

Formal informatics and machine learning for more principled systems and synthetic biology

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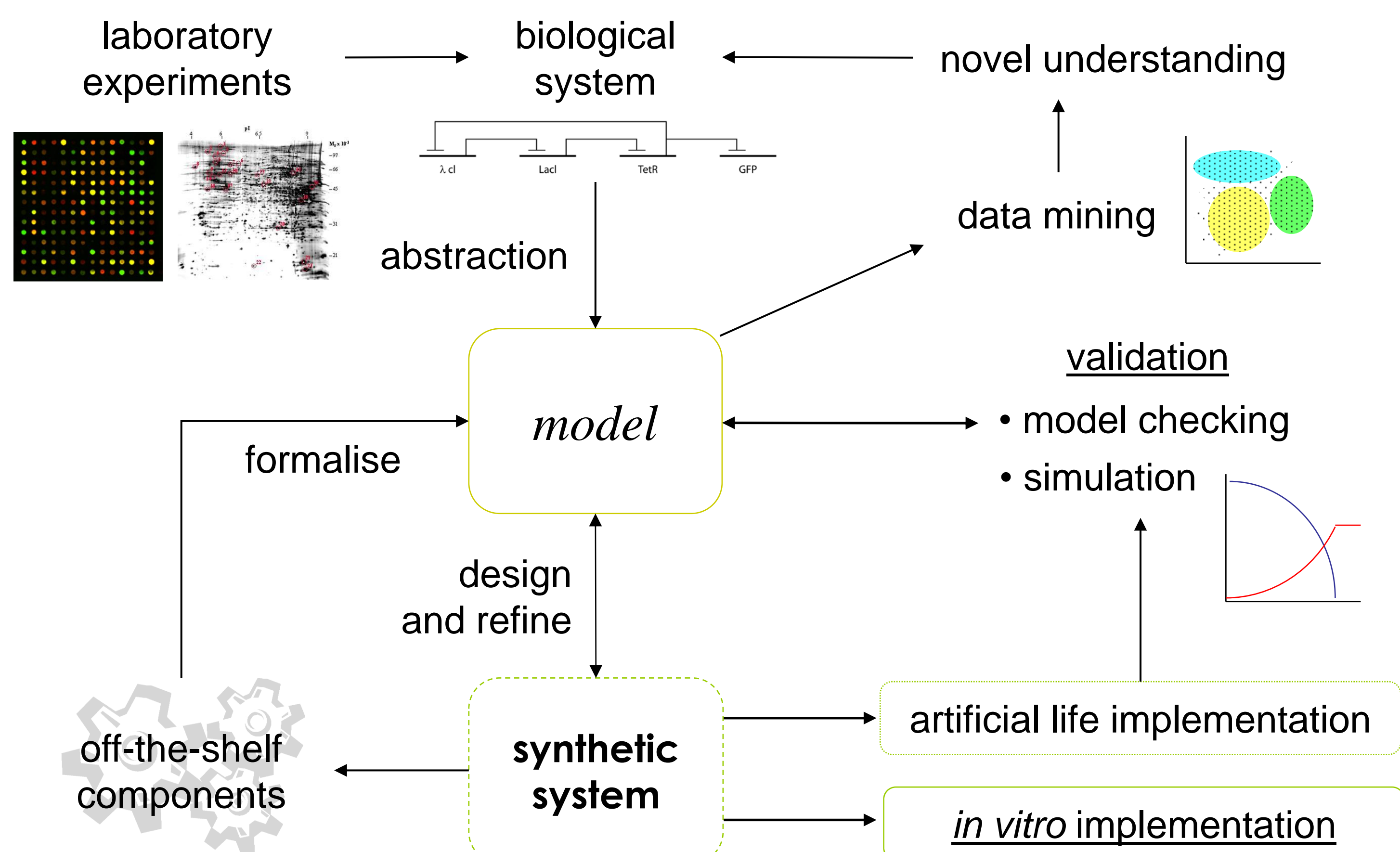
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InfoBiotics proposes that synergy between formal informatics methods, data mining and biochemical insights is a pre-requisite for a more principled practice of ALife research in general and synthetic biology in particular.

From observation to design through *in silico* hypothesis testing

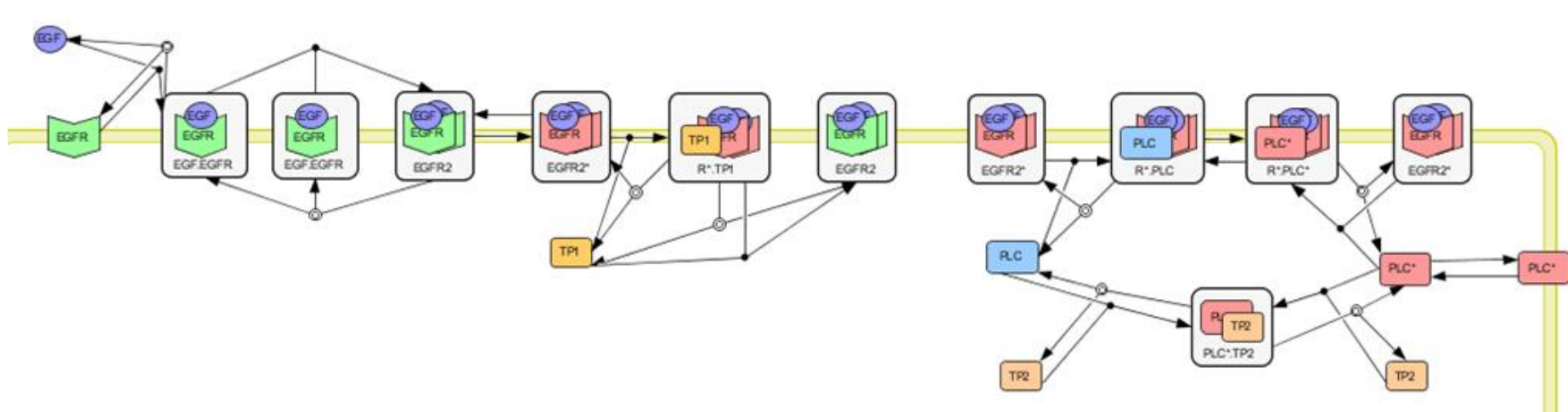
We will develop our approach by modelling well-defined biological systems of real-world interest, and accurately simulate their behaviour, to understand how they are engineered. Whereas modelling is the end goal of systems biology, we aim to modularise and recombine our models for the definition, design, prediction and testing of synthetic cells.



We propose to stick to the bottom-up approach traditional in ALife research by extending current research practice with an unconventional formal computational approach that captures the inherent *stochasticity* and *discrete* character of cellular systems.

Process algebra¹, Petri Nets² and P systems³ have had considerable success in modelling for systems biology, which suggests they might also have potential for design and testing in synthetic biology.

Formal representations of PLC activation following EGF binding EGFR

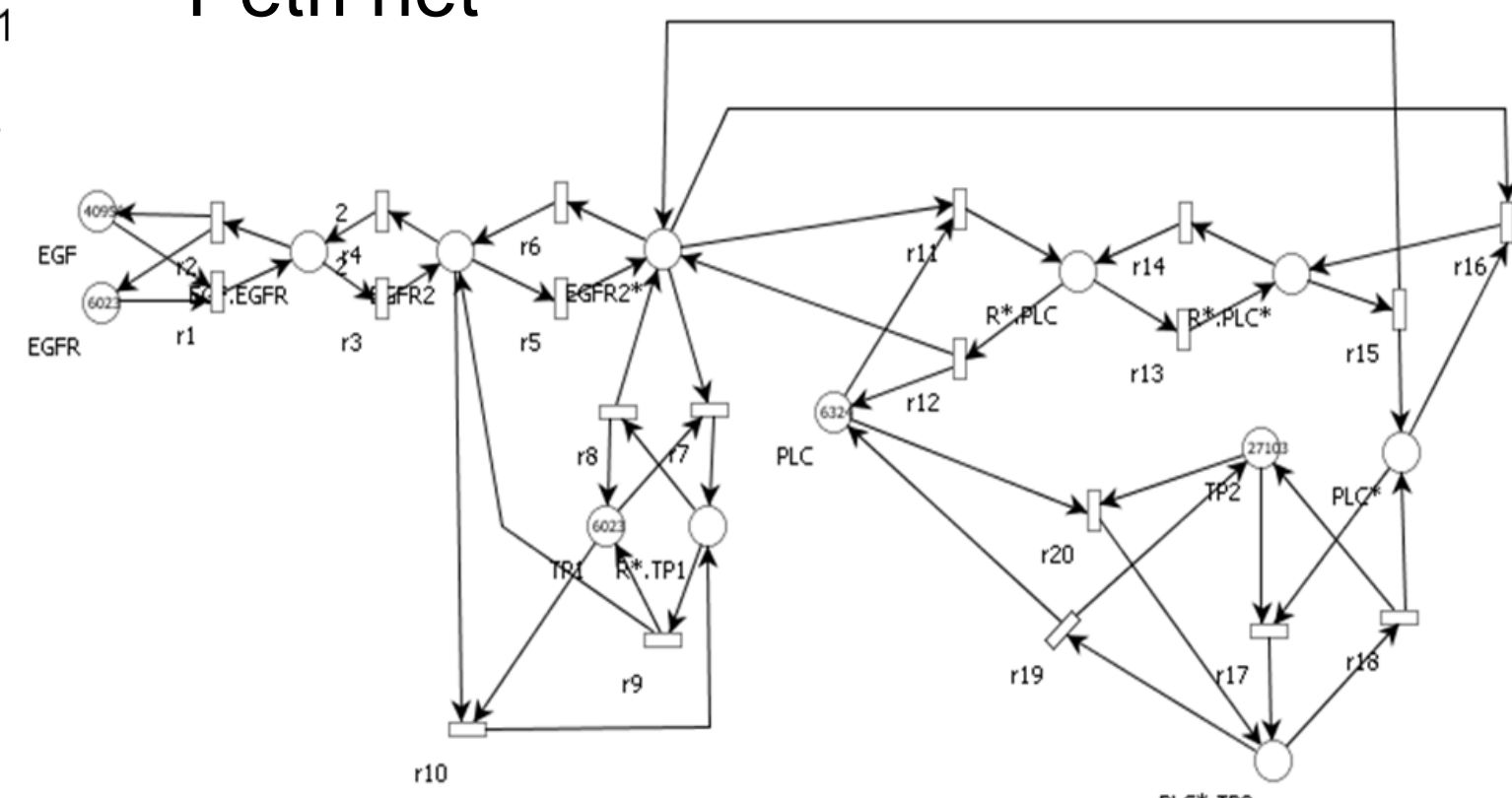


π -calculus (non-mobile)

EGF := $r_{1c1}?$. Ra
 EGFR := $r_{1c1}!$. 0
 Ra := $\tau^2_{c2}.$ (EGF | EGFR) + $r_{3c3}?$. Ra2 + $r_{3c3}!$. 0 + $r_{10c10}?$. R*.TP1
 Ra2 := $\tau^4_{c4}.$ (Ra | Ra) + $\tau^6_{c5}.$ R*
 R* := $\tau^6_{c5}.$ Ra2 + $r_{7c7}?$. R*.TP1 + $r_{11c11}?$. R*.PLC + $r_{16c16}?$. R*.PLC*
 TP1 := $r_{7c7}!$. 0 + $r_{10c10}!$. 0
 R*.TP1 := $\tau^8_{c8}.$ (R* | TP1) + $\tau^9_{c9}.$ (Ra | TP1)
 PLC := $r_{11c11}!$. 0 + $r_{20c20}!$. 0
 R*.PLC := $\tau^{12}_{c12}.$ (R* | PLC) + $\tau^{13}_{c13}.$ (R*.PLC*)
 R*.PLC* := $\tau^{14}_{c14}.$ R*.PLC + $\tau^{15}_{c15}.$ (R* | PLC*)
 PLC* := $r_{16c16}!$. 0 + $r_{17c17}?$. PLC*.TP2
 TP2 := $r_{17c17}!$. 0 + $r_{20c20}!$. PLC*.TP2
 PLC*.TP2 := $\tau^{18}_{c18}.$ (PLC* | TP2) + $\tau^{19}_{c19}.$ (PLC | TP2)

System := EGF⁴⁰⁹⁵⁶ | EGFR⁶⁰²³ | TP1⁶⁰²³ | PLC⁶⁰²³ | TP2²⁷¹⁰³

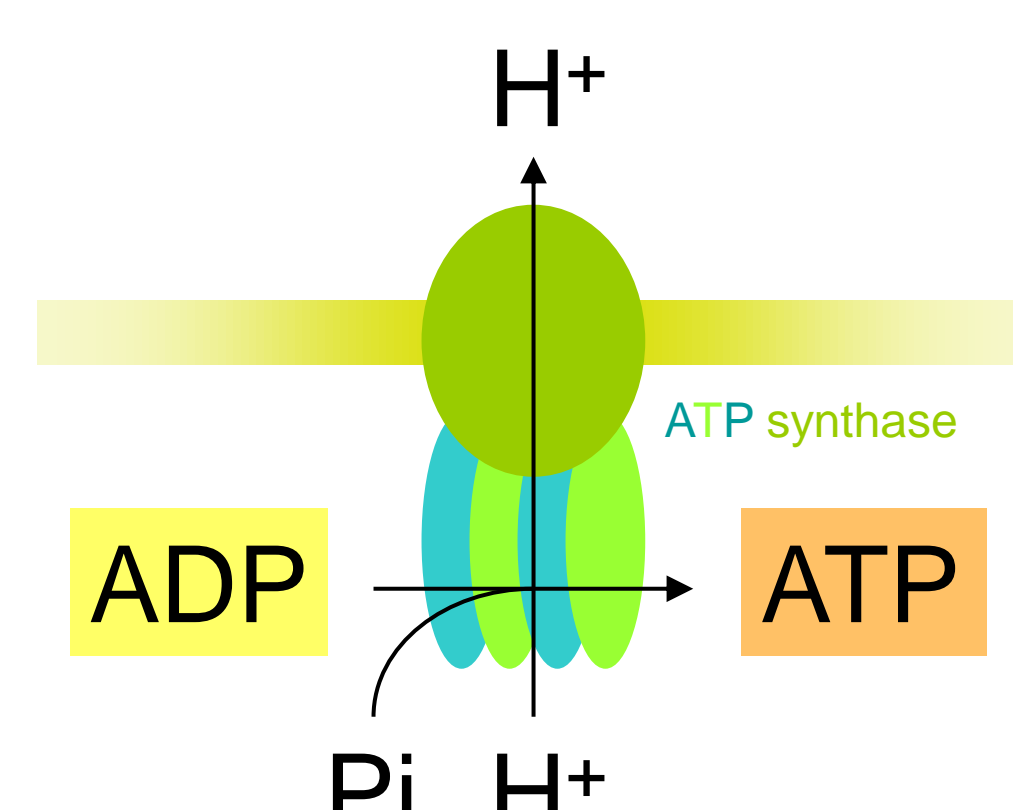
Petri net



We have chosen **P systems** – an abstraction of the structure and functioning of living cells – as a high-level formal framework for the specification and simulation of cellular systems, because they constitute a middle ground between a purely denotational (ODEs) and operational ($\{Brane, \pi, \kappa\}$ -calculus) semantics, and there is a natural mapping between P system components and biological entities:

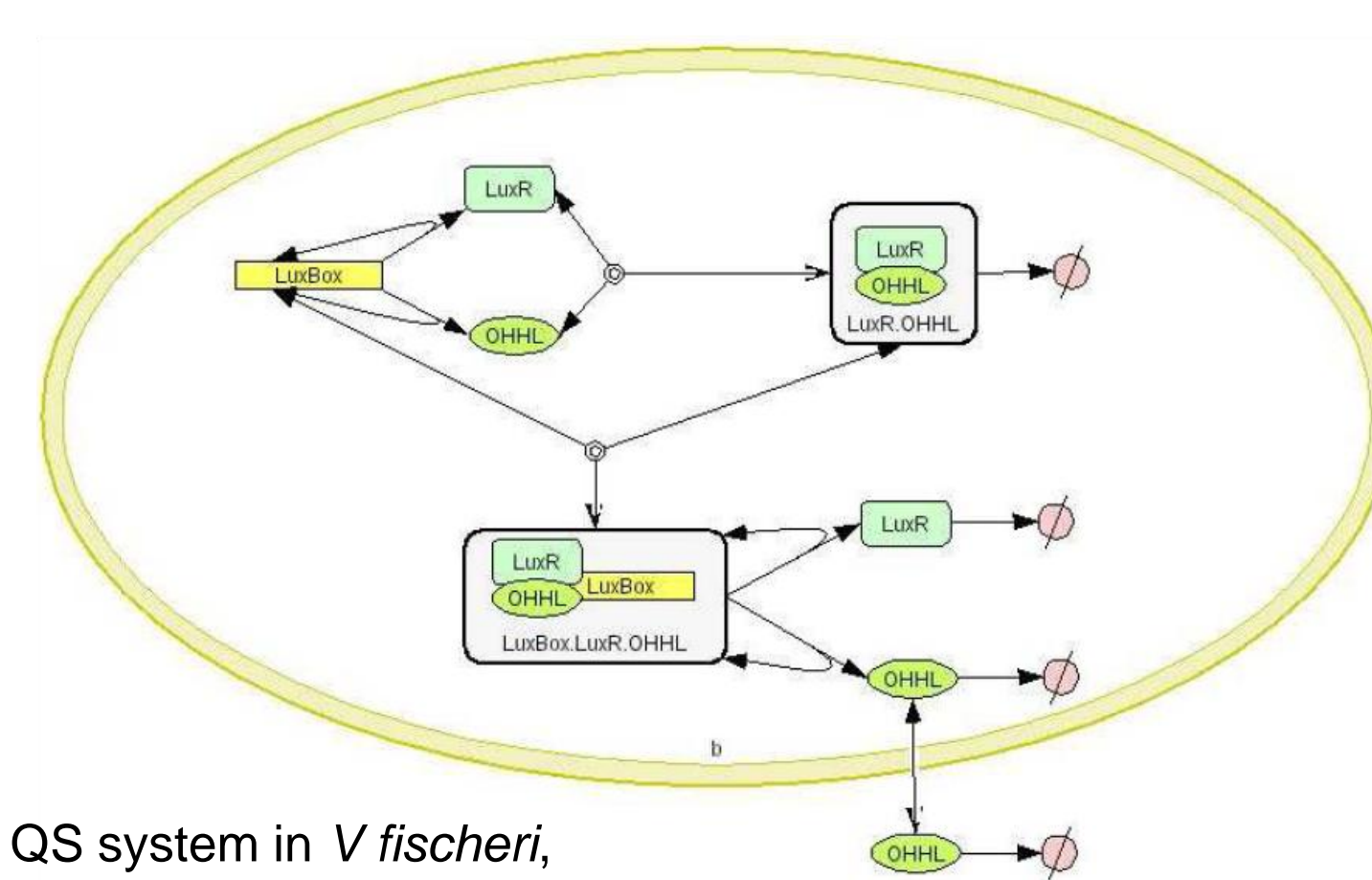
Biological entity

P system specification

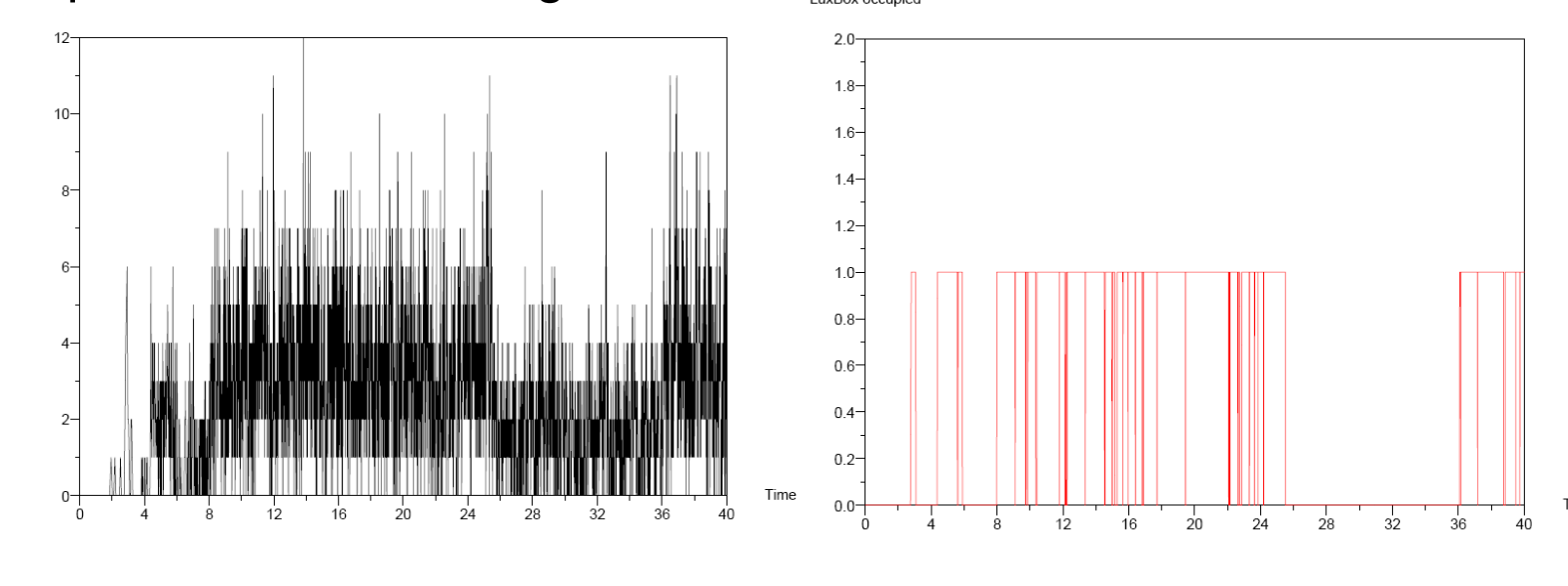
Molecule	Object	a
DNA and RNA	Strings	$ATGCA$
Population of molecules	Multisets of objects	a^2b^3c
Compartments	Membranes	$[\]_l$
Molecular interactions	Rewriting rules on objects	$a \rightarrow b$
Genetic processes	Rewriting rules on strings	$at \rightarrow au$
		<div> H^3 1 </div> <div> $ADP^{60}ATP^3H^{99}Pi^{60}$ 2 </div> <div> $r_l [ADP, Pi, H^+]_2 \rightarrow H^+ [ATP]_2$ </div>

Modelling quorum sensing with P systems

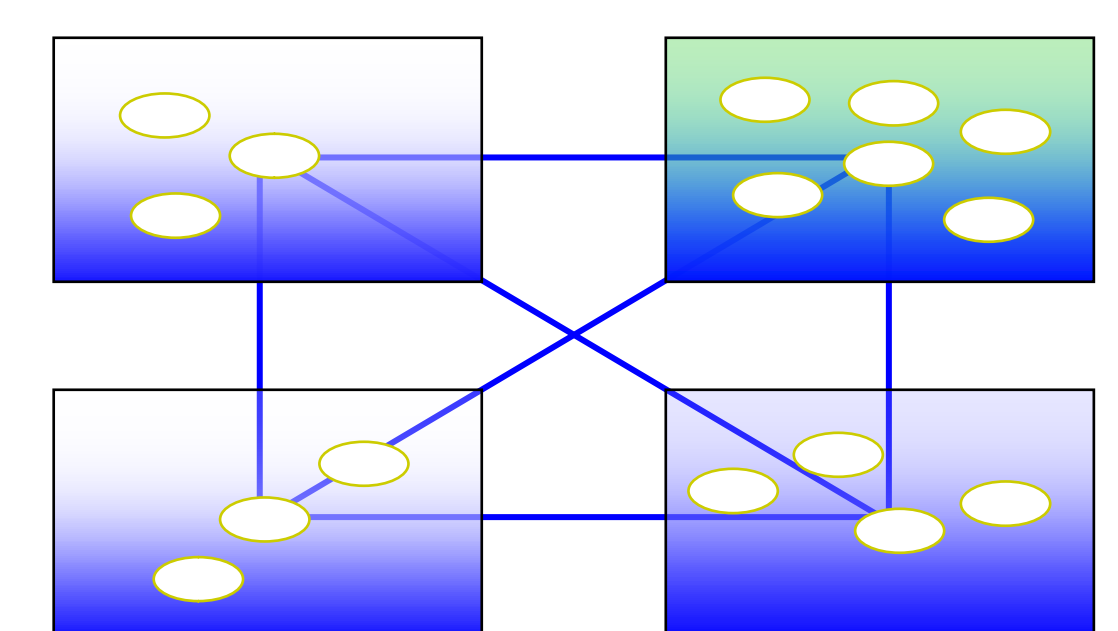
P systems have been shown to be capable of simulating the emergent behaviour of bacterial colonies by modelling quorum sensing (QS) systems⁴. QS is a cell density dependent gene regulation system that allows a population of bacterial cells to coordinate their actions. Examples include pathogenicity switching in *Pseudomonas aeruginosa* and the production of light in sea squid by *Vibrio fischeri*:



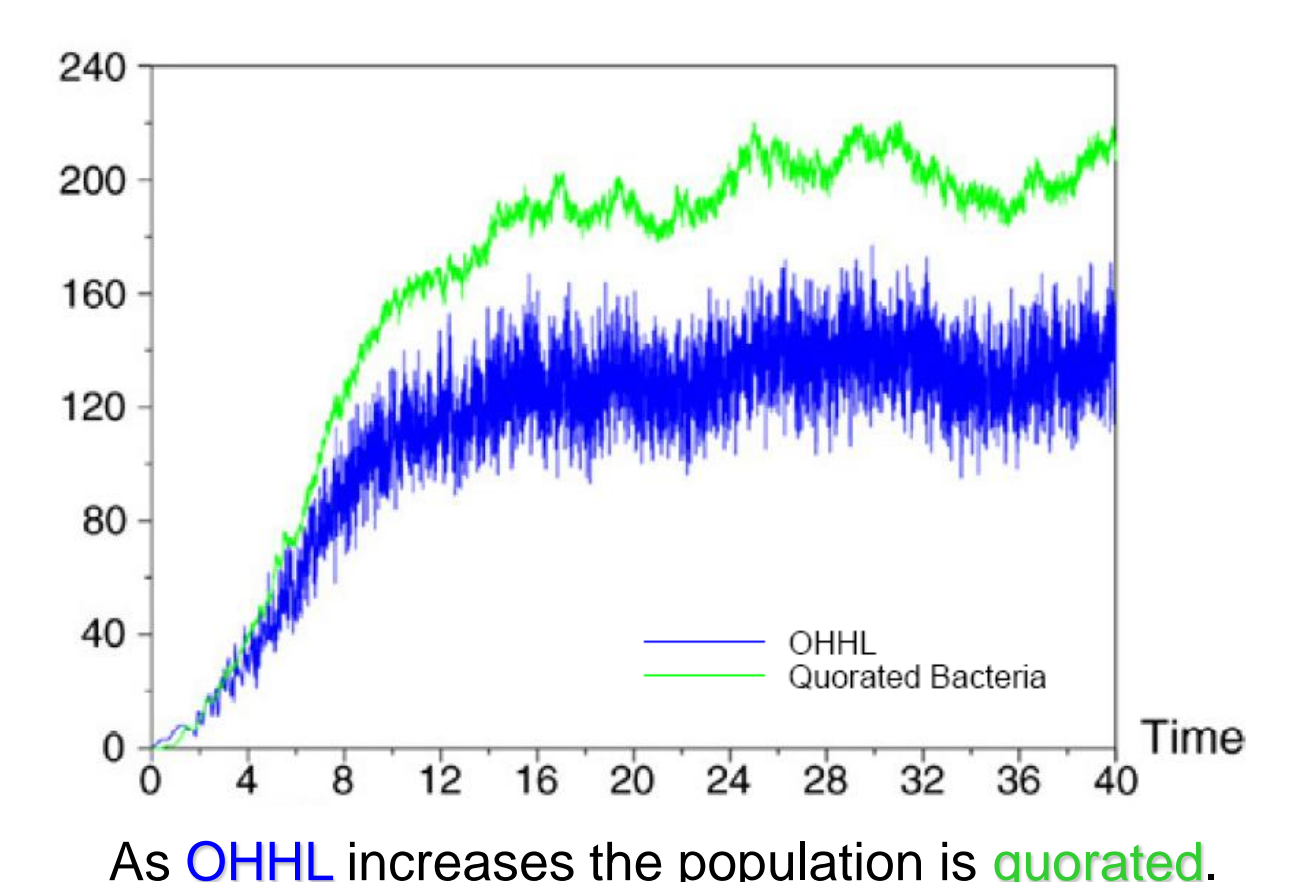
QS system in *V. fischeri*, specified in Cell Designer.



Single cell. As OHHL is taken up, gene expression switches on.



Many cells in adjoining localities. OHHL diffuses between.



As OHHL increases the population is quorated.

Summary

- The knowledge generated using P systems models will allow us to concentrate on the intentional design of cellular systems exhibiting a desired behaviour.
- A designed cellular system can be tested via artificial life based on P systems and, once its functionality has been analysed and mathematical properties formally uncovered, implemented *in vitro*.

References

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