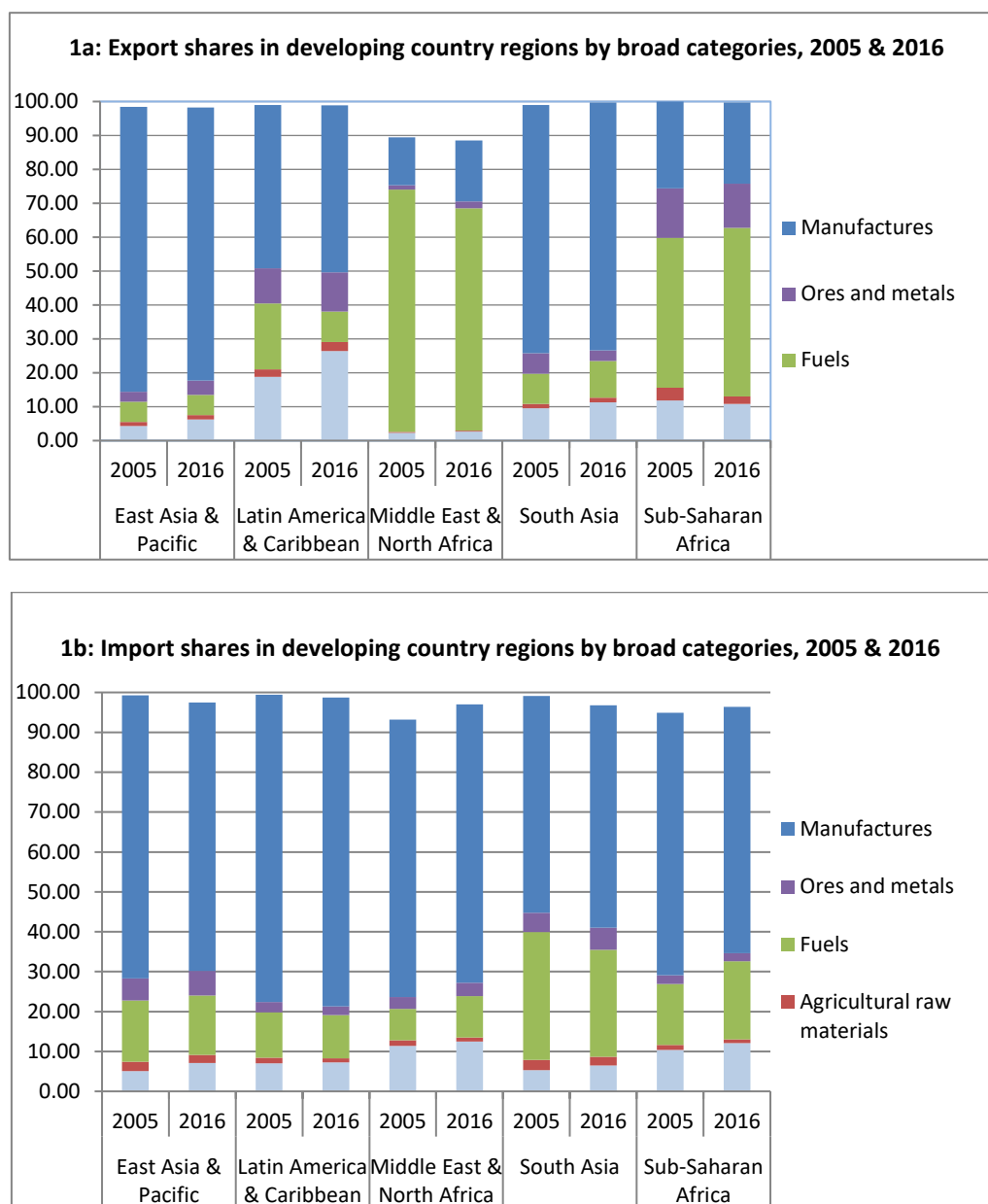
Finally, Fochamnyo and Akame (2017) captures the impact of trade openness – not trade policy – on exports diversification in SSA. The paper finds that in SSA, exports diversification is determined by trade openness, value added in agriculture and manufacturing, and FDI. Also, foreign aid, official exchange rates and gross domestic investment promoted export diversification in selected economies.

3. Trade and diversification trends in developing countries: An overview

The link between diversification and trade is not evident. There is significant heterogeneity across developing countries in terms of trade and exports specialization patterns. Despite significant openness to trade and ongoing liberalization efforts, a number of developing countries, notably African countries and LDCs, have not succeeded in diversifying production and exports, and in transforming their economies (UNCTAD, 2004). This contrasts with the situation of emerging economies in Asia and Latin America where higher trade has been associated with higher export diversification. Apart from the emerging economies, the export structures of most developing countries have remained largely unchanged, and highly concentrated on primary commodities. For example, Figure 1a shows that the exports of Sub-Saharan African countries consist mostly of fuels, ores and metals. In addition to concentration, there are concerns about the increasing deindustrialization trend in some developing countries - where the share of manufacturing value added in GDP is declining - and the negative impact on the potential for structural transformation (see Soderbum, 2017). In contrast to their export patterns, developing countries tend to import larger shares of manufacturing goods, which have more potential to contribute to enhancing productivity, and serve as means of technology and knowledge transfer (Figure 1b).³

³ We also used the share of manufactures value added to GDP as an alternative proxy for diversification.

Figure 1. Export and import shares in developing country regions by broad categories, 2005 and 2016



Source: Authors' elaboration based on UNCTAD Comtrade data (2017).

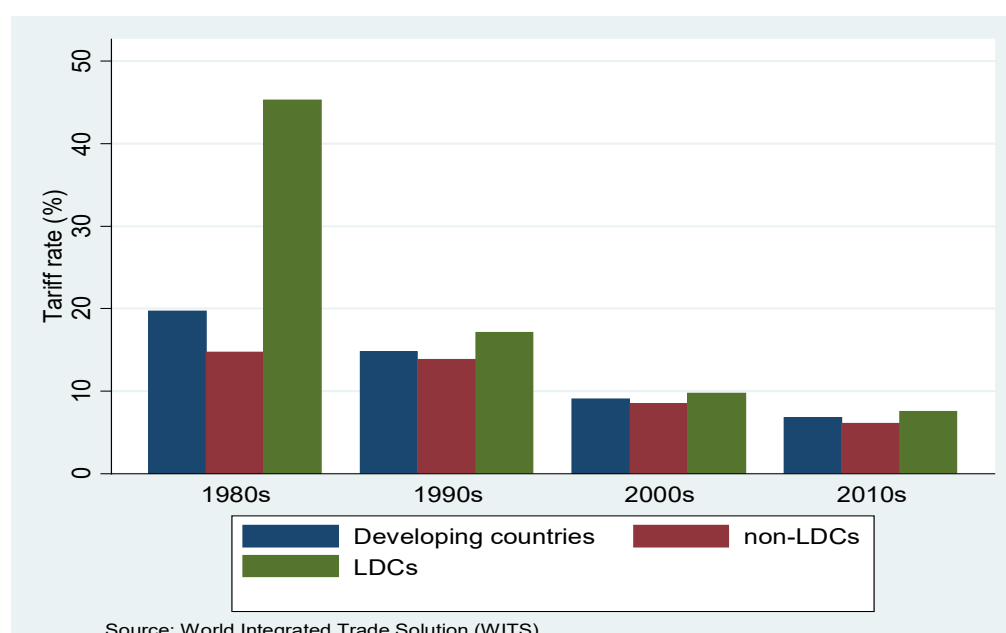
In this study, we cover a large group of developing economies, comprising a total of 144 countries. The sample displays significant differences in levels of development during the period 1970-2015, as well as important structural variances in terms of trade and production. The differences in the mean values of trade specialization, growth, and other key economic variables, are noticeable in the descriptive statistics presented in Tables A2 and A3 in the Appendix.

The Theil export diversification index represents the sum of measures of diversity across sectors (i.e. the vertical diversity or extensive margin, implying new exported products or new export destinations) and diversity within

sectors (horizontal diversity or intensive margin, meaning a larger volume of exports of old products). In our sample, the exports diversification index ranges between 1.53 and 6.44 across developing countries, with a median value of 3.94. In SSA, the range of the export diversification index, on average, is similar to that of other developing countries, although it has a higher mean of 4.33 compared with that of other developing countries of 3.79,⁴ and a higher lower bound (1.78 versus 1.53), suggesting a lower level of diversification in SSA. There are also discernible differences in the mean values of other specialization indicators such as manufacturing exports shares and total trade as a share of GDP as seen in Figure 1 and Tables A2 and A3.

The data shows a significant increase in trade liberalization over the sample period. It is worth noting that an important driver of trade liberalization has been the significant reduction of tariff rates, particularly in LDCs, driven by autonomous trade reforms as well as by bilateral and multilateral commitments (see Figure 2). The following sections provide a systematic empirical analysis of the relationship between exports diversification and key trade, trade policy and structural indicators.

Figure 2. Changes in tariff rates across developing countries



4. Some facts on trade and exports diversification within countries: Non-parametric analysis

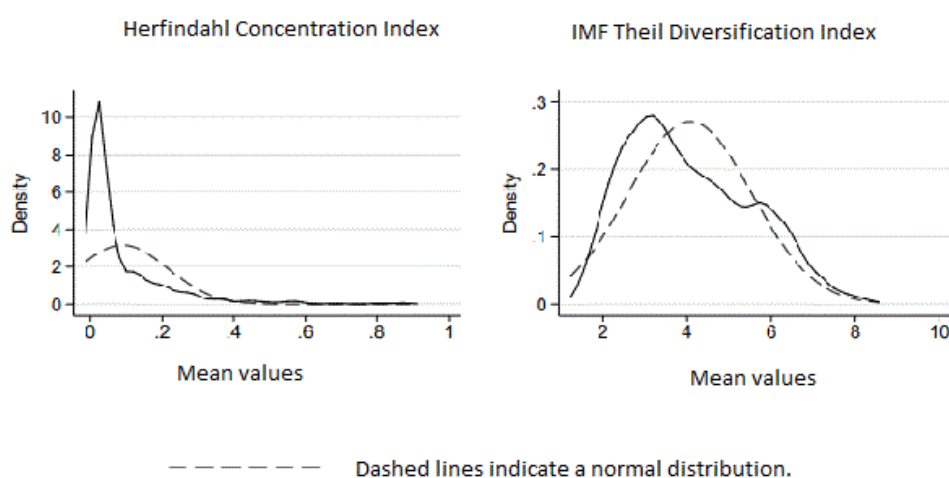
This section uses non-parametric tests to analyse the patterns and the links between trade, trade policy and the diversification of exports. Parametric tests often assume that the statistic under consideration is approximately normally distributed. This assumption makes sense when the sample size is large. However, for

⁴ Note that a *higher* value of the index represents a *lower* level of export diversification.

smaller samples it may or may not hold, so it is useful, for robustness, to perform non-parametric (or distribution-free) tests, to complement the regression analysis.

Figure 3 depicts the distributional patterns of the exports concentration and export specialization indices. The first panel showing the Herfindahl Concentration Index indicates that many developing countries observe high concentrations of exports, particularly those at the bottom of the per capita income bundle. The second panel shows the Theil index of exports diversification, which displays a pattern closer to a normal distribution. Therefore, they provide some justification for using the Theil index, rather than the Herfindahl index, at least for statistical purposes,⁵ in the remaining empirical part of the paper.

Figure 3. Distribution of concentration and diversification measures 1995-2010



Estimated based on UNCTAD Comtrade (HHI) and the IMF Theil index.

To better tease out the connection between trade and diversification using non-parametric tests, developing countries in the sample are classified as “more open to trade” and “less open to trade” depending on their trade to GDP ratio compared to the sample mean.⁶ Then, we compute the median export diversification indices for both groups and ask whether there are any significant differences in export diversification between the groups. Over the period 1995-2010, the median trade openness ratio for the countries more open to trade is 80 percent and for those less open to trade it is 29 percent. Regarding exports diversification, the median Theil index for the countries more open to trade is 3.8 while for those countries less open to trade the index is about 4.0. This suggests that countries more open to trade are marginally more diversified than those less open to trade.

In the case of SSA, the data shows that the median trade openness ratio for the countries more open to trade is 102.7 percent and for those less open to trade it is almost one-half, that is, 50 percent. Regarding exports diversification, the median Theil index for SSA countries classified as more open to trade is 4.5 while for those countries less open to trade it is lower at 4.3, suggesting that SSA countries that are more open to trade have less diversified exports.

⁵ This notion holds particularly for small samples where the Central Limit Theorem may not be applicable.

⁶ The cut-off point used for determining which countries are more or less open to trade is the sample mean of 81.3 percent. In other words, countries with trade ratios below 81.3 percent were classified as less open to trade and those with trade ratios above this threshold as more open to trade. For SSA the sample mean used for the threshold is 75.9 percent.

We conducted a robustness check using other diversification indicators, as well as the *Kruskal-Wallis* non-parametric test to assess if there are statistically significant differences between the medians of the two groups. That is, we test if countries that are more open to trade possess higher diversification of exports.⁷ Tables 1 and 2 present the results of the tests for the various indicators of export diversification for all developing countries and for SSA, respectively. The results in Table 1 indicate statistically significant differences, for both measures, in exports diversification patterns between the two groups for developing countries generally. However, for SSA (Table 2), statistical differences according to the level of openness can be observed only in the case of Theil index. Furthermore, since the Theil index is our most preferred measure, we conclude that while more open developing countries, generally, enjoy greater diversification than their less open counterparts, it is the reverse for SSA countries as a sub-group.

However, the non-parametric tests provide only qualitative evidence. Thus, we undertake panel data econometric analysis in the subsequent section to further examine the relationship.

Table 1. Non-parametric tests for differences in diversification according to differences in degree of openness, complete sample

Variable	Indicator	Kruskal-Wallis tests. (Chi_2)
Export diversification	Herfindahl concentration index	98.58 (0.001)
	Manufacturing exports (% of total exports)	88.86 (0.001)
	IMF Theil index	99.17 (0.002)

Table 2. Non-parametric tests for differences in diversification in SSA according to the degree of openness

Variable	Indicator	Kruskal-Wallis tests. (Chi_2)
Export diversification	Herfindahl concentration index	1.747 (0.186)
	Manufacturing exports (% of total exports)	0.640 (0.430)
	IMF Theil index	11.77 (0.002)

Notes: Tables 1 and 2.

- p values are presented in parenthesis.

- The *Kruskal-Wallis* tests for significant differences on a continuous variable among different groups. It is an H test where the test statistic is computed as follows: $H = \left[\frac{12}{n(n+1)} \sum_{j=1}^c \frac{T_j^2}{n_j} \right] - 3(n+1)$, where n stands for the sum of sample sizes in all samples, c is the number of samples (groups), and T_j is sum of ranks in the j^{th} sample.

⁷ The null hypothesis is that the medians of both groups are equal for each indicator (i.e. that exports diversification is the same across groups), and the alternative hypothesis is that the medians are not equal. It should be borne in mind that this method provides one data point per country. Thus, the small data size is not appropriate for distributional assumptions.

5. Cross-Country and Panel Data Estimations

5.1 Empirical Specification

Trade has the potential to contribute to the diversification of production and exports, but the realization of this potential benefit will vary from country to country, reflecting differences in initial conditions and country-specific policies that affect the performance of production and trade sectors. In this context, this section examines the link between trade, trade policy and export diversification across developing and SSA countries, after controlling for a set of trade-related factors and other structural and policy indicators such as human capital, macroeconomic conditions, investment and infrastructure. Although our full sample covers the period 1970-2015, the empirical estimates in this section rely on data for the period 1970-2010 (encompassing 144 countries) because data for the Theil export diversification index is available only until 2010. The starting point for the empirical analysis is the following estimating equation (see for example Hausmann et al, 2007; Osakwe 2007; and Agosin et al, 2012):

$$ED_{it} = \alpha + \beta_0 ED_{t-1} + \beta_1 X_{it} + \beta_2 Trade_{it} + \eta_i + \lambda_t + \varepsilon_{it} \quad (1)$$

Where ED_{it} represents the measure of exports diversification: the IMF Theil export diversification index; X_{it} is a matrix of explanatory variables including human capital, per capita income, real exchange rate indices, and infrastructure; $Trade_{it}$ is a set of trade and trade policy indicators (trade intensity and tariff rates, depending on the specification); i and t are the country and time indexes, respectively; η_i , λ_t are country and time specific effects; and ε_{it} is an idiosyncratic error term. Detailed variables definitions are provided in the appendix. The empirical models are estimated using dynamic panel data and system generalized method of moments (GMM), to control for unobserved time-invariant heterogeneity and the endogeneity of the dependent variables. System GMM also addresses the potential bias arising in dynamic panel data by introducing the lagged dependent variable as a regressor (see Arellano and Bover 1995; and Arellano and Bond 1991; Blundell and Bond 1998).

5.2 Results

Before undertaking formal econometric analysis for all countries across the sample period, we present correlation coefficients between exports diversification and other explanatory variables considered in the analysis. The results are presented in Table 3. The correlations and signs of the coefficients are in the expected directions, in general. With regard to trade and diversification, the results indicate that higher trade liberalization (lower tariffs) appears to be associated with higher export diversification. The results with trade intensity indicate trade is associated with concentration although the results seem rather weak. Furthermore, an increase in tariffs is associated with lower diversification.

Table 3. Correlation matrix

Variables	Theil index	Total Trade	Tariffs	GDP per capita	Human capital	Remoteness	Infrastructure	Institutions
Theil index	1.000							
Total Trade	0.004 (0.804)	1.000						
Tariffs	0.120 (0.000)	-0.229 (0.000)	1.000					
GDP per capita	0.041 (0.006)	0.351 (0.000)	-0.227 (0.000)	1.000				
Human capital	-0.252 (0.000)	0.158 (0.000)	-0.089 (0.024)	0.331 (0.000)	1.000			
Remoteness	0.055 (0.002)	0.030 (0.0076)	0.087 (0.000)	0.017 (0.297)	0.055 (0.082)	1.000		
Infrastructure	-0.046 (0.018)	-0.007 (0.679)	0.057 (0.017)	-0.059 (0.001)	-0.086 (0.012)	0.050 (0.017)	1.000	
Institutions	-0.316 (0.000)	-0.001 (0.965)	-0.139 (0.000)	-0.101 (0.000)	0.101 (0.001)	0.060 (0.001)	0.163 (0.000)	1.000

Notes: A *negative* value between the Theil index and a given variable indicates a *positive* correlation between export diversification and that variable. Detailed data definition is provided in the appendix.

To further validate the correlation estimates, we begin by estimating a cross-country regression specification by Ordinary Least Squares (OLS), which provide relatively long-term results. The findings are reported in Tables 4 and 5. In terms of the fitness of models, using the *Theil export diversification index* as an indicator of diversification provides more statistically sound results than other proxies of concentration or diversification. The estimations also use total trade (as share of GDP) and tariffs as indicators of trade intensity and trade policy, as well as other ancillary variables.⁸

⁸ The reported results in Tables 5 and 6 exclude outliers in the sample and appear to be empirically more robust than with the inclusion of such countries.

Table 4. OLS results
The dependent variable is exports diversification (Theil Index): 1970-2010

	(1)	(2)	(3)	(4)
	<i>With trade</i>	<i>With tariff</i>	<i>With trade</i>	<i>With tariff</i>
GDP per capita	0.00001** (2.19)	0.00001** (2.37)	-0.00002 (-1.58)	-0.00001 (-0.71)
Human capital	-0.0135*** (-6.74)	-0.0134*** (-5.90)	-0.0112*** (-5.14)	-0.0118*** (-4.81)
Remoteness	0.00001 (1.04)	0.00001 (0.13)	0.00001 (0.64)	-0.00003 (-0.33)
Infrastructure	-0.00115 (-0.59)	-0.00110 (-0.49)	-0.0009 (-0.47)	-0.00113 (-0.50)
Institutions	-0.0412*** (-4.47)	-0.0431*** (-3.70)	-0.0384*** (-3.95)	-0.0401*** (-3.20)
Trade/ Tariff	-0.00034 (-0.30)	0.0114*** (3.25)	0.00007 (0.07)	0.0107*** (3.02)
GDP per capita (Square)			6.06e-10** (2.41)	4.11e-10 (1.48)
Constant	4.285*** (19.91)	4.167*** (19.67)	4.267*** (19.90)	4.190*** (19.81)
Observations	314	266	314	266
F-test	19.26	19.85	34.95	32.99
R-squared	0.22	0.25	0.24	0.25

Note: *** Significant at 1% level, ** 5% level and *10% level, respectively; t values in parentheses (with robust standard errors); lower values of the Theil diversification index imply higher diversification, and negative coefficients indicate positive effects on diversification. Regressions reported exclude outliers, which have been identified in terms of trade concentration / specialization indicators relative to GDP; countries excluded from the regressions are: Hong Kong, Singapore, Equatorial Guinea, Guyana, Maldives and Lesotho.

Table 5. OLS results including regional dummy for SSA
The dependent variable is exports diversification (Theil Index): 1970-2010

	(1)	(2)	(3)	(4)
	<i>With trade</i>	<i>With tariff</i>	<i>With trade</i>	<i>With tariff</i>
SSA	0.417*** (2.98)	0.395*** (2.66)		
GDP per capita	0.00001*** (2.80)	0.00001*** (2.94)	0.00001*** (2.64)	0.00001*** (2.94)
Human capital	-0.0104*** (-4.61)	-0.0101*** (-3.83)	-0.0116*** (-5.49)	-0.0105*** (-4.24)
Remoteness	0.00001 (1.12)	-0.00001 (-0.14)	0.00001 (1.01)	0.0000003 (0.03)
Infrastructure	-0.00150 (-0.76)	-0.00144 (-0.63)	-0.00130 (-0.66)	-0.00158 (-0.68)
Institutions	-0.0374*** (-3.96)	-0.0411*** (-3.57)	-0.0404*** (-4.38)	-0.0394*** (-3.37)
Trade/ Tariff	-0.0000191 (-0.02)	0.0131*** (3.85)	-0.0005 (-0.48)	0.0118*** (3.50)
SSA*Trade/ SSA*Tariff			0.0047*** (2.85)	0.0342*** (3.06)
Constant	4.001*** (16.83)	3.900*** (16.15)	4.137*** (18.80)	3.939*** (17.04)
Observations	314	266	314	266
F-test	21.80	22.14	19.74	23.33
R-squared	0.25	0.27	0.24	0.27

Notes: *** Significant at 1% level, ** 5% level and *10% level respectively; t values in parenthesis (with robust standard errors); lower values of the Theil index diversification imply higher diversification, and negative coefficients indicate higher diversification. Regressions reported exclude outliers, which have been identified in terms of trade concentration / specialization indicators relative to GDP; countries excluded from the regressions are: Hong Kong, Singapore, Equatorial Guinea, Guyana, Maldives and Lesotho.

The findings from the cross-country regressions in Table 4 show that higher GDP per capita is associated with exports specialization in the long run (Columns 1 and 2). The estimated coefficient for human capital, measured by secondary school enrollment, is negative and statistically significant across specifications, which implies that higher human capital is associated with greater exports diversification. The literature suggests that geography is exogenous to an economy, with the geographical distance to main trade partners as an important variable in the analysis of exports diversification and trade, although the results are not statistically significant. Also, institutions, as measured by Polity2, are positively associated with exports diversification.

On average, the impact of trade intensity on exports diversification is not confirmed. However, the findings show that trade liberalization, measured by lower tariffs, tends to lead to exports diversification. Access to electricity, used as a proxy for infrastructure, is not statistically significant but has the expected sign. We also test for a non-linear impact of GDP on exports diversification in the long run, but the expected inverted-U hypothesis of the relationship between income and exports diversification is supported only when controlling for the impact of trade intensity.⁹

The evidence established so far has been for the total sample of developing countries. The question arises if the impact of trade on diversification holds for the sub-sample of Sub-Saharan African countries. Thus, further estimations were performed, using a dummy variable for SSA, to gauge the extent to which the estimated coefficients differ for this group compared to the other countries in the sample. Table 5 extends the estimations reported in Table 4, also controlling for the impact of trade and trade policy on SSA. The findings of the augmented models provide support for those in Table 4 concerning structural factors as well as the indicators of trade and trade policy, confirming that more restrictive trade regimes lead to higher specialization of exports. This result echoes an important strand of the theoretical and empirical literature suggesting that trade liberalization is positively associated with exports diversification (e.g. Cadot et al 2011, Schott 2004, and Xiang 2007 for related discussions). A direct impact of trade and tariffs on SSA is statistically confirmed. Using tariffs as an indicator of trade liberalization we find that liberalization leads to exports diversification, and the results are stronger for SSA. In the case of trade intensity, the results are not significant, but for SSA countries it leads to exports concentration; the latter result is consistent with the findings of Agosin et al. (2012) for their more global sample.

To examine the robustness of the long-run results yielded by the cross-country estimates, we account for the endogenous regressors by undertaking dynamic panel estimations using Generalized Methods of Moments (GMM) estimators, with robust standard errors. It should be noted that the consistency of the GMM estimator depends on the validity of the assumption that the second-order error term is not serially correlated, and on the validity of the instruments. The diagnostics statistics reported in Table 6 generally support the empirical validity of the estimates. The null hypothesis of no second-order serial correlation is maintained; meanwhile the Sargan test results fail to reject the null hypothesis of over-identifying restrictions, though with rather low p-values.

⁹ Other explanatory variables were included in the analysis to gauge the impact of macroeconomic conditions, including various measures of exchange rates and volatility, investment, FDI, capital account openness, measured by the Chinn-Ito de Jure controls, but the results are also mixed and statistically inconclusive.

Table 6. GMM results including regional dummy for SSA
The dependent variable is exports diversification (Theil Index): 1970-2010

	(1)	(2)	(3)	(4)
	<i>With trade</i>	<i>With tariff</i>	<i>With trade</i>	<i>With tariff</i>
L.Theil (IMF)	0.949*** (46.00)	0.953*** (44.22)	0.951*** (48.55)	0.956*** (47.01)
GDP per capita	0.000001 (1.33)	0.000002** (2.15)	0.000003 (1.07)	0.000006* (1.79)
Human Capital	-0.002* (-1.88)	-0.002** (-2.10)	-0.002** (-2.29)	-0.002** (-2.46)
Remoteness	8.88e-08 (0.04)	4.23e-06 (0.15)	4.04e-06 (0.18)	5.68e-06 (0.22)
Infrastructure	0.0004 (0.89)	0.0005 (1.02)	0.0004 (0.96)	0.0005 (1.14)
Institutions	-0.003 (-1.04)	-0.0003 (-0.12)	-0.002 (-0.83)	-0.0002 (-0.08)
Trade/ Tariff	-0.0002 (-0.99)	0.001* (1.85)	-0.0004* (-1.75)	0.001* (1.75)
SSA*Trade/ SSA*Tariff	-0.0003 (-1.01)	0.0004 (0.11)	-0.0003 (-0.82)	-0.0003 (-0.08)
GDP per capita (Square)			-3.21e-11 (-0.79)	-6.21e-11 (-1.41)
Constant	0.261** (1.97)	0.177 (1.40)	0.264** (2.12)	0.169 (1.49)
Observations	314	266	314	266
Arellano-Bond AR(1)	0.018	0.028	0.018	0.028
Arellano-Bond AR(2)	0.792	0.794	0.781	0.784
Sargan (<i>p</i> values)	0.112	0.072	0.158	0.110

Notes: t statistics in parentheses: * $p < 0.10$, ** $p < 0.05$, *** $p < 0.01$. Lower values of the Theil index diversification imply higher diversification, and negative coefficients indicate positive effects on diversification. Regressions reported exclude outliers which have been identified in terms of trade concentration / specialization indicators relative to GDP; countries excluded from the regressions are: Hong Kong, Singapore, Equatorial Guinea, Guyana, Maldives and Lesotho. The test statistics and standard errors (in parentheses) are asymptotically robust to heteroskedasticity. The Sargan statistic is a test of the over-identifying restrictions, distributed as chi-square under the null of instrument validity.

In all the reported results, the positive and significant lagged dependent variable suggests persistence of export diversification. As in the OLS estimates, higher human capital leads to greater exports diversification. This is in line with the findings in the literature (e.g. Hausmann et al 2007, and Agosin et al 2012), that countries with abundant human capital specialize in differentiated manufactured products. GDP per capita is positively associated with exports concentration, contrary to the finding by Elhiraika and Mbate (2014) for African countries; however, the non-linear impact of GDP per capita on exports diversification cannot be confirmed. The impact of other structural variables cannot be statistically verified, although the reported signs are in the expected direction. For the focus of the present study, the results show that trade intensity and trade liberalization both lead to exports diversification for all developing countries, and similarly for SSA countries as a group.

6. Conclusion

Over the past few decades, developing countries have increased their dependence on trade and adopted more liberal trade policies. Yet vulnerable countries such as LDCs and SSA continue to account for an insignificant percentage of global trade and have highly concentrated export structures. Against this backdrop, this paper examines the role of trade and trade policy in exports diversification in developing countries using both parametric and non-parametric techniques.

The non-parametric analyses indicate that developing countries that are more open to trade, as measured by trade intensity, tend to have more diversified exports structures than those less open to trade. However, for SSA the non-parametric test shows the reverse, that is, that countries that are more open to trade have less diversified exports structures.

The findings from the parametric analysis provide further evidence that trade liberalization, in the form of lower tariffs, contributes to exports diversification in developing countries, and the results for the long term are even stronger for SSA countries. With regards to trade intensity, the parametric estimations also confirm the results that trade is associated with diversification in developing countries and in SSA countries in the short term; however, for SSA it actually leads to concentration in the long term, consistent with the non-parametric results. Finally, the empirical analyses provide evidence that institutions, human capital, and GDP per capita also influence the diversification prospects.

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Appendix

Table A1. Variables definition and data sources

Variable	Indicator	Source
Trade and trade policy	Trade (% of GDP)	World Development Indicators (WID) http://databank.worldbank.org/data/reports.aspx?source=World-Development-Indicators
	Tariff (weighted)	World Integrated Trade Solutions (WITS) https://wits.worldbank.org/
Export diversification measures	Manufacturing exports (% of total exports)	Authors' own calculation based on data from WID
	IMF Theil diversification index. A lower value of the index indicates greater diversification.	IMF https://www.imf.org/external/np/res/dfidimf/diversification.htm
	Herfindahl export concentration index. The index takes values between 0 and 1, and a value closer to 1 indicates greater concentration.	UNCTAD Statistics http://unctadstat.unctad.org/wds/TableView/tableView.aspx?ReportId=120
Human Capital	Secondary school enrolment (net, %)	World Development Indicators (See above)
Remoteness	Distance major trade partner	COMTRADE-WITS (for bilateral trade partners), and CEPII database (for distance). https://wits.worldbank.org/ http://www.cepii.fr/CEPII/en/bdd_modele/bdd_modele.asp
Infrastructure	Access to electricity (% of population)	World Bank World Development Indicators (see above)
Institutions	Polity2 index. The index takes values between -10 and +10. Higher values indicate higher levels of democracy.	Polity IV database http://www.edac.eu/indicators_desc.cfm?v_id=63

Table A2. Summary statistics: Complete sample, 1970–2015

Variables	Obs.	Mean	Median	Standard Deviation	Min	Max
Structural determinants of diversification						
Manufacturing exports (% of Total exports)	3530	14.46	6.87	18.00	0	110.49
Manufacturing (% of GDP)	4625	13.21	12.15	7.41	0.15	45.66
IMF Theil index	5130	3.96	3.94	1.06	1.53	6.44
School enrolment, secondary (% net)	1531	52.25	55.33	26.55	0.09	99.42
GDP per capita	5484	5291.67	2200.58	9734.53	115.43	115003.00
Remoteness	3986	5676.75	4341.88	4265.55	60.77	19079.88
Institutions	4880	-0.71	-2.00	6.77	-10	10
Access to electricity	3443	78.23	96.16	30.14	0.01	100
Trade and Economic reforms						
Tariff rate	2450	9.89	8.90	7.58	0.00	88.43
Total trade (% of GDP)	5503	81.27	71.36	53.59	0.02	531.74
Exports (% of GDP)	5503	36.35	29.81	27.25	0.01	230.27
Imports (% of GDP)	5503	44.92	38.06	31.17	0	424.82

Note: For the IMF Theil index, the period is 1970–2010.

Table A3. Summary statistics for SSA and other developing countries (excluding SSA), 1970–2015

	SSA					Other developing countries (excl. SSA)				
	<i>N</i>	Mean (Std. dev.)	Median	Min	Max	<i>N</i>	Mean (Std. dev.)	Median	Min	Max
Structural determinants of diversification										
Manufacturing exports (% of Total exports)	941	7.18 (8.99)	3.40	0	48.95	2589	17.106 (19.65)	8.99	0	110.49
Manufacturing (% of GDP)	1568	11.20 (6.71)	9.87	0.24	45.67	3057	14.28 (7.548)	13.94	0.16	40.45
Theil Index	1594	4.33 (0.95)	4.37	1.78	6.34	3536	3.79 (1.07)	3.75	1.53	6.44
School enrolment, secondary (% net)	424	26.114 (20.19)	20.39	0.099	89.64	1107	62.26 (21.39)	66.47	3.58	99.43
GDP per capita	1903	1823.22 (2889.71)	793.25	115.44	25732.70	3581	7134.86 (11441.29)	3449.02	161.89	115003.00
Remoteness	1068	6087.32 (3452.45)	5541.32	105.18	15270.32	2918	5526.48 (4518.01)	3569.32	60.77	19079.88
Institutions	1999	-1.57 (6.05)	-4	-10	10	2881	-0.116 (7.176)	-1	-10	10
Access to electricity (% of population)	1113	81.13 (27.25)	94.86	0.01	100	2330	76.84 (31.34)	96.63	0.02	100
Economic reforms										
Tariff rate	776	11.09 (5.27)	10.63	0.50	39.16	1674	9.35 (8.24)	7.79	0	88.43
Total trade (% of GDP)	1854	75.99 (47.50)	63.39	6.32	531.74	3649	83.94 (56.24)	76.51	0.02	455.28
Exports (% of GDP)	1854	30.79 (20.08)	24.95	2.52	124.39	3649	39.16 (29.86)	32.64	0.01	230.27
Imports (% of GDP)	1854	45.20 (33.87)	36.47	2.98	424.82	3649	44.78 (29.71)	39.32	0	227.35

Note: For the IMF Theil index, the period is 1970–2010.

Table A4. Sample of countries (n=144)

Afghanistan*	Dominica	Lebanon	St. Lucia
Algeria	Dominican Republic	Lesotho* ‡	St. Vincent and the Grenadines
Angola* ‡	Ecuador	Liberia* ‡	Saudi Arabia
Antigua and Barbuda	Egypt, Arab Rep.	Libya	Samoa
Argentina	El Salvador	Macao SAR, China	Senegal* ‡
Armenia	Equatorial Guinea* ‡	Madagascar* ‡	Seychelles ‡
Aruba	Eritrea* ‡	Macedonia	Sierra Leone* ‡
Azerbaijan	Eswatini ‡	Malawi* ‡	Singapore
Bahamas	Ethiopia* ‡	Malaysia	Solomon Islands*
Bahrain	Faroe Islands	Maldives	Somalia* ‡
Bangladesh*	Fiji	Mali* ‡	South Africa ‡
Barbados	French Polynesia	Mauritania* ‡	South Sudan* ‡
Belize	Gabon ‡	Mauritius ‡	Sri Lanka
Benin* ‡	Gambia ‡	Mexico	Sudan*
Bhutan*	Ghana ‡	Mongolia	Suriname
Bolivia	Grenada	Moldova	Syria
Botswana ‡	Guatemala	Morocco	Tajikistan
Brazil	Guinea* ‡	Mozambique* ‡	Tanzania* ‡
Brunei Darussalam	Guinea-Bissau ‡	Myanmar*	Thailand
Burkina Faso* ‡	Guyana	Namibia ‡	Timor-Leste*
Burundi* ‡	Haiti*	Nepal*	Togo* ‡
Cabo Verde ‡	Honduras	New Caledonia	Tonga
Cambodia*	Hong Kong	Nicaragua	Trinidad and Tobago
Cameroon ‡	India	Niger* ‡	Tunisia
Central African Republic* ‡	Indonesia	Nigeria ‡	Turkey
Chad* ‡	Iran	Oman	Turkmenistan
Chile	Iraq	Pakistan	Uganda* ‡
China	Jamaica	Palau	United Arab Emirates
Colombia	Jordan	Panama	Uruguay
Comoros* ‡	Kazakhstan	Papua New Guinea	Uzbekistan
Congo, Rep. ‡	Kenya ‡	Paraguay	Vanuatu*
Congo, Dem. Rep.* ‡	Kiribati*	Peru	Venezuela
Costa Rica	Korea, Rep.	Philippines	Vietnam
Cote d'Ivoire ‡	Kuwait	Qatar	Yemen
Cuba	Kyrgyzstan	Rwanda* ‡	Zambia* ‡
Djibouti* ‡	Lao	St. Kitts and Nevis	Zimbabwe ‡

Note: *and ‡ denote Least Developed Countries (LDC) and Sub-Saharan African countries (SSA), respectively.