

# Towards Coupling Transportation Networks and City Growth in Complex Urban Systems Models

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## 1 General Presentation

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- Algorithmic Systematic Review
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# Scientific Context

Interactions between urban development and transportation network are considered to be central in dynamics of complex urban systems at any spatial and temporal scale [Bretagnolle, 2009][Offner, 1993]. As many underlying time scales are involved in dynamics, very few modeling efforts have been done towards models simulating simultaneously both growths.

Such geographical models would have both

- theoretical interest, in understanding processes involved in coevolution
- direct practical applications (e.g. planning) in the case of partially data-driven models

# Research Question

**Research question (current and very general, will necessarily evolve):**

*Are there some scale and level of thematic genericity at which it is possible to construct models of simulation aiming to couple urban and network growth ? To what extent can these models be data-driven in the aim of application to case studies ?*

# Methods and Approach

- Broad Complex Systems point of view (from physics to geography, economy, etc).
- Multidisciplinary research teams, two laboratories at the best both thematically and technically (LVMT : transportation, urban economy), Géocits-Paris : quantitative geography, spatial integration
- Recent progress in numerical exploration of models, work will be based on a strong basis from technical point of view [Reuillon et al., 2013, Schmitt et al., 2014]

# State of the Art

- Thematic literature on codevelopment [Bretagnolle, 2009, L'Hostis et al., 2012]
- Network growth literature : geometrical network growth [Barthélemy and Flammini, 2008], economic network growth (empirical micro and macro economic studies on stylized facts of transportation network growth) [Xie and Levinson, 2009], biological network growth [Adamatzky and Jones, 2010, Tero et al., 2010]
- LUTI models : influence of transportation on land-use change [Chang, 2006, Iacono et al., 2008]
- Various urban morphogenesis models [Achibet et al., 2014, Bonin et al., 2012]
- Spatial Econometrics studies, trying to find statistically significant relations (causalities or correlations), such as e.g. [Duranton and Turner, 2012, Levinson, 2008]
- Few studies from this various field propose to couple both growths : [Barthélemy and Flammini, 2009, Achibet et al., 2014, Raimbault et al., 2011, Levinson et al., 2007]

# Technical Tools

- Systematic use of git as a backup/transparency/reproducibility/etc. tool ; integrality of the work on a public repository
- Model/methods implementation : agnostic in languages and tools (NetLogo, R, Java, Python, Shell etc)
- Model exploration : use of OpenMole as soon as possible.
- Intensive computation : reasonable tasks (max 4 weeks CPU-time) run on personal remote 4-cores server (NetLogo, R, Java)

# Model Coupling

Need for qualitative and quantitative considerations on modular model construction and validation → importance of model coupling.

Many literature on model construction :  
iterative process in [Cottineau et al., 2015]  
towards a meta-model in [Goldspink, 2000] ; etc.

Environments and formalisms for system integration (more from engineering background) : [Golden et al., 2012] ; DEVS formalism [Zeigler, 1989], or Object-Process Methodology [Dori, 2002].



# Towards a Quantification of Model Coupling

## *Intuitive formulation*

Let  $M_1, M_2$  some models,  $c(M_i)$  corresponding Kolmogorov complexity,  $\alpha(M_i)$  model parameters,  $o(M_i)$  models outputs,  $\sim$  an equivalence relation between models.

**Def :**  $M$  couples (or extends)  $M_1, M_2$  if  $\alpha(M_1) \cup \alpha(M_2) \subset \alpha(M)$  and  $\exists \vec{\alpha}_1, \vec{\alpha}_2, \forall \vec{X}, i, M[\vec{\alpha}_i, \vec{X}] \sim M_i[\vec{\alpha}_i|_{\alpha(M_i)}, \vec{X}]$

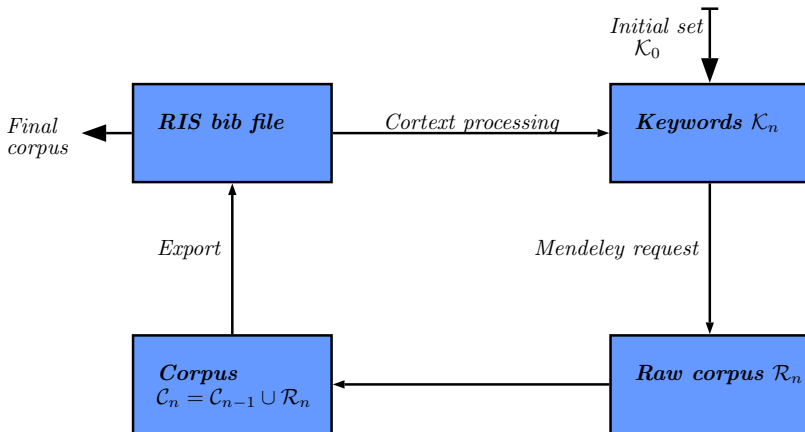
Given constraints on outputs  $o(M) = o'$ , it should be possible to define minimal coupling  $\langle M_1 \otimes M_2 \rangle$  as an equivalence class of models.

*Proposition of definitions of coupling strength :*

*Computational coupling strength :*  $\kappa_1 = \frac{c(M_1 \otimes M_2)}{c(M_1) + c(M_2)}$

*Functional coupling strength :*  $\kappa_2 = d(o(M_1 \otimes M_2), o(M_1) \cup o(M_2))$

# Iterative algorithm, inspired from [Chavalarias and Cointet, 2013]



# Algorithm Implementation

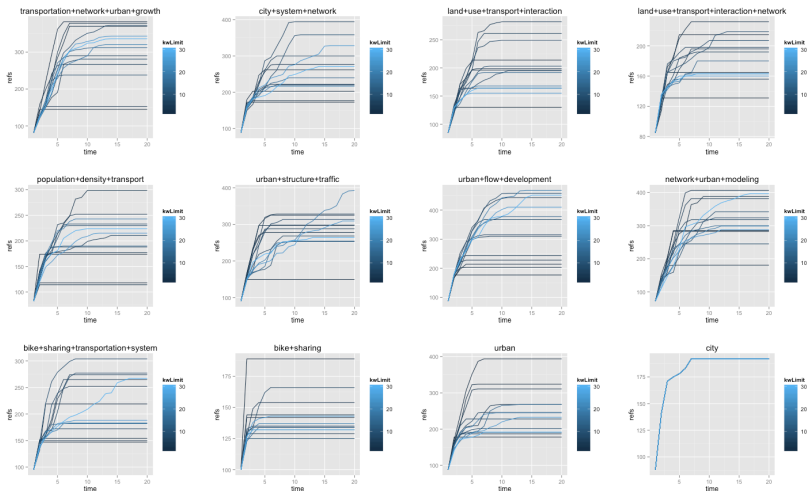
**Catalog Requests :** Mendeley API, easy to use and relatively open.

*Ongoing work :* Implement a Google scholar API to compare relative exhaustivities of catalogs.

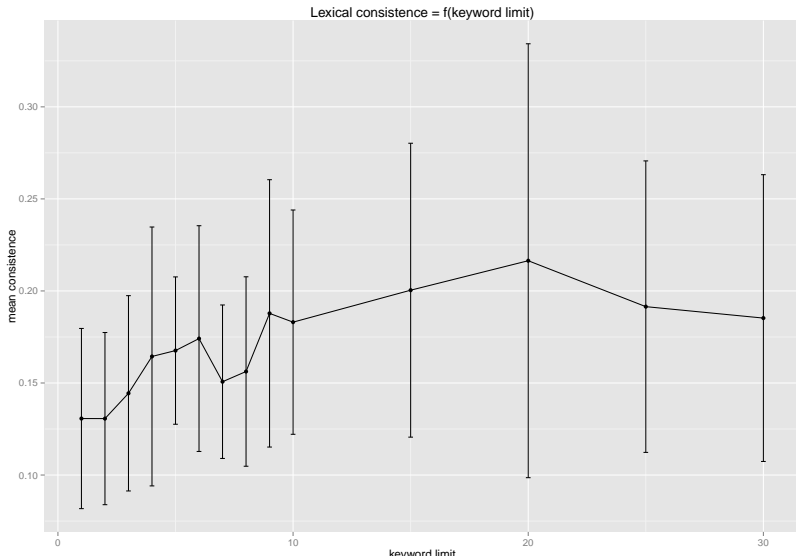
**Natural Language Processing :** Procedure given in supplementary material of [Chavalarias and Cointet, 2013] ; difficultly reproducible (!), so implemented web API to Cortext project website that provides the service online.

*Wrapped as an executable program.* Allows distribution and tests by others (under acceptation of Cortext API) ; but also behavior exploration from external application (R in our case).

# Results : convergence

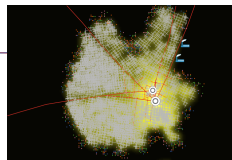
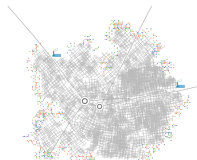


## Results : lexical consistence



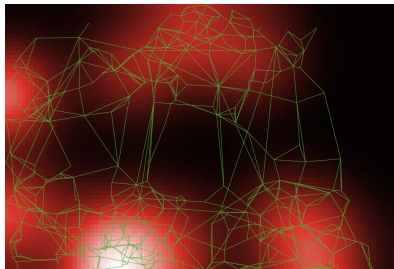
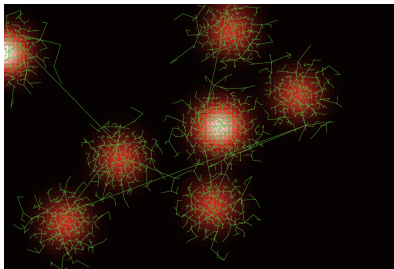
# On the need of model formalization for reproducibility

Model for Tijuana bordertown, integrated in NL Urban Suite [De Leon et al., 2007]  
Unvoluntary falsification of results.



# On the need of rigorous implementation

Geometrical street network growth model [Barthélemy and Flammini, 2008]  
Non-reproducible results.



## **Long Term Planning, 6 months**

State of the Art, Literature Review, Quantitative modelography, refined research question.

## **Short Term Planning, 1 month**

Finish systematic review (corpus synthesis, “hand” systematic review), implement and compare various models (ex. quantitative comparison of network growth models), test various paths (e.g. Florent’s model on endo-geneisation of transportation infrastructure evolution)



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