

**ilsi ...**

modeling complex systems in the life sciences

clean and powerful mathematical/computational tools

combinatorial dynamics

multi-level dynamics

model-checking stochastic systems

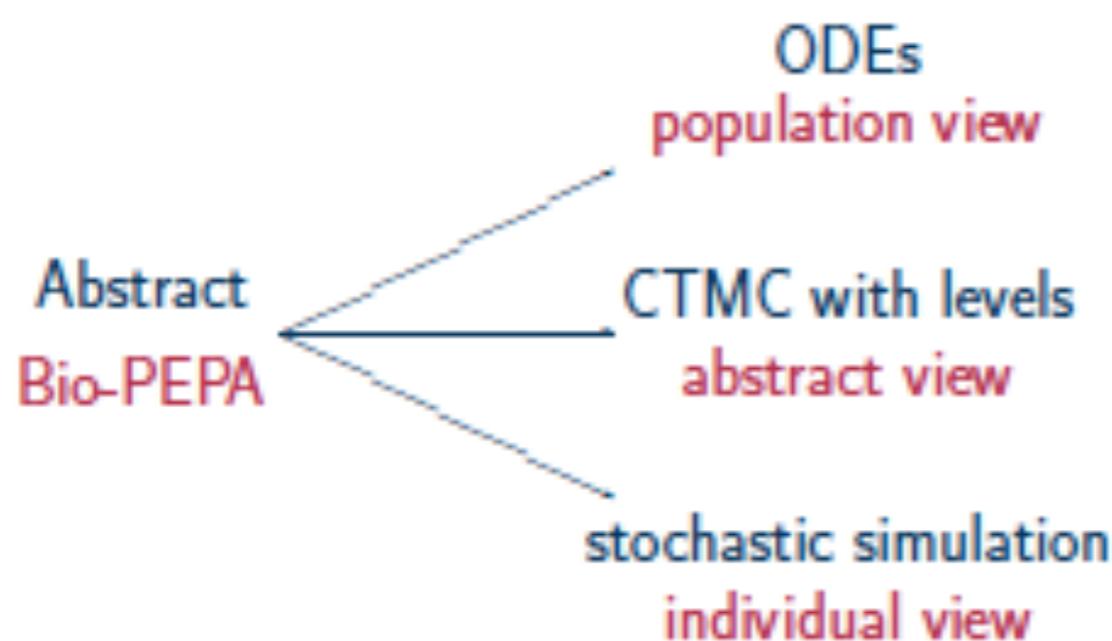
stochastic machine learning

self-organised dynamics

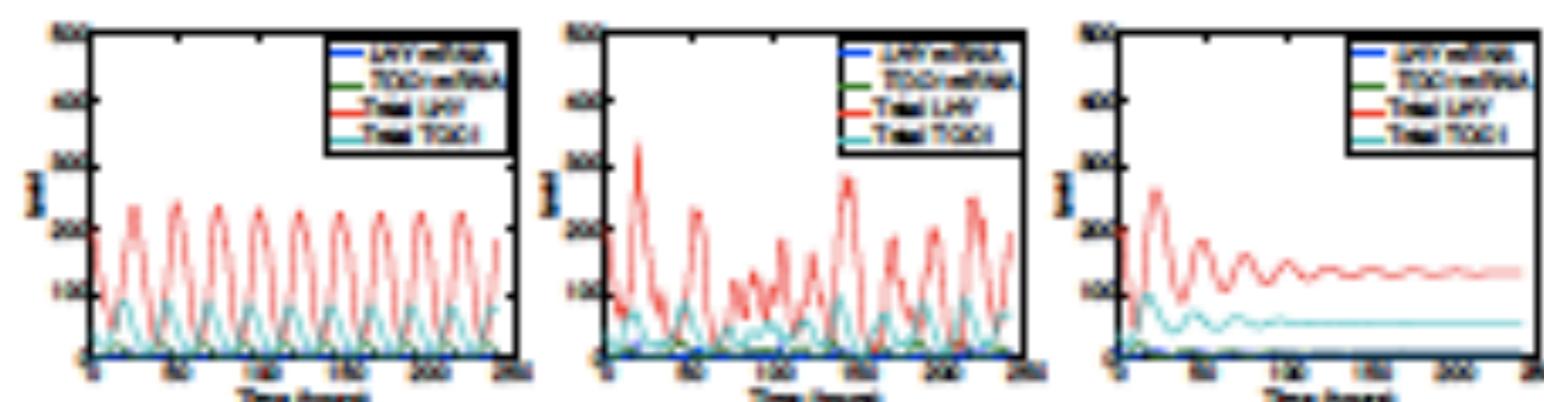
# Bio-PEPA

## modelling projects on circadian rhythms & tumour development

- Computational language for dynamic modelling
- Formal compositional representation of biochemical systems
- Molecular species  $\Rightarrow$  concurrent interacting processes
- Biochemical reactions  $\Rightarrow$  interactions
- Kinetic laws  $\Rightarrow$  functional rates



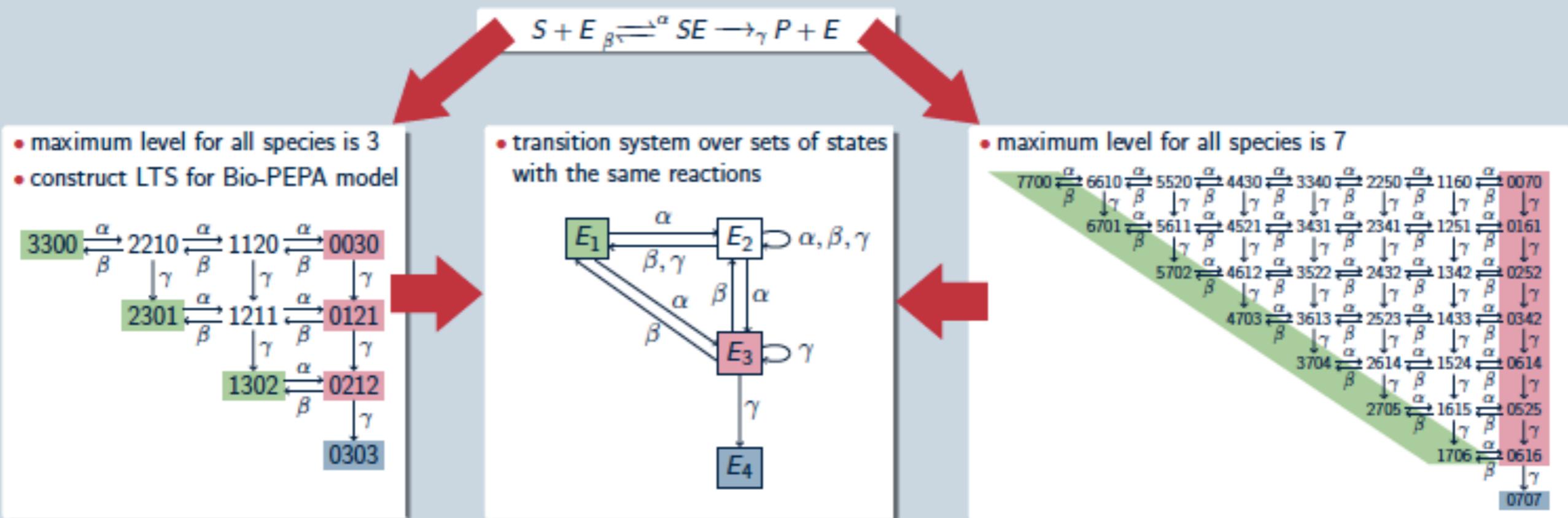
- Solution of the underlying ordinary differential equations
- Markovian analysis
- Verification of system properties via probabilistic model-checking
- Time-series analysis via stochastic simulation



# semantic equivalences to model biological behaviour

relate models with same behaviour - for labelled transition systems/CTMC with levels

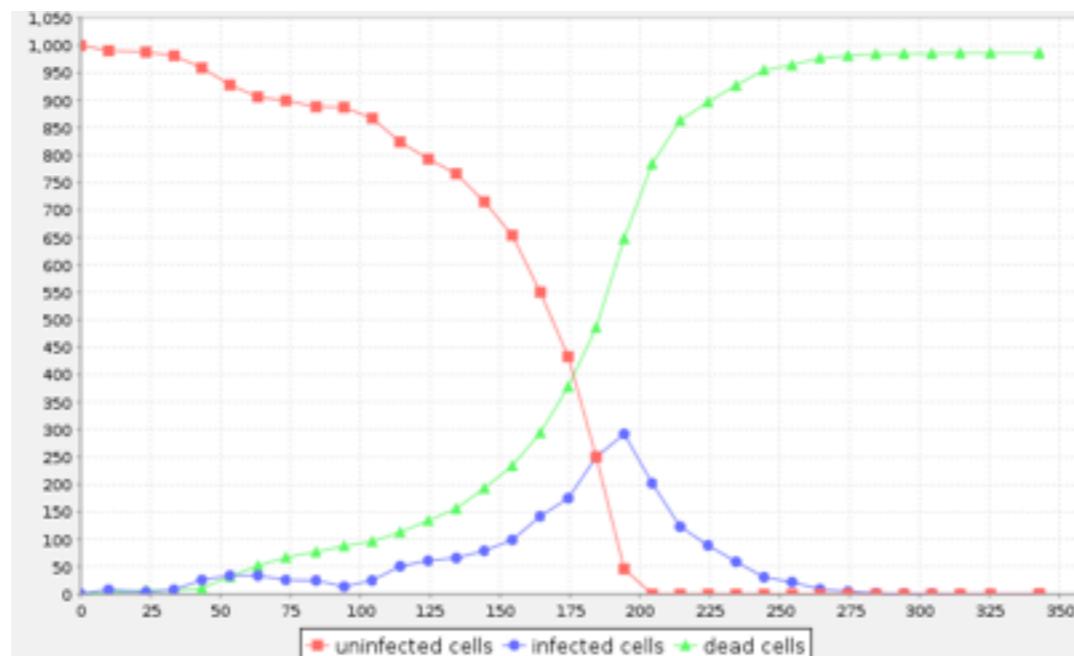
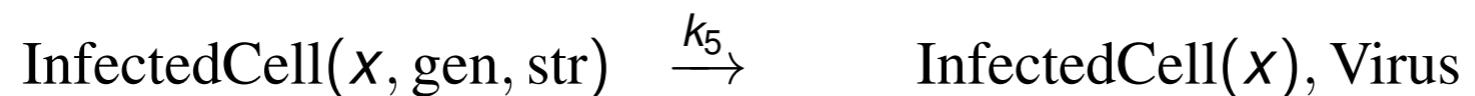
Equivalent behaviour based on two discretisations of same model: compression bisimulation



- two models are compression bisimilar when their equivalence classes (based on reactions) and induced labelled transition systems are bisimilar
- in this example, identical equivalence classes and induced transition systems are obtained, hence bisimilar

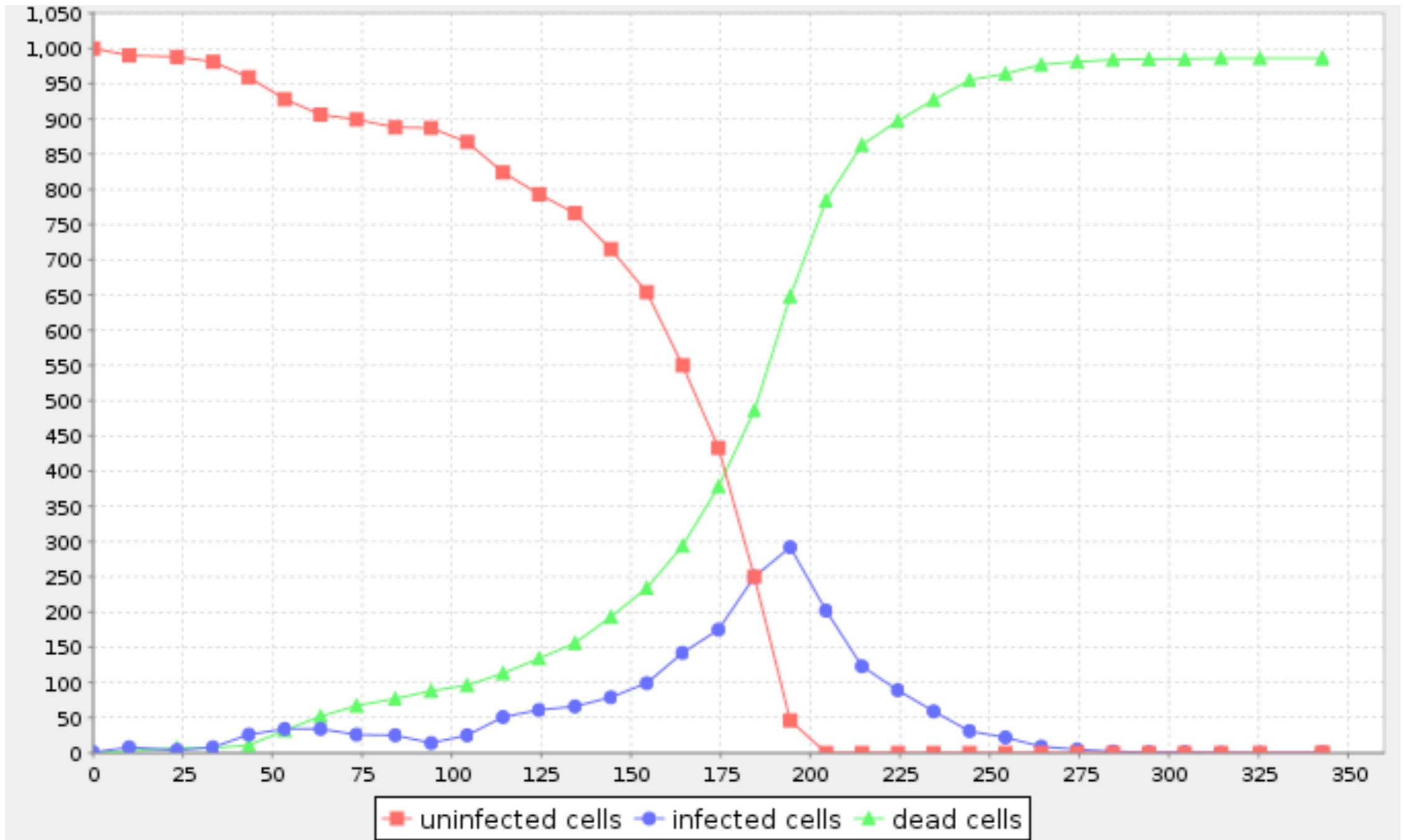
# the Lambda language

## Stochastic multi-level multiset rewriting



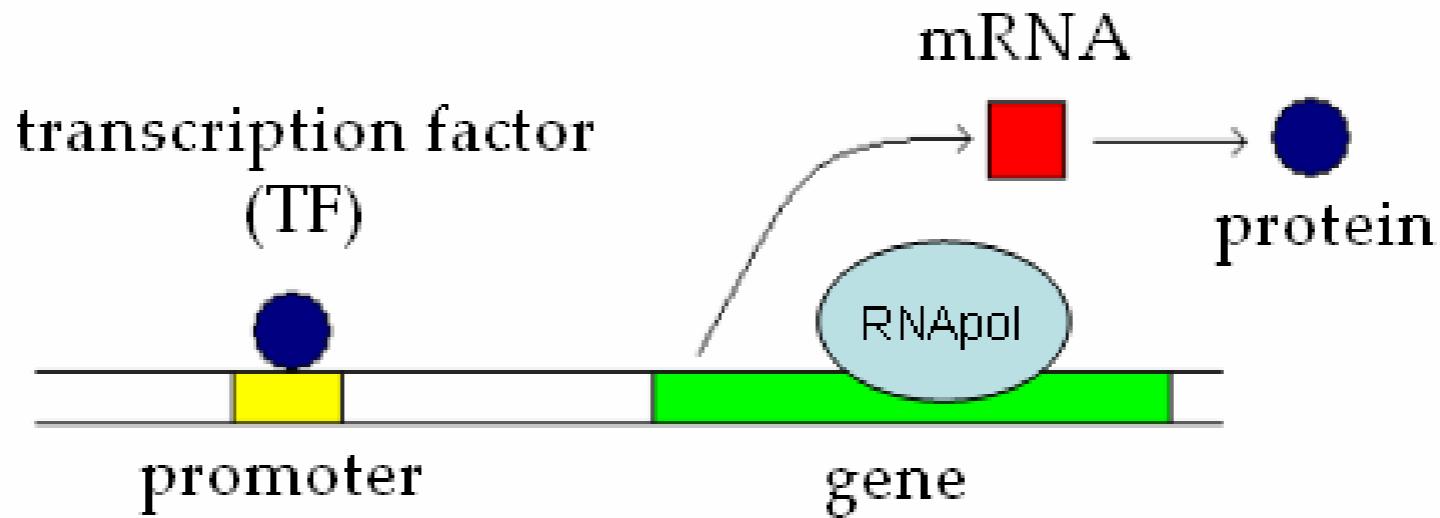
# arbitrary multi-level dynamics

Model interacting cells, each with internal biochemistry



# Stochastic transcriptional processes

reconstructing TF activities for transcriptional networks

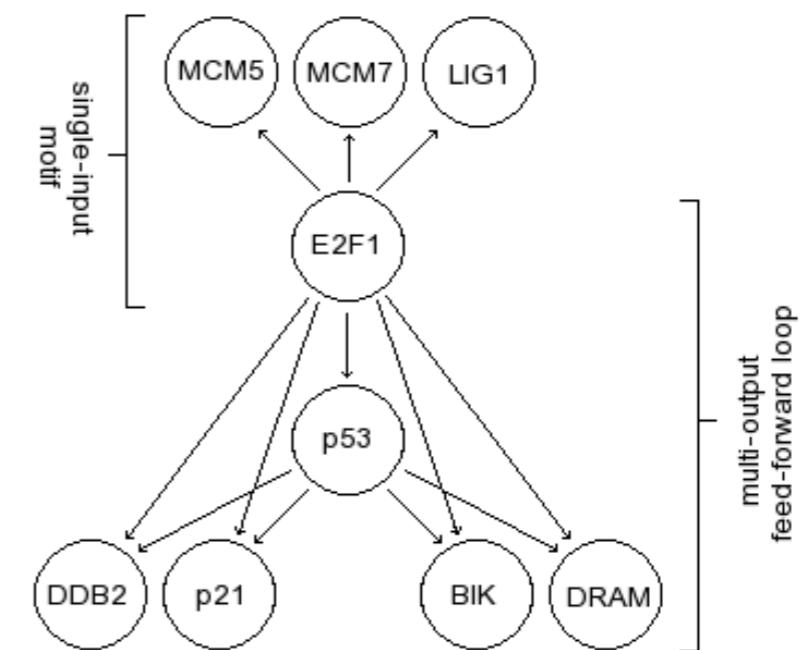
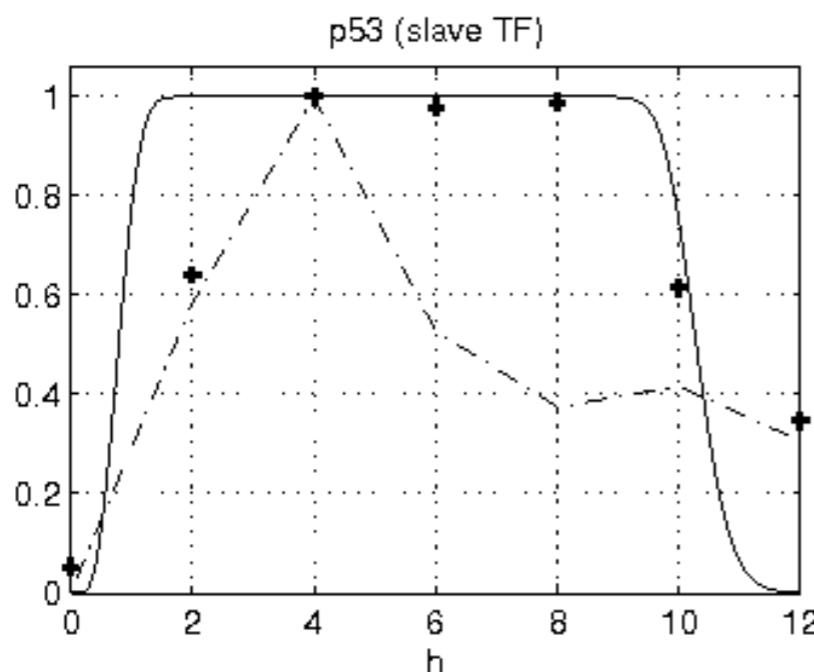


Dynamical model of transcription

$$\frac{dx_i(t)}{dt} = A_i \mu(t) + b_i - \lambda_i x_i(t)$$

# P53 a feed-forward loop Model

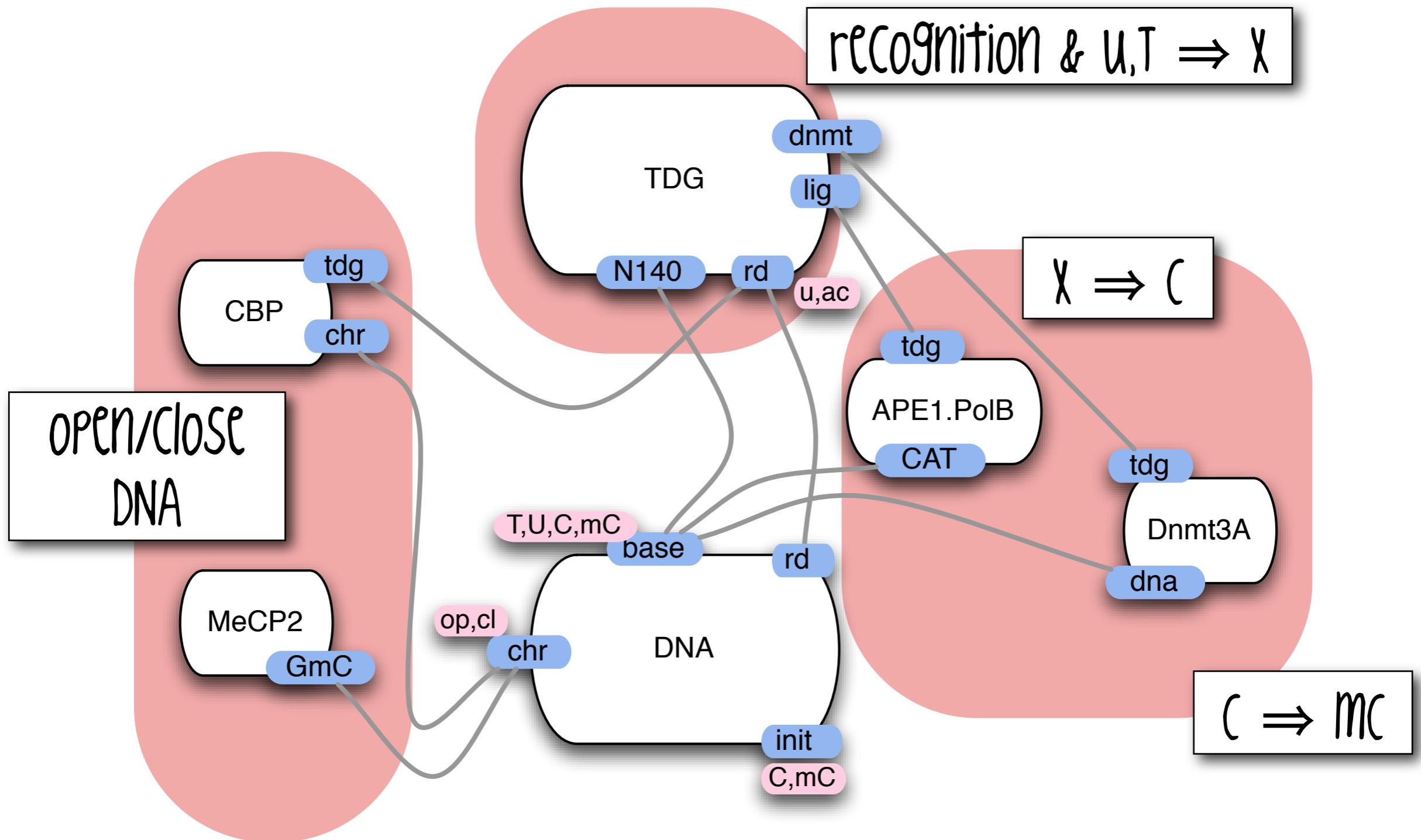
- ▶ p53 is involved in a FFL where it acts as a slave TF (Nature Reviews, 2009)
- ▶ E2F1 represents the master TF which activates p53 and p53 target genes
- ▶ We compute inference on p53 activity using a FFL model and compare our results with prediction of a single-input motif (SIM) model (Barenco et al, Genome Biol 2006)



- ▶ p53 activity experimental measure (crosses)
- ▶ SIM prediction (dashed) compared with our FFL prediction (solid)

# The Kappa language

## combinatorial dynamics

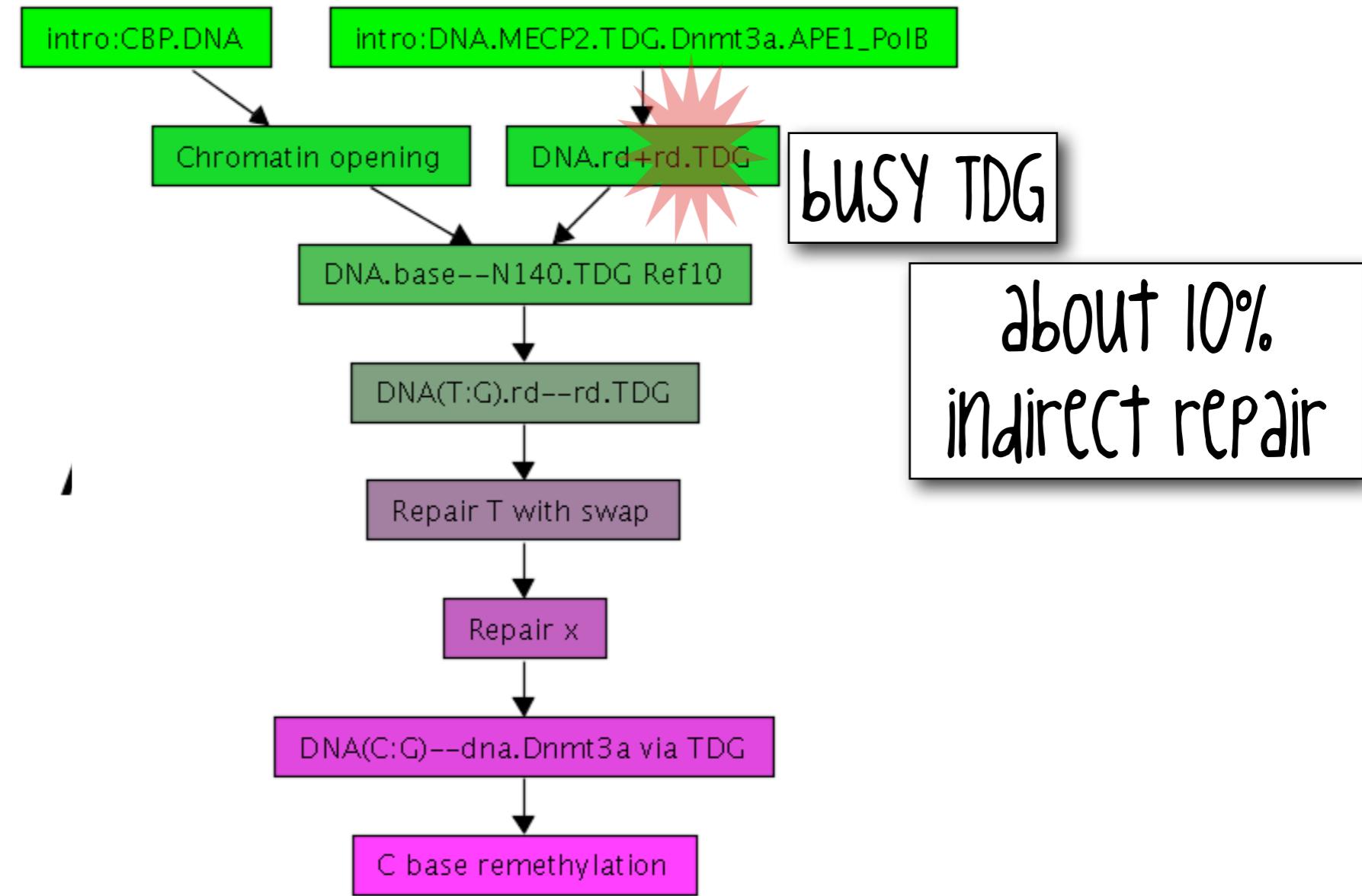


# Causality - Stories

Story: =  
inCOMPRESSible  
causal trace

-  
"everything  
matters"

-  
causal debugging  
of the model

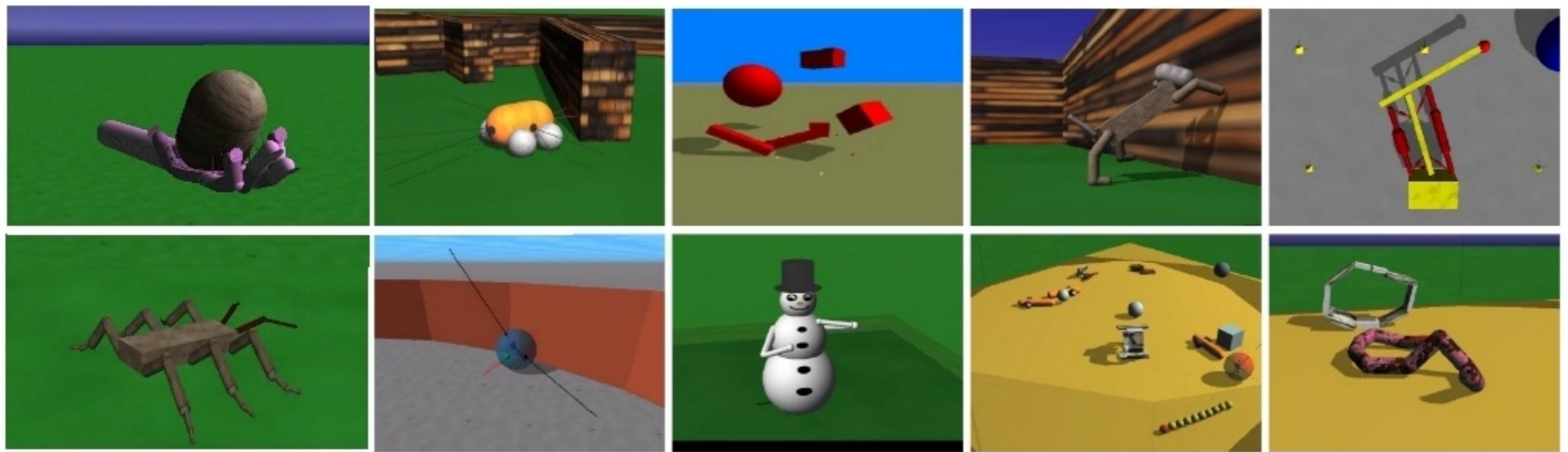


# Robots

## self-regulating dynamics

Self-Organization of adaptive behaviours by simultaneous optimisation of two conflicting goals: Choose actions to

- maximize predictability of the own sensors and to
- maximize information gained by the new sensory inputs.
- + Emergence of agile behaviours in a variety of robots.



# self-organisation

Self-organising control generates mainly exploratory behaviour: Guidance towards **goal-oriented behaviours** by

- distal teaching
- reinforcement learning
- using hints (symmetries)

Applications:

- control of transradial prostheses
- feedback loops in neural systems
- generation of options for decisions
- biological modelling (**neurorobotics**)

