

A "Scope, Simulation and Story" approach to identify future spatial development scenarios

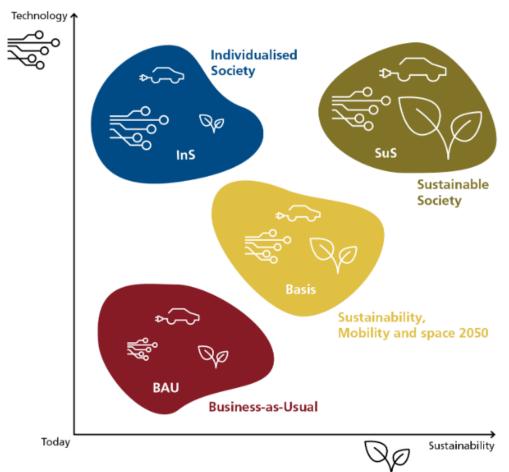
Orlando Roman ¹, Jan Kwakkel ², Bryan T. Adey ¹ and Benjamin Black ¹

¹Department of Civil, Environmental and Geomatic Engineering. ETH Zürich ²Faculty of Technology Policy and Management, TU Delft



Problem Statement

Scenarios



ARE's Transport Outlook 2050 Scenarios:

https://www.are.admin.ch/are/en/home/mobility/data/transport-outlook/scenarios-methodology.html#1497088217

Socio-economic challenges for mitigation



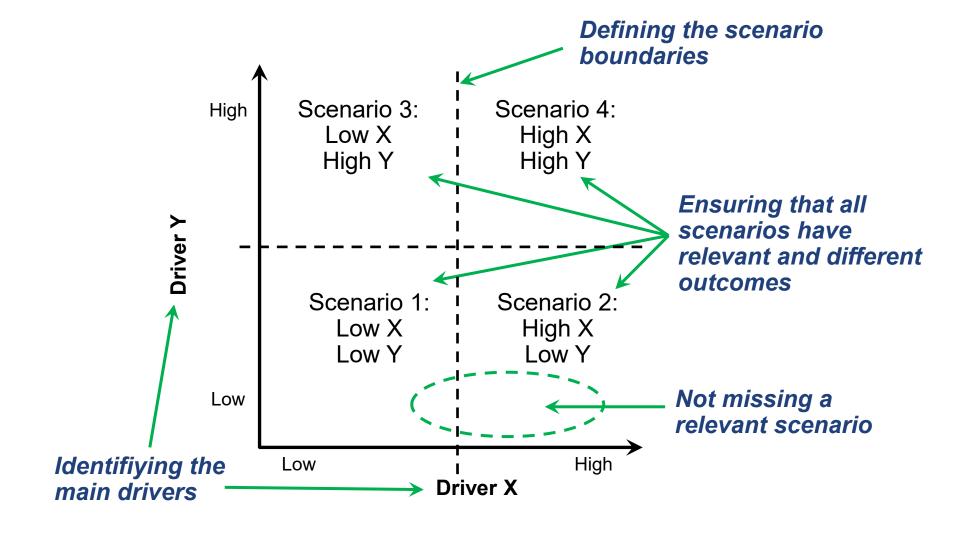
Socio-economic challenges for adaptation

The Global Shared Socioeconomic Pathways SSPs





Problem Statement – What is challenging





Research Gap

Most scenario-planning exercises remain predominantly qualitative.

Limited set of narrative storylines



Simulation models

"Story and Simulation" approach

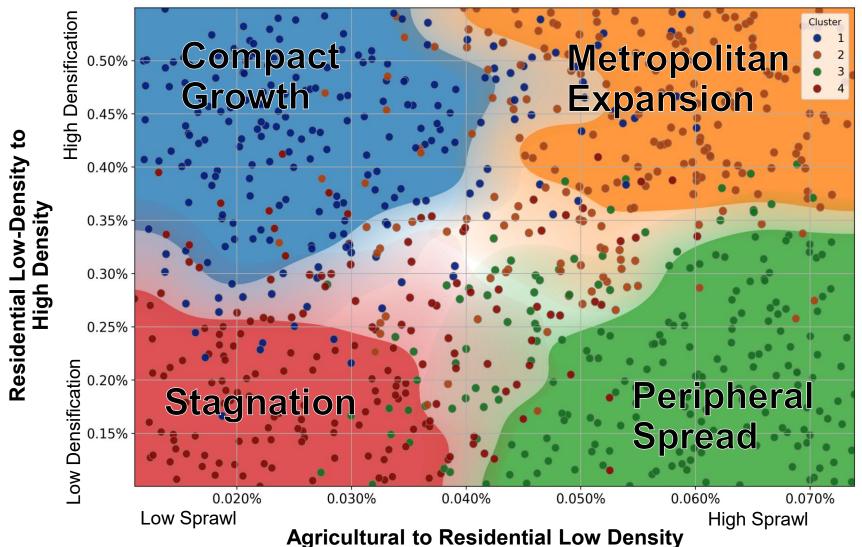
Approaches that invert this workflow, leveraging large ensembles of simulations upfront to quantitatively inform and refine the creation of scenario storylines, are still relatively uncommon.

Proposal

Probabilistic boundaries between scenarios

Y-axis explain 41% of change

X-axis explain 14% of change



Scenarios that are spatially different and relevant





A Scope, Simulation and Story approach

1: Scope

- Spatial and temporal constraints
- Potential drivers of change: Uncertainties and Planning Decisions
- Desirable Futures

2: Simulation

- Data Gathering
- Urban Development Model Selection
- Model calibration and validation
- Simulation of Ensemble of Scenarios
- Spatial clustering
- Visualisation

3: Story

- Iteration with stakeholders
- Scenario refinement
- Storyline development
- Proposal for action plans







A Scope, Simulation and Story approach

2: Simulation

LUCC Model Drivers Initial LU map Final LU map bability Maps Patcher Expander Future LU map

Spatial Clustering

Spatial Similarity estimation (Po/Kappa)



First Stage Seeded K-means (Only outputs)



Second Stage Seeded K-means (Refined with Inputs)



Supervised Classification (Random Forest)

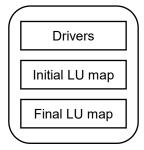
Visualization



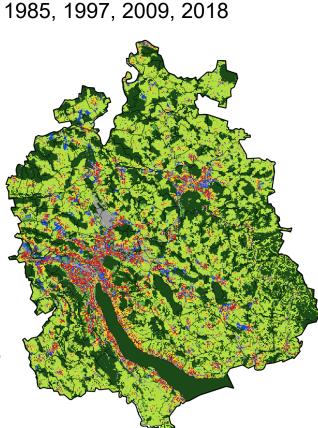
Gaussian
Smoothing to
show uncertainty
boundaries



LUCC Model – Dinamica EGO

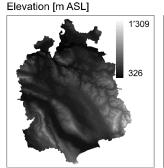


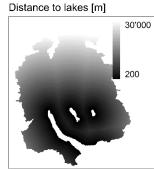
- 1. Low-density settlement area
- 2. High-density settlement area
- 3. Industrial, commercial, and public area
- 4. Construction sites and fallows
- 5. Traffic area
- 6. Recreational and green zones
- 7. Agricultural area
- 8. Forest and unproductive area



Slope [°]

62
0

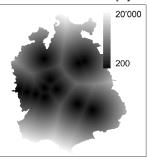




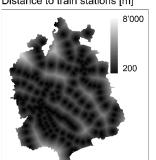
Distance to the city of Zurich

200

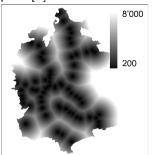


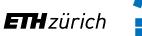


Distance to train stations [m]

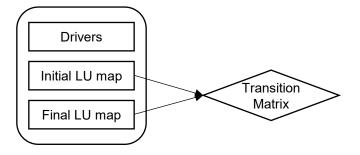


Distance to highway access points [m]





LUCC model – Transition Matrix



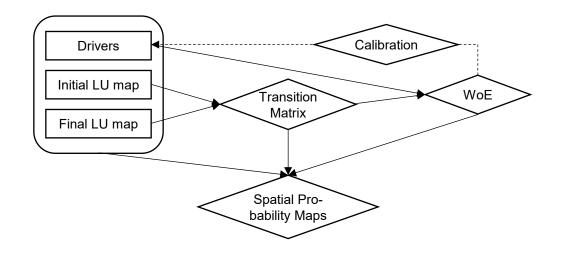
«A pixel of low-density settlement in 2009 will change to high-density settlement by 2018 with a probability of 0.35%»

To: From:	1 LDS	2 HDS	3 ICP	4 CF	5 T	6 RG	7 A	8 FU
1: Low-density settlement area (LDS)	-	0.35%		0.26%				
2: High-density settlement area (HDS)	0.14%	-		0.20%				
3: Industrial, commercial, and public area (ICP)	0.05%	0.12%	-	0.62%	0.03%	0.02%	0.24%	0.14%
4: Construction sites and fallows (CF)	4.52%	7.20%	2.88%	-	4.40%	1.40%	3.82%	1.21%
5: Traffic area (T)	0.003%	0.004%	0.026%	0.114%	-	0.005%	0.003%	0.009%
6: Recreational and green zones (RG)		0.02%	0.06%	0.32%		-	0.10%	0.02%
7: Agricultural area (A)	0.04%	0.04%	0.04%	0.10%	0.02%	0.02%	-	0.09%
8: Forest and unproductive area (FU)	0.003%	0.001%	0.003%	0.007%	0.004%	0.002%	0.047%	-

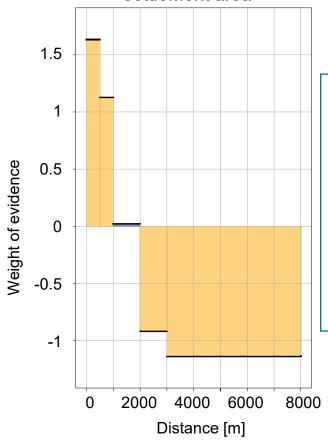




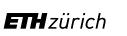
LUCC model – Drivers Weights of Evidence



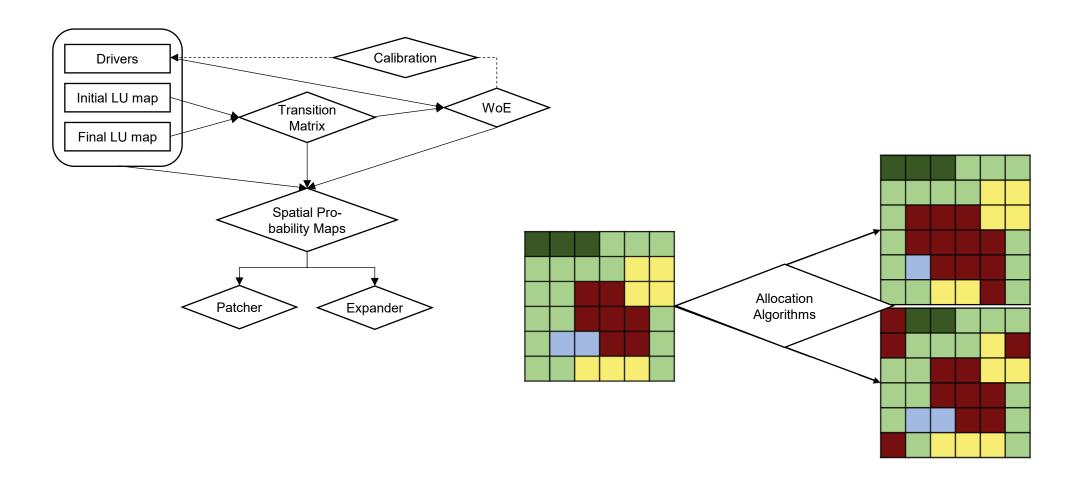
Distance to Train Stations
Agricultural area to high-density
settlement area

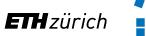


«The distance to train stations is significant in explaining the transition from agriculture to highdensity settlement. For > 2km from a train station it is more likely that the transition doesn't occur than that it occurs.»



LUCC model – Allocation of predicted change



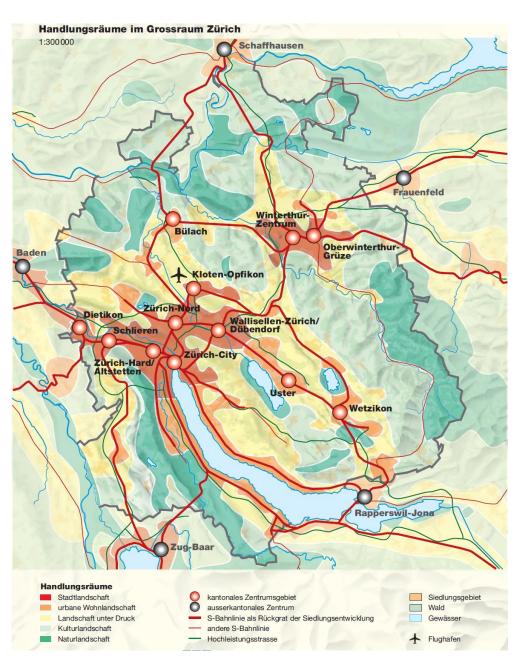


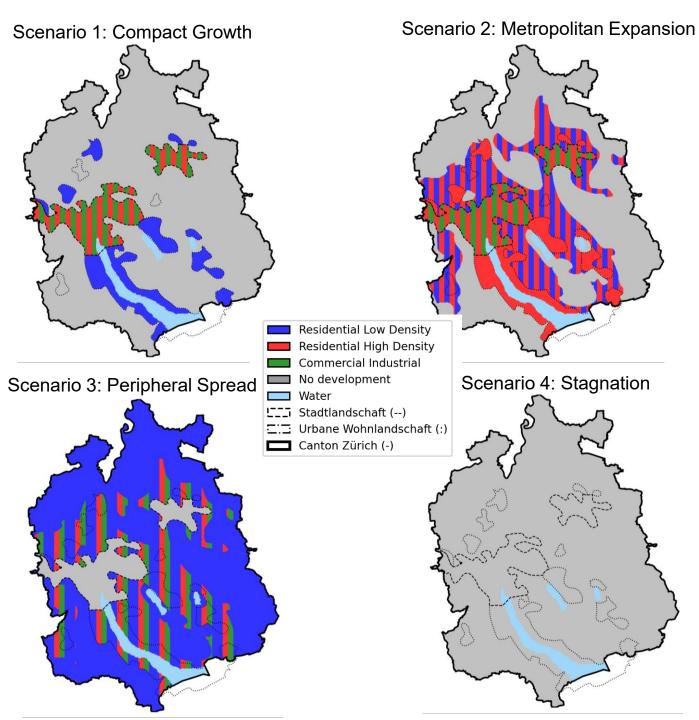
Experimental Design – 800 simulations – Latin Hypercube Sampling

Uncertain Factor	Min. Value	Max. Value	PDF*
Transition rate from low- to high-density settlement	0.25	0.35	Uniform
Transition rate from high- to low-density settlement	0.14	0.24	Uniform
Transition rate from industrial, commercial and public area to low-density settlement	0.04	0.05	Uniform
Transition rate from industrial, commercial and public area to high-density settlement	0.10	0.12	Uniform
Transition rate from agricultural area to low-density settlement	0.04	0.07	Uniform
Transition rate from agricultural area to high-density settlement	0.04	0.05	Uniform
Transition rate from agricultural area to industrial, commercial and public area	0.04	0.06	Uniform
Weights of Train Stations/Highway access points for probability surfaces	-50%/+50%	+50%/-50%	Uniform
Weights of Smaller cities/Big cities for probability surfaces	-50%/+50%	+50%/-50%	Uniform

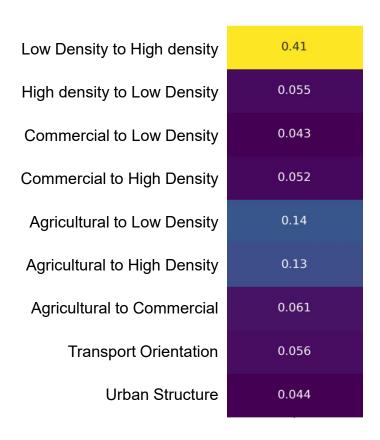


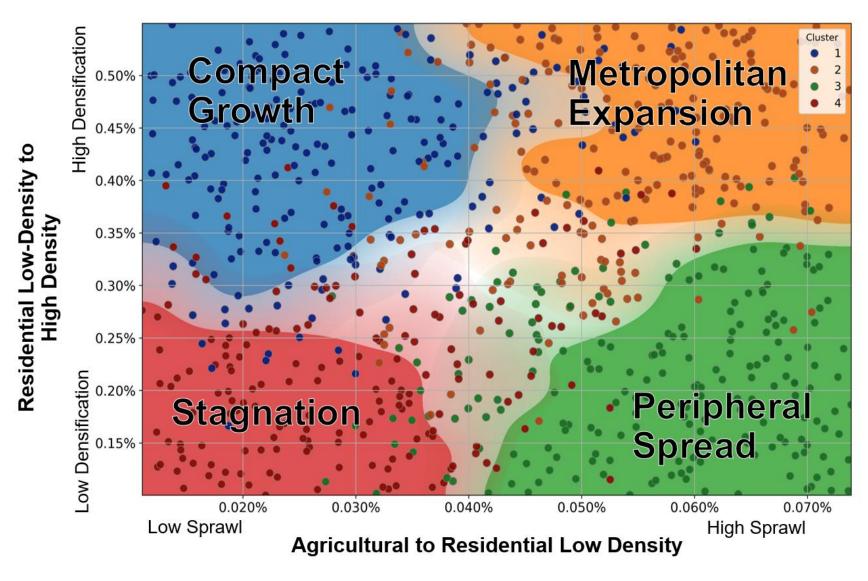
Spatial outputs - Normative

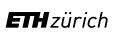




Scenario Map

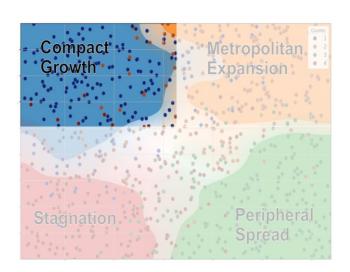


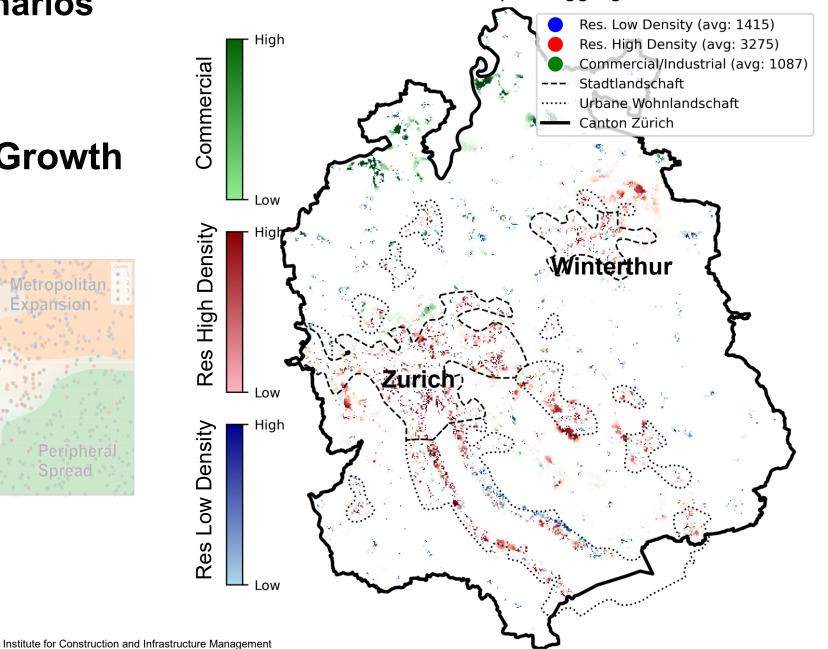




Cluster 1 (146 maps) - Aggregated Transitions

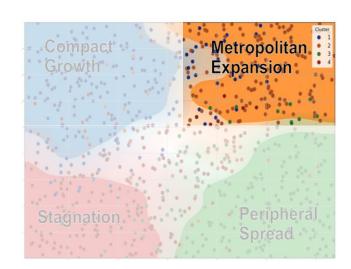
Compact Growth

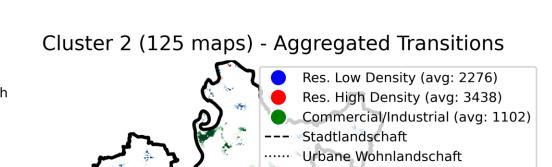


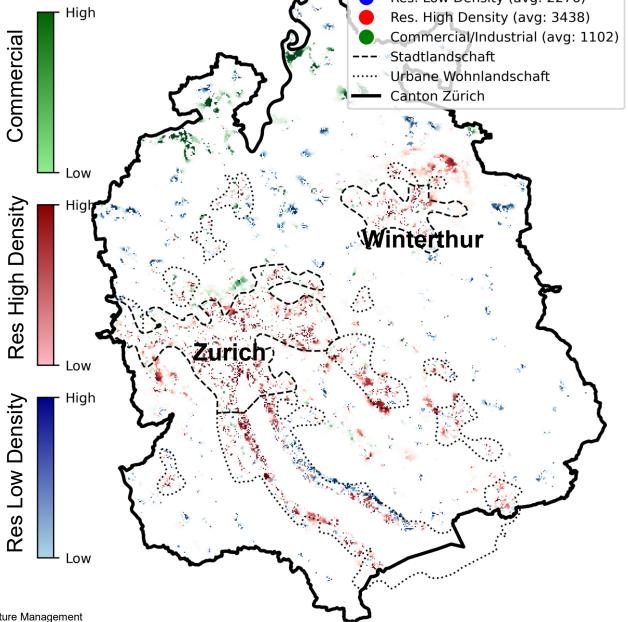




Metropolitan **Expansion**

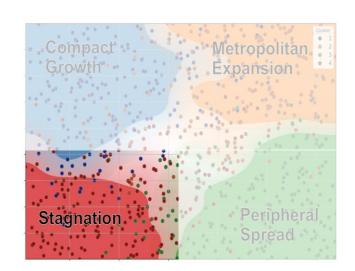


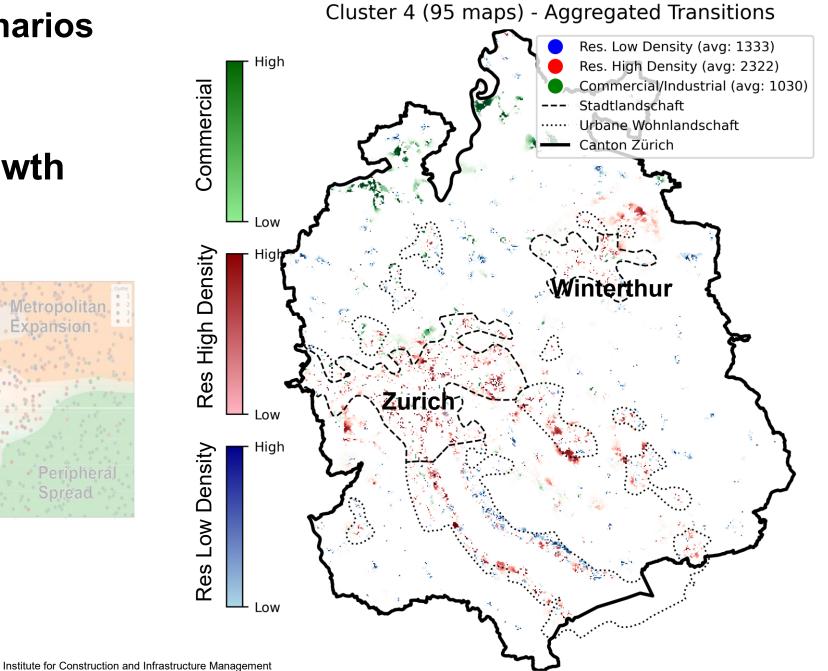






No Growth

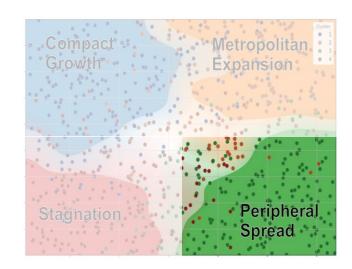


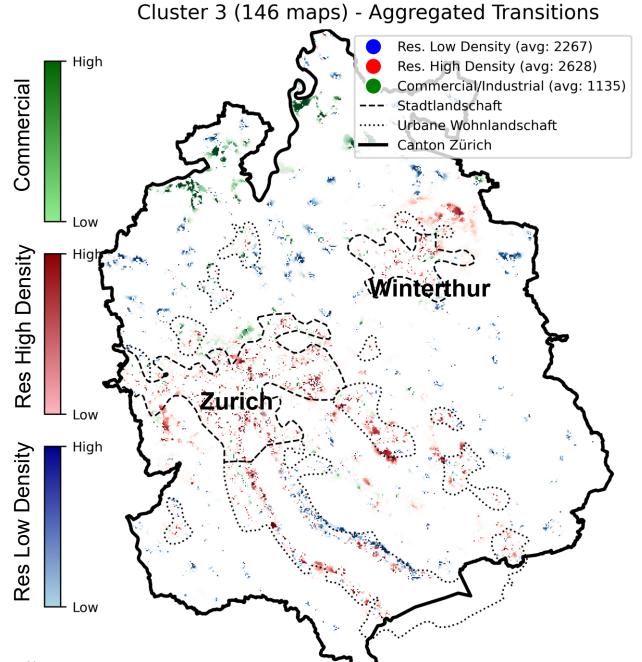




17

Peripheral Spread



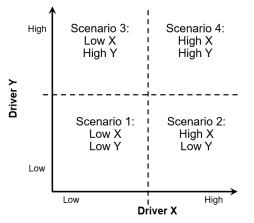


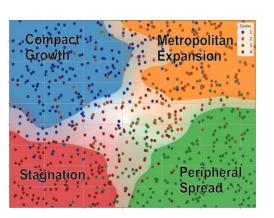


18

Conclusions

- We are proposing a methodology to develop scenario narratives that are informed by simulations. A
 "Scope, Simulation and Story" approach.
- Different and relevant spatial patterns emerge from the simulations providing insights for planning (i.e. which are the main factors producing such spatial patterns).
- There are technical challenges to measure spatial similarity, cluster spatial simulations and visualize spatial scenarios. This work contributes with a workflow and an example of how to implement such an approach to identify scenario narratives. The methodology could be adapted for other Urban Development model, not necessarily cellular automata models
- To embed this workflow into real planning processes, we propose to include participatory feedback at the beginning (the Scope) and the end (the Story) of the Simulation process.













Orlando Roman oroman@ethz.ch

ETH Zurich
Institut für Bau- und Infrastrukturmanagement
Stefano-Franscini-Platz 5
8093 Zürich

www.ibi.ethz.ch

