

# An Applied Knowledge Framework to Study Complex Systems

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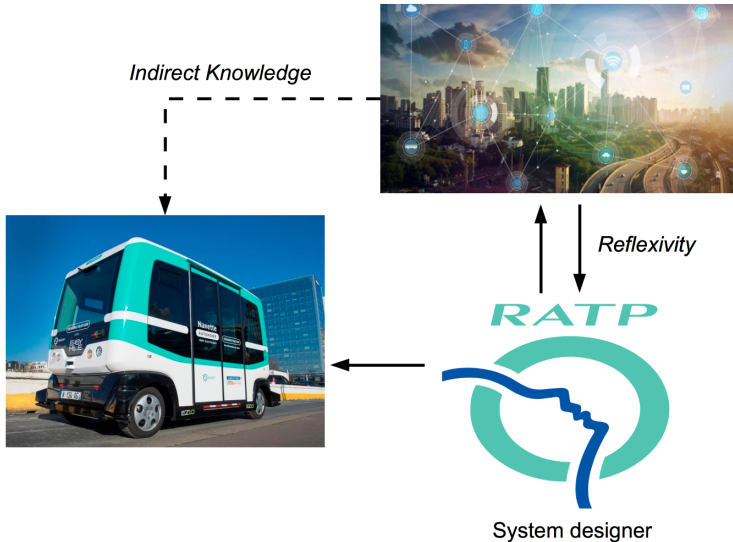
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# Reflexivity in System Engineering ?



Source : [www.ratp.fr](http://www.ratp.fr)

# Processes of Knowledge Production

*The study of processes of knowledge production as an asset to study complex systems ?*

→ Philosophical and epistemological approaches to the nature of knowledge : [Kuhn, 2012]'s structure of scientific revolutions, [Feyerabend, 2010]'s advocacy for diverse viewpoints.

→ Quantitative approaches : beyond simple bibliometrics  
[Cronin and Sugimoto, 2014]

*Following [Morin, 1991], the Knowledge of Knowledge arise from and for the study of Complex Systems : knowledge of the complex is complex knowledge (requisite complexity [Gershenson, 2015])*

# Knowledge Frameworks

**Knowledge Framework :** *A systemic framework containing an epistemological component dealing with the nature of knowledge or knowledge production.*

→ Knowledge management : [Durantin et al., 2016] coupling engineering with design paradigms ; [Carlile, 2004] knowledge at the boundaries of disciplines.

→ Meta-modeling frameworks : [Cottineau et al., 2015] multi-modeling ; [Golden et al., 2012] unified formal description of Complex Systems.

→ Applied frameworks : [Moulin-Frier et al., 2017] typology of approaches in Artificial Intelligence.

## Research objective

- Existing frameworks specific to a field or discipline, or to a given approach or methodology.
- Can be more or less applied or operational.

### **Research objective :**

*Based on knowledge domains proposed by [Livet et al., 2010], develop a generic Applied Knowledge Framework, capturing some structure of knowledge (epistemological level) with a direct link with concrete applications (discipline level).*

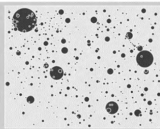
## Approach and Methodology

**Approach** : An inductive approach from a case study in Theoretical and Quantitative Geography, developed in the last 20 years (Evolutive Urban Theory [Pumain, 1997])

**Methodology** : Mixed methods. Interview with main contributors of the theory, from different disciplines (D. Pumain, C. Cottineau in Geography, R. Reuillon in Computer Science) ; quantitative analysis of citation network.

# Evolutionary Urban Theory

## Spatio-temporal scales



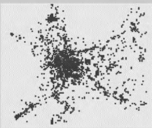
1 day

## Emerging properties

Hierarchy  
Functional diversity  
Spatial pattern

## Organization levels

**Macro: System of cities**  
(urban networks)



1 hour

Centrality  
Function  
Morphology  
"Ambiance urbaine"

**Meso: City**  
(urban areas)

## Descriptors

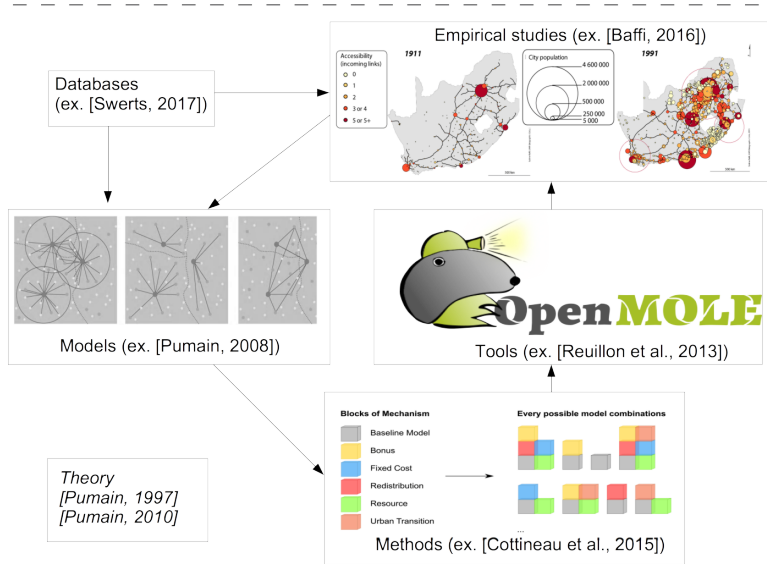


Life cycle  
Profession  
Power

**Micro: Actors**  
(households, firms, institutions)

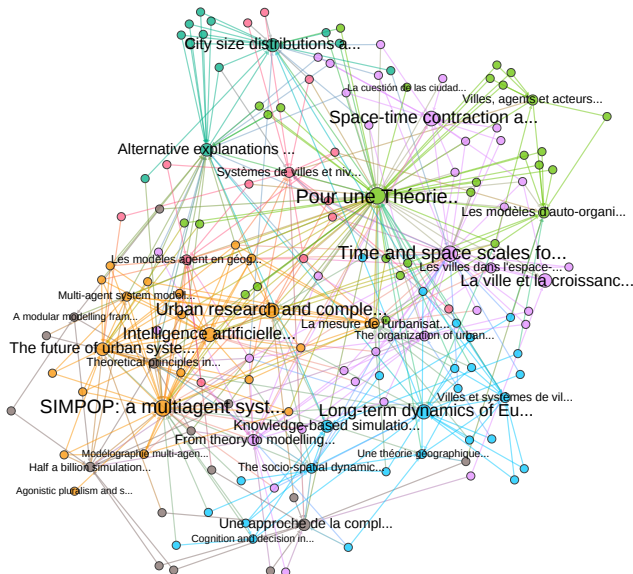
Source :  
[Pumain, 2008]

# Iterative Construction of Knowledge across Domains





# Citation Network Analysis



*Core citation network of Evolutive Urban Theory*

$$|V| = 155$$

$$|E| = 449$$

7 communities,  
modularity 0.39

## Constraints on the Framework

*We postulate the following integration constraints for the framework :*

- Integration of disciplines, as Complex Systems are mostly interdisciplinary.
- Integration of knowledge domains : no particular type of knowledge must be privileged in the production process.
- Integration of types of methodologies : for example different modeling approaches can be taken into account.

# Epistemological Foundations

Giere's cognitive approach to science [Giere, 1990] : cognitive agents have *perspectives* on aspects of the real world.

**Scientific perspectivism** [Giere, 2010] : *cognitive agents* use *media*, the models, to represent something with a certain purpose.

[Varenne, 2017]'s classification of main model functions : perception and observation, understanding, theory building, communication, decision making.

# Knowledge Domains

## *Definition of Knowledge Domains :*

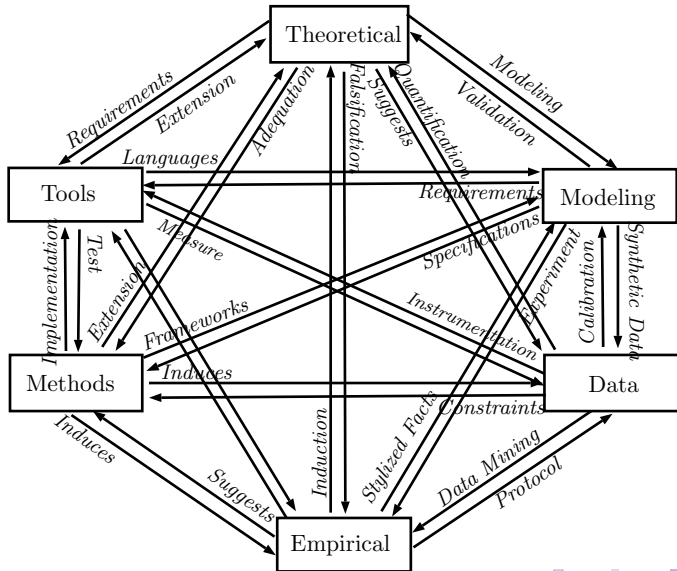
- **Empirical.** Empirical knowledge of real world objects.
- **Theoretical.** Conceptual knowledge, implying cognitive constructions.
- **Modeling.** The model as the formalized *medium* of the perspective.
- **Data.** Raw information that has been collected.
- **Methods.** Generic structures of knowledge production.
- **Tools.** Implementation of methods and supports of others domains.

# Co-evolution of Knowledge within domains

## Description of the Knowledge Framework :

- 1 Any scientific knowledge construction on a complex system can be understood as a perspective, decomposed into knowledge domains.
- 2 Contents within domains *coevolve* [Holland, 2012] between themselves and with other elements of the perspective (including cognitive agents and the purpose).
- 3 It implies weak emergence [Bedau, 2002] what is consistent with the existence of bodies of knowledge.

# Illustration of interactions between domains



# Application : Engineering the Metropolitan

**Table:** Illustration of Knowledge Framework Application

<b>Engineering Issue</b>	<b>Knowledge Domains</b>	<b>Transferability</b>	<b>References</b>
Autonomous Transportation	Empirical, Modeling	Integrated Modeling	[Belmonte et al., 2008]
Innovative Modeling	Modeling, Methods	Method development	[Balbo et al., 2016]
Functional Requirements	Empirical, Tools	Ergonomic tools	[Foot, 2005]
Societal Adaptation	Theoretical, Empirical	Stakeholders involvement	[Foot, 1994], [Hatchuel et al., 1988]
Technical Requirements	Empirical, Modeling	Integrated Modeling	[Moreno Regan, 2016]

## Discussion : Application

### Application

→ Sounds like a generic framework, but as it arises from the structure of complex knowledge itself, is anchored within reflexivity and therefore aimed at a direct application.

→ Different levels of integration make it particularly suited to study Complex Systems. Specifications or targeted application guidelines would decrease integration ?



## Discussion : Developments

### Developments

- Towards a formalisation : perspectives as dataflow machines [Golden et al., 2012] with an ontology [Livet et al., 2010] ; canonic decomposition of ontologies with emergence structure, condition with correspondance with the canonic decomposition of the machine to be investigated.
- Towards a quantification : applying coupled semantic and citation networks analysis [Raimbault, 2017], empirical investigation of knowledge domains co-evolutionary dynamics within a targeted corpus.

## Conclusion




→ We constructed an applied knowledge framework by induction from the study of the genesis of a scientific theory.

→ Operational application to diverse cases and engineering issues still to be tested.

- Code, data and results available at <https://github.com/JusteRaimbault/CityNetwork/Models/QuantEpistemo/EvolutiveUrbanTheory>
- Transcripts of interviews at <https://github.com/JusteRaimbault/Entretiens>
- Paper on arXiv at <https://arxiv.org/abs/1706.09244>
- Acknowledgments : I thank D. Pumain, R. Reuillon and C. Cottineau for giving of their time for the interviews.

## Reserve Slides

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