

# A MULTI-SCALE MODEL OF URBAN GROWTH COUPLING DYNAMICS OF SYSTEMS OF CITIES WITH MORPHOLOGICAL PROCESSES

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**Abstract.** We introduce a multi-scale model of urban growth. Focusing on the spatial structure of processes rather than on their intrinsic multi-dimensionality, we take into account population only and couple a macroscopic interaction model for a system of cities with urban morphogenesis models simulating the spatial distribution of population in metropolitan areas based on reaction-diffusion processes. Different coupling regimes between scales are explored on synthetic systems of cities, and the model is partly calibrated for a weak coupling with a consistent database for the European urban system. This work paves the way towards more complex and operational multi-scale models of urban growth.

**Keywords.** Urban growth; Multi-scale; Urban morphology; Systems of cities; Model calibration.

## 1 Introduction

The modeling of urban growth is a crucial issue for the design of sustainable territorial policies, through the understanding of past urbanization processes and the forecasting of future urban trajectories. Models have been proposed at different scales and integrating different dimensions of urban systems. At the scale of a metropolitan area, Land-use Transport Interaction models [1] are for example a privileged tool to anticipate the answer of spatial distributions of activities (mostly residential location and economic activities) to an evolution of the accessibility landscape permitted by new transportation infrastructures. At the same scale, cellular automata models of urban growth or land-use change study more generally land-use transitions with a high spatial resolution, and are mostly data-driven [2]. At the smaller scale of the system of cities, macroscopic models of urban growth have focused on reproducing the distribution of city sizes, either through economic processes as e.g. [3], or from a geographical point of view focusing on interactions between cities [4].

Territorial dynamics, and more particularly urban dynamics, have according to [5] an intrinsic multi-scalar nature, with successive autonomous levels of emergence

from individual microscopic agents to the mesoscopic scale of the city and the macroscopic scale of the system of cities. Furthermore, the need for sustainable territorial policies would imply the construction of multi-scalar models to take into account issues associated to each relevant scale [6].

This contribution contributes to that open question by introducing a multi-scale model of urban growth which focuses on the spatial structure of processes rather than on their multi-dimensionality. Therefore, we take into account only population variables, but both at the macroscopic scale of the system of cities in the legacy of [7] and at the mesoscopic scale of the metropolitan area with an urban morphogenesis model. The coupling of these scales is a crucial novel feature of our model. We describe in the following stylized facts justifying the approach, describe the model, and summarize preliminary results from its exploration and calibration.

## 2 Empirical stylized facts

We use the dataset of urban systems dynamics on long time provided by [8], and in particular for the European urban system spanning 1850-2000. Regarding the precise distribution of population, we use the static Eurostat population grid in 2010 aggregated at a 500m resolution. Empirical data analysis provide the two following crucial stylized facts: (i) the spatial distribution of morphological indicators computed on spatial moving windows of size 50km has a high spatial non-stationarity, recovering the results obtained by [9] for the interaction between population distribution and the road network; (ii) population growth rates of urban areas, shown in Fig. 1 as a function of distance, exhibit as expected short-range positive correlations but also negative long-range correlations. The first point justifies differentiating mesoscopic models of morphogenesis in space, and the second to take into account the interactions between these urban areas at the macroscopic scale.

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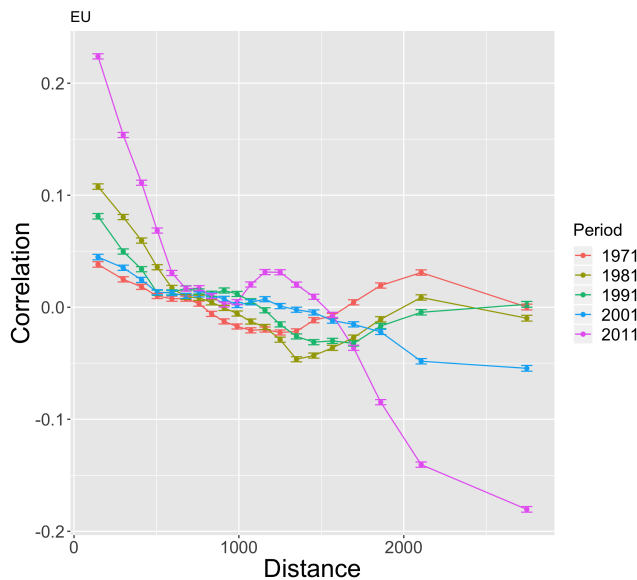


Figure 1: Growth rate correlations as a function of distance between urban areas, for the European urban system.

### 3 Multi-scalar model

[10] [11]

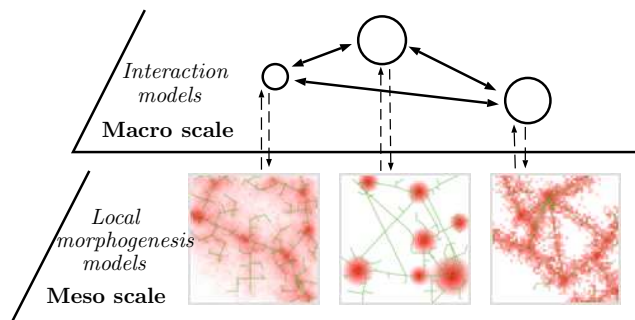


Figure 2: Theoretical flowchart of the multi-scalar model.

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### 4 Discussion

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