

Agent-based modeling in Political Science, Sociology, and Social Psychology

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Outline

1. What do you know, what do you want to know about agent-based modeling?
2. What is agent-based modeling?
3. Who uses it for what purpose?
4. How do you do it?
5. Examples

What is an Agent-based Model?

- ▶ It is a **formal model**:

A model is an **abstraction** which represents part of the real-world in a simpler form. Formal means: All objects and rules are precisely defined **mathematically and/or algorithmically**.

- ▶ No difference to classical linear regression or structural equation model.
- ▶ **Agent-based** means that every agent in the real-world is represented in the model as an independent entity (no representative agent).
 - ▶ Similar to the typical datasets used in linear regression or structural equation model.
- ▶ Its focus is on the **interaction** of agents which is studied for example by **simulation** for a **longer time**.
 - ▶ That's the important difference!
- ▶ General side note: All models are wrong.

Who uses it for what purpose?

Social Psychology

Eliot R. Smith and Frederica R. Conrey (2007). **Agent-Based Modeling: A New Approach for Theory Building in Social Psychology.** *Personality and Social Psychology Review* 11 (1), 87–104

“The authors believe that the ABM approach is better able than prevailing approaches in the field, variable-based modeling (VBM) techniques such as causal modeling, to capture types of complex, dynamic, interactive processes so important in the social world.”

- ▶ Theory building
- ▶ ABM: Search for “generative explanations” of phenomena.
- ▶ VBM: Account for phenomenon by showing that it is an example of a more general statistical regularity.
- ▶ Example (Kalick and Hamilton 1984): Correlation of attractiveness of dating or married partners ($\rho \approx 0.55$).
 - ▶ VBM: Preference for similar partners? (But no evidence.)
 - ▶ ABM: Random matching, dating offer with probability \propto attractiveness, if both offer \rightarrow couple forms \rightarrow both out of market

Who uses it for what purpose?

Sociology

Michael W. Macy and Robert Willer (2002). **From Factors to Actors: Computational Sociology and Agent-Based Modeling.** *Annual Review of Sociology* 28, 143–166

“In surveying recent applications [of ABM], we found that most congregated around two problems, (a) the self-organization of social structure and (b) the emergence of social order.”

“ABMs are used to perform virtual experiments that test macrosociological theories by manipulating structural factors like network topology, social stratification, or spatial mobility.”

- ▶ From forecasts to thought experiments
- ▶ Differentiate against “equation-based”, holistic models which only represent the “deck of Coleman’s boat” in claiming and analyzing statistical relations between macrosocial variables.
- ▶ Example: Schelling’s (1971) segregation model.

Who uses it for what purpose?

Political Science

L.E. Cederman (2001). **Agent-based modeling in political science.** *The Political Methodologist* 10 (1), 16–22

Joshua M. Epstein (1999). **Agent-based computational models and generative social science.** *Complexity* 4 (5), 41–60

- ▶ Make similar claims on studying emergent phenomena through generative models.
- ▶ ABM is used to model e.g.
 - ▶ Sudden outbreak of uprisings and revolutions.
 - ▶ Behavior of political parties.
 - ▶ Formation of preferences and ideological positions.

Summary

- ▶ **ABM vs. VBM:** Look more on the interaction of agents than the interaction of variables.
 - ▶ But: Individual-based variables are essential in both.
- ▶ **Agent-based vs. equation-based:** It is not about equations between macroscopic variables but about the emergence of such relations.
 - ▶ But: Rule in the ABM algorithm are equation. Macroscopic equations can be derived from agent-based models (e.g. Markov Chains); often faster, and deeper insight.
- ▶ **Agent-based vs. equation-based:** Not about equations of macroscopic variables but about emergence of their relations.
 - ▶ But: Rules in the ABM algorithm are equation. Macroscopic equations can be derived (e.g. Markov Chains); often faster, and deeper insight.
- ▶ **Agent-based vs. game-theoretical:** It is typically not about perfect rationality over all future steps but about simple behavioral heuristics and the dynamics they trigger over time.
 - ▶ But: Myopic (not too forward-looking) rationality can well be a component of a dynamic model.

How do you do it? **6 steps**

- 1) **Agents and parameters:** Define agents, their dynamic variables and static parameters. Specifying them defines the **state** of the system.
- 2) **Behavior:** Define behavioral **rules** and **procedures** how agents change their state. Derive them from utility functions or from a psychological theory. States of other agents play a role. Randomness models uncertainty or influences not modeled.
- 3) **Initial constellation:** Fix an initial constellation: Typically, the number of agents (if not dynamic) and the initial values for their dynamic parameters.
- 4) **Simulation:** Implement a simulation as a computer program. Think about visualization and data storage. Programming environments: NetLogo, R, matlab, ...
- 5) **Macroscopic variables:** Define meaningful variables describing an emergent phenomenon.
- 6) **Mass simulationen** Check influence from static parameters on macro variables systematically.

Examples in NetLogo

- ▶ Schelling's (1971) segregation model
- ▶ Growth and redistribution (Lorenz 2013)
- ▶ Laver and Sergenti's (2011) model of party competition
- ▶ Clustering in ideological space (bounded confidence model)
(see refs. in Lorenz 2014)

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