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# **The gravity of cross-border R&D expenditure**

by

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**Abstract:**

While up to the 1990s, R&D was still ‘an important case of non-globalization’ (Patel and Pavitt, 1991), the internationalization of business R&D activities has accelerated significantly during the last two decades. R&D activities of foreign affiliates have become one of the most dynamic elements of the process of globalization. Until recently, the main recipients of cross-border R&D expenditure were developed countries, though new players have emerged lately, particularly in Asia. Against that backdrop, the paper applies a recently compiled novel data set on R&D expenditure of foreign-owned firms in the manufacturing sectors of a set of OECD countries and identifies specific home and host country characteristics that are conducive or obstructive to cross-border R&D expenditure of foreign affiliates. Results point at the pivotal role of market size, cultural, physical and technological proximity for R&D efforts of foreign-owned firms. Moreover, the analysis demonstrates that sufficient human capital and strong indigenous technological capabilities in the host country tend to be conducive to R&D activities of foreign affiliates. On the contrary, a rich human capital base in the home country is obstructive to the process of R&D internationalization. Geographic distance turns out to be a strong deterrent.

*JEL code:* F23, O32, L6

*Key words:* internationalization of R&D, multinational firms, gravity model

## 1. Introduction

Firms not only produce or sell their products and services abroad, but increasingly also conduct research and development (R&D) at locations outside their home countries – a phenomenon referred to as the ‘internationalization of business R&D’ (Narula and Zanfei, 2005; OECD, 2008b; Hall, 2010). But this is more of a recent phenomenon. In their seminal paper on research and development (R&D) in large multinational enterprises, Patel and Pavitt (1991, p 17) concluded that the production of technology remained ‘far from globalized’, but was concentrated in the home countries of enterprises. Hence in the 1990s, R&D was still ‘an important case of non-globalization’ (Patel and Pavitt, 1991, p 17). However, during the last two decades, the internationalization of business R&D activities has accelerated strikingly. Specifically, as highlighted by the OECD (2008a), between 1995 and 2003, R&D expenditure of foreign affiliates increased twice as rapidly as their turnover or their host countries’ aggregate imports. This renders R&D activities of foreign affiliates one of the most dynamic elements of the process of globalization. However, until recently, the main actors and recipients of cross-border R&D expenditure were developed countries. Lately, some new players emerged, giving rise to new patterns of R&D internationalization. Especially in Asia, emerging economies gained importance as host countries of R&D internationalization activities but developing countries also increasingly engaged in outward R&D activities. Despite these developments, the largest part of international R&D still takes place between the triad area, comprising the US, the EU and Japan (OECD, 2008b).

As such, the internationalization of R&D is a surprising development. The international economics as well as the international business literature long regarded R&D and the accumulation of knowledge by companies as activities that are bound to the home countries of multinational firms. Theories of the multinational firm following Hymer’s (1976 [1960]) seminal contribution stress that the international expansion of R&D is a means to exploit existing intangible assets and knowledge capital of the firm (Dunning, 1988; Markusen, 2002; Helpman, 2006; Forsgren, 2008).

In addition, host countries can profit considerably from the presence of R&D intensive foreign-owned firms: R&D expenditure of foreign-owned firms may increase aggregate R&D and innovation expenditure of the country or may give rise to substantial information and knowledge spillovers (Blomström and Kokko, 2003), foreign-owned firms may boost the demand for skilled personnel including R&D staff or, R&D efforts and the presence of foreign-owned firms may lead to structural change and agglomeration effects (Young et al., 1994). Hence, attracting these firms has been high on the political agenda.

The ensuing analysis investigates determinants of the process of internationalization of R&D. It uses a novel and unique database of bilateral business R&D expenditure of foreign affiliates in the manufacturing sector of selected OECD countries for the period from 2001 to 2007. Given the type and quality of the data, the analysis contributes greatly to the ongoing discussion as to key determinants of the process of R&D internationalization as previous data-related shortcomings are remedied. Specifically, since the analysis uses R&D expenditure-based data instead of patent data, some of the potential biases and limitations patent data suffer from are bypassed and avoided (Cohen et al., 2000; Hinze and Schmoch, 2004; Nagaoka et al., 2010). Methodologically, an extended gravity approach is taken which helps shed light on the roles of standard gravitational forces like market size, distance, cultural or physical proximity for the internationalization of R&D, extended to include additional technology and innovation related drivers of R&D internationalization.

The results highlight the essential roles market size, cultural, physical and technological proximity play for the process of R&D internationalization. Moreover, it finds evidence that additional scientific or technological capabilities matter strongly: abundant human capital in the host country is conducive to R&D activities of foreign-owned firms, while a lack of human capital in the home country appears to encourage the relocation of innovative activities abroad. Similarly, strong and internationally competitive R&D capabilities in the host country turn out to be conducive to R&D efforts of foreign-owned firms. They can exploit these capabilities for own research activities. Finally, the analysis finds that R&D expenditure of foreign-owned firms is regionally decentralized and not concentrated within the EU.

The remainder of the paper is structured as follows. Section 2 presents related literature and previous empirical evidence on important determinants of cross-border inventive activities while Section 3 discusses the data used in the analysis and provides some general patterns of R&D internationalization. Furthermore, some hypotheses are formulated that will be tested empirically. The econometric specifications tested are outlined in Section 4 while Section 5 presents and discusses the results. Finally, Section 6 concludes.

## **2. Related literature**

In the empirical literature, gravity models are popular and well known for their success in explaining international trade flows (see Anderson, 1979 or Deardorff, 1984 for a theoretical discussion and Breuss and Egger, 1999 or Helpman et al., 2008 for some empirical results). In essence, the gravity equation for trade says that trade flows between two countries are proportional to the two country's size (as proxied by GDP) but inversely related to the distance between them. Moreover, these models also often account for physical or cultural proximity in terms of shared border, common language or colonial history, respectively. Increasingly, gravity models are also used to explain FDI flows (Brainard, 1997; Jeon and Stone, 1999 or Bergstrand and Egger, 2007), migration flows (Lewer and Van den Berg, 2008) or flows of workers' remittances (Lueth and Ruiz Arranz, 2006) between countries. More recently, gravity models also found their way into the analysis of cross-border inventive activities (see, for example Guellec and van Pottelsberghe de la Potterie, 2001; Dachs and Pyka, 2010 or Castellani et al., 2011).

Generally, an ever growing body of empirical literature consistently points at the pivotal role played by economic size of countries in fostering cross-border flows of goods, capital or people. Similarly, size also matters for cross-border R&D activities. Specifically, foreign-owned firms may have to adapt their products and production processes to suit local demand patterns, consumer preferences or to comply with legal regulations and laws. In view of that, these firms may find it easier to cover their cost of adaptive R&D in larger markets with higher demand for their goods and services, better sales prospects and consequently larger revenues. In the same way, foreign-owned firms may develop new products or processes from scratch. As highly uncertain and risky activities, innovative activities gobble up immense resources that can easier and faster be recovered on larger markets with more promising market potentials. Dachs and Pyka (2010) use EPO patents for the period 2000 to 2005 to identify essential determinants of cross-border patents. They show that cross-border patenting activities are significantly higher if both home and host economies are larger.

In addition, the negative relationship between distance and any bilateral flows of either goods, capital or people is one of the most robust findings in the rich strand of literature

emerging from the gravity model tradition. Traditionally, as emphasized by Tinbergen (1962), distance is interpreted as a proxy for transportation costs or an index of uncertainty and information costs firms have to shoulder when penetrating foreign markets. In the case of overseas R&D, these costs include additional costs of coordinating geographically dispersed R&D activities, the costs of transferring knowledge over distance, and a loss of economies of scale and scope when R&D becomes more decentralized (Sanna-Randaccio and Veugelers, 2007; Gersbach and Schmutzler, 2011). Related evidence is provided by Castellani et al. (2011) who throw light on the specific role of distance for cross-border R&D FDI relative to manufacturing investments. They emphasize that once social, cultural and institutional factors like shared language and religion or membership in the same regional trade agreement are accounted for, the location of R&D labs abroad is independent of geographic distance and therefore equally likely to be found close by or farther away. This is taken as conclusive evidence for the limited role of transportation costs but the pivotal role of uncertainty and prevailing informational barriers and costs in deterring cross-border R&D FDI. In contrast, however, geographic distance remains an important determinant for manufacturing or other types of FDI.

Supportive evidence also emerges for the importance of both cultural and physical proximity between countries for cross-border flows and activities, as typically proxied by common language or common borders, respectively. In particular, lower cultural barriers between culturally similar countries as well as closer geographic proximity between countries facilitate the flow of goods, capital or people across borders. Strong cultural ties between countries ease communication and the exchange of information and knowledge across borders, rendering cross-border flows and activities easier and less costly. Physical proximity reduces transportation costs or travel expenses and therefore further enhances cross-border flows. Various authors in the international management literature stress that foreign-owned firms have to master and overcome additional institutional and cultural barriers, a disadvantage that is known as the 'liability of foreignness' (Zaheer, 1995; Eden and Miller, 2004). This concept captures foreign-owned firms' lack of market knowledge and understanding of customer demand but also their lower degree of embeddedness in informal networks in their host countries, decisive elements for foreign-owned firms when devising innovation strategies in terms of whether and how to develop new or adapt existing products and/or processes to local preferences and what resources to allot to these innovative activities. Supportive empirical evidence is provided by Guellec and van Pottelsberghe de la Potterie (2001) who use patent data for 29 OECD member countries to explain prevailing patterns of cross-border ownership of inventions as well as of research cooperation in the mid-1980s and the mid-1990s. They stress that both cross-border ownership of patent inventions and joint patent inventions are more widespread among countries that share common borders. Moreover, Guellec and van Pottelsberghe de la Potterie (2001) and Dachs and Pyka (2010) also demonstrate that cross-border patenting and co-operation is significantly stronger among culturally similar countries.

In addition to these core elements included in traditional gravity models, additional factors are found which help explain observable patterns of cross-border inventive activities. In that respect, technological proximity which captures similarities in technological specialization across countries is found to be conducive to cross-border ownership of patent inventions and joint patent inventions (Guellec and van Pottelsberghe de la Potterie, 2001).

Similarly, stronger R&D efforts in terms of higher R&D intensities in both home and host countries foster the internationalization of R&D (Dachs and Pyka, 2010). Moreover, effects

are found to differ across countries as the technological strength of the home country appears to exert a stronger push effect than the technological strength of the host country.

In light of the growing importance of strong IPR protection mechanisms for the location decision of innovative activities of MNCs (see e.g. Thursby and Thursby, 2006), Dachs and Pyka (2010) emphasize that strong IPR mechanisms also matter for cross-border patenting. As such, they highlight that systematic policies aimed at the strengthening of prevailing IPR mechanisms help render cross-border patenting activities more attractive activities.

Finally, empirical evidence also points at the regional concentration or scientific integration of cross-border inventive activities. As such, cross-border patenting is higher among EU-15 countries (Dachs and Pyka, 2010), while probably due to the shared history and broad cultural similarities, cross-border ownership of inventions as well as of research co-operation was stronger among Nordic countries (Guellec and van Pottelsberghe de la Potterie, 2001).

### 3. Data and descriptive statistics

The ensuing analysis is based on a recently compiled database of bilateral business R&D expenditure of foreign affiliates in the manufacturing sector of selected OECD countries.<sup>1</sup> Data on bilateral business R&D expenditure of foreign affiliates cover the period from 2001 to 2007 and were collected from national sources and compiled by the Austrian Institute of Technology (AIT) and the Vienna Institute for International Economic Studies (wiiw) in 2011.<sup>2</sup> This data set was complemented by additional data from different sources: standard gravity indicators like distance ( $DIST_{ij}$ ), common language ( $COMLANG_{ij}$ ) or common boarder ( $COMBORD_{ij}$ ) are taken from databases created by CEPII. Information on real GDP, tertiary school enrolment rates, high-technology exports and patent applications of resident and non-residents and total populations in country  $i$  and  $j$  come from the World Bank's *World Development Indicators* (WDI). Finally, information on the technology distance between country  $i$  and  $j$  was calculated with patent data provided by the EPO PATSTAT database. It is designed as a matrix of correlation coefficients such that the technology distance proxy increases with a decreasing technological distance between two countries.

Descriptive statistics of all variables used in the estimations are provided in Table 4 and Table 5 in the Appendix. On average, between 2001 and 2007, a recipient country in the sample received about 98 million euro per year and per partner country. However, annual inward business R&D expenditure shows broad dispersion, ranging between 0 euro and 6.5 billion euro. More specifically, from 2001 to 2007, the following countries reported the highest R&D expenditure of foreign affiliates: with on average 2.7 billion euro, the USA reported the highest inward R&D expenditure, followed by Germany with on average 395 million euro, Japan with on average 346 million euro and Canada with on average 203 million euro.

Moreover, between 2001 and 2007, the USA received the highest inward R&D expenditure from Germany (with on average 4.8 billion euro), followed by the UK (with on average 4.3

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<sup>1</sup> The following OECD countries are covered: Austria (AUT), Belgium (BEL), Bulgaria (BUL) Canada (CAN), the Czech Republic (CZE), Denmark (DNK), Estonia (EST), Finland (FIN), France (FRA), Germany (GER), Greece (GRC), Hungary (HUN), Ireland (IRL), Japan (JPN), the Netherlands (NLD), Norway (NOR), Poland (POL), Portugal (PRT), Romania (ROM), Spain (ESP), the Slovak Republic (SVK), Slovenia (SVN), Sweden (SWE), Turkey (TUR), the UK (GBR) and the US (USA).

<sup>2</sup> Data was collected as part of the project "Internationalisation of business investments in R&D and analysis of their economic impact" but have been slightly revised and updated for this paper.

billion euro) and Switzerland (with on average 3.4 billion euro). Germany reported the highest inward R&D expenditure from the USA (with on average 3.4 billion euro), the Netherlands (with on average 1.7 billion euro) and France (with on average 1.3 billion euro) while Japan reported the highest inward R&D expenditure from France (with on average 2.4 billion euro), followed by the USA (with on average 493 million euro) and the Netherlands (with on average 435 million euro). Finally, between 2001 and 2007, Canada reported the highest inward R&D expenditure from the USA (with on average 1.4 billion euro), the UK (with on average 187 million euro) and Japan (with on average 82 million euro). In contrast, among all recipient countries included in the sample, inward R&D expenditure was lowest in Bulgaria with on average 7.000 euro only, followed by Latvia (with on average 19.000 euro), Estonia (with on average 400.000 euro) and Romania (with on average 700.000 euro).

Figures 1 to 4 below give a general picture of the magnitudes of R&D internationalization, identify key players (Figure 1) and attractive locations for R&D efforts of foreign affiliates (Figure 2 and Figure 3) and show the spatial structure of the network of bilateral R&D expenditure between European countries (Figure 4). As such, they reveal important phenomena and help formulate hypotheses that will be tested in the ensuing analysis.

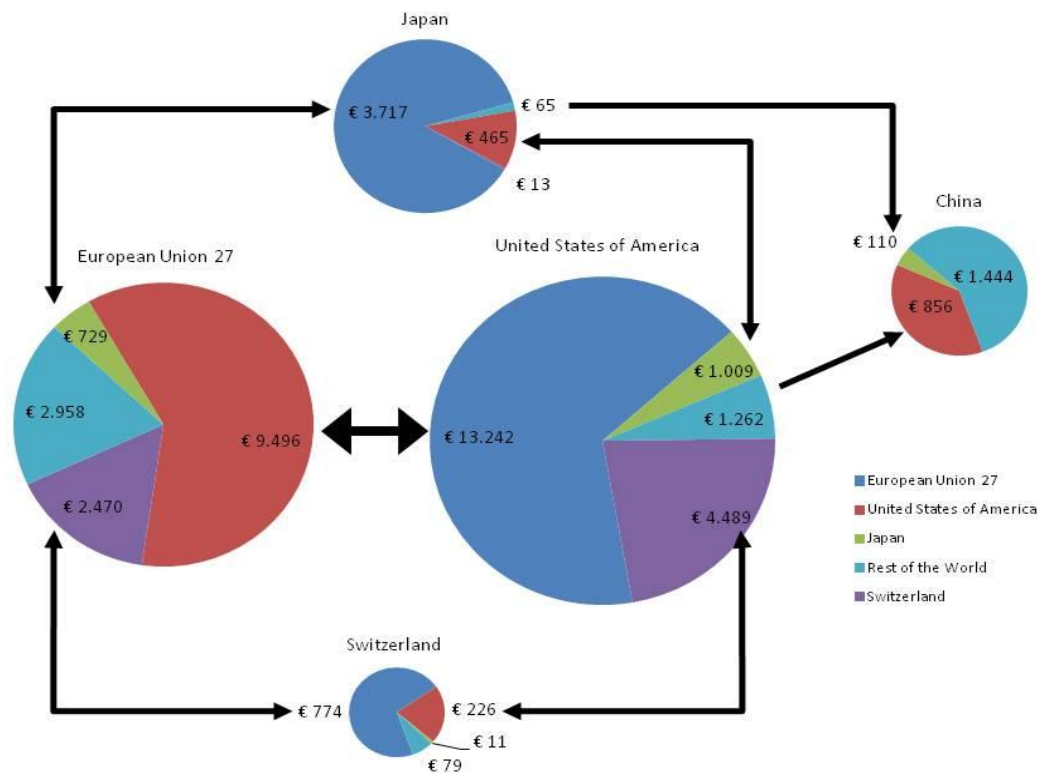
A general picture of inward R&D expenditure in the manufacturing sector by country of origin for key global players (that is the EU, the USA, Japan, China and Switzerland) is drawn in Figure 1 below. The size of each pie chart captures the total amount of inward R&D expenditure in a country, while pie slices represent the volume of inward R&D expenditure by country of origin. Arrows illustrate major R&D-based relations between countries. Figure 1 emphasizes that, as major recipients of inward R&D expenditure, both, the USA as well as the EU are the two key players in the process of internationalization of R&D. Specifically, in 2007, inward R&D expenditure of US firms in the EU and inward R&D expenditure of EU firms in the US together accounted for 2/3 of total inward R&D expenditure in manufacturing worldwide.<sup>3</sup>

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<sup>3</sup> The European Union is considered as one entity, and intra-EU relationships (for example R&D of German firms in France) are not taken into account.



**Figure 1: Inward R&D expenditure between the EU, the US, Japan, China and Switzerland: manufacturing only (2007, in Mio EUR at current prices)**



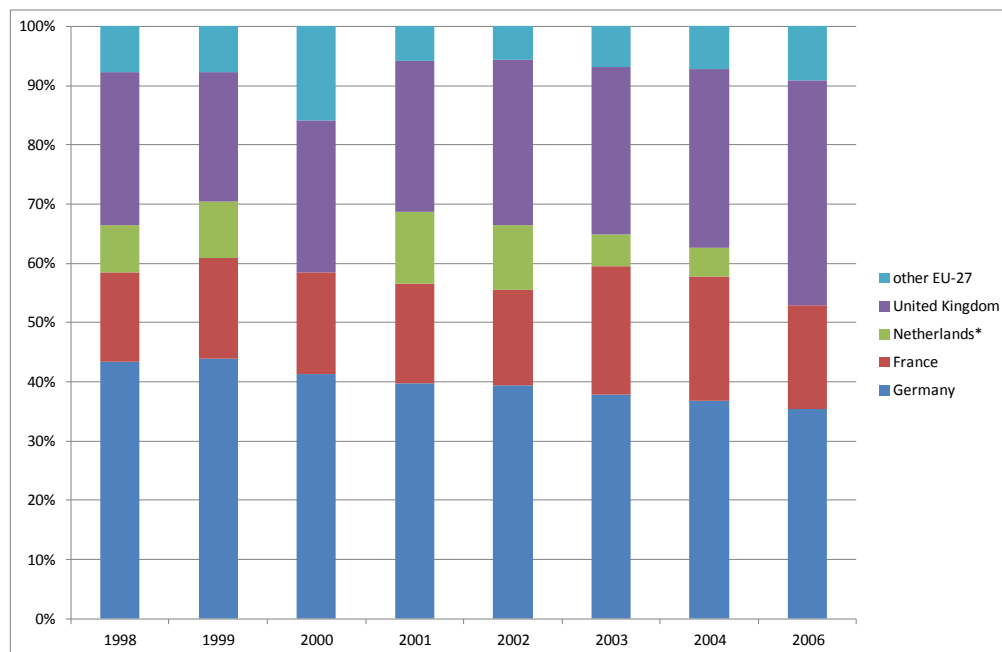
Reading note: Firms from the European Union have spent 774 Mio EUR on R&D in Switzerland in 2007; Swiss firms have spent 2,470 Mio EUR on R&D in the EU-27 in 2007. Swiss data include also the service sector; data for China is estimated based on national sources and US and Japanese outward data.

Source: OECD, Eurostat, national statistical offices, own calculations

Moreover it points at the strong mutual importance of both key players for their respective inward R&D volumes: in 2007, US firms accounted for more than 65 percent of total inward R&D expenditure in manufacturing in the EU. Similar, around 62 percent of EU inward R&D expenditure in the manufacturing sector stem from US firms located in the EU. In addition, Switzerland was the 2<sup>nd</sup> most important country of origin with around 16 percent of all inward R&D expenditure coming from Swiss firms located in the EU and around 22 percent located in the USA. In contrast, Japanese firms located either in the EU or the US accounted for a comparatively small fraction of inward R&D expenditure only.

More recently, China has emerged as a new attractive location for R&D efforts of foreign-owned firms. While Chinese data is incomplete and plagued by methodological issues which render a comparison with data from OECD countries difficult, data on R&D expenditure of wholly foreign-owned firms that operate in China suggest around 2.5 billion EUR for the year 2007.

**Figure 2: Countries of origin of EU inward BERD in the US (inward BERD from EU-27 country X in US/inward BERD from total EU-27 in US, 1998-2006)**



Note: \* included in other EU in 2000 and 2006; Total EU-27 includes all European companies except Swiss companies. No country breakdown is possible for 2005 and 2007.

Source: OECD based on US data by the US Bureau of Economic Analysis, own calculations.

Next, Figure 2 takes a closer look at R&D expenditure of foreign affiliates located in the US, by country of origin (between 1998 and 2006) and therefore identifies the importance of inward R&D efforts of single EU countries in the US.<sup>4</sup> Specifically, it depicts the simple country penetration, as the ratio of inward R&D expenditure from a specific EU country to total inward R&D expenditure from the EU in the US and points at the dominance of three EU countries only. As far back as 1998 and up to 2006, German, French and the British foreign affiliates accounted for around 80 percent of total EU inward R&D expenditure in the US. Throughout, Germany ranked first, followed by the UK and France. Only in 2006 did the UK overtake Germany as the most important investor in R&D in the US. Hence, given that the US is the world's largest economy with a huge market and attractive sales potentials, the following hypothesis can be formulated:

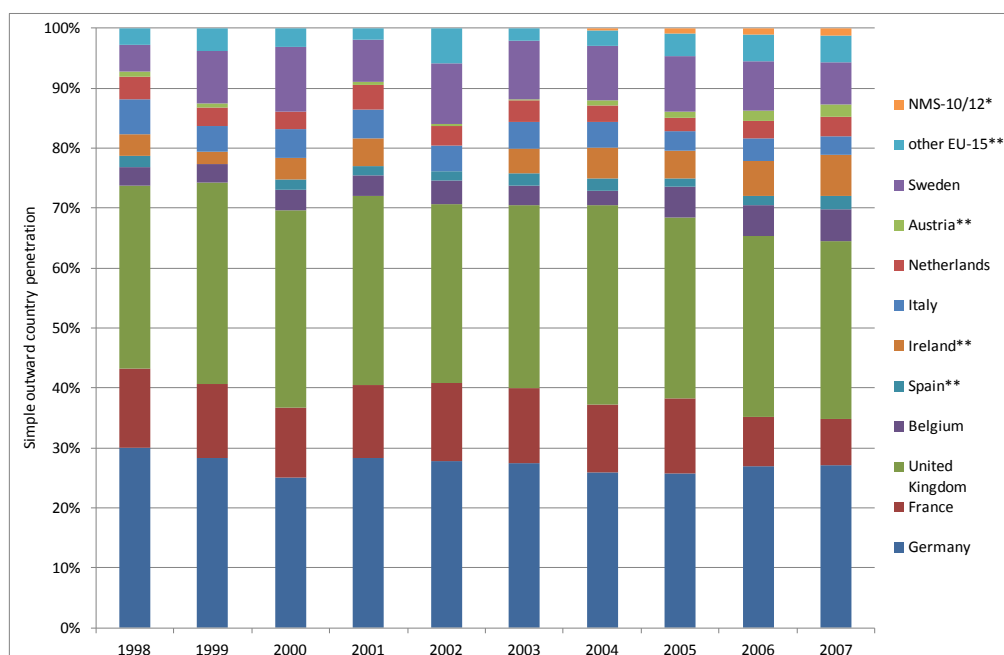
*Hypothesis 1: The size of the market is an important attractor for foreign-owned firms which need to adapt their products or processes to local conditions to meet local consumer preferences or to comply with local legal regulations and laws.*

The opposite perspective is taken in Figure 3 which depicts R&D expenditure of US foreign affiliates located in the EU, by country of destination (between 1998 and 2007) as the ratio of US outward R&D expenditure in a particular EU country to total US outward R&D expenditure in the EU. It demonstrates that throughout the period from 1998 to 2007, the UK,

<sup>4</sup> Due to lacking data on outward R&D expenditure for most EU countries, Figure 2 is based on US inward data.

Germany and France were the three most important and attractive individual EU countries for US R&D efforts, together absorbing around 70 percent of all US outward R&D expenditure in the EU. However, starting in 2005, France appears to have lost some ground while New Member States have become more attractive locations for US R&D efforts. The importance of the three largest EU economies as key locations for US R&D efforts in the EU underscores above hypothesis (H1) that *'the size of the market matters'*.

**Figure 3: Location of US inward BERD in the EU (US outward BERD in EU-27 country X/US outward BERD in total EU-27, 1999-2007)**



Note: \* NMS-10/12 comprises the Czech Republic, Estonia, Cyprus, Latvia, Lithuania, Hungary, Malta, Poland, Slovenia and Slovakia (all from 2004 to 2007) and in 2007 Bulgaria and Romania also; \*\* other EU-15 comprises Greece, Ireland (2002 only), Denmark, Luxembourg, Portugal, Finland, Austria (2000 only) and Spain (1999 only).

Source: OECD based on US outward data by the US Bureau of Economic Analysis, own calculations.

In addition, a comparison of Figures 2 and 3 shows that US inward R&D expenditure in the EU is much less concentrated in a few economies only than EU inward R&D expenditure in the US, as small and medium-sized EU economies (like Belgium, Ireland, the Netherlands or Austria) are comparatively more important locations for R&D efforts of US companies than the US is for foreign affiliates from small and medium-sized EU economies in the US.

Finally, Figure 4 zooms in on the EU and depicts the spatial structure of the network of R&D investments among European countries. The edge size (that is the link between countries) corresponds to the weighted degree centrality of a country, defined as the sum of R&D expenditure of firms from country A in country B and vice versa while the node size of each country corresponds to the sum of R&D expenditure of foreign-owned firms in the country. Nodes are located at the capital cities of each country.

**Figure 4: Inward BERD flows between European countries (2007)**



Note: the strength of lines between country A and B corresponds to the sum of R&D expenditure of firms from country A which operate in country B, and vice versa. The size of the node per country corresponds to the sum of R&D expenditure of all foreign-owned firms in the country.

Source: OECD, Eurostat, national statistical offices, own calculations.

The spatial network map for 2007 reveals a strong clustering of R&D investment in the centre of Europe while the periphery is participating to a lower degree. Moreover, Germany appears as the central hub, showing high interaction intensity, particularly with its direct neighbors the Netherlands, Switzerland, Austria or France. Similar neighborhood effects are apparent for the UK or Spain, which show particular high interaction intensity with Sweden and France or France and Belgium, respectively. In contrast, Finland has a diverse and big set of partner countries, in terms of absolute size, however, the interactions are comparatively low. Against that background, the following additional hypotheses can be formulated:

*Hypothesis 2: Geographic distance is obstructive to R&D expenditure of foreign affiliates.*

*Hypothesis 3: Neighboring countries are attractive locations for R&D efforts of foreign affiliates.*

*Hypothesis 4: 'The liability of foreignness' - cultural proximity is conducive to R&D efforts of foreign affiliates as lower cultural barriers improve market knowledge and the understanding of customer needs and facilitate communication and the exchange of information and knowledge across borders.*

All in all, while New EU Member States (NMS) are in general connected to the system of R&D investment in Europe, the magnitudes are comparatively low, with the Czech Republic and Hungary showing the strongest R&D-based embeddedness. This peripheral position of NMS may mainly be due to the low number of MNCs originating from there. Interestingly, business R&D investment of NMS appears far less integrated than their public research (including universities and research institutions): Scherngell and Barber (2011) use information on international collaboration patterns in the European Framework Programmes (FPs) and demonstrate that NMS seem to be rather well integrated in pan-European research collaborations, while Figure 4 highlights that this is less so for R&D efforts in the industry sector.

#### 4. Econometric specification

Following the tradition of the gravity literature, the following econometric specifications are estimated to shed light on home and host country characteristics that drive cross-country business R&D expenditure:

$$\begin{aligned} \ln RD_{ijt} = & \lambda_t + \alpha_i + \alpha_j + \beta_1 \ln DIST_{ij} + \beta_2 COMLANG_{ij} + \beta_3 COMBORD_{ij} + \dots \\ & \dots + \beta_4 \ln GDP_{it} + \beta_5 \ln GDP_{jt} + \delta_z X_{zijt} + \varepsilon_{ijt} . \end{aligned} \quad (1)$$

And, if account is also taken of the level of economic development:

$$\begin{aligned} \ln RD_{ijt} = & \lambda_t + \alpha_i + \alpha_j + \beta_1 \ln DIST_{ij} + \beta_2 COMLANG_{ij} + \beta_3 COMBORD_{ij} + \dots \\ & \dots + \beta_4 \ln GDP_{it} + \beta_5 \ln GDP_{jt} + \beta_6 \ln \left( \frac{GDP_{it}}{POP_{it}} \right) + \beta_7 \ln \left( \frac{GDP_{jt}}{POP_{jt}} \right) + \delta_z X_{zijt} + \varepsilon_{ijt} , \end{aligned} \quad (2)$$

where  $\ln RD_{ijt}$  is the log of business R&D expenditure of foreign affiliates from country  $j$  located in the host country  $i$  at time  $t$ .

$\ln DIST_{ij}$  is the log of the geographical distance between country  $i$  and  $j$  as the simple distance between most populated cities (in km). As an index of uncertainty and information costs, R&D expenditure of foreign-owned firms is expected to decline with growing distance.

$COMLANG_{ij}$  and  $COMBORD_{ij}$  are dummies taking the value 1 if the two countries  $i$  and  $j$  share a common language or border, respectively. Both are included to capture cultural and physical proximity between country  $i$  and  $j$  and are expected to foster R&D activities of foreign-owned firms.

Furthermore,  $\ln GDP_{it}$  and  $\ln GDP_{jt}$  refer to the log of real gross domestic product in country  $i$  and  $j$ , respectively and are proxies for the economic size of countries  $i$  and  $j$ . Positive effects are expected, since given their superior market potentials and sales prospects, larger markets are more attractive and conducive to inward R&D expenditure.

Account is also taken of the role a country's level of economic development has in attracting business R&D expenditure of foreign-owned firms. As such, wealthier economies (as proxied by their respective real GDPs per capita, namely  $\ln(GDP_{it}/POP_{it})$  for country  $i$  and  $\ln(GDP_{jt}/POP_{jt})$  for country  $j$ ) may not only have a higher purchasing power, but may also be home to consumers with a more pronounced 'love for variety' (see Dixit and Stiglitz, 1977) so that foreign-owned firms which develop or produce novel products or processes consider economies with higher standards of living more attractive markets with better profit perspectives.

In addition to above standard gravity model indicators, innovation related indicators are included to throw light on their roles in driving the internationalization of R&D.  $X_{zjt}$  is a matrix of  $z$  additional innovation related variables that are expected to affect R&D expenditure of foreign affiliates to different degrees. In particular, the analysis includes gross tertiary school enrolment rates in country  $i$  and  $j$  to account for the pivotal role the quality of human capital plays for any successful R&D efforts (ENR\_TER). Specifically, empirical evidence highlights that cross-country differences in the quality and size of a skilled workforce are an important determinant of R&D internationalization: Lewin et al. (2009) show that firms relocate product development to other parts of the world if faced with a shortage of skilled science and engineering talent, while Hedge and Hicks (2008) highlight that an abundance of graduates in science and technology and strong scientific and engineering capabilities in a host country are able to attract business R&D into a host country.

Moreover, to capture a country's general level of inventiveness, the ratio of patent applications of residents to patent applications of non-residents in country  $i$  and  $j$  is included (PA\_RATIO). Specifically, more inventive host countries are attractive for foreign-owned firms seeking to harness prevailing local technology and innovation capabilities for the development of new products or processes.

R&D activities of foreign-owned firms may also crucially depend on differences in countries' abilities to develop and produce internationally competitive high-technology products. In particular, countries with strong indigenous R&D and technological capabilities tend to specialize in high-technology industries and to generate high-technology products (and services) that more easily withstand fierce competition in the global arena. Hence, a high share of high-technology exports in GDP is indicative of an internationally competitive indigenous R&D base foreign-owned firms can harness to successfully develop new products and processes or to adapt products and processes to local conditions and preferences. Therefore, high-technology exports of country  $i$  and  $j$  (defined as the share of high-technology exports that are produced with high R&D intensity in total GDP) are included to capture the quality of indigenous R&D and technological capabilities (HTX\_SH).

Additionally, cross-country differences in the levels of technological development may also affect the internationalization of R&D. Specifically, there has been a long-standing debate in the FDI literature on the existence and extent of technological spillovers from foreign direct investments with, however, lacking consensus. Some empirical studies lend support to the catching-up hypothesis put forward by Findlay (1978) and find that technological spillovers increase with a widening of the technology distance (e.g. Castellani and Zanfei, 2003 or Peri and Urban, 2006). Others suggest the opposite such that only a narrow technology distance is conducive to technological spillovers (e.g. Kokko et al., 1996 or Liu et al., 2000) as closer levels of technological development across countries renders them technologically more compatible, with sufficient absorptive capacities to benefit from each other's research efforts

and successes. Hence, the technological distance between country  $i$  and  $j$  is included, in terms of a correlation coefficient which, by construction, lies between  $[0, 1]$  (TDIS). A high value of the coefficient indicates a narrow technological distance and similar specialization patterns between two countries.

Furthermore, dummies for EU-membership are included which capture whether only country  $i$  is a member of the EU, whether country  $j$  is a member of the EU only, or whether both  $i$  and  $j$  are EU-member countries. This will show whether R&D expenditure of foreign-owned firms is higher between EU member countries or between EU and non-EU countries. Boschma (2005) refers to institutional proximity to capture that a common institutional set-up of two countries may facilitate business activities of firms abroad.

Finally, equation (1) also includes host and home country fixed effects ( $\alpha_i$  and  $\alpha_j$  for country  $i$  and  $j$ , respectively) to account for country heterogeneity and year fixed effects ( $\lambda_t$ ) to take account of common macroeconomic shocks.

## 5. Results

Results are presented in Table 1 for different econometric specifications (see equations (1) and (2)) and estimation techniques: columns (1) to (3) provide results for the basic specification (equation (1)), while columns (4) to (6) also account for the effect of the level of economic development on R&D expenditure of foreign-owned firms (equation (2)). Moreover, from a methodological point of view, columns (1) and (4) provide results for pooled OLS, columns (2) and (5) for fixed effects for receiving and sending countries and columns (3) and (6) for random effects specific for bilateral country pairs. The main shortcoming of the pooled OLS approach lies in its inability to allow for heterogeneity of host and home countries since it assumes that all countries are homogeneous. This is remedied by fixed effects (column (2)) and random effects approaches (column (3)) which explicitly account for the heterogeneity of both individual host and home countries as well as for heterogeneity of host-home-country pairs, respectively.

The analysis confirms hypothesis 2 outlined above as it finds consistent evidence for the pivotal role geographic distance between countries plays in curbing the process of R&D internationalization. Specifically, R&D expenditure of foreign-owned firms falls by between 0.3 and 0.8 percent in response to a 1 percent increase in distance between countries, where distance captures additional coordinative costs of regionally dispersed R&D activities or diseconomies of scale and scope as a result of more decentralized R&D activities.

Moreover, cultural proximity tends to be a conducive determinant of R&D expenditure of foreign affiliates. This supports the 'liability of foreignness' hypothesis formulated above: lower cultural barriers improve market knowledge and the understanding of customer needs and facilitate communication and the exchange of information and knowledge across borders. In a similar vein, in support of hypothesis 3, physical proximity also fosters the internationalization of R&D such that foreign affiliates located in neighboring countries tend to spend significantly more on R&D activities than affiliates located farther away.

As expected, the size of both home and host countries emerges as one key determinant of cross-border R&D expenditure of foreign-owned firms. In particular, a 1 percent increase in the both host and home country's market size is associated with a rise in R&D expenditure by between 0.8 and 1 percent. However, size effects slightly differ across countries and tend

to be stronger in the host country. This provides supportive evidence of the 'size matters' hypothesis.

The analysis also demonstrates that apart from size, prevailing levels of economic development matter for the scale of cross-country R&D expenditure. In particular, cross-border R&D expenditure tends to be higher in wealthier economies: a 1 percent rise in the host country's GDP per capita increases R&D expenditure of foreign-owned firms by around 0.7 to 0.8 percent while a similar 1 percent increase in the home country's GDP per capita has a slightly higher effect and is associated with an around 1 percent increase in R&D efforts of foreign-owned firms.

**Table 1: Host and home country determinants of R&D internationalization (2001-2007)**

Dep.Var.: log of R&D expenditure of foreign-owned firms from country j in country i						
Estimation technique	Pooled OLS	Country FE	Country-pair RE	Pooled OLS	Country FE	Country-pair RE
Variables	(1)	(2)	(3)	(4)	(5)	(6)
Constant	-21.499*** (18.55)	-85.323** (2.00)	-18.047*** (10.88)	-35.198*** (21.18)	-110.343** (2.13)	-31.121*** (13.25)
Log distance	-0.725*** (7.70)	-0.276*** (3.05)	-0.819*** (5.66)	-0.558*** (6.11)	-0.278*** (3.07)	-0.612*** (4.37)
Common language	0.645*** (2.72)	-0.134 (0.64)	1.159*** (3.13)	0.091 (0.39)	-0.137 (0.65)	0.585 (1.64)
Common border	0.399* (1.88)	1.346*** (7.09)	0.292 (0.83)	0.873*** (4.26)	1.352*** (7.11)	0.761** (2.26)
Log real GDP HOST	1.082*** (21.65)	0.905 (0.47)	1.041*** (13.96)	0.832*** (12.57)	-0.938 (0.13)	0.770*** (8.05)
Log real GDP HOME	0.896*** (17.54)	5.754*** (2.62)	0.841*** (11.12)	0.790*** (16.04)	9.946* (1.80)	0.748*** (10.33)
Log real GDP per capita HOST				0.666*** (4.86)	1.868 (0.29)	0.772*** (4.13)
Log real GDP per capita HOME				1.139*** (10.22)	-4.851 (0.84)	0.938*** (6.25)
Tertiary enrolment rate HOST	0.044*** (9.04)	0.011 (0.45)	0.029*** (4.61)	0.023*** (4.11)	0.009 (0.38)	0.009 (1.35)
Tertiary enrolment rate HOME	0.002 (0.43)	0.007 (0.37)	-0.005 (1.05)	-0.008** (2.11)	0.009 (0.50)	-0.011** (2.38)
Ratio patent applications residents HOST	-0.050*** (2.95)	0.009 (0.26)	-0.003 (0.18)	-0.050*** (3.12)	0.010 (0.31)	-0.003 (0.22)
Raio patent applications residents HOME	-0.081*** (4.21)	-0.050 (1.21)	-0.021 (1.17)	-0.096*** (5.25)	-0.053 (1.27)	-0.023 (1.28)
Share high-tech exports HOST	0.036* (1.80)	0.039 (0.45)	0.049** (2.06)	0.033* (1.68)	0.039 (0.46)	0.045** (1.97)
Share high-tech exports HOME	0.021 (1.19)	-0.051 (1.21)	-0.020 (1.07)	0.016 (0.96)	-0.035 (0.76)	-0.023 (1.27)
Technological distance	-0.250 (0.55)	1.388** (2.49)	-0.318 (0.47)	0.779* (1.78)	1.362** (2.43)	0.510 (0.79)
Dummy: HOST EU-member	1.031*** (3.27)		0.434 (0.87)	0.694** (2.32)		0.348 (0.74)
Dummy: HOME EU-member	1.797*** (5.60)		1.504*** (2.80)	1.610*** (5.30)		1.347*** (2.66)
Dummy: HOST and HOME EU-member	1.259*** (3.73)		0.346 (0.66)	1.270*** (3.96)		0.518 (1.05)
Year fixed effects	YES	YES	YES	YES	YES	YES
Observations	1054	1054	1054	1054	1054	1054
Adj. R <sup>2</sup>	0.587	0.779	0.580	0.631	0.779	0.624
Number of i			362			362

Note: t-statistics in parentheses, \*\*\* p<0.01, \*\* p<0.05, \* p<0.1

All regressions include time fixed effects. Estimation results in Columns (1) and (4) are based on pooled OLS, results in columns (2) and (5) use country fixed effects for both receiving and sending countries while results in columns (3) and (6) use random effects specific for bilateral country-pairs.



Moreover, light is shed on the particular roles additional innovation-related indicators play for the process of R&D internationalization. Results in Table 1 highlight that human capital emerges as a non-negligible determinant of cross-country R&D expenditure of foreign-owned firms. However, results also reveal that underlying dynamics appear to differ across specifications. Specifically, column (1) to (3) show that, in line with findings by Hedge and Hicks (2008), there is evidence that a strong human capital base in the host country attracts business R&D: a 1 percentage point increase in the host country's tertiary enrolment rate is associated with a 2.9 percent increase in R&D expenditure of foreign affiliates. In contrast, results presented in columns (4) to (6) stress that, once levels of economic development of both host and home country are also taken into account, an abundance of human capital in the home country appears to discourage R&D internationalization activities of foreign-owned firms. This is in line with findings by Lewin et al. (2009) which emphasize that firms tend to relocate product development to other parts of the world if faced with a shortage of skilled science and engineering talent at home. However, diverging results on the role of human capital for the process of R&D internationalization are not – as it may seem - contradictory but suggest that, once levels of economic development are also controlled for, the host country's endowment with human capital becomes of secondary importance while its level of development (together with its economic size) assumes the role of main driver of the process of R&D internationalization.

Similarly, there is evidence that a strong and internationally competitive indigenous R&D base in the host country is conducive to R&D expenditure of foreign-owned firms. Hence, host countries that specialize in and generate internationally competitive high-technology products are attractive R&D locations for foreign-owned firms as they possess indigenous technological capabilities foreign-owned firms can exploit for their innovative activities.

In line with results by Guellec and van Pottelsberghe de la Potterie (2001), the analysis also emphasizes that technological distance matters. In particular, R&D expenditure of foreign-owned firms appears to be higher between countries with similar technological specializations which may indicate that R&D activities of foreign-owned firms are attracted by potential spillovers in technological domains similar to their own specialization.

In contrast, no decisive role can be attributed to a country's general level of inventiveness in fostering R&D expenditure of foreign affiliates.

Finally, the analysis also demonstrates that cross-border R&D expenditure tend to be regionally dispersed across EU as well as non-EU member countries.

## **6. Summary and conclusion**

In the course of the last two decades, R&D expenditure of foreign-owned firms increased tremendously, an indication that firms increasingly conduct research and development outside their home countries. Against that backdrop, the analysis identified important determinants of this more recent process of increased R&D internationalization. It uses a novel data set on R&D expenditure of foreign-owned firms in the manufacturing sector of a set of OECD countries, spanning the period from 2001 to 2007.

Generally, the results attribute a pivotal role to geographic distance in curbing R&D expenditure of foreign-owned firms. This may be explained by the costs of R&D internationalization (like additional costs of coordinating geographically dispersed R&D

activities or of transferring knowledge over distance) which tend to noticeably increase with distance which, in turn, renders highly dispersed R&D activities more costly and consequently less attractive. Moreover, cultural proximity which facilitates communication and the exchange of knowledge as well as physical proximity which turns neighboring countries attractive R&D hubs emerge as important determinants of the process of R&D internationalization. Furthermore, as expected, economic size and wealth of host and home countries alike are key determinants which - in the light of larger markets with more favorable sales prospects as well as wealthier consumers with a stronger and more pronounced 'love for variety' - stimulate R&D efforts of foreign affiliates.

In addition, R&D efforts of foreign-owned firms also respond to additional scientific or technological capabilities. In particular, while some indication is found that a strong human capital base in the host country attracts business R&D of foreign-owned firms, there is additional evidence that an abundance of human capital in the home country tends to curtail the relocation of innovative activities to other parts of the world. Similarly, a strong and internationally competitive indigenous R&D base in the host country which foreign-owned firms can harness and exploit for their own research activities is conducive to R&D expenditure of foreign affiliates. Furthermore, R&D expenditure of foreign-owned firms is also significantly stronger among countries with similar levels of technological development, which renders technological compatibility among countries a non-negligible driver of the process of R&D internationalization. Finally, some indication is found that R&D expenditure of foreign-owned firms is regionally decentralized and not concentrated within the EU.

These results have important implications for science, technology and innovation policy. They point at areas where governments can take concerted action to render their countries more attractive for R&D activities of foreign-owned firms. These critical areas are science and education. Governments that succeed in strengthening domestic research and development capabilities and in raising tertiary enrolment rates may also succeed in attracting R&D of foreign-owned firms (Veugelers et al., 2005; OECD, 2008a; De Backer and Hatem, 2010). Governments that want to attract R&D of foreign multinational firms should focus on the economic fundamentals - provide a healthy business environment, political stability, good public infrastructure, reasonable tax rates, a stable legal system including the protection of intellectual property rights - rather than grant special incentives to foreign-owned firms willing to locate R&D in this country.

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## 7. Appendix

**Table 2: Correlation matrix for host and home country determinants of R&D internationalization**

	Log DIST	COMLANG	COMBORD	Log RGDP HOST	Log RGDP HOME	ENR_TER HOST	ENR_TER HOME	PA_RAT HOST	PA_RAT HOME	HTX_SH HOST	HTX_SH HOME	TDIST
Log DIST	1											
COMLANG	-0.096	1										
COMBORD	-0.454	0.300	1									
Log RGDP HOST	0.230	0.094	0.000	1								
Log RGDP HOME	0.308	0.096	0.001	-0.026	1							
ENR_TER HOST	0.157	-0.052	-0.061	0.197	-0.004	1						
ENR_TER HOME	-0.074	-0.053	-0.010	-0.003	0.064	0.040	1					
PA_RAT HOST	-0.048	-0.032	0.010	0.074	0.001	0.335	0.055	1				
PA_RAT HOME	-0.113	-0.032	0.030	0.000	0.087	0.052	0.414	0.042	1			
HTX_SH HOST	-0.033	0.085	-0.014	-0.144	0.005	-0.067	-0.014	-0.012	-0.011	1		
HTX_SH HOME	-0.053	0.077	0.000	0.004	-0.040	-0.010	0.034	-0.004	0.056	-0.020	1	
TDIST	-0.009	0.175	0.100	0.288	0.347	0.189	0.156	0.077	0.112	0.033	0.070	1

**Table 3: Correlation matrix for host and home country determinants of R&D internationalization – with levels of economic development**

	Log DIST	COMLANG	COMBORD	Log RGDP HOST	Log RGDP HOME	Log RGDP pc HOST	Log RGDP pc HOME	ENR_TER HOST	ENR_TER HOME	PA_RAT HOST	PA_RAT HOME	HTX_SH HOST	HTX_SH HOME	TDIST
Log DIST	1													
COMLANG	-0.096	1												
COMBORD	-0.454	0.300	1											
Log RGDP HOST	0.230	0.094	0.000	1										
Log RGDP HOME	0.308	0.096	0.001	-0.026	1									
Log RGDP pc HOST	0.133	0.138	-0.045	0.502	-0.012	1								
Log RGDP pc HOME	-0.092	0.102	0.022	-0.011	0.288	-0.015	1							
ENR_TER HOST	0.157	-0.052	-0.061	0.197	-0.004	0.256	-0.018	1						
ENR_TER HOME	-0.074	-0.053	-0.010	-0.003	0.064	-0.029	0.506	0.040	1					
PA_RAT HOST	-0.048	-0.032	0.010	0.074	0.001	0.068	-0.007	0.335	0.055	1				
PA_RAT HOME	-0.113	-0.032	0.030	0.000	0.087	-0.021	0.223	0.052	0.414	0.042	1			
HTX_SH HOST	-0.033	0.085	-0.014	-0.144	0.005	0.131	0.004	-0.067	-0.014	-0.012	-0.011	1		
HTX_SH HOME	-0.053	0.077	0.000	0.004	-0.040	0.004	0.189	-0.010	0.034	-0.004	0.056	-0.020	1	
TDIST	-0.009	0.175	0.100	0.288	0.347	0.164	0.200	0.189	0.156	0.077	0.112	0.033	0.070	1

**Table 4: Descriptive statistics**

Variable	Obs	Mean	Std. Dev.	Min	Max
Log RDij	1054	2.47	2.89	-4.61	8.78
Log distance	1054	7.34	1.09	4.09	9.32
Common language	1054	0.09	0.29	0.00	1.00
Common border	1054	0.15	0.36	0.00	1.00
Log RGDP HOST	1054	12.40	1.72	8.73	16.23
Log RGDP HOME	1054	13.03	1.56	9.04	16.23
Tertiary enrolment rate HOST	1054	60.70	13.22	24.50	93.80
Tertiary enrolment rate HOME	1054	61.28	16.55	9.94	96.10
Ratio patent applications residents HOST	1054	4.91	3.97	0.03	23.92
Ratio patent applications residents HOME	1054	4.83	3.56	0.04	28.75
Share high-tech exports HOST	1054	4.43	3.24	0.24	16.19
Share high-tech exports HOME	1054	4.83	3.59	0.14	32.76
Technological distance	1054	0.65	0.17	0.10	0.93

**Table 5: Descriptive statistics – with levels of economic development**

Variable	Obs	Mean	Std. Dev.	Min	Max
Log RDij	1054	2.47	2.89	-4.61	8.78
Log distance	1054	7.34	1.09	4.09	9.32
Common language	1054	0.09	0.29	0.00	1.00
Common border	1054	0.15	0.36	0.00	1.00
Log RGDP HOST	1054	12.40	1.72	8.73	16.23
Log RGDP HOME	1054	13.03	1.56	9.04	16.23
Log RGDP pc HOST	1054	9.51	0.75	7.46	10.62
Log RGDP pc HOME	1054	9.97	0.56	6.12	10.87
Tertiary enrolment rate HOST	1054	60.70	13.22	24.50	93.80
Tertiary enrolment rate HOME	1054	61.28	16.55	9.94	96.10
Ratio patent applications residents HOST	1054	4.91	3.97	0.03	23.92
Ratio patent applications residents HOME	1054	4.83	3.56	0.04	28.75
Share high-tech exports HOST	1054	4.43	3.24	0.24	16.19
Share high-tech exports HOME	1054	4.83	3.59	0.14	32.76
Technological distance	1054	0.65	0.17	0.10	0.93