

A SYSTEMATIC LITERATURE REVIEW ON THE RELATIONS BETWEEN “FIRM-REGION NEXUS” AND FIRM PRODUCTIVITY

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ABSTRACT

An increasing number of studies focus on the impact of firm location on firm productivity. Here, *location* refers to localised resources or externalities available to firms. These studies have become possible due to advancements in data availability at firm level and productivity estimation methods. There is a growing need to better identify the effects of localized externalities, “the firm-region nexus”, on firms that are the primary targets of many regional development policies. However, relying solely on administrative regions risks committing the ecological fallacy: attributing to all firms in a region the effects observed for a region as a whole. This article presents the state of the art as of 2025, highlighting key issues in this area of research. A total of 166 articles were selected, mainly published in the past decade. From a methodological perspective, there is no real consensus on the models utilised, whether to estimate productivity or to investigate the relationships between “firm-region nexus” and firm productivity. Spatial integration is still not adequately taken into account: (a) Total Factor Productivity estimations do not account for spatial dependence among methodological concerns; (b) 70% of the articles do not discuss methodological issues linked to the use of firm locations. A deeper grasp of firm location, particularly the “head office bias”, emerges as critical to improving the robustness of analyses. Quantifying “firm-region nexus” remains heterogeneous according to national or local contexts (diverging points of interest, data availability...). Comparing the effects of various types of externalities across countries appears quite ambitious. Some articles focus on the effect of one category of localised externalities: the aim is to find not only a relation but the type of relation: spatial or temporal effect, linear or non-linear relations, threshold effects.

KEYWORDS :

Firm-level; Firm Productivity; Total Factor Productivity; Firm location.

JEL-Codes: D24, O47, R58, R32, R11

1. INTRODUCTION

Understanding the potential contribution of the “firm-region nexus” to the productivity of existing firms is not just a common research concern in regional sciences but also a central political issue for public authorities. The “firm-region nexus” refers to localised externalities that provide firms a local advantage.

Firms take advantage of these localised externalities. Consequently, firms are targeted by public policies that enhance the “firm-region nexus” or localised externalities. However, most existing research about the effects of this “firm-region nexus” is carried out at the aggregate statistical unit level, such as the NUTS classification in Europe. Drawing conclusions regarding regional development strategies in these studies exposes decision-makers to the ecological fallacy (Openshaw, 1984; Fortheringham & Wong, 1991; Wrigley, 1995). Since relationships seen at higher levels may not always mirror realities at individual level (in this case, firm level), the ecological fallacy is a mistake that can result in misunderstandings and poor decisions. Public policies can also benefit from individual-level research (Duranton, 2011). Indeed, firms are the target group of most public policies in regional development in order to boost socio-economic development of local communities as the ultimate beneficiaries.

The development of research on relationships between territorial resources and productivity measured at the firm level depends on four conditions: the availability of reliable accounting data, reliable information on the location of activities, robust indicators to quantify productivity, and quantification of the “firm-region nexus”.

First, access to business databases varies from country to country. The quality of, and access to, data depends on the institutions, public and private, that collect the information, the issue of data protection, and the amount of information requested from businesses. These influence the distribution of case studies around the world.

Second, it remains difficult to link the creation of added value by a firm to a specific location: account data usually are available at legal unit level, implying that added value is located at headquarters. However, headquarters are not necessarily the main place of production of added value or where a firm benefits the most of localised externalities.

Third, the productivity of a firm can be measured using various indicators. In the 1950s, the "Solow residual" was conceptualised to compare the productivity of firms regardless of differences in activities (Abramowitz, 1956; Griliches, 1996, 1998; Hulten, 2001; Nadiri, 1970; Solow, 1957; Van Beveren, 2012; Van Ark, 2014). The operationalisation of the concept, better known as Total Factor Productivity (TFP), is now widespread. The various techniques for estimating TFP seek to deal with classical biases in econometrics, including price omission bias, simultaneity bias, endogeneity of explanatory variables (capital and labour), and selection bias linked to the use of panel data (Van Beveren, 2012).

Fourth, quantifying "firm-region nexus" remains a methodological challenge due to data availability or the level of details to capture spatial variability due to, for instance, agglomeration economies. Some authors quantify agglomeration economies by proxies such as population or firm density, whereas other authors quantify agglomeration economies through sophisticated variables designed to capture different forms such as localisation, urbanisation, or competition economies.

In the 2010s, a growing number of studies sought to identify the interactions within the "firm-region nexus" and their effects on productivity measured at the firm level, seeking to integrate the aforementioned issues. This article reports on the Systematic Literature Review (SLR) implemented to identify 166 articles constituting the most exhaustive literature review possible. The SLR exploits the content of the 166 identified articles to highlight the methodological issues and to present the state of knowledge on the interactions between territorial resources and firm productivity at firm level.

The article is organised as follows. The section 2 discusses the methodology used to select and analyse the 166 articles. The third section analyses the metadata of 166 selected articles (date of publication, location of case study, authors...). The fourth section discusses three important factors in the methods used to analyse the 166 articles: the sample or statistical population studied (size and types of firms); the methods to estimate productivity and the impact of “firm-region nexus”; and the variables quantifying this “firm-region nexus”. Finally, the "discussion and conclusions" section summarises our findings by focusing on the interactions between “firm-region nexus” and the firm productivity.

2. METHOD AND DATA

This section presents the method and data collected to conduct the Systematic Literature Review (SLR). The first subsection defines the SLR and details how it was applied. The second subsection details the data collected in each article considered.

2.1. SLRs: DEFINITION AND APPLICATION

Initially, SLRs were developed and used in the life sciences. The main advantage of SLR is that it provides a comprehensive inventory of the literature. It must meet five qualities: be reproducible, transparent, objective, unbiased, and rigorous. The selection of keywords, the chosen databases, and the interpretations are all choices that must be justified by the researchers (Boell & Cecez-Kecmanovic, 2015).

The list of keywords comprises three categories that were to be represented in the selected articles (see Table 1). The first category corresponds to a clear mention (anywhere in the article) to an analysis conducted at a firm-level (and not at regional level). The second category refers to some words describing a clear mention of spatial and/or geographical dimensions. To select papers on the spatial dimension of firm productivity, these words must be in the title, abstract or keywords of each article. In the third category, an association must be made between a firm (or two main synonyms) and its productivity. This ensures that the selected articles focus on the region-firm (productivity) nexus issue. No specific period has been included in the query.

The query was conducted on December 12, 2023, using the *Scopus* search engine (see Table 1). *Scopus* is preferred over other search engines based on the two arguments made by Mongeon & Paul-Hus (2016). First, *Scopus* inventories a larger number of scientific journals, particularly in the social sciences. Second, the diversity of origins of scientific journals is broader in *Scopus* compared to other search engines like the *Web of Science*. It should be noted that *Google Scholar* was not used because it does not distinguish between peer review articles and the 'grey' literature.

[Table 1 here]

Table 1. Query formulated in Scopus for the systematic literature review.

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ALL ( "plant-level" OR "firm-level" ) AND TITLE-ABS-KEY ( ( "firm" OR "enterprise" OR "plant" ) W/5
( "productivity" OR "TFP" OR "Total factor productivity" ) ) AND TITLE-ABS-KEY ( "regional" OR
"location" OR "territorial" OR "localization" OR "agglomeration" OR "city" OR "spatial" OR "place-
based" OR "proximity" OR "spatial clustering" OR "local" OR "distance" ) AND NOT ALL ( "FDI"
AND "foreign direct investment" ) AND ( LIMIT-TO ( DOCTYPE , "ar" ) ) AND ( LIMIT-TO (
LANGUAGE , "English" ) )
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The initial query identifies 920 relevant documents. We introduced two specific codes to limit the selection of articles:

- The first limits the selection to articles (to ensure the same quality standards) published in English as scientific *lingua franca*, reducing the number of documents to 839; this may impact the location of case studies.
- The second one excludes articles mentioning Foreign Direct Investment (or its acronym FDI) because it appeared that these articles do not use the spatial or geographic dimension to analyse the firm-region nexus: either the relevant scale is national in these papers or the subnational (regional or local) scale is analysed as control variable. It reduces the number of documents to 574.

The 574 abstracts were reviewed to select relevant articles, analysing the relations between territorial resources and firm productivity. To analyse the nexus firm-region, selected articles must fulfil the following conditions:

- Be an empirical analysis, excluding purely state-of-the-art or theoretical analysis.
- Analyse primarily the territorial resources as defined above.
- Demonstrate an analysis that includes a spatial or geographic dimension (for instance, the spatial impact of an infrastructure but not the economic impact of a national or regional infrastructure program).
- Be focused on manufacturing or service firms, excluding (thanks to Scopus research engine) articles focused on agriculture, retail or tourism firms. The location of these firms is linked to other specific location factors (high streets in city, tourist attractions, geographic conditions).
- Be focused on externalities, and not on internal characteristics of firms such as type of ownership or firm level of R&D investment.
- Not have as main subject the effect of national or regional regulations in the environmental or fiscal fields.
- Not have as main subject international trade, outsourcing, and/or export ability, because the spatial dimension refers, in these cases, to national or international scales.

The reading of each abstract resulted in a selection of 216 articles. Subsequently each article was read in its entirety: a selection of 166 articles resulted. These articles contain some models explaining the firm productivity by territorial resources with or without internal characteristics. Based on the different criteria, the systematic literature review is based on these 166 articles; Appendix A includes the complete list.

2.2. COLLECTION OF DATA FROM ARTICLES INCLUDED IN THE SLR

Various information was collected for each of the 166 identified articles. The metadata collected via *Scopus* include author(s), year of publication, and journal name. Data about articles was processed based on four categories.

The first category of data refers to sample details. These details include the type of firms (for instance, manufacturing or services firms), the sample size (i.e., the number of firms analysed), and the years of observation.

The second category of data refers to location information. These details include area where firms are located, the level of accuracy of firm locations, and the inclusion of information on single or multiple establishments of firms. The level of accuracy of firm location is derived from the European NUTS typology. We define seven scales. Four scales are derived from NUTS typology for regional administrative units, from NUTS 0 (country) to NUTS 3 according to the population size of study area. Eurostat, the European Office for Statistics, offers the Local Administrative Units (LAU) to analyse local level data. It corresponds to local authorities, communes, or municipalities. We add two complementary scales: local labour market, usually defined on a scientific basis, and city without any other information provided by the paper authors.

The third category refers to the analysis of relations between variables quantifying the “firm-region nexus” and firm productivity. First, indicators of firm productivity are collected (including methods to estimate productivity). Second, models quantifying the “firm-region nexus” (including the direction of the relationship with the indicators of productivity) are analysed. Most articles include several models, between one to 15 models published per article. It is important to avoid the over-representation of results published in articles testing similar models. That is why, in these cases, models considered are either the baseline model with the most variables or several models in cases where a single model did not include all the variable categories. Based on this selection, data are collected about the statistical methods, variables quantifying the relations between “firm-region nexus” and firm productivity including the basic results (positive, negative, both, or non-significant).

Explanatory variables are collected and then classified according to an adaptation of Tsvetkova *et al.* (2020) typology. These authors have realised a large state-of-the-art of the “region-firm nexus” based on workshops and literature review within the OECD Spatial Lab. They identify twelve categories of territorial resources with a spatial dimension on firm productivity at subnational scales. These twelve categories are grouped as follows: first, agglomeration economies, including five components (localisation economies, urbanisation economies, competition economies, size and efficiency of local labour markets and global index of agglomeration economies); second, knowledge and ecosystems, including R&D, knowledge diffusion, entrepreneurship and human capital; third, finance and governance, including finance, institutions, governance and policies and regulations; fourth, infrastructure and settlement, including demography, geography and infrastructures; and fifth, local economic structure, including the effect of specific categories of firms on productivity (e.g. local share of large firms).

3. AN EMERGING FIELD OF RESEARCH IN A GROWING NUMBER OF COUNTRIES

The question of the relationship between “firm-region nexus” and firm productivity is an emerging theme, as shown by the publication dates of the 166 analysed articles. Almost all the articles were published since the 2010s (see Figure 1). Since 2019, each year has seen more than 15 articles published. Two elements support the observation that this is an emerging topic. On the one hand, no single journal has established itself as a reference for publication on the research theme. No less than 92 different journals have published articles. These journals are either specialised in specific economic themes (productivity, transport geography) or specialised in regional sciences. Six journals published more than five articles in the sample: *Regional Studies*, *Annals of Regional Science*, *Regional Science and Urban Economics*, *Journal of Urban Economics* and *Sustainability*.

[Figure 1 here]

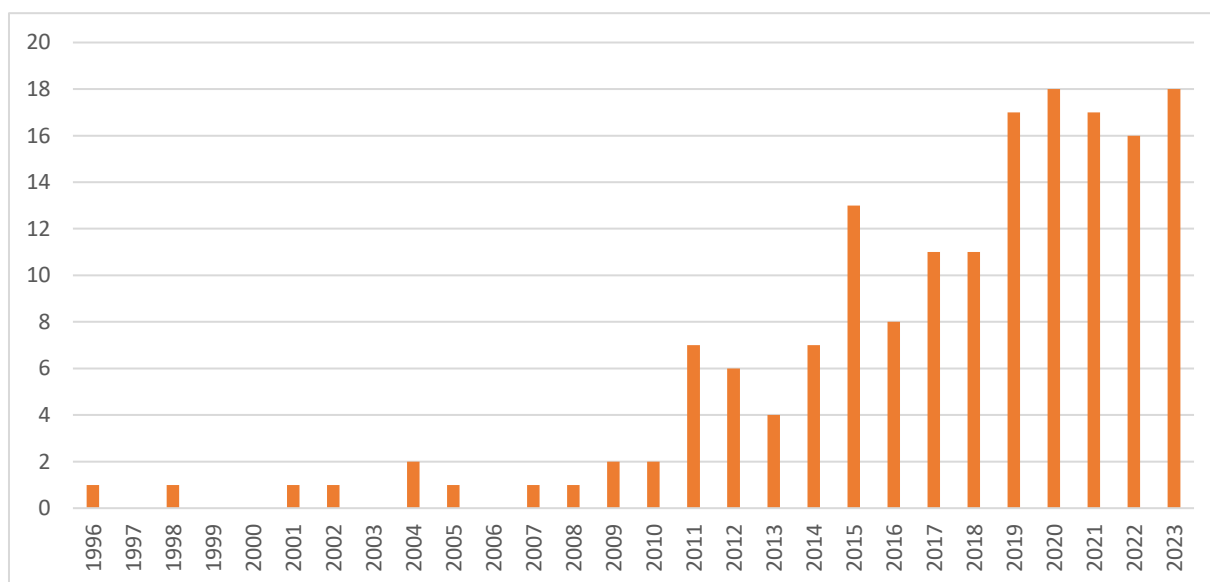


Figure 1. Number of articles identified by SLR by year of publication (Source: Scopus).

Among the 395 different authors of 166 articles, 9% have published more than one article included in this SLR. These authors have published about the same study case: sometimes about different samples of firms but always of the same country. Company databases comprise balance sheets of legal units. However, legal units' definition differs across national laws. Moreover, a firm is sometimes an association of several legal units, united by a distinctive organisational logic. The concept of firm is broader than legal unit: it remains ill-defined entity both in terms of its boundaries and its content (Maskell, 2001), due to different viewpoints.

Moreover, there are major differences across countries about available firm data: private, semi-private, or public producers of databases alongside differences between national accounting systems and various methodological choices. The lack of harmonised data across countries means it remains difficult to carry out analyses on several countries or for authors to publish on different countries. Researchers face specificities related to the accounting data collected and made available (see Siepel & Dejardin, 2020).

The Bureau Van Dijk database, including the Europe's largest firms, or some surveys conducted among firms in several African countries, allows simultaneous analyses of several countries. These two databases are used in 7 of the 166 articles. Further, 143 articles analyse a sample or a population of firms from one country, while 15 articles focus on firms from a part of a country, typically China or Italy.

The study cases are mainly located in China (40 articles) and Italy (27 articles) (see Table 2). Apart from these two special cases, 10 countries are the case studies of more than 3 articles of this SLR (7 in Europa, 2 in Asia and 1 in America). There are several hypotheses explaining this unequal repartition of study cases across the world: first, uneven regional development is a common issue in these 12 countries; second, data availability and robustness is a crucial issue to allow research; third, the spread of English as a scientific lingua franca is not the same throughout the World. For instance, 24 articles out of 40 articles about Chinese firms are based on a firm census conducted during the 2000s.

[Table 2 here]

Continents	Countries with more than 3 articles
Europa – 82 articles	Italy – 27 articles United Kingdom – 9 articles France – 6 articles Spain – 5 articles Germany and Sweden – 4 articles Belgium, Portugal, and studies on several European countries – 3 articles
Asia – 63 articles	China – 40 articles South Korea – 4 articles India and Vietnam – 3 articles
America – 9 articles	United States of America – 5 articles
Africa – 8 articles	
Oceania – 3 articles	
Intercontinental – 1 article	

Table 2. Location of study cases of the 166 articles of the SLR (Source: own elaboration).

4. HOW HAS RESEARCH BEEN CONDUCTED?

4.1. SELECTING FIRM SAMPLE OR POPULATION TO QUANTIFY PRODUCTIVITY

Most research evaluating the impact of “firm-region” nexus on firm productivity focuses on manufacturing firms (see Table 3). Most exclude some firms for several reasons: first, firm data quality remains a real issue. There are few data quality checks for firms’ databases e.g., errors, omissions, omitted relations between legal units. Second, data accuracy for the smallest firms can be weaker because they do not need to report all accounting data (with variations in what must be published depending on the country). Third, some authors focus on market-oriented firms to avoid firms with specific strategies such as public owned firms. Fourth, and finally, some authors focus their research on a specific sector.

[Table 3 here]

Sectoral focus	Without exclusion	With exclusion based on accounting data (e.g., more than x full-time equivalent, amount minimum of sales...)	With exclusion based on economic sector (e.g., without financial firms with specific accounts...)	Focus on specific group(s) of firms (e.g., sector or technology level...)	Total
None (all firms)	31	21	2	12	66

Manufacturing	32	32	17	10	91
Services			1	6	7
Total	63	53	20	28	164
No data: 2 articles					

Table 3. Firm sample or population analysed by the 166 articles of the SLR (Source: own elaboration).

Three indicators emerge from the multitude of indicators that measure firm productivity (OECD, 2020): labour productivity, wages, outputs and TFP. TFP has the advantage of allowing for comparison *all other things being equal*, but also the disadvantage of being more complex to estimate due to numerous methodological difficulties (Gal, 2013; Gordon *et al.*, 2015; OECD, 2020). TFP is the most common productivity indicator among the SLR (see Table 4).

[Table 4 here]

Indicator	Number of articles in which the indicator is used
Total Factor Productivity	105
Added value	53
Outputs	13
Wages	2
No clear information	1

Table 1. Frequency of use of each productivity indicator in SLR (Source: own elaboration).

A diversity of estimation methods is observed due to the absence of a method that simultaneously deals with all methodological issues (see Van Beveren, 2012). Some authors (19% of the 166 articles) favour statistical methods like ordinary least squares estimators (OLS), fixed effects, models including instruments, or generalised moment models (GMM) (see Table 4). OLS is used despite the lack of robustness because it remains easy to use and to interpret (Ehrl, 2013).

Other authors (55% of the 166 articles) use *ad hoc* estimation methods discussed by Van Beveren (2012). These *ad hoc* methods are the methods of Olley & Pakes (1996), Levinsohn & Petrin (2003), Akerberg *et al.* (2015), and Wooldridge (2009). These two last methods are the published version or the last version of working papers used by Van Beveren. These *ad hoc* methods account for about half of the 141 different TFP estimates identified among the 105 articles (see Table 5).

[Table 5 here]

TFP estimation method		Number of concerned articles
Ad hoc methods identified by Van Beveren (2012)	Olley & Pakes (1996)	24
	Levinsohn & Petrin (2003)	47
	Akerberg, Caves & Frazer (2015)	14
	Wooldridge (2009)	6
Estimation of TFP by generic methods	OLS	14
	Fixed effects	6
	Use of instruments	9
	GMM	3
	Specific method (with development in article)	2
	Other	10
	No information	6

Table 5. TFP estimation methods across the 166 articles (Source: personal elaboration).

The lack of consideration in econometric research for phenomena with a spatial dimension (Anselin, 2010; Tsvetkova *et al.*, 2020) is evident in the methods used to estimate TFP. However, there is a large body of work demonstrating the existence of spatial dependence between firms. In Belgium, Dhyne & Duprez (2016) show that the probability of a transaction between two firms decreases as the distance between them increases. Surprisingly, the discussion of Van Beveren (2012) on the methodological issues, does not mention spatial autocorrelation as a potential bias. This element testifies to the existence of a gap between the research conducted in general econometrics and in spatial econometrics (Anselin, 2010).

This gap is filled by three articles in our sample. First, Miccucci & di Giacinto (2009) have included a spatial lag of their explanatory variables. Their results are robust in terms of spatial autocorrelation. Second, Owoo (2016) identified spatial dependency between firm's TFP in African countries. Third, Harris *et al.* (2019) develop a model dealing with all the methodological issues, including spatial dependence.

4.2. TAKING INTO ACCOUNT THE SPATIAL DIMENSION IN DATA AND METHODS

Spatial dependence can be integrated into distinct parts of the statistical analysis: on the dependent variable, on the measure of the firm productivity (*spatial lag model*), on the explanatory variables, namely territorial resources (*spatial cross-regressive model*), or on the error term (*spatial error-model*). A community of researchers is interested in the Generalized Moment Method (GMM) to both estimate TFP and to integrate spatial dependence in the models. Indeed, GMM allows for dealing with endogeneity, whether spatial (Anselin & Rey, 2014) or production factors-related (Wooldridge, 2009). Thus, Harris *et al.* (2019) use an integrated methodology quantifying TFP, without spatial dependence bias. They use a GMM integrating spatial dependence to quantifying TFP in a one-step way. This last model seems to fill the gap identified in the previous section.

More generally, spatial analysis methods are poorly employed among the identified articles. Out of 166 articles, 73 (44%) include at least one map and/or an application of spatial analysis tools. Maps are used more frequently than spatial analysis tools. Specifically, only 8 out of 166 articles (5%) contain both at least one map and an application of spatial analysis tools.

Firms may have several establishments. The spatial association of a firm with its headquarters is a strong simplifying hypothesis, leading to major biases (Autant-Bernard *et al.*, 2011). These different establishments can all be places where value is produced, potentially benefiting from specific localised externalities. More generally, the observation made by Autant-Bernard *et al.* (2011) testifies to an insufficient consideration of the geographical complexity and sub-national variability of productivity in the scientific literature, as highlighted by, among others, Anselin (2010) and Tsvetkova *et al.* (2020).

The SLR confirms that the spatial association of a firm with its headquarters is generally the rule. It is striking and challenging that there is no methodological discussion about the quality of firm location data in 116 articles (70%). In these cases, it is assumed that the firm is located at its headquarters. Among the 40 remaining articles (30%), 28 articles (17%) include a methodological discussion about the data quality of firm location, assuming the limits of these data. As for the 22 other articles, 9 articles have created a dummy variable to distinguish firms with one-single location corresponding to the headquarters and firms with several establishments or plants. Harris & Moffat (2012) identify that multi-establishments firms have higher TFP than firms with one location because multi-establishments firms may have capabilities to benefit from localised externalities from several locations. Ten other articles select only single plant firms (9 cases) or multi-plants firms (1 specific case to analyse this population, see Okubo & Tomiura, 2012). Finally, the 3 remaining articles assume a split of firms between different plants according to the weight of each plant (by, e.g., number of employees as weight) (Boschma *et al.*, 2009; Gibbons *et al.*, 2019; Mitze & Makkonen, 2020).

5. WHAT IS THE STATE OF KNOWLEDGE ON THE RELATIONSHIP BETWEEN FIRM-REGION NEXUS AND FIRM PRODUCTIVITY?

In this section, the variables assessed by the different models are analysed following the methodology and the layout of Beaudry & Schiffauerova (2009). Results are also presented by article to avoid the over-representation of results from articles including several models (see Table 4).

BETWEEN 0.4% AND 11% OF FIRM TFP DEPENDS ON THE FIRM LOCATION

Some articles identify the proportion of TFP variability resulting from firm location. The spatial variability of firm TFP does not exceed 11% and is generally lower than the sectoral variability. It depends also on the study cases, the models, and the variables. According to Campisi *et al.* (2022), 0.4 % of firm TFP variability is only explained by the regional location, but 44% of firm TFP variability is related to the interactions between location (at regional level) and sector among Italian knowledge intensive business services. By comparison, firm TFP variability depends also on the country: intranational variability is 3.6% in France, 9.9% in Spain, and international variability is up to 15% for firms from seven European countries according to Aiello & Ricotta (2016). Between these extreme values, the magnitude of spatial variability is around 5% for firm TFP.

FEW ARTICLES FOCUS ON ALL CATEGORIES OF LOCALISED EXTERNALITIES

Most articles (92 out of 166) include a dummy variable identifying a region and/or a control variable of spatial variability. Indeed, authors do not necessarily try to understand all the spatial variability but the effect of one specific category of localised externalities. However, these variables, by capturing part of the spatial variability, are also “catch-all”, thus preventing their interpretation. The use of fixed effect to capture spatial variability is frequent. By way of illustration, some articles use this type of variable to distinguish territories with remarkably high disparities, as in Italy (Aiello *et al.*, 2014, 2015; Antonioli *et al.*, 2016; Cardamone *et al.*, 2016; Lasagni *et al.*, 2015), but also elsewhere in the world (for instance, in Africa, see Owoo & Naudé, 2017; in Great Britain, see Harris & Moffat, 2015; in Canada, see Baldwin *et al.*, 2008).

ANALYSIS OF VARIABLES QUANTIFYING THE “REGION-FIRM” NEXUS

Agglomeration economies and their components

Agglomeration economies are the most studied type of localised externalities, with 49% of tested variables among the 166 articles. Variables quantifying agglomeration economies are present in 57% of articles of this SLR. Simple indicators quantifying agglomeration economies are firm or population density, or local GDP (per capita). These global indicators are used to consider the size effect of cities or urban areas on firm productivity. These indicators allow authors to focus on other types of localised externalities. Indeed, these global indicators do not aim to understand the different categories of agglomeration economies.

Relevant articles are focused on countries with cities concentrating high productivity. In dense areas of France, the productivity advantage ranges from 4.8% for the least productive firms to 13.9% for the most productive firms (Combes *et al.*, 2012). In Belgium, a firm located in Brussels, the largest Belgian city, is 4% more productive once firm sorting and agglomeration economies integrate (Kampelmann *et al.*, 2018). In China, doubling city size implies a productivity premium for firms between 3 and 4% (Hashiguchi & Tanaka, 2015; Pan & Zhang, 2002). In United Kingdom, the intranational productivity gap between the most and least productive places is broken into two roughly equal parts: on the one hand, between London, the most productive place, and the second most productive place and, on the other hand, between this second most productive place and the least productive places (Harris & Moffat, 2022). This illustrates the difference between localised resources in London and in the rest of the country.

Among the four components of agglomeration economies, the competition dimension is the least tested, but the positive effect is the most unanimous among articles of SLR. The competition dimension is the most important source of agglomeration economies of manufacturing firms in Italy according to Cainelli, Fracasso & Marzetti (2015), but not for the case of German firms (Brunow & Blien, 2015).

The localisation and urbanisation economies are more frequently studied. The positive effect of localisation economies on firm productivity is more frequently observed than the positive effect of urbanisation economies on firm productivity. Beaudry & Schiffauerova (2009) suggest that detection of localisation and/or urbanisation economies depends on scale and sectoral aggregation. For these authors, it remains difficult to detect the right scale of aggregation and/or the right level of sectoral aggregation. Regarding the relevant scale of agglomeration economies, a threshold of 1 km has been identified for services located in cities in Spain (Coll-Martinez, 2019) and in Sweden (Andersson *et al.*, 2019): the effect of localisation economies is stronger at neighbourhood scale ($< 1\text{km}$) and urbanisation economies have an effect at city level ($> 1\text{km}$). Nevertheless, localisation economies have a positive effect beyond 1km as observed in Canada (Baldwin, Brown & Rigby, 2010) or in Italy (Cainelli & Ganau, 2018).

The positive effect of localisation and urbanisation economies reach consensus (see e.g. Beaudry & Schiffauerova, 2009), but this is not reflected by results of SLR. Non-significant or negative effects reflect methodological designs aiming to understand the effect of agglomeration economies according to firm age, firm size, technological or knowledge intensity, or other internal characteristics of firms. Each firm has a specific equilibrium between advantages and disadvantages of agglomeration economies (Lall, Shalizi, Deichmann, 2004; Badr, Rizk & Zaki, 2019; Bellofatto, Dominguez & Dwyer, 2023; Cainelli, Ganau & Iacobucci, 2016; Harris *et al.*, 2019; Martin, Mayer & Mayneris, 2011) depending on the internal capabilities to capture agglomeration economies (Spanos, 2019), the firm size (Knoben *et al.*, 2016; Ramachandran, Reddy & Sesidharan, 2020), and the cumulative effects (with other categories of localised externalities) for some firms (Fafchamps & Hamine, 2017; Di Giacinto, Micucci & Tosoni, 2020). Thus, relations between agglomeration economies and firm productivity are non-linear (Carreira & Lopes, 2018), including the threshold effect (Dai, Li & Lu, 2017) or different temporal effects (Fazio & Maltese, 2015; Martin, Mayer & Mayneris, 2011); all this exerting a selection effect on firms (Hasan *et al.*, 2018).

The quality of local labour markets is poorly addressed among the 166 articles as it remains difficult to quantify this resource. However, the local level of skilled workers (quality and quantity) is related to the firm productivity to explain difficulties of certain regions in the United Kingdom (Morris *et al.*, 2020). The quality of local matching of these skilled workers is a component of related variety advantages as observed in Denmark by Timmermans & Boschma (2004). In China, social mobility is positively linked to firm productivity (Wang & Luo, 2023).

Local economic structure

The local importance of certain types of firms influences nearby firm productivity. By contrast with agglomeration economies, this category refers to the effect of certain types on firms as a whole. Here, 27% of the articles include a variable related to this category into the tested models. A high local share of frontier firms influences TFP for all firms: a frontier firm leads to higher productivity for nearby firms (Serafinelli, 2019; Du & Vanino, 2021). A high local level of foreign direct investments influences firm productivity positively in China (Lin, Li & Yang, 2011) and in Germany (Mitze & Makkonen, 2020). In Italy, risk aversion of familial owned firms negatively influences their productivity and, as corollary, the productivity of neighbouring firms (Amato *et al.*, 2022). According to the cases, the local importance of services improves productivity of manufacturing firms (Yang, Yeh & Wang, 2018; Chen *et al.*, 2023). The industrial specialisation also positively influences firm productivity in China (Tian, Hu & Lin, 2023) and in Europe (Aiello & Ricotta, 2016).

Knowledge, innovation, human capital, and R&D

Variables in this category represent 12% of tested variables and are tested in 28% of articles.

Human capital is frequently quantified by the local share of the most highly qualified (for instance, local share of university degree). This variable positively influences firm productivity according to the SLR: more than 50% positive association between human capital and firm productivity are observed among the 166 articles. In China, increasing by one year the average number of years of study of city's population increase by 14% firm productivity (Liu, 2014). Training of workers is also a way to take the most of localisation economies as observed in France by Morin & Védrine (2022).

Beside human capital, R&D is frequently tested because data are available. Also, they usually positively influence firm productivity, but there are sometimes insignificant relations. Also, the effect of universities on neighbouring firms is not yet clear. Beneficiaries of academic activities are not well identified (Raspe & Van Oort, 2011).

Knowledge diffusion is poorly tested by comparison with the two previous sub-categories (R&D and human capital) of "firm-region" nexus. There are plenty ways to quantify knowledge diffusion from institutions like universities: between firms and between (certain types of) workers, among others. Knobon *et al.* (2016) studied the effect of face-to-face contacts in combination with internal characteristics of firms and agglomeration economies. Face-to-face contacts of a firm influence the firm capability to take benefit from agglomeration economies. Antonelli & Scellato (2013, p. 92) observed different relevant scales for contacts and benefits from proximity in terms of productivity according to sectoral proximity: "The Jacobian inter-industrial -within region- vertical knowledge interactions, the intra-industrial nationwide horizontal knowledge feedbacks, and the localized intra-industrial knowledge interactions that take place within geographical clusters".

Finally, a high local entrepreneurship dynamism, quantified by the local share of new firms, is not necessarily linked to a high firm productivity: influence of new firms is negative at the time of creation but it becomes positive several years after the initial entry (Andersson, Braunerhjelm & Thulin, 2012). However, younger firms adopt likely faster more advanced technologies than older firms, which improves their productivity (Howell, 2020).

Quality of governance and local institutions

Our analysis shows that variables quantifying the quality of local governance and institutions positively influence firm productivity. Several international institutions have developed regional index quantifying the quality of local governance or institutions such as the European Quality of Government Index (EQI) (Charron *et al.*, 2014; Charron *et al.*, 2021). These indicators are positively associated with firm productivity even if the indicators are constructed differently in respective global regions (e.g., Manozocchi, Quinteri & Santoni, 2017; Rodriguez-Pose *et al.*, 2021; Abebrese *et al.*, 2023; Hussen & Cokgezen, 2022). Besides these indexes, low levels of corruption, rapid delivery of building permits, and low local authority debts tend to positively influence firm productivity (Agostino *et al.*, 2020; Giordano *et al.*, 2020; Lasagni *et al.*, 2015; Demir *et al.*, 2015; Qi *et al.*, 2022).

Access to finance also positively influences firm productivity. A high local level of private fundings (by banks) or a high number of local banks positively influence firm productivity, as observed in Italy (Moretti, 2014; Ganau, 2016; Manzocchi, Quinteri & Santoni, 2017). A high quality of local institutions moderates the negative effect of the lack of funding by financial institutions (Rodriguez-Pose *et al.*, 2021). The results are not similar regarding public fundings (by comparison with fundings from banks), especially subsidies, leading to a sorting effect of firms (Zhu, Xu & Zheng, 2022).

Infrastructure and geography

Within this category, where numerous variables have been tested (236 variables across 74 articles), most authors seek to understand the effect of geography, infrastructure, or spatiotemporal phenomena on firm productivity.

First, some authors identified the influence of human or physical geography on firm productivity: a location in less developed regions of Mexico, United Kingdom, Belgium, or Italy implies a lower firm productivity (Deichmann *et al.*, 2004; Harris & Moffat, 2012; Kampelmann *et al.*, 2018; Di Giacinto, Micucci & Tosoni, 2020). Beyond regional disparities, the effects of spatial phenomena are also studied: (a) a firm located less than 100 miles from a site hit by a terrorist attack is less productive (Mun, Han & Kim, 2021); (b) the proximity to a border affects the productivity of Italian firms (Fantechi & Fratesi, 2023); (c) in China, firm productivity is higher in warmer areas (Xue, Zhang & Zhao, 2021) but the projected impact of climate change, including an increasing of temperature, could negatively impact the future firm productivity until -12% of output (without adaptation) (Zhang *et al.*, 2018); and (d) finally, air pollution is linked to a lower firm productivity in China (Liu, Yang & Cai, 2023).

Second, local demography affects firm productivity in several ways. Firm productivity could be improved in places (a) where immigration increases (for firms with TFP under median in France) (Mitaritonna, Orefice, & Peri, 2017); (b) with demographic diversity (e.g. nationalities) at the regional level (but not at firm level) for German firms (Trax, Branow, & Suedekum, 2015); and (c) with a younger population (di Giacinto, Micucci & Tosoni, 2020). The proximity between the firm and the entrepreneur's home influences the firm's capabilities to benefit from agglomeration economies (especially Marshall-Arrow-Romer spillovers in case of proximity between firm and residence) and the lock-in situation in Italian manufacturing firms (Stefano, Zare & Nicola, 2023).

Third, the effects of infrastructure on firm productivity are an important point of interest. New highways are linked to an increase of manufacturing firm productivity in the United Kingdom (Gibbons *et al.*, 2019), Spain (especially in more developed regions) (Holl, 2016; Holl & Mariotti, 2018), and South Korea (Lee, 2021). However, the effect of new highways on firm productivity has a decreasing marginality in China (Li, Wu & Chen, 2017; Tian, Hu, Lin, 2023). Indeed, a larger number of economic agents is accessible within the same time thanks to new highways. These infrastructures improve the agglomeration economies. The accessibility benefit decreases the more the region is already connected. Moreover, a negative effect on firm productivity is identified if the better accessibility is linked to a too small city (Lin & Huang, 2021). The same reasoning applies to high-speed lines for accessibility to cities: a decrease of time-distance by train of 1% is linked to an increase of 1.5% firm TFP (Yue & Nan, 2019), which strengthens exchanges between cities (Zhao, Xiao & Dai, 2021).

Fourth, IT infrastructure is crucial to ICT access and, *in fine*, to firm productivity. This is observed by a survey in New Zealand (Grimes, Ren & Stevens, 2012) and is linked to the quality of preexisting networks (time effect) in Italy (Cambini, Grinza & Sabatino, 2023). Zhou & Wang (2023) identify a stronger positive effect of proximity to main train stations or airports for labour-intensive, non-exporting, private and small firms.

Fifth, Special Economic Zones (SEZ) have been developed in many countries to host Foreign Direct Investments or exporting firms. These zones offer facilities in terms of land, taxes, institutions, and infrastructure depending on countries. Given that the real effect depends on national or local cases, it remains difficult to generalise about SEZs. For instance, many studies identify a selection effect (Koster *et al.*, 2019; Li, Wu & Tan, 2021), border effect (in or out the SEZ) (Zhou & Liu, 2023), and heterogeneous effects by firm categories (Howell, 2019; Hasan, Klaiber & Sheldon, 2020).

Sixth, regional path dependency impacts firm productivity. The quantification of regional path dependency depends on the scope of articles. The variables are sometimes used as instrumental variables. Many articles refer to phenomena many centuries ago. For instance, middle age climate is used as a variable to identify vulnerable regions that have set up institutions at an early stage. The early development of institutions explains current firm productivity of manufacturing in Europe (Rodriguez-Pose *et al.*, 2021). The road network of Antiquity and the Middle Ages is an instrumental variable that identifies the positive effect of highways on firm productivity (Holl, 2016; Lee, 2021). Closer in time, local literacy levels, historical population density, and/or the existence of a cadastre at the end of the 19th century are positively linked to current firm productivity (Békés & Harasztosi, 2013; Agostino *et al.*, 2020).

CONCLUDING REMARKS

The objective of this SLR is to identify and analyse articles that quantify the relations “firm-region” nexus and productivity at the firm level. Based on a query conducted using the *Scopus* search engine, 166 articles were analysed, revealing an emerging research field.

This literature review highlights the fact that too little research is conducted on the impact of territorial resources on productivity as measured at the firm level by comparison with the abundant research conducted at regional level. From this viewpoint, there is a need to better identify the effect of territorial resources on firms, which are the target group for a large part of regional development policies. Staying on the level of administrative regions exposes researchers and decisionmakers to the ecological fallacy of attributing an observed effect for the community to everyone in that community (Openshaw, 1984; Wrigley, 1995). Moreover, “head office” bias could lead to overestimating the real magnitude of agglomeration economies and localised externalities linked to largest cities.

The elements discussed here not only directly impact the results of the studies about the relations between the “firm-region” nexus and firm productivity, but consequently also the conclusions regarding regional development, a major economic policy objective. That is why it policy makers should pay greater attention to “data and method issues”. That said, new research may lead to increasingly robust insights about the impact of territorial resources on firm productivity.

The availability of reliable data on firms and the use of robust estimates of TFP as a comparable indicator of firm productivity seem to jointly condition the development of field research. The analysed articles usually focus on national contexts because data, typically produced at the national level, are not standardised across countries. This continues to make international comparisons challenging (Schuh *et al.*, 2017). Although authors normally work within a single national context, ongoing exchanges between scientists across national boundaries are making it possible to achieve a consensus regarding appropriate statistical analysis methods and the effect of “firm-region” nexus on firm productivity. For example, some innovative variables could be assessed in multiple national contexts, notably in terms of access to financial services or the quality of supply-demand matching in local labour markets.

Few articles take seriously into account the firm location issue: only 30% of 166 articles contain a specific methodological discussion about it. Some of these articles detail the potential bias in their methodological section. Therefore, we can conclude that there is a lack of consideration for the geographical complexity and subnational variability of productivity as highlighted by Anselin (2010), Autant-Bernard *et al.* (2011), and Tsvetkova *et al.* (2020). Neglecting the “head office bias”, the real advantage of agglomeration probably tends to be overestimated (Gaubert, 2018; Bouba-Olga & Grossetti, 2020).

Classical methods to estimate firm TFP neglect the bias induced by spatial dependence between firms. From this perspective, it is striking to observe that, for instance, Van Beveren (2012) does not include it in his list of methodological challenges. This potential bias is another methodological issue for researchers in regional science that reflects an additional lack of consideration for the spatial dimension. In the future, studies should address the remaining gap in the integration of the spatial dimension, notably by developing ad hoc methodologies and tools. First, it is observed that cartography and spatial analysis are still underused tools for describing fundamentally spatial phenomena. In parallel, the development of tools in spatial data analysis, such as *Geoda Space* (Anselin & Rey, 2014), is likely to facilitate wide usage of these techniques. We should also mention Harris *et al.* (2019), which develops an innovative methodology combining, within the same model, a robust estimation of the TFP, spatial dependence, and an explanatory model of territorial resources using GMM.

The quantification of “firm-region” nexus remains very varied, depending on national or local cases (diverging points of interest, data availability, different ways to quantify “firm-region nexus” ...). A critical perspective is more developed in articles focusing on one category of externalities. Thus, a “general” effect (identified by a classical regression) could hide specific effects or relations (threshold effect, decreasing marginality...).

These more detailed analyses explain a part of the non-significant, heterogeneous, or negative effects on firm productivity among the 166 articles. There are some tests of specific relations between firm productivity and variables. Many articles challenge the real effect of agglomeration economies on firm productivity: spatial and/or temporal effect, linear or non-linear relations, and the threshold effect. Regarding entrepreneurial dynamics, some articles identify the key importance of firm age on TFP of nearby firms with, from a temporal perspective, a negative and then a positive effect.

Among the 166 articles, it appears that the “firm-region” nexus influences firm TFP. Regarding articles including the variety of variables quantifying this “firm-region” nexus, firm location potentially influences TFP within a range of 0.4% to 11%. Therefore, location does influence firm productivity, but it is a minor factor compared to internal company organisation.

Among the different categories of localised externalities, scopes diverge. Agglomeration economies increase firm productivity. Beyond this stylised fact, the scientific debate focuses on the spatial and/or temporal effect, the magnitude of each type of agglomeration economies, the cumulative advantage, the selection effect on firms with varying degrees of interest for agglomeration economies, and the local magnitude of diseconomies of agglomeration. The quality of matching on the local labour market is another aspect of agglomeration economies. A better understanding of the “head office bias” could improve analysis robustness. In addition to agglomeration economies, some firms have a specific effect on firm productivity nearby due to their nature (e.g., size, frontier firms, financial services...).

The local quality of governance, institutions and human capital are less frequently tested but are more frequently positively linked to firm productivity. This is clearer than knowledge diffusion or local level of innovation due to difficulties in quantifying these categories.

Finally, geography, demography, history, and infrastructure could influence firm productivity, but these variables are strongly related to agglomeration economies, institutions, or human capital. For instance, infrastructure improves accessibility to economic agents and therefore to agglomeration economies. SEZ are developed to improve agglomeration economies in locations open to the world. Historical variables, quantifying past levels of development (sometimes even from the Roman era for European countries, see Holl (2016)), seem to explain the variability across space of firm TFP in the modern era.

BIBLIOGRAPHY

- Abeberese A B, Barnwal P, Chaurey R, Mukherjee P (2023) Democracy and firm productivity: Evidence from Indonesia. *Review of Economics and Statistics*, 105 (3): 713-722. https://doi.org/10.1162/rest_a_01077
- Abramowitz M (1956) Resources and Outputs Trends in the US since 1870. *American Economic Review* 46 (2): 5-23.
- Akerberg D A, Caves K, Frazer G (2015) Identification properties of recent production function estimators. *Econometrica* 83 (6): 2411-2451. <https://doi.org/10.3982/ECTA13408>
- Agostino M, Di Tommaso M R, Nifo A, Rubini L, Trivieri F (2020) Institutional quality and firms' productivity in European regions. *Regional Studies* 54 (9): 1275-1288. <https://doi.org/10.1080/00343404.2020.1712689>
- Aiello F, Pupo V, Ricotta F (2014) Firm heterogeneity in TFP, sectoral innovation and location. Evidence from Italy. *Spatial Economic Analysis* 9 (1): 51-70. <https://doi.org/10.1080/02692171.2015.1016408>
- Aiello F, Pupo V, Ricotta F (2015) Explaining Total Factor Productivity at Firm Level in Italy. Does Location Matter? *International Review of Applied Economics* 29 (5): 579-607. <https://doi.org/10.1080/17421772.2013.863428>
- Aiello F, Ricotta F (2016) Firm heterogeneity in productivity across Europe: evidence from multilevel models. *Economics of Innovation and New Technology* 25 (1): 57-89. <https://doi.org/10.1080/10438599.2015.1057001>
- Amato S, Pieroni V, Lattanzi N, Vitali G (2022) Are family firms good neighbours? A spatial analysis of Italian technology-intensive firms. *Journal of Small Business and Enterprise Development*, 29 (4): 663-693. <https://doi.org/10.1108/JSBED-06-2021-0242>
- Andersson M, Braunerhjelm P, Thulin P (2012) Creative destruction and productivity: entrepreneurship by type, sector and sequence. *Journal of Entrepreneurship and Public Policy*, 1 (2): 125-146. <https://doi.org/10.1108/20452101211261417>
- Andersson M, Larsson J P, Wernberg J (2019) The economic microgeography of diversity and specialization externalities - firm-level evidence from Swedish cities. *Research Policy* 48 (6): 1385-1398. <https://doi.org/10.1016/j.respol.2019.02.003>
- Antonelli C, Scellato G (2013) Complexity and technological change: Knowledge interactions and firm level total factor productivity. *Journal of Evolutionary Economics*, 23 (1): 77-96. <https://doi.org/10.1007/s00191-012-0299-8>

Antonioli D, Borghesi S, Mazzanti M (2016) Are regional systems greening the economy? Local spillovers, green innovations and firms' economic performances. *Economics of Innovation and New Technology* 25 (7): 692-713. <https://doi.org/10.1080/10438599.2015.1127557>

Anselin L (2010) Thirty years of spatial econometrics. *Papers in Regional Science* 89 (1): 3-25. <https://doi.org/10.1111/j.1435-5957.2010.00279.x>

Anselin L, Rey S J (2014) *Modern Spatial Econometrics in Practice: A Guide to GeoDa, GeoDaSpace and PySAL*. GeoDa Press LLC, Chicago, USA.

Autant-Bernard C, Guironnet J-P, Massard N (2011) Agglomeration and social return to R&D: Evidence from French plant productivity changes. *International Journal of Production Economics* 132 (1): 34-42. <https://doi.org/10.1080/00220380412331322681>

Badr K, Rizk R, Zaki C (2019) Firm productivity and agglomeration economies: evidence from Egyptian data. *Applied Economics* 51(51), 5528-5544. <https://doi.org/10.1080/00036846.2019.1613506>

Baldwin J R, Beckstead D, Brown M W, Rigby D L (2008) Agglomeration and the geography of localization economies in Canada. *Regional Studies*, 42 (1): 117-132. <https://doi.org/10.1080/00343400701543199>

Baldwin J R, Brown W M, Rigby D (2010) Agglomeration economies: Microdata panel estimates from Canadian manufacturing. *Journal of Regional Science*, 50 (5): 915-934. <https://doi.org/10.1111/j.1467-9787.2010.00675.x>

Bellofatto A A, Domínguez B, Dwyer E C (2023) Uncovering Urban Advantages: Evidence from Australian Firm-Level Data. *Economic Record*, 99 (S1): 13-34. <https://doi.org/10.1111/1475-4932.12753>

Beaudry C, Schiffauerova A (2009) Who's right, Marshall or Jacobs? The localization versus urbanization debate. *Research policy*, 38 (2): 318-337. <https://doi.org/10.1016/j.respol.2008.11.010>

Békés G, Harasztosi P (2013) Agglomeration premium and trading activity of firms. *Regional Science and Urban Economics*, 43 (1): 51-64. <https://doi.org/10.1016/j.regsciurbeco.2012.11.004>

Boell S K, Cecez-Kecmanovic D (2015) On being 'Systematic' in Literature Reviews in IS. *Journal of Information Technology* 30 (2): 161-173. <https://doi.org/10.1057/jit.2014.26>

Boschma R, Eriksson R, Lindgren U (2009) How does labour mobility affect the performance of plants? The importance of relatedness and geographical proximity. *Journal of Economic Geography*, 9 (2), 169-190. <https://doi.org/10.1093/jeg/lbn041>

- Bouba-Olga O, Grossetti M (2020) The French Version of the CAGE Mythology (Competitiveness – Attractiveness – Globalization – Excellence) and Some Ideas on How to Escape from It. In: Pumain D (ed) *Theories and models of urbanization*. Springer, Cham, Switzerland: 133-150. https://doi.org/10.1007/978-3-030-36656-8_8
- Brunow S, Blien U (2015) Agglomeration effects on labor productivity: An assessment with microdata. *Region*, 2 (1): 33-53. <https://doi.org/10.18335/region.v2i1.24>
- Cainelli G, Fracasso A, Marzetti G (2015) Spatial agglomeration and productivity in Italy: A panel smooth transition regression approach. *Papers in Regional Science*, 94 (S1): S39-S67. <https://doi.org/10.1111/pirs.12103>
- Cainelli G, Ganau R (2018) Distance-based agglomeration externalities and neighbouring firms' characteristics. *Regional Studies*, 52 (7), 922-933. <https://doi.org/10.1080/00343404.2017.1360482>
- Cainelli G, Ganau R, Iacobucci D (2016) Do geographic concentration and vertically related variety foster firm productivity? Micro-evidence from Italy. *Growth and Change*, 47 (2): 197-217. <https://doi.org/10.1111/grow.12112>
- Cambini C, Grinza E, Sabatino L (2023) Ultra-fast broadband access and productivity: Evidence from Italian firms. *International Journal of Industrial Organization*, 86: 102901. <https://doi.org/10.1016/j.ijindorg.2022.102901>
- Campisi D, Mancuso P, Mastrodonato S L, Morea D (2022) Productivity dispersion in the Italian knowledge-intensive business services (KIBS) industry: a multilevel analysis, *Management Decision*, 60 (4), 940-952. <https://doi.org/10.1108/MD-11-2020-1578>
- Cardamone P, Pupo V, Ricotta F (2016) Do Firms Benefit from University Research? Evidence from Italy. *Italian Economic Journal* 2 (3): 445-471. <https://doi.org/10.1007/s40797-016-0035-x>
- Carreira C, Lopes L (2018) Regional knowledge spillovers: a firm-based analysis of non-linear effects. *Regional Studies*, 52 (7): 948-958. <https://doi.org/10.1080/00343404.2017.1360484>
- Charron N, Dijkstra L, Lapuente V (2014) Regional governance matters: Quality of government within European Union member states. *Regional Studies* 48 (1): 68-90. <https://doi.org/10.1080/00343404.2013.770141>
- Charron N, Lapuente V, Bauhr M (2021) Sub-national Quality of Government in EU Member States: Presenting the 2021 European Quality of Government Index and its relationship with Covid-19 indicators. *Working Paper Series of the Quality of Government Institute* 2021 (4): 40 p.

- Chen G, Liu Y, Gao Q, Zhang J (2023) Does regional services development enhance manufacturing firm productivity? A manufacturing servitization perspective. *International Review of Economics and Finance*, 86: 451-466. <https://doi.org/10.1016/j.iref.2023.03.020>
- Coll-Martinez E (2019) Creativity and the city: testing the attenuation of agglomeration economies in Barcelona. *Journal of Cultural Economics* 43 (3): 365-395. <https://doi.org/10.1007/s10824-019-09340-9>
- Combes P-P, Duranton G, Gobillon L, Puga D, Roux S (2012) The Productivity Advantages of Large Cities: Distinguishing Agglomeration from Firm Selection. *Econometrica*, 80 (6), 2543-2594. <https://doi.org/10.3982/ECTA8442>
- Dai M, Li X, Lu Y (2017) How urbanization economies impact TFP of R & D Performers: Evidence from China. *Sustainability*, 9 (10): 1766. <https://doi.org/10.3390/su9101766>
- Deichmann U, Fay M, Koo J, Lall S V (2004). Economic structure, productivity, and infrastructure quality in Southern Mexico. *Annals of Regional Science*, 38 (3), 361-385. <https://doi.org/10.1007/s00168-003-0171-8>
- Demir F, Hu C, Liu J, Shen H (2022) Local corruption, total factor productivity and firm heterogeneity: Empirical evidence from Chinese manufacturing firms. *World Development*, 151: 105770. <https://doi.org/10.1016/j.worlddev.2021.105770>
- Dhyne E, Duprez C (2016) Three regions, three economies? *Economic Review* 12/2016. National Bank of Belgium, Brussels, Belgium: 65-80. https://www.nbb.be/doc/ts/publications/economicreview/2016/revecoiii2016_h4.pdf
- Di Giacinto V, Micucci G, Tosoni A (2020) The agglomeration of knowledge-intensive business services firms. *Annals of Regional Science*, 65 (3), 557-590. <https://doi.org/10.1007/s00168-020-00995-3>
- Du J, Vanino E (2021) Agglomeration externalities of fast-growth firms. *Regional Studies*, 55 (2): 167-181. <https://doi.org/10.1080/00343404.2020.1760234>
- Duranton G (2011) California dreamin': The feeble case for cluster policies. *Review of Economic Analysis*, 3 (1), 3-45. <https://doi.org/10.15353/rea.v3i1.1375>
- Ehrl P (2013) Agglomeration economies with consistent productivity estimates. *Regional Science and Urban Economics* 43 (5): 751-763. <https://doi.org/10.1016/j.regsciurbeco.2013.06.002>
- Fafchamps M, Hamine S E (2017) Firm productivity, wages, and agglomeration externalities. *Research in Economics*, 71 (2): 291-305. <https://doi.org/10.1016/j.rie.2016.12.003>

- Fantechi F, Fratesi U (2023) Border Effects on firm's productivity: The role of peripherality and territorial capital. *Papers in Regional Science*, 102 (3): 483-506. <https://doi.org/10.1111/pirs.12730>
- Fazio G, Maltese E (2015) Agglomeration Externalities and the Productivity of Italian Firms. *Growth and Change*, 46 (3): 354-378. <https://doi.org/10.1111/grow.12093>
- Fotheringham A S, Wong D W S (1991) The Modifiable Areal Unit Problem in Multivariate Statistical Analysis. *Environment and Planning A*, 23 (7): 1025-1044. <https://doi.org/10.1068/a231025>
- Gal P (2013) Measuring Total Factor Productivity at the Firm Level using OECD-ORBIS. *OECD Economics Department Working Papers*, 1049. OECD Editions, Paris, France. <https://doi.org/10.1787/5k46dsb25ls6-en>
- Ganau R (2018) Productivity, Credit Constraints and the Role of Short-Run Localization Economies: Micro-Evidence from Italy. *Regional Studies* 50 (11), 1834-1848. <https://doi.org/10.1080/00343404.2015.1064883>
- Gaubert C (2018) Firm sorting and agglomeration. *American Economic Review* 108 (11): 3117-3153. <https://doi.org/10.1257/aer.20150361>
- Gibbons S, Lyytikäinen T, Overman H G, Sanchis-Guarner R (2019) New road infrastructure: The effects on firms. *Journal of Urban Economics*, 110: 35-50. <https://doi.org/10.1016/j.jue.2019.01.002>
- Giordano R.; Lanau S.; Tommasino P.; Topalova P. (2020) Does public sector inefficiency constrain firm productivity? Evidence from Italian provinces. *International Tax and Public Finance*, 27 (4): 1019-1049. <https://doi.org/10.1007/s10797-020-09600-x>
- Gordon J, Zhao S, Gretton P (2015) *On productivity: concepts and measurement [Productivity Commission Staff Research Note]*. [Australian] Productivity Commission, Canberra, Australia.
- Griliches Z (1996) The Discovery of the Residual: A Historical Note. *Journal of Economic Literature* 34 (3): 1324-1330.
- Griliches Z (1998) *R&D and productivity: The Econometric Evidence*. University of Chicago Press, Chicago, USA.
- Grimes A, Ren C, Stevens P (2012) The need for speed: Impacts of internet connectivity on firm productivity. *Journal of Productivity Analysis* 37 (2): 187-201. <https://doi.org/10.1007/s11123-011-0237-z>
- Harris R, Moffat J (2012) Is productivity higher in British cities? *Journal of Regional Science*, 52 (5): 762-786. <https://doi.org/10.1111/j.1467-9787.2012.00778.x>

Harris R, Moffat J (2015) Plant-level determinants of total factor productivity in Great-Britain 1997-2008. *Journal of Productivity Analysis* 44 (1): 1-20. <https://doi.org/10.1007/s11123-015-0442-2>

Harris R, Moffat J (2022) The geographical dimension of productivity in Great Britain, 2011-18: the sources of the London productivity advantage. *Regional Studies*, 56 (10): 1713-1728. <https://doi.org/10.1080/00343404.2021.2004308>

Harris R, Moffat J, Evenhuis E, Martin R, Pike A, Sunley P (2019) Does spatial proximity raise firm productivity? Evidence from British manufacturing. *Cambridge Journal of Regions, Economy and Society* 12 (3): 467-487. <https://doi.org/10.1093/cjres/rsz017>

Hasan S, Faggian A, Klaiber H A, Sheldon I (2018) Agglomeration Economies or Selection? An Analysis of Taiwanese Science Parks. *International Regional Science Review*, 41 (3): 335-363. <https://doi.org/10.1177/0160017616642822>

Hasan S, Klaiber H A, Sheldon I (2020) The impact of science parks on small- and medium-sized enterprises' productivity distributions: the case of Taiwan and South Korea. *Small Business Economics*, 54 (1): 135-153. <https://doi.org/10.1007/s11187-018-0083-8>

Hashiguchi Y, Tanaka K (2015) Agglomeration and firm-level productivity: A Bayesian spatial approach. *Papers in Regional Science*, 94 (S1): S95-S114. <https://doi.org/10.1111/pirs.12147>

Holl A (2016) Highways and productivity in manufacturing firms. *Journal of Urban Economics*, 93: 131-151. <https://doi.org/10.1016/j.jue.2016.04.002>

Holl A, Mariotti I (2018) Highways and firm performance in the logistics industry. *Journal of Transport Geography*, 72: 139-150. <https://doi.org/10.1016/j.jtrangeo.2018.08.021>

Howell A (2019) Heterogeneous impacts of China's economic and development zone program. *Journal of Regional Science* 59 (5): 797-818. <https://doi.org/10.1111/jors.12465>

Howell A (2020) Picking 'winners' in space: Impact of spatial targeting on firm performance in China. *Journal of Regional Science*, 60 (5), 1025-1046. <https://doi.org/10.1111/jors.12497>

Hulten C R (2001) Total Factor Productivity: A Short Biography. In: Hulten C R, Dean E R, Harper M J (eds.) *New Developments in Productivity Analysis (NBER Studies in income and wealth No. 63)*. University of Chicago Press, Chicago, USA: 1-47.

Hussen M S, Çokgezen M (2022) Relationship between innovation, regional institutions and firm performance: Micro-evidence from Africa. *African Journal of Science, Technology, Innovation and Development*, 14 (2), 316-332. <https://doi.org/10.1080/20421338.2020.1866148>

- Kampelmann S, Rycx F, Saks Y, Tojerow I (2018) Misalignment of productivity and wages across regions: Evidence from Belgium. *Regional Studies*, 52 (12): 1695-1707. <https://doi.org/10.1080/00343404.2018.1445846>
- Knoben J, Arian A T, van Oort F, Raspe O (2016) Agglomeration and firm performance: One firm's medicine is another firm's poison. *Environment and Planning A*, 48 (1): 132-153. <https://doi.org/10.1177/0308518X15602898>
- Koster H R A, Cheng F F, Gerritse M, van Oort F G (2019) Place-based policies, firm productivity, and displacement effects: Evidence from Shenzhen, China. *Journal of Regional Science* 59 (2): 187-213. <https://doi.org/10.1111/jors.12415>
- Lall S V, Shalizi Z, Deichmann U (2004) Agglomeration economies and productivity in Indian industry. *Journal of Development Economics*, 73 (2), 643-673. <https://doi.org/10.1016/j.jdeveco.2003.04.006>
- Lasagni A, Nifo A, Vecchione G (2015) Firm productivity and institutional quality: Evidence from Italian industry. *Journal of Regional Science*, 55 (5): 774-800. <https://doi.org/10.1111/jors.12203>
- Lee J K (2021) Transport infrastructure investment, accessibility change and firm productivity: Evidence from the Seoul region. *Journal of Transport Geography*, 96: 103182. <https://doi.org/10.1016/j.jtrangeo.2021.103182>
- Levinsohn J, Petrin A (2003) Estimating production functions using inputs to control for unobservables. *The review of economic studies* 70 (2): 317-341. <https://doi.org/10.1111/1467-937X.00246>
- Li Z, Wu M, Chen B R (2017) Is road infrastructure investment in China excessive? Evidence from productivity of firms. *Regional Science and Urban Economics*, 65: 116-126. <https://doi.org/10.1016/j.regsciurbeco.2017.05.001>
- Li Z., Ding C, Niu Y (2019) Industrial structure and urban agglomeration: evidence from Chinese cities. *Annals of Regional Science*, 63 (1): 191-218. <https://doi.org/10.1007/s00168-019-00932-z>
- Li X, Wu X, Tan Y (2021) Impact of special economic zones on firm performance. *Research in International Business and Finance* 58: 101463. <https://doi.org/10.1016/j.ribaf.2021.101463>
- Lin Y, Huang J (2021) Can Highway Networks Promote Productivity? Evidence from China. *Journal of Advanced Transportation*, 6860979. <https://doi.org/10.1155/2021/6860979>

- Lin H-L, Li H-Y, Yang C-H (2011) Agglomeration and productivity: Firm-level evidence from China's textile industry. *China Economic Review*, 22 (3): 313-329. <https://doi.org/10.1016/j.chieco.2011.03.003>
- Liu Z (2014) Human capital externalities in cities: Evidence from chinese manufacturing firms. *Journal of Economic Geography*, 14 (3): 621-649. <https://doi.org/10.1093/jeg/lbt024>
- Liu S, Yang Y, Cai L (2023) Impact of air quality on enterprise productivity: Evidence from Chinese listed companies. *Frontiers in Environmental Science*, 10: 1095393. <https://doi.org/10.3389/fenvs.2022.1095393>
- Manzocchi S, Quintieri B, Santoni G (2017) Local manufacturing productivity markers: an empirical study of the Italian counties. *Annals of Regional Science*, 59 (1), 255-279. <https://doi.org/10.1007/s00168-017-0830-9>
- Martin P, Mayer T, Mayneris F (2011) Spatial concentration and plant-level productivity in France. *Journal of Urban Economics*, 69 (2): 182-195. <https://doi.org/10.1016/j.jue.2010.09.002>
- Maskell P (2001) The firm in economic geography. *Economic Geography* 77 (4): 329-344. <https://doi.org/10.1111/j.1944-8287.2001.tb00168.x>
- Micucci G, Di Giacinto V (2009) The producer service sector in Italy: Long-term growth and its local determinants, *Spatial Economic Analysis* 4 (4): 391-425. <https://doi.org/10.1080/17421770903317637>
- Mitaritonna C, Orefice G, Peri G (2017) Immigrants and firms' outcomes: Evidence from France. *European Economic Review*, 96: 62-82. <https://doi.org/10.1016/j.euroecorev.2017.05.001>
- Mitze T, Makkonen T (2020) When interaction matters: the contingent effects of spatial knowledge spillovers and internal R&I on firm productivity. *Journal of Technology Transfer* 45 (4): 1088-1120. <https://doi.org/10.1007/s10961-019-09729-w>
- Mongeon P, Paul-Hus A (2016) The journal coverage of Web of Science and Scopus: a comparative analysis. *Scientometrics* 106 (1): 213-228. <https://doi.org/10.1007/s11192-015-1765-5>
- Moretti L (2014) Local financial development, socio-institutional environment, and firm productivity: Evidence from Italy. *European Journal of Political Economy* 35: 38-51. <https://doi.org/10.1016/j.ejpoleco.2014.03.006>

- Morin Y, Védérine L (2022) Do agglomeration economies affect firms' returns to training? Evidence based on French industrial firms. *Papers in Regional Science*, 101 (5): 1135-1156. <https://doi.org/10.1111/pirs.12691>
- Morris D, Vanino E, Corradini C (2020) Effects of regional skill gaps and skill shortages on firm productivity. *Environment and Planning A* 52 (5): 933-952. <https://doi.org/10.1177/0308518X19889634>
- Mun S, Han S H, Kim H J (2021) Terrorist attacks and total factor productivity. *Economics Letters*, 202: 109808. <https://doi.org/10.1016/j.econlet.2021.109808>
- OECD (2020) *Enhancing Productivity in UK Core Cities: Connecting Local and Regional Growth*. OECD Urban Policy Reviews, OECD Publishing, Paris, France. <https://doi.org/10.1787/9ef55ff7-en>
- Okubo T, Tomiura E (2012) Industrial relocation policy, productivity and heterogeneous plants: Evidence from Japan. *Regional Science and Urban Economics*, 42 (1-2), 230-239. <https://doi.org/10.1016/j.regsciurbeco.2011.09.004>
- Olley S, Pakes A (1996) The dynamics of productivity in the telecommunications equipment industry. *Econometrica* 64 (6): 1263-1297. <https://doi.org/10.3386/w3977>
- Openshaw S (1984) Ecological fallacies and the analysis of areal census data. *Environment and planning A* 16 (1): 17-31. <https://doi.org/10.1068/a160017>
- Owoo N S (2016) A spatio-temporal analysis of non-farm enterprise performance in Uganda: 2010-2012. *African Journal of Economics and Management Studies*, 7 (4), 535-546. <https://doi.org/10.1108/AJEMS-12-2014-0094>
- Owoo N, Naudé W (2017) Spatial proximity and firm performance: evidence from non-farm rural enterprises in Ethiopia and Nigeria. *Regional Studies* 51 (5): 688-700. <https://doi.org/10.1080/00343404.2015.1131896>
- Pan Z, Zhang F (2002) Urban productivity in China. *Urban Studies*, 39 (12): 2267-2281. <https://doi.org/10.1080/0042098022000033863>
- Qi Y, Yu J, Yang S, Xie X (2022) Local government consumption and firm performance. Evidence from the "TPCs" in China. *Journal of Asian Economics*, 80: 101477. <https://doi.org/10.1016/j.asieco.2022.101477>
- Ramachandran R, Reddy K, Sasidharan S (2020) Agglomeration and Productivity: Evidence from Indian Manufacturing. *Studies in Microeconomics*, 8 (1): 75-94. <https://doi.org/10.1177/2321022220923211>

Raspe O, van Oort F G (2011) Firm heterogeneity, productivity and spatially bounded knowledge externalities. *Socio-Economic Planning Sciences*, 45 (1): 38-47. <https://doi.org/10.1016/j.seps.2010.08.002>

Rodriguez-Pose A, Ganau R, Maslauskaitė K, Brezzi M (2021) Credit constraints, labor productivity, and the role of regional institutions: Evidence from manufacturing firms in Europe. *Journal of Regional Science*, 61 (2): 299-328. <https://doi.org/10.1111/jors.12514>

Schuh B, Dallhammer E, Derszniak-Noirjean M, Kaucic J, Kirchmayr-Novak E, Tordy J, Oberholzner T, Enichlmair C, Kaufmann P (2017) *Small and medium-sized enterprises in European regions and cities [scientific annex]*. ESPON, Luxembourg, Grand Duchy of Luxembourg.

Serafinelli M (2019) “Good” firms, worker flows, and local productivity. *Journal of Labor Economics*, 37 (3): 747-792. <https://doi.org/10.1086/702628>

Siepel J, Dejardin M (2020) How do we measure firm performance? A review of issues facing entrepreneurship researchers. In: Saridakis G, Cowling M (eds) *Handbook of Quantitative Research Methods in Entrepreneurship*. Edward Elgar Publishing, Cheltenham: 4–20.

Solow R M (1957) Technical change and the aggregate production function. *The review of Economics and Statistics* 39(3): 312-320. <https://doi.org/10.2307/1926047>

Spanos G (2019) Firm organization and productivity across locations. *Journal of Urban Economics*, 112: 152-168. <https://doi.org/10.1016/j.jue.2019.05.006>

Stefano A, Zare S, Nicola L (2023) Is too small always bad? The role of place attachment in harnessing location advantages. *International Entrepreneurship and Management Journal*, 20: 265-308. <https://doi.org/10.1007/s11365-023-00907-9>

Taylor M, Asheim B (2001) The concept of the firm in economic geography. *Economic Geography* 77 (4): 315-328. <https://doi.org/10.1111/j.1944-8287.2001.tb00167.x>

Tian Z, Hu A, Lin Y (2023) Does Proximity to Expressways Improve Manufacturing Productivity? Evidence from Chinese Firms. *Journal of Development Studies*, 59 (12): 1867-1884. <https://doi.org/10.1080/00220388.2023.2244639>

Timmermans B, Boschma R (2014) The effect of intra- and inter-regional labour mobility on plant performance in Denmark: The significance of related labour inflows. *Journal of Economic Geography*, 14 (2), 289-311. <https://doi.org/10.1093/jeg/lbs059>

Trax M, Brunow S, Suedekum J (2015) Cultural diversity and plant-level productivity. *Regional Science and Urban Economics*, 53: 85-96. <https://doi.org/10.1016/j.regsciurbeco.2015.05.004>

- Tsvetkova A, Ahrend R, Oliveira Martins J, Lembcke A C, Knutsson P, Jong D, Terzidis N (2020) The spatial dimension of productivity: Connecting the dots across industries, firms and places. *OECD Regional Development Working Papers* 2020/01: 1-65. <https://doi.org/10.1787/ba5edb47-en>
- Van Ark R (2014) Total factor productivity: lessons from the past and directions for the future, *NBB Working paper research*, 271. Brussels, Belgium: National Bank of Belgium. <https://www.nbb.be/doc/ts/publications/wp/wp271en.pdf>
- Van Beveren I (2012) Total factor productivity estimation: A practical review. *Journal of economic surveys* 26 (1): 98-128. <https://doi.org/10.1111/j.1467-6419.2010.00631.x>
- Wang J, Luo C (2022) Social Mobility and Firms' Total Factor Productivity: Evidence from China. *Sustainability*, 14 (22). <https://doi.org/10.3390/su142215190>
- Wooldridge J M (2009) On estimating firm-level production functions using proxy variables to control for unobservables. *Economics Letters* 104 (3): 112-114. <https://doi.org/10.1016/j.econlet.2009.04.026>
- Wrigley N (1995) Revisiting the Modifiable Areal Unit Problem and the ecological fallacy. In: Cliff A D, Gould P R, Hoare A G, Thrift N (eds) *Diffusing Geography: Essays Presented to Peter Haggett*. Wiley, 49-71.
- Xue S, Zhang B, Zhao X (2021) Brain drain: The impact of air pollution on firm performance. *Journal of Environmental Economics and Management*, 110:102546. <https://doi.org/10.1016/j.jeem.2021.102546>
- Yang F F, Yeh A G O, Wang J (2018) Regional effects of producer services on manufacturing productivity in China. *Applied Geography*, 97: 263-274. <https://doi.org/10.1016/j.apgeog.2018.04.014>
- Yué S, Nan S (2019) Railway speedup and firms' total factor productivity. *Economics Letters* 178: 21-23. <https://doi.org/10.1016/j.econlet.2019.01.015>
- Zhang P, Deschenes O, Meng K, Zhang J (2018) Temperature effects on productivity and factor reallocation: Evidence from a half million chinese manufacturing plants. *Journal of Environmental Economics and Management*, 88: 1-17. <https://doi.org/10.1016/j.jeem.2017.11.001>
- Zhao T, Xiao X, Dai Q (2021) Transportation infrastructure construction and high-quality development of enterprises: Evidence from the quasi-natural experiment of high-speed railway opening in China. *Sustainability*, 13 (23): 13316. <https://doi.org/10.3390/su132313316>

Zhou D, Wang W (2023) Can internet adoption promote the productivity of firms in China: evidence from a longitudinal study. *China Agricultural Economic Review*, 15 (4): 795-813. <https://doi.org/10.1108/CAER-11-2022-0249>

Zhou Z, Liu Z (2023) The impact of place-based policies in firm performance: Evidence from China. *Sustainability*, 15 (8): 6623. <https://doi.org/10.3390/su15086623>

Zhu J, Xu H, Zhang Y (2022) Local government debt and firm productivity: Evidence from China. *Research in International Business and Finance*, 63: 101798. <https://doi.org/10.1016/j.ribaf.2022.101798>