Agent-Based Social Simulation Modelling: Cui Bono?

Scott Moss

Introduction: Cuibono

- Who benefits? Who do you want to benefit?
- Has there been an impact on
 - social and economic policy?
 - business or commercial policy or strategy?

• other social disciplines such as history, sociology, anthropology, archaeology?

Plan of my talk

- Social behaviour and complexity
- Simplicity (parsimony): a poor justification for model design • Opinion dynamics: inheritance of bad modelling habits
- How general are the bad habits?
- Balancing evidence and theory in agent-based modelling
- How to benefit stakeholders (if you want to)
- A concluding (curmudgeonly) challenge

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 - If an opinion or view is important, then finding that a close friend has a contrasting view results in either a change in the relationship or a change in one's view or, sometimes, both opinions changing to a compromise position

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- All heavy-tailed distributions of relative changes

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 - The system is slowly driven so that new information or events leave most agents below their critical thresholds for change most of the time.

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- A few cases in ABSS (none in economics) where simplification is guided by evidence in designing a model
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- NG found paper with slow-driving information: volatility was exhibited ("On the Robustness of Democratic Electoral Processes to Computational Propaganda")
- Paper by Meyer and Edmonds on Austrian politics



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 - For example, an appeal for saving water rather than the French Revolution

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Theory-first or evidence-first "My model is my theory" — Nigel Gilbert

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 - moving consumer goods, London housing strategy, HIV-AIDS in rural South Africa

• My own work in water demand and climate change, post-Soviet Russian economy, markets for fast-

Evidence-based modelling Simplification

- The evidence guides simplifications
 - Domain experts (stakeholders or academics) indicate what is important to model explicitly
 - If results turn out to be sensitive to some artificial simplification, domain experts can indicate how to elaborate that element

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 - Link outputs to model design and behavioural specifications and then to evidence for design and specifications

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- Restricted sources of public funding

 - OCOPOMO in top 4 of projects for funding in computer science programme • Proposal using OCOPOMO ranked 25th for funding in social science programme

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- Facilitates stakeholder communication
 - But stakeholders committed to the outcome rather than the reasons will probably dismiss anything that undermines their objectives
 - Precision avoids verbal fudges and could lead to conflict rather than compromise?

Modellers?

Modellers? Society?

Modellers? Society? Both?

Cuibono?

Modellers? Society? Both? The choice and the future are yours



Finalthoughts

- Diversity and good fellowship characterised social simulation from the beginning
 - Some policy models
 - Lots of abstract models produced by physicists and engineers
 - Model and modelling languages based on logical formalisms
 - •
- Scant impact on policy or strategy in the real worl
- Policy makers seek endorsement of their aims
 - Ideology dominates evidence
- Evidence-based, agent-based social simulation could make difference but we have to make the case • This would require a cohesive and public effort to point out where our models would have made a
- difference to outcomes
- ESSA well placed to organise and oversee a campaign to make ABSS a key feature of policy formation