

**Pseudo-Code for the Agent-Based Model *Liminality and the Diffusion of Innovations among Adolescents* by Diego F. Leal ([www.diegoleal.info](http://www.diegoleal.info))**

**FIRST PROCEDURE/LOOP (Populate Model)**

- Extract Add Health friendship nomination network data (e.g. Sunshine High data) and nodes' attributes data (race, ethnicity, income, age, grade, gender).
- Symmetrize the network using the weak rule.
- Create as many agents as there are in the school under analysis. Denote the number of agents as  $n$ .
- Bestow each agent with the attributes (sex, race, grade, income, and ethnicity) of the student it represents.
- Create a variable for each agent,  $A_i$ , that signals adoption ( $A_i = 1$  adopted;  $A_i = 0$  did not adopt)

**SECOND PROCEDURE/LOOP (Model Diffusion)**

- For agent  $i$  to agent  $n$ , where  $n$  is the number of agents in a given school (e.g. Sunshine High)
  - Make agent  $i$  the seed agent, that is, the seed innovator ( $A_i = 1$ )
  - Make  $i$ 's group of friends adopt the innovation. Call this set of agents the seed neighborhood ( $S_i$ )
  - Repeat  $N$  times ( $N \in [1, n]$ ):
    - In random order, and with no replacement, ask each agent/alter outside  $S_i$  to:
      - Adopt the innovation if a given user-defined proportion,  $T$ , of her friends have adopted the innovation ( $T \in [0, 1]$ )
  - Retrieve the number of agents infected by agent  $i$ . Call this quantity  $M_{i\_raw}$
  - Calculate the proportion of the population infected by agent  $i$  ( $M_{i\_raw}/n$ ). Call this quantity the *spreading capacity* of agent  $i$  ( $CAP_i$ ).

**THIRD PROCEDURE/LOOP (Calculate Centrality Measures & Average Spreading Capacity)**

- Calculate the following centrality scores for each ego:
  - Degree ( $deg$ ); Betweenness ( $betw$ ); Closeness ( $close$ ); interracial brokerage ( $IB$ ); egonetwork diversity ( $diver$ ); Eigenvector centrality ( $eigen$ ); Local clustering coefficient ( $clust$ )
- Consider a user-defined proportion  $p$  of the most efficient spreaders ( $p \in [0, 1]$ )
- Define the set  $Y_{CAP}(p)$  as the portion  $p$  of agents with the highest spreading capacity ( $CAP_i$ )
- Compute the average proportion of alters infected for each ego included in  $Y_{CAP}(p)$ . Call this quantity  $AVG_{CAP}(p)$
- Define the set  $Y_{centrality\_measure}(p)$  as the portion  $p$  of agents with the highest score in a given centrality measure. For instance, the set  $Y_{degree}(p)$  is the portion  $p$  of agents with the highest degree centrality.
- Compute the average proportion of alters infected for each ego included in  $Y_{centrality\_measure}(p)$ . Call this quantity  $AVG_{CAP\_centrality\_measure}(p)$

**FOURTH PROCEDURE/LOOP (Compute Imprecision Function)**

- To assess the merit of using a given centrality measure to identify efficient spreaders, one needs to compare the sets  $AVG_{CAP}(p)$  and  $AVG_{CAP\_centrality\_measure}(p)$ . In order to do so, Follow Kitsak et al. (2010) by computing an *imprecision function* based on these two quantities:

$$IM_{centrality\_measure}(p) = 1 - [AVG_{CAP\_centrality\_measure}(p)/AVG_{CAP}(p)]$$

- Note: A value of IM close to 0 represents a very precise decision process because the nodes chosen under the centrality measure under analysis (e.g. degree centrality) are those who, indeed, individually contribute most to the diffusion process.