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# Quantifying Interdisciplinarity of a Generalist Journal

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**Abstract** Insert your abstract here. Include keywords, PACS and mathematical subject classification numbers as needed.

**Keywords** Bibliometrics · Semantic Analysis

## 1 Introduction

Most of scientific disciplines seem to be in a need of more interdisciplinarity and transversal approaches, as explored in a recent special issue of *Nature*, for diverse reasons that may include the development of vertically integrated fields conjointly with horizontal transversal questions. There are naturally ongoing debates on what is exactly interdisciplinarity (many other terms such as transdisciplinarity, crossdisciplinarity also exist) and it actually depends of involved disciplines : recent hybrid disciplines

Existing works in quantitative epistemology using various types of networks have shown interesting potentialities. For the citation network, a good predicting power for citation patterns is for example obtained by Newman (2013). Co-authorship networks can also be used for predictive models Sarigöl et al (2014). A multilayer network approach was recently proposed in Omodei et al (2016), using bipartites networks of papers and scholars, in order to produce measures of interdisciplinarity. Disciplines can be stratified into layers to reveal communities between them and therein collaboration patterns Battiston et al (2015). Keyword networks are used in other fields such as economics of technology : for example, Choi and Hwang (2014) proposes a method to identify technological opportunities by detecting important keywords from the point

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of view of topological measures. Shibata et al (2008) uses topological analysis of the citation network to detect emerging research fronts.

We describe here a study implementing these ideas for the particular case of a scientific journal for which bibliographical data is difficult to obtain, that is **cybergeo**, an electronic journal in theoretical and quantitative geography, that is concerned with open science issues such as peer-review ethics transparency Wicherts (2016). Our approach combine semantic communities analysis (as done in Palchykov et al (2016) for papers in physics but with keyword extraction ; Gurciullo et al (2015) analyses semantic networks of political debates) with citation network to extract e.g. interdisciplinarity measures.

The rest of the paper is organized as follows : we describe in section 2 the context of the dataset, in particular the scientific purpose of the case study journal, and the data collection procedure. We then give in section 3 results on interdisciplinarity landscape obtained through network multilayer analysis of the dataset.

## 2 Data Collection

### 2.1 Implementation

The general architecture for data collection is presented in Fig. ???. Citation data is collected from **Google Scholar**, that is the only source for incoming citations Noruzi (2005) in our case as the journal is not referenced in other databases. We are aware of the possible biases using this single source Bohannon (2014)<sup>1</sup>, but these critics are more directed towards search results than citation counts.

Text processing is done the same way as in previous section, expect that a particular treatment is done to language detection using *stop-words* and a specific tagger **TreeTagger** is used for other languages than english Schmid (1994).

## 3 Methods and Results

### 3.1 Citation Network Properties

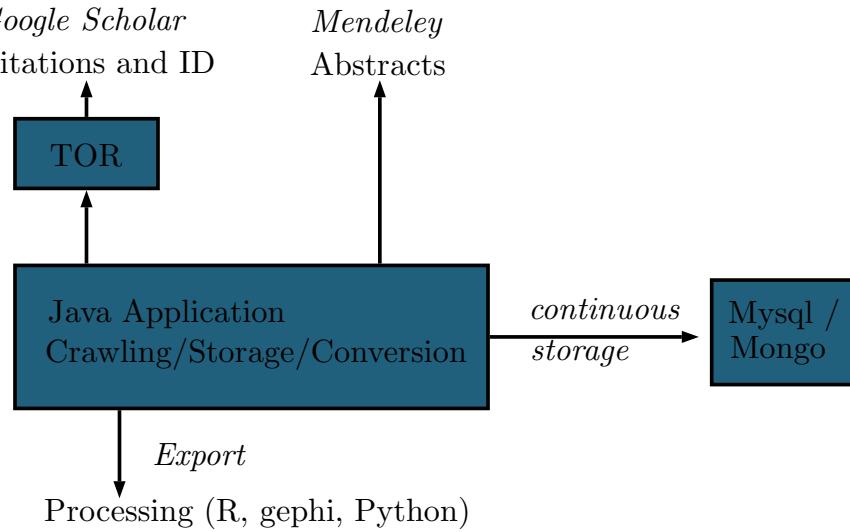
We are able by the reconstruction of the citation network at depth  $\pm 1$  from the original 1000 references of the journal to retrieve around  $45 \cdot 10^6$  references, on which  $2.1 \cdot 10^6$  are retrieved with abstract text allowing semantic analysis.

### 3.2 Semantic Communities Construction

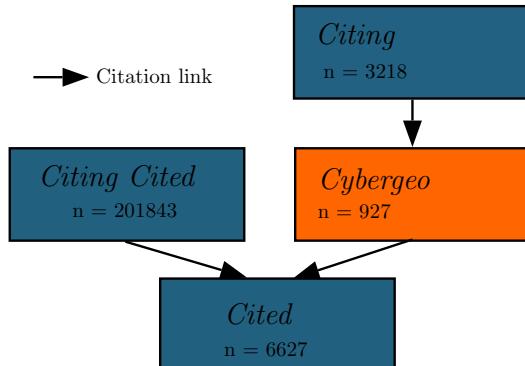
*Relevant Keywords Extraction Text-mining in python with **nltk*** Bird (2006), method adapted from ?

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<sup>1</sup> or see <http://iscpif.fr/blog/2016/02/the-strange-arithmetic-of-google-scholars>

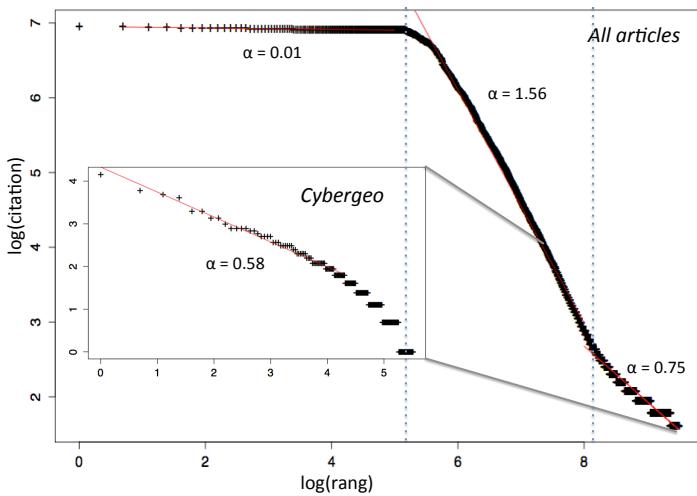


**Fig. 1** Heterogeneous Bibliographical Data Collection. Architecture of the application for content (semantic data), metadata and citation data collection. The heterogeneity of tasks requires a multi-lingual approach. Source code and more precise informations on architecture are available on the [git](#) repository of the project at .

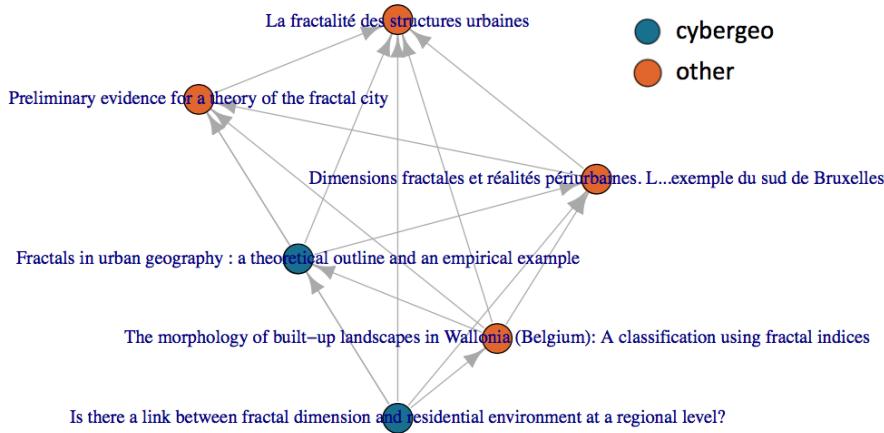


**Fig. 2** Structure and content of the citation network. The original corpus of *Cybergeo* consists in 927 articles, themselves cited by a slightly larger corpus (yielding a stationary impact factor of around 3.18), cite  $\simeq 6600$  references, themselves co-cited by more than  $2 \cdot 10^6$  works.

- Language detection using *stop-words*
- Parsing and tokenizing / pos-tagging (word functions) / stemming done differently depending on language :
  - English : `nltk` built-in pos-tagger, combined to a *PorterStemmer*
  - French or other : use of `TreeTagger` Schmid (1994)
- Selection of potential *n-grams* (with  $1 \leq n \leq 4$ ) : English  $\bigcap \{NN \cup VBG \cup JJ\}$  ; French  $\bigcap \{NOM \cup ADJ\}$



**Fig. 3** Properties of the citation network. Rank-size plot of in-degrees ; three superposing successive regimes must correspond to different literature types or practices across disciplines.



**Fig. 4** Example of a maximal clique in the citation network, paper of *cybergeo* being in blue. Such topological structure reveal citation practices such as here a systematic citation of previous works in the research niche.

- Database insertion for instantaneous utilisation ( $10j \rightarrow 2\text{min}$ )
- Estimation of *n-grams* relevance, following co-occurrences statistical distribution

### Semantic Network

*Communities Construction* We retrieve by community detection in the semantic network typical geographical disciplines, such as :

- Political sciences/critical geography (535) : decision-mak, polit ideolog, democraci, stakehold, neoliber
- Biogeography (394) : plant densiti, wood, wetland, riparian veget
- Economic geography (343) : popul growth, transact cost, socio-econom, household incom
- Environment/climate (309) : ice sheet, stratospher, air pollut, climat model
- Complex systems (283) : scale-fre, multifract, agent-bas model, self-organ
- Physical geography (203) : sedimentari, digit elev model, geolog, river delta
- Spatial analysis (175) : spatial analysi, princip compon analysi, heteroscedast, factor analysi
- Microbiology (118) : chromosom, phylogeneti, borrelia
- Statistical methods (88) : logist regress, classifi, kalman filter, sampl size
- Cognitive sciences (81) : semant memori, retrospect, neuroimag
- GIS (75) : geograph inform scienc, softwar design, volunt geograph inform, spatial decis support
- Traffic modeling (63) : simul model, lane chang, traffic flow, crowd behavior
- Health (52) : epidem, vaccin strategi, acut respiratori syndrom, hospit
- Remote sensing (48) : land-cov, landsat imag, lulc
- Crime (17) : crimin justic system, social disorgan, crime

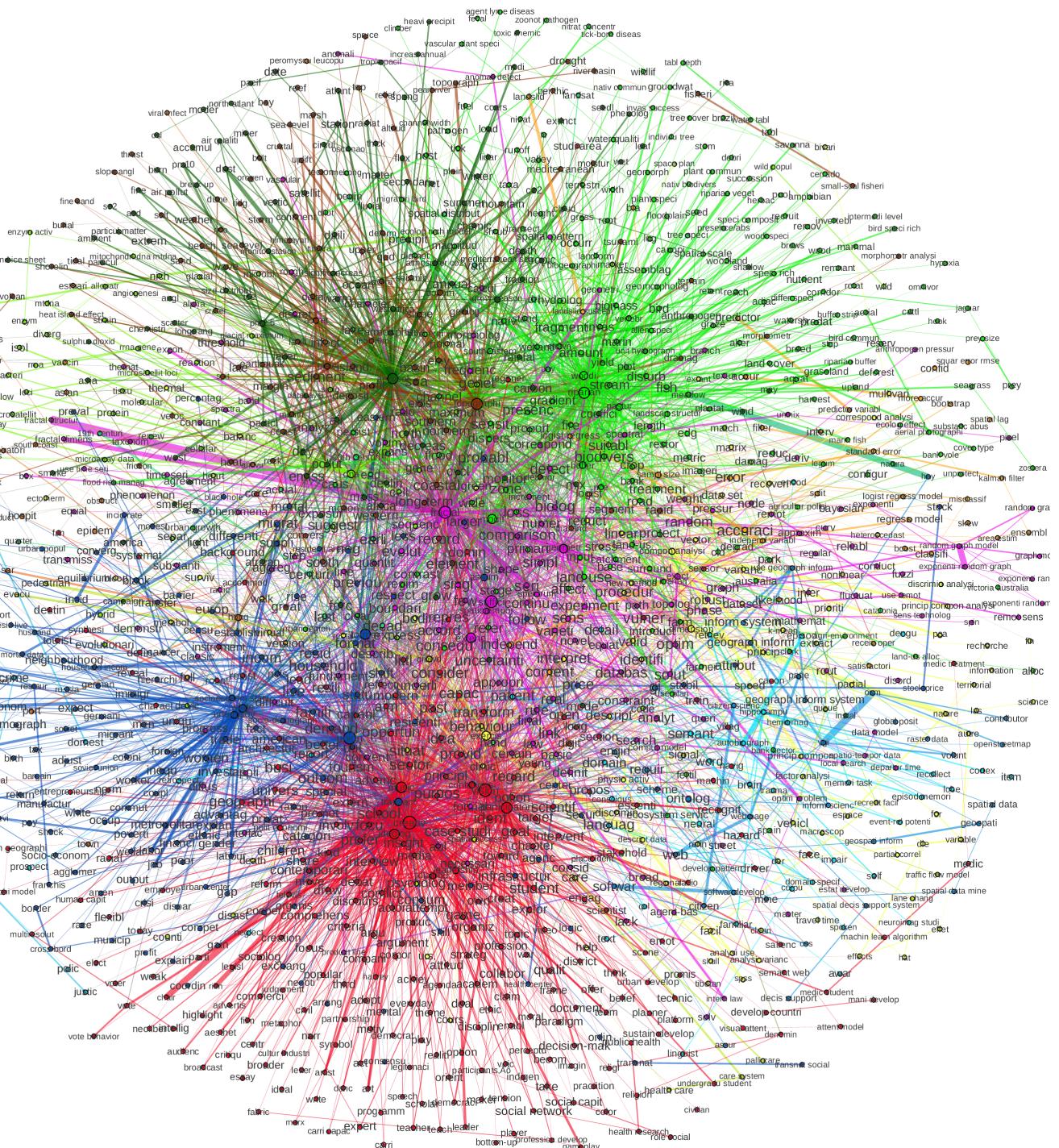
### 3.3 Measures of Interdisciplinarity

Distribution of keywords within reconstructed disciplines provides an article-level interdisciplinarity, and we can construct various measures at the journal level. Combination of citation and semantic layers in the hyper-network provide second order interdisciplinarity measures. The construction of null models for comparison and the collection of currently missing data (journals for other papers) are currently ongoing so these results are not presented here.

## 4 Discussion

## 5 Conclusion

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**Fig. 5** Semantic network of concepts in quantitative geography. Corpus consists of around  $2 \cdot 10^5$  abstracts of publications at a topological distance shorter than 2 from the journal *cybergeo* in the citation network. Relevance of keywords were estimated with a bootstrap method, and semantic network is constructed by co-occurrences of keywords (filtered following the procedure detailed in text, with cut at larger degrees of 10% here to delete hubs such as **model** or **space** and efficiently reveal communities). A zoomable vectorial file (**.svg**) of the network is available as Supplementary Material.

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