

# 5<sup>th</sup> International Hands-on tutorial on logical modeling

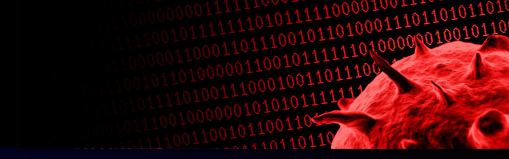
**Tomas Helikar**

[www.cellcollective.org](http://www.cellcollective.org) || [www.helikarlab.org](http://www.helikarlab.org) || [@helikarlab](https://twitter.com/helikarlab) || [thelikar2@unl.edu](mailto:thelikar2@unl.edu)

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University of Rochester, Medical Center, USA



## Schedule

9:00-9:15 Welcome and Introduction to logical modeling frameworks

9:15-10:30 CellNOpt: Julio Saez-Rodriguez

10:30-11:00 **Coffee break**

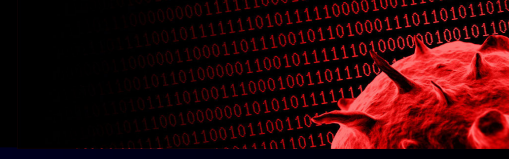
11:00-12:30 Cell Collective: Tomas Helikar

12:30-13:30 **Lunch break**

13:30-15:00 GINsim: Aurelien Naldi & Denis Thieffry

15:00-15:30 **Coffee break**

15:30-17:00 CoLoMoTo Interactive Notebook: Loïc Pauleve



# Network Modeling Methods

Interaction maps,  
Statistical mining,  
Graph theory

Bayesian networks,  
Discrete, Rule-based  
models, Logical Models

ODE models



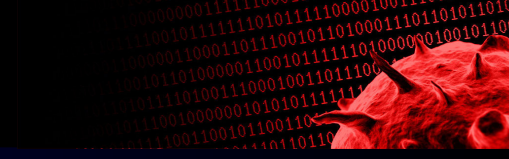
Abstract

High Detail

Large scale

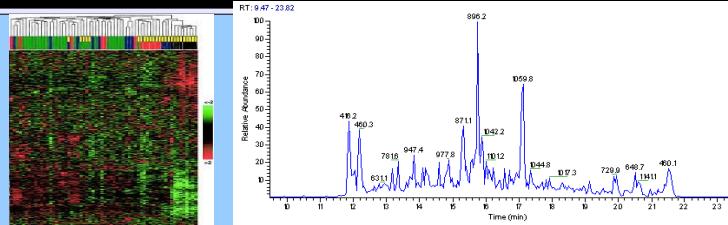
Specific





# Bottom up vs top down modeling

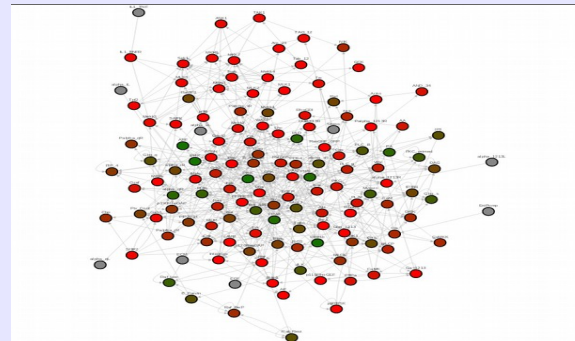
Top-down



Global profiling (omics)

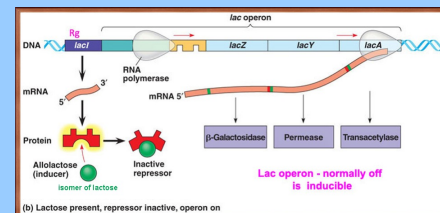
Data analysis

Model inference



Mechanism description

Bottom-up



Interaction identification

Literature curation



# Logical (Boolean) Modeling

Stuart Kauffman (1969)

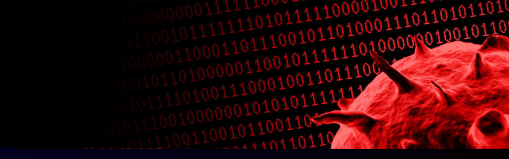


- Generic model of gene regulatory network with nodes with predefined in-degree, random connections
- Deterministic behavior defined by a Boolean function

Rene Thomas (1973)



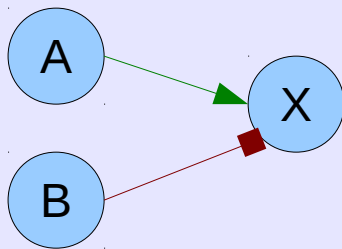
- Specific gene regulatory networks



# Modeling Method

## Logical Model Network

Active (*On/High*) or Inactive (*Off/Low*)

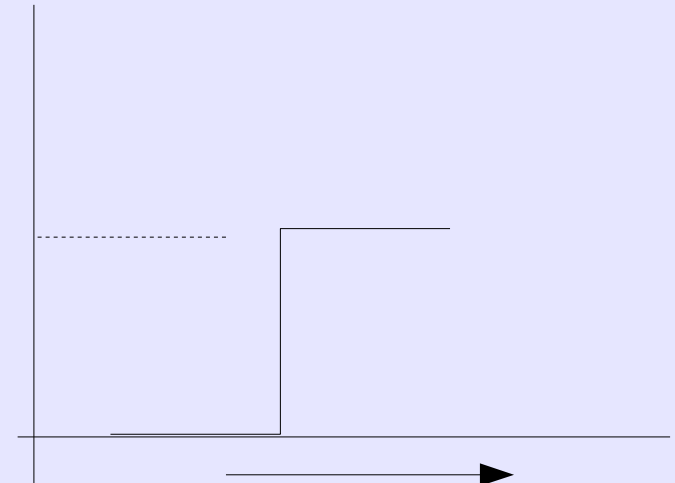


Activation



On

Off



(Kinetic) Parameter independent

Qualitative logic, i.e. “Protein *A* activates protein *X*”

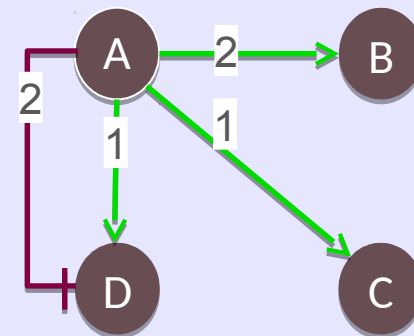
- straight forward to retrieve from biochemical literature

Efficient simulations



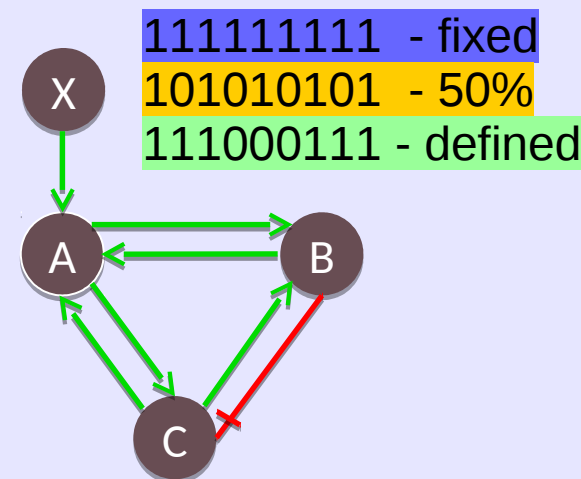
# Variants of the formalism

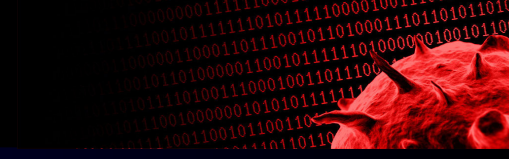
- Multivalued variables  $\{0,1,2\}$
- Time delays (multiple time scales)
- Semi-continuous input/output
- Specific classes of logical functions, e.g. threshold function (sum of regulatory effects relative to a threshold)



## Control networks

variable set to a fixed value,  
sampled, specific signal sequence





# Examples of investigations of logical models

**What are the attractors (long term behaviors)?**

Stable states (all components are stable)

Cyclical attractors (oscillations)

**What are their reachability properties? e.g.**

- Is a given attractor reachable from a given initial state?
- What are the properties along the trajectories leading to an attractor?

**What are the properties upon model perturbations? e.g.**

- Knock-out  $\rightarrow$  variable maintained to 0
- Gain-of-function  $\rightarrow$  variable maintained to 1

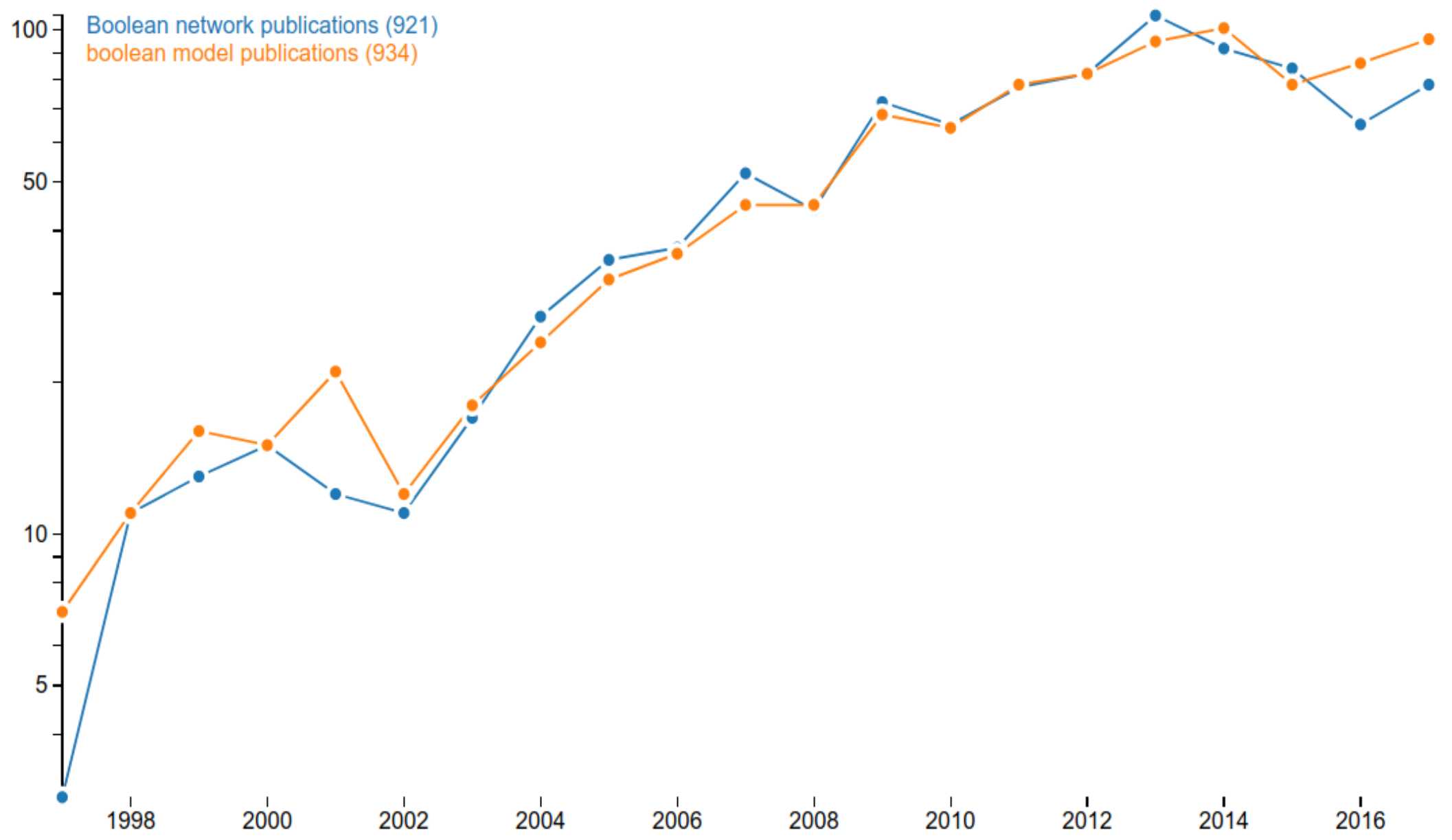
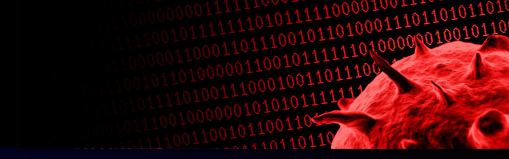
**How does the environment effect the dynamics? (control networks)**





# Challenges

- Combinatorial explosion of the number of states with the number of components ( $2^n$  states for  $n$  network components)
- Scalability of creating large-scale and accurate models
- Model transparency (can I believe the model?)
- Model (re-)usability and sharing



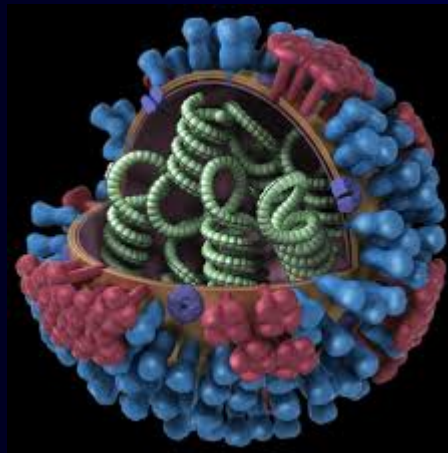
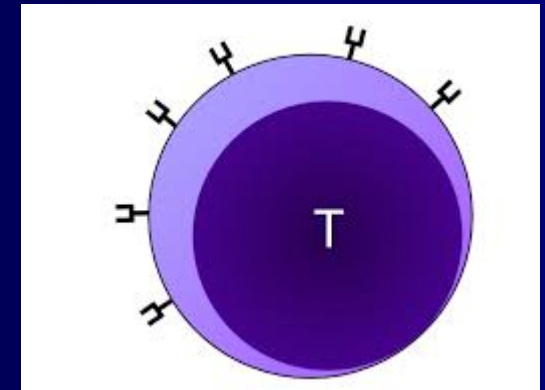
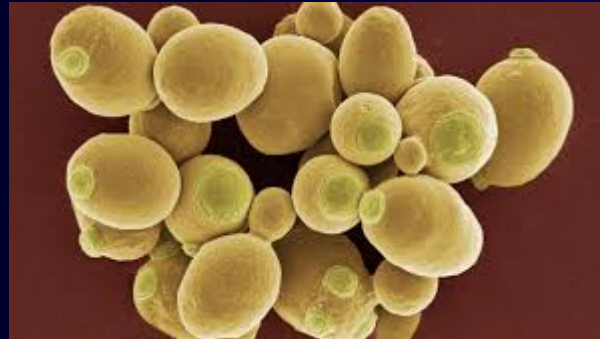
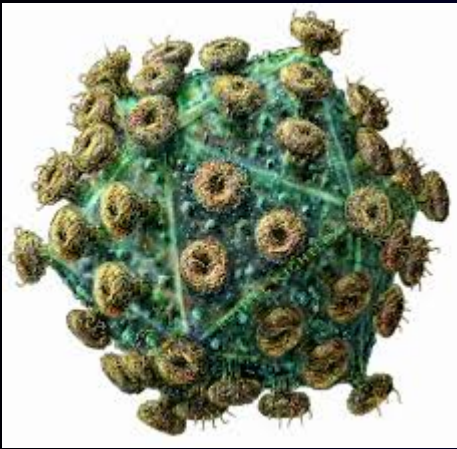


# Models and Model repositories

Cell Collective ([www.cellcollective.org](http://www.cellcollective.org))

[http://ginsim.org/models\\_repository](http://ginsim.org/models_repository)

Biomodels.net





# Tools (not exhaustive!)

Tool	Range	Updating	Feature	Syst. Req.
Adam	Multi-val	Seq/Sync	SS & CA	Web serv
BooleanNet	Bool	A/Sync, Time sync, Stoch async	Switch to PLDE Attractors (reduc.)	Python
BoolNet	Bool	A/Synch, Stoch async	RBN generation	R
Cell Collective	Bool	A/Sync, Time Delay, Thresholds	Stochastic, Real-time	Online
CoLoMoTo Interactive Notebook	Mixed	A/Sync, Time sync, Stoch async	Integrative	Docker
CellNetAnalyzer	Bool	-	Structural analysis (Mini. Int. Sets)	Matlab
CellNOpt	Bool	Sync	Model training, Fuzzy Logic, ODE	R / Cytoscape plugin
GINsim	Multi-val	A/Sync, priorities	Stable states, functionality, HTG	Java
MaBoss	Bool	continuous/discrete time Markov processes		C++
PyBoolNet	Bool	A/Sync	Attractors, Model Checking	Python





# Community Efforts

METHODOLOGY ARTICLE

Open Access

SBML qualitative models: a model representation format and infrastructure to foster interactions between qualitative modelling formalisms and tools <http://www.biomedcentral.com/1752-0509/7/135>



Systems biology

Bioinformatics

## Cooperative development of logical modelling standards and tools with CoLoMoTo

Aurélien Naldi<sup>1</sup>, Pedro T. Monteiro<sup>2,3</sup>, Christoph Müssel<sup>4</sup>, the Consortium for Logical Models and Tools<sup>\*,†</sup>, Hans A. Kestler<sup>4,5,6</sup>, Denis Thieffry<sup>7</sup>, Ioannis Xenarios<sup>1,8</sup>, Julio Saez-Rodriguez<sup>9</sup>, Tomas Helikar<sup>10</sup> and Claudine Chaouiya<sup>3</sup>

<http://dx.doi.org/10.1093/bioinformatics/btv013>

Journal of Integrative Bioinformatics, 12(2):270, 2015

<http://journal.imbio.de/>

## SBML Level 3 package: Qualitative Models, Version 1, Release 1

Claudine Chaouiya<sup>1\*</sup>, Sarah M Keating<sup>2</sup>, Duncan Berenguier<sup>3</sup>, Aurélien Naldi<sup>4</sup>, Denis Thieffry<sup>5</sup>, Martijn P. van Iersel<sup>2</sup>, Nicolas Le Novère<sup>6</sup> and Tomáš Helikar<sup>7</sup>



REVIEW  
published: 31 May 2016  
doi: 10.3389/fgene.2016.00094



## Logical Modeling and Dynamical Analysis of Cellular Networks

Wassim Abou-Jaoudé<sup>1</sup>, Pauline Traynard<sup>1</sup>, Pedro T. Monteiro<sup>2,3</sup>, Julio Saez-Rodriguez<sup>4</sup>, Tomáš Helikar<sup>5</sup>, Denis Thieffry<sup>1</sup> and Claudine Chaouiya<sup>3\*</sup>

## Outreach – Meetings, workshops and tutorials

- Lisbon, PT, 2010 (meeting)
- Hinxton, UK, 2012 (meeting)
- Paris, FR, 2013 (COMBINE – SBML qual)
- Lausanne, SUI, 2014 (meeting)
- Copenhagen, DK, 2014 (ECCB – workshop)
- Basel, SUI, 2015 (BC2 – tutorial)
- Singapore, 2015 (ICSB – tutorial + workshop)
- Barcelona, SP, 2016 (ICSB – tutorial)
- Blacksburg, Virginia, 2017 (ICSB – tutorial)





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Matteo Barberis and Tomáš Helikar (Eds.)

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open-access publisher and research network

# Logical Modeling of Cellular Processes: From Software Development to Network Dynamics

Frontiers in Systems Biology

Specialty Chief Editor: *Hiroaki Kitano*

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