

# Models of growth for system of cities : Back to the simple

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# Modeling Urban Growth

# Spatial Interaction and Urban Growth

## *Role of spatial interactions in Urban Growth ?*

- gravity-based flows influence population growth in a synergetic formulation [Sanders, 1992]
- Simpop models (from Simpop1 to SimpopLocal) [Pumain, 2012] : agent-based approaches ; more recently Marius [Cottineau et al., 2015] closer to system dynamics
- Simple random growth (Gibrat model) becomes quickly complex by adding spatial interaction [Bretagnolle et al., 2000] ; refined extension with waves of innovation in [Favaro and Pumain, 2011]

# Research Objective

# Model Rationale

→ Rationale : extend an interaction model for system of cities by including physical network, to investigate its influence on system dynamics

→ Work under Gibrat independence assumptions, i.e.  $\text{Cov}[P_i(t), P_j(t)] = 0$ . If  $\vec{P}(t+1) = \mathbf{R} \cdot \vec{P}(t)$  where  $\mathbf{R}$  is also independent, then  $\mathbb{E}[\vec{P}(t+1)] = \mathbf{R} \cdot \mathbb{E}[\vec{P}](t)$ . Expectancies only for now (higher moments computable similarly)

→ With  $\vec{\mu}(t) = \mathbb{E}[\vec{P}(t)]$ , we generalize this approach by taking  $\vec{\mu}(t+1) = f(\vec{\mu}(t))$

# Model Formulation

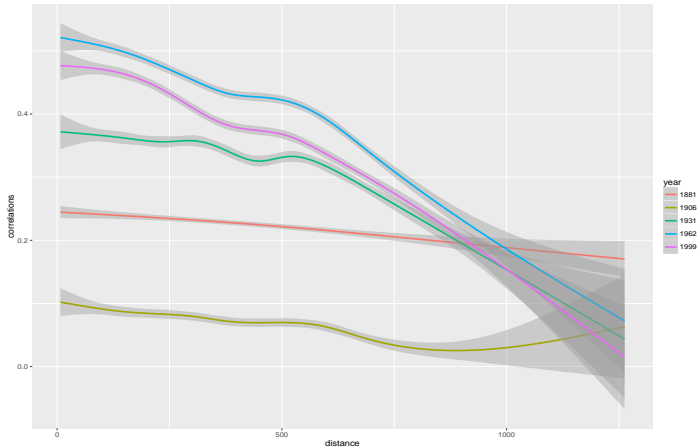
→ In our case,  $f(\vec{\mu}) = r_0 \cdot \text{Id} \cdot \vec{\mu} + \mathbf{G} \cdot \mathbf{1} + \mathbf{N} \cdot$  with

- $G_{ij} = w_G \cdot \frac{V_{ij}}{\langle V_{ij} \rangle}$  and  $V_{ij} = \left( \frac{\mu_i \mu_j}{\sum \mu_k^2} \right)^{\gamma_G} \exp(-d_{ij}/d_G)$
- $N_i = w_N \cdot \sum_{kl} \left( \frac{\mu_k \mu_l}{\sum \mu} \right)^{\gamma_N} \exp(-d_{kl,i})/d_N$  where  $d_{kl,i}$  is distance to shortest path between  $k, l$  computed with slope impedance ( $Z = (1 + \alpha/\alpha_0)^{n_0}$  with  $\alpha_0 \simeq 3$ )

# Data : stylized facts

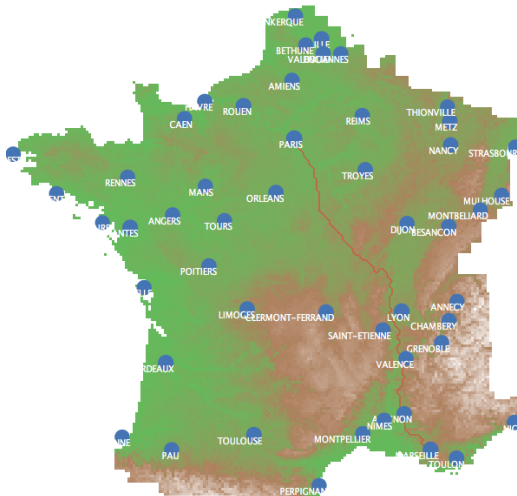
Population data for French-cities (Pumain-INED database : 1831-1999)

*Non-stationarity of log-returns correlations function of distance*



# Data : geographic abstract network

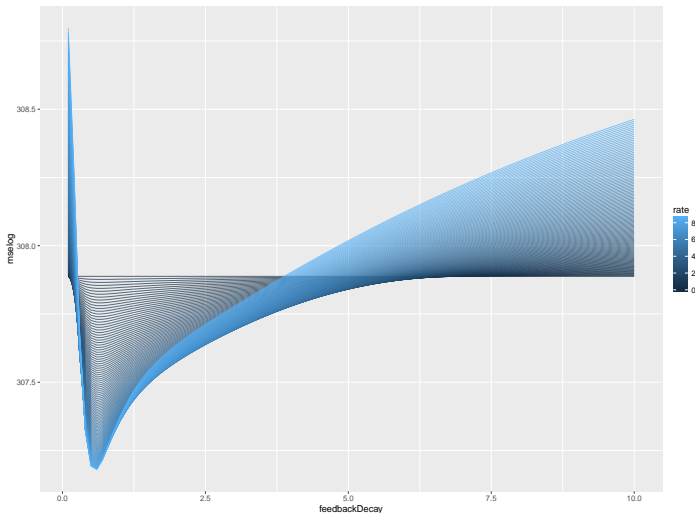
*Physical transportation network abstracted through a geographical shortest path network*





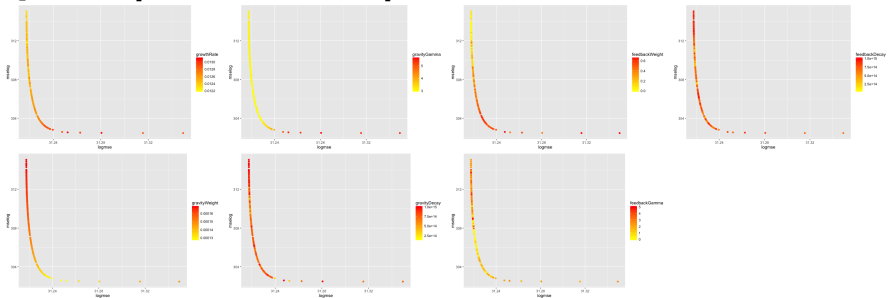
# Results : model exploration

## *Evidence of physical network effects*

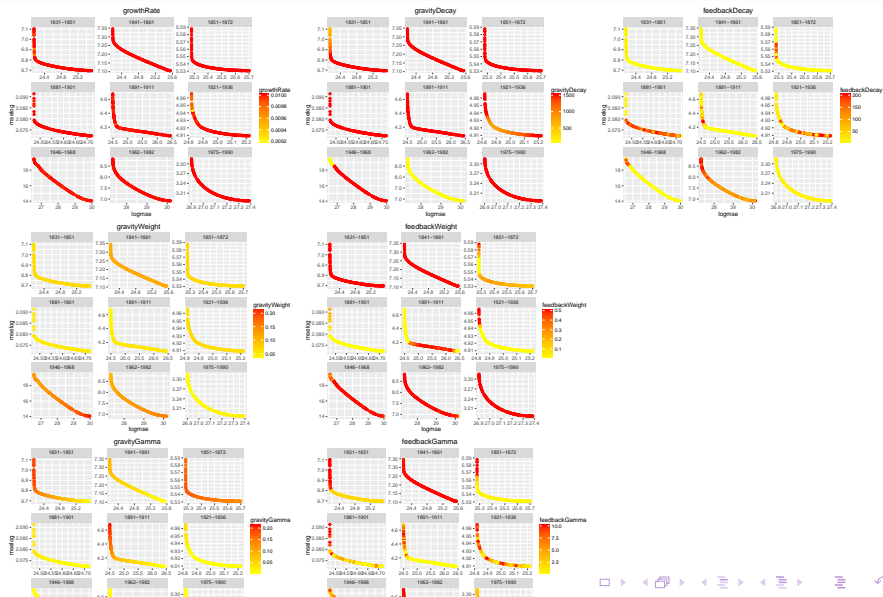


# Results : model calibration

*Model calibration using GA on computation grid, with software OpenMole [Reuillon et al., 2013]*



# Results : non-stationary model calibration



# Quantifying overfitting

*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

# Empirical AIC

# Discussion

# Conclusion

- All code available at




<https://github.com/JusteRaimbault/CityNetwork/tree/master/Models/NetworkNe>

# Reserve slides

## Reserve Slides



## References I

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Openmole, a workflow engine specifically tailored for the distributed exploration of simulation models.

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Sanders, L. (1992).

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## Calibration with fixed gravity effects (iterative calibration)

