

# Thesis Progress Meeting

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# Achieved Work (by projects)

- SFICSSS [4.7w] (+ holidays [2.5w])
- Network-Density (RGS) [1.7w] (ETA 1w)
- Interaction Gibrat (CCS) [1w] (/th. paper, ETA 1w)
- China [0.2w]
- Reviewing [0.3w]
- Transportation Eq [0.3w]
- Biblio/reading [1.2w] ; Conference [1.9w] ; Misc [1.4w]

# For a Cautious Use of Big Data and Computation (RGS-AC 2016)

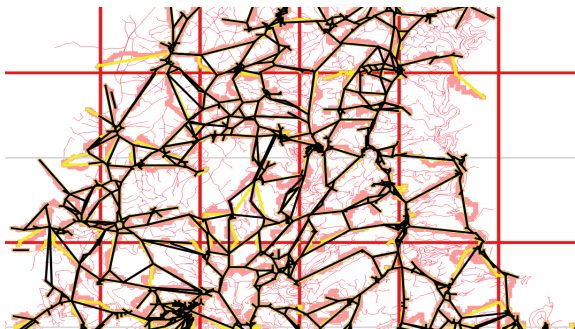
**Presentation Rationale :** *Large scale computation and Big Data make no sense (are endangered) without theory and/or analytical preliminaries*

**Case Study :** *Static Correlations between urban form and network measures ; insights into ergodicity and stationarity*

# Dataset construction

Computation of topological road network for all Europe, at 100m granularity scale (to be used consistently with population grid [EUROSTAT, 2014])

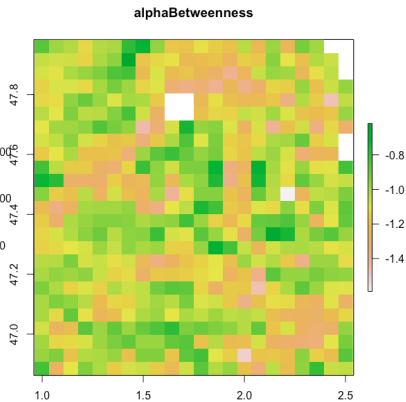
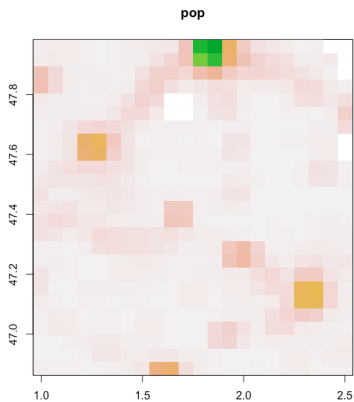
→ Import of OSM into postgresql, simplification at 100m granularity, topological simplification with split/merge algorithm



$\simeq 44 \cdot 10^6$  links in  
initial OSM db,  
 $\simeq 61 \cdot 10^6$  in first  
simplified layer,  
 $\simeq 21 \cdot 10^6$  in final  
database

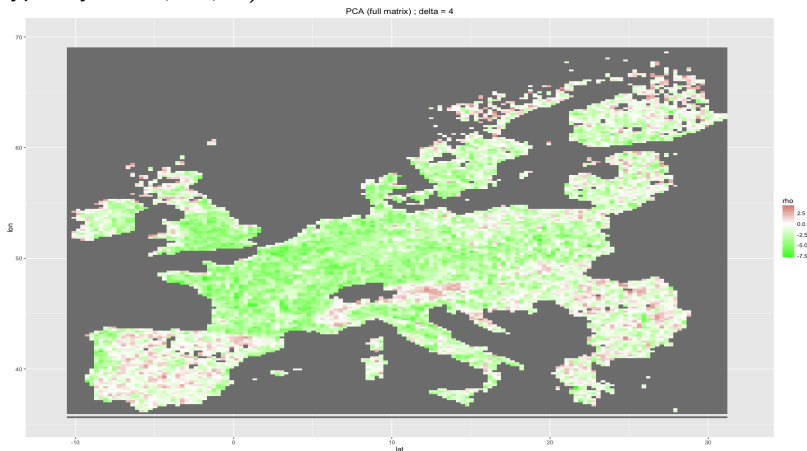
# Results : Computation of Indicators

*Computation of urban form indicators [Le Néchet, 2015] and network indicators on  $l_0 = 10\text{km}$  side square*



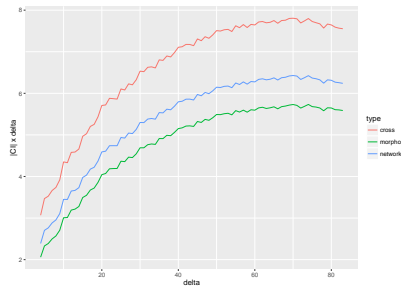
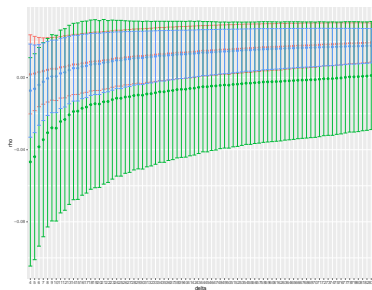
# Results : Spatial Correlations

*Computation of spatial correlation on square areas of width  $\delta \cdot l_0$  (with typically  $\delta = 4, \dots, 16$ )*



→ local spatial stationarity of processes

# Results : Multi-scale Processes



→ Significant variation of mean correlation with  $\delta$  (Left) and of normalized confidence interval (Right) given by  $|\rho_+ - \rho_-| \cdot \delta$ , as bounds theoretically vary as  $\sqrt{N} \sim \sqrt{\delta^2}$  : implies multi-scalarity

# Empirical Findings (Formalization)

$Y_i[\vec{x}, t]$  spatio-temporal stochastic process, verifies empirically :

- 1 Local spatial autocorrelation is present and bounded by  $l_\rho$  (in other words the processes are continuous in space) : at any  $\vec{x}$  and  $t$ ,  

$$|\rho_{\|\Delta\vec{x}\| < l_\rho} [Y_i(\vec{x} + \Delta\vec{x}, t), Y_i(\vec{x}, t)]| > 0.$$
- 2 Processes are locally parametrized :  $Y_i = Y_i[\alpha_i]$ , where  $\alpha_i(\vec{x})$  varies with  $l_\alpha$ , with  $l_\alpha \gg l_\rho$  and weakly locally stationary in space.
- 3 Processes are multi-scalar : since  $\rho(\delta = \infty) > \rho(\delta = 0)$ , a necessary non-linear correction on processes spatial averages in correlation computation is present.



# Analytical Deductions

1. **Regimes of temporal correlations.** Let assume local ergodicity in  $\vec{x}_0$  at scale  $\delta \cdot l_0$  (reasonable with urban growth and network extension in recent times). The Ergodic theorem implies that  $\exists \mathcal{T}$  such that

$$\langle Y_i(t) \rangle_{\|\vec{x} - \vec{x}_0\| < \delta \cdot l_0} = \langle Y_i(\vec{x}_0) \rangle_{t \in \mathcal{T}}$$

With spatial stationarity,  $\langle Y_i \rangle_{\vec{x}_0} = \langle Y_i \rangle_{\vec{x}_1}$ , thus  $\mathcal{T}$  must be constant to be invariant by translation. By contraposition and (2), processes have different dynamical characteristics.

2. **Global non-ergodicity.** Let  $X_k$  a partition of space into local areas. We have  $\langle \cdot \rangle_x = \sum_k w_k \langle \cdot \rangle_{x_k} = (1) \sum_k w_k \langle \cdot \rangle_{\mathcal{T}_k}$ . On the other hand, global ergodicity would give  $\langle \cdot \rangle_t = \langle \cdot \rangle_{\mathcal{T}} = \sum_k w_k \langle \cdot \rangle_{\mathcal{T}}$  and  $\sum_k w_k (\langle \cdot \rangle_{\mathcal{T}} - \langle \cdot \rangle_{\mathcal{T}_k}) = 0$ . Being true on each subset implies  $\mathcal{T} = \mathcal{T}_k$ , what contradicts (1).

# Simple Models of Growth for System of Cities (CCS 2016)

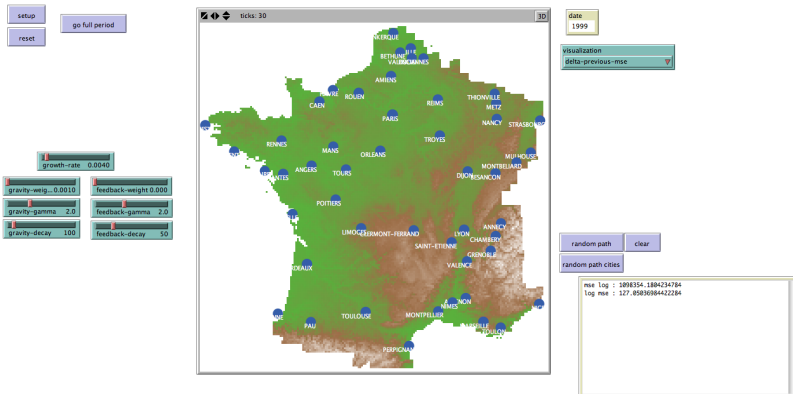
## Presentation Content :

→ *Gravity/Network feedback spatial interactions models of growth : presentation and current results*

→ *Proposition of an empirical AIC methodology, application to the model*

# Implementation

*On the importance of visualization in spatial models : complementary implementations in NetLogo/R/Scala*



# Quantifying overfitting : Empirical AIC

*Not clear nor well theorized how to deal with overfitting in models of simulation. **Intuitive idea :*** Approximate gain of information by approaching models of simulation by statistical models.

Let  $M_k^* = M_k[\alpha_k^*]$  computational models heuristically fitted to the same dataset. With  $S_k \simeq M_k^*$ , we show that  $\Delta D_{KL}(M_k^*, M_{k'}^*) \simeq \Delta D_{KL}(S_k, S_{k'})$  if fits of  $S_k$  are negligible compared to fit difference between computational models and models have same parameter number.

**Application**  $M_1$  : gravity only model with ( $r_0 = 0.0133, w_G = 1.28e - 4, \gamma_G = 3.82, d_G = 4e12$ ) ;  $M_2$  : full model with ( $r_0 = 0.0128, w_G = 1.30e - 4, \gamma_G = 3.80, d_G = 8.4e14, w_N = 0.603, \gamma_N = 1.148, d_N = 7.474$ )  
 Fitting of independent polynomial models ( $\tilde{P}_i(t) = Q[\tilde{P}_i(t-1)]$ ) with 4 and 7 parameters) gives  $\Delta D_{KL} \simeq 19.7 \rightarrow$  fit improvement without overfitting

# Extension/Application of Lutecia model

- Empirical description of governance structure for transportation within the MCR, associated issues.
- Application of the model to the real case (after refined exploration, sensitivity analysis and internal validation).
- Focus on specific questions involving the medium-sized city of Zhuhai : position and influence within MCR processes ; specific governance configuration (the city is a Special Economic Zone e.g.).

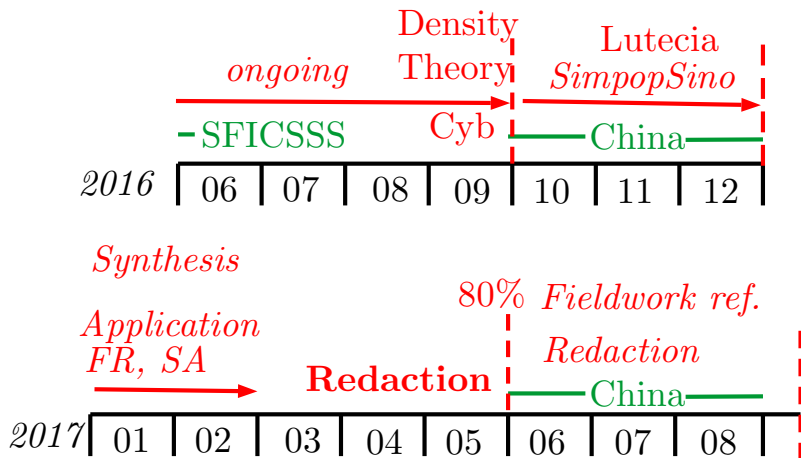
# Towards a SimpopSino model

- Extension of Gibrat-Interaction model, taking into account at least one economic dimension
- Meeting with Denise : ok for Elfie dataset ; importance of link meso-macro in transportation
- Rapidly growing network in China  
[Kenworthy and Hu, 2002, Lyu et al., 2016] :  
construction of a dynamical database ; test static/dynamic/co-evolution  
network extensions for SimpopSino

## Next steps (until December 15th 2016)

- Lutecia : model [3w] ; fieldwork [2w]
- SimpopSino : theoretical/modeling [3w]
- Thesis/papers writing [2w]

# Thesis Organisation (remainder)





# References I



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