### Complexity Insights into Circular Economy

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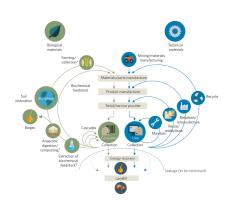
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## The Circular Economy

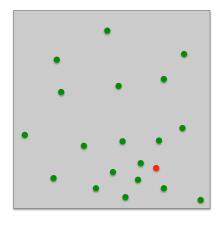


## Why use complexity science?

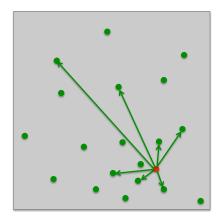
- 'Closing the loop'
- Multiple interacting actors
- Multiple organizational levels
- Interdependence
- Optimizing waste flows

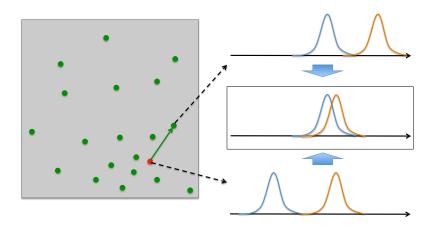


## Model

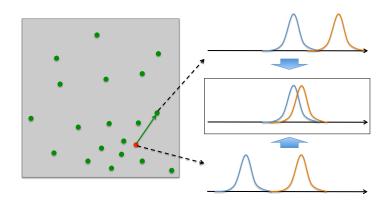


## Model





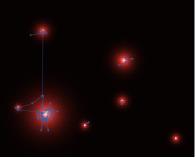
## Model



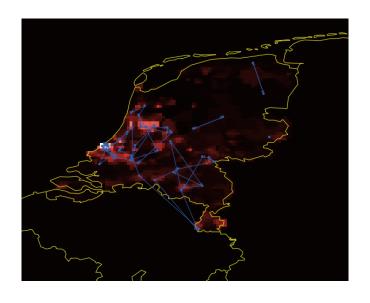
$$u_{ij} = o(i,j) - c \cdot \frac{d_{ij}}{d_{max}}$$

# Geographical setup





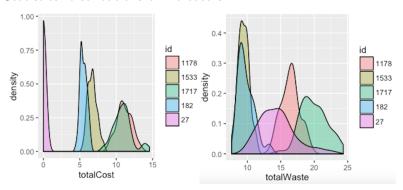
## Application on a real city system



### Results: Internal Validation

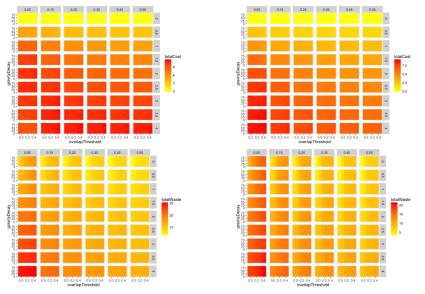
**Model Exploration :** Intensive parallel computation ( $\simeq 5 \cdot 10^5$  runs) using OpenMole [Reuillon et al., 2013]

#### Statistical distributions of indicators



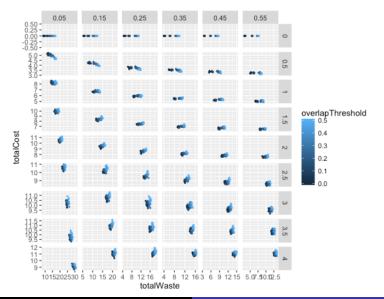
## Results: Model Exploration

Left: uniform; Right: real case. Qualitative change in behavior.



### Results: Optimization

### Pareto fronts for contradictory objectives



### Perspectives

- Test on:
  - Existing maps and infrastructures
  - Biobjective Calibration of the toy-model on waste and cost
  - Use data to calibrate the model
- Open source monitoring
- Insights into the 'waste market'

# Reserve slides

### Model setup

**Demand and Offer functions** :  $\vec{D}_i(\vec{y}) = D_i^{(0)} \cdot \vec{d}_i(\vec{y})$  and  $\vec{O}_i(\vec{y}) = O_i^{(0)} \cdot \vec{o}_i(\vec{y})$ , where  $\vec{d}_i$  and  $\vec{o}_i$  are multivariate probability densities

### Model Parameters

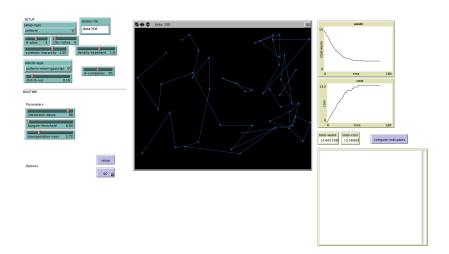
#### **Parameters**

- $\sigma_0$  standard deviation of input/output distributions
- d<sub>0</sub> characteristic decay distance for spatial interaction potential
- c transportation cost
- ullet  $heta_O$  overlap threshold over which transactions are feasible

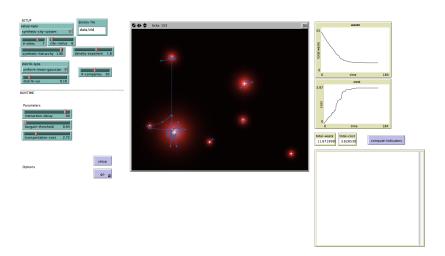
### **Model Indicators**

- Total waste : sum of remaining output distributions
- Total cost : weighted network length
- Network topology indicators : clustering coefficient, in/out mean degree, component number

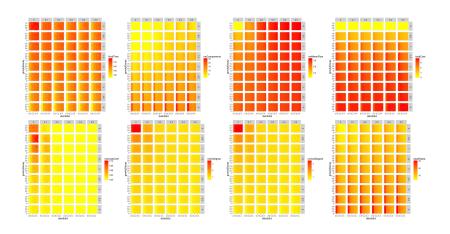
# Model Interface (uniform)



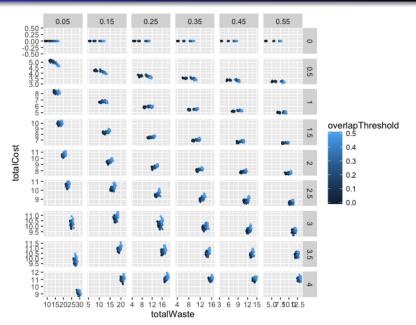
## Model Interface (synthetic)



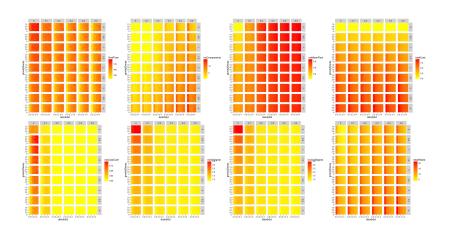
# Indicators (uniform spatial distribution)



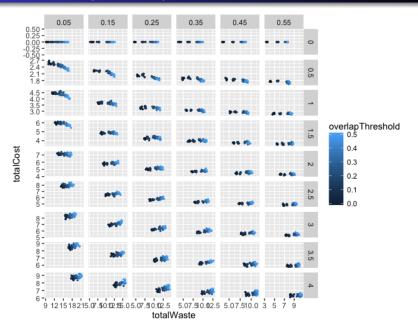
## Pareto front (uniform spatial distribution)



# Indicators (real case)



## Pareto front (real case)



### References I



Reuillon, R., Leclaire, M., and Rey-Coyrehourcq, S. (2013). Openmole, a workflow engine specifically tailored for the distributed exploration of simulation models.

Future Generation Computer Systems, 29(8):1981–1990.