



Complex Adaptive System of Systems
(CASoS) Engineering Initiative
<http://www.sandia.gov/casos>

Loki-Infect 3

A Portable Networked Agent Model for Designing Community-Level Containment Strategies

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Veterans Health
Administration

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Previous Work with Loki-Infect

- Loki-Infect versions 1 and 2 have been used in a variety of infectious disease modeling studies:
 - **Glass et al. (2006)**: determined the critical importance of children in influenza epidemic propagation. Closing schools and social distancing of children reduced infections by 90%.
 - **Davey et al. (2008)**: evaluated thresholds for rescinding community mitigation strategies.
 - **Glass & Glass (2008)**: surveyed children and teenagers found teens had most contacts that could serve as influenza transmission 'backbone'.
 - **Davey & Glass (2008)**: a systematic evaluation of feasible mitigation strategies at wide range of pandemic severities and found critical enablers of success—rapid, stringent, regional implementation with high compliance.
 - **Perlroth et al. (2009)**: evaluated cost-effectiveness of mitigation strategies, finding that the addition of school closure to adult and child social distancing and antiviral treatment and prophylaxis is not cost-effective for viral strains with low infectivity (R_0 1.6 and below) and low case fatality rates (1% and below).

Objectives for Loki-Infect 3

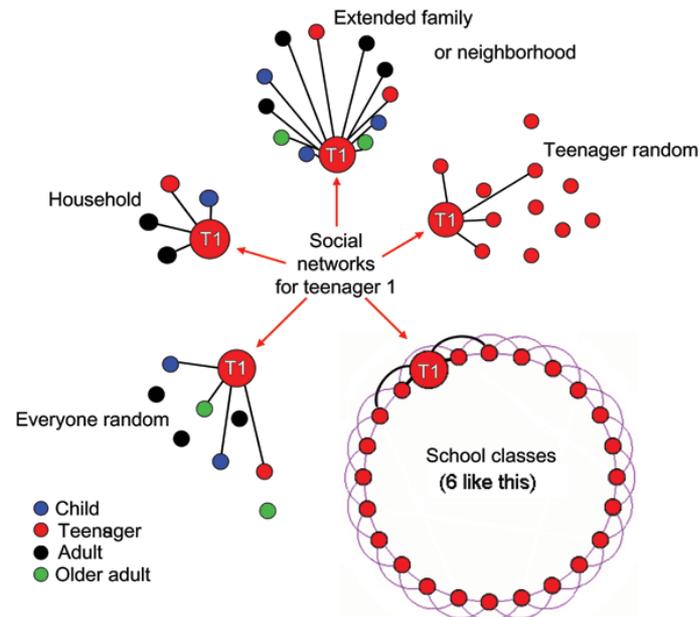
- Loki-Infect 3 is a **desktop application** intended for use by **community-level** decision makers.
- It allows rapid construction of small-scale studies of emerging or hypothetical infectious diseases in their communities and evaluation of the potential effectiveness of various containment strategies.
- It was designed with an emphasis on modularity, portability, and ease of use.
- Our goal is to make this program freely available to community workers across the world.

Loki-Infect Graphical User Interface allows users to easily create a propagation network

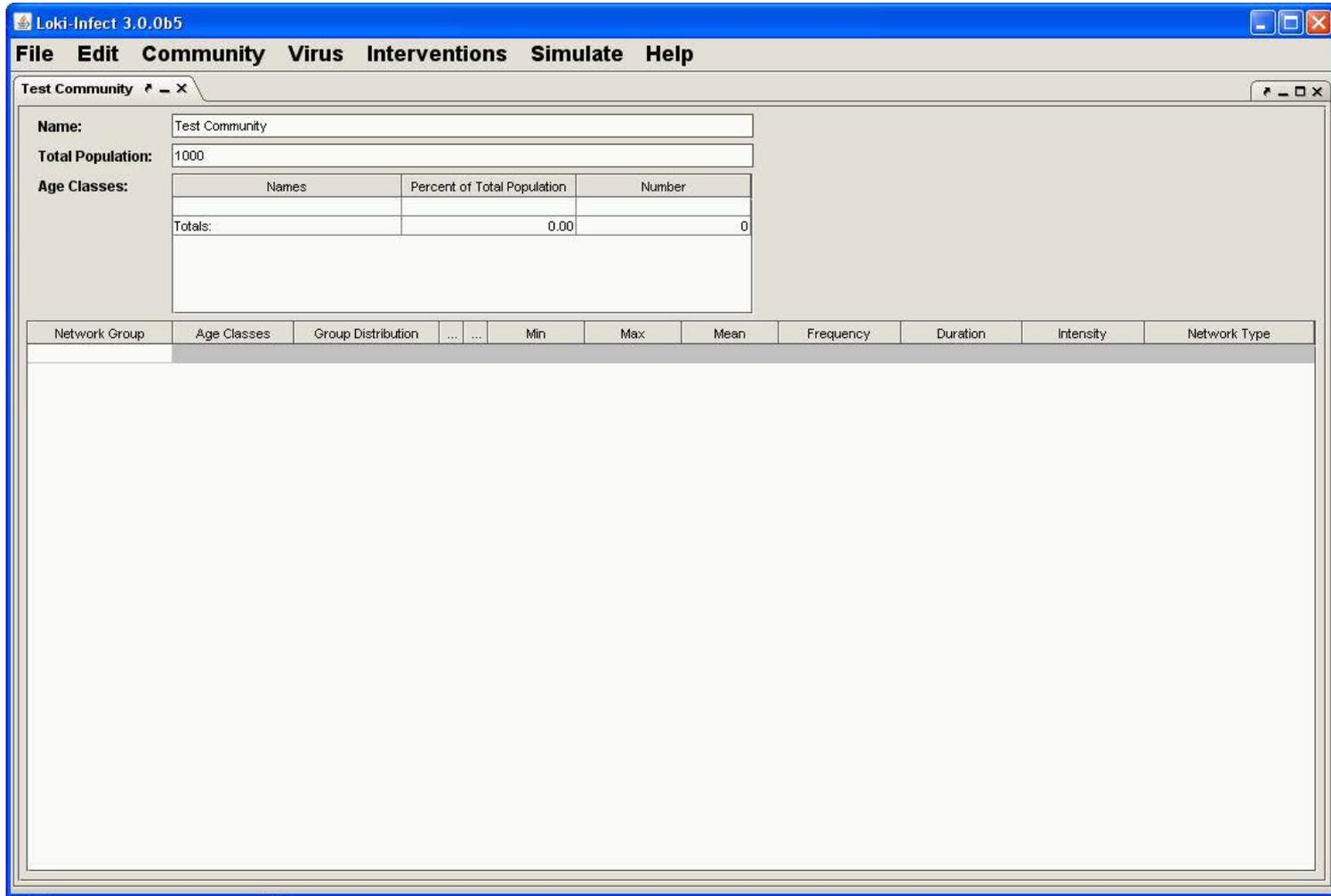


Representation of a Community

- A community is described by a set of **layers**, such as a family layer, a friend layer, or a classroom layer.
- Each layer contains a number of **groups**, which represent, e.g., individual families, friendship groups, or classrooms.
- A person is represented by a **node**, which can be a member of multiple different groups.



Users can begin with a blank community,
building it from scratch to suit their needs...



The screenshot shows the 'Loki-Infect 3.0.0b5' application window. The main menu includes 'File', 'Edit', 'Community', 'Virus', 'Interventions', 'Simulate', and 'Help'. The 'Test Community' dialog box is open, displaying the following configuration options:

- Name:** Test Community
- Total Population:** 1000
- Age Classes:** A table with columns for Names, Percent of Total Population, and Number.

Names	Percent of Total Population	Number
Totals:	0.00	0

Below the age classes table, there is a row of tabs: 'Network Group', 'Age Classes', 'Group Distribution', '...', '...', 'Min', 'Max', 'Mean', 'Frequency', 'Duration', 'Intensity', and 'Network Type'. The 'Age Classes' tab is currently selected.

Or users can begin with a predefined community that reflects basic contact networks for a model 10000-member community

Loki-Infect 3.0.0b5

File Edit Community Virus Interventions Simulate Help

Default Community

Name: Default Community

Total Population: 10,000

Age Classes:

Names	Percent of Total Population	Number
Adults	58.5	5850
Children	17.7	1770
Teens	11.3	1130
Seniors	12.5	1250
Totals:	100.00	10000

Network Group	Age Classes	Group Distribution	Min	Max	Mean	Frequency	Duration	Intensity	Network Type
Non-Senior Households	Adults	Uniform Distribution			1	2	1.5	6	1	1	Complete Network
	Children	Exponential Distribution			0	4	1.0				
	Teens	Exponential Distribution			0	4	1.0				
Senior Households	Seniors	Uniform Distribution			1	2	1.5	6	1	1	Complete Network
Extended Families or ...	Seniors	Uniform Distribution			0	2	1.0	1	1	1	Complete Network
	Adults	Exponential Distribution			0	8	3.0				
	Teens	Exponential Distribution			0	8	4.0				
	Children	Exponential Distribution			0	8	4.0				
Child Classes	Children	Uniform Distribution			20	35	27.5	6	1	1	Ring Network
Child Random	Children	Constant Distribution			1,770	1,770	1770.0	1	1	1	Random Network
Teen Class 1	Teens	Uniform Distribution			20	35	27.5	1	1	1	Ring Network
Teen Class 2	Teens	Uniform Distribution			20	35	27.5	1	1	1	Ring Network
Teen Class 3	Teens	Uniform Distribution			20	35	27.5	1	1	1	Ring Network
Teen Class 4	Teens	Uniform Distribution			20	35	27.5	1	1	1	Ring Network
Teen Class 5	Teens	Uniform Distribution			20	35	27.5	1	1	1	Ring Network
Teen Class 6	Teens	Uniform Distribution			20	35	27.5	1	1	1	Ring Network
Teen Random	Teens	Constant Distribution			1,130	1,130	1130.0	1	1	1	Random Network

Individual cells can be edited to update the entire population, or only a portion of it

File Edit Community Virus Interventions Simulate Help

Default Community ↗ - X

Name: Default Community

Total Population: 10,000

Age Classes:

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	Children	Exponential Distribution			0	4	1.0	
	Teens	Exponential Distribution			0	4	1.0	
Senior Households	Seniors	Uniform Distribution			1	2	1.5	

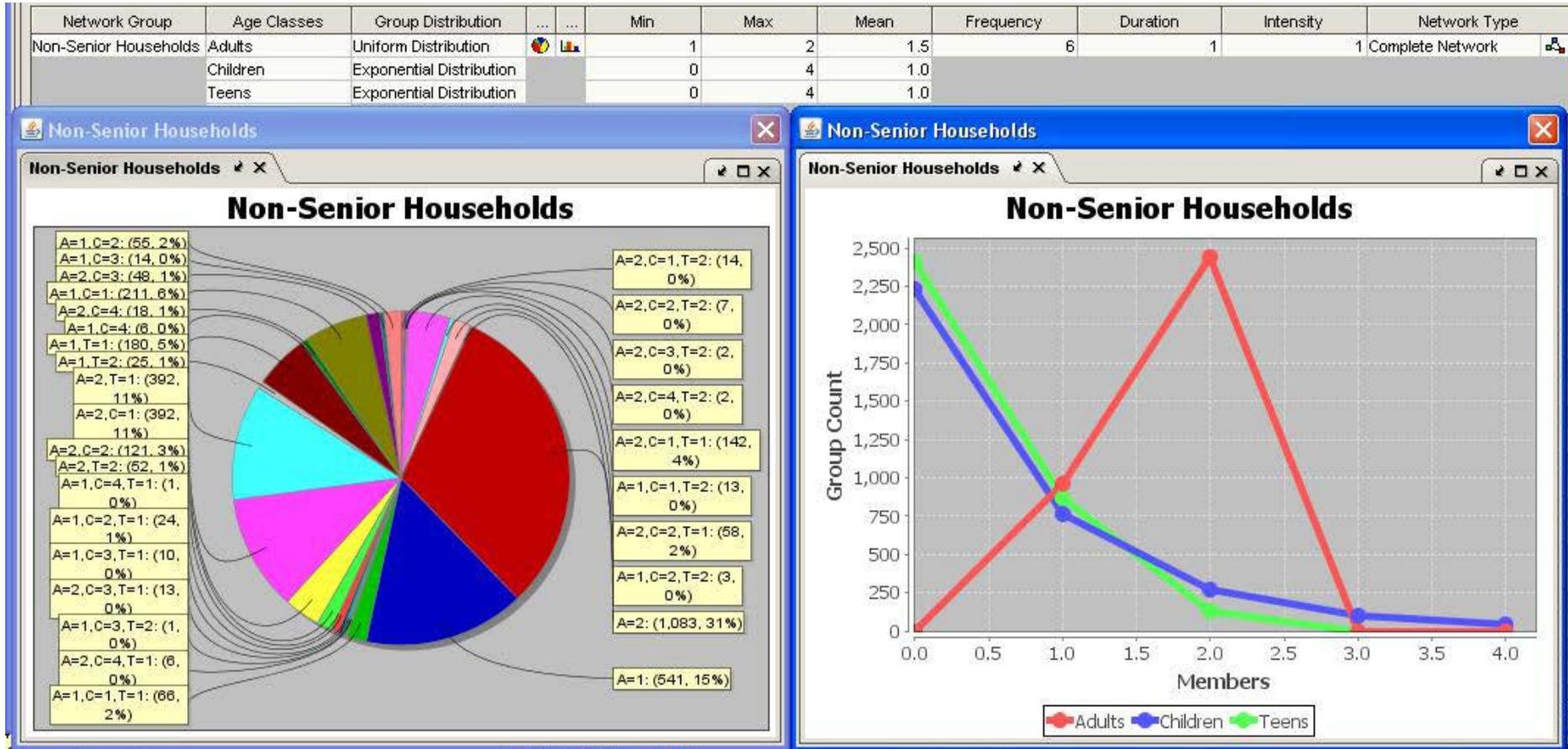
Members of a layer and how they're distributed in groups in the layer can be configured

Additional layers over the population can be constructed



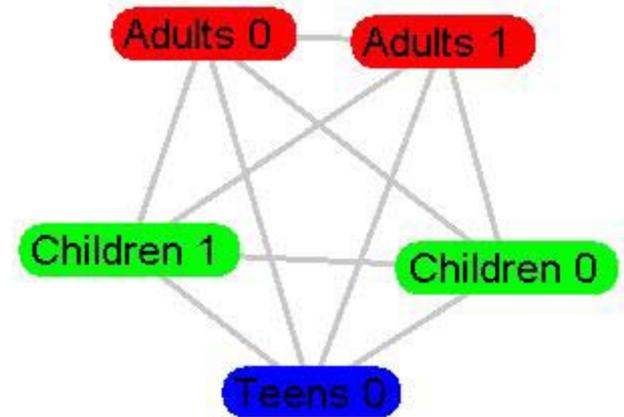
Network Group	Age Classes	Group Distribution	Min	Max	Mean
Non-Senior Households	Adults	Uniform Distribution			1	2	1.5
	Children	Exponential Distribution			0	4	1.0
	Teens	Exponential Distribution			0	4	1.0
Senior Households	Seniors	Uniform Distribution			1	2	1.5
Extended Families or ...	Seniors	Uniform Distribution			0	2	1.0
	Adults	Exponential Distribution			0	8	3.0
	Teens	Exponential Distribution			0	8	4.0
	Children	Exponential Distribution			0	8	4.0
Child Classes	Children	Uniform Distribution			20	35	27.5

Graphs of the distributions of groups upon constructing a given layer can be requested by clicking the appropriate icon

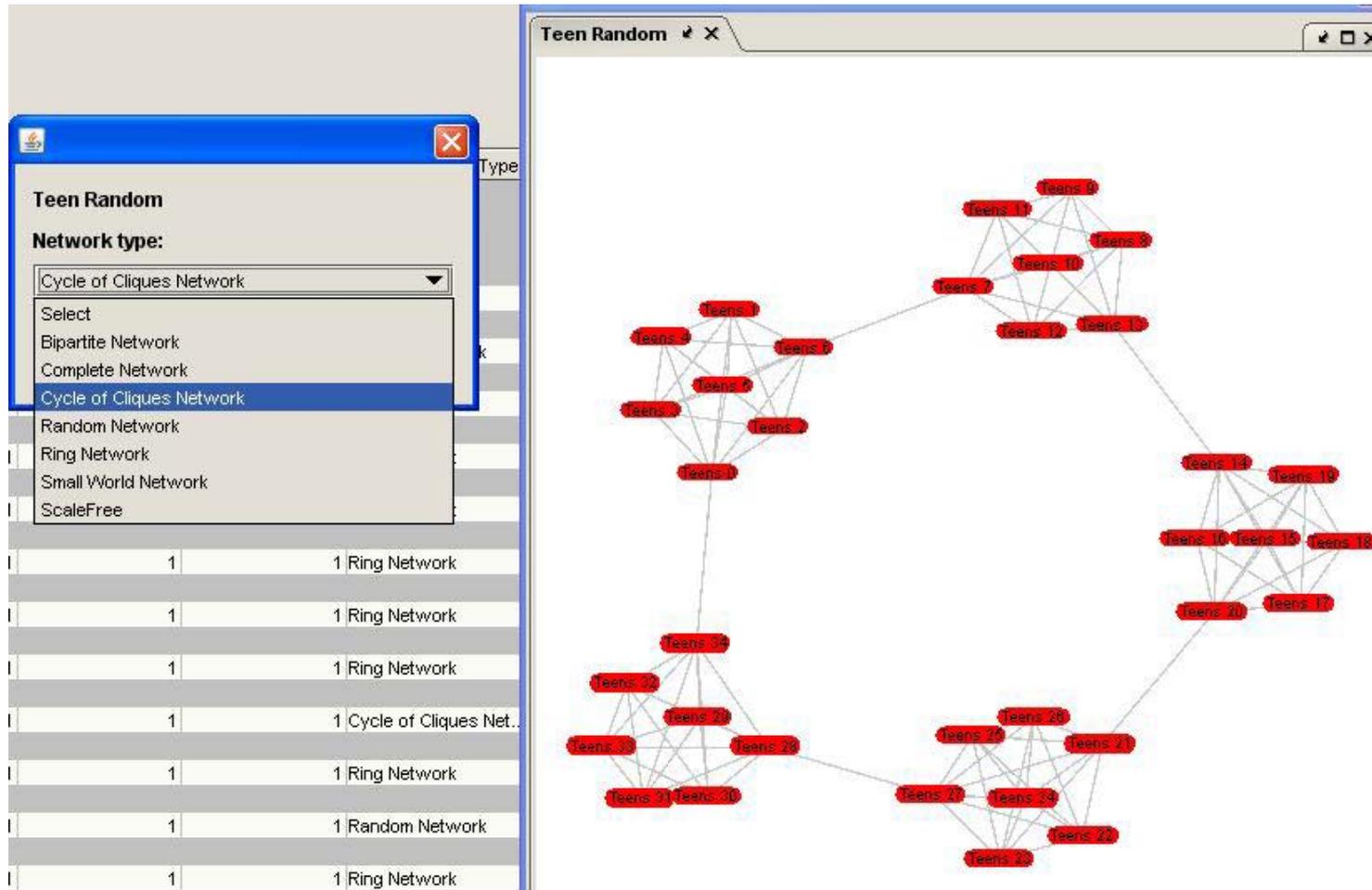


Representation of a Community

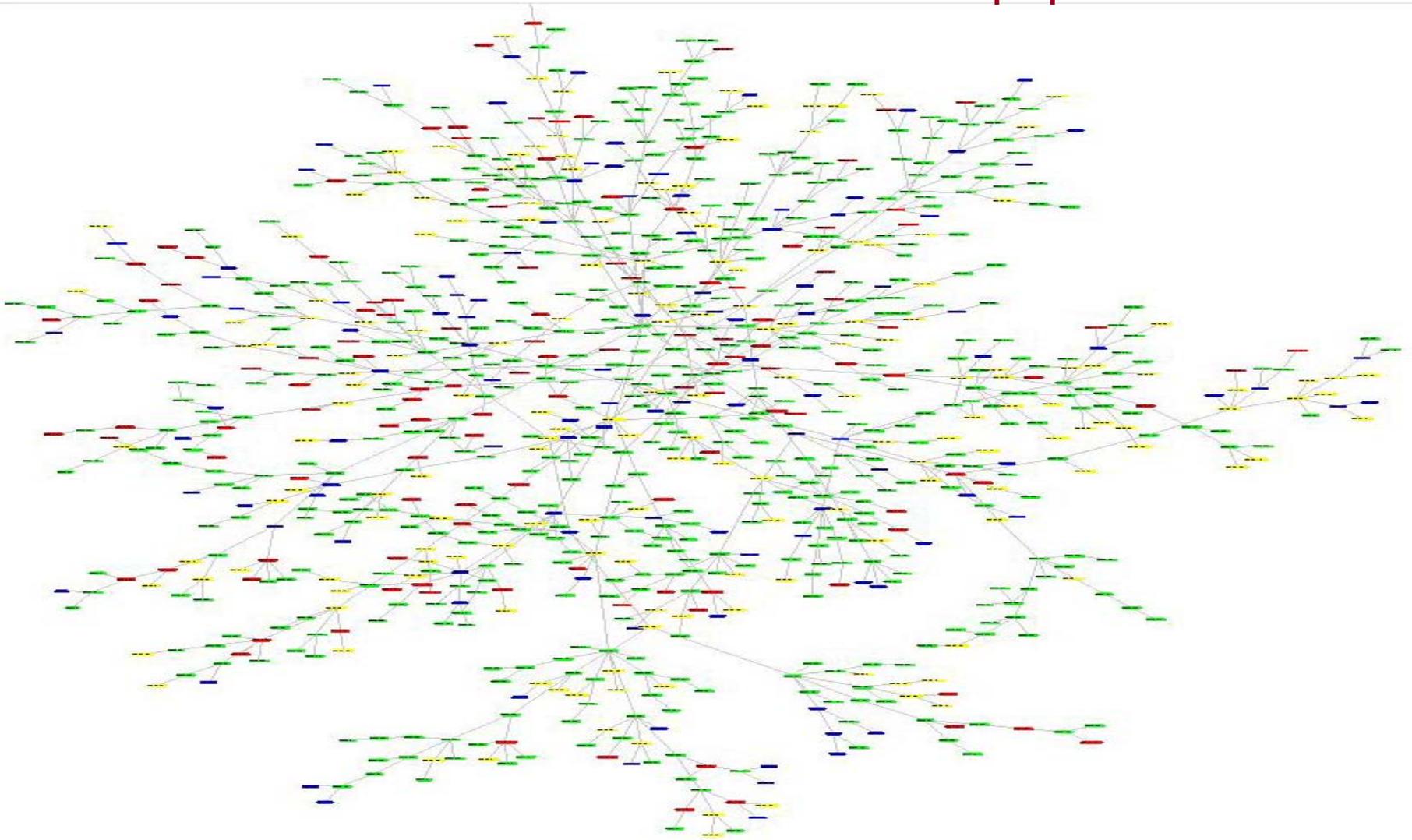
- Finally, for each layer in a community, the user provides an idealized network topology (and any parameters for that topology) for each group in the layer.
- Supported topologies include:
 - Scale-Free (Barabási)
 - Random (Erdős–Rényi)
 - Small-World (Strogatz)
 - Ring
 - Bipartite
 - Cycles of Cliques
- The resulting community is a network of networks, where each node is a member of multiple different sub-networks.



Example group topology: idealized cycle of cliques

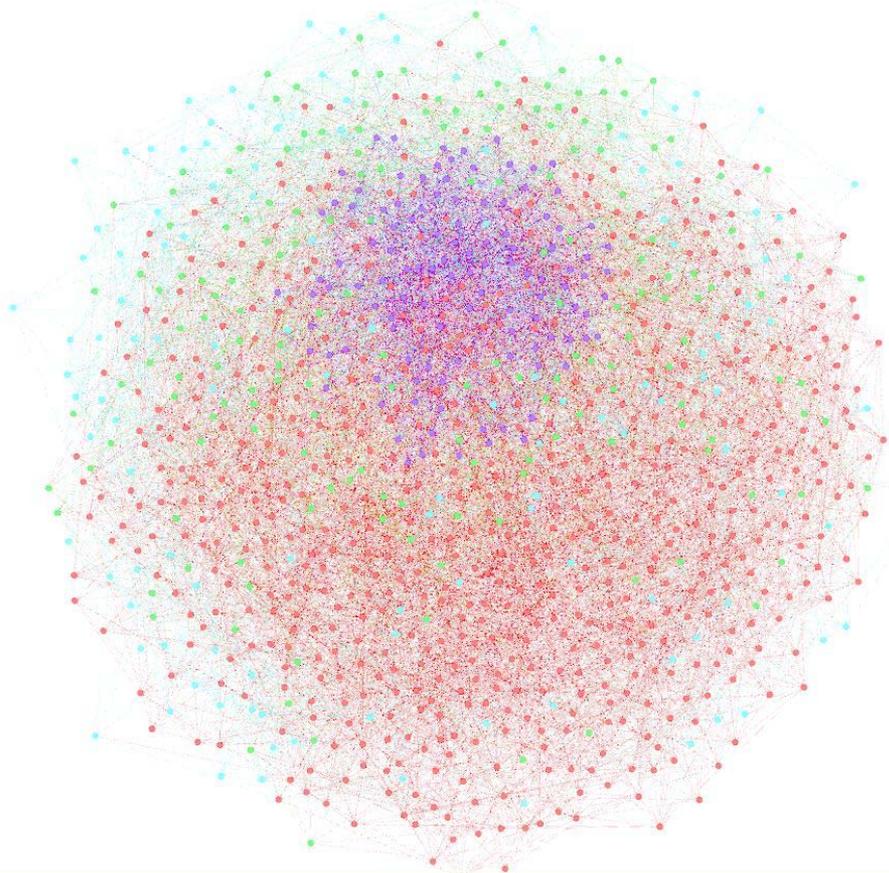


scale-free network over a population of 1000

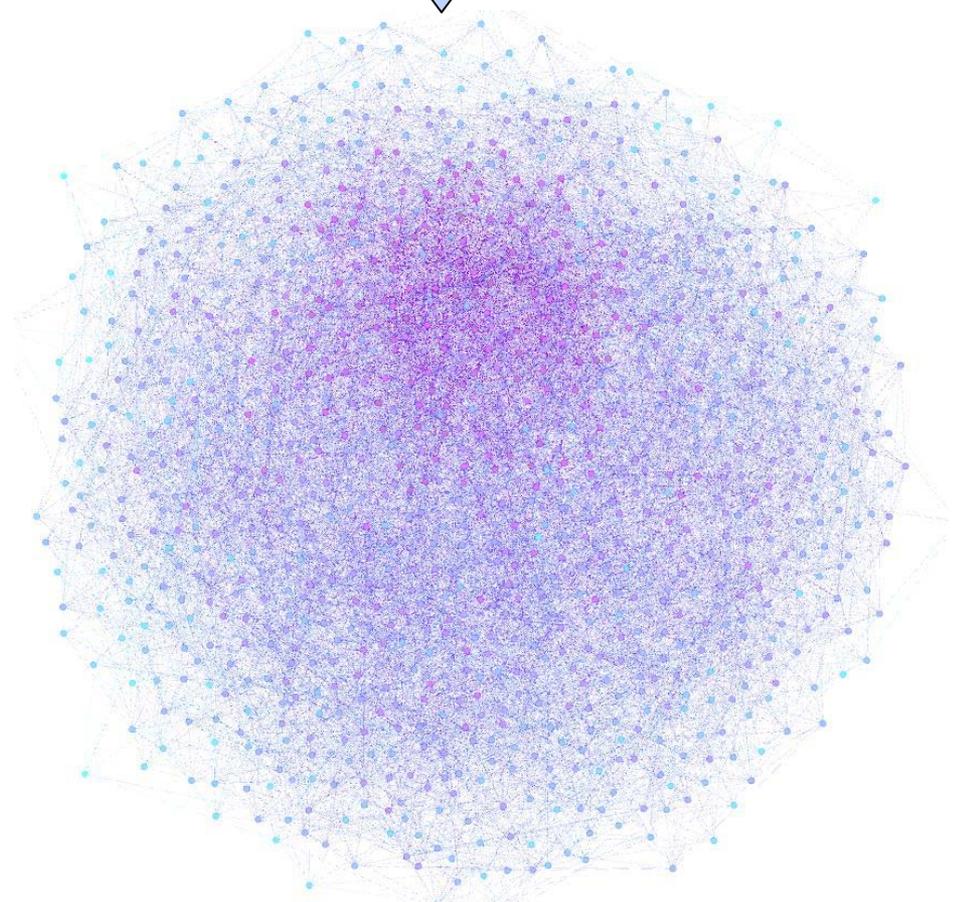


The entire network structure for a community can be exported to the GraphML format

Network colored
by age classes



Same network colored by node degree

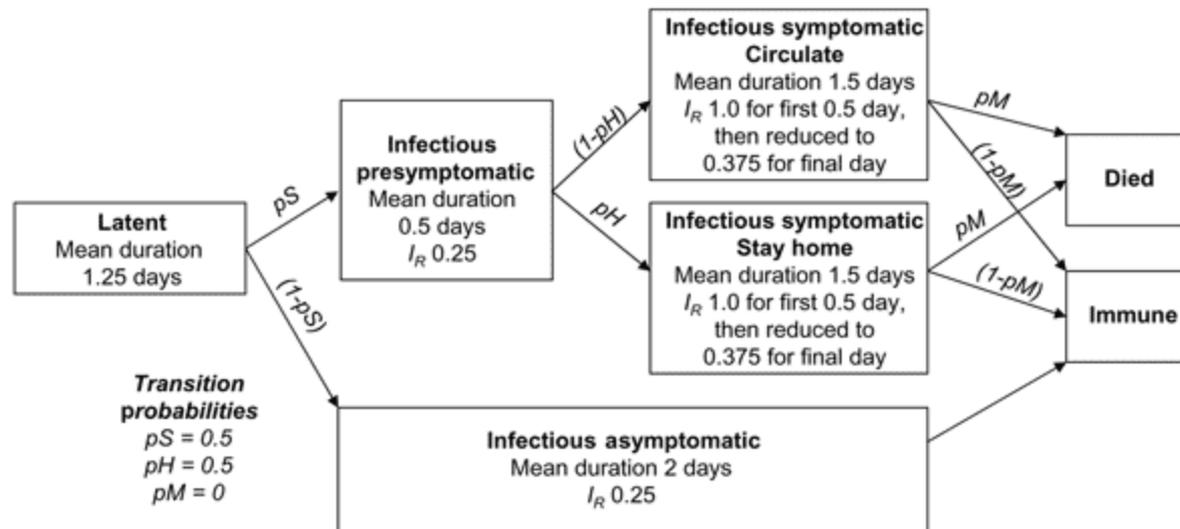


Models of Contagion

- Loki-Infect 3 allows the user to simulate different or multiple contagions on the same social network.
- Currently we have implemented an influenza model developed by Davey et al. between 2006 and 2009 within the context of Loki-Infect 3.
- We are also currently working with Danilo Scepanovic of MIT to implement an alternative manifestation of influenza that is more biologically realistic.
- Loki-Infect 3 is also being adapted to model the spread of opinions and behaviors along social networks.

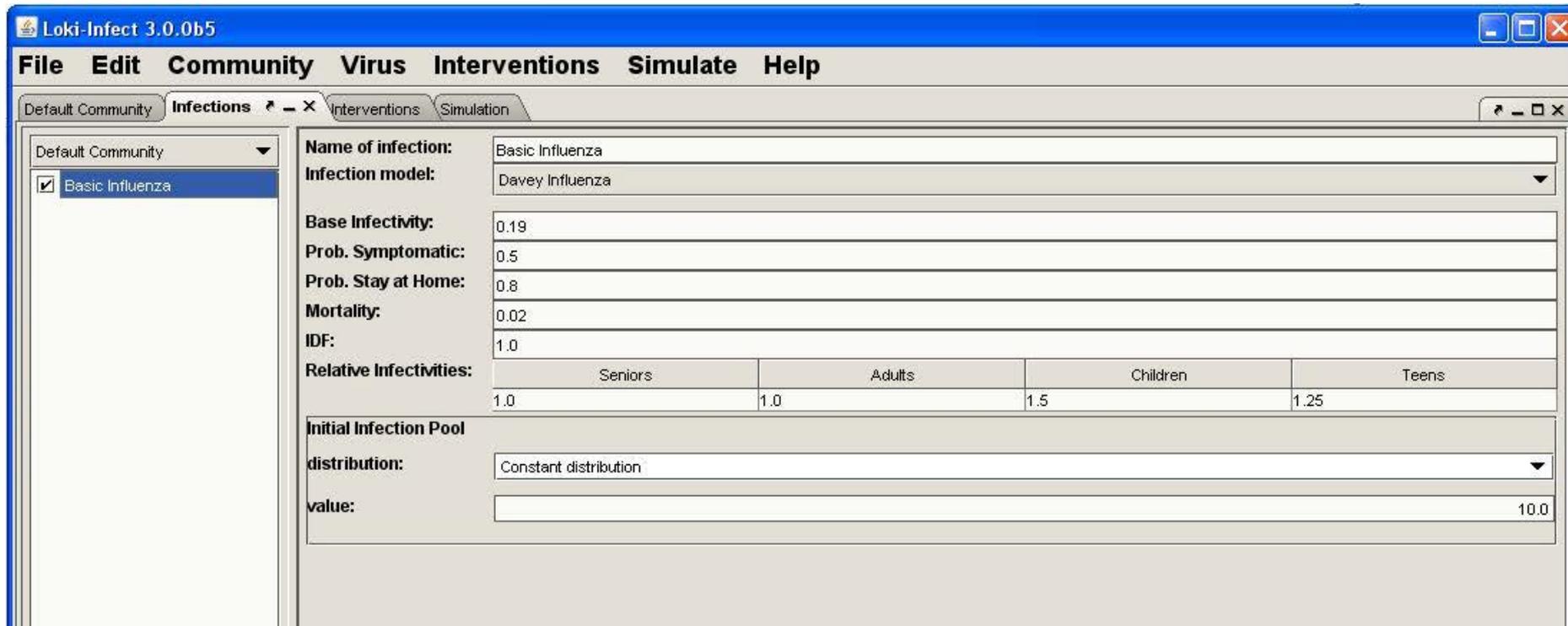
Davey et al. Influenza Manifestation

- In the influenza manifestation by Davey et al., each edge in the social network represents a potential contact between two people with an associated contact **frequency**, **duration**, and **intensity**.
- Individuals progress through a probabilistic state machine, either remaining susceptible, or becoming infectious and later recovering or dying from the infection. The infection spreads through individual contact.



Davey et al. Influenza Manifestation

- This influenza model has a small, yet descriptive, parameter set, which can be configured through the GUI and used to represent a number of influenza manifestations



The screenshot shows the 'Loki-Infect 3.0.0b5' application window. The 'Infections' tab is active, showing a list of infections on the left with 'Basic Influenza' selected. The main configuration area on the right includes the following fields and values:

- Name of infection: Basic Influenza
- Infection model: Davey Influenza
- Base Infectivity: 0.19
- Prob. Symptomatic: 0.5
- Prob. Stay at Home: 0.8
- Mortality: 0.02
- IDF: 1.0
- Relative Infectivities:

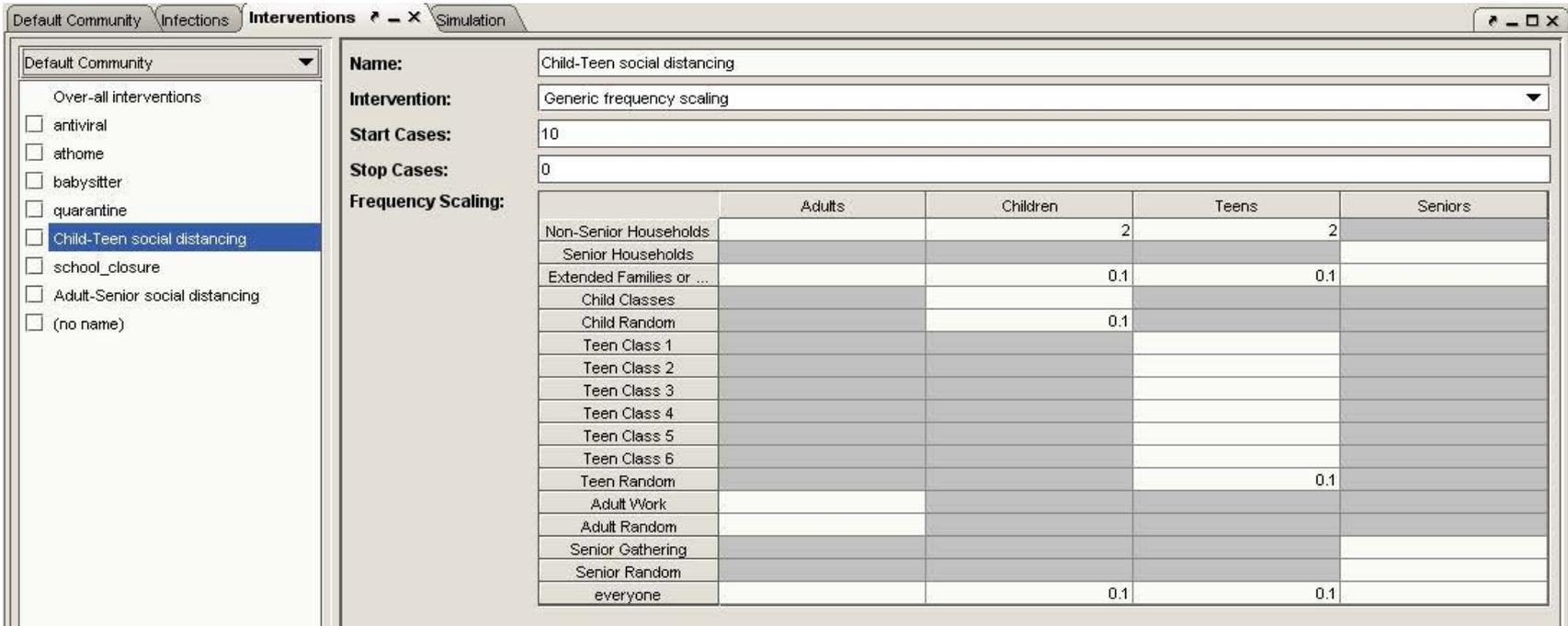
	Seniors	Adults	Children	Teens
	1.0	1.0	1.5	1.25
- Initial Infection Pool distribution: Constant distribution
- Initial Infection Pool value: 10.0

Different models for spreading an infection can be selected, and details for that model displayed and editable

Name of infection:	Basic Influenza			
Infection model:	Davey Influenza ▼			
Base Infectivity:	0.19			
Prob. Symptomatic:	0.5			
Prob. Stay at Home:	0.8			
Mortality:	0.02			
IDF:	1.0			
Relative Infectivities:	Seniors	Adults	Children	Teens
	1.0	1.0	1.5	1.25
Initial Infection Pool				
distribution:	Constant distribution ▼			
value:	10.0			

A simulation can begin with a distributions of people chosen from the population to be initially infected

- There are two primary categories of interventions: **case-based** and **network-based**.
- Network-based interventions, such as school closures and social distancing, take effect immediately for all relevant nodes.



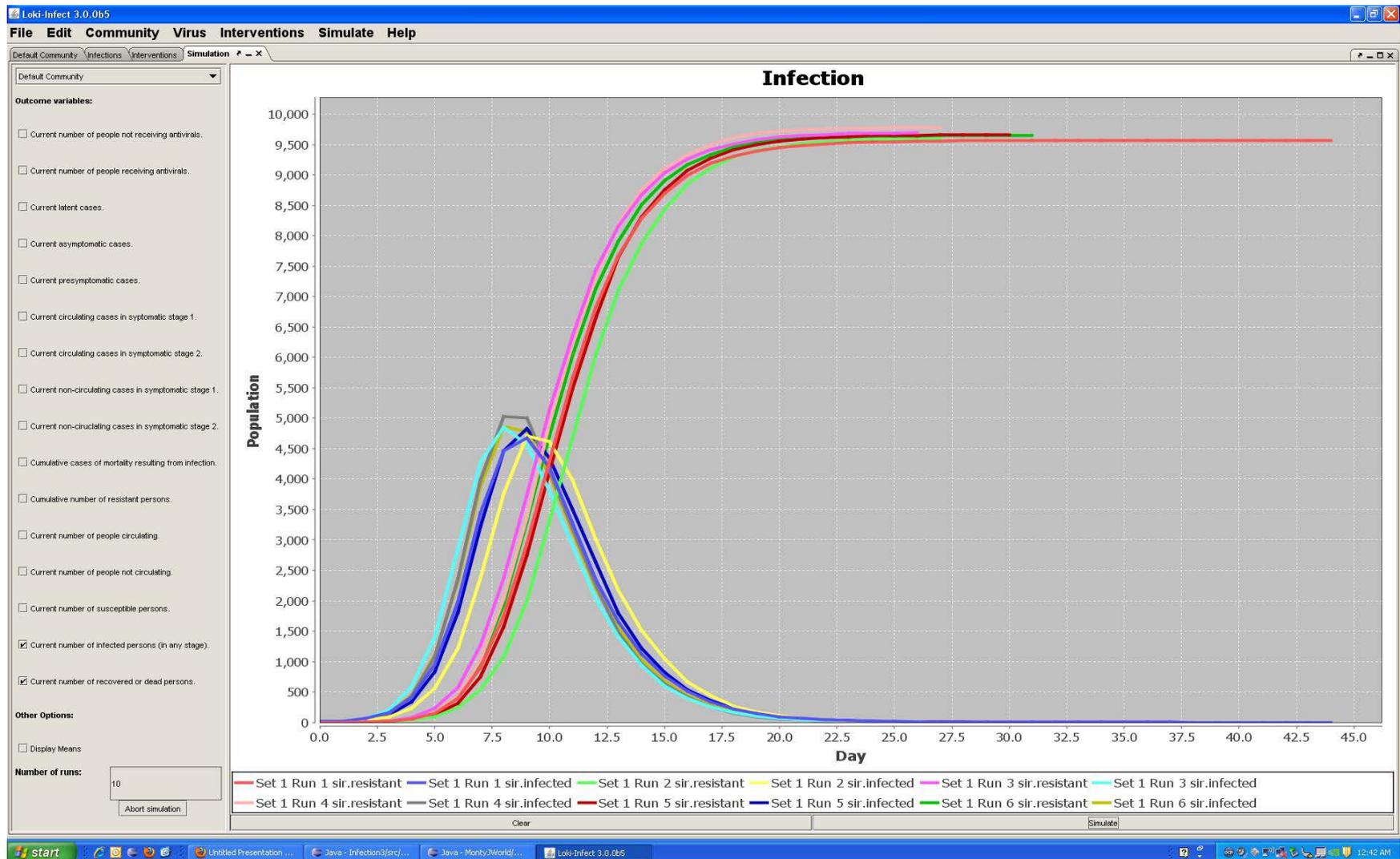
The screenshot shows the 'Interventions' window in a software application. The 'Name' field is 'Child-Teen social distancing' and the 'Intervention' is 'Generic frequency scaling'. The 'Start Cases' is 10 and 'Stop Cases' is 0. The 'Frequency Scaling' table is as follows:

	Adults	Children	Teens	Seniors
Non-Senior Households		2	2	
Senior Households				
Extended Families or ...		0.1	0.1	
Child Classes				
Child Random		0.1		
Teen Class 1				
Teen Class 2				
Teen Class 3				
Teen Class 4				
Teen Class 5				
Teen Class 6				
Teen Random			0.1	
Adult Work				
Adult Random				
Senior Gathering				
Senior Random				
everyone		0.1	0.1	

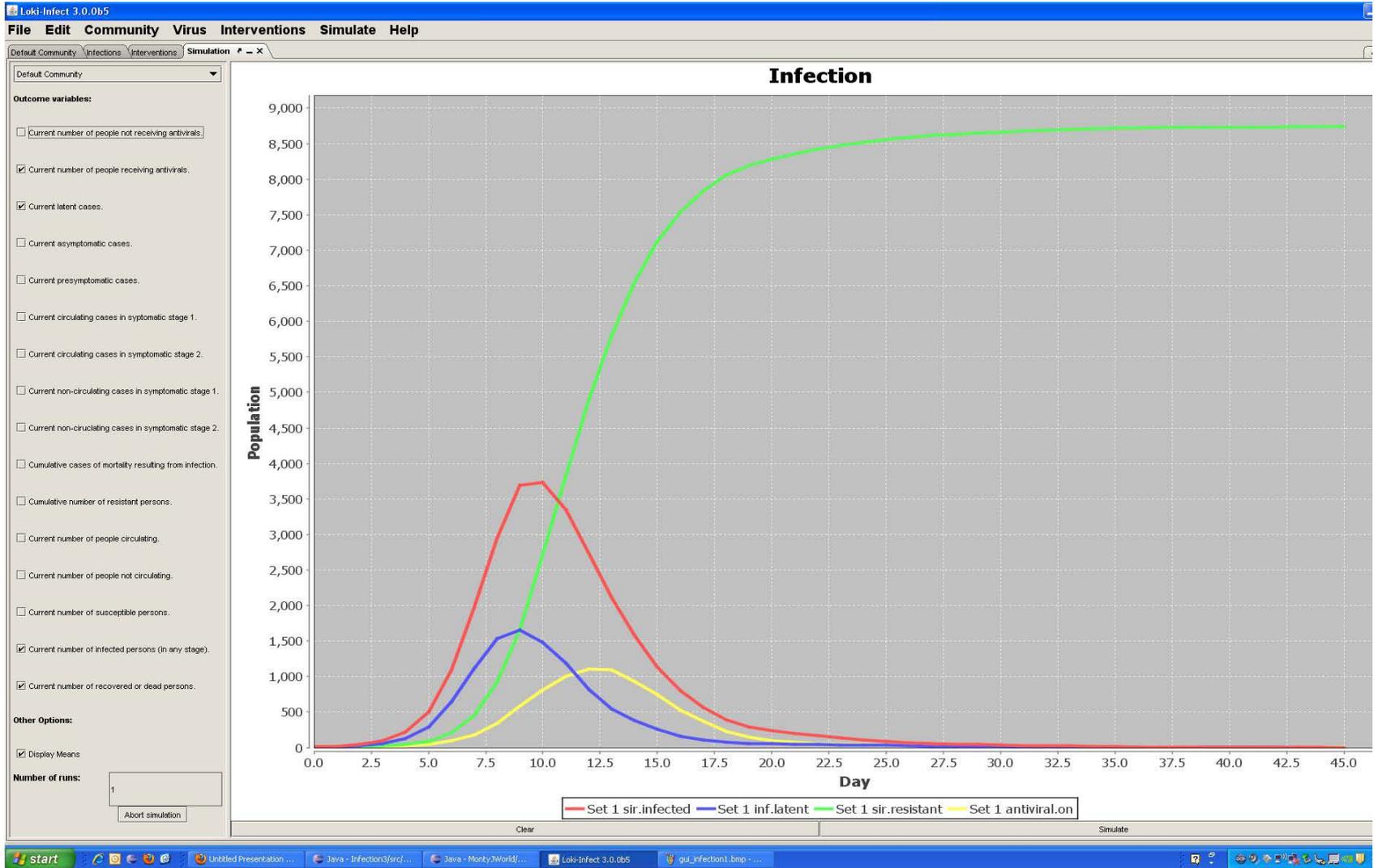
- Case-based interventions include actions such as antiviral treatment and prophylaxis, which reduce a node's infectivity and susceptibility for the duration of antiviral administration.
- Case-based interventions apply only to new cases that emerge.

Name:	antiviral					
Intervention:	Antiviral ▼					
Entry State:	inf.sympathome1 ▼					
Exit State:	▼					
Start Cases:	10					
Stop Cases:	0					
Entry Probabilities:	<table border="1"> <thead> <tr> <th>Group</th> <th>Probability</th> </tr> </thead> <tbody> <tr> <td>everyone</td> <td>0.5</td> </tr> </tbody> </table>		Group	Probability	everyone	0.5
Group	Probability					
everyone	0.5					
Prophylaxis groups:	<table border="1"> <thead> <tr> <th>Group</th> <th>Probability</th> </tr> </thead> <tbody> <tr> <td>Senior Households</td> <td>0.65</td> </tr> </tbody> </table>		Group	Probability	Senior Households	0.65
Group	Probability					
Senior Households	0.65					

In the simulate window, you can perform multiple runs, and filter the data you wish to view

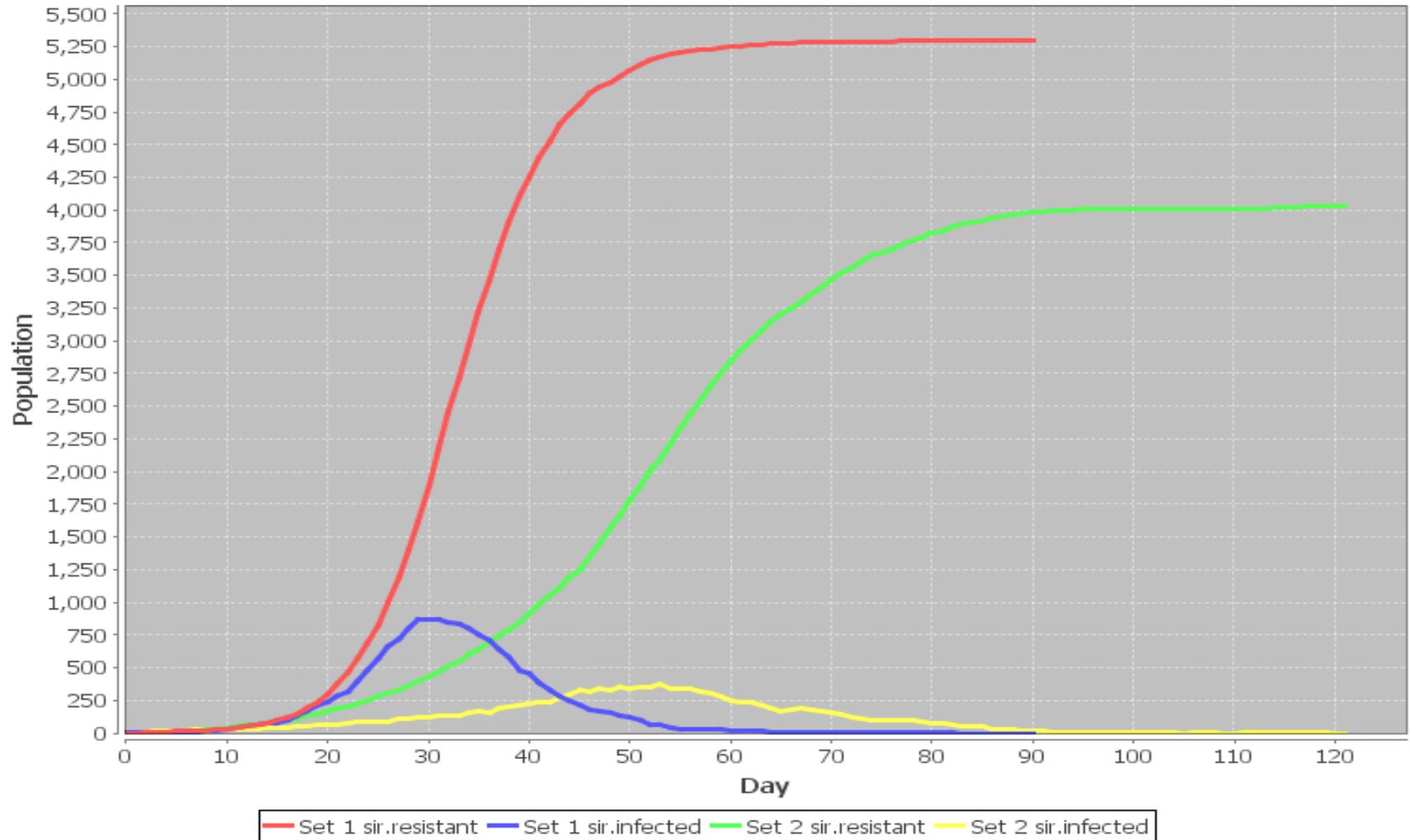


Data can be averaged, and dumped to file



Example: The Effect of School Closures on Disease Propagation

Infection



- Investigation of the spread of correlated diseases and opinions.
- Investigation of the spread of multiple competitive and non-competitive strains of influenza, including strains that are resistant to neuraminidase inhibitors.
- Used for cost-effectiveness evaluation of mitigation strategies.
- Implementation of a mechanism to retrieve census data based upon GIS coordinates and construct characteristic communities.

Demos

Come see me for demos or if you're
interested in beta testing

Distribution and Release

- We intend to publicly release Loki-Infect 3 along with its source code under a free license in the summer of 2011.

Questions?

Additional slides

Representation of a Community

- To construct a layer in the community, we begin by randomly sampling the user-provided distributions to produce new distributions.
- We then use these distributions as constraints in a linear least squares problem, which we solve using a weighted non-negative least squares algorithm.
- We then use a hill-climbing approach to produce a solution that satisfies all necessary constraints (e.g., we must guarantee that the sum of all members in all groups is consistent with the demographics of the population).
- Repeatedly applying this approach to all layers produces a new random community that necessarily satisfies all hard constraints and roughly approximates all soft constraints.