

rule-based/energy-based

WCSB, June 2011

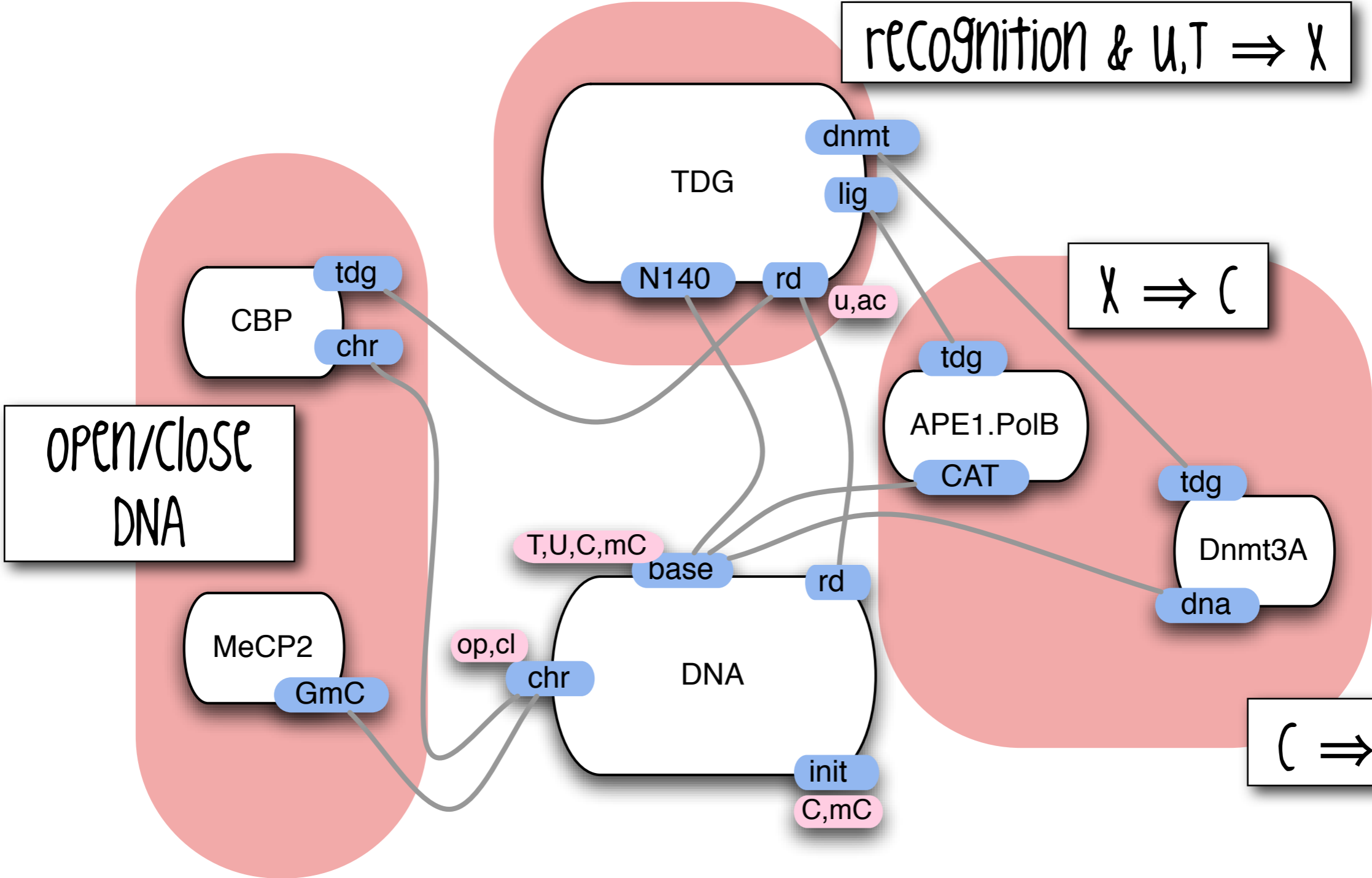
# The Kappa language

## Combinatorial dynamics

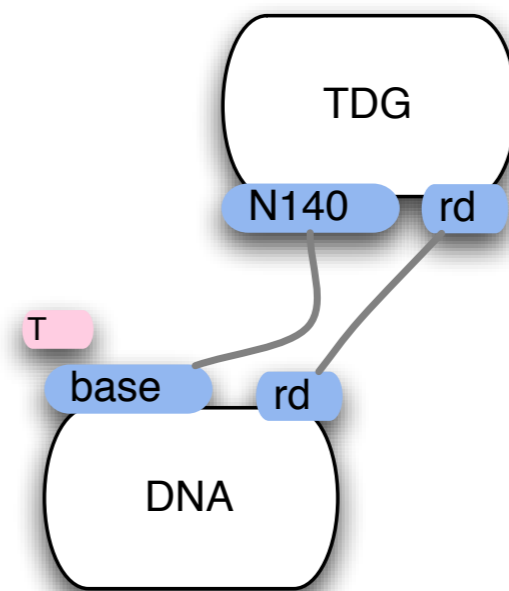
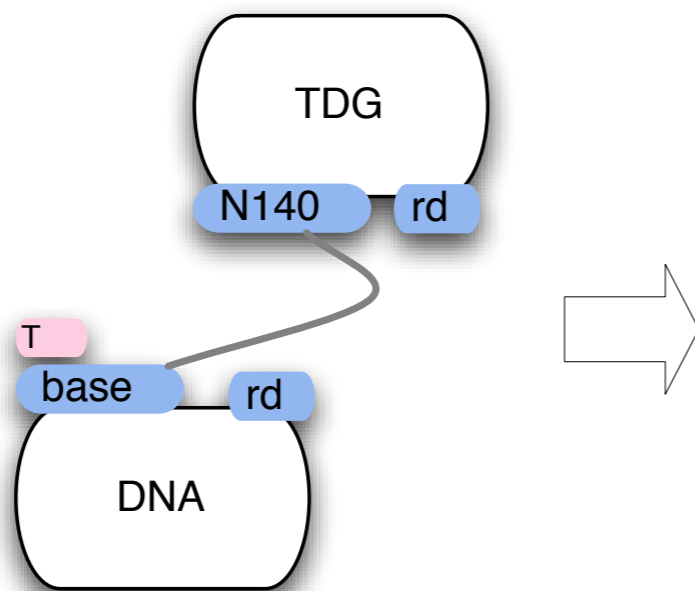
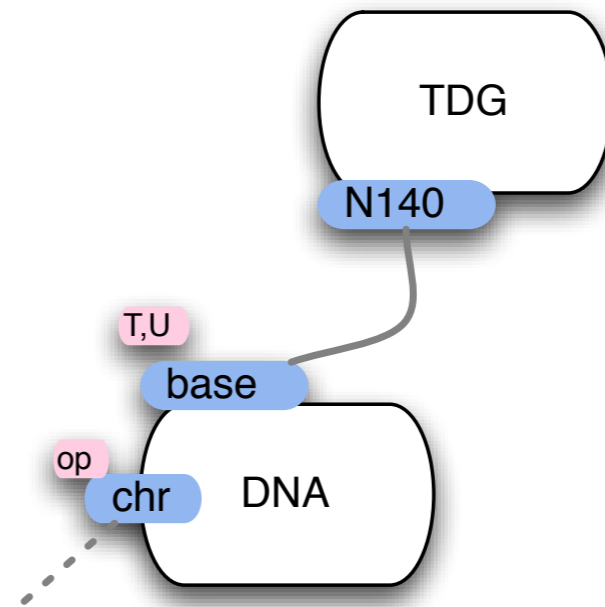
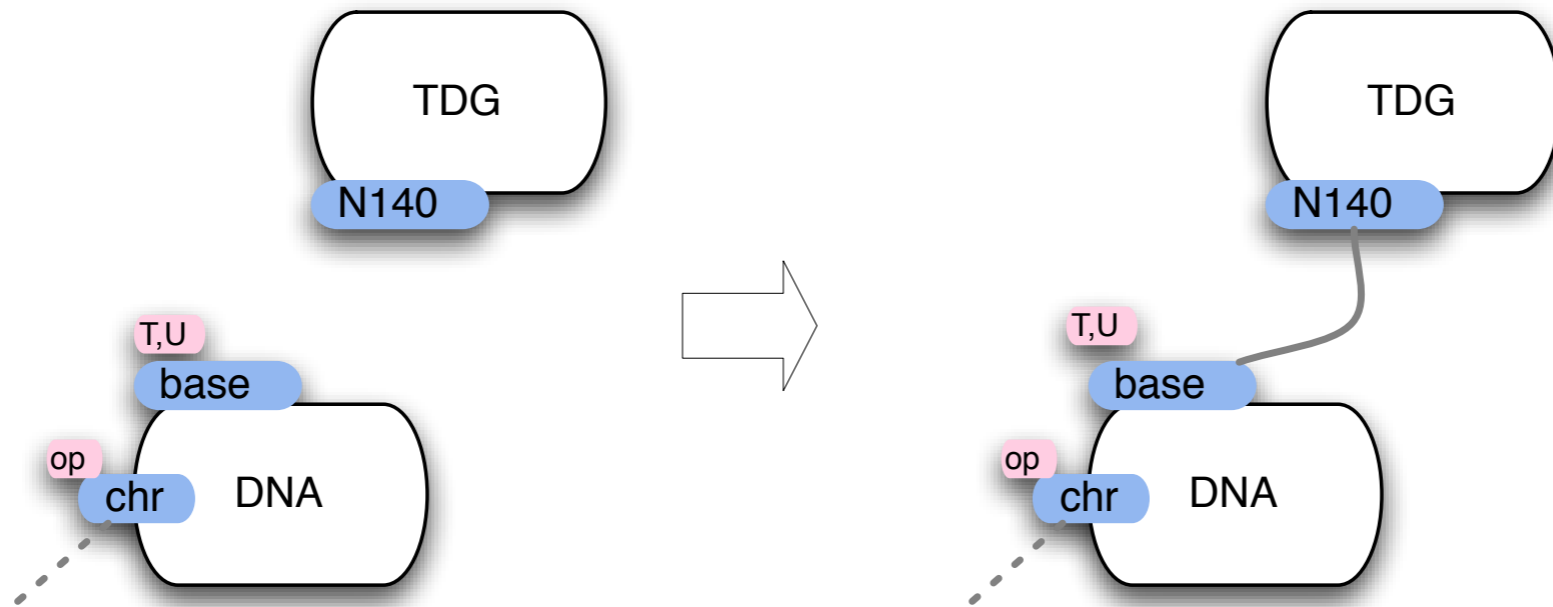
recognition & u,T  $\Rightarrow$  X

X  $\Rightarrow$  C

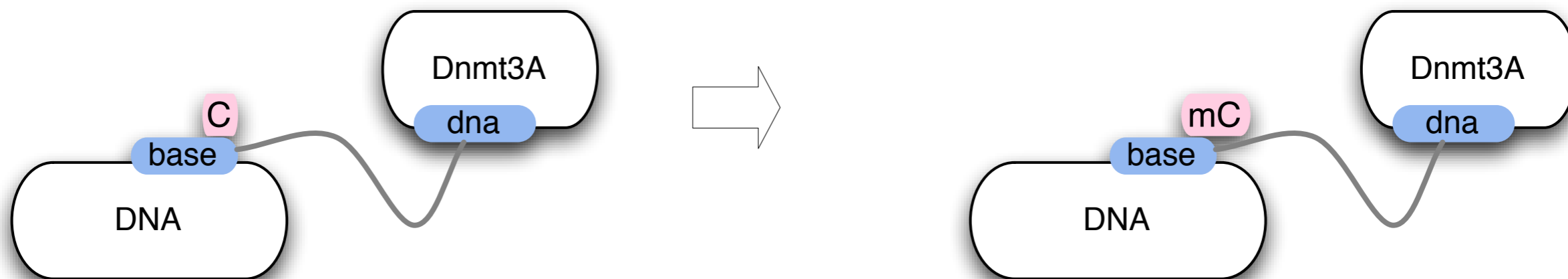
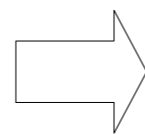
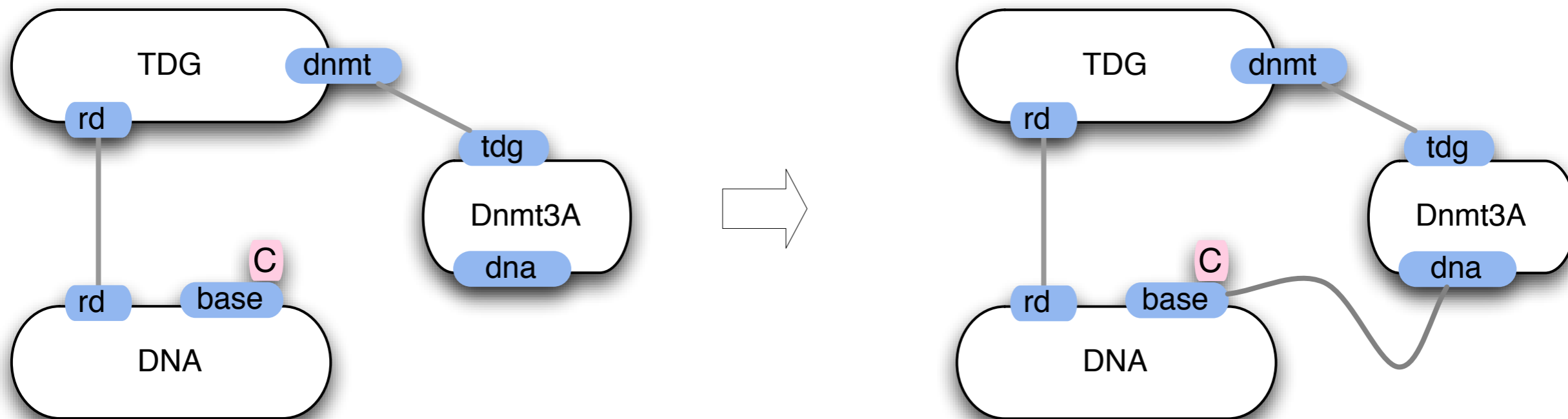
C  $\Rightarrow$  mC



# TDG-DNA: mismatch recognition



# TDG:DNA-DNMT3A C to mC



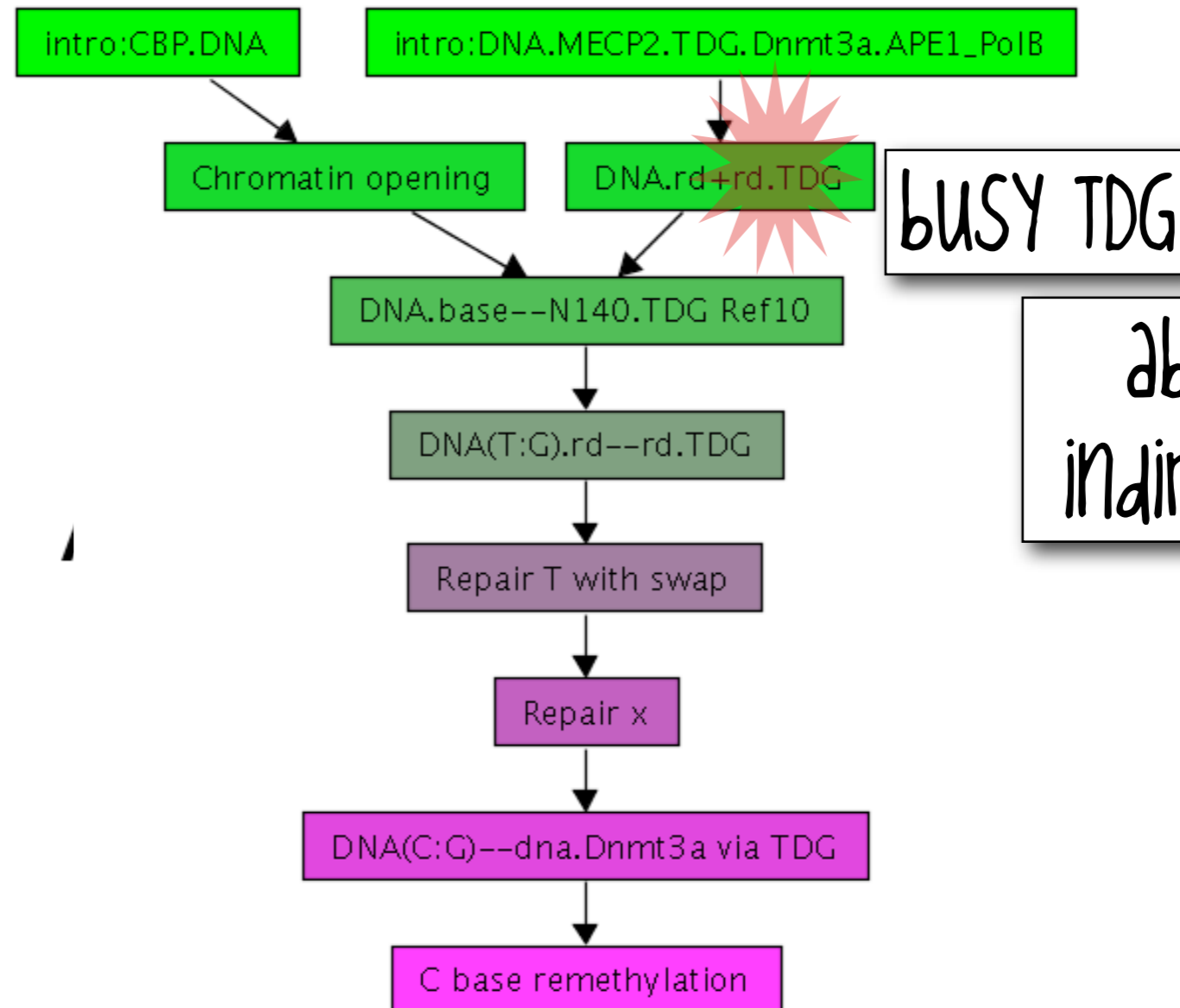
memory in transient assembly !

# causal summaries

Story :=  
incompressible  
causal trace

-  
"everything  
matters"

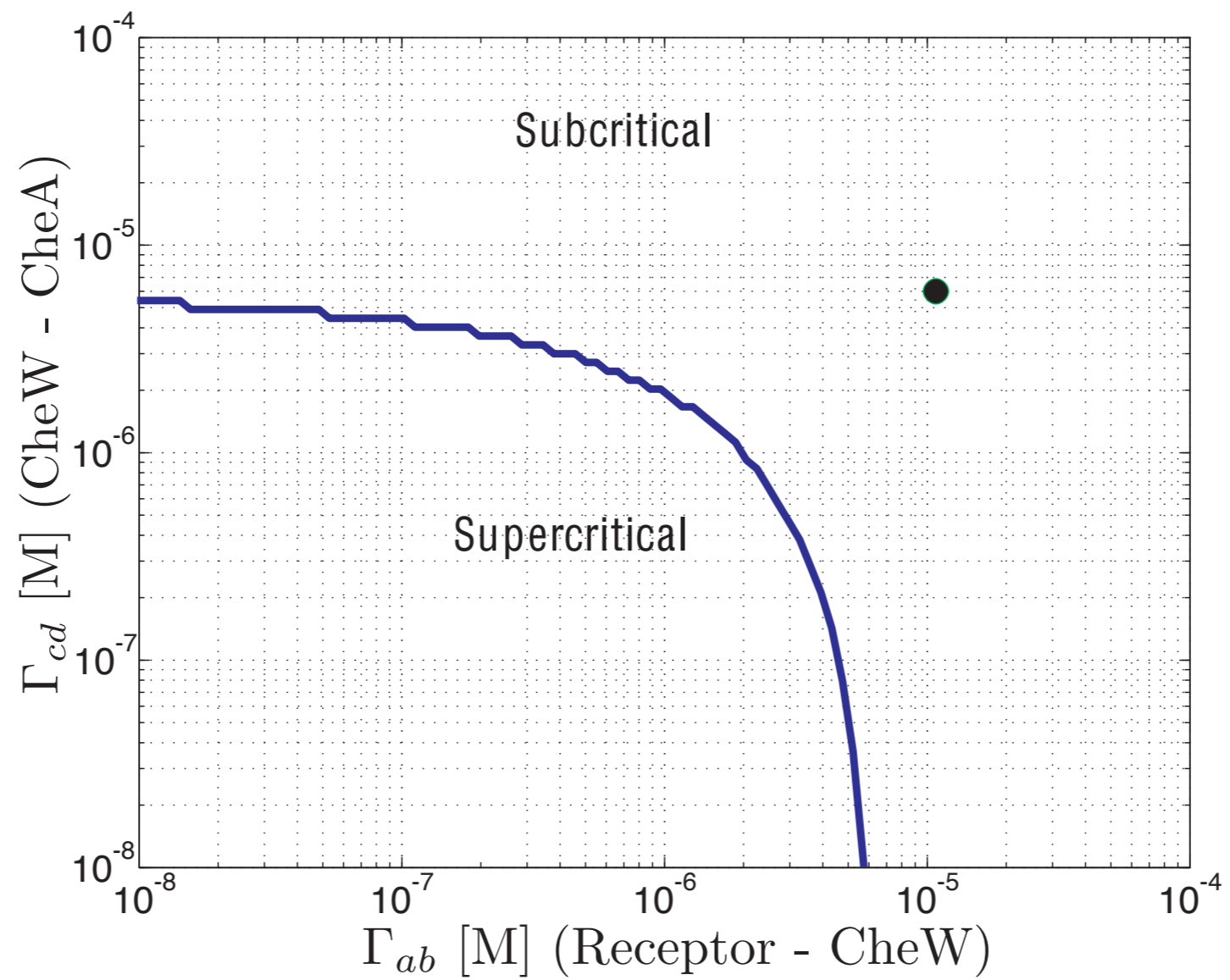
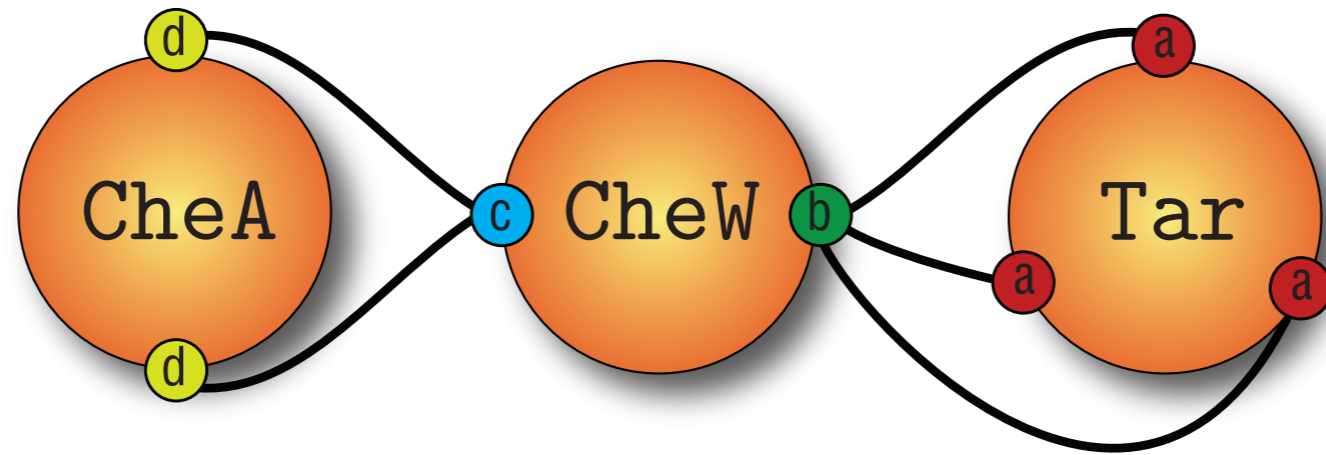
-  
causal debugging  
of the model

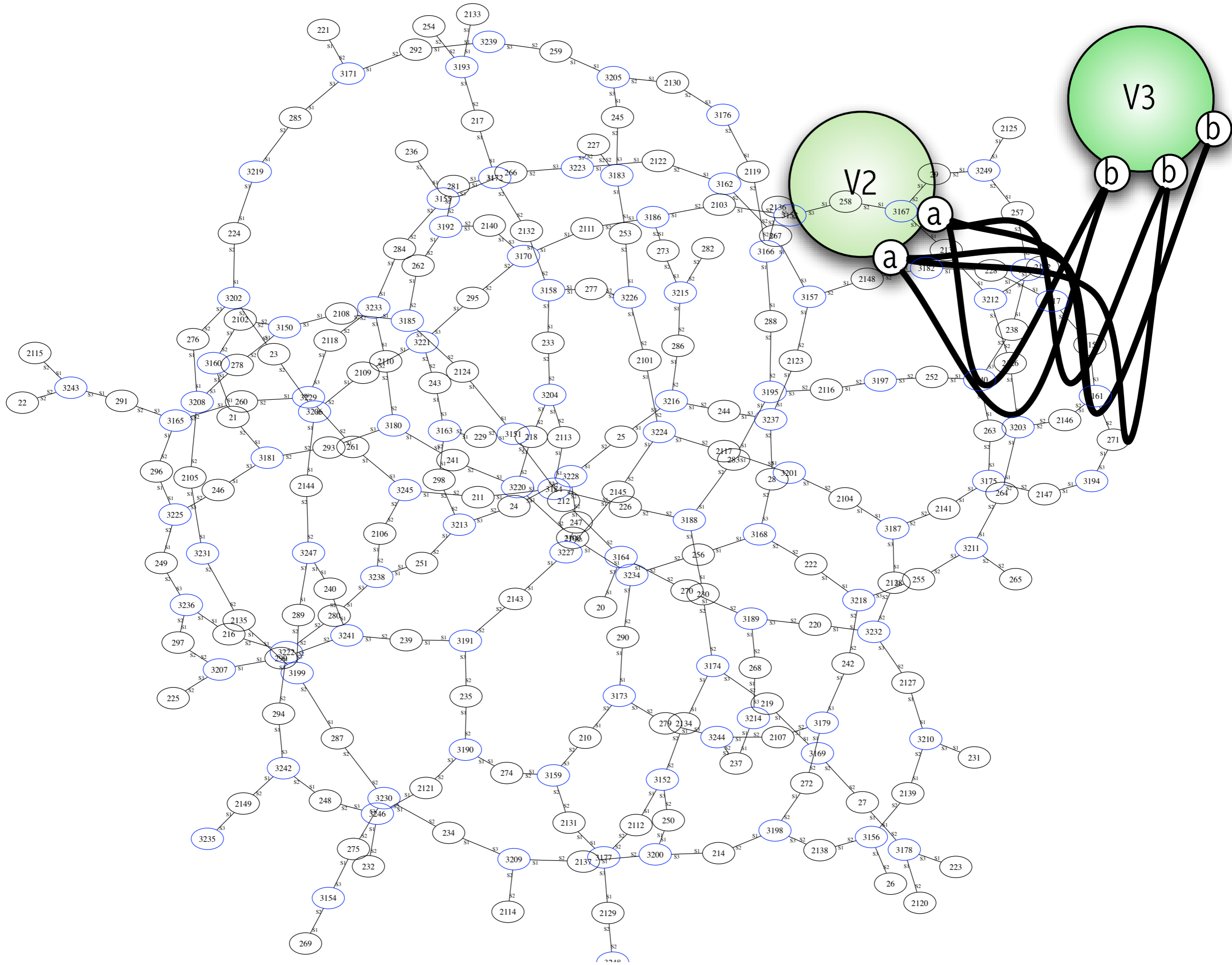


about 10%  
indirect repair

energy |

percolation control

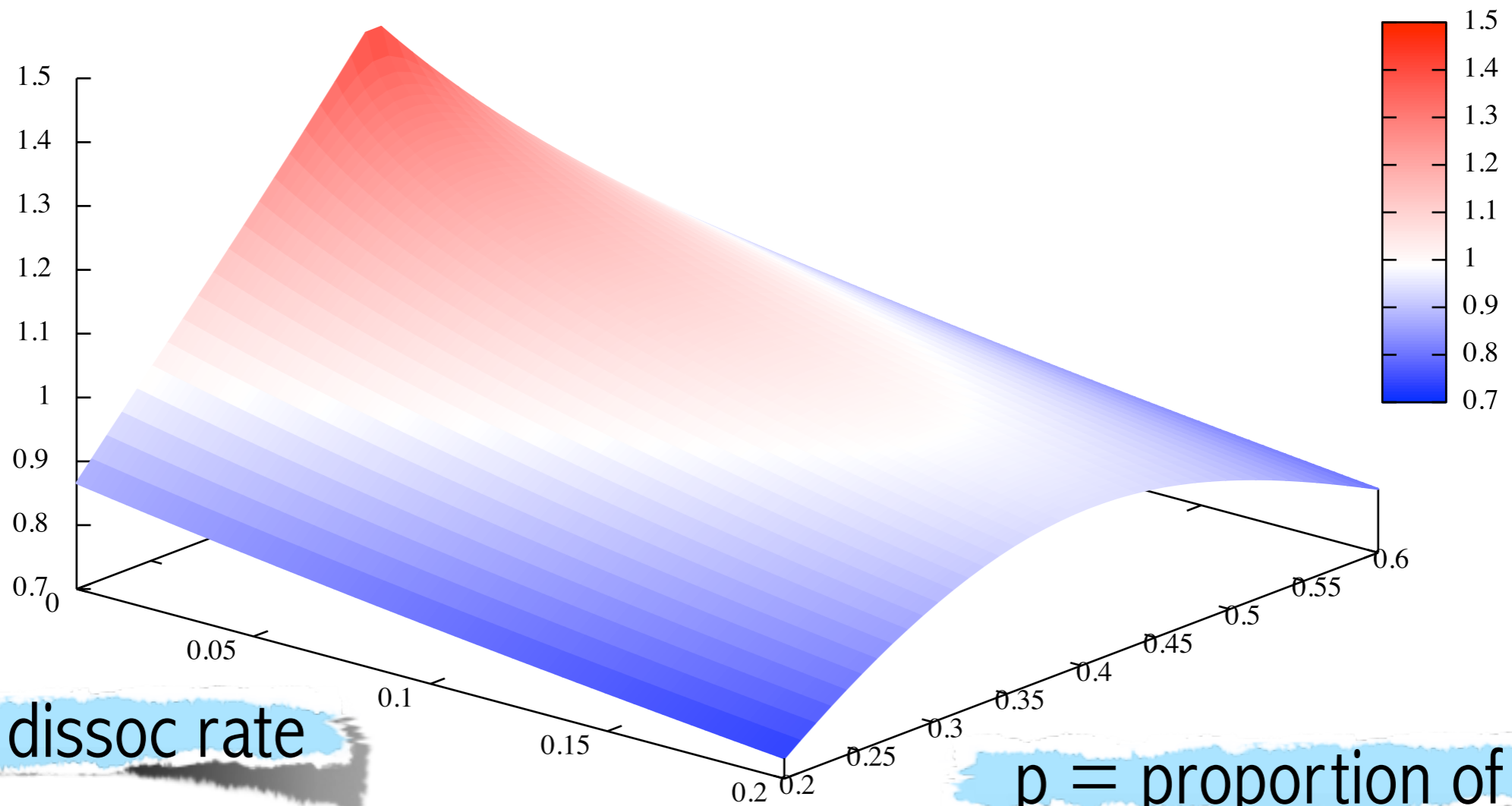






# Control?

$$\lambda(p, K) := \frac{2 + p + K - \sqrt{(2 + p + K)^2 - 24p(1 - p)}}{2\sqrt{3p(1 - p)}}$$



# equilibrium/cooperative case

$$\rho(x, y) = \frac{\Gamma_{i,j}}{(v_A - i)(v_B - j)}$$

$\Gamma$  has an equilibrium iff  $\Gamma = \Gamma_A \Gamma_B^t$  for some  $\Gamma_A \in \mathbb{R}_+^{v(A)}$ ,  $\Gamma_B \in \mathbb{R}_+^{v(B)}$

$$V(x) = \sum_{u \in x} \ln \frac{\prod_{0 \leq i < o(u)} \Gamma_{\tau(u)}(i)}{[o(u); v_{\tau(u)}]}$$

# deterministic approx.

$$\begin{aligned}
 A'_i = & -\mathbf{1}_{i < v_A} \sum_{0 \leq j < v_B} \gamma_{i,j}^+ (v_A - i)(v_B - j) A_i B_j \\
 & - \mathbf{1}_{i > 0} \sum_{0 < j \leq v_B} \gamma_{i-1,j-1}^- A_i : B_j \\
 & + \mathbf{1}_{i > 0} \sum_{0 < j \leq v_B} \gamma_{i-1,j-1}^+ (v_A - i + 1)(v_B - j + 1) A_{i-1} B_{j-1} \\
 & + \mathbf{1}_{i < v_A} \sum_{0 \leq j < v_B} \gamma_{i,j}^- A_{i+1} : B_{j+1}
 \end{aligned}$$

$$A'_i = \mathbf{1}_{\{i < v_A\}} \cdot (\gamma_i^- (i + 1) A_{i+1} - \gamma_i^+ (v_A - i) A_i n_b^f) \\ + \mathbf{1}_{\{i > 0\}} \cdot (-\gamma_{i-1}^- i A_i + \gamma_{i-1}^+ (v_A - i + 1) A_{i-1} n_b^f)$$

$$\gamma_{i,j}^- = \gamma_i^- \quad \gamma_{i,j}^+ = \gamma_i^+$$

references:  
 chaos 20(3) - 2010  
 PNAS 106 - 2009

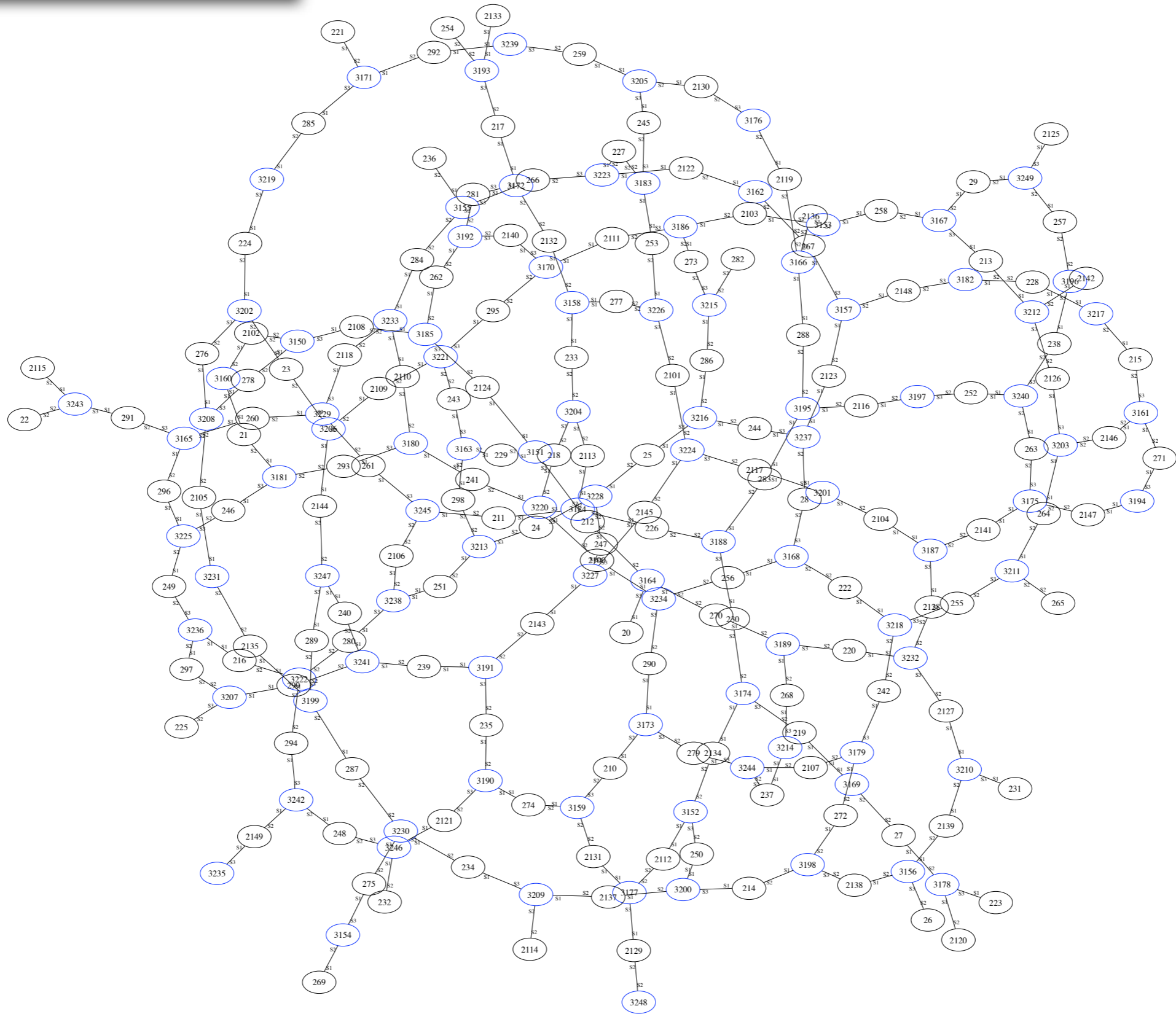
self-consistent / dimension-less

$$a_i = A_i/N, a = n_A/N, b = n_B/N, K_i := \frac{\prod_{0 \leq k < i} \Gamma_k}{\binom{v_A}{i} N^i}$$

$$K_i \cdot a_i = \left( a - \sum_{0 < k \leq v_A} a_k \right) \cdot \left( v_B b - \sum_{0 \leq k \leq v_A} k a_k \right)^i$$

language Kappa/KaSim

# KaSim - Snapshot



# agents & parameters

```
%agent: B(b1,b2)
```

```
%agent: A(a1,a2,a3)
```

```
%var: 'vol' 100
```

```
%var: 'k_on' 0.1/'vol'
```

```
%var: 'k_off' 2
```

```
%var: 'k_off_vee' 1/5 * 'k_off'
```

```
%var: 'k_off_tee' 1/50 * 'k_off'
```

```
%var: 'n_A' (1000 * 'vol')
```

```
%var: 'n_B' (1500 * 'vol')
```

```
%init: 'n_A' (A(a1,a2,a3))
```

```
%init: 'n_B' (B(b1,b2))
```



# rules ...

'b2-a1-11' B(b2), A(a1,a2!\_,a3!\_) -> B(b2!0), A(a1!0,a2!\_,a3!\_)@ 'k\_on'  
'b2-a1-10' B(b2), A(a1,a2!\_,a3 ) -> B(b2!0), A(a1!0,a2!\_,a3 )@ 'k\_on'  
'b2-a1-01' B(b2), A(a1,a2 ,a3!\_) -> B(b2!0), A(a1!0,a2 ,a3!\_)@ 'k\_on'  
'b2-a1-00' B(b2), A(a1,a2 ,a3 ) -> B(b2!0), A(a1!0,a2 ,a3 )@ 'k\_on'

'b2 a1-11' B(b2!0), A(a1!0,a2!\_,a3!\_) -> B(b2), A(a1,a2!\_,a3!\_)@ 'k\_off\_tee'  
'b2 a1-10' B(b2!0), A(a1!0,a2!\_,a3 ) -> B(b2), A(a1,a2!\_,a3 )@ 'k\_off\_vee'  
'b2 a1-01' B(b2!0), A(a1!0,a2 ,a3!\_) -> B(b2), A(a1,a2 ,a3!\_)@ 'k\_off\_vee'  
'b2 a1-00' B(b2!0), A(a1!0,a2 ,a3 ) -> B(b2), A(a1,a2 ,a3 )@ 'k\_off'

# observables ...

```
%var: 'A0' A(a1, a2, a3)
```

```
%var: 'a1' A(a1!_, a2, a3)
```

```
%var: 'a2' A(a1, a2!_, a3)
```

```
%var: 'a3' A(a1, a2, a3!_)
```

```
%var: 'A1' 'a1' + 'a2' + 'a3'
```

```
%var: 'a1a2' A(a1!_, a2!_, a3)
```

```
%var: 'a1a3' A(a1!_, a2, a3!_)
```

```
%var: 'a2a3' A(a1, a2!_, a3!_)
```

```
%var: 'A2' 'a1a2' + 'a1a3' + 'a2a3'
```

```
%var: 'A3' A(a1!_, a2!_, a3!_)
```

```
%plot: 'A0'
```

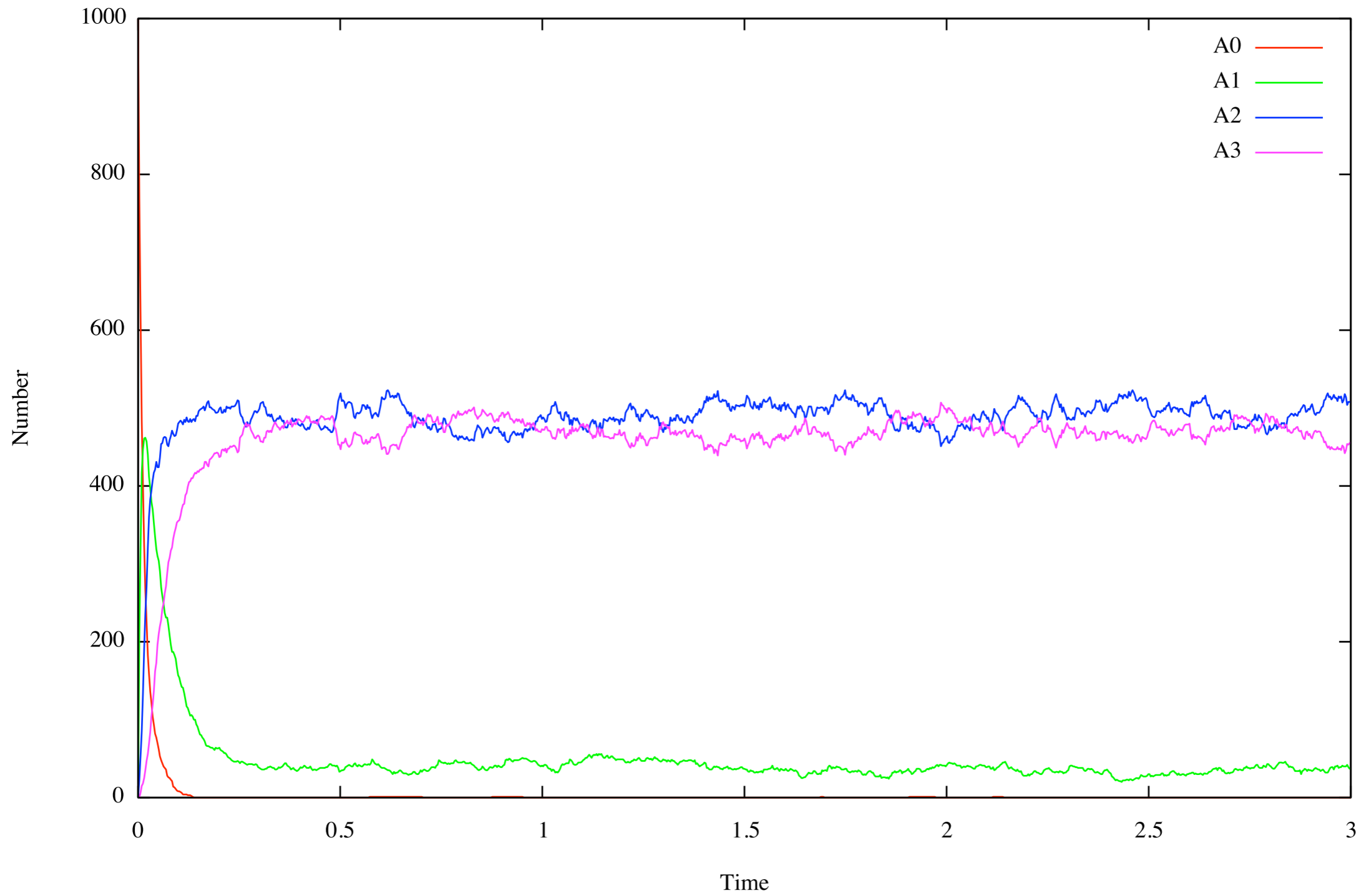
```
%plot: 'A1'
```

```
%plot: 'A2'
```

```
%plot: 'A3'
```

# KaSim - simulations

29/0/2011 percoop



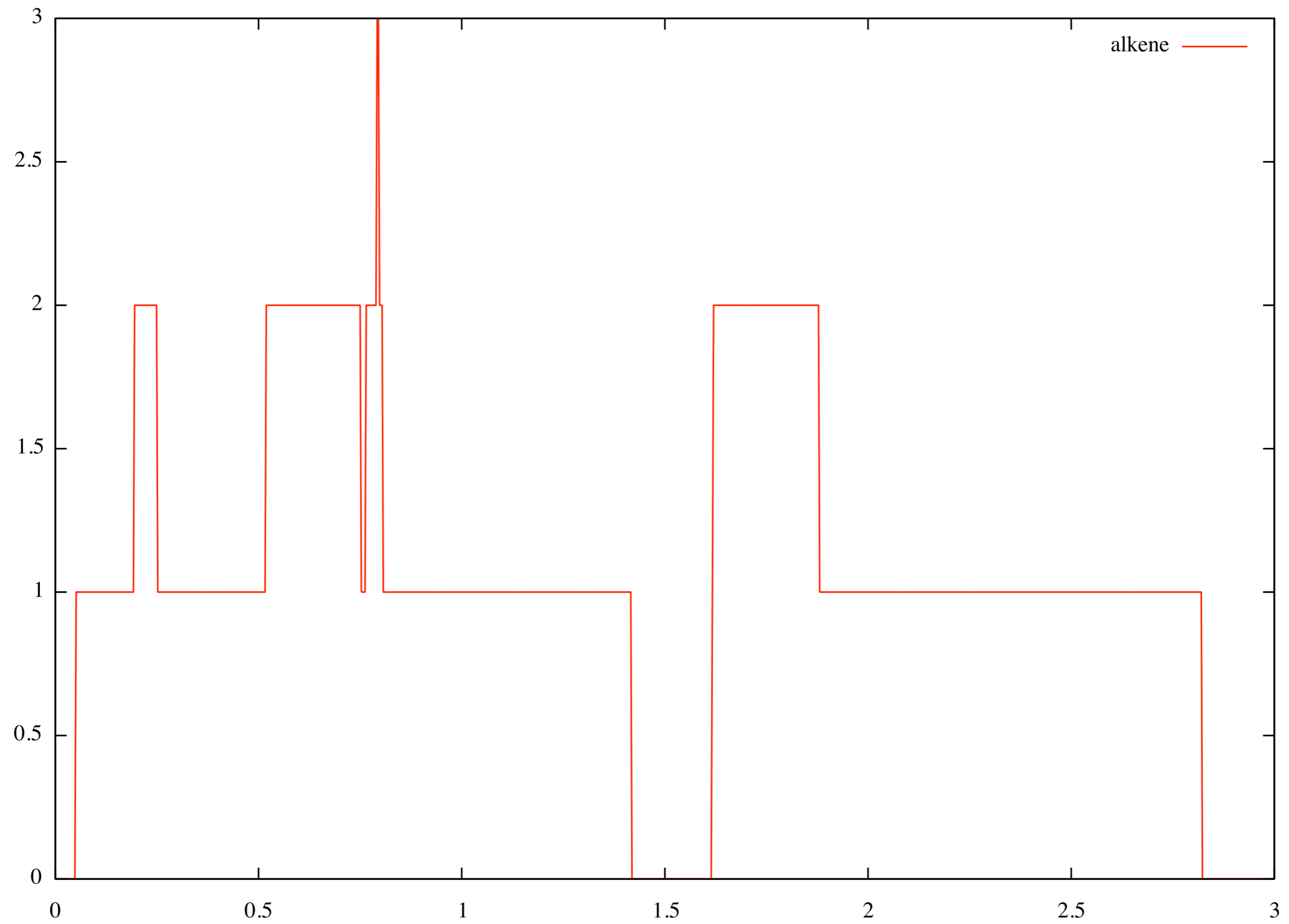
# alkenes

```
# double bonds/alkenes [2;3] = 6
%var: 'Ba1a2' B(b1!1,b2!2),A(a1!1,a2!2)
%var: 'Ba2a1' B(b1!1,b2!2),A(a1!2,a2!1)
%var: 'Ba1a3' B(b1!1,b2!2),A(a1!1,a3!2)
%var: 'Ba3a1' B(b1!1,b2!2),A(a1!2,a3!1)
%var: 'Ba2a3' B(b1!1,b2!2),A(a2!1,a3!2)
%var: 'Ba3a2' B(b1!1,b2!2),A(a2!2,a3!1)

%var: 'alkene' 'Ba1a2'+ 'Ba2a1' + 'Ba1a3' + 'Ba3a1' + 'Ba2a3' + 'Ba3a2'

%plot: 'alkene'
```

# alkenes



energy II

Stat PHYS of communicating processes

idea 1:  
distributed task = deadlock-escape + local heuristics

reversible communicating processes

$$\begin{aligned} \Theta, \Gamma \cdot (p, q) &\rightarrow^f \Theta, \Gamma_0 \cdot p, \Gamma_1 \cdot q \\ \Theta, \Gamma \cdot (ap + q), \Gamma' \cdot (a'p' + q') &\rightarrow^s \Theta, \Gamma(a, \Gamma', q) \cdot p, \Gamma'(a', \Gamma, q') \cdot p' \end{aligned}$$

idea II:

exhaustive search/probabilistic equilibrium  
= must succeed + almost surely finite time

probabilistic reversible communicating processes

$$\begin{aligned} \Theta, \Gamma \cdot (p, q) &\rightarrow^f \Theta, \Gamma_0 \cdot p, \Gamma_1 \cdot q \\ \Theta, \Gamma \cdot (ap + q), \Gamma' \cdot (a'p' + q') &\rightarrow^s \Theta, \Gamma(a, \Gamma', q) \cdot p, \Gamma'(a', \Gamma, q') \cdot p' \end{aligned}$$

$$\rho(x, y) = \frac{k_a^*}{k_a} \cdot \frac{1}{\mu(ap)} \cdot \frac{1}{\mu(a'p')}$$



Probabilistic equilibrium (CTMC) =  
detailed balance/thermo consistency + convergence

$$p(x) = \frac{e^{-V(x)}}{\sum_y e^{-V(y)}}$$

aka grand canonical ensemble

# EXPLOSIVE GROWTHS

	event horizon	nb of complete matchings
$q \rightarrow^f 0 \cdot p(a), 1 \cdot p(\bar{a})$	1, 1	1
$\rightarrow^{fs} 0a0 \cdot p(a), 0a1 \cdot p(a), 1\bar{a}0 \cdot p(\bar{a}), 1\bar{a}1 \cdot p(\bar{a})$	2, 2	2
$= 0a0 \cdot a(p(a), p(a)), 0a1 \cdot a(p(a), p(a)),$ $1\bar{a}0 \cdot \bar{a}(p(\bar{a}), p(\bar{a})), 1\bar{a}1 \cdot \bar{a}(p(\bar{a}), p(\bar{a}))$		
$\rightarrow^{fs} 0a0a0 \cdot p(a), 0a0a1 \cdot p(a), 0a1a0 \cdot p(a), 0a1a1 \cdot p(a),$ $1\bar{a}0\bar{a}0 \cdot p(\bar{a}), 1\bar{a}0\bar{a}1 \cdot p(\bar{a}), 1\bar{a}1\bar{a}0 \cdot p(\bar{a}), 1\bar{a}1\bar{a}1 \cdot p(\bar{a})$	4, 4	4!
...		
$\rightarrow^{fs} \prod_{w \in 2^k} 0w(a) \cdot p(a), \prod_{w \in 2^k} 1w(\bar{a}) \cdot p(\bar{a})$	$2^k, 2^k$	$2^k!$

is there a "concurrent" potential that controls the above?

a "concurrent" potential:

$$V_2(p) = \sum_{\theta \in p, \mathbf{a} \in \mathcal{A}^{\leq \alpha}} \langle \xi_{\mathbf{a}}, \text{nb of } \mathbf{a} \text{ in the stack of } \theta \rangle$$

## fork/energy balance

$$\Theta, \Gamma \cdot (p, q) \xrightarrow{f} \Theta, \Gamma_0 \cdot p, \Gamma_1 \cdot q$$
$$\Delta V_1 = V_1(\Gamma) + \eta = \ln(k^*/k)$$

$$k = \exp(-\eta - V_1(\Gamma))$$

## SYNCH

$$\Theta, \Gamma \cdot (ap + q), \Gamma' \cdot (a'p' + q') \xrightarrow{s} \Theta, \Gamma(a, \Gamma', q) \cdot p, \Gamma'(a', \Gamma, q') \cdot p'$$

$$\Delta V_1 = \epsilon_a$$

$$k_a = \exp(-\epsilon_a)$$

# Sufficient condition for equilibrium

**Proposition 1** *Let  $p_0$  be a  $\alpha$ -way synchronising process with max thread creation  $\leq 1 + \delta$  with  $\delta > 0$ , and suppose  $\epsilon_m := \min \epsilon_a > \delta \alpha^2 \ln(4(\delta + 1))$ , then:*

$$Z(p_0) := \sum_{q \in \Omega(p_0)} e^{-V(q)} < +\infty$$

where  $\Omega(p_0)$  is the set of processes reachable from  $\emptyset \cdot p_0$ .

**Corollary 1** *Consider a reversible process  $\emptyset \cdot p_0$  equipped with rate constants  $k_a^\pm, k_f^\pm$  compatible with the  $V_2$  potential; if  $\epsilon_m > \delta \alpha^2 \ln(4(\delta + 1))$ , then  $p_0$  has an equilibrium on  $\Omega(p_0)$  defined as  $\pi(q) = e^{-V(q)} / Z(p_0)$ .*

idea III:

energy-based programming/distributed Metropolis  
Code = Statics/Potential + transition/moves + Compatible  
kinetics

$$\operatorname{argmax} \xi \cdot \sum_{q \in \partial X} p^*(\xi, q) = \int \mathbf{1}_{\partial X} dp^*$$

machine learning

modeling complex systems in the life sciences

clean and powerful mathematical/computational tools

combinatorial dynamics

causality analysis

new means of encoding info

self-organised energy-based dynamics

... stochastic machine learning



[kappalanguage.org](http://kappalanguage.org) - tools

[rulebase.org](http://rulebase.org) on-line playable models



cosimo Laneve (Bologna)

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