

# Intro to ABMs

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## What is an agent-based model (ABM)?

- No rigorous definition (like most applied science)
- But: can characterize as a model consisting of
  1. **entities** (the agents)...
  2. ...which **act**<sup>1</sup> upon each other...
  3. ...in some kind of **environment**...
  4. ...to create some **emergent** outcome
- “Emergent” = collective is more than the sum of its parts
- Implemented computationally, sometimes also analysed mathematically

## What is the benefit of ABMs?

“Like equation-based modeling, but **unlike prose**, agent-based models must be **complete, consistent, and unambiguous if they are to be capable of being executed on a computer**” (Gilbert 2020, xii, my emphasis)

- **complete**: the modeller cannot leave anything out of the model description
- **consistent**: no part of the model can logically contradict another part of the same model
- **unambiguous**: the meaning of every part of the model must be objectively clear

## Examples

These concepts are best explained through the use of examples...

...so let's look at a few!<sup>2</sup>

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<sup>1</sup>Eng. *agent* < Lat. *agens*, pres. part. of *ago* ‘act’

<sup>2</sup>The examples are taken from the [Example Zoo](#) of the Agents.jl package (released under the MIT license).

## Example 1: Conway's Game of Life

- Early example of a **cellular automaton** (Gardner 1970)
- Lattice; each cell either “live” (L) or “dead” (D)
- Rules:

Rule	Cell	Neighbourhood	Result
“underpopulation”	L	< 2 L cells	L → D
“sustenance”	L	2 or 3 L cells	L → L
“overpopulation”	L	> 3 L cells	L → D
“reproduction”	D	3 L cells	D → L

[../videos/game\\_of\\_life.mp4](#)

## Question

Earlier we said ABMs are complete, consistent and unambiguous.

**What have I left out of the definition of Conway's Game of Life?** (I.e. why is my description so far incomplete?)

### Answer

Three very important things (at least):

1. Is the lattice **finite** or **infinite**? If finite, then what happens at the boundaries? – *It is infinite.*
2. Are the agents (the cells) updated **synchronously** (all at once) or **asynchronously**? – *Synchronously.*
3. How are a cell's **neighbours** defined? – *It's the 8 cells surrounding it.*

## Species

The game supports many life forms (“species”), categorized into:<sup>3</sup>

- still lifes
- oscillators
- spaceships (moving oscillators)

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<sup>3</sup>Images of Game of Life species from Wikimedia Commons (public domain).

## Emergence

- The game has simple rules, complex behaviour
- It is **undecidable**: given a starting state S and a proposed other state O, *we can prove that it is impossible to prove* whether O will ever be reached from S!
- New facts about the game are still being discovered: 2018 discovery of “knightships” (spaceships that move like the knight in chess)

### Example 2: Flocking

<https://youtu.be/dedVszDI9aE?si=D-L4ccVFdIUUnN658>

### Example 2: Flocking

- A simple model of the emergence of collective behaviour, flocking in birds<sup>4</sup>
- Birds follow three rules:
  1. Collision avoidance: maintain a minimum distance to other birds
  2. Tracking: fly towards the average position of neighbouring birds
  3. Navigation: fly in the average direction of your neighbours

[../videos/flocking.mp4](#)

### Example 3: Social Distancing

- SIR (susceptible-infected-recovered) models are used to model epidemics, e.g. the spread of viruses<sup>5</sup>
- Such models can be extended with aspects such as social distancing – implemented here as agents which remain stationary
- In the following animations,
  - black dot = susceptible (healthy) individual
  - red dot = infected individual
  - green dot = recovered individual

[../videos/epidemic\\_noisolation.mp4](#)

[../videos/epidemic\\_isolation.mp4](#)

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<sup>4</sup>Reynolds (1987), and much research thereafter, importantly Vicsek et al. (1995) and subsequent.

<sup>5</sup>See Vynnycky and White (2010) for an overview.

## Bounded rationality / Locality

- Common to all these examples is the following observation: the agents have **bounded rationality**
  - In Flocking, individual birds follow only three simple rules defined over the bird's neighbours
  - A bird **does not know** what flocking means, nor does it have a rule to accomplish flocking
  - Rather, flocking emerges as the collective behaviour of a group of birds
- In other words, **global** patterns arise from numerous **local** interactions
- Similar remarks apply to Game of Life and Social Distancing, indeed to **any** ABM

## Challenges in ABM

- How do we know what to model?
- How do we test our models against empirical data?
- How do we implement our models computationally?

## Challenges of computational implementation

- Speed: we want simulations to be fast
- Randomness: when our code calls for random numbers, we want them to be really random!
- Cleanliness: we want our code to be understandable to other users
- Reproducibility: when others run our code, they should get the same results we do

## Why is speed an issue?

- Central processing units (CPUs) in modern computers carry out billions of instructions each second
- However, with ABMs, computational requirements may be significant, and may not **scale** nicely

## Example/Exercise

- Assume:
  - You have a model such that one simulation run, with a given set of parameter values, takes 1 minute to complete.

- Your model has 2 parameters, each of which can assume 100 different values.
- You want to replicate the simulation for each parameter combination 100 times for statistical reasons.
- How long will it take for your entire simulation to complete?

#### Answer

2 parameters with 100 values each results in  $100 \times 100 = 10,000$  parameter combinations. Thus, in total, we have  $100 \times 10,000 = 1$  million simulation runs to complete. If each run takes 1 minute, the total is 1 million minutes. This corresponds to roughly **2 years!**

### How to deal with issues of speed

1. Choose a suitable programming language
2. Write **performant** code
3. Whenever possible, **parallelize** your code
  - This means running it simultaneously across many CPUs/computers; we will see later how it's done

### Why is randomness needed?

- Quite simple: real-world processes are complex, and to model such complex processes we resort to **stochastic processes**
- A stochastic process is a sequence of random variables
- For example, consider a “navigating” agent that turns into a random direction whenever it doesn't know how to proceed otherwise. In this case, the random direction needs to be generated using a **random number**.
- Or consider a linguistic example: suppose Mary is friends with Bob, Fiona and Charles. Unless we want to claim that Mary's interactions with the other people are **deterministic** (which does not seem particularly sensible), we need some way of selecting interlocutors at random.

### Why is randomness an issue?

- Conventional computers are deterministic devices
- So, if we need, say, a random number between 0 and 1, how is that accomplished?
- The answer is a **pseudorandom number generator** (PRNG)
  - This is an algorithm that generates a (long, but not infinite!) sequence of numbers which has the *appearance* of being random

- The sequence is generated from a **seed** number. If you give the PRNG the same seed, you will get the same “random” sequence of numbers (this takes care of the reproducibility requirement).
- **However**, there are significant issues...

## Issues with PRNGs

- Suppose your PRNG generates a sequence of 1M numbers...
- ...but in your simulation you need to generate 10M random numbers<sup>6</sup>
- Then your “random” numbers will repeat 10 times
- This means that different parts of your simulation are **not** independent of each other – a major problem!
- Further issues can arise when we look at parallel processing... but more on that later!

## Summary

- ABM is a powerful framework for modelling real-world processes
- Models are complete, consistent and unambiguous
- Individual agents exhibit bounded rationality
- Challenges involve, among other things, simulation speed and proper implementation of randomness

## The scientific community

- ABMs are created and explored by people in all manners of disciplines from physics and chemistry to linguistics and economics
- Examples of professional organisation in social sciences and linguistics:
  - [European Social Simulation Association](#)
  - [The Journal of Artificial Societies and Social Simulation](#)
  - [The International Society for Computational Social Science](#) (+IC2S2 conference)
  - [Language Dynamics and Change](#) (journal)

## Homework

Next week, we will begin programming. To prepare your computer for this, complete the homework [Installing Julia](#).

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<sup>6</sup>We’ll see later that this is by no means a crazy requirement!

## References

- Gardner, Martin. 1970. “The Fantastic Combinations of John Conway’s New Solitaire Game ‘Life’.” *Scientific American* 223 (4): 120–23. <https://doi.org/10.1038/scientificamerican1070-120>.
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