## Modelling Complex Adaptive Systems

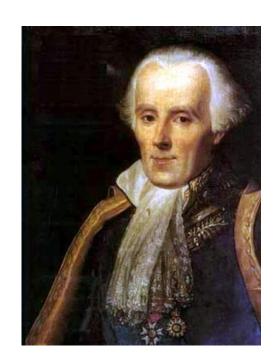
**Agent Based Simulations** 

Dec. 8th 2015, Arend Ligtenberg





"We may regard the present state of the universe as the effect of its past and the cause of its future. An intellect which at a certain moment would know all forces that set nature in motion, and all positions of all items of which nature is composed, if this intellect were also vast enough to submit these data to analysis, it would embrace in a single formula the movements of the greatest bodies of the universe and those of the tiniest atom; for such an intellect nothing would be uncertain and the future just like the past would be present before its eyes."



Laplace 1814: Essai philosophique sur les probabilites



#### Assumptions

- Every observed effect has an observable cause (causality).
- The whole can be understood by taking it apart and studying the pieces (analysis).
- Sufficient analysis of past events can create the capacity to predict future events (predictability).

True?



# Yes for many cases











# But not always









#### When does it go wrong?

- many social beings
- many interactions
- decentralised systems
- coupled systems & scales



Complex Adaptive Systems (CAS)



#### CAS definition

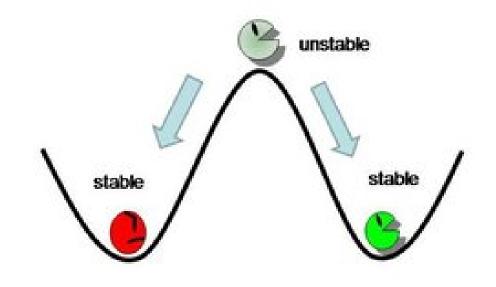
- A system that can adapt itself to the environment
- Large number of interacting components (agents)
- Many different scales (both in space and time)
- Capacity to change and learn from experience
- Interdisciplinary

Sum is more than its parts



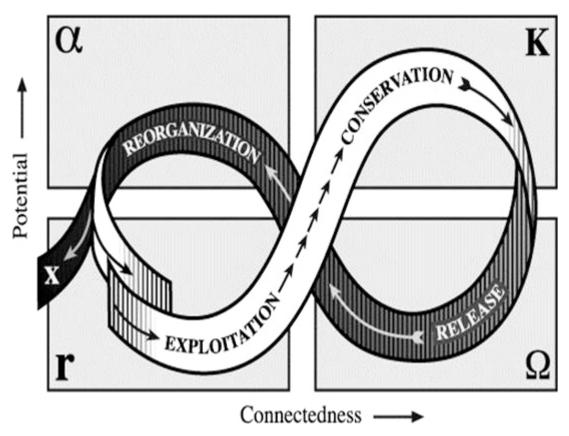
#### What's the problem?

- Open
- Hidden causalities
- Non-linear
- Feedbacks
- Path dependency
- Bi-stability / inherent uncertainty



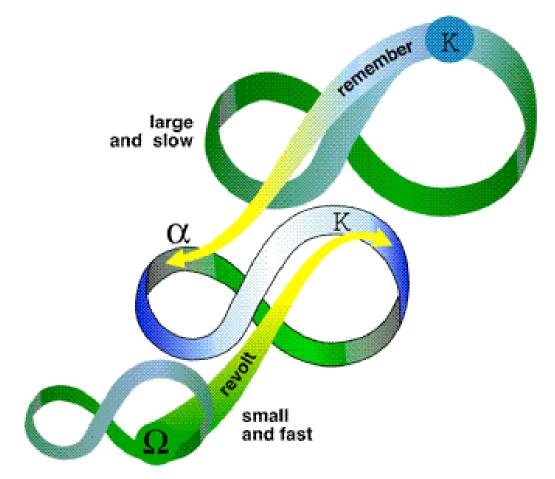
# Adaptive Cycles

reogr



Source: Holling et. al. 2020

# Panarchy



Source: resilience alliance



# Examples

- Ecologies
- Economies
- Sociologies
- Politics
- Cities









#### Modelling CAS

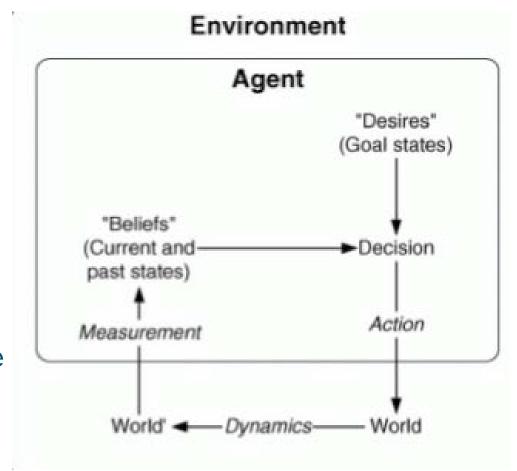
- Bottom-up
- No central control
- Individual components
- Interactions & feedback
- Self-organisation and Emergence

Agent Based Models (ABM)



### Agents

- Decision-making components
- Situated in some environment
- Autonomous and goal directed
- Reactive (pro active)
- Learning
- Partial control; influence environment
- Action steered by preconditions



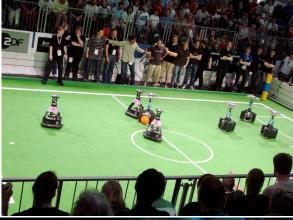


#### Examples

- Control systems (thermostat, flight control systems, Tesla)
- Software daemons
- Webcrawlers
- Robots

#### Simulation models



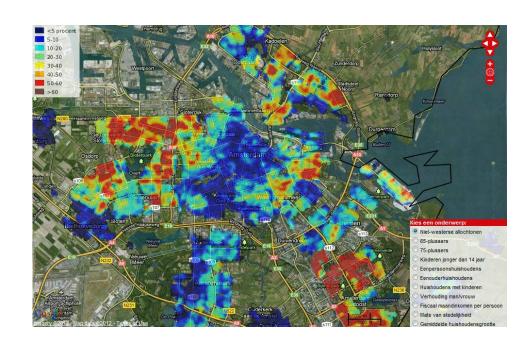






#### Simulating CAS

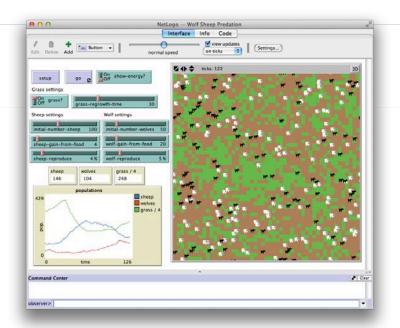
- Interactions between social beings and their environment
- Represented as Agents
- Example:Segregation model(Schelling)

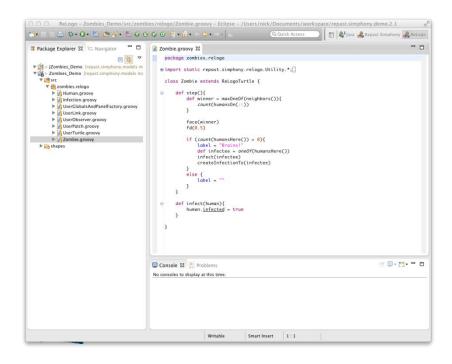


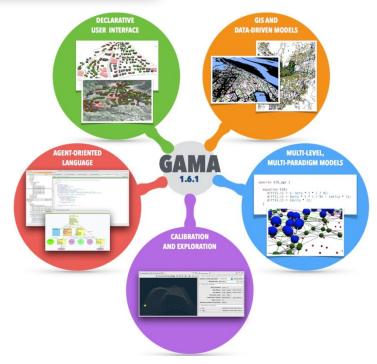


#### How

- NetLogo
- Repast
- GAMA

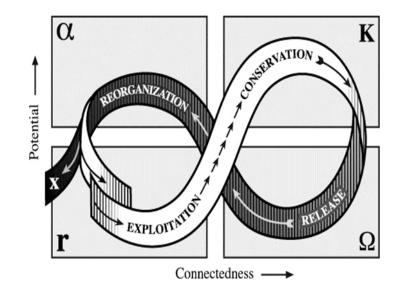






#### Why

- Learn the systems reactions
- Explore CAS
  - transformations,
  - adaptive capacity
  - robustness and resilience



- Design better policies
- Adaptive Management (≠ best guess management)



#### Challenges

- Purpose and theory
- Sensitivity analyses, calibration and validation
- Agent representation and behaviour
- Representation of spatial and social environments



#### Purpose and theory

Normal: theory → model → validation → acceptance

Position of ABM not established

- Model as a laboratory
- Use the model to develop theories
- Concern: many assumption remain hidden



### Sensitivity Analysis

- Not straight forward for ABMs
- Adaptation and non-linearity is the problem
- Exploring various methods:
  - Local methods
  - Global methods
  - Ergodicity based methods
  - ...

#### Verification, calibration, and validation

- Verification → model matches design
- Calibration → fine tuning model
- Validation → model matches 'real-world'

Lack of uniqueness in param. estimations. Assumptions outweigh data availability

Exploring serious gaming as tool



#### Next

Olivier: example SES

Eva: Supply chain



# Thank You

Questions

