

Trade costs, quality and the skill premium

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Abstract. We develop a monopolistic competition model with non-homothetic factor input bundles where increasing quality requires increasing use of skilled workers. As a result more skill abundant countries export higher quality, higher priced goods. Using a multi-country dataset, we test and confirm the findings in Schott (2004) of a positive effect of skill abundance on unit values identified with US data. We extend the core model with per unit trade costs leading to the Washington apples effect that goods shipped over larger distance are of higher quality. The combination of high-quality goods being relatively skill intensive with the Washington apples effect implies that countries at a larger distance from their trading partners display a higher skill premium. Simulating our model, we find that a doubling of distance of a country relative to all its trading partners raises the skill premium in a country by about 1.6%.

Résumé. Les coûts du commerce, qualité, et la prime au travail qualifié. Les auteurs développent un modèle de concurrence monopolistique avec des ensembles d'intrants non homothétiques où une qualité accrue réclame l'utilisation accrue de travailleurs qualifiés. En conséquence, les pays où relativement abondent les travailleurs qualifiés exportent des produits de plus haute qualité et à prix plus élevés. À l'aide de données pour plusieurs pays, on met au test et on confirme les résultats de Schott (2004) – pour des données américaines – à l'effet que l'abondance de qualifications dans un pays a un effet positif sur la valeur ajoutée. On applique son modèle à des données pour plusieurs pays. On modifie le cœur du modèle en utilisant les coûts du commerce par unité de commerce ce qui débouche sur l'effet des pommes de Washington à savoir que les produits transportés sur de plus grandes distances sont de plus haute qualité. La combinaison de ces deux forces (le fait que les produits de plus haute qualité réclament plus de travail qualifié, et l'effet des pommes de Washington) suggère que les pays à plus grande distance de leurs partenaires commerciaux jouissent d'une prime au travail qualifié. Les simulations du modèle révèlent qu'un doublement de la distance entre un pays par rapport à tous ses partenaires commerciaux voudrait dire un accroissement de la prime au travail qualifié de ce pays de l'ordre de 1.6%

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1. Introduction

In a seminal paper based on US import data, Schott (2004) found that traded goods prices within detailed product categories rise in the skill and capital abundance of the exporting country. As such he provided evidence for within-sector specialization. Broadly speaking, goods prices vary systematically even for similar goods sharing the same detailed product classification. More skill-abundant and capital-abundant countries export goods with higher prices. Higher prices are taken as evidence of higher quality.

While Schott's (2004) findings highlight the importance of exporter characteristics, and especially skill abundance in exporting countries, the theoretical literature that followed has focused instead on explanations based on distance and importer characteristics in explaining international pricing patterns.¹ The related empirical literature has also followed this route. As such, we are left with evidence based largely on one country, the US, with respect to exporter characteristics.

In this paper, we return to Schott's original observations on exporters and test his findings on the effect of skill abundance on traded goods prices employing a multi-country dataset with multiple exporters and importers. Compared to Schott, our data allow for inclusion of various fixed effects to control for possible omitted variables, and we also estimate nonlinear specifications. After the empirical exercise, we model the link between skill abundance and pricing in a monopolistic competition framework with homogeneous firms in the spirit of Krugman (1980), adding a role for quality. So, preferences are CES including a taste parameter as a measure for quality. We work with a variant of the Krugman model developed by Venables (1994) with fixed export costs besides regular fixed costs.² This implies separate free entry conditions for each destination market and the possibility that only a subset of firms export. There are two factor inputs, high skilled and low skilled labour, and factor input bundles are non-homothetic. Goods with higher quality require relatively more skilled labour. Moreover, similar to Baldwin and Harrigan (2011) and Feenstra and Romalis (2014), the marginal cost parameter rises with quality. This setup gives a straightforward explanation for the relation between exporter skill abundance and traded goods prices in Schott (2004). In relatively skill abundant countries, the relative wage of skilled workers is lower, implying a lower cost of producing high quality

1 Manova and Zhang (2012), Verhoogen (2008), Kugler and Verhoogen (2012), Crozet et al. (2012), Martin (2012), Görg et al. (2010), Bastos and Silva (2010) and Hallak and Sivadasan (2010) are examples of studies with firm level prices. Hummels and Skiba (2004), Hummels and Lugovskyy (2009), Baldwin and Harrigan (2011), Harrigan et al. (2011) and Bekkers et al. (2012) use average prices at various HS levels.

2 The model setup of Venables (1994) with destination-specific fixed costs is chosen to keep the model tractable enough to derive analytical results. Generating an effect of skill abundance on quality requires a non-homothetic cost function. This reduces the tractability of the model implying that we need to keep other modelling features as basic as possible. As we are interested in explaining aggregate traded goods prices and not firm level prices, we can abstract from firm heterogeneity as used, for example, in Bernard et al. (2007).

goods. This raises the incentive for firms to produce higher quality goods. And goods of higher quality display higher marginal costs raising the price.

We first define a basic model to analytically derive the impact of skill abundance on traded goods prices. Then, we extend the basic framework with two additional elements from the literature on traded goods prices and solve the model with simulations. First, we add per unit trade costs to the model, besides the standard iceberg trade costs. This generates a Washington apples effect as in Hummels and Skiba (2004). Goods shipped at larger distance have a higher quality. Second, we include a taste for quality parameter on the demand side and following Hallak (2006) this parameter is a function of income per capita. This implies that richer consumers demand higher quality goods. With quality being relatively skill-intensive countries at a larger distance from their trading partners will produce higher quality goods raising the relative demand for skilled workers and thus the skill premium.

We solve the extended model numerically calibrating it to actual income, income per capita and distance data for the largest countries in the empirics. Parameters appearing in Feenstra and Romalis (2014) are set as estimated by these scholars. The remaining parameters are taken from the literature and set such that the estimated elasticities of the FOB price with respect to skill abundance and distance employing data following from model simulations are close to the elasticities estimated with real-world data. Model simulations show that the combination of per unit trade costs and high-quality goods being skill intensive generates an intuitive relationship between trade costs and the skill premium. An increase in distance raising per unit trade costs relative to ad valorem trade costs generates a Washington apples effect, raises the quality of exporter's goods and therefore also the demand for skilled workers. Simulations show that a doubling of distance of a country from its trading partners raises the skill premium by 1.6%. Our simulations indicate that there is also a demand-side effect on the distribution of income. Richer consumers benefit more from quality increases as quality as they have a higher valuation for quality. This reinforces the effect on the nominal skill premium, although the effect in our simulations is an order smaller than the effect on the nominal skill premium.

Based on the above exposition our contribution to the literature is thus twofold. First, we introduce a mechanism through which distance affects the skill premium as a result of the combination of the Washington apples effect and the relative skill intensity of high quality goods. Second, we provide an evaluation of Schott's US-based results with respect to factor abundance using a wider dataset on traded goods prices with multiple importers and exporters.

For the empirics, we employ a large, multi-country dataset with product level (HS6) unit values for the period 2000–2004. The empirics confirm the main prediction of our model and the findings in Schott (2004). A larger relative skill abundance of the exporting country leads to higher traded goods prices. Based upon our model, we also examine the effect of distance and exporter GDP per capita on unit values. We include an importer-product-time fixed effect to

capture the role of importer GDP per capita and variation in the definition of unit values across products. With this fixed effect, we can also account for other relevant demand side variables not present in our theoretical model like market size and income inequality. The coefficients on distance and exporter GDP per capita have the expected positive signs. We estimate the same model including nonlinear terms. The results confirm the findings of the (log) linear model with marginal effects close to the linear specification.

The related literature can be split up into three parts, first work on explaining traded goods prices, second work on between country differences in the incentive to produce quality and third work on trade and inequality. Most theoretical work explaining traded goods prices focuses on demand side characteristics,³ on distance⁴ or on firm characteristics.⁵ The work by Feenstra and Romalis (2014) includes many elements of this literature. Feenstra and Romalis (2014) set up a firm heterogeneity model of quality differentiation with per unit trade costs and demand for quality varying with importer income per capita. They estimate model parameters structurally, using trade and price data. In our model simulations, we build on Feenstra and Romalis (2014), by using their estimated elasticities and extending their framework with a role for factor abundance on the supply side.

Flam and Helpman (1987), Hummels and Klenow (2005) and Fielser (2012) also model between country differences in the incentive to produce and export goods of different quality. In these papers differences in the ability to produce quality stem from absolute productivity differences between countries, but are not related to factor abundance.⁶ Early work related to our paper is Falvey (1981), who develops a specific factors model to explain intra-industry trade as a result of factor differences between countries. Although his model also features quality differentiation endogenous to factor differences, he does not purport to relate prices to country characteristics and instead focuses on explaining intra-industry trade with factor differences.⁷

Fajgelbaum et al. (2011) combine non-homothetic preferences with increasing returns in production, showing that richer countries specialize in the production of high-quality goods. Although our extended model also contains non-homothetic preferences, there is no home-market effect of quality specialization in our model. The reason is that quality and fixed costs are destination-specific: firms have to pay fixed costs to enter each market and sell a different

3 See, for example, Flam and Helpman (1987), Hallak (2006), Hsieh and Klenow (2007), Hummels and Lugovskyy (2009), Simonovska (2010), Alessandria and Kaboski (2011) and Bekkers et al. (2012).

4 See, among others, Hummels and Skiba (2004), Baldwin and Harrigan (2011).

5 See, among others, Verhoogen (2008), Kugler and Verhoogen (2012) and Hallak and Sivadasan (2010).

6 Kugler and Verhoogen (2012) relate the quality of output to quality of inputs in a model where more productive firms use higher quality inputs, because of complementarity between productivity and input quality.

7 Bekkers (2016) proposes a different mechanism to explain the effect of skill abundance on quality and traded goods prices. In a firm heterogeneity model, firms can raise the quality of their goods by investing more in innovation. With factor input bundles in innovation being relatively skill intensive, more skill abundant countries produce higher quality, higher priced goods.

quality level to each country. So, having a large home market for high-quality goods does not imply that high-quality goods are also exported by more firms. Dingel (2014) models the two mechanisms in Schott (2004) and Fajgelbaum et al. (2011) leading to a positive effect of exporter income per capita on the quality of exports and determines the relative importance of the two mechanisms with data on intra-US trade. Our model does not feature the home-market effect. Instead, we include per unit trade costs generating an effect of distance on the skill premium, also solving our model numerically to quantify the effect.

The recent literature on trade and inequality has proposed various mechanisms to explain rising inequality in all countries as a result of trade liberalization, moving away from the traditional Heckscher–Ohlin framework where inequality effects differ according to relative factor abundance of the country. Four sets of studies are related to our work. First, Verhoogen (2008) shows how trade liberalization can raise wage inequality in a firm heterogeneity model where more productive firms produce higher quality goods and pay higher wages. Trade liberalization will reallocate market shares towards more productive exporting firms paying higher wages and thus raising wage inequality. Burstein and Vogel (2012) and Harrigan and Reshef (2011) model a similar mechanism in a firm heterogeneity model with more productive firms being more skill intensive. Trade liberalization reallocates market shares towards more productive and more skill intensive firms, raising the demand for skills and thus the skill premium. Similar to these models, in our model higher quality goods (or more productive firms) are also more skill intensive. The way in which changes in trade costs generate more demand for quality instead is different. In the mentioned studies this occurs through a reallocation effect towards more productive firms and in our paper this occurs through a change in the strength of the Washington apples effect: when per unit trade costs become more important relative to ad valorem trade costs, the demand for quality rises. Second, Caron et al. (2011) show that there is a positive relation between the sectoral income elasticity of demand and the skill intensity, implying that rising income will lead to increased demand for skills thus raising the skill premium.⁸ Our model features a similar mechanism, as rising income (possibly as a result of trade liberalization) raises the demand for high-quality and thus more skill-intensive goods. Third, Matsuyama (2007) shows that trade can drive up inequality if activities related to international business are relatively skill intensive. Fourth, Fajgelbaum and Khandelwal (2014) show that trade affects the income distribution through the demand side under non-homothetic preferences, a mechanism also present in our model. Fajgelbaum and Khandelwal (2014) find that trade in general is good for poor consumers.

The next section starts with an analysis of the multi-country price data providing motivating evidence for the theoretical model. Section 3 outlines both the baseline theoretical model on the role of factor abundance and the model with extensions. In section 4, we present a numerical analysis of the extended theoretical model, and section 5 concludes.

8 The published version, Caron et al. (2014), does not discuss the skill premium implications.

2. Motivating evidence

Before developing a theoretical model, we first explore the link between traded goods prices and skill abundance with a multi-country dataset, extending the work by Schott (2004) who employed only data on exports to the US. We proxy traded goods prices with unit values. The data used for unit values come from the BACI database,⁹ which contains the quantity and value of bilateral imports in six-digit Harmonized System (HS) classification. The database is constructed from COMTRADE (Commodities Trade Statistics database). We use data for the period between 2000–2004. BACI takes advantage of the double information on each trade flow to fill out the matrix of bilateral world trade providing a “reconciled” value for each flow reported at least by one of the partners. Therefore the missing values in BACI are those concerning trade between non-reporting countries.

Skill abundance and income per capita data originate from the World Bank’s World Development Indicator database. We use GDP per capita as a measure of income per capita. Similarly to Schott (2004), we define skilled labour as workers with tertiary or secondary education, while unskilled labour as having only primary education. Data on distance are taken from Clair et al. (2004).¹⁰ Some descriptive statistics on our sample and the list of countries used in the regressions based upon data availability can be found in the online appendix.

We include distance in all regressions to account for the Washington apples effect meaning that quality rises with distance, an empirical finding first discovered by Alchian and Allen (1964) and explored in a trade setting by Hummels and Skiba (2004). We control for the role of demand side variables like importer market size and importer income inequality by including importer-time-product fixed effects. The product-specific fixed effects serve to account for differences in measurement of unit values across products.

Table 1 presents the estimation results. In column (1), we start with a linear specification with distance and skill abundance as explanatory variables, and in column (2), we add GDP per capita as a control variable. Our results are in line with the empirical results of Schott (2004) who found a positive effect of exporter skill abundance on unit values with US importer data. We further explore similarities and differences between our results and Schott (2004) in the online appendix. Controlling for GDP per capita the coefficient on skill abundance drops from 0.095 and 0.057. Due to the correlation with GDP per capita, the coefficient becomes lower once GDP per capita is also included. Our estimation results imply that a 10% increase in relative skill abundance is associated with an increase in traded goods prices of between 0.9% and 0.6%. We find that prices increase with distance supporting the Washington apples effect. Furthermore, GDP per capita

⁹ See cepii.fr/anglaisgraph/bdd/baci/baciwp.pdf.

¹⁰ See cepii.fr/anglaisgraph/bdd/distances.htm. The distance data are calculated following the great circle formula, which uses latitudes and longitudes of the relevant capital cities.

TABLE 1
Effect of relative skill abundance, control variables and interactions with substitution elasticities on unit values

Dependent variable:	(1)	(2)	(3)	(4) Marg effects	(5)	(6)	(7)
$\ln UV_{k/mr}$							
$\ln(S/U)$	0.095*** (0.025)	0.057*** (0.017)	-0.009 (0.131)	0.094*** (0.023)	0.57*** (0.017)	0.095*** (0.025)	0.094*** (0.025)
$\ln distance$	0.116*** (0.016)	0.129*** (0.017)	0.257* (0.144)	0.127*** (0.018)	0.129*** (0.017)	0.112*** (0.016)	0.116*** (0.016)
$\ln GDPpc$		0.150*** (0.022)	-0.045 (0.129)	0.191*** (0.035)	0.150*** (0.022)		
$export_{jc}$						0.007 (0.006)	
$extmarg$							-3.406 (2.667)
$(\ln(S/U))^2$			0.13 (0.011)				
$\ln(S/U) \ln distance$			-0.008 (0.013)				
$\ln(S/U) \ln GDPpc$			0.048** (0.022)				
$\ln GDPpc \ln distance$			0.005 (0.012)				
$(\ln GDPpc)^2$			0.026 (0.016)				
$(\ln distance)^2$			-0.008 (0.009)				
$\ln(S/U) * \ln \sigma$					-2.28e-0.6 (5.38e-06)		
Constant	1.536 (0.132)	1.035*** (0.152)	0.739 (0.577)		1.541*** (0.152)	1.541*** (0.139)	1.543*** (0.134)
Observations	23,632,862	23,632,862	23,632,862		23,632,862	23,174,457	23,632,862
Adjusted R^2	0.62	0.63	0.63		0.63	0.62	0.62

NOTES: Standard errors (in parentheses) are clustered by exporters. Importer-product-time fixed effects are included in all specifications. $\ln(S/U)$ is the exporter's skill abundance defined as the log of the ratio of skilled to unskilled workers. $\ln distance$ is the log of distance between the exporter and importer country capitals. $\ln GDP_{pc}$ is the log of GDP per capita of the exporter country in 1,000 dollars. $\ln \sigma$ is the product substitution elasticity. *, **, *** $p < 0.05$, ***, $p < 0.01$.

of the exporter country has a positive effect on export unit values throughout all specifications with a coefficient between 0.19 and 0.15.

To check for nonlinearities, we add nonlinear terms (squares and interaction terms) in column (3) with the marginal effects displayed in column (4). The interaction term between skill abundance $\ln \frac{S}{U}$ and GDP per capita is significant, implying that some of the effects are nonlinear. The marginal effects are very close to the coefficients of the linear specification.

In column (5), we use sector and importer-country specific estimates of the product substitution elasticity estimated by Broda et al. (2006) to examine the interaction effect of skill abundance in exporter countries with the product substitution elasticity in importer countries.¹¹ Broda et al. (2006) estimate the substitution elasticities for 73 countries at the HS6 level.¹² The coefficient of the interaction term is negative and non-significant.¹³ Below, we will show that effects are similar in the simulations with our theoretical model displaying a very small effect of the substitution elasticity on the impact of skill abundance on traded goods prices.

Finally, we evaluate the importance of exporting fixed costs and the extensive margin for traded goods prices. Columns (6) and (7) show that measures of both variables are insignificant. As will be discussed below this is in line with simulations with the theoretical model, where these variables are also insignificant.¹⁴

To summarize, our estimation results indicate that countries export higher priced, higher quality products when they are more skill abundant. They thus show that the results of Schott (2004) also hold when we take a wider sample of importing countries beyond the US, although the impact of relative skill abundance is a bit lower for the larger sample of importing countries (see the online appendix for further discussion on the comparison between Schott (2004) and our results).

3. Theoretical model

The modelling setup follows Venables (1994), adding endogenous quality and non-homothetic factor cost bundles. We model an economy with two countries indexed by $k, l = H, F$, two factors of production, skilled workers S and unskilled workers U . All workers in the two countries have identical preferences.

11 We cannot include the measure itself as we have sectoral fixed effects.

12 The data can be downloaded from columbia.edu/~dew35/TradeElasticities/TradeElasticities.html

13 We also explored the interaction effect with σ in the nonlinear model and effects are very similar. Results are available upon request.

14 Controlling also for GDP per capita, the extensive margin measure becomes significant with a positive sign. This result is hard to interpret, and so we conclude that the effect of the extensive margin is not robust to variation in control variables.

3.1. Demand

Utility in country k , Q_k , consists of a CES composite of domestic varieties Q_{kk} and foreign varieties Q_{lk} with substitution elasticity ε . Preferences for both domestic and foreign varieties are a CES function over a continuum of varieties $\omega \in \Omega_{kk}$ and $\omega \in \Omega_{lk}$ with substitution elasticity σ :

$$Q_k = (Q_{kk}^{\frac{\varepsilon-1}{\varepsilon}} + Q_{lk}^{\frac{\varepsilon-1}{\varepsilon}})^{\frac{\varepsilon}{\varepsilon-1}}, \quad (1)$$

$$Q_{lk} = \left[\int_{\omega \in \Omega_{lk}} (z(\omega)q(\omega))^{\frac{\sigma-1}{\sigma}} d\omega \right]^{\frac{\sigma}{\sigma-1}}. \quad (2)$$

q_ω and z_ω are, respectively, the quantity and quality of variety ω . Variables with a subscript lk represent flows from country l to country k . Demand for variety ω by all consumers in country k imported from country l is given by:

$$q_{lk}(\omega) = z_{lk}(\omega)^{\sigma-1} p_{lk}(\omega)^{-\sigma} P_{lk}^{\sigma-\varepsilon} P_k^{\varepsilon-1} I_k. \quad (3)$$

The price index P_k and P_{lk} are defined as:

$$P_k = \left(P_{kk}^{1-\varepsilon} + P_{lk}^{1-\varepsilon} \right)^{\frac{1}{1-\varepsilon}} \quad (4)$$

$$P_{lk} = \left[\int_{\omega \in \Omega_{lk}} \left(\frac{p(\omega)}{z(\omega)} \right)^{1-\sigma} d\omega \right]^{\frac{1}{1-\sigma}}. \quad (5)$$

I_k is total income in country k and the sum of skilled and unskilled labour's income:

$$I_k = w_k^s S_k + w_k^u U_k. \quad (6)$$

w_k^s and w_k^u are, respectively, the wages of skilled and unskilled workers and S_k and U_k the number of skilled and unskilled workers.

3.2. Supply

We now turn to the supply side. Like in Krugman (1980) firms are identical and can produce with an identical increasing returns technology with a fixed cost f . Following Venables (1994) firms have to pay market-specific fixed costs.¹⁵ So a firm from country k pays domestic fixed costs to sell in its home market, f_{kk} and additional exporting fixed costs f_{kl} to sell abroad. We can interpret the fixed costs as beachhead costs to enter a market. Beachhead costs for each market are intuitive in a setting where firms produce different quality levels for different destination markets depending on market conditions in the destination. Destination-specific fixed costs also enable us to derive analytical results in the basic model.

15 Jean (2002) and Melitz (2003) also work with fixed export costs.

As explained by Venables (1994) a setup with an upper Armington nest together with destination-specific fixed costs implies selection into exporting with only a subset of firms exporting. Without the Armington nest, the four free entry conditions (two for each country) following from destination-specific fixed costs would not be independent and thus not allow for both trading and non-trading firms. Selection is a property of our model setup, but is not important for the results on traded goods prices in the basic model as firms are homogeneous and per unit trade costs are absent. In the extended model with per unit trade costs, changes in the number of exporting firms (the extensive margin) might affect traded goods prices, since per unit trade costs imply that exported goods are of higher quality.

Marginal costs for sales to a specific destination (domestic and exporting) are a function of the quality of the good sold in the destination with an elasticity $1/\theta$. θ is called the quality elasticity in Baldwin and Harrigan (2011) and it is a measure for the ability to produce high-quality goods.¹⁶ Feenstra and Romalis (2014) also work with this relation between quality and marginal costs. The total cost function C_k of a firm from country k is given by:

$$C_k(z_{kk}, z_{kl}, w_{ks}, w_{ku}) = \sum_{l=H,F} \left(z_{kl}^{\frac{1}{\theta}} \tau_{kl} q_{kl} + f_{kl} \right) CB_{kl}. \quad (7)$$

τ_{kl} are iceberg trade costs. CB_{kl} is the cost of input bundles used in production and fixed costs and defined as follows:

$$CB_{kl} = CB(z_{kl}, w_{ks}, w_{ku}) = \left((z_{kl}^{\eta} w_k^s)^{1-\rho} + \vartheta (w_k^u)^{1-\rho} \right)^{\frac{1}{1-\rho}}. \quad (8)$$

We assume $\eta > 0$. The expression for the cost of input bundles in (8) implies that an increase in quality raises the weight of skilled workers in the input bundle. Therefore, relatively more high skilled workers are required for higher quality goods. So, the cost function is non-homothetic and to allow for variation in the substitution elasticity between high skilled and low skilled workers, we work with a non-homothetic CES cost function as in Shimomura (1999) with ρ the substitution elasticity between skilled and unskilled labour in the cost of input bundles in (8).¹⁷ ϑ is a CES-shifter used in the calibration to generate a positive skill-premium, i.e. $w_k^s > w_k^u$.

We choose the functional form z_{kl}^{η} for the CES-weight to be able to derive analytical results on the effects of skill abundance on quality and traded goods prices in the baseline model. With our specification costs depend on quality through marginal costs and through the non-homotheticity of the input bundles.

Using the expression for demand in equation (3) and the cost function as specified in equation (7), each firm maximizes profits π_k choosing the price p_{kl} and quality z_{kl} :

16 To be precise, the quality elasticity as defined in Baldwin and Harrigan (2011) is equal to $\theta - 1$ in our model.

17 The production function corresponding to the cost function CB in equation (8) is given by

$$Y(z_{km}, U_k, S_k) = \left(\left(\frac{S_k}{z_{km}^{\eta}} \right)^{\frac{\rho-1}{\rho}} + \vartheta^{\frac{1}{\rho}} U_k^{\frac{\rho-1}{\rho}} \right)^{\frac{\rho}{\rho-1}}.$$

$$\pi_k = \sum_{l=H,F} \left(\left(\frac{p_{kl}}{z_{kl}} \right)^{1-\sigma} P_{kl}^{\sigma-\varepsilon} P_l^\varepsilon I_l - \left(z_{kl}^{\frac{1}{\theta} + \sigma - 1} \tau_{kl} P_{kl}^{-\sigma} P_{kl}^{\sigma-\varepsilon} P_l^\varepsilon I_l + f_{kl} \right) CB_{kl} \right). \quad (9)$$

Each firm produces a unique variety. Maximizing profits with respect to the price p_{kl} generates the following markup equation for the CIF price:

$$p_{kl} = \frac{\sigma}{\sigma-1} z_{kl}^{\frac{1}{\theta}} \tau_{kl} CB_{kl}. \quad (10)$$

Taking the first order condition of profit in equation (9) with respect to quality and substituting the markup pricing equation in (10) leads to:

$$\frac{p_{kl} q_{kl}}{\sigma} \left(\frac{(\sigma-1) \frac{\theta-1}{\theta}}{z_{kl}} + \frac{\sigma-1}{CB} \frac{\partial CB}{\partial z_{kl}} \right) + f_{kl} \frac{\partial CB}{\partial z_{kl}} = 0. \quad (11)$$

The domestic and exporting market can be seen as separate markets, because there are fixed exporting costs besides regular fixed costs. Entering the domestic market and paying the domestic beachhead cost does not imply that a firm can also export as in Krugman (1980). This implies that there are two separate zero profit conditions, one for the domestic market and one for the exporting market:¹⁸

$$\frac{p_{kl} q_{kl}}{\sigma} = f_{kl} CB_{kl}. \quad (12)$$

The derivative of CB_{kl} in equation (8) with respect to z_{kl} is equal to:

$$\frac{\partial CB_{kl}}{\partial z_{kl}} = \frac{\eta CB_{kl}^\rho (z_{kl}^\eta w_k^s)^{1-\rho}}{z_{kl}}. \quad (13)$$

Substituting the zero profit conditions in equations (12) and the expression for $\frac{\partial CB}{\partial z_{kl}}$ into equation (11) leads to:

$$\frac{(\sigma-1) \frac{\theta-1}{\theta}}{z_{kl}} - \frac{\sigma \eta (z_{kl}^\eta w_k^s)^{1-\rho}}{z_{kl} CB_{kl}^{1-\rho}} = 0. \quad (14)$$

The first term in equation (14) represents the balance of the marginal benefit of higher quality as a result of larger sales and the increase in marginal cost of higher quality. The second term represents the marginal cost of higher quality due to a larger required use of the more expensive skilled labour. The balance of the two determines the optimal level of quality.

Using the expression for CB_{kl} in equation (8), equation (14) can be rewritten to express the relative wage $\frac{w_k^s}{w_k^u}$ as a function of quality z_{kl} with ζ defined as $\zeta = \frac{\sigma-1}{\sigma} \frac{\theta-1}{\theta} \frac{1}{\eta}$.

18 Venables (1994) works with one free entry condition for firms selling only in the domestic market and one free entry condition for firms selling in both markets. This is equivalent to our approach with a free entry condition for each market.

$$\frac{w_k^u}{w_k^s} = z_{kl}^\eta \left(\frac{1-\zeta}{\zeta} \right)^{\frac{1}{1-\rho}}. \quad (15)$$

3.3. Effect of skill abundance

To derive the effect of skill abundance on quality, we add the labour market equilibrium conditions for skilled and unskilled workers. Applying Shephard's lemma to the cost function in equation (7) and using the rewritten free entry conditions, $z_{kl}^{\frac{1}{\eta}} q_{kl} + f_{kl} = \sigma f_{kl}$, gives:

$$S_k = \sum_{l=H,F} N_{kl} \sigma f_{kl} C B_{kl}^\rho (z_{kl}^\eta)^{1-\rho} (w_k^s)^{-\rho}, \quad (16)$$

$$U_k = \sum_{l=H,F} N_{kl} \sigma f_{kl} C B_{kl}^\rho \vartheta (w_k^u)^{-\rho}. \quad (17)$$

We can divide the labour market conditions in equations (16)–(17), using the fact that quality z_{kl} does not vary with the destination market without per unit trade costs and a role for importer GDP per capita. This leads to the following expression:

$$\frac{S_k}{U_k} = \frac{(z_{kl}^\eta)^{1-\rho}}{\vartheta} \left(\frac{w_k^u}{w_k^s} \right)^\rho. \quad (18)$$

Substituting equation (15) into (18), we can solve for quality z_{kl} as a function of relative skill abundance S_k/U_k :

$$z_{kl} = \left(\frac{1}{\vartheta} \frac{S_k}{U_k} \right)^{\frac{1}{\eta}} \left(\frac{\zeta}{1-\zeta} \right)^{\frac{1}{\eta} \frac{\rho}{1-\rho}}. \quad (19)$$

So, quality z_{kl} rises in relative skill abundance $\frac{S_k}{U_k}$.

We can easily determine the effect of relative skill abundance on the export price. From equation (10) the export price p_{kl} is determined by the level of quality z_{kl} and the cost of input bundles $C B_{kl}$:

$$p_{kl} = \frac{\sigma}{\sigma-1} \left(\frac{S_k}{U_k} \right)^{\frac{1}{\eta\theta}} \left(\frac{\zeta}{1-\zeta} \right)^{\frac{\rho}{\eta(1-\rho)\theta}} \tau_{kl} C B_{kl}. \quad (20)$$

In the online appendix, we show that the relative change of unit wage costs as a result of a change in the relative wage $\frac{w_k^s}{w_k^u}$ is zero when taking into account the endogenous reaction in quality. The direct effect of a larger relative skilled wage $\frac{w_k^s}{w_k^u}$ exactly cancels out against the effect of the reduction in quality induced by a larger relative skilled wage. So the costs of input bundles do not vary with relative wages. Hence, the effect of relative skill abundance is determined by the direct effect in equation (20) displaying an elasticity of the price p_{kl} with respect to skill abundance of $\frac{1}{\eta\theta}$. So, we have the following result:

Result 1 In the baseline model, export goods from relatively more skill abundant countries have a larger quality and a higher price.

The model presented in this section contains a link between skill abundance, quality and market price. In a more skill abundant country, the relative wage of skilled workers is lower. Therefore, the marginal cost of producing higher quality goods falls. As a result firms will offer higher quality goods.¹⁹ The relations are consistent with the empirical findings by Schott (2004). A larger relative skill abundance in an exporting country leads to a higher export quality and a higher export price.

3.4. Model with extensions

In this section, we add two additional features to the baseline skill abundance model, a taste for quality that is varying with income as in Hallak (2006) and per unit trade costs as in Hummels and Skiba (2004). With these extensions our model becomes close to the model in Feenstra and Romalis (2014) with two main differences. First, we extend the model with a role for skill abundance; second, we limit the model by abstracting from firm heterogeneity and instead working with destination-specific fixed costs as in Venables (1994). Firm heterogeneity is not important for our paper since we focus on aggregate traded goods prices and not on firm-level prices. Moreover, since we cannot solve for quality explicitly with our extensions, firm heterogeneity would make simulations intractable.

The first additional feature is introduced as in Feenstra and Romalis (2014) using the dual approach starting from the expenditure function. The expenditure function E_k^v of a worker of type v , $v = s, u$, is defined as:

$$E_k^v = Q_k^v P_k^v = Q_k^v \left(\sum_{l=1}^K (P_{lk}^v)^{1-\varepsilon} \right)^{\frac{1}{1-\varepsilon}}, \quad (21)$$

$$P_{lk}^v = \left[\int_{\omega \in \Omega_{lk}} \left(\frac{p(\omega)}{z(\omega)^{\alpha_k^v}} \right)^{1-\sigma} d\omega \right]^{\frac{1}{1-\sigma}}. \quad (22)$$

K is the number of countries, not necessarily limited to 2. α_k^v measures the importance of quality for consumers in country k and α_k^v is a function of utility of a worker of type v in country k , Q_k^v :

$$\alpha_k^v = 1 + \lambda \ln Q_k^v. \quad (23)$$

The expenditure function differs across the two types of workers, since the importance of quality for consumers is a function of utility. Demand $q_{lk}(\omega)$ is the sum of demands of the two types of workers and follows from the expenditure function in (21) and (22):

19 Scope for quality differentiation implies that, in our model, larger relative skill abundance and thus relatively lower skilled wages lead to higher prices. This in contrast to the standard Heckscher–Ohlin factor abundance model, where larger skill abundance and thus lower skilled wages lead to lower prices.

$$q_{lk}(\omega) = \sum_{v=s,u} q_{lk}^v(\omega) = p_{lk}(\omega)^{-\sigma} \sum_{v=s,u} z_{lk}(\omega) \alpha_k^{v(\sigma-1)} (P_{lk}^v)^{\sigma-\varepsilon} (P_k^v)^\varepsilon Q_k^v. \quad (24)$$

Price p_{lk} and quality z_{lk} are the same for the two types of workers, since we assume that the fixed costs involved in developing a new variety are sufficiently large to make it unprofitable to sell the different types of workers goods with different quality levels.

The second extension to the baseline model consists of the inclusion of both iceberg trade costs τ_{kl} and per unit trade costs T_{kl} . Per unit trade costs will generate a Washington apples effect that exported goods are of higher quality. The expression for total costs of a firm from country k becomes:

$$C_k(z_{kk}, z_{kl}, w_k^s, w_k^u) = \sum_{l=1}^K \left(\tau_{kl} \left(z_{kl}^{\frac{1}{\theta}} \frac{CB_{kl}}{\varphi_k} + T_{kl} \right) q_{kl} + \frac{CB_{kl}}{\varphi_k} f_{kl} \right). \quad (25)$$

Following Feenstra and Romalis (2014), iceberg trade costs are paid over costs inclusive of per unit trade costs. φ_k is a country-level productivity measure, transforming the number of skilled S_k and unskilled workers U_k into the effective number of skilled and unskilled workers, respectively \tilde{S}_k and \tilde{U}_k :

$$\tilde{S}_k = \varphi_k S_k; \quad \tilde{U}_k = \varphi_k U_k. \quad (26)$$

The productivity term φ_k is introduced to be able to calibrate income per capita to a desired level.

Employing the expression for CB_{kl} in equation (8) and the free entry condition, $p_{kl}q_{kl} = \frac{\sigma f_{kl} CB_{kl}}{\varphi_k}$, profit maximization generates the following markup pricing equation and first order condition for quality:²⁰

$$p_{kl} = \frac{\sigma}{\sigma-1} \tau_{kl} \left(z_{kl}^{\frac{1}{\theta}} \frac{CB_{kl}}{\varphi_k} + T_{kl} \right), \quad (27)$$

$$\sum_{v=s,u} \chi_{kl}^v \alpha_l^v \left(z_{kl}^{\frac{1}{\theta}} \frac{CB_{kl}}{\varphi_k} + T_{kl} \right) - \frac{1}{\theta} z_{kl}^{\frac{1}{\theta}} \frac{CB_{kl}}{\varphi_k} + \left(\frac{\sigma \frac{CB_{kl}}{\varphi_k} z_{kl}^{\frac{1}{\theta}} + T_{kl}}{\sigma-1} \right) \frac{\eta (z_{kl}^\eta w_k^s)^{1-\rho}}{CB_{kl}^{1-\rho}} = 0. \quad (28)$$

With the share of spending by workers of type $v=s, u$ in country l on goods from country k , χ_{kl}^v , given by:

$$\chi_{kl}^v = \frac{p_{kl} q_{kl}^v}{p_{kl} q_{kl}} = \frac{z_{kl}^{\alpha_l^v(\sigma-1)} (P_{kl}^v)^{\sigma-\varepsilon} (P_l^v)^\varepsilon Q_l^v}{\sum_{w=s,u} z_{kl}^{\alpha_l^w(\sigma-1)} (P_{kl}^w)^{\sigma-\varepsilon} (P_l^w)^\varepsilon Q_l^w}. \quad (29)$$

The first term in equation (28) is the marginal benefit of higher quality as a result of larger sales. The second term represents the direct marginal cost of higher

²⁰ Derivation in the online appendix. Because of the two income groups, we cannot work with quality-adjusted price and quantity as in Feenstra and Romalis (2014) to derive the first order condition.

quality and the third term represents the marginal cost of higher quality due to a larger required use of the more expensive skilled labour both in variable costs and fixed costs. The balance of the three terms determines the optimal level of quality.

The FOC for quality z_{kl} nests both our baseline model and the model in Romalis (2014). Setting α_j^y at 1 and T_{kl} at 0, the FOC in equation (28) will be identical to the FOC in the baseline model. Setting η at zero and thus eliminating the third term in equation (28) and equating α_j^y across the two income groups, $\alpha_j^y = \alpha_l$, leads to the same (explicit) solution for quality z_{kl} as in Feenstra and Romalis (2014), $z_{kl}^{\frac{1}{\theta}} = \frac{\theta\alpha_l T_{kl}}{1-\theta\alpha_k} \frac{\varphi_k}{CB_{kl}}$.²¹

The inclusion of the productivity shifter φ_k and per unit trade costs T_{kl} implies that the expressions for labour market equilibrium become:

$$S_k = \sum_{l=1}^K N_{kl} \left(\frac{\sigma \frac{CB_{kl}}{\varphi_k} z_{kl}^{\frac{1}{\theta}} + T_{kl}}{\frac{CB_{kl}}{\varphi_k} z_{kl}^{\frac{1}{\theta}} + T_{kl}} \right) \frac{f_{kl}}{\varphi_k} CB_{kl}^\rho (z_{kl}^\eta)^{1-\rho} (w_k^s)^{-\rho}, \quad (30)$$

$$U_k = \sum_{l=1}^K N_{kl} \left(\frac{\sigma \frac{CB_{kl}}{\varphi_k} z_{kl}^{\frac{1}{\theta}} + T_{kl}}{\frac{CB_{kl}}{\varphi_k} z_{kl}^{\frac{1}{\theta}} + T_{kl}} \right) \frac{f_{kl}}{\varphi_k} CB_{kl}^\rho \vartheta (w_k^u)^{-\rho}. \quad (31)$$

To complete the characterization of equilibrium, we need to determine the number of domestic and exporting firms in each country, respectively N_{kk} and N_{kl} , for which we use two equations. First, the expenditures to factor payments can be expressed as follows:

$$\sum_{l=1}^K N_{kl} \left(\frac{\sigma z_{kl}^{\frac{1}{\theta}} \frac{CB_{kl}}{\varphi_k} + T_{kl}}{\frac{z_{kl}^{\frac{1}{\theta}} CB_{kl}}{\varphi_k} + T_{kl}} \right) f_{kl} \frac{CB_{kl}}{\varphi_k} = w_k^u U_k + w_k^s S_k. \quad (32)$$

Second, following Venables (1994), we combine the free entry condition, the expression for the price index and the markup pricing rule to express the share of exporting firms as follows:

$$\left(\frac{N_{kk}}{N_{lk}} \right)^{\frac{\sigma-\varepsilon}{\sigma-1}} = \frac{CB_{lk}}{\varphi_l} \frac{f_{lk}}{f_{kk}} \frac{\sum_{v=s,u} z_{kk}^{\alpha_k^v(\varepsilon-1)} (P_k^v)^\varepsilon Q_k^v}{\sum_{v=s,u} z_{lk}^{\alpha_k^v(\varepsilon-1)} (P_k^v)^\varepsilon Q_k^v} \left(\frac{\tau_{lk} \left(z_{lk}^{\frac{1}{\theta}} \frac{CB_{lk}}{\varphi_l} + T_{lk} \right)}{\tau_{kk} \left(z_{kk}^{\frac{1}{\theta}} \frac{CB_{kk}}{\varphi_k} + T_{kk} \right)} \right)^{\varepsilon-1}. \quad (33)$$

21 An explicit expression for z_{kl} is indispensable to solve the model under firm heterogeneity, also when using numerics. The reason is that the free entry condition is expressed as an integral over all active firms. Feenstra and Romalis (2014) do not solve for all endogenous variables in the model and leave the free entry condition aside. Moreover, they can solve explicitly for z_{kl} as there is no role for factor abundance. To be able to solve and simulate the model, we thus have to work with identical firms.

We can now define equilibrium as follows:

DEFINITION 1 *Equilibrium in the model is defined by a tuple of vectors in all countries k for all workers v , $\{w_k^v, \alpha_k^v, Q_k^v, E_k^v, P_k^v\}$, in all pairs of countries k and l , $\{z_{kl}, CB_{kl}, N_{kl}\}$ and in all pairs of countries k and l for all workers v , $\{P_{kl}^v\}$ and is determined by the following equations in all countries k :*

1. *The expression for the cost of input bundles in equation (8) to each destination market l*
2. *The expression for expenditure in equation (21)*
3. *The expression for the price index in equation (22)*
4. *The expression for the quality elasticity with respect to utility in equation (23)*
5. *The markup pricing rule in equation (27) to each destination market l*
6. *The FOC for quality in equation (28) to each destination market l*
7. *Labour market equilibrium for skilled and unskilled workers in equations (30) and (31)*
8. *The income identity in equation (32)*
9. *The expression for the share of exporting firms in equation (33)*

4. Numerical analysis of the theoretical model

In this section, we numerically solve the extended model with multiple countries as defined in definition 1 to explore the effect of distance on the skill premium through quality specialization.²² We simulate the model with five countries with values for the exogenous variables equal to the values for the largest five countries in our empirical exercise in terms of GDP.

In the simulations, we concentrate on the FOB price, as our traded goods price data are also FOB prices. The FOB price can be expressed as a function of the CIF price as follows:

$$p_{kl}^{FOB} = \frac{p_{kl}^{cif}}{\tau_{kl}} - T_{kl}. \quad (34)$$

We start in the next subsection with a discussion of model calibration. In the following subsections, we present simulation results on the role of the extensive margin and the effect of distance on the skill premium. We close this section with robustness checks of the simulation results to variations in parameter values.

4.1. Calibration

Table 2 displays the parameter values used in the simulations with the extended model, their description and their source. Model parameters and exogenous variables are on the one hand taken from the literature and the data (section 4.1.1)

22 The GAMS code of the numerical models is available upon request.

TABLE 2
Baseline values of parameters

Parameter	Value	Description	Source
σ	6.07	Substitution elasticity between varieties on product market	Feenstra and Romalis (2014)
λ	0.021	Elasticity of taste for quality parameter with respect to income/capita	Feenstra and Romalis (2014)
θ	0.61	Elasticity of marginal costs with respect to quality	Feenstra and Romalis (2014)
κ	0.1	Elasticity of per unit trade costs wrt distance	Feenstra and Romalis (2014)
ε	1.2	Armington substitution elasticity on the product market	Feenstra et al. (2014)
ρ	1.2	Substitution elasticity between skilled and unskilled labour	Hertel et al. (2012)
f_{kk}	1	Fixed costs of production	
f_{kl}	1	Exporting fixed costs	
d_{kl}	Data	Distance between countries	Clair et al. (2004)
$\frac{S_k}{U_k}$	Data	Relative skill abundance	WDI
U_k	Data	Number of unskilled workers	WDI
φ_k	Data	Productivity	WDI
ϑ	0.14	CES-shifter low-skilled labour	Acemoglu (2003)
η	0.79	Elasticity of skilled factor intensity with respect to quality	Simulations
δ	0.05	Elasticity of ad valorem trade costs with respect to distance	Simulations

and on the other hand calibrated to match the regression results with real-world data (section 4.1.2).

4.1.1. Parameters and data from the literature

We select parameters and data from four different sources. First, for all parameters also appearing in Feenstra and Romalis (2014), we use the values estimated by these scholars. So, the substitution elasticity σ between varieties is set at 6.07; the elasticity of the taste for quality parameter with respect to income per capita, λ , is set at 0.021; the elasticity of marginal costs with respect to quality, θ , is set equal to 0.61; and the elasticity of per unit trade costs with respect to distance is equal to 0.1.

Second, for some parameters specific to our model and not appearing in Feenstra and Romalis (2014), we select values from the literature. The Armington substitution elasticity ε is taken from Feenstra et al. (2014) who come to estimates for the substitution elasticity between domestic and foreign varieties (the ‘‘macro’’ elasticity) around 1. We choose a value of 1.2 to avoid convergence problems appearing for values of ε close to 1. The substitution elasticity between factor inputs not taking into account quality changes is set at 1.2, corresponding with the median value across sectors in Hertel et al. (2012). Fixed production costs f_{kk} are set at 1. Bernard et al. (2007) work with an equally arbitrary value of 0.1 in their simulations, motivating this value with the fact that 0.1 is 5% of their value

for sunk entry costs. Given that we do not have sunk entry costs, we can choose a value of 1 for fixed costs without loss of generality. Following Bernard et al. (2007) exporter fixed costs are set equal to domestic fixed costs, so that without per unit and ad valorem trade costs selling at home and abroad would be equally attractive.

Third, values for distance d_{kl} and skill abundance $\frac{S_k}{U_k}$ are set equal to the values in the dataset used for the empirics, using data of the largest five countries in terms of GDP. Domestic distance is set equal to internal distance as reported in Clair et al. (2004). The trade literature works increasingly with positive domestic trade costs, see, for example, Ramondo et al. (2014). Fourth, the number of unskilled workers U_k and productivity φ_k are determined endogenously, imposing that income and income per capita are equal to the dataset-values used in the empirics.²³ In a similar way the CES-shifter on low-skilled labour, ϑ , was set at 0.14 in order to generate an average skill premium of 1.6, corresponding with a log skill premium of 0.47 reported in Acemoglu (2003).

4.1.2. Calibrated parameters

We calibrate the elasticity of skilled factor intensity with respect to quality, η , and the elasticity of iceberg trade costs with respect to distance, δ , such that the estimated elasticities of the FOB price with respect to skill abundance and distance employing data following from model simulations are close to the elasticities estimated with real-world data. In the simulations both distance d_{kl} and skill abundance $\frac{S_k}{U_k}$ are varied randomly three times each around their respective dataset-values $\overline{d_{kl}}$ and $\overline{\frac{S_k}{U_k}}$, using $d_{kl} = \overline{d_{kl}}(1 + \text{uniform}(-0.01, 0.01))$ and $\frac{S_k}{U_k} = (\overline{\frac{S_k}{U_k}} + \text{uniform}(-0.01, 0.01))$. For each of the nine variations the model is solved thus mimicking variation over time in these variables. Log-FOB-prices following from the simulation outcomes are then regressed on log-skill-abundance and log-distance including as in the empirical analysis combined fixed effects for each importer-loop pair. This procedure is repeated 200 times.²⁴

Table 3 displays the average estimated coefficients and standard errors of the regressions with the simulated data, setting η at 0.79 and δ at 0.05.^{25,26} The table shows that the estimated elasticities following from the model simulations are close to the empirically estimated elasticities of 0.095 and 0.094 for skill abundance and 0.116 and 0.127 for distance in respectively the linear and nonlinear specification. The average standard error shows that the coefficients are very

23 Income I_k is defined as $I_k = w_{ks}S_k + w_{ku}U_k$ and income per capita i_k as $i_k = \frac{w_{ks}S_k + w_{ku}U_k}{S_k + U_k}$.

24 In all the simulations, we check the SOC defined in the online appendix. It is satisfied for all simulations.

25 In searching for δ and η , δ was limited between 0 and 0.1, as the elasticity of ad valorem trade costs with respect to distance should be smaller than the elasticity of per unit trade costs with respect to distance to generate a Washington apples effect.

26 Both per unit and ad valorem trade costs are only a function of distance with, respectively, elasticities of $\delta = 0.05$ and $\eta = 0.1$.

TABLE 3
Estimated elasticities of FOB prices with respect to skill abundance and distance with simulated data

Variable	Average coefficient	Average standard error
Skill abundance $\frac{S_k}{U_k}$	0.0925 (0.0254)	0.00546 (0.00126)
Distance d_{kl}	0.121 (0.00759)	0.00143 (0.000332)

NOTES: The table displays the average coefficient and the average standard error of 200 importer fixed effects regressions of the FOB price on skill abundance and distance, all measured in logs. Standard errors of the 200 repetitions in parentheses.

significant and the standard errors of the simulations between brackets show that the estimated coefficients do not vary much over the different iterations.

4.2. *The role of the extensive margin*

This subsection explores the effect of the extensive margin on traded goods prices. There is selection into exporting in our model, as only a fraction of all firms export. The fraction of firms exporting is likely to exert an effect on export-quality and thus on export prices. If a larger fraction of firms exports, demand for high skilled workers will go up, since exported goods are of higher quality and thus require more high skilled workers. We evaluate the effect of the extensive margin on FOB prices with our numerical model randomly varying fixed export costs relative to fixed domestic costs. Column 1 of table 4 displays the outcomes of regressing FOB prices on the extensive margin, defined as the fraction of exporting firms relative to domestic firms, averaged over all export destinations. Skill abundance and distance are also included as regressors and the estimation is repeated 200 times. The table shows that the extensive margin has on average a small negative impact on FOB prices. Still, the standard error of the average coefficient between parentheses is large, indicating that the coefficient varies hugely over the 200 iterations. Therefore, we can conclude that the extensive margin does not have a significant impact on traded goods prices in our model. In column 2, we also examine the effect of exporting fixed costs relative to domestic fixed costs. Also this variable does not have a significant impact on traded goods prices.

4.3. *Effect of distance on the skill premium*

In this subsection, we study the effect of distance on the skill premium. There is both a supply-side and demand-side effect. Since distance has a stronger effect on per unit than on ad valorem trade costs, an increase in distance makes the Washington apples effect stronger. Therefore firms raise the quality of exported

TABLE 4
Estimated elasticities of FOB prices with respect to the extensive margin and fixed export costs

Variable	Avg. coefficient	Avg. standard error	Avg. coefficient	Avg. standard error
Skill abundance $\frac{S_k}{U_k}$	0.0922 (0.0376)	0.00562 (0.00252)	0.0930 (0.0237)	0.00528 (0.00120)
Distance d_{kl}	0.123 (0.00120)	0.00117 (0.000412)	0.122 (0.0678)	0.00138 (0.000316)
Extensive margin em_k	-0.00465 (0.0534)	0.00541 (0.00527)		
Export fixed costs $\frac{f_{kl}}{f_{kk}}$			-0.0304 (0.700)	0.401 (0.0983)

NOTES: The table displays the average coefficient and the average standard error of 200 fixed effects regressions of the FOB price on skill abundance, distance and the extensive margin, all measured in logs. The extensive margin is defined as the share of exporting firms relative to domestic firms. Export fixed costs is defined as export fixed costs divided by domestic fixed costs, both averaged over all trading partners. Standard errors of the 200 repetitions in parentheses

goods. As a result the relative demand for skilled labour rises and therefore the nominal skill premium, representing the supply-side effect. Since quality is more important for higher income high-skilled workers, the increase in quality leads to a stronger decrease in the quality adjusted price index for the high-skilled, a demand side effect. In table 5, we display the estimated elasticities of the skill premium with respect to skill abundance and average distance of each country vis-à-vis all its trading partners employing the outcomes of model simulations repeated 200 times based on the baseline parameter values. We display the average elasticity of the nominal skill premium, $\frac{w^s}{w^u}$, reflecting the supply-side effect, of the quality-adjusted price ratio, $\frac{P^u}{P^s}$, reflecting the demand-side effect, and of real skill premium, $\frac{w^s}{P^s} / \frac{w^u}{P^u}$, reflecting the overall effect. The table shows that distance has a significant, positive effect on the nominal skill premium, with an elasticity of about 0.023, which means that a doubling of distance of a country vis-à-vis all its trading partners will raise its skill premium by 1.6% ($2^{0.023} - 1$).²⁷ So, our finding provides support for the supply-side effect just described. There are two reasons for the relatively modest effect of distance on the skill premium. First, domestic quality will be adjusted downwards in response to an increase in the relative price of skilled labour. This adjustment limits the initial effect on the skill premium. Second, an increase in distance raises both per unit and ad valorem trade costs, reducing the share of production for the export market and thus reducing the share of goods with high quality.

The table also shows that the quality-adjusted price ratio of low-skilled to high-skilled rises significantly with distance, although the effect is an order smaller

27 Skill abundance has a strong negative effect on the skill premium, as expected.

TABLE 5

Estimated elasticities of skill premium with respect to skill abundance and distance with simulated data

Variable	$\frac{w^s}{w^u}$	SE	$\frac{p^u}{p^s}$	SE	$\frac{w^s}{p^s} / \frac{w^u}{p^u}$	SE
Skill abundance $\frac{S_k}{U_k}$	-0.797 (0.00318)	0.00507 (0.000508)	0.000873 (0.0000114)	0.000437 (0.0000112)	-0.797 (0.00300)	0.00507 (0.000575)
Distance d_{kl}	0.0233 (0.0100)	0.00506 (0.000571)	0.0000362 (0.0000146)	0.0000114 (0.0000112)	0.0234 (0.0100)	0.00505 (0.000571)

NOTES: The table displays the average coefficient and the average standard error of 200 regressions of the nominal skill premium $\frac{w^s}{w^u}$ and the price ratio $\frac{p^u}{p^s}$ on skill abundance and average distance of each country vis-à-vis all its trading partners, all measured in logs. Standard errors of the 200 repetitions in parentheses.

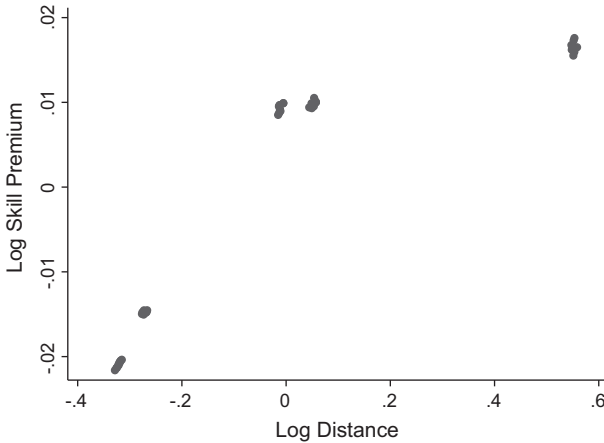


FIGURE 1 Partial scatter plot of skill premium on distance

than the supply-side effect on the nominal skill premium. This finding provides support for the demand-side effect: a larger distance raises the Washington apples effect, which in turn raises quality benefiting high-skilled workers more than low-skilled workers. The elasticity of the real skill premium with respect to distance in column 5 is the sum of the elasticities of the nominal skill premium and the price ratio.

Figure 1 shows the partial scatter plot of the skill premium on distance (both measured in logs) following from the partial regression of the skill premium on distance with skill abundance as control variable and importer-repetition fixed effects. The figure shows five sets of scattered points corresponding with observations in the five different countries. The scatter plot shows clearly that there is a positive relation in the model between distance and the skill premium.

A reduction of ad valorem trade costs works in the model like an increase in distance, as the elasticity of ad valorem trade costs with respect to distance

is smaller than the elasticity of per unit trade costs with respect to distance. So with lower ad valorem trade costs the Washington apples effect becomes stronger raising the skill premium. We summarize the above discussion as follows:

OBSERVATION 1 In the model with per unit and ad valorem trade costs and demand for quality varying with income, a reduction in distance raises the real skill premium through a strengthening of the Washington apples effect.

We perform two additional exercises to get more insight into the effect of trade costs and distance on the skill premium. First, we compare the average skill premium in all countries in a situation with actual distance between trading partners and a situation with distance between trading partners set equal to average domestic distance of the five countries. This exercise thus shows what the effect is of neutralizing distance between all trading partners. Increasing distance between trading partners from the domestic level to the actual level leads as expected to an increase in the average skill premium in all countries from 1.31 to 1.66 and the difference is highly significant. Increasing distance for sales in other countries raises the quality of goods sold because of the Washington apples effect and this drives up the relative demand for skilled workers.

Second, we simulate the model two times, first switching off the supply-side mechanism and then the demand-side mechanism by first setting η at zero and then setting λ at zero. The Washington apples effect creates an effect of distance both through the demand-side as a result of non-homothetic preferences with higher income agents demanding higher quality goods and through the supply-side as a result of non-homothetic technology with quality being skill intensive. We thus assess the relative contribution of demand-side and supply-side forces by switching off, respectively, non-homothetic technology and non-homothetic preferences. Table 6 displays the results. The results are as expected. If we set η at zero, the effect of distance on the nominal skill premium becomes zero and the supply-side effect disappears. With η equal to zero, skill intensity of production is not related to quality and hence the increasing quality as a result of the Washington apples effect does not affect the skill premium. Instead the small demand-side effect on the price ratio remains in place. If instead we set λ at zero, the effect of distance on the price ratio becomes zero and the demand-side effect disappears. The quality-adjusted price is the same for both income groups with λ equal to zero and henceforth the Washington apples effect has no differential impact on the quality-adjusted prices of the two income groups. The supply-side effect on the nominal skill premium instead remains in place.

4.4. Robustness checks

To check the robustness of our simulations, we evaluate the effect of variation in the parameters σ , λ , θ , κ , ε , f_{kl} , f_{kl}/f_{kk} , η and δ on the estimated elasticities of both FOB prices and the skill premium with respect to distance and skill abundance. We vary these parameters one at a time. Table 7 shows how the elasticities vary with the parameter values. The second column shows the minimum and maximum

TABLE 6

Estimated elasticities of skill premium with respect to skill abundance and distance with simulated data with $\eta=0$ and $\lambda=0$

Variable	$\frac{w^s}{w^u}$	SE	$\frac{p^u}{p^s}$	SE	$\frac{w^s}{p^s} / \frac{w^u}{p^u}$	SE
$\eta=0$						
Skill abundance $\frac{S_k}{U_k}$	-0.833 (2.44e-06)	5.42e-07 (3.04e-06)	-4.51e-06 (0.000148)	0.0000113 (3.51e-07)	-0.833 (0.000148)	0.0000116 (2.05e-06)
Distance d_{kl}	9.05e-07 (5.42e-06)	5.39e-07 (3.02e-06)	0.0000943 (1.14e-06)	0.0000112 (3.57e-07)	0.0000953 (5.65e-06)	0.0000116 (2.04e-06)
$\lambda=0$						
Skill abundance $\frac{S_k}{U_k}$	-0.797 (0.00440)	0.00521 (0.000744)	6.90e-14 (4.88e-13)	8.46e-14 (5.98e-13)	-0.797 (0.00440)	0.00521 (0.000744)
Distance d_{kl}	0.0238 (0.00914)	0.00519 (0.000741)	-1.51e-13 (1.07e-12)	8.44e-14 (5.97e-13)	0.0238 (0.00914)	0.00519 (0.000741)

NOTES: The table displays the average coefficient and the average standard error of 50 regressions of the nominal skill premium $\frac{w^s}{w^u}$ and the price ratio $\frac{p^u}{p^s}$ on skill abundance and average distance of each country vis-à-vis all its trading partners, all measured in logs, for, respectively, $\eta=0$ and $\lambda=0$. Standard errors of the 50 repetitions in parentheses.

TABLE 7

Simulated elasticities of the traded goods price with respect to distance, skill abundance and exporter GDP per capita and of the skill premium with respect to distance

Parameter	Parameter values			Elasticity p_x wrt S/U		Elasticity p_x wrt distance		Elasticity w_s/w_u wrt distance	
	Min.	Base	Max.	Min.	Max.	Min.	Max.	Min.	Max.
σ	3.05	6.07	6.2	0.0258	0.0925	0.121	0.141	0.0208	0.0233
λ	0.01	0.021	0.05	0.0864	0.0979	0.121	0.124	0.0231	0.0259
θ	0.4	0.61	0.7	0.0212	0.122	0.119	0.136	0.0140	0.0257
κ	0.05	0.1	0.25	0.0641	0.123	0.0871	0.265	0.0199	0.0255
ε	1.2	1.2	1.8	0.0647	0.089	0.123	0.138	0.0232	0.0301
f_{kl}	0.5	1	2.5	0.0765	0.0925	0.121	0.127	0.0233	0.0246
$\frac{f_{kl}}{f_{kk}}$	1	1	2.25	0.0876	0.0954	0.121	0.123	0.0234	0.0220
η	0.6	0.8	1.4	0.112	0.643	0.117	0.121	0.0233	0.0337
δ	0.01	0.05	0.05	0.0671	0.0925	0.0943	0.124	0.0227	0.0241

value of the different parameters in the robustness checks and for comparison the baseline value. The next two columns show the elasticities of the FOB price with respect to distance and skill abundance corresponding with the maximum and minimum parameter values. The last column displays the elasticities of the real skill premium with respect to distance for the minimum and maximum parameter values. The reported elasticities are averages based upon 50 repetitions with the reported parameter values.

We can make the following five observations on the robustness exercises. First, signs of the three elasticities of the export price with respect to skill abundance and distance and of the elasticity of the skill premium with respect to distance always stay the same. Second, the parameters λ , $\frac{f_{kl}}{f_{kk}}$ and f_{kl} have only a relatively small impact on the elasticities. So, although the level of fixed costs was set

somewhat arbitrary this has almost no effect on the model outcomes. Third, the elasticity of the skill premium with respect to distance, reported in the last columns of 7, always stays positive but also relatively small.²⁸ Fourth, the effect of the substitution elasticity σ on the elasticity of the export price with respect to skill abundance is positive but small. The sign of this interaction effect is hence opposite to what we find in the empirics, but like in the empirics where the effect is non-significant, the effect is small. Fifth and finally, the parameters with a relatively strong impact on the elasticity of the export price with respect to skill abundance are θ and η . We interpret the influence of these parameters on the elasticities as follows. θ is an inverse measure of the marginal cost to produce quality. So, at a small θ it is expensive to produce high-quality goods and henceforth a cost advantage to produce high-quality goods because of a relative abundance of skilled workers will hardly lead to higher quality goods. A similar intuition holds for the effect of η on the elasticity of the export price with respect to skill abundance, which rises with η .

5. Concluding remarks

In this paper, we put forward a theoretical mechanism to explain the finding in Schott (2004) that more skill abundant countries export higher quality, higher priced goods. Factor input bundles are non-homothetic with higher quality goods requiring relatively more skilled workers. This implies that in skill abundant countries firms have an incentive to produce higher quality goods. With marginal costs rising in quality, higher quality goods also have higher prices. We incorporated this mechanism in a monopolistic competition model of trade adding a role for distance and importer GDP per capita in the determination of traded goods prices implying a Washington apples effect. We estimated the effect of skill abundance and distance using a dataset with multiple importers and exporters containing export unit values as proxy for export prices. We found, as expected, that traded goods prices rise in the two mentioned variables and used the estimated elasticities to calibrate the parameters of the model. Simulating the impact of changes in distance, we found an effect of distance on the skill premium in our model. Countries at a larger distance from their trading partners display a stronger Washington apples effect, raising the quality of goods sold and bought. Because of the skill intensity of high-quality goods this raises the nominal skill premium (a supply-side effect) and because of the non-homotheticity of demand this also reduces the relative quality-adjusted price level of high-income, high-skilled workers (a demand-side effect).

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28 Although not reported, the elasticity of the skill premium with respect to skill abundance hardly varies with parameters values. For the parameter variations explored it oscillates between -0.816 and -0.776 .

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