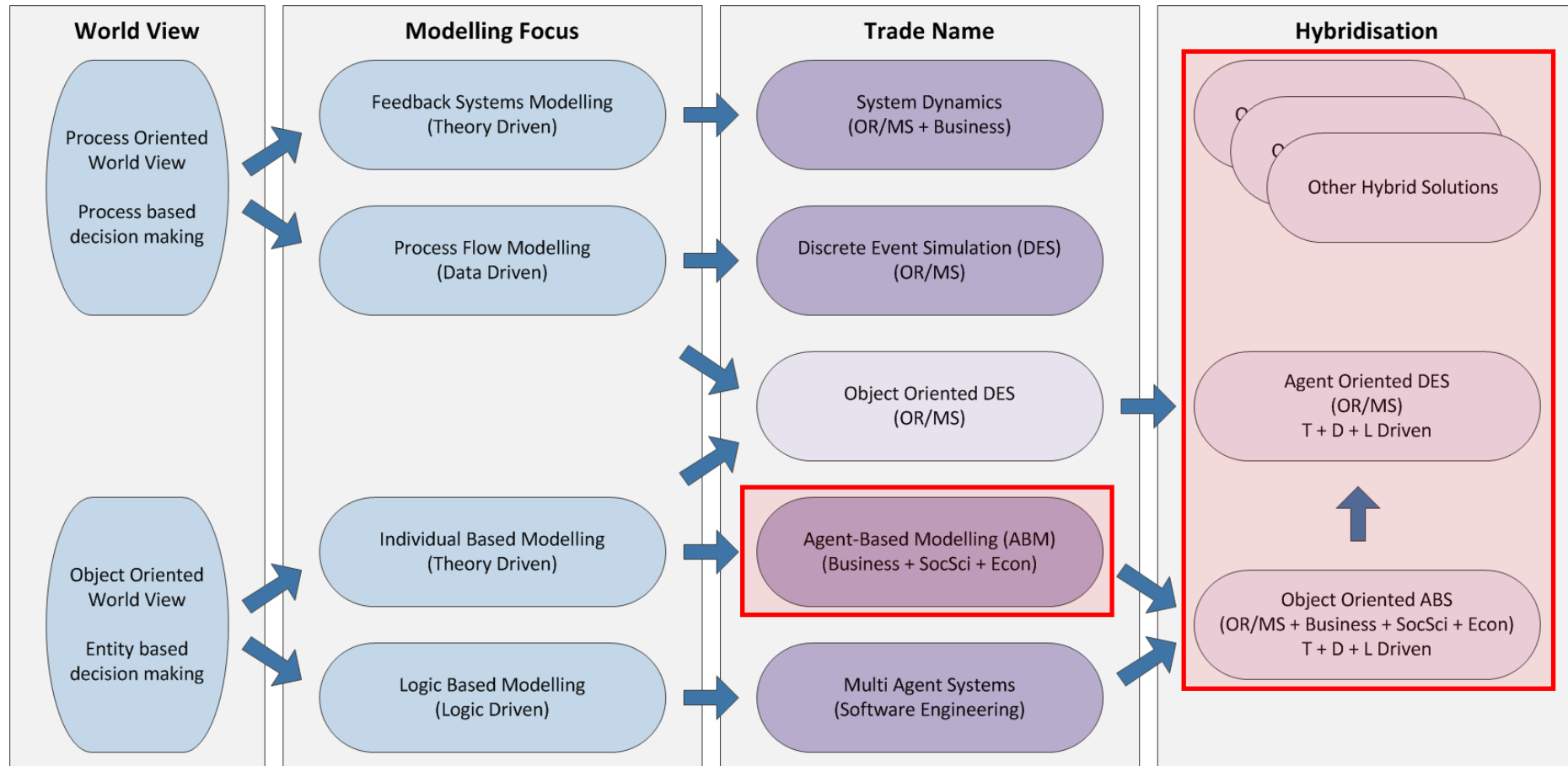


EABSS Workshop 2023

Co-Creation of Agent-Based Social Simulation Models

Agent-Based Modelling and Simulation & Hybrids

Simulation Modelling Framework



Theory Driven: Theories for model formulation; data for model validation
 Data Driven: Data for model formulation (can be quantitative and qualitative); data for model validation
 Logic Driven: Logic for model formulation; data for model validation

Simulation Modelling Framework

- Object Oriented Agent-Based Simulation (OO-ABS)
 - Study of non-queuing systems (organised in terms of objects and their interaction)
 - Behaviour of proactive entities can be defined via a state chart
 - **Decisions (based on behavioural/logic models) are made within the entities**
- Agent Oriented Discrete Event Simulation (AO-DES)
 - Study of queuing systems (organised in terms of queues and flows)
 - Behaviour of proactive entities can be defined via a state chart
 - **Process decisions (based on predefined rules) are made within the process model**
 - **Object decisions (based on behavioural/logic models) are made within the entities**

Agent-Based Modelling

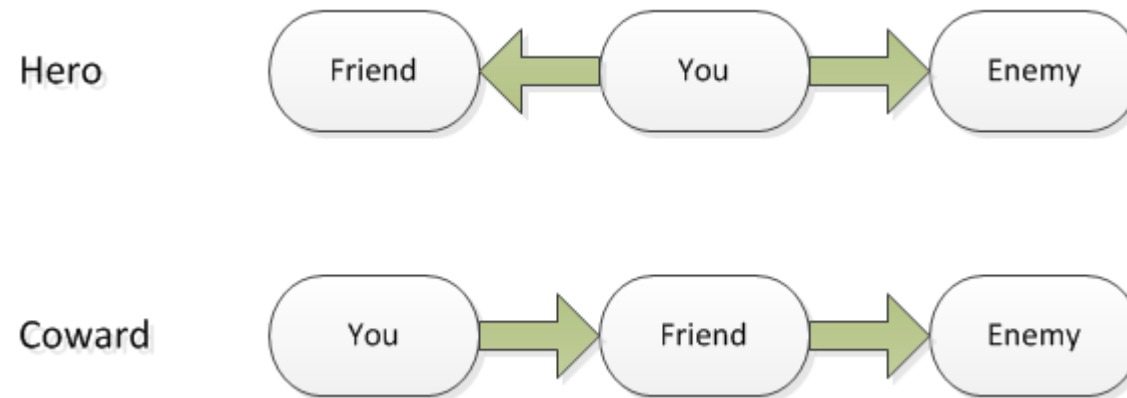




<https://www.youtube.com/watch?v=OMov1aMWscw> (full video)

Agent-Based Modelling

- Heroes and Cowards Game [Wilensky and Rand 2013]

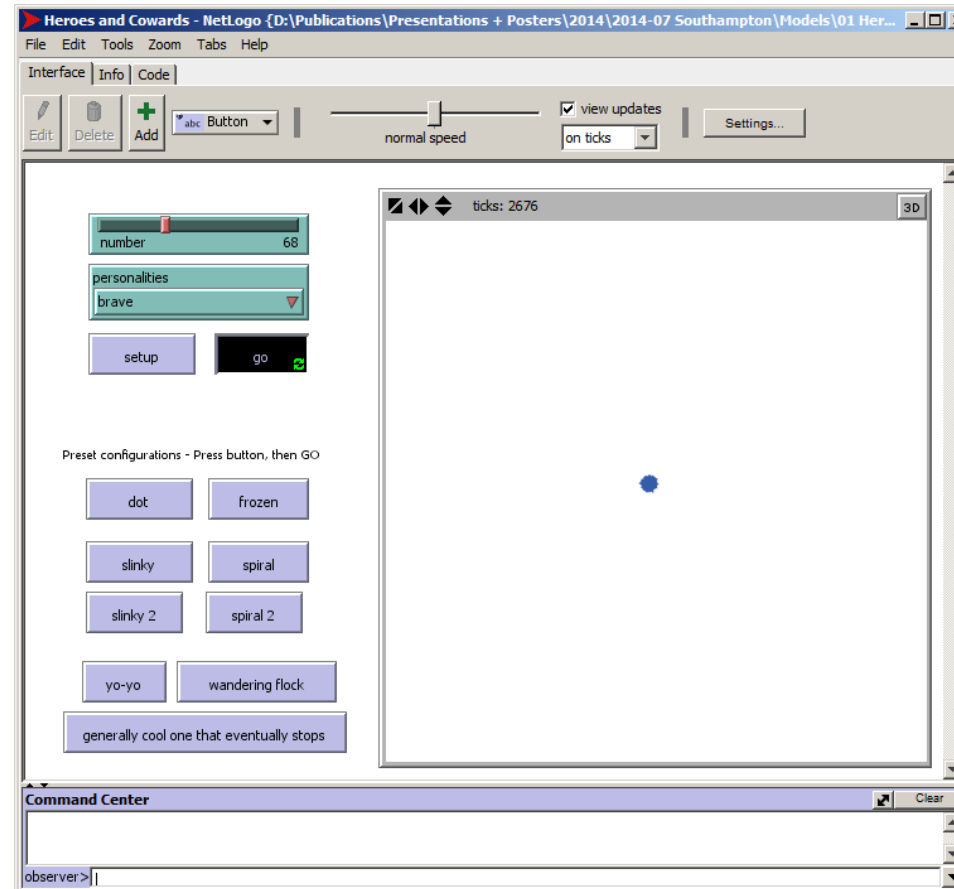






Agent-Based Modelling

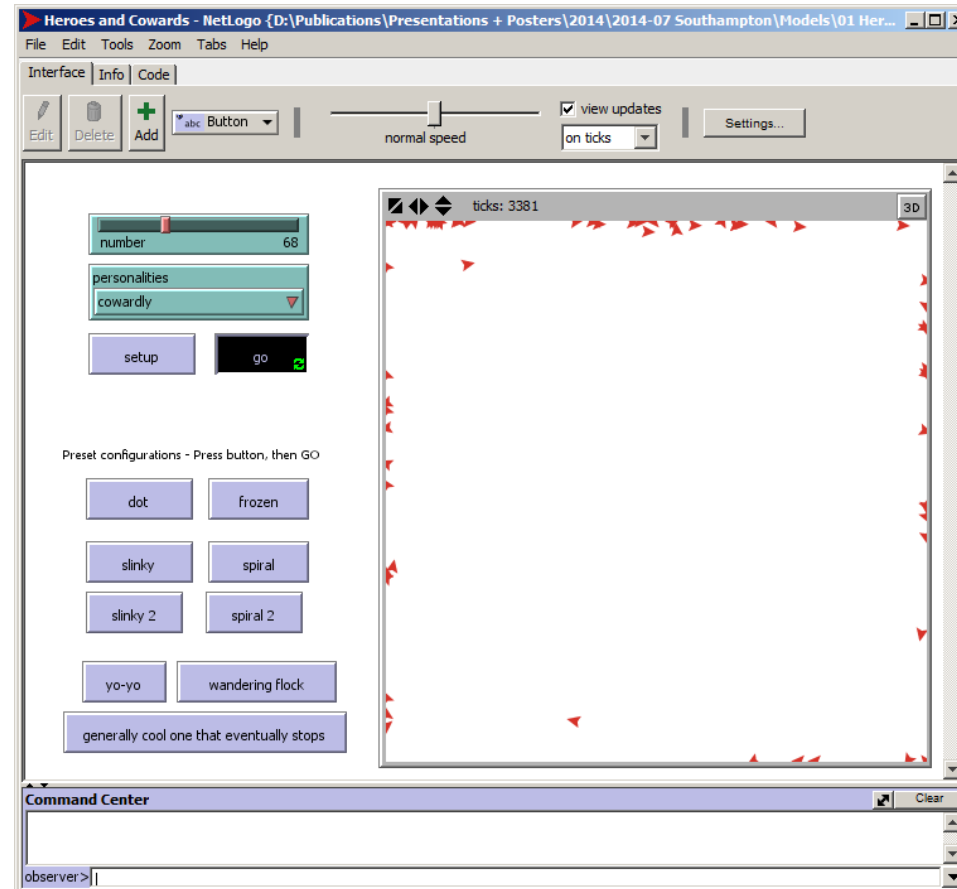
- Heroes and Cowards Game : All heroes





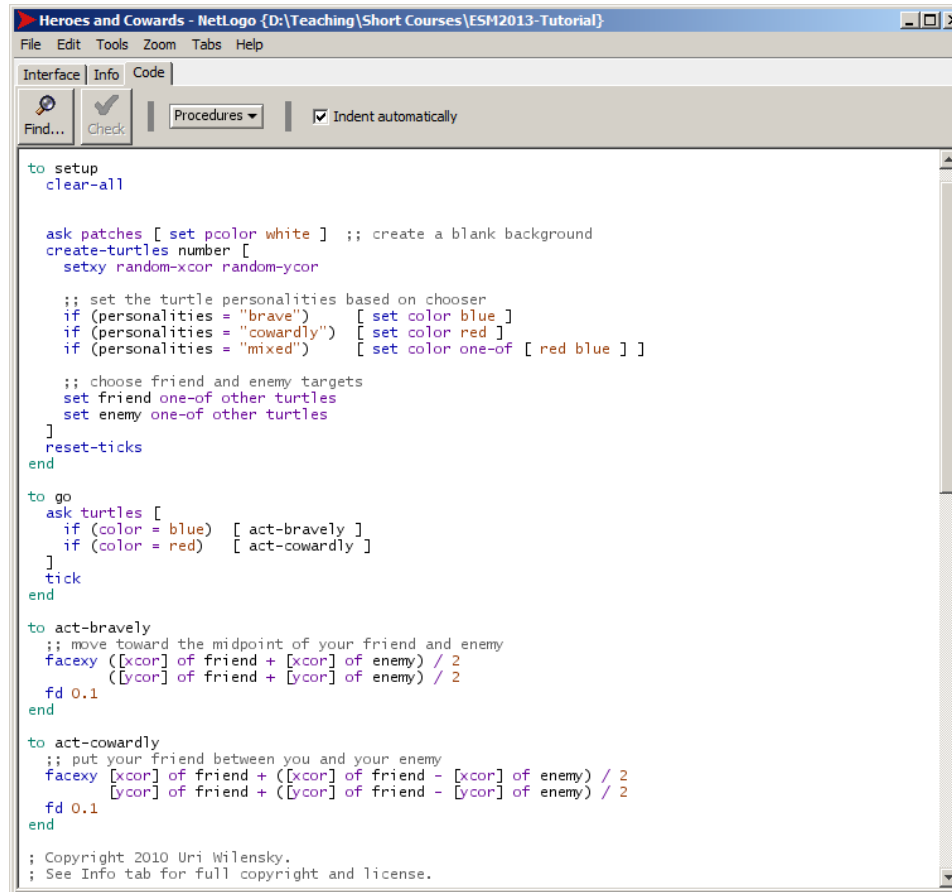
Agent-Based Modelling

- Heroes and Cowards Game: All cowards



Agent-Based Modelling

- Heroes and Cowards Game: Source Code



```
Heroes and Cowards - NetLogo {D:\Teaching\Short Courses\ESM2013-Tutorial}
File Edit Tools Zoom Tabs Help
Interface Info Code
Find... Check Procedures Indent automatically

to setup
  clear-all

  ask patches [ set pcolor white ] ;; create a blank background
  create-turtles number [
    setxy random-xcor random-ycor

    ;; set the turtle personalities based on chooser
    if (personalities = "brave") [ set color blue ]
    if (personalities = "cowardly") [ set color red ]
    if (personalities = "mixed") [ set color one-of [ red blue ] ]

    ;; choose friend and enemy targets
    set friend one-of other turtles
    set enemy one-of other turtles
  ]
  reset-ticks
end

to go
  ask turtles [
    if (color = blue) [ act-bravely ]
    if (color = red) [ act-cowardly ]
  ]
  tick
end

to act-bravely
  ;; move toward the midpoint of your friend and enemy
  facexy ([xcor] of friend + [xcor] of enemy) / 2
  fd 0.1 ([ycor] of friend + [ycor] of enemy) / 2
end

to act-cowardly
  ;; put your friend between you and your enemy
  facexy [xcor] of friend + ([xcor] of friend - [xcor] of enemy) / 2
  fd 0.1 [ycor] of friend + ([ycor] of friend - [ycor] of enemy) / 2
end

; Copyright 2010 Uri Wilensky.
; See Info tab for full copyright and license.
```

Agent-Based Modelling

- Software used: NetLogo
 - <https://ccl.northwestern.edu/netlogo/>



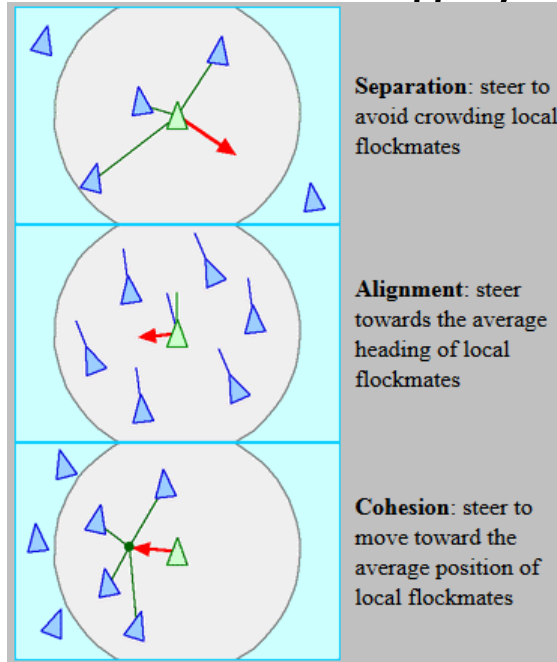
Agent-Based Modelling

- Flocking behaviour



Agent-Based Modelling

- Flocking behaviour modelling by Craig Reynolds [\[url\]](#)



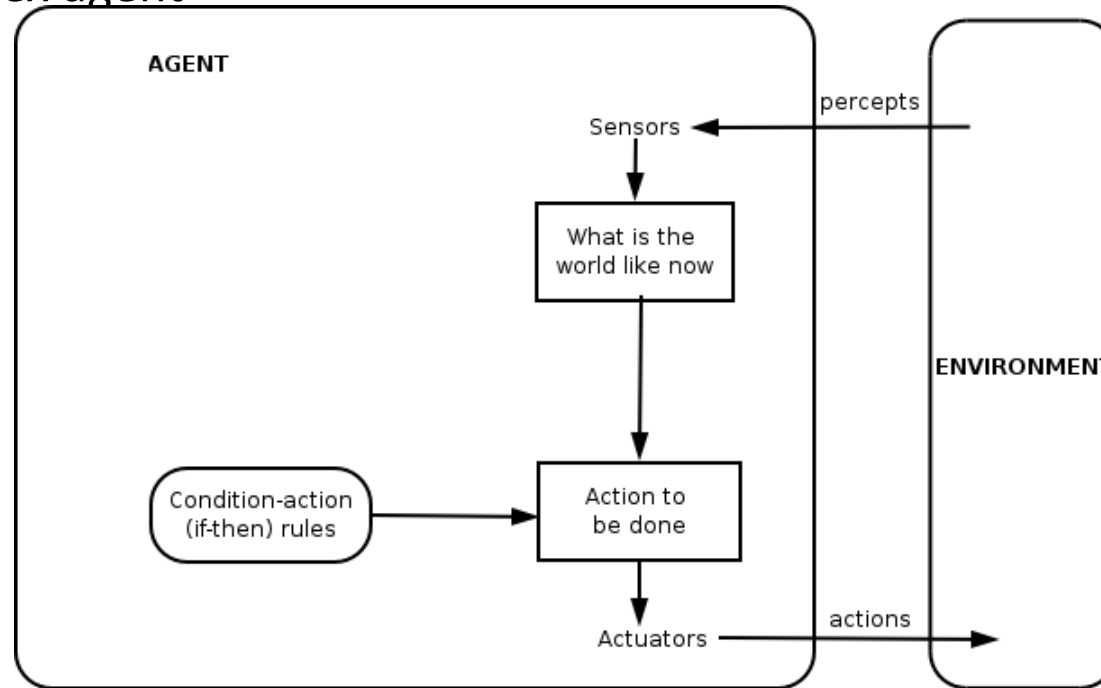
<http://ayearincode.tumblr.com/post/107414487116/this-morning-i-added-some-new-rules-to>

Agent-Based Modelling

- In Agent-Based Modelling (ABM), a system is modelled as a collection of **autonomous decision-making entities** called agents. Each agent individually assesses its situation and makes decisions on the basis of a **set of rules**.
- ABM is **a mindset more than a technology**. The ABM mindset consists of describing a system from the perspective of its constituent units. [Bonabeau 2002]
- ABM is **well suited to modelling** systems with heterogeneous, autonomous and proactive actors, such as **human-centred systems**.

Agent-Based Modelling

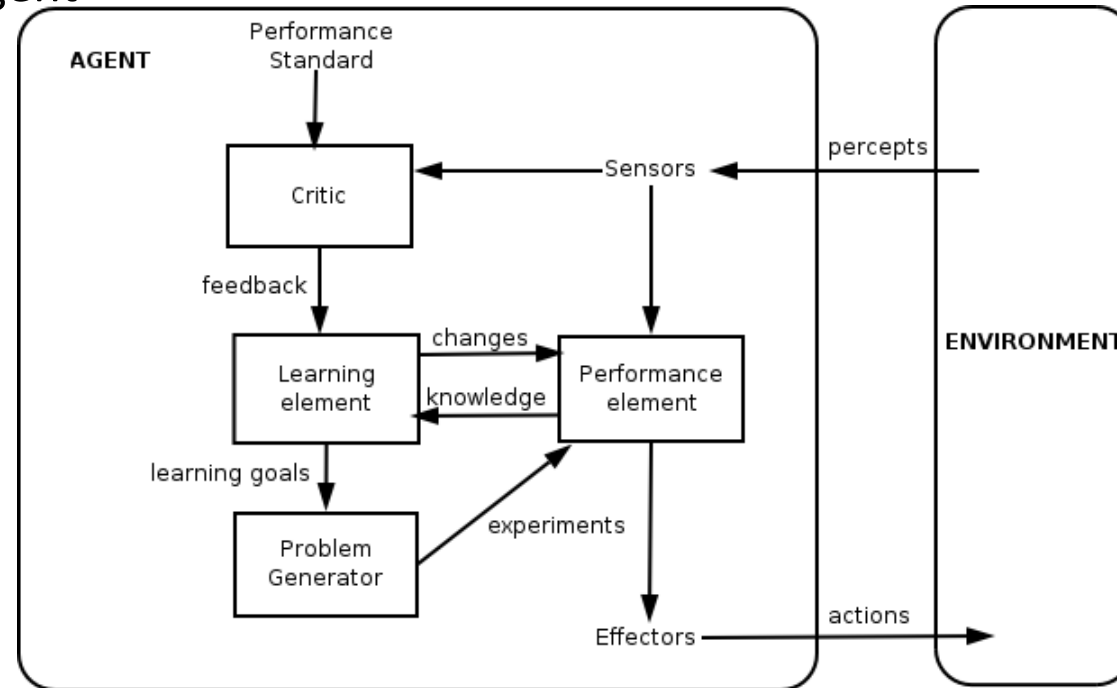
- Borrowing from Artificial Intelligence: From simple to complex
 - Simple reflex agent



Russell and Norvig (2003)

Agent-Based Modelling

- Borrowing from Artificial Intelligence: From simple to complex
 - Learning agent



Russell and Norvig (2003)

Agent-Based Modelling

- What do we mean by "agent"?
 - Agents are **"objects with attitude"** [Bradshaw 1997]
- Properties:
 - Discrete entities
 - With their own goals and behaviours
 - With their own thread of control
 - Autonomous decisions
 - Capable to adapt
 - Capable to modify their behaviour
 - Proactive behaviour
 - Actions depending on motivations generated from their internal state



Agent-Based Modelling

- Agents can represent individuals, households, organisations, nations ...
 - Discrete entities; autonomous decisions; proactive
- ABMs are essentially **decentralised**; there is no place where global system behaviour (dynamics) would be defined
- Instead, the individual agents **interact** with each other and their environment **to produce complex collective behaviour** patterns

Agent-Based Modelling

- Benefits of ABM

- ABM provides a natural description of a system
- ABM captures emergent phenomena



- Emergence

- Emergent phenomena result from the interactions of individual entities. **The whole is more than the sum of its parts** [Aristotle BC] because of the interactions between the parts
- An emergent phenomenon can have properties that are decoupled from the properties of the part (e.g. patterns appearing)
- Example: Traffic Jam Dynamics

Agent-Based Modelling

- When to use ABM (examples)? [Siebers et al. 2010]
 - When the problem has a **natural representation as agents** - when the goal is modelling the behaviours of individuals in a diverse population
 - When entities have **relationships with other entities**, especially **dynamic relationships**
 - When it is important that entities have **spatial or geo-spatial aspects** to their behaviours
 - When it is important that entities **learn or adapt**, or populations adapt
 - When entities engage in **strategic behaviour**, and anticipate other entities' reactions when making their decisions

Agent-Based Simulation



Agent-Based Simulation

- Little Computer People (LCP) @ C64 @ 1985
 - This "House on a Disk" is based on the theory that every computer has an "occupant"; every occupant is different
 - You could communicate with your occupant by asking him what you want him to do
 - "Please play with me"
 - "Please play piano"
 - "Please write a letter to me"
 - "Please talk to me"



Agent-Based Simulation

- The Sims: Interactive Organisational Agent-Based Simulation



Agent-Based Simulation

- Building an ABS model (OR/MS)

- Identify active entities (agents)
- Define their states and behaviour
- Put them in an environment
- Establish connections
- Test the model

AnyLogic Help (2013)

- Validating an ABS model

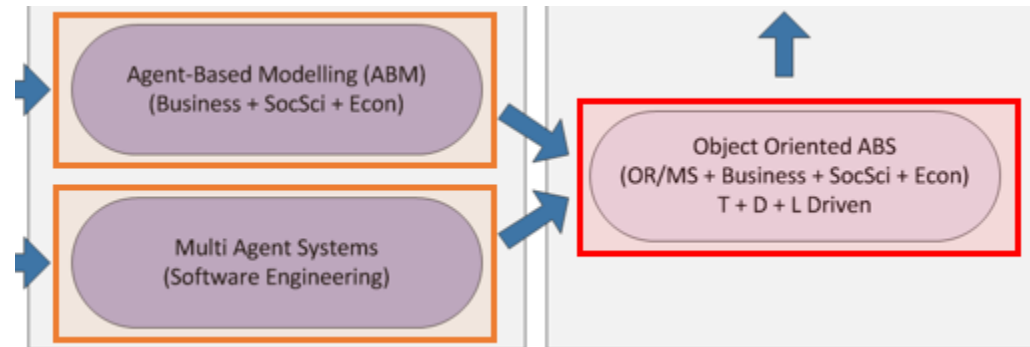
- System behaviour is an emergent property
- Validation at micro level
- Plausibility check of emerging patterns at system level (e.g. comparison to observations)

- Alternative (e.g. Ecology)

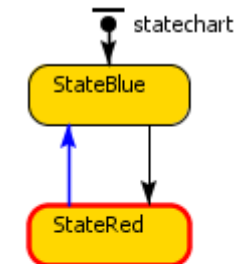
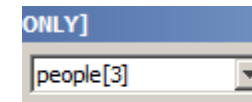
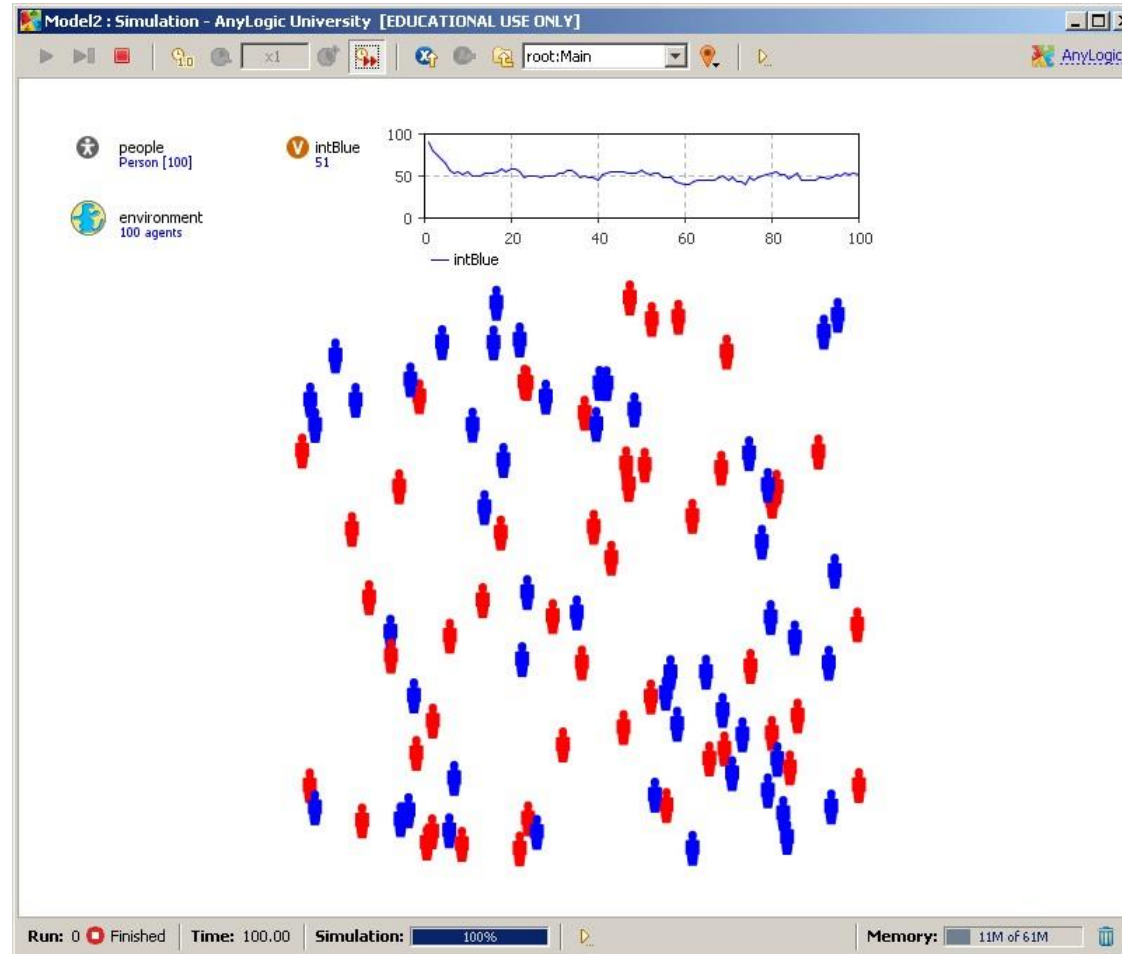
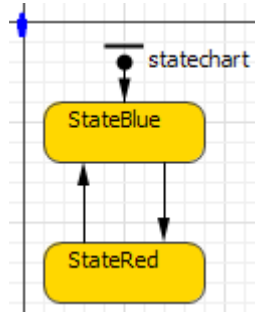
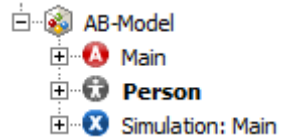
- Formulate the question
- Assemble hypothesis
- Choose model structure
- Parameterise the model
- Implement the model
- Analyse the model
- Communicate the model

Grimm and Railsback (2005)

Hybrids: Object Oriented ABM



Simple Agent-Based Example





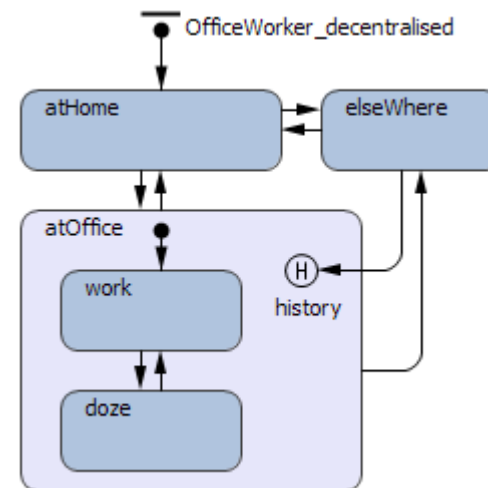
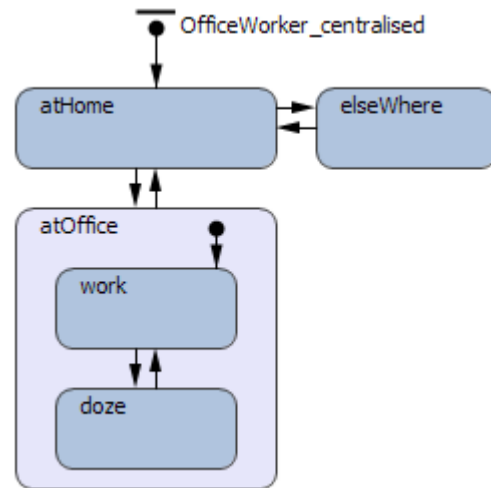
Building Simple State Charts Step-by-Step

- Simulating an office scenario
 - What question would you like to answer?
 - Consider "What-If" or "How Many" type of questions and choose one to continue
 - Who are the actors relevant to your question?
 - Come up with 2-3 actor types based on their roles
 - What are the key locations you can find them?
 - Keep it simple (approx. 3 locations)
 - What are key time consuming activities they get involved in?
 - Keep it simple (approx. 3 activities)
 - Define a state chart for one of your actor types
 - Consider key locations and key time consuming activities relevant for this actor type

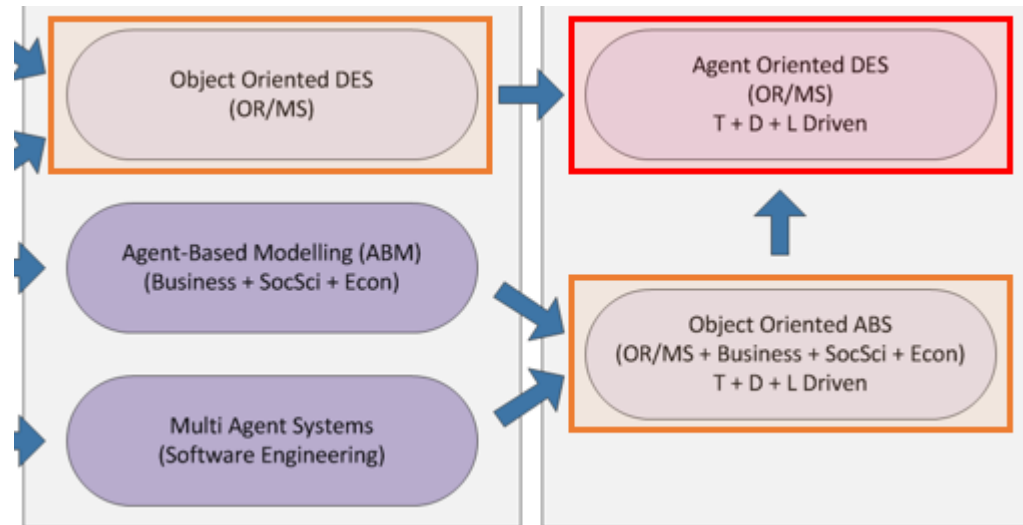


Building Simple State Charts Step-by-Step

- What is the principal difference between these solutions?



Hybrids: Agent Oriented DES



Object Oriented DES > Alternative 1: Study of queuing systems + active objects

Case Study

Modelling Staff Proactiveness in Retail Simulations



Hybrids: ABM & SDM



Case Study

Hybrid Climate Assessment Modelling



Any Questions?



References

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