

An interdisciplinary bibliometric analysis of models for land-use and transport interactions

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Abstract

Research on links between transport and land-use is by essence interdisciplinary, as a result of the multi-dimensionality and complexity of these objects. In the case of models simulating interactions between transport and land-use, the research landscape is similarly relatively broad and sparse. We propose in this paper a bibliometric analysis of this literature from an interdisciplinary perspective. We first provide a survey of the various disciplines and approaches. We then construct an interdisciplinary corpus of around 10,000 papers, which we analyse in terms of citation network and semantic content. We illustrate therein the diversity of existing approaches, their complementarity, and possible future research directions coupling some of these viewpoints.

Keywords: Land-use Transport Interaction Modeling; Bibliometrics; Research Landscape; Interdisciplinarity

1 Introduction

Transportation networks are well known as having a central role in shaping the evolution of land-use in urban and regional systems [Mackett, 1993]. In the context of urban planning, quantitative simulation models integrating this link have been introduced as tools to explore future scenarios and coined as Land-use Transport Interaction (LUTI) models [Wegener, 2021]. Other disciplines such as transport geography focus on processes at other scales such as systems of cities, and have developed more stylised models [Raimbault, 2020c]. Transportation network growth is also well understood from an economic viewpoint focusing on network investments [Levinson et al., 2012]. A variety of disciplines and corresponding viewpoints, processes and scales, is thus focused on models linking transport and land-use.

Within this highly interdisciplinary research question, some types of models and theoretical frameworks have been significantly less explored. For example, the construction of co-evolution models between transport and land-use, integrated across time and spatial scales, remains relatively open. Diverse hypotheses can be proposed to explain the absence of investigations on such co-evolution models: (i) following [Commenges, 2013], scientific and operational actors that would be concerned by the practical application of such models would see themselves replaced by the same models and have thus no incentive to develop them (sociological explanation); (ii) the different disciplines which develop the diverse components that are necessary to such models are compartmentalised and have divergent motivations (epistemological explanation); (iii) the construction of such models exhibits intrinsic difficulties making their development not encouraging and not well currently tackled. The second hypothesis can be tested empirically using literature mapping methods.

This issue on co-evolution models highlights how the research landscape, in terms of disciplines and produced literature, endogenously shapes the questions tackled and processes studied. More generally, such an interdisciplinary field as modeling interactions between transport and land-use, involves many complementary viewpoint. Being able to provide an interdisciplinary literature review is thus an asset for scientific reflexivity and to investigate novel and hybrid research fronts. This contribution proposes thus a broad literature survey of such models, combined with a literature mapping approach.

The application of new bibliometrics and literature mapping methods to questions related to transport geography has already been proposed in the literature. [Derudder et al., 2019] study from a bibliometrics perspective the scientific position of Journal of Transport Geography. [Shi et al., 2020] analyse the scientific production around the

concept of accessibility. [Leung et al., 2019] produce citation network maps of research on the impact of fuel price on urban transport. [Modak et al., 2019] give an overview of the dynamics of Transportation Research journals over the last 50 years. Regarding models of interactions between transport and land-use in themselves, systematic bibliometric methods have not yet been applied.

Our contribution consists in producing first a broad and cross-disciplinary survey of such models; and second a partial but also interdisciplinary map and bibliometric analysis of the literature. Our study is not exhaustive but combines diverse viewpoints usually not combined. A companion paper [Raimbault, 2020b] provides a complementary approach, with a systematic review and meta-analysis of model characteristics, and a more exhaustive corpus construction.

The rest of this paper is organised as follows. We first review from an interdisciplinary perspective the models that can be linked to interactions between transportation networks and territories, without any a priori of temporal or spatial scale, of ontologies, of structure, or of application context. This survey is done with diverse disciplinary entries, including for example geography, transportation geography, planning. This overview suggests relatively independent knowledge structures and disciplines that rarely communicate. We proceed then to a literature mapping and bibliometrics analysis. Constructing a corpus of around 10,000 papers, we proceed to a multilayer network analysis, combining citation network and semantic network obtained through text-mining. This provides a better grasp of the relations between disciplines, their lexical field and their interdisciplinarity patterns.

2 Literature survey

We develop now an overview of different approaches modeling interactions between networks and territories. First of all, we need to notice a high contingency of scientific constructions underlying these. Indeed, according to [Bretagnolle et al., 2002], the “*ideas of specialists in planning aimed to give definitions of city systems, since 1830, are closely linked to the historical transformations of communication networks*”. The historical context (and consequently the socio-economical and technological contexts) conditions strongly the formulated theories. This implies that ontologies and corresponding models addressed by geographers and planners are closely linked to their current historical preoccupations, thus necessarily limited in scope and/or operational purpose. In a perspectivist vision of science [Giere, 2010], such boundaries are the essence of the scientific enterprise, and their combination and coupling in the case of models is generally a source of knowledge.

The entry we take here to sketch an overview of models is complementary to the one taken by [Raimbault, 2018a] (first chapter) and by [Raimbault, 2020b], by declining them through their main ontology of network-territories interactions: the relations $\text{Network} \rightarrow \text{Territory}$, $\text{Territory} \rightarrow \text{Network}$ and $\text{Territory} \leftrightarrow \text{Network}$. In this notation, a direct arrow corresponds to processes that we can relatively univocally attribute to the origin, whereas a reciprocal arrow assumes the intrinsic existence of reciprocal interactions, generally in coincidence with the emergence of entities playing a role in these. The reference frame for scales is also the one introduced in [Raimbault, 2018a], knowing that we do not consider the microscopic scales with the choice of discarding daily mobility models. We consider therefore models at the mesoscopic and macroscopic temporal and spatial scales.

2.1 LUTI models

2.1.1 Overview

One important approach to the modeling of the influence of transportation networks on territories lies in the field of planning, at medium temporal and spatial scales (the scales of metropolitan accessibility we developed before). Models in geography at other scales, such as the Simpop models [Pumain, 2012], do not include a particular ontology for transportation networks at the exception of the SimpopNet model [Schmitt, 2014], and even if they include networks between cities as carriers of exchanges, they do not allow to study in particular the relations between networks and territories.

These approaches are generally named as *models of the interaction between land-use and transportation (LUTI, for Land-Use Transport Interaction)*. Land-use generally means the spatial distribution of territorial activities, generally classified into more or less precise typologies (for example housing, industry, tertiary, natural space). These works can be difficult to apprehend as they relate to different scientific disciplines. We make here the choice to gather numerous approaches having the common characteristic to principally model the evolution of land-use, on medium temporal and spatial scales. The unity and the relative positioning of these approaches covering from economics to planning, remain an open question, to which [Raimbault, 2020b] introduces elements of answer through a systematic review and meta-analysis approach. Their general principle is to model and simulate the

evolution of the spatial distribution of activities, taking transportation networks as a context and significant drivers of relocations.

To understand the underlying conceptual frame to most approaches, a synthesis of the general theoretical and empirical frame for land-use transport interaction models described by [Wegener and Fürst, 2004] is as follows. The four concepts included are land-use, relocations of activities, the transportation system and the distribution of accessibility. A cycle of circular effects are summed up in the following loop: Activities \rightarrow Transportation system \rightarrow Accessibility \rightarrow Land-use \rightarrow Activities. The transportation system is assumed with a *fixed infrastructure*, i.e. effects of the distribution of activities are effects on the *use* of the transportation system (and thus link to *mobility* in our more general frame): modal choice, frequency of trips, length of travels.

The theoretically expected effects are classified according to the direction of the relation (*Land-use* \rightarrow *Transport* or *Transport* \rightarrow *Land-use*, and a loop *Transport* \rightarrow *Transport*), and according to the main factors included (residential density, of employments, locations, accessibility, transportation costs) and also by the aspect which is modified by the intervention tested (length and frequency of trips, modal choice, densities, locations). We can for example take:

- *Land-use* \rightarrow *Transport*: a minimal residential density is necessary for the efficiency of public transportation, a concentration of employments implies longer trips, larger cities have a greater proportion of the modal part of public transportation.
- *Transport* \rightarrow *Land-use*: a high accessibility implies higher prices and an increased development of residential housing, companies locate for a better accessibility to transportation at a larger scale.
- *Transport* \rightarrow *Transport*: places with a good accessibility will produce more and longer trips, modal choice and transportation cost are highly correlated.

These theoretical effects are then compared to empirical observations, which for most of them give the way processes are implemented. Some are not observed in practice, whereas most converge with theoretical expectations.

A more general framework closer to the idea of co-evolution, is the one given by [Le Néchet, 2010], which situates the triad Transportation system/Localization system/Activities system within the relation with agents: agents creating demand, agents building the city, external factors. From the viewpoint of urban economics, propositions for such models have existed for a relatively long time: [Putman, 1975] recalls the frame of urban economics in which main components are employments, demography and transportation, and reviews economic models of locations that relate to the Lowry model [Lowry, 1964].

[Wegener and Fürst, 2004] develop a state of the art of empirical studies and in modeling on this type of approach of interactions between land-use and transport. The theoretical positioning is closer of disciplines such as transportation socio-economics and planning (see the disciplinary landscapes described in the quantitative section of this paper). They compare and classify seventeen models, which however to not include an endogenous evolution of the transportation network on relatively short time scales for simulations (of the order of the decade). We find again indeed the correspondance with typically mesoscopic scales previously established. A complementary review is done by [Chang, 2006], broadening the context with the inclusion of more general classes of models, such as spatial interactions models (which contain traffic assignment and four steps models), planing models based on operational research (optimization of locations of different activities, generally homes and employments), the microscopic models of random utility, and models of the real estate market.

2.1.2 A diversity of operational models

The variety of existing models lead to operational comparisons: [Paulley and Webster, 1991] synthesise a project comparing different model applied to different cities. Their result allow on the one hand to classify interventions depending on their impact on the level of interaction between transportation and land-use, and on the other hand to show that the effects of interventions strongly depend on the size of the city and on its socio-economic characteristics.

Ontologies of processes, and more particularly on the question of equilibrium, are also varied. The respective advantages of a static approach (computation of a static equilibrium of households localisation for a given specification of their utility functions) and of a dynamical approach (out-of-equilibrium simulation of residential dynamics) has been studied by [?], within a metropolitan frame on time scales of the order of the decade. The authors show that results are roughly comparable and that each model has its utility depending on the question asked.

Different aspects of the same system can be included within diverse models, as show for example [Wegener et al., 1991], and traffic, residential and employments dynamics, the evolution of land-use as a consequence, also influenced by a static transportation network, are generally taken into account. [Iacono et al., 2008] covers a similar horizon with an additional development on cellular automata models for the evolution of land-use and agent-based models. The

temporal range of application of these models, around the decade, and their operational nature, make them useful for planning, what is rather far of our focus to obtain explicative models of geographical processes. Indeed, it is often more relevant for a model used in planning to be understandable as an anticipation tool, or even a communication tool, than to be faithful to territorial processes, at the cost of an abstraction.

2.1.3 Perspectives for LUTI models

[Timmermans, 2003] formulates doubts regarding the possibility of interaction models that would be really integrated, i.e. producing endogenous transportation patterns and being detached from artefacts such as accessibility for which the influence of its artificial nature remains to be established, in particular because of the lack of data and a difficulty to model governance and planning processes. It is interesting to note that current priorities for the development of LUTI models seem to be centred on a better integration of new technologies and a better integration with planning and decision-making processes, for example through visualization interfaces as proposed by [Wee, 2015]. They do not aim at being extended on problematics of territorial dynamics including the network on longer time scales for example, what confirms the range and the logic of use and development of this type of models.

A generalisation of this type of approach at a smaller scale, such as the one proposed by [Russo and Musolino, 2012], consists in the coupling between a LUTI at the mesoscopic scale to macroeconomic models at the macroscopic scale. They indeed generalise the framework of LUTI models to propose a framework of interaction between spatial economy and transportation (*Spatial Economics and Transport Interactions*). This framework includes LUTI models at the urban scale, and at the national level macroeconomic models simulating production and consumption, competition between activities, production of the stock of the offer of transportation. Transportation models still assume a fixed network and establish equilibria within it, what implies a small spatial scale and a short time scale. These do not consider the evolution of the transportation network in an explicit manner but are interested only in abstract patterns of demand and offer. Urban economics have developed specific approaches that are similar in their context: [Masson, 2000] for example describes an integrated model coupling urban development, relocations and equilibrium of transportation flows. [Wilson, 1998] highlights several possible theoretical developments for LUTI models, but also in terms of their operational application.

Thus, we can synthesise this type of LUTI approach, by the fundamental following characteristics: (i) models aiming at understanding an evolution of the territory, within the context of a given transportation network; (ii) models in a logic of planning and applicability, being themselves often implied in decision-making; and (iii) models at medium scales, in space (metropolitan scale) and in time (decade).

2.2 Network Growth

An “opposite” modeling paradigm is focused on the evolution of the network. It may seem strange to consider a variable network while neglecting the evolution of the territory, when considering some potential network evolution mechanisms (potential breakdown, self-reinforcements, network planning) which occur at mainly longer time scales than territorial evolutions. We will see that there is no paradox, since (i) either the modeling focuses on the evolution of *network properties*, at a short scale (micro) for congestion, capacity, tarification processes, mainly from an economic point of view; (ii) or territorial components playing indeed a role on the network are stable on the long scales considered.

Modeling approaches which aim at explaining the growth of transportation networks generally take a *bottom-up* and endogenous point of view. They thus try to unveil local rules that would allow to reproduce the growth of the network on long time scales (often the road network). As we will see, it can be a topological growth (creation of new links) or the growth of link capacities in relation with their use, depending on scales and ontologies considered. To simplify, we distinguish broad disciplinary streams having studied the modeling of the growth of transportation networks: these are respectively linked to transportation economics, physics, transportation geography, and biology.

We thus converge with the classification by [Xie and Levinson, 2009b], which propose an extended review of modeling the growth of transportation networks, in a perspective of transportation economics but broadened to other fields. [Xie and Levinson, 2009b] distinguish broad disciplinary streams having studied the growth of transportation networks: transportation geography has developed very early models based on empirical facts but which have focused on reproducing topology rather than mechanisms (the contribution of geography would however consist in limited efforts at the time of [Chorley and Haggett, 1970], which we do not develop further below); statistical models on case studies produce very limited conclusions on causal relations between network growth and demand (growth being in that case conditioned to demand data); economists have studied the production of infrastructure both from a microscopic and macroscopic point of view, generally not spatialized; network science has produced stylised

models of network growth which are based on topological and structural rules rather than rules built on processes corresponding to empirical facts.

2.2.1 Economics

Economists have proposed models of this type: [Zhang and Levinson, 2007] review transportation economics literature on network growth, recalling the three main features studied by economists on that subject, that are road pricing, infrastructure investment and ownership regime, and finally describes an analytical model combining the three. These three classes of processes are related to an interaction between microscopic economic agents (users of the network) and governance agents. Models can include a detailed description of planning processes, such as [Levinson et al., 2012] which combine qualitative surveys with statistics to parametrise a network growth model. [Xie and Levinson, 2009a] compares the relative influence of centralised (planning by a governance structure) and decentralised growth processes (local growth which does not enter the frame of a global planning).

[Yerra and Levinson, 2005] show with an economic model based on self-reinforcement processes (i.e. that include a positive feedback of flows on capacity) and which includes an investment rule based on traffic assignment, that local rules are sufficient to make a hierarchy of the road network emerge with a fixed land-use. [Levinson and Karamalapati, 2003] proceed to an empirical study of drivers of road network growth for *Twin Cities* in the United States (Minneapolis-Saint-Paul), establishing that basic variables (length, accessibility change) have the expected behavior, and that there exists a difference between the levels of investment, implying that local growth is not affected by costs, what could correspond to an equity of territories in terms of accessibility. The same data are used by [Zhang and Levinson, 2017] to calibrate a network growth model which superimposes investment decisions with network use patterns. A synthesis of such approaches is done in [Xie and Levinson, 2011].

2.2.2 Physics

Physics has more recently introduced infrastructure network growth models, largely inspired by this economic literature: a model which is very similar to the last we described is given by [Louf et al., 2013] with simpler cost-benefit functions by obtaining a similar conclusion. Given a distribution of nodes (cities) which population follows a power law, two cities will be connected by a road link if a cost-benefit utility function, which linearly combines potential gravity flow and construction cost (what gives a cost function of the form $C = \beta/d_{ij}^\alpha - d_{ij}$, where α and β are parameters), has a positive value. In this approach, the assumption of non-evolving city populations whereas the networks is iteratively established finds little empirical or thematic support, since we showed that network and cities had comparable evolution time scales. This model is thus closer to produce in the proper sense a *potential network* given a distribution of cities, and must be interpreted with caution. These simple local assumptions are sufficient to make a complex network emerge with phase transitions as a function of the relative weight parameter in the cost function, leading to the emergence of hierarchy. [Zhao et al., 2016] apply this model in an iterative way to connect intra-urban areas, and shows that taking into account populations in the cost function significantly changes the topologies obtained.

An other class of models, close to procedural models in their ideas, are based on local geometric optimization processes, and aim at resembling real networks in their topology. [Bottinelli et al., 2017] thus study a tree growth model applied to ant tracks, in which maintenance cost and construction cost both influence the choice of new links. The morphogenesis model by [Courtat et al., 2011] which uses a compromise between realisation of interaction potentials and construction cost, and also connectivity rules, reproduces in a stylised way real patterns of street networks. A very close model is described in [Rui et al., 2013], but including supplementary rules for local optimization (taking into account degree for the connection of new links). Optimal network design, belonging more to the field of engineering, uses similar paradigms: [Vitins and Axhausen, 2010] explore the influence of different rules of a shape grammar (in particular connection patterns between links of different hierarchical levels) on performances of networks generated by a genetic algorithm.

We can detail the mechanisms of one of these geometrical growth models. [Barthélemy and Flammini, 2008] describe a model based on a local optimization of energy which generates road networks with a globally reasonable shape. The model assumes “centres”, which correspond to nodes of a road network, and road segments in space linking these centres. The model starts with initial connected centres, and proceeds by iterations to simulate network growth the following way: (i) new centres are randomly added following an exogenous probability distribution, at fixed duration time steps; (ii) the network grows following a cost minimisation rule: centres are grouped by projection on the network; each group makes a fixed length segment grow in the average direction towards the group starting from the projection (except if it vanishes in length, a segment then grows in the direction of each point). This model is adjusted in order that areas of parcels delimited by the network follow a power law with an exponent similar

to the one observed for the city of Dresden, Germany. It has the advantage to be simple, to have few parameters (probability distribution for centres, length of segments built), to rely on reasonable local rules. This last point has pitfalls, since we can then expect the model to only capture a reduced complexity, by neglecting various processes such as governance.

2.2.3 Biological networks

An other approach to network growth are biological networks. This approach belongs to the field of morphogenetic engineering, which aims at conceiving artificial complex systems inspired from natural complex systems and on which a control of emerging properties is possible [Doursat et al., 2012]. *Physarum machines*, which are models of a self-organised mould (*slime mould*) have been proved to solve in an efficient way difficult problems (in the sense of their computational complexity) such as routing problems [Tero et al., 2006] or NP-complete navigation problems such as the Traveling Salesman Problem [Zhu et al., 2013]. These properties allow these systems to produce networks with Pareto-efficient properties for cost and robustness [Tero et al., 2010] which are typical of empirical properties of real networks, and furthermore relatively close to these in terms of shape (under certain conditions, see [Adamatzky and Jones, 2010]).

This type of models are relevant since self-reinforcement processes based on flows are analogous to link reinforcement mechanisms in transportation economics. This type of heuristic has been tested to generate the French railway network by [Mimeur, 2016], making an interesting bridge with investment models by Levinson we previously described. For this last study, validation criteria that were applied remain however limited, either at a level inappropriate to the stylised facts studied (number of intersection or of branches) or too general and that can be reproduced by any model (total length and percentage of population deserved), and belong to criteria of form that are typical to procedural modeling which can only difficultly account of internal dynamics of a system as previously developed. Furthermore, taking for an external validation the production of a hierarchical network reveals an incomplete exploration of the structure and the behavior of the model, since through its preferential attachment mechanisms it must mechanically produce a hierarchy. Thus, a particular caution will have to be given to the choice of validation criteria.

2.2.4 Procedural modeling

Finally, we can mention other tentatives such as [De Leon et al., 2007, Yamins et al., 2003], which are closer to procedural modeling [Lechner et al., 2004, Watson et al., 2008] and therefore have only little interest in our case since they can difficultly be used as explicative models (following [Varenne, 2017], an explicative model allows to produce an explanation to observed regularities or laws, for example by suggesting processes which can be at their origin; if model processes are explicitly detached from a reasonable ontology, they can not be potential explanations). Procedural modeling consists in generating structures in a way similar to shape grammars, but it also concentrates generally on the faithful reproduction of local form, without considering macroscopic emerging properties. A shape grammar is a formal system (i.e a set of initial symbols, axioms, and a set of transformation rules) which acts on geometrical objects. Starting from initial patterns, they allow generating classes of objects. Classifying them as morphogenesis models is however imprecise and corresponds to a misunderstanding of mechanisms of *Pattern Oriented Modeling* [Grimm et al., 2005], which consists in seeking to explain observed patterns, generally at multiple scales, in a *bottom-up* way. Procedural modeling does not correspond to such procedural approaches, since it aims at reproducing and not at explaining. Such type of models (exponential mixture to produce a population density for example) can be used to generate initial synthetic data uniquely to parametrise other complex models (see for example [Raimbault, 2019b]).

2.3 Modeling co-evolution

An last approach to modelling mentioned in the introduction the link between transportation networks and territories is to consider them as *co-evolving*, in the sense of intricate relations implying a dynamical modeling and strong coupling in time between the corresponding components. Such models are rather sparse in the literature and correspond to many disciplines without an unified background.

[Achibet et al., 2014] model the co-evolution of buildings and road networks with an agent-based model. [Barthélemy and Flammini, 2008] generalise the model of [Barthélemy and Flammini, 2008] into a co-evolution model by allowing the density of network nodes to dynamically evolve and adapt to centrality. [Ding et al., 2017] describe a co-evolution model coupling multiple layers of the transportation network.

Table 1: **Synthesis of modeling approaches.** The type gives the sense of the relation; the class is the scientific field in which the model is inserted; scales correspond to our simplified scales; functions are given in the sense of [Varenne, 2017]; we finally give the type of results they provide and the paradigms used.

Type	Class	Temporal Scale	Spatial scale	Function	Results	Paradigms
Networks → Territories	LUTI	Medium	Mesoscopic	Planning, Prediction	Land-use simulation	Urban economics
Territories →	Networks Economics	Medium	Mesoscopic	Explanation	Role of economic processes	Economics, Governance
Networks	Geometrical growth	Long	Meso or Macro	Explanation	Reproduction of stylized shapes	Simulation models, Local optimization
	Biological networks	Long	Mesoscopic	Optimization	Production of optimal networks	Self-organized network
Territories ↔	Networks Economics	Medium	Mesoscopic	Explanation	Reinforcement effects	Economics
Networks	Geometrical growth	Long or NA	Micro, Meso or Macro	Explanation	Reproduction of stylized shapes	Simulation models, Local optimization
	Urban Systems	Medium, Long	Macroscopic	Explanation, prospection	Stylized facts	Complex geography

Network growth models described above from the perspective of economics can also be generalised into co-evolution models by making land-use component evolve. [Levinson et al., 2007] integrate into the network investment model an evolving population and unveil self-reinforcing hierarchies. [Li et al., 2016] extend this model by including the dynamics of real-estate prices. [Levinson and Chen, 2005] proposes a prediction model for the coupled dynamics of land-use and transport.

[Raimbault et al., 2014] generalise the model of [Moreno et al., 2012] based on a cellular automaton coupled with an evolving road network, and show that a variety of urban forms can be produced therein. [Raimbault, 2019c] integrates into this model multiple heuristics for network growth and shows their complementarity to also produce various urban forms. [Wu et al., 2017] introduce a model linking population diffusion with an evolving network under local optimisation rules.

Systems of cities are also an appropriate scale to model interactions between territories and transportation networks, and more particularly their co-evolution. [Baptiste, 1999] models inter-urban migrations coupled with the evolution of capacities in the inter-urban road network. [Blumenfeld-Lieberthal and Portugali, 2010] simulate network breakdown as a growth mechanism and integrates population exchanges between cities. [Schmitt, 2014] builds on this model to introduce the SimpopNet model for the co-evolution of cities and transportation networks, which was shown to effectively capture circular causation regimes by [Raimbault, 2020c]. [Raimbault, 2018b] integrates self-reinforcing abstract networks into an urban dynamics model to provide a co-evolution model. This model is generalised to physical transportation networks by [Raimbault, 2020a].

2.4 Synthesis

We synthesise this survey by recalling the broad types of models that we reviewed, organising them by type (relation between networks and territories), by class (broad classes corresponding to the stratification of the review), and by giving the temporal and spatial scales concerned, the functions, the type of result obtained, the paradigms used. This synthesis is given in Table 1. We notice an unbalance between the last section accounting for models integrating effectively a strongly coupled dynamic (and possibly a co-evolution) and the preceding approaches, confirming a sparsity of such approaches suggested before. We will in the next section investigate more generally, from a quantitative viewpoint, the research landscape of the models we surveyed here.

Table 2: **Composition of the initial corpus for the construction of the citation network.**

Discipline	Title	Reference
Political science	<i>Les effets structurants du transport: mythe politique, mystification scientifique</i>	[Offner, 1993]
Interdisciplinary	<i>Réseaux et territoires-significations croisées</i>	[Offner and Pumain, 1996]
Geography	<i>Villes et réseaux de transport: des interactions dans la longue durée (France, Europe, Etats-Unis)</i>	[Bretagnolle, 2009]
Transportation	Land-use transport interaction: state of the art	[Wegener and Fürst, 2004]
Economics	The co-evolution of land use and road networks	[Levinson et al., 2007]
Economics	Modeling the growth of transportation networks: a comprehensive review	[Xie and Levinson, 2009b]
Physics	Co-evolution of density and topology in a simple model of city formation	[Barthélemy and Flammini, 2009]

3 A map of the research landscape

In this section, we propose a bibliometric analysis complementary to the survey above. The idea is not to propose an exhaustive analysis or map of the literature, but to give an interdisciplinary perspective, focusing on the diversity of disciplines and approaches and their complementarity. The method and open source tools applied here are described by [Raimbault, 2019a]. We proceed in particular to (i) a citation network analysis, unveiling endogenous disciplines by clustering the network; (ii) a semantic network analysis, extracting relevant keywords from paper abstracts and retrieving semantic communities in the co-occurrence network; (iii) an analysis of interdisciplinarity patterns by crossing the two semantic and citation network layers.

3.1 Corpus construction

We construct an interdisciplinary corpus by reverse exploration of citation networks. Starting from a seed of initial papers, we collect citing papers up to level two. Our initial corpus is constructed starting from the state-of-the-art established above. Its complete composition is given in Table 2. It includes seven “key” references identified for each of the disciplines previously described. The aim here is not to be exhaustive (it is in the companion paper [Raimbault, 2020b]), but to construct a description of the neighbourhood of domains we deal with, and give a glimpse of their articulation. It is tailored here to have a reasonable size (leading to a final network that can be processed without a specific method regarding the size of data), but the methods used here have been developed on massive datasets, for example with patent data [Bergeaud et al., 2017], the full bibliography of [Raimbault, 2018a] (appendix F).

The Table 2 gives the composition of the initial corpus for the construction of the citation network. We include various disciplines, from planning/transportation to economics and geography, including physics. Publication years are comparable for the paper considered (at the exception of [Offner, 1993] and [Offner and Pumain, 1996] which however belong to disciplines with lower citation rates), to cover comparable research coverages.

Following the methodology of [Raimbault, 2019a], we retrieve from Google scholar all papers citing the seed corpus, and all papers citing these citing papers (constructing a citation network at depth two, consisting in the scientific “heritage” of the seed corpus. The network obtained contains $V = 9462$ references corresponding to $E = 12004$ citation links. In terms of languages, English covers 87% of the corpus, French 6%, Spanish 3%, German 1%, completed by other languages such as Mandarin.

We collect also therefore abstracts for the previous network, in order to do a semantic analysis. As done by [Raimbault, 2019a], abstracts are collected using the Mendeley API. These are available for around one third of references, giving $V = 3510$ nodes with a textual description.

Table 3: Description and size of citation communities.

Domain	Size (% of nodes)
LUTI	18%
Urban and Transport Geography	16%
Infrastructure planning	12%
Integrated planning - TOD	6%
Spatial Networks	17%
Accessibility studies	18%

3.2 Citation network

Basic statistics for the citation network already give interesting informations. The network has an average degree of $\bar{d} = 2.53$ and a density of $\gamma = 0.0013$. The average in-degree (which can be interpreted as a stationary impact factor) is of 1.26, what is relatively high for social sciences. It is important to note that it has a single weak connected component, what means that initial domains are not in total isolation: initial references are shared at a minimal degree by the different domains. We work in the following on the sub-network of nodes having at least two links, to extract the core of network structure. Furthermore, the network is necessarily complete between these nodes since we went up to the second level.

We proceed for the citation network to a community detection with the Louvain algorithm, on the corresponding non-directed network. The algorithm gives 13 communities, with a directed modularity of 0.66, extremely significant in comparison to a bootstrap estimation of the same measure on the randomly rewired network with gives a modularity of 0.0005 ± 0.0051 on $N = 100$ repetitions. Communities make sense in a thematic way, since we recover for the largest the domains presented in Table 3.

Naming of communities are done a posteriori by inspecting their contents, according to the broad fields unveiled in the literature review done previously. We note that this naming is indeed exogenous and necessarily subjective. As further developed for the semantic network, there does not exist any simple technique for an endogenous naming. We must keep this aspect in mind for the positioning of interpretations and conclusions.

The Fig. 1 shows the citation network and allows us to visualise the relations between these domains. It is interesting to observe that works by economists and physicists in this field fall within the same category of the study of *Spatial Networks*. Indeed, the literature cited by physicists contains often a larger number of references in economics than in geography, whereas economists use network analysis techniques. Moreover, planning, accessibility, LUTI models and Transit Oriented Development (TOD) are very close but can be distinguished in their specificities: the fact that they appear as separated communities witnesses of a certain level of compartmentalisation. These make the bridge between spatial network approaches and geographical approaches, which contain an important part of political science for example. Links between physics and geography remain rather low. This overview naturally depends on the initial corpus, but allows us to better understand its context in its disciplinary environment.

3.3 Semantic network

The extraction of keywords is done following an heuristic based on [Chavalarias and Cointet, 2013], further developed by [Bergeaud et al., 2017]. A complete description of the method and its implementation for multi-lingual scientific corpuses is detailed by [Raimbault, 2019a]. It is based on second-order relations between semantic entities, which are *n-grams*, i.e. multiple keywords which can have a length up to three. These are extracted based on their co-occurrence matrix, which statistical properties yield a measure of deviation from uniform co-occurrences. This measure is used to evaluate the relevance of keywords. By selecting a fixed number of relevant keywords $K_W = 10000$, we can then construct a network weighted by co-occurrences.

The topology of the raw network does not allow the extraction of clear communities, in particular because of the presence of hubs that correspond to frequent terms common to many sub-disciplines included here. These words are used in a comparable way in all the studied fields, and do not carry information to separate them (but they would carry some if we were comparing a corpus in quantitative geography and a corpus in qualitative anthropology for example). We focus on terms making the specificity of each sub-field and filter keywords according to a maximal degree k_{max} . Similarly, edges with small weights are considered as noise and filtered according to a minimal edge weight threshold θ_w .

The sensitivity analysis of the characteristics of the filtered network, in particular its size, modularity and

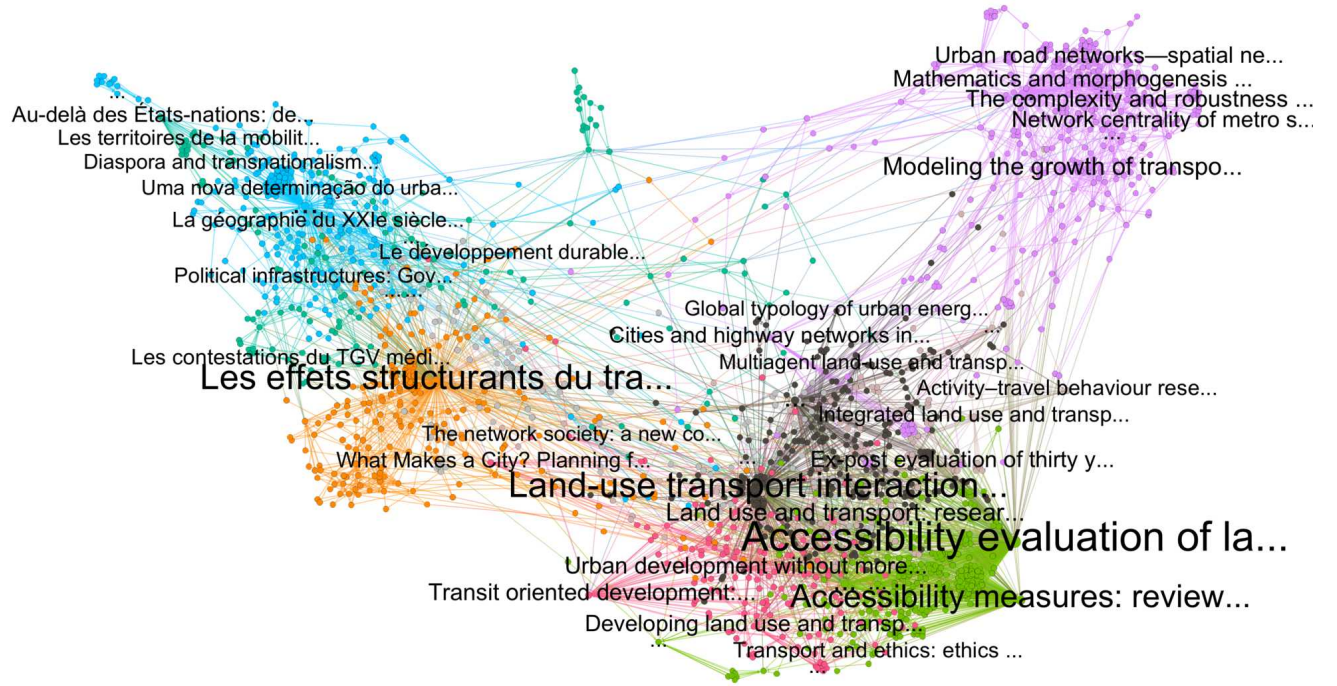


Figure 1: **Citation Network.** We visualise references having at least two links, using a force-atlas algorithm. Colors give communities described in text. In orange, blue, turquoise: urban geography, transport geography, political sciences; in pink, black, green: planning, accessibility, LUTI; in purple: spatial networks (physics and economics).

community structure, is given in Fig. 2. It is used to set the optimal parameters for the semantic network. We choose parameter values allowing a multi-objective optimization between modularity and network size, $\theta_w = 10, k_{max} = 500$, by the choice of a compromise point on a Pareto front, what gives a semantic network of size ($V = 7063, E = 48952$). A visualization of the corresponding semantic network is given in Fig 3.

We then retrieve communities in the network using a standard Louvain clustering on the optimal filtered network. We obtain 20 communities for a modularity of 0.58. These are examined manually to be named, the automatic naming techniques [Yang et al., 2000] being not elaborated enough to make the implicit distinction between thematic and methodological fields for example (and in fact between knowledge domains, see [Raimbault, 2017]) which is a supplementary dimension that we do not tackle here, but necessary to have meaningful descriptions. The communities are described in Table 4. We directly see the complementarity with the citation approach, since emerge here together subjects of study (High Speed Rail, Maritime Networks), domains and methods (Networks, Remote Sensing, Mobility Data Mining), thematic domains (Policy), pure methods (Agent-based Modeling, Measuring). Thus, a reference may use several of these communities. We furthermore have a finer granularity of information. The effect of language is strong since French geography is distinguished as a separated category (advanced analyses could be considered to better understand this phenomenon and benefit from it: sub-communities, reconstruction of a specific network, studies by translation; but these are out of the scope of this exploratory study). We note the importance of networks, and of issues related to political sciences and socio-economic geography.

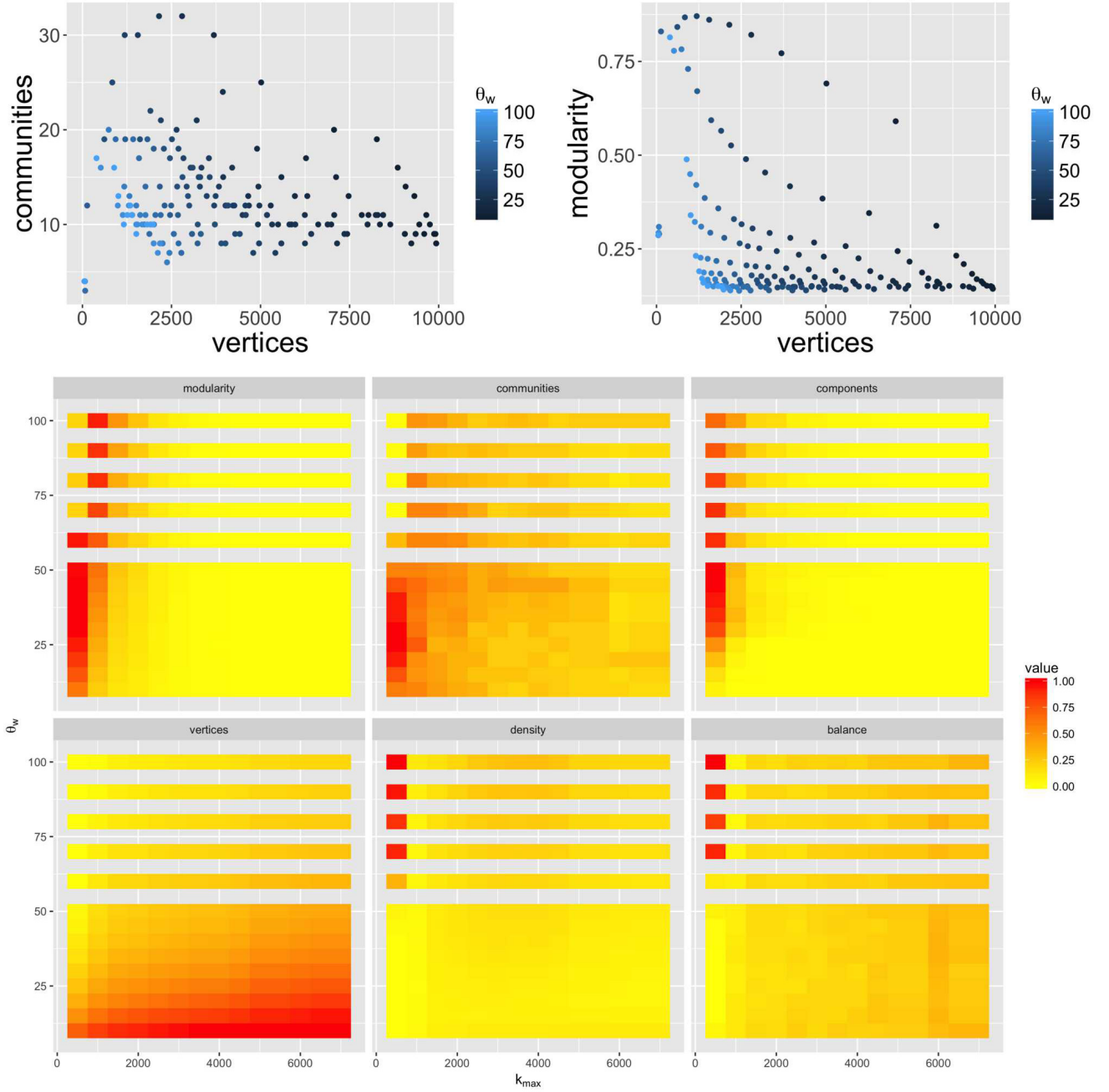


Figure 2: **Sensitivity analysis of modular properties of the semantic network as a function of filtering parameters.** (*Top Left*) Pareto front of the number of communities and the number of vertices (two objectives to be maximised), the colour giving the value of θ_w ; (*Top Right*) Pareto front of the modularity as a function of number of vertices, for varying θ_w ; (*Bottom*) Values of possible objectives (modularity, number of communities, number of connected components, number of vertices, density, size balance between communities), each objective being normalised in $[0; 1]$, as a function of parameters θ_w and k_{max} .

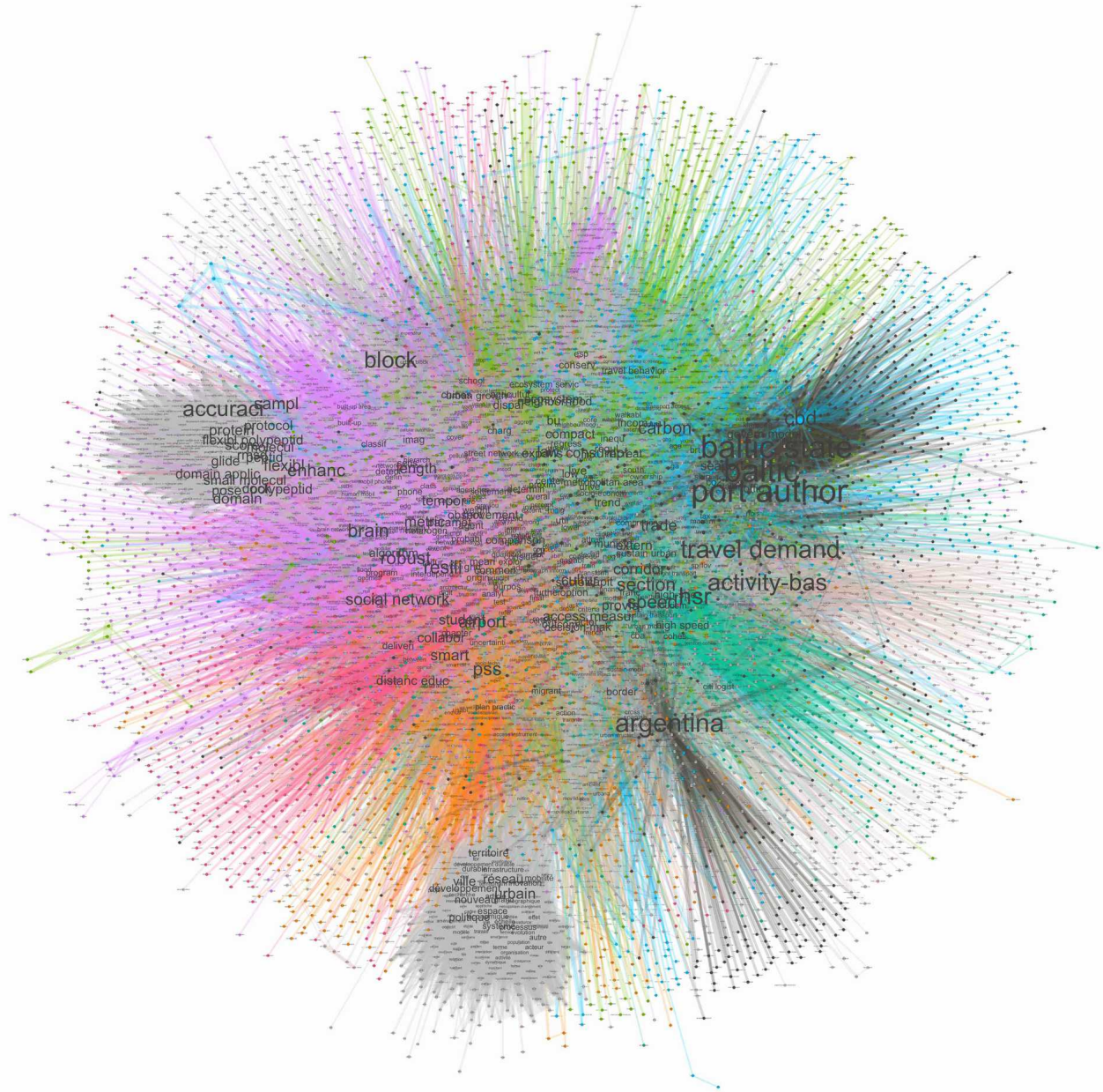


Figure 3: **Semantic network of domains.** The colour of links gives the community and the size of keywords is fixed by their degree.

Table 4: **Description of semantic communities.** We give their size, their proportion in quantity of keywords (under the form of *multi-stems*) cumulated on the full corpus, and representative keywords selected by maximal degree.

Name	Size	Weight	Keywords
Networks	820	13.57%	social network, spatial network, resili
Policy	700	11.8%	actor, decision-mak, societi
Socio-economic	793	11.6%	neighborhood, incom, live
High Speed Rail	476	7.14%	high-spe, corridor, hsr
French Geography	210	6.08%	système, développement, territoire
Education	374	5.43%	school, student, collabor
Climate Change	411	5.42%	mitig, carbon, consumpt
Remote Sensing	405	4.65%	classif, detect, cover
Sustainable Transport	370	4.38%	sustain urban, travel demand, activity-bas
Traffic	368	4.23%	traffic congest, cbd, capit
Maritime Networks	402	4.2%	govern model, seaport, port author
Environment	289	3.79%	ecosystem servic, regul, settlement
Accessibility	260	3.23%	access measur, transport access, urban growth
Agent-based Modeling	192	3.18%	agent-bas, spread, heterogen
Transportation planning	192	3.18%	transport project, option, cba
Mobility Data Mining	168	2.49%	human mobil, movement, mobil phone
Health Geography	196	2.49%	healthcar, inequ, exclus
Freight and Logistics	239	2.06%	freight transport, citi logist, modal
Spanish Geography	106	1.26%	movilidad urbana, criteria, para
Measuring	166	1.0%	score, sampl, metric

3.4 Measures of interdisciplinarity

Distribution of keywords within communities provides an article-level interdisciplinarity measure. The combination of citation and semantic layers in the hyper-network provide second-order interdisciplinarity measures (semantic patterns of citing or cited), that we don't use here because of the modest size of the citation network (see [Raimbault, 2019a] and [Bergeaud et al., 2017]). More precisely, a reference i can be viewed as a probability vector on semantic classes j , that we write in a matrix form $\mathbf{P} = (p_{ij})$. These are simply estimated by the proportions of keywords classified in each class for the reference. A classical measure of interdisciplinarity [Bergeaud et al., 2017] is then $I_i = 1 - \sum_j p_{ij}^2$. Let \mathbf{A} be the adjacency matrix of the citation network, and let \mathbf{I}_k matrices selecting rows corresponding to class k of the citation classification: $\mathbf{I}_k \cdot \mathbf{1}_{c(i)=k}$, such that $\mathbf{I}_k \cdot \mathbf{A} \cdot \mathbf{I}_{k'}$ gives exactly the citations from k to k' . The citation proximity between citation communities is then defined by $c_{kk'} = \sum \mathbf{I}_k \cdot \mathbf{A} \cdot \mathbf{I}_{k'} / \sum \mathbf{I}_k \cdot \mathbf{A}$. We define the semantic proximity by defining a distance matrix between references by $\mathbf{D} = d_{ii'} = \sqrt{\frac{1}{2} \sum (p_{ij} - p_{i'j})^2}$ and the semantic proximity by $s_{kk'} = \mathbf{I}_k \cdot \mathbf{D} \cdot \mathbf{I}_{k'} / \sum \mathbf{I}_k \sum \mathbf{I}_{k'}$.

We show in Fig. 4 the values of these different measures, and also the semantic composition of citation communities, for the main semantic classes. The distribution of I_i shows that articles orbiting in the LUTI field are the most interdisciplinary in the terms used, what could be due to their applied character. Other disciplines show similar patterns, except geography and infrastructure planning which exhibit quasi-uniform distributions, witnessing the existence of very specialised references in these classes. This was an expected result given the targeted sub-fields exhibited (political sciences for example, and similarly prospective studies of type cost-benefit are restricted in scope). This first link between network layers confirms the specificities of each field. Regarding semantic compositions (Fig. 4, top right panel), most provide an external validation of both classification given the dominant classes which are in relative agreement. The field which is the less concerned by socio-economical issues is infrastructure planning, what could give reason to critics of technocracy. Issues on climate change and sustainability are relatively well dispatched. Finally, geographical works are mostly related to governance issues.

Proximity matrices (Fig. 4, bottom) confirm the conclusion obtained previously in terms of citation. Indeed, the intersection between citation classes is low, the highest values being up to one fourth of planning towards geography and of LUTI towards TOD (but not the contrary, since the relations can be in one direction only). However,

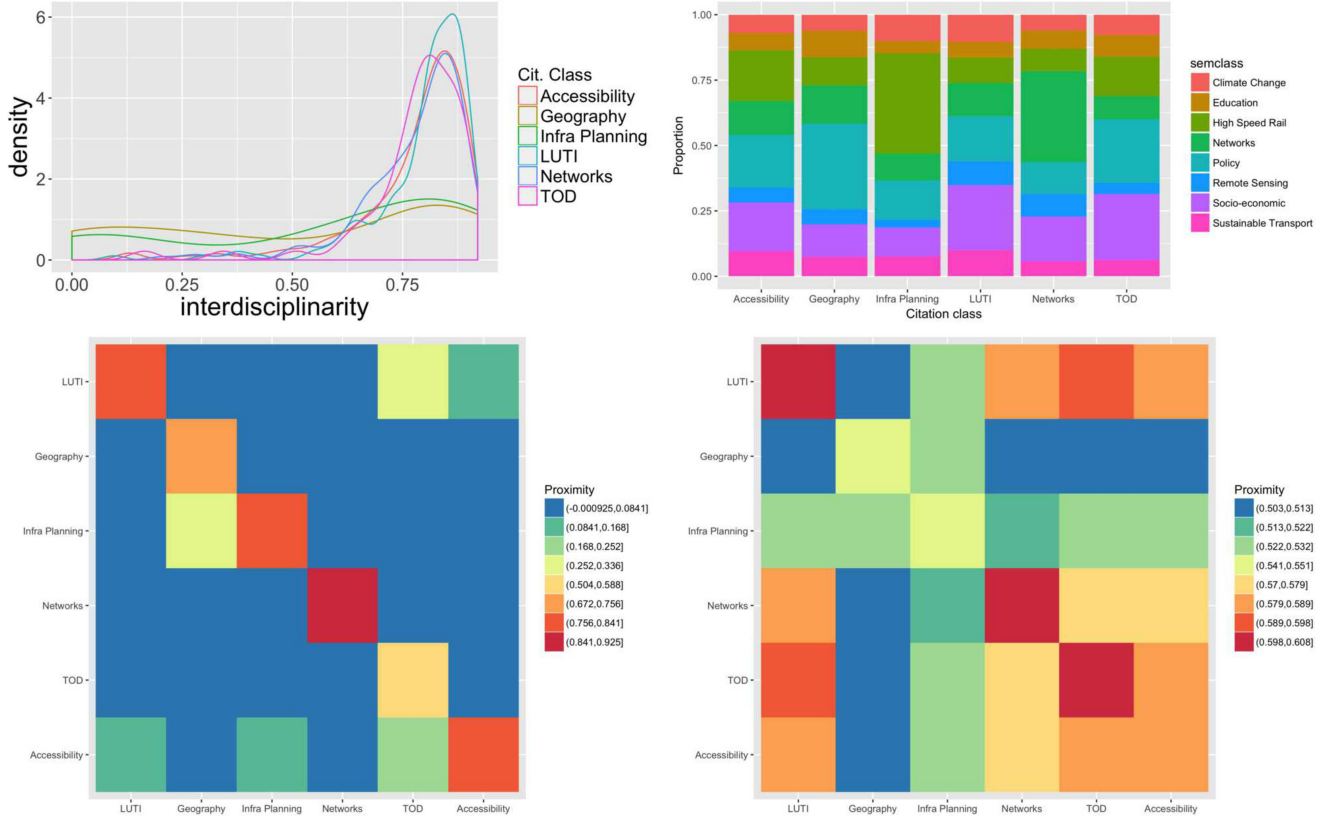


Figure 4: **Patterns of interdisciplinarity.** (*Top Left*) Statistical distribution of I_i by citation classes, in other words distribution of interdisciplinarity levels within citation classes; (*Top Right*) Semantic composition of citation classes: for each citation class (in abscissa), the proportion of each semantic class (in color) is given; (*Bottom Left*) Citation proximity matrix for $c_{kk'}$ between citation classes; (*Bottom Right*) Semantic proximity matrix $s_{kk'}$ between citation classes.

semantic proximities show for example that LUTi, TOD, Accessibility and Networks are close in their semantic contents, what is logical for the first three, and confirms for the last that physicists mainly rely on methods of this fields linked to planning to legitimate their works. Geography is more isolated, its closest neighbour being infrastructure planning. This last result is directly linked to the choice of the seed corpus, with a strong influence of French geography which in practice remains far from urban economics and physics. To what extent transport geography more generally is close to planning and economics remain as an open question for a possible extension of this work. These results globally show that domains sharing terms remain in isolation, despite sharing some common problematics and subjects.

We conclude this analysis with a quantification of proximities between the layers of the hypernetwork. It is straightforward to construct a correlation matrix between two classifications, through the correlations of their columns. We define the probabilities \mathbf{P}_C all equal to 1 for the citation classification. The correlation matrix between it and \mathbf{P} extends from -0.17 to 0.54 and has an average with an absolute value of 0.08, what is significant in comparison to random classifications since a bootstrap with $b = 100$ repetitions with shuffled matrices gives a minimum at -0.08 ± 0.012 , a maximum at 0.11 ± 0.02 and an absolute average at 0.03 ± 0.002 . This shows that the classifications are complementary and that this complementarity is statistically significant compared to random classifications.

The adequacy of the semantic classification in relation to the citation network can also be quantified by the multi-classes modularity [Nicosia et al., 2009], which captures the likelihood that a link is due to the classification studied, taking into account the simultaneous belonging to multiple classes. Thus, the multi-class modularity of semantic probabilities for the citation network is 0.10, what is a strong evidence of an adequacy between layers. Indeed a bootstrap with $b = 100$ gives a value of 0.073 ± 0.003 , what remains limited given the maximal value fixed by citation probabilities within their own network which give a value of 0.81. This furthermore confirms the

complementarity of classifications.

4 Discussion

We have in this paper sketched an overview of disciplines and approaches in relation to the modeling of interactions between transport and land-use, and also their relations. We provide an interdisciplinary bibliometric study, from citation and semantic viewpoint, confirming the diversity and complementarity of approaches. The companion paper of this work [Raimbault, 2020b] aims at understanding with more details and more exhaustively the content of each field and corresponding models.

A possible direction to extend this quantitative epistemological analysis would be to work on full textes related to the modeling of interaction between networks and territories, with the aim to automatically extract thematics within articles. Methods more suited for full texts than the one used here for example include Latent Dirichlet Allocation [Blei et al., 2003]. The idea would be to perform some kind of automatised modelography, extending the modelography methodology developed by [Schmitt and Pumain, 2013], to extract characteristics such as ontologies, model architecture or structures, scales, or even typical parameter values, as done manually in [Raimbault, 2020b]. It is not clear to what extent the structure of models can be extracted from their description in papers and it surely depends on the discipline considered. For example in a framed field such as transportation planning, using a pre-defined ontology (in the sense of a dictionary) could be efficient to extract information as the discipline has relatively strict conventions. In theoretical and quantitative geography, beyond the barrier of diversity of possible formalisations for a same ontology, the organisation of information is surely more difficult to grasp through unsupervised data-mining because of the less framed and literary nature of the discipline: synonyms and figures of speech are more frequent in social sciences and humanities, making it more difficult to extract a possible generic structure of knowledge description.

The methodology developed here is efficient to provide reflexivity instruments, i.e. it can be used to study our approach itself. One of its application is to the scientific journal *Cybergeog* in a perspective of Open Science and reflexivity in [Raimbault, 2019a]. Combined with complementary bibliometrics methods into an interactive web application as described by [Raimbault et al., 2021], this allows journal authors and editors to better situate their work in the literature and thus enhance reflexivity. One other application to scientific reflexivity is done by [Raimbault, 2018a] on its own corpus of references, with the aim to reveal possible neglected research directions or novel issues. A possible way to extend this approach would be to produce scientific maps in a dynamical way, using the `git` history which allows to recover any version of the bibliography at a given date during the duration of the project.

Such approaches also provide a better understanding of knowledge production patterns, what can be linked to quantitative epistemology in general [Chavalarias and Cointet, 2013], and more specifically to the theoretical and empirical construction of knowledge frameworks to grasp complexity, such as the one described by [Raimbault, 2017].

To conclude, we proposed in this paper to survey and map through bibliometric methods a landscape of disciplines dealing with the modelling of land-use and transport, and of relations between these disciplines, in terms of citations but also of level of interdisciplinarity. We showed a high diversity and complementarity, and a strong potential for novel approaches bridging these viewpoints.

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