## Emergence and social dynamics

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## Overview

Computational social science
Agent-based models
Emergence in sociology
Types of emergence
it An example
The implications

## What is computational social science?

- Models
+ Programs as models
- Mechanisms
+ Realist accounts of the way the social world works
- Experiments
+ Experimenting on the model, as a second best to experimenting on the social world


## Example: Market

- Many agents trading with each other
- Each trying to maximise its own welfare
- Neo-classical economics assumes that markets are at equilibrium, where the price is such that supply equals demand
- But with a cellular automata, we can model markets in which the price varies between localities according to local supply and demand



## Example: Sugarscape

- Agents located on a grid of cells
- Trade with local neighbours
- Two commodities: sugar and spice. All agents consume both these, but at different rates
- Each agent has its own welfare function, relating its relative preference for sugar or spice to the amount it has 'in stock' and the amount it needs
- Agents trade at a price negotiated between them when both would gain in welfare



## Example: Sugarscape



## Results

- The expected market clearing price emerges from the many bilateral trades (but with some remaining variations)
- The quantity of trade is less than that predicted by neoclassical theory
+ since agents are unable to trade with others than their neighbours
- And...
+ the effect of trade is to make the distribution of wealth (measured in sugar) more unequal


## Agent-based models

- Agents are units that have behaviour
- They act within a (simulated) environment
- Agents can react to other agents, pursue goals, communicate with other agents, move around within the environment
- Macro-level features can emerge from the interaction of agents



## Emergence

- Some individual particles
+ people
+ groups
+ organisations
+ nations
- A system of which these are components
+ a society
+ an institution
- A complex system
+ a firm
+ particles interact in a non-linear way
- The system has properties that are characteristic of the system, but not of the particles + inequality
+ status
+ language
- Methodological individualism
+ e.g. Max Weber (I864-1920)
+ he argued that individual actions and beliefs (e.g the Protestant Ethic) led to the mergence of social institutions (e.g. capitalism)
- Methodological collectivism
+ e.g. Emile Durkheim (1858-1917)
+ He argued that social facts had an independent existence greater and more objective than the actions of the individuals that composed society and could only be explained by other social facts

- Ever since, there have been controversies about whether social explanations should be formulated primarily in terms of structure or of agency, or how some synthesis can be achieved
- Computational social science provides the opportunity to dissolve such disputes!
- Agent-based models can provide the experimental laboratory to investigate emergence



## Examples of social emergence

- In space
- In time
- Second-order emergence

State opening of Parliament of Trinidad and Tobago


## Emergence in space

Central London:
Poverty 1896 (deep red = poorest)

Poverty 1991 (deep red = poorest)

Standardised mortality ratio, 1991
(~ lifespan)

Danny Dorling, Richard Mitchell, Mary Shaw, Scott Orford, George Davey Smith (2000) The Ghost of Christmas Past: health effects of poverty in London in 1896 and 1991 BMJ. December 23; 321(7276): 1547-1551.

## Emergence in time



## Second-order emergence

- Individual action leads to emergent social structures
+ Social structure = rules, norms and regularities
- These structures are the matrix in which action takes place
- This action maintains and changes the structures



## An example of emergence using an ABM



- Thomas Schelling proposed a theory ${ }^{\dagger}$ to explain the persistence of racial segregation in an environment of growing tolerance
- He proposed: If individuals will tolerate racial diversity, but will not tolerate being in a minority in their locality, segregation will still be the equilibrium situation


## A segregation model

- Grid 500 by 500
- I500 agents, I050 green, 450 red
- so: 1000 vacant patches
- Each agent has a tolerance
- A green agent is 'happy' when the ratio of greens to reds in its Moore neighbourhood (i.e. in the 8 surrounding patches) is more than its tolerance
- and vice versa for reds
- With a tolerance of $40 \%$, an agent is happy even when up to $60 \%$ of its neighbours (a slight majority) are the other colour
- Randomly allocate reds and greens to patches
- Then the average number of neighbours of the same colour is 58\% (about 5)
- And about I8\% of the agents are unhappy


## Aggregation

- No dynamics
- No emergence
- No patterns of segregation
- Features are just the aggregation of the cells' characteristics
- Percents similar and unhappy can easily be calculated from an analytic formula
- So this is the 'base case'

cress


## Adding dynamics

- Unhappy agents move along a random walk to a patch where they are happy
- Emergence is a result of 'tipping'
+ If one red enters a neighbourhood witti4 reds already there, a previously happy green will become unhappy and move elsewhere, either contributing to a green cluster or possibly upsetting previously happy reds and so on...


## Emergence

- The Schelling model is used as a standard example of emergence
- Values of tolerance above $30 \%$ give clear display of clustering: 'ghettos'
- Even though agents can tolerate $70 \%$ of their neighbours being of the other colour in their neighbourhood, the average percentage of same-colour neighbours is typically $75-80 \%$ after everyone has moved to a satisfactory location (risen from $58 \%$ before relocations)



## Emergence and self-organisation

- Eventually, in this model, all agents find a resting place, resulting in a static equilibrium
- But this is not typical of the social world, where agents are constantly on the move
+ Immigration, emigration, births, deaths...
- Self-organisation occurs in social situations when there are emergent patterns, even though the agents are changing their identity
+ Compare John Holland's example of a bow wave:


## Clusters remain even when agents come

$5 \%$ of agents 'die' and are replaced with agents of random colour every timestep


## There are also many other examples of locational clusters...

- Ethnic businesses
+ Chinese and Turkish restaurants
- Immigrant communities
+ German and English in Majorca
- Religious communities
+ Protestant and Catholic in N. Ireland
- Wealthy neighbourhoods

+ Notting Hill
- Technology clusters
+ Cambridge Science Park


## Does this make it an adequate model of ethnic

 segregation?- The Schelling model is (presumably) equally applicable to
+ Coagulations of particles
+ Packs of animals
+ Etc.
- So it has been regarded as a prototypical model of how simple models can be applied to complex social phenomena


But this can only be done by ignoring some fundamental characteristics of human societies...

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## Upward and downward effects

- Individual actions by agents yield macro level features (clusters)
- Clusters constrain individual action




## Downward effects

- Assume: Predominantly red areas have higher crime rates
+ Crime rate: a macro-level attribute
- As a result, property within such areas is cheaper
+ Assume property price $\mathrm{P}=(9-\mathrm{R}) /(9-\mathrm{G})$
+ Where
- $R$ is the number of red neighbours
- $G$ is the number of green neighbours
- An agent can only move to a spot where the property price is less than or slightly above the agent's current property value (its wealth)
+ Agent can move if $P_{\text {current }}+\mid>=P_{\text {new }}$


## Consequences

- Reds that are surrounded by other reds are poor because they are in high crime areas and so have cheap homes
- Reds surrounded by greens are weaithy, and move to red areas
- Greens surrounded by reds are poor and
 can't move to desirable green areas
- Greens surrounded by greens aie rich and don't want to move

Background shade marks crime rate (dark: high crime rate, low property values; light: low crime rate, high property values)

## Recognising emergent features

- While the observer can see the emergent features, the agents can't
- But in human societies, people can recognise (and act on) emergent features
- Their reactions can in turn affect those features
- Thus, second-order emergence
- also called
- The double hermeneutic
- Immergence


## Examples

- Clubs and societies


Junior Audubon Club Members and birdhouses, circa 1915

- Recognised by the participants, with a name for the group
- Formal organisations
- Companies, universities, hospitals, legislatures
- Institutions
- The Church, the law,
- Localities
- Chicago, London, Harlem

In these and other examples, the fact that you are a member (or are not a member) changes the rules of interaction between you and other agents

## 2nd order emergence in Schelling's

- A patch that is adjacent to 4 or more patches in which there are red agents is labelled a 'red' patch permanently
- And similarly for patches adjacent to 4 or more green agents
- Then red agents will only move to
- patches that have no label or
- red patches
- and similarly for green agents
- Thus the agents recognise what is a 'good' patch for them
- The labels don't always reflect the current situation, but are based on what was the case previously
- Generates stereotyping of neighbourhoods


The colours of the patches (dark red or green) show the labels applied to the districts as a result of the colour of the agents that are there now or were there previously

## Heterogeneity



- In previous models, all agents have been identical except for
- Their location
- Their colour
- For example, all have exactly the same tolerance.
- This is clearly unrealistic for human groups
- We can experiment with
- Random variations in tolerance, to represent unmeasured differences
- Tolerance correlated with colour, to represent systematic differences such as class, ethnicity etc.


## Conclusion

- All these models of segregation are 'right' at some level of abstraction
- A model that is appropriate for particles can also be used to model social phenomena, provided that you accept that it omits characteristic features of human society
- But all models omit something!


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## questions?

