

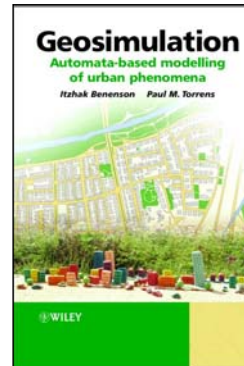
# The Revival of Urban Modeling

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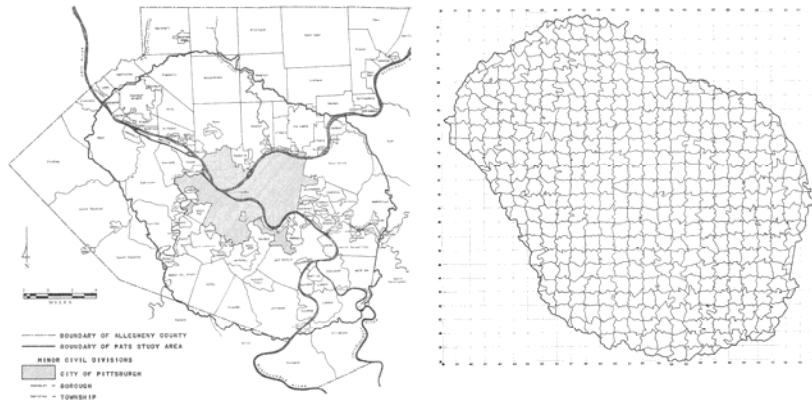


## The Golden Age 1960s-1970s

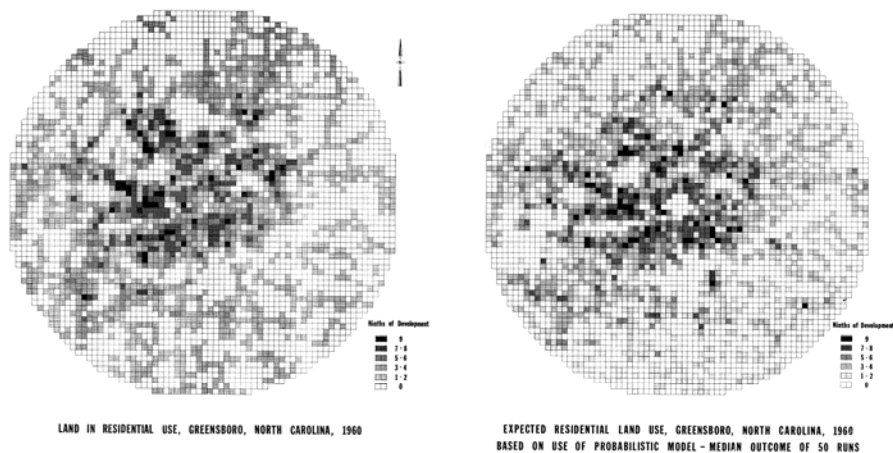
## Ira Lowry, 1964 - Pittsburg, gravitation model

$$T_{ij} \sim 1/(a + bd + cd^2)$$

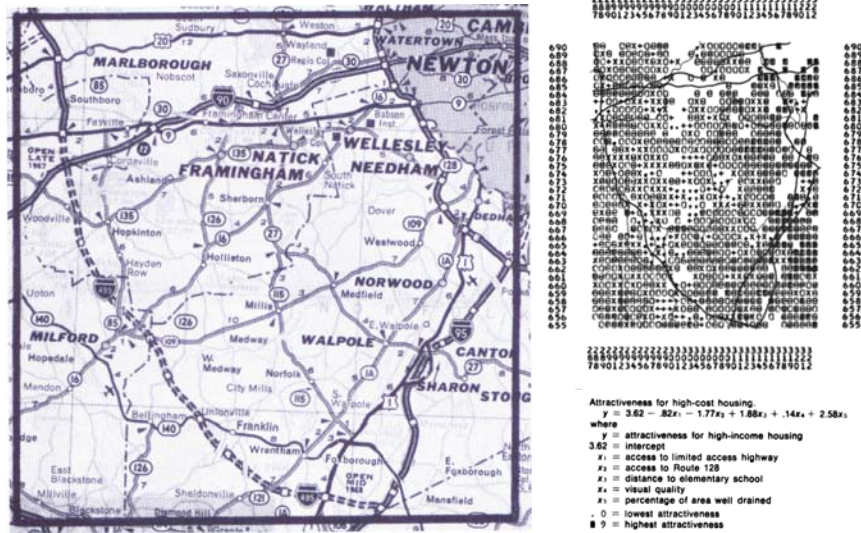
- a basic sector, including industrial, business, and administrative activities, whose clients are mostly non-local;
- a retail sector, dealing with the local population;
- a householder sector.



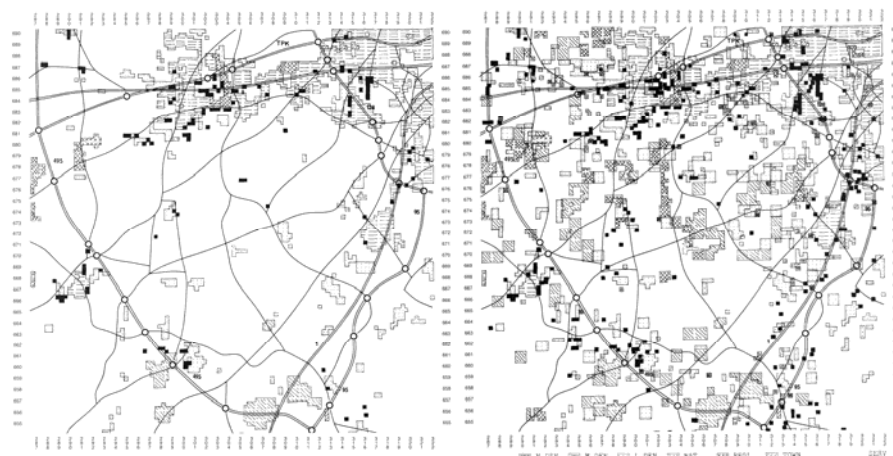
F. Chapin, Weiss, Donnelly, 1962 - 1968, Greensboro, 300x300 m units, probabilistic model, based of *potential* for development as a linear function of few easily estimated variables, initial conditions - 1948, median run is compared to 1960.



Steinitz and Rogers, 1974, Boston, many factors, intentionally simple linear expression of potential for development on the base of existing maps of land-uses, topography, transport network, etc.



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Initial conditions of 1974

2000, Current development tendencies

## Urban models of 1960s

• Focus on the allocation of externally defined development quote.

• Separation between cells' potential and locations where change does occur.

• Two-level hierarchy of urban space.

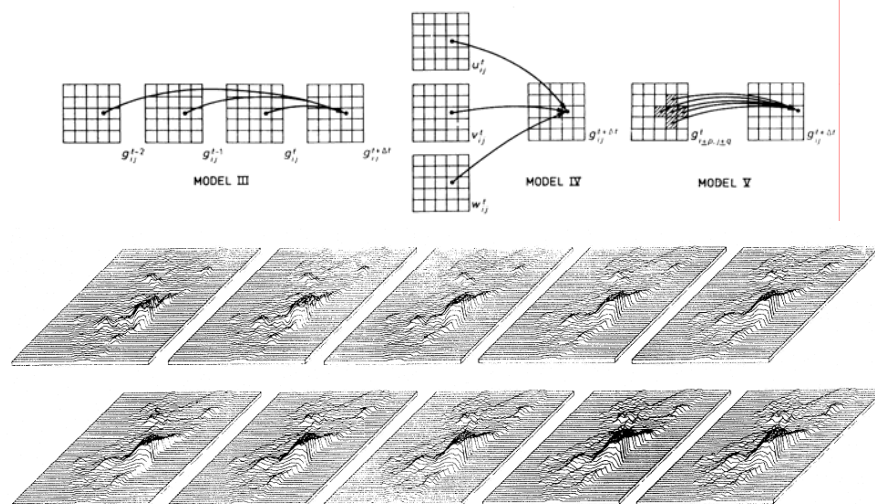
• Separation of the factors of land-use change into endogenous, determined by land unit properties and location, and exogenous, controlled by public authorities.

• Investigation of the variance of model results.

• Comparison of the actual pattern with a median, and not the best fit, outcome.

## W. Tobler, 1970 (1979) Urban Cellular Automata

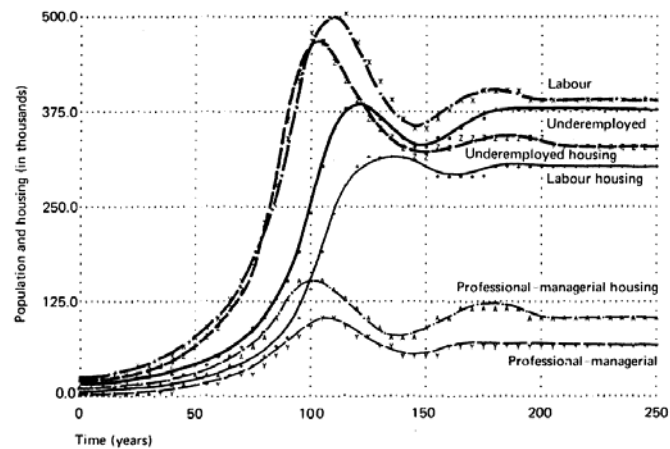
$$\sum p \in [-2, 2], q \in [-2, 2], p + q \leq 2w_{pq}P_{i+p,j+q}(t) \quad w_{pq} = a_{pq} + b_{pq}\Delta t,$$



# Dark Age

1970s - 1980s

Forrester (1969), Wilson (1970+), many others:  
(Commonsensual) System Dynamics, The Hope of  
Robustness and The Hope of Order Parameters

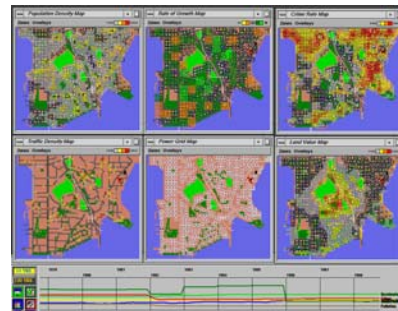


## Lee, 1973, *Requiem for Large-Scale Models*

### Seven Sins of Large-Scale Models:

- **Hypercomprehensiveness** (attempt to explain too much with too many constraints and relationships)
- **Grossness** (reliance on aggregate input)
- **Mechanicalness** (narrow language of computation)
- **Expensiveness** (high price of data and parameter estimates)
- **Hungriness** (tremendous data requirements)
- **Tuningness** (tautological tuning the model until outputs conform to 'reasonable' expectations)
- **Complicatedness** (inability of the modelers to adequately understand their own creatures)

Nowadays Forrester considers comprehensive models as learning and not a predictive tool. SimCity and Sims seem the best implementations



Are urban systems just the same as chemical ones?

**The general agreement is that the answer is NO**

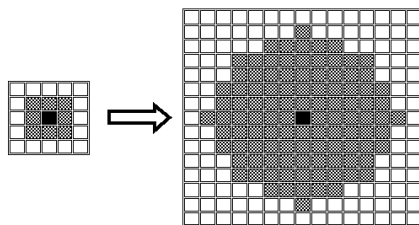
- Distant action and immediate spread of the disturbance
- Fast components (humans) can influence slow ones (infrastructure)
- Laws of unit's changes and interactions are approximations of empirical data, not the laws of nature

# **Renaissance**

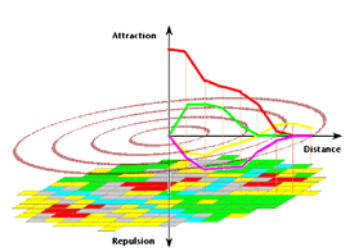
**1990s - 2000s**

# Cellular Automata

Constrained Cellular Automata (Turner, 1988; White & Engelen, 1994, 1997).  
White & Engelen, 1997, Cincinnati, 1966 on the base of 1840



Larger neighborhood



Non-monotonous weight(d)

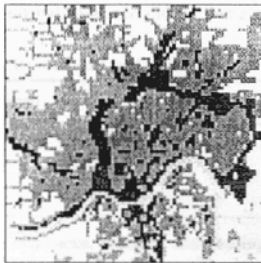


White & Engelen, 1997, *Constrained Cellular Automata - Allocation of development* quote again! Cincinnati, forecast of 1966 on the base of **1840**

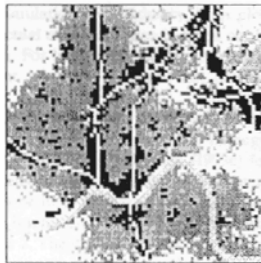
Stage 1: The potentials  $p_{c,i}$  of transition from the current state into  $S_i$ ,  $i = 1; \dots; N$ , are estimated for each cell.

Stage 2: For each cell, obtained potentials are sorted in decreasing order.

Stage 3: An externally defined amount  $n_i$  of land that must be in  $S_i$  use is distributed over the cells  $c$ , for which the potential  $p_{c,i}$  is the highest.



Cincinnati, 1966,

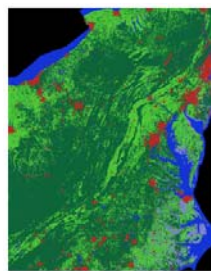


Model 1966

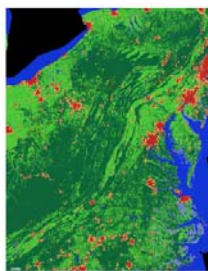


Model 1996, networks

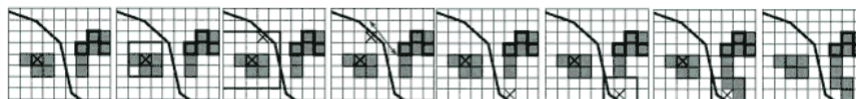
### Spread of urban patterns (Deltatrons) Clarke, 1997



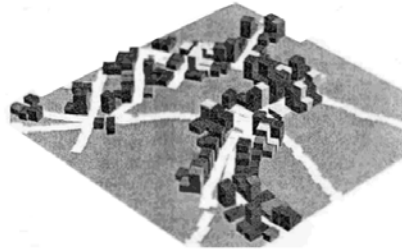
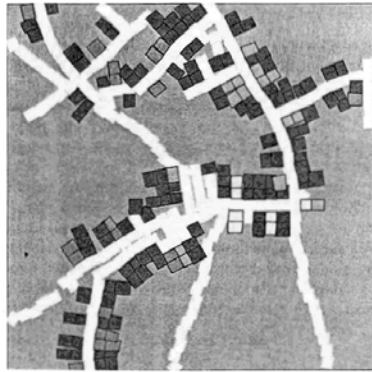
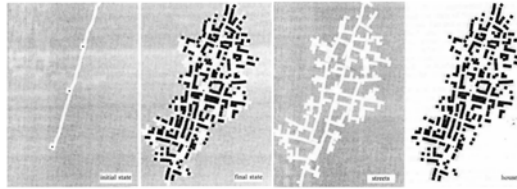
MAIA 1992 land cover.



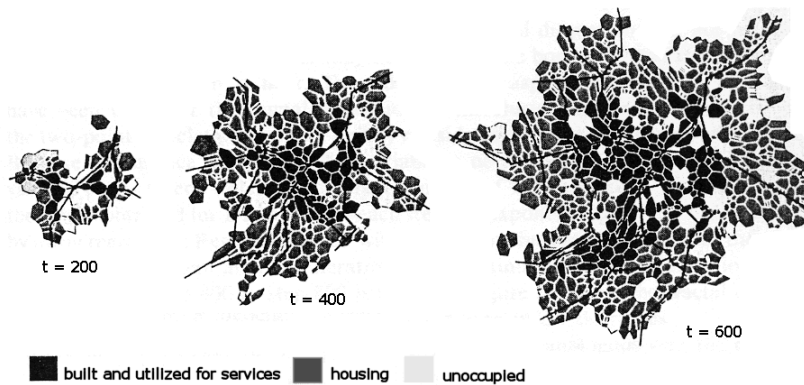
MAIA 2050 forecasted land cover.



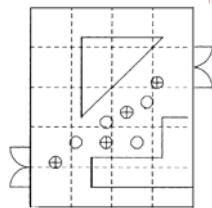
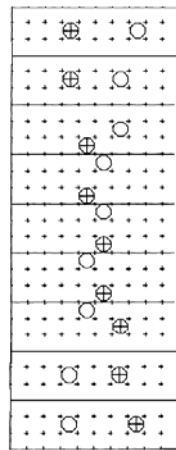
Why cells, actually?  
(Erickson and Lloyd-Jones, 1997).



Cells can also change! (Simboloni, 2000)



# Multi-Agent Systems

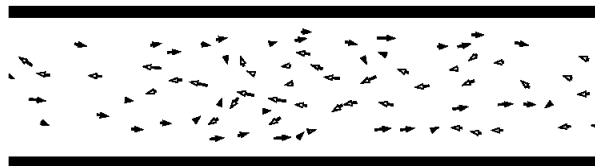
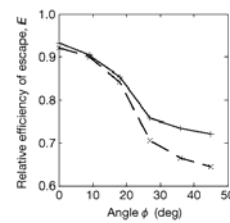
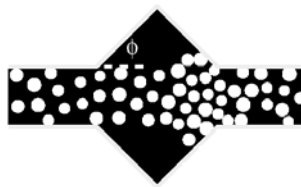


Pedestrian traffic and evacuation models Gipps and Marksjo, 1985

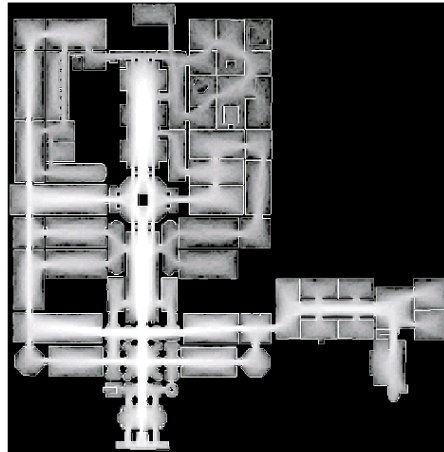
$$\text{Repulsion force} = 1 / ((D - 0.4)^2 + 0.015)$$

When it works, physicists catch the ride -

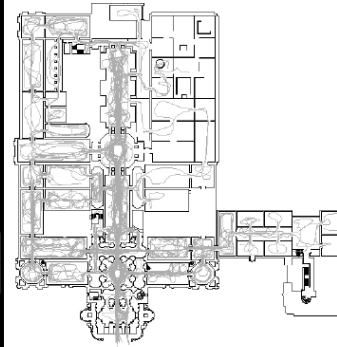
Helbing et al, 1998+, and many others, Physica A



Geographers still take over in 'data rich' situations of complex space structure - Pedestrian movements in Tate gallery, Turner and Penn, 2002



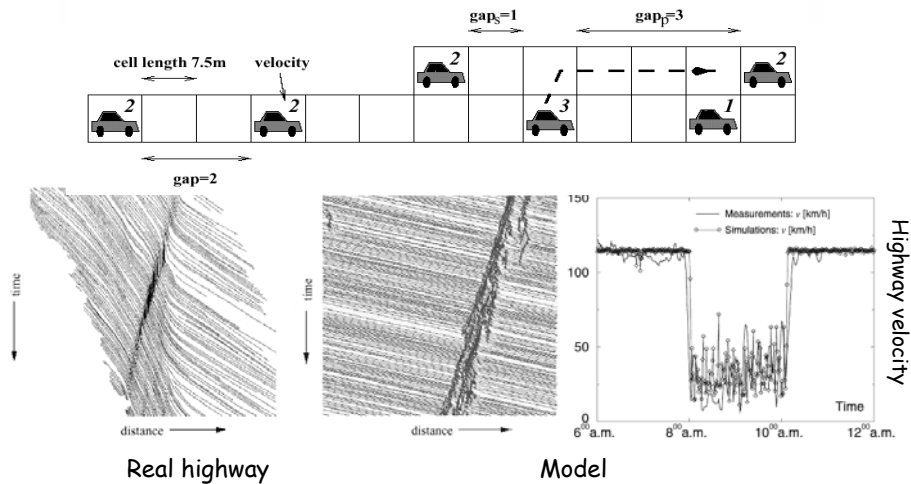
Simulation outcome



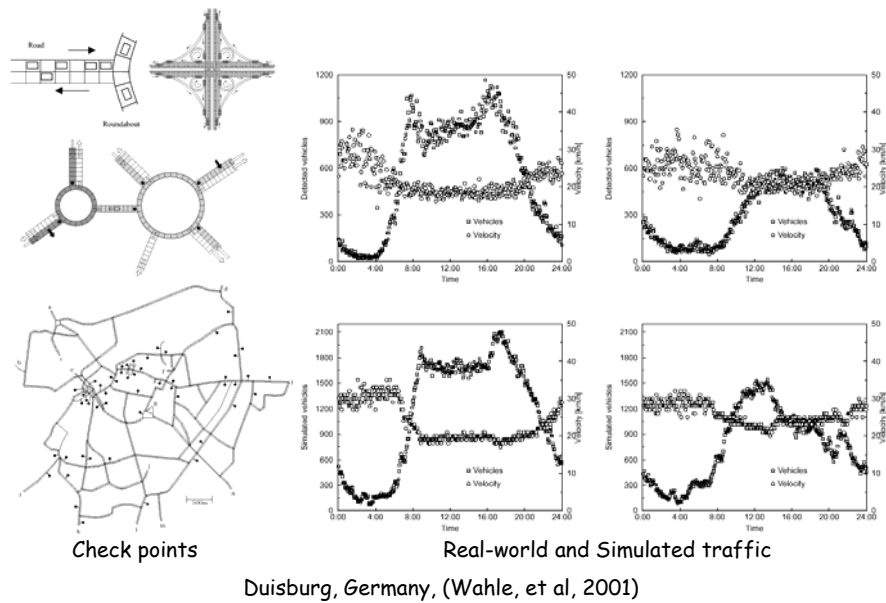
Actual trace in Tate

Car traffic in the city Nigel, Schreckenberg, 1999+, and many others

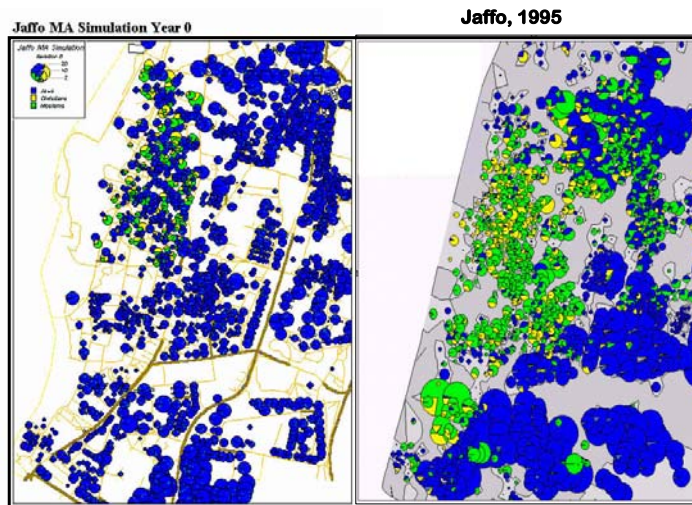
1. Acceleration:  $v_A(t+1) = \min(v_A(t) + 1, v_{MAX})$ ;
2. Braking:  $v_A(t+1) = \min(v_A(t), d_A(t) - 1)$ ;
3. Random deceleration with probability  $p$ :  $v_A(t+1) = \max(v_A(t) - 1, 0)$ ;
4. Driving:  $x_A(t+1) = x_A(t) + v_A(t)$ ;

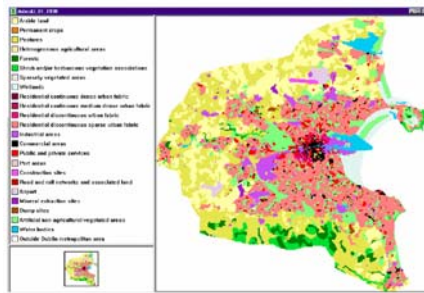


### Car traffic in the city - real-time simulations



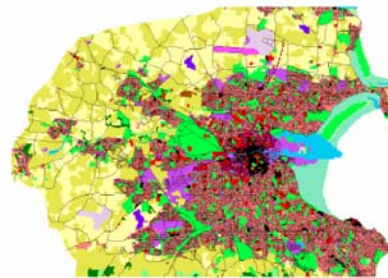
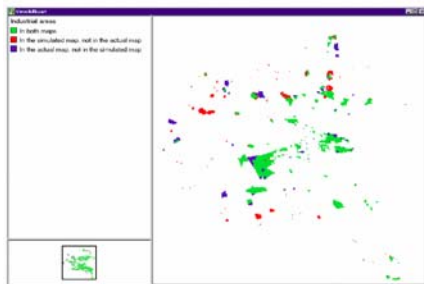
### Residential dynamics in simple situations - Yaffo, Benenson et al, 2002





Comprehensive modeling White, Engelen and RIKS, 1998+, Landis, Zhang, 1998+ (California), Wadell, 2000+

Struggle with Hungriness, Tuningness, Complicatedness



The latest trend in land-use modeling for planning:

Make the rules as simple as possible, and investigate *robustness* of the model outcomes to varying planning policies.

If the model is not robust, then, most probably, you do not understand the system....



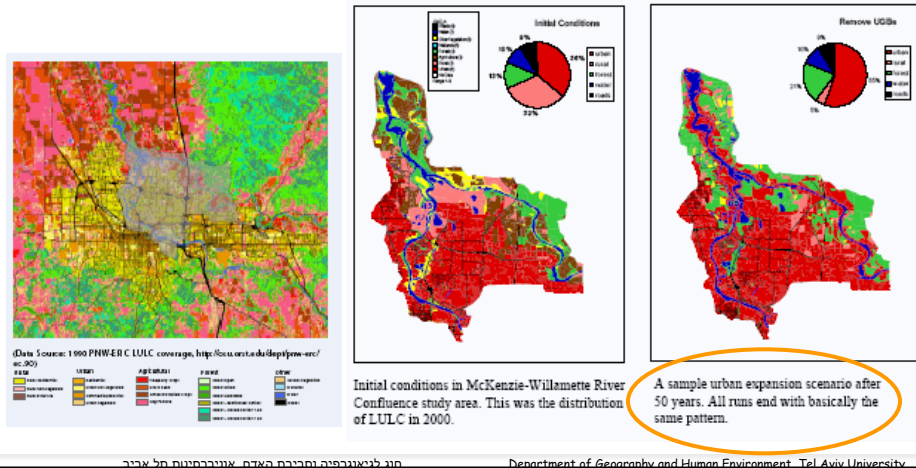
## Evoland, EPA and Oregon State University

Discrete, reflecting planning constraints, rules of land-use changes

If  $(LU_t = 11 \text{ or } LU_t = 4 \text{ or } LU_t = 5)$  Then  $(LU_{t+1} = 10 \text{ or } LU_{t+1} = 5)$ ;

G1: What happens when the *process of application of rules* does not follow the "average" practice?

G2: Reveal planning constraints that cause negative consequences!



Struggle with Hungriness, Tuningness, Complicatedness

Claim of a day: Model must be robust!

How to achieve that?

1. Bidding or ordering opportunities according to their utilities **before** making choice - White and Engelen, Turner, Landis and Zhang, many others (but not "discrete choice" models)

		A (0.9)	B (0.8)	None
Unconditional probability to choose each one of options	Proportional choice	$\alpha(1 - \beta/2)$ [0.54]	$\beta(1 - \alpha/2)$ [0.44]	$(1 - \alpha)(1 - \beta)$ [0.02]
	Try the better	$\alpha$ [0.9]	$\beta(1 - \alpha)$ [0.08]	$(1 - \alpha)(1 - \beta)$ [0.02]

Probabilities of choice according to "bidding" heuristic

Opportunity	Utility at t1	Utility at t2	Utility at t3
A	0.8	0.8	0.8
B	0.4	0.7	0.85
A	0.8	0.8	0.12
B	0.08	0.14	0.85

My conclusion: models work well when

- Deal with physically existing objects - OK
- Data on objects' states are available - OK
- We understand the laws of objects' behavior and interactions  $\Leftrightarrow$  Simple systems

OR

- We are able to investigate the model dynamics  
 $\Leftrightarrow$  Robust complex systems