

# Agent-based modelling of value chains



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# Outline

- (Very brief) Introduction to Agent-Based Modelling
- Agent-Based Modelling of Value Chains
- Application to Agricultural Context
- Next Steps



# Agent-based modelling



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- Represents heterogeneous interacting individuals explicitly
  - Systemic observations are seen as ‘emerging’ from these
    - Complex systems basis
    - Traditional formal approaches not capable of capturing emergent structure
- Sometimes represents a physical and/or dynamic ecological environment



# (Traditional) Economics and ABM



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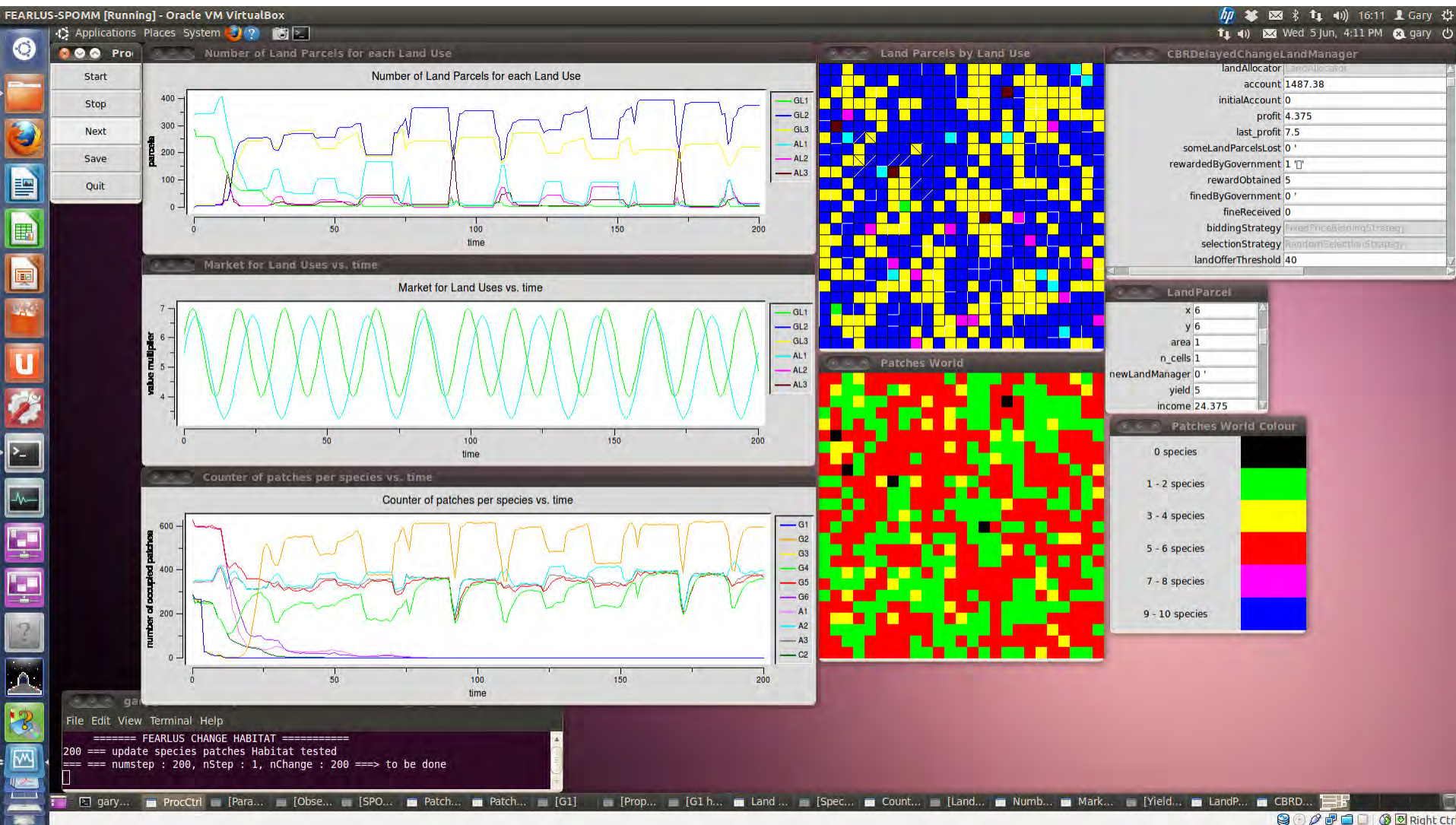
- Out-of-equilibrium dynamics
- Psychologically or theoretically plausible decision-making
- Feasibility of spatially explicit modelling
- Social networks, social interaction
- Fewer constraints imposed by method



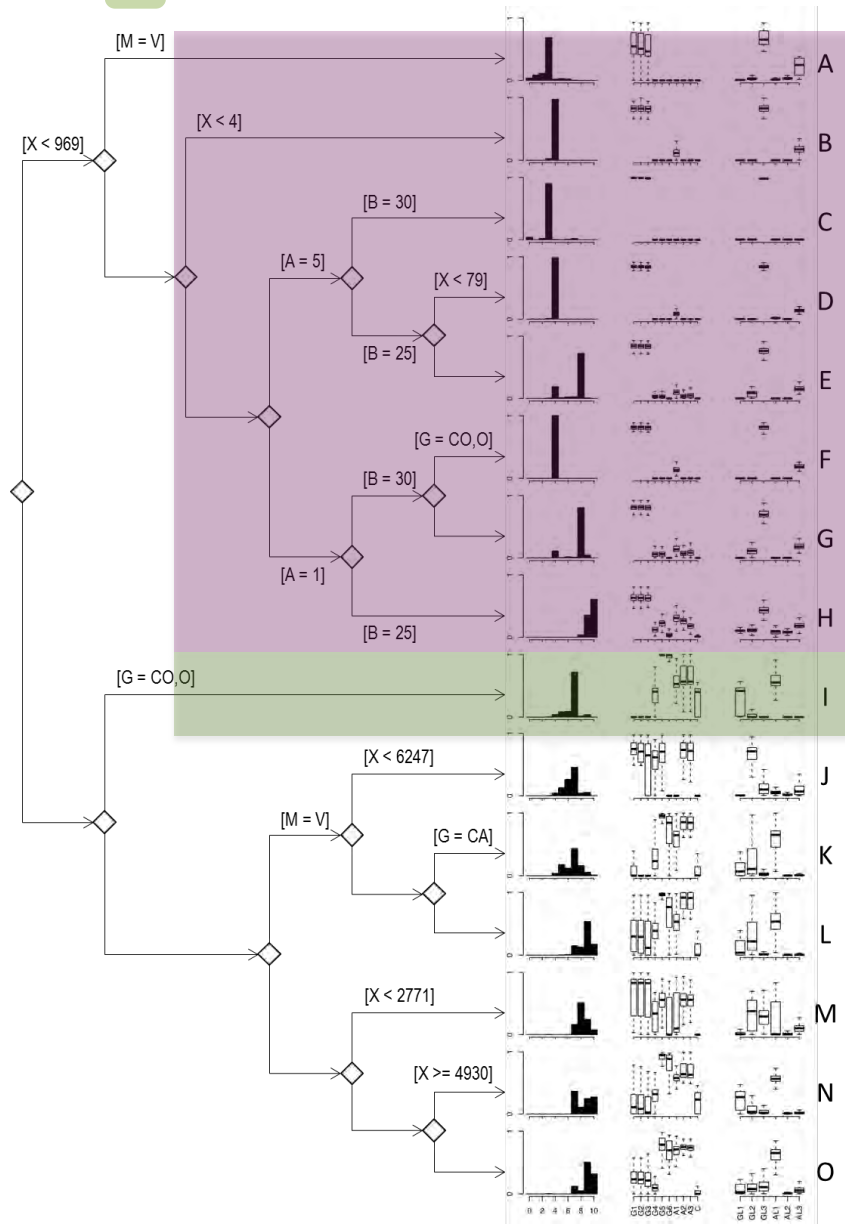
# Example: Biodiversity incentives



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# Example cont'd: analysing results



- Below a threshold of government expenditure, the market drives outcomes, and species richness is lower
- Above the threshold, policy is the main driver
  - Outcome based incentives seem more robust to other influences (market, input costs, aspirations)



# Example in supply chain context

- Van Dyke Parunak et al. (1998, LNAI 1534) compare AB and traditional (ODE) models for supply chains
  - ABMs easier to build and use to represent discrete decision making
  - Separation of interaction and physical space possible
    - No constraints on social network topology
  - Validation at micro and macro levels can be done
    - See also Moss and Edmonds (2005) Am J. Soc.
  - Better support for ‘what-if’ scenarios
    - Largely because of more natural representation



# Various examples of ABM in supply chains

- Often quite specifically focused on manufacturing and processing environment; managing stock levels, logistics, managing risk:
  - Julka et al. (2002) *Comp. Chem. Eng.*
  - Kaihara (2003) *Int. J. Prod. Econ.*
  - Giannakis & Louis (2011) *J. Purch. Supply Mgt.*
- Models often theoretical rather than tailored to case studies.  
Exceptions:
  - Rouzafzoon & Helo (2016) *Ind. Mgt. Data. Sys.:* application to health service supply chain
- Very few cases in agricultural / bioeconomy sector
  - But, e.g. Hidayat & Marimin (2014) *Int. J. Supply Chain Mgt.:* Palm oil





# Application to Agriculture

- Agents are businesses in the agricultural value chain
  - (Would be better to think of value networks/webs/graphs)
- Interactions comprise exchange of capital
  - Money, goods
  - Also: knowledge, experience, tokens of cultural identity and group inclusion
  - Also: 'circularity' – exchanges of 'unwanted' materials
- Mediated through space and spatially situated undertaking of activities
- ABM well-suited to handling this kind of complexity



# Towards implementation

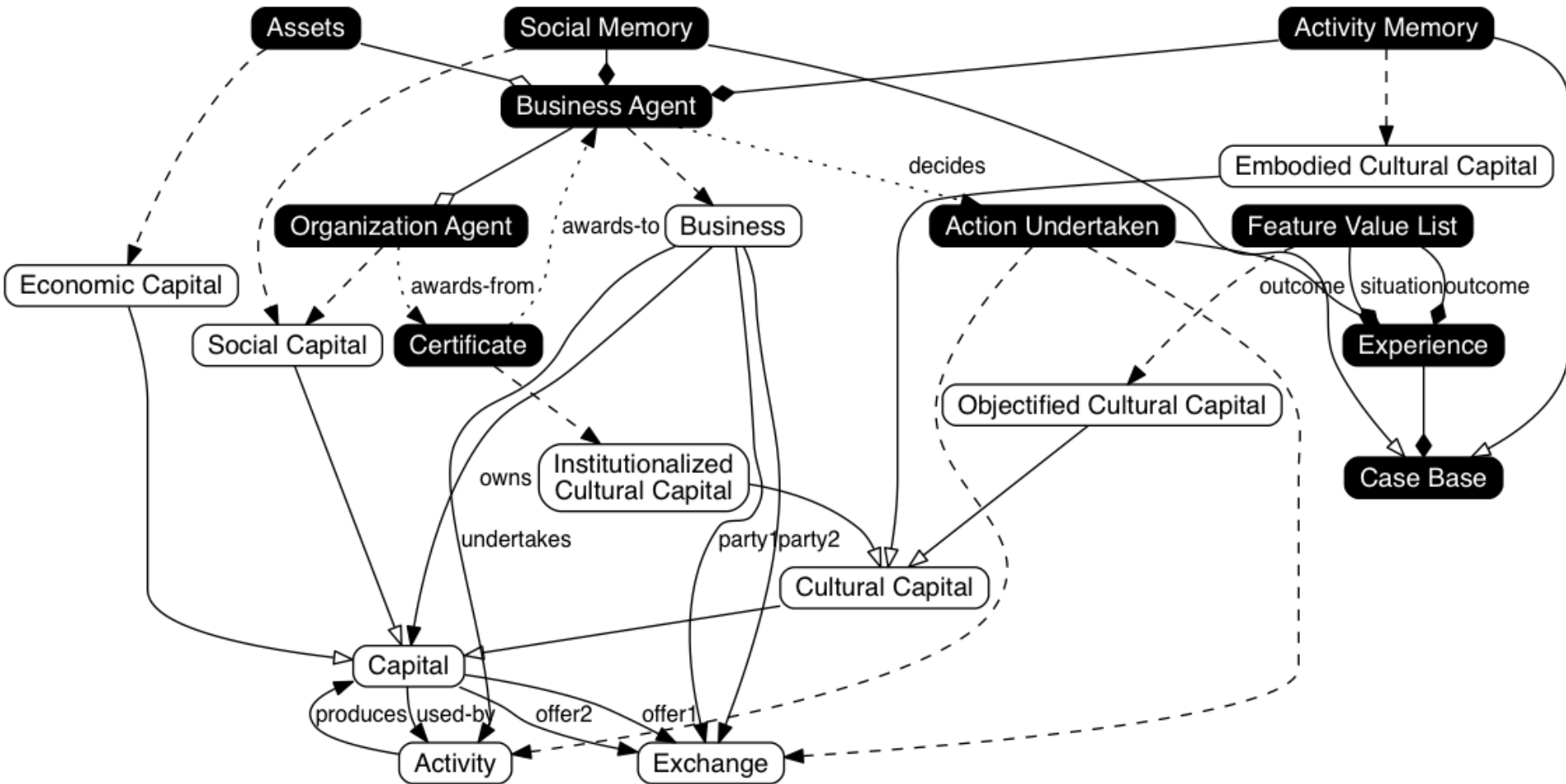
- Agent-based models allow us to represent plausible modes of decision-making
  - Case-based reasoning (Aamodt & Plaza, 1994) represents decision-making of experts
  - Decisions based on experience in similar situations
    - Case-base (store of experience) is an explicit representation of Bourdieusian concept of embodied cultural capital (knowledge)
    - Can apply to decisions about activities to undertake and whom to exchange what capital with
    - Localization within contextually-situated agent allows explicit representation of specialized local knowledge



# Conceptual model



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# Transforming value networks



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- Changing systems requires overcoming existing path-dependent lock-ins:
  - Infrastructure
  - Knowledge, experience, expertise
  - Social organisation
  - Regulation
- Some are easier to overcome than others



# Next steps



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- Implement model in NetLogo
- Data acquisition and import
  - Critical: schema and database of activities agents can choose among
- Calibration and validation
- Explore scenarios
  - Contextual driving variables outwith control
    - Climate change, global markets
  - Policy options that can be controlled
    - Incentives, regulations



## **How to manage the transition to a “smart” bioeconomy**

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