

# Artificial Biochemistry

Combining Stochastic Collectives

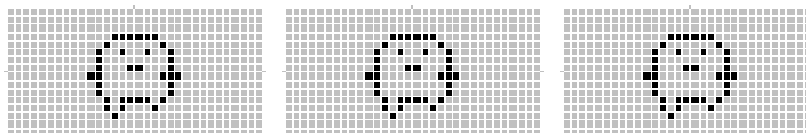
Luca Cardelli

Microsoft Research

Newton Institute, Logic and Algorithms Program  
2006-05-09

[www.luca.demon.co.uk](http://www.luca.demon.co.uk)

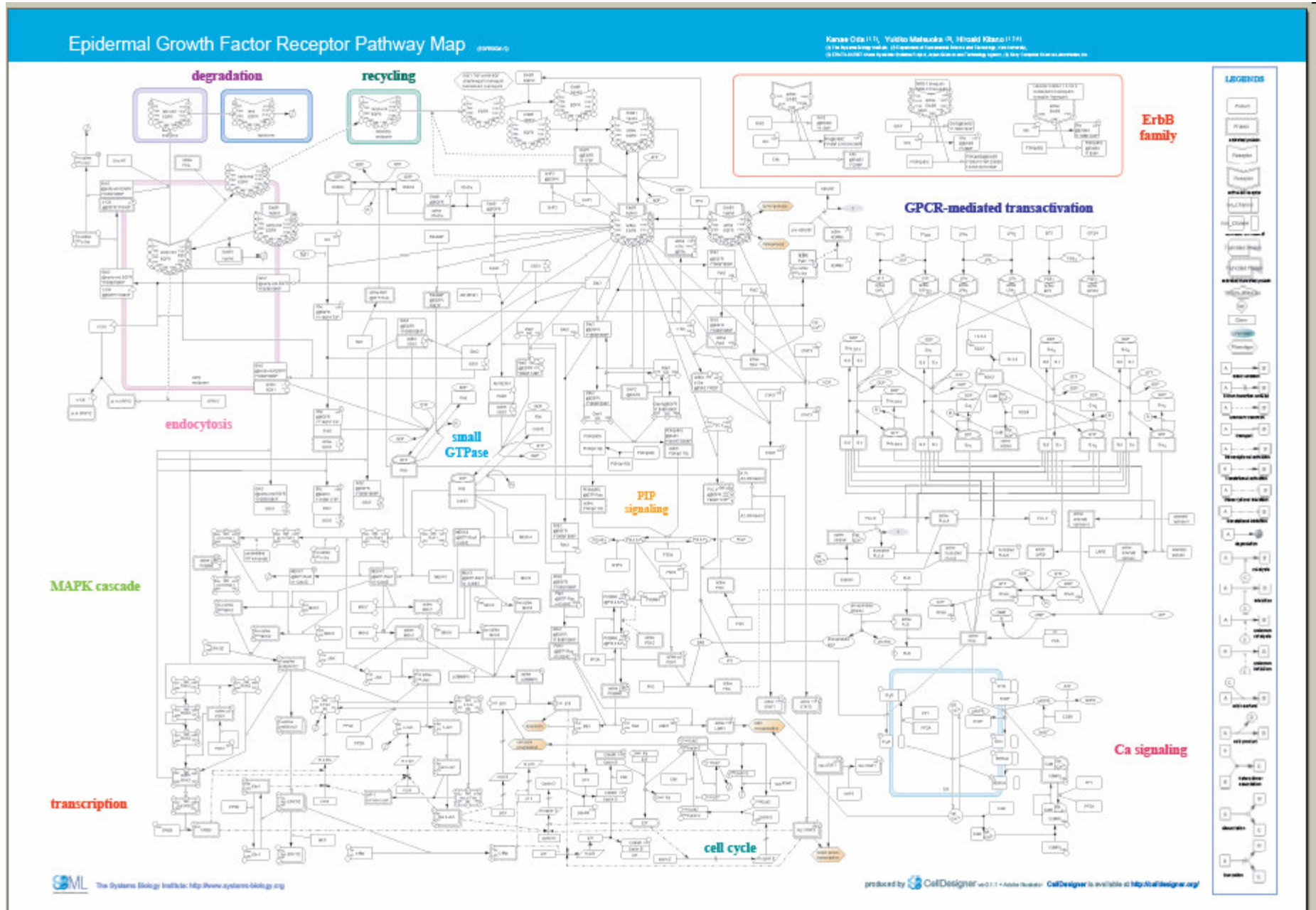
# Stochastic Collectives



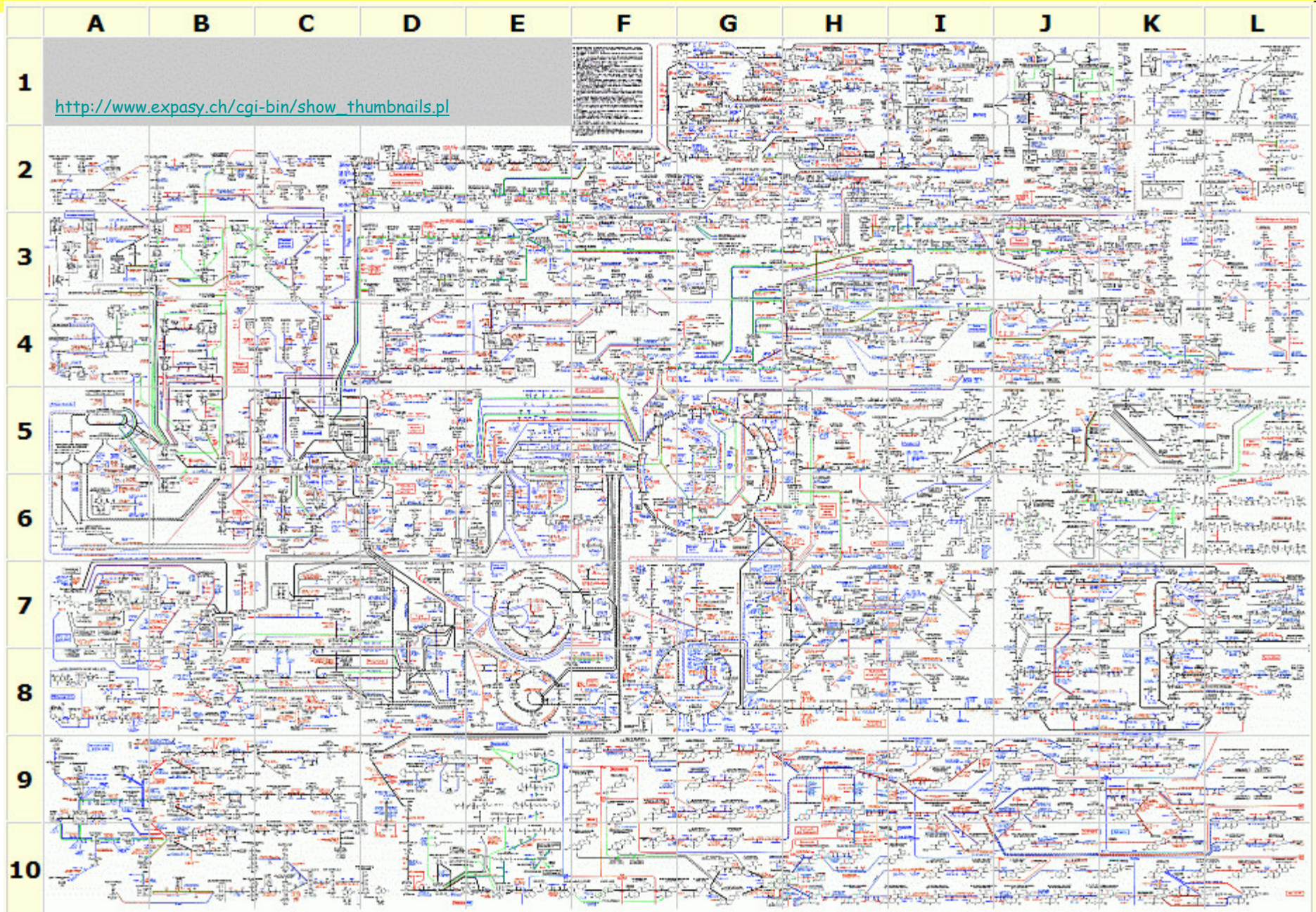
# Stochastic Collectives

- "Collective":
  - A large set of interacting finite state automata:
    - Not quite language automata ("large set")
    - Not quite cellular automata ("interacting" but not on a grid)
    - Not quite process algebra ("finite state" and "collective")
    - Cf. "multi-agent systems" and "swarm intelligence"
- "Stochastic":
  - Interactions have *rates*
    - Not quite discrete (hundreds or thousands of components)
    - Not quite continuous (non-trivial stochastic effects)
    - Not quite hybrid (no "switching" between regimes)
- Very much like biochemistry
  - Which is a large set of stochastically interacting molecules/proteins
  - Are proteins **finite state** and subject to automata-like **transitions**?
    - Let's say they are, at least because:
    - Much of the knowledge being accumulated in Systems Biology is described as state transition diagrams [Kitano].

# State Transitions



# Even More State Transitions



# Reverse Engineering Nature

- That's what Systems Biology is up against
  - Exemplified by a technological analogy:
- Tamagotchi: a technological organism
  - Has **inputs** (buttons) and **outputs** (screen/sound)
  - It has **state**: happy or needy (or hungry, sick, dead...)
  - Has to be petted at a certain **rate** (or gets needy)
  - Each one has a **slightly different** behavior
- Reverse Engineering Tamagotchi
  - Running experiments that elucidate their behavior
  - Building models that explain the experiments
- Applications
  - Engineering: Can we build our own Tamagotchi?
  - Maintenance: **Can we fix a broken Tamagotchi?**

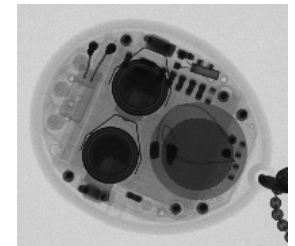


How often do I have to exercise my Tamagotchi? Every Tamagotchi is different. However we do recommend exercising at least three times a day



# Understanding T. Nipponensis

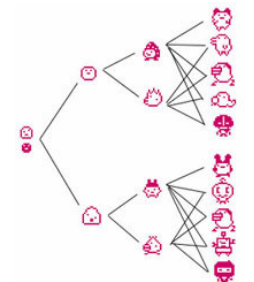
- Tamagotchi Nipponensis: a stochastic interactive automaton
  - 40 million sold worldwide; discontinued in 1998
  - Still found "in the wild" in Akihabara
  - New version in 2004: they communicate!
- Traditional scientific investigations fail
  - Design-driven understanding fails
    - We cannot read the manual (Japanese)
    - What does a Tamagotchi "compute"? What is its "purpose"?
    - Why does it have 3 buttons?
  - Mechanistic understanding fails
    - Few moving parts. Removing components mostly ineffective or "lethal"
    - The "tamagotchi folding problem" (sequence of manufacturing steps) is too hard and gives little insight on function
  - Behavioral understanding fails
    - Subjecting to extreme conditions reveals little and may void warranty
    - Does not answer consistently to individual stimuli, nor to sequences of stimuli
    - There are stochastic variations between individuals
  - Ecological understanding fails
    - Difficult to observe in its native environment (kids' hands)
    - Mass produced in little-understood automated factories
    - It evolved by competing with other products in the baffling Japanese market
  - Mathematical understanding fails
    - What differential equations does it obey? (Uh?)



Tamagotchi X-ray



Tamagotchi Surgery  
<http://necrobones.com/tamasurg/>



# A New Approach

- “Systems Technology” of T. Nipponensis
  - High-throughput experiments (**get all the information you possibly can**)
    - Decode the entire software and hardware
    - Take sequences of tamagotchi screen dumps under different conditions
    - Put 300 in a basket and shake them; make statistics of final state
  - Modeling (**organize all the information you got**)
    - Ignore the “folding” (manufacturing) problem
    - Ignore materials (it’s just something with buttons, display, and a *program*.)
    - Abstract until you find a conceptual model (ah-ha: it’s a stochastic automaton).
- **Do we understand what stochastic automata collectives can do?**

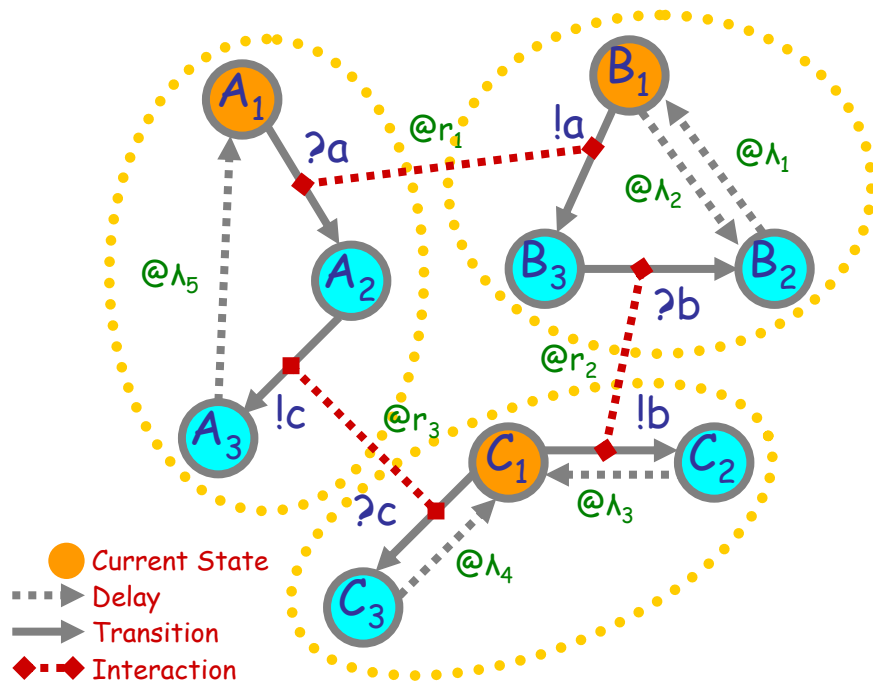


Communicating Tamagotchi



# Automata Collectives

# Interacting Automata

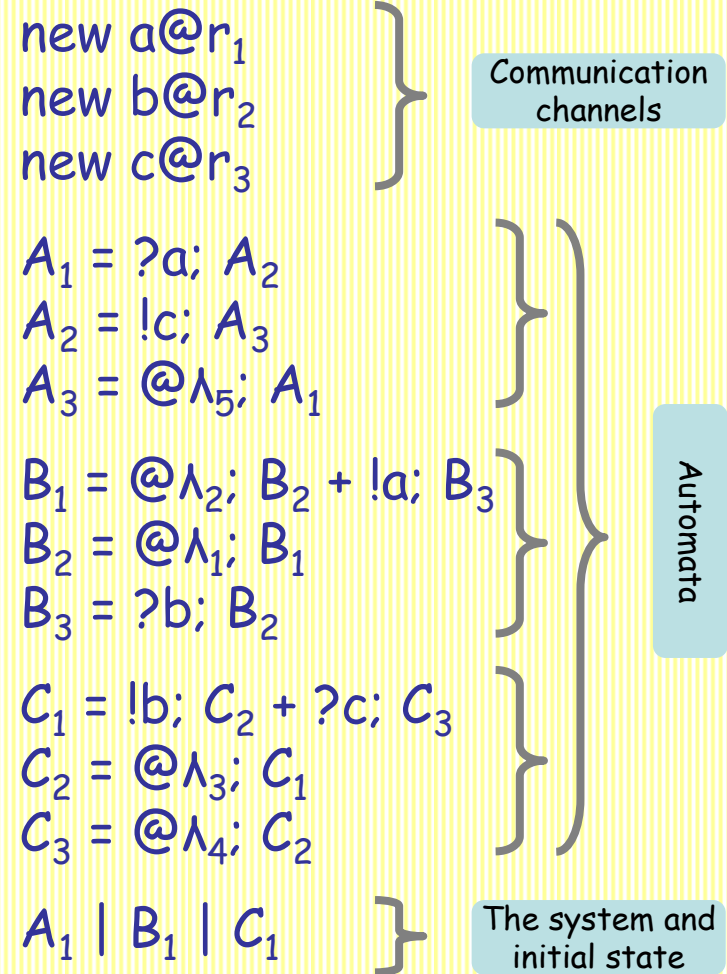


**Communicating automata:** a graphical FSA-like notation for "finite state restriction-free  $\pi$ -calculus processes". **Interacting automata** do not even exchange values on communication.

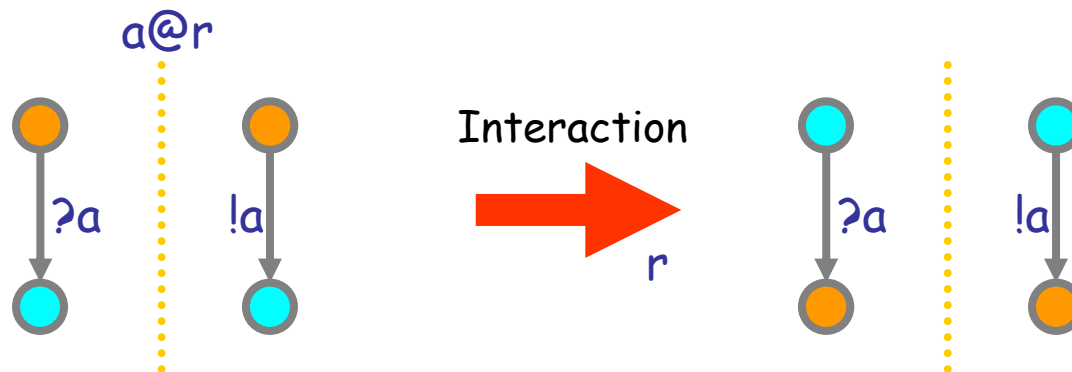
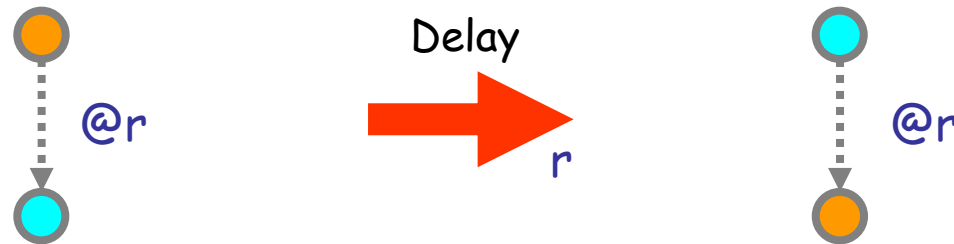
The stochastic version has *rates* on communications, and delays.

"Finite state" means: no composition or restriction inside recursion.

Analyzable by standard Markovian techniques, by first computing the "product automaton" to obtain the underlying finite Markov transition system. [Buchholz]

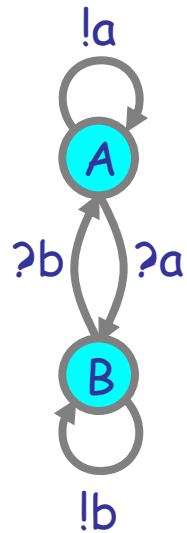


# Interacting Automata Transition Rules



- Current State
- Current State
- ⋯→ Delay
- Transition

# Groupies and Celebrities



## Celebrity

(does not want to be like somebody else)

```
directive sample 0.1 1000
```

```
directive plot A(); B()
```

```
new a@1.0:chan()
```

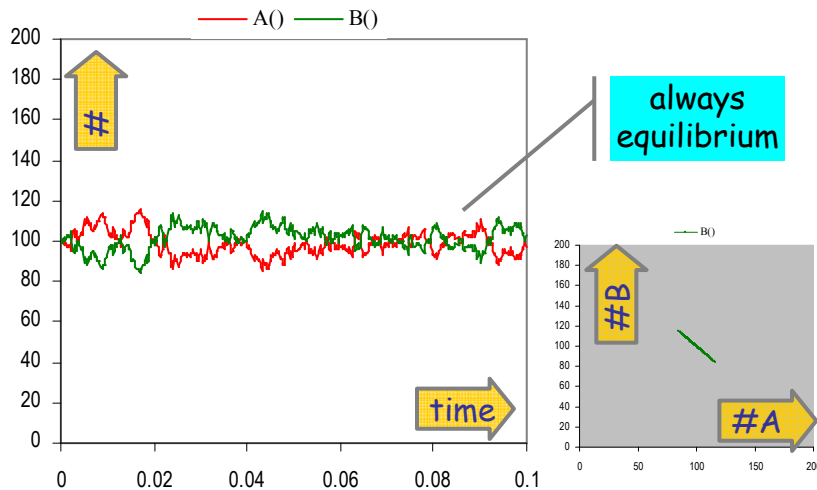
```
new b@1.0:chan()
```

```
let A() = do !a; A() or ?a; B()
```

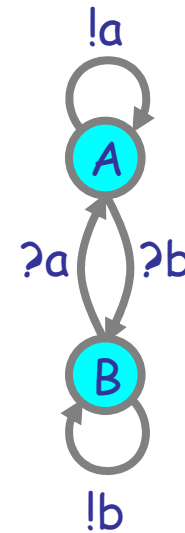
```
and B() = do !b; B() or ?b; A()
```

```
run 100 of (A() | B())
```

A stochastic collective of celebrities:



Stable because as soon as a A finds itself in the majority, it is more likely to find somebody in the same state, and hence change, so the majority is weakened.



## Groupie

(wants to be like somebody different)

```
directive sample 5.0 1000
```

```
directive plot A(); B()
```

```
new a@1.0:chan()
```

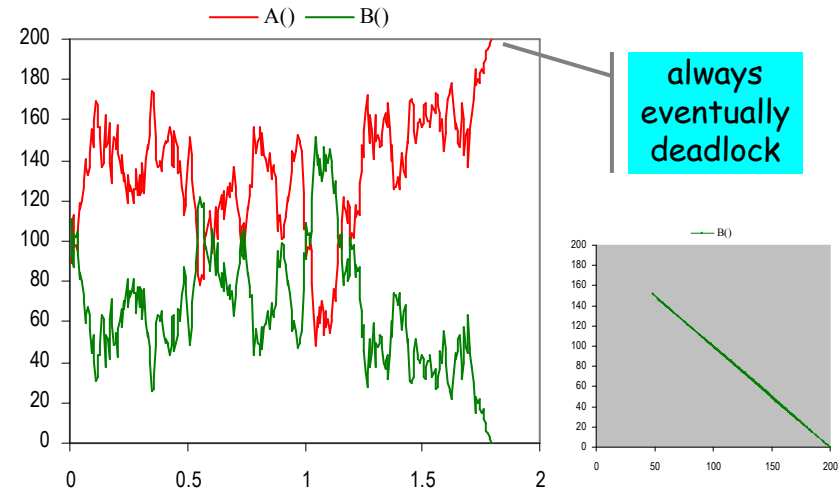
```
new b@1.0:chan()
```

```
let A() = do !a; A() or ?b; B()
```

```
and B() = do !b; B() or ?a; A()
```

```
run 100 of (A() | B())
```

A stochastic collective of groupies:



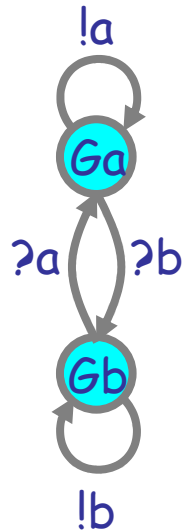
Unstable because within an A majority, an A has difficulty finding a B to emulate, but the few B's have plenty of A's to emulate, so the majority may switch to B. Leads to deadlock when everybody is in the same state and there is nobody different to emulate.

# Both Together

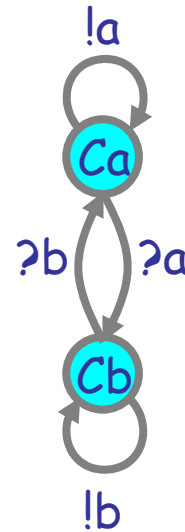
A tiny bit of "noise" can make a huge difference

A way to break the deadlocks: Groupies with just a few Celebrities

Many Groupies



A few Celebrities



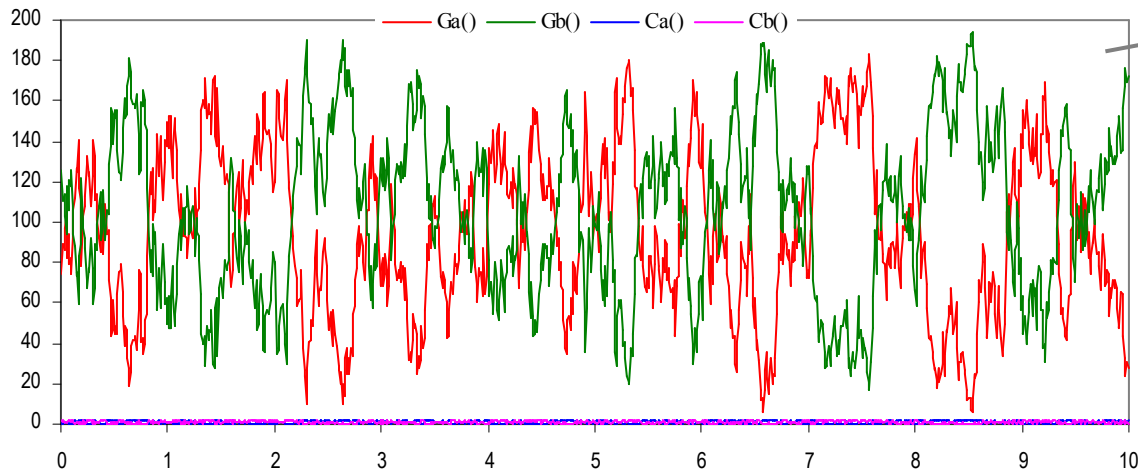
```
directive sample 10.0 1000
directive plot Ga(); Gb(); Ca(); Cb()

new a@1.0:chan()
new b@1.0:chan()

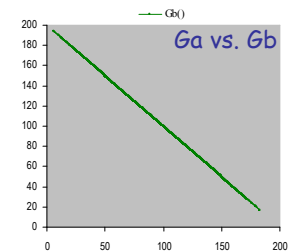
let Ca() = do !a; Ca() or ?a; Cb()
and Cb() = do !b; Cb() or ?b; Ca()

let Ga() = do !a; Ga() or ?b; Gb()
and Gb() = do !b; Gb() or ?a; Ga()

run 1 of (Ca() | Cb())
run 100 of (Ga() | Gb())
```

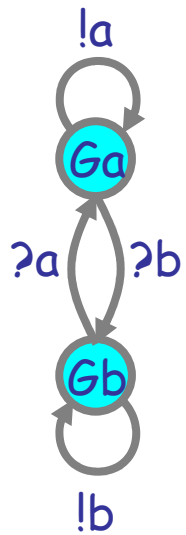


never deadlock

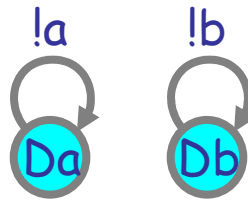


# Doped Groupies

A similar way to break the deadlocks: destabilize the groupies by a small perturbation.



Groupie



Doping<sup>(1)</sup>

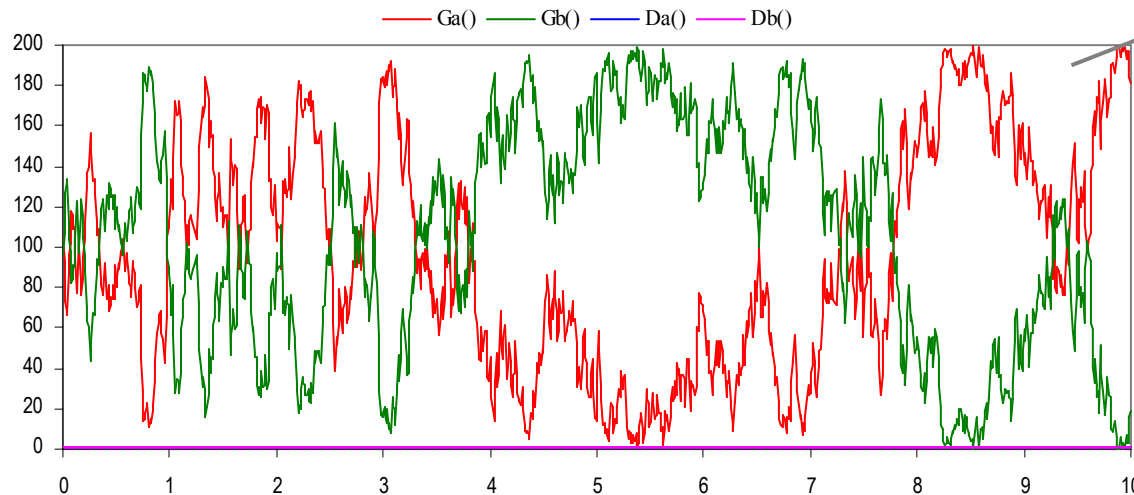
```
directive sample 10.0 1000
directive plot Ga(); Gb(); Da(); Db()
```

```
new a@1.0:chan()
new b@1.0:chan()
```

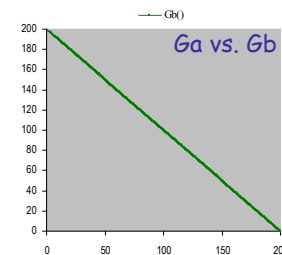
```
let Ga() = do !a; Ga() or ?b; Gb()
and Gb() = do !b; Gb() or ?a; Ga()
```

```
let Da() = !a; Da()
and Db() = !b; Db()
```

```
run 1 of (Da() | Db())
run 100 of (Ga() | Gb())
```



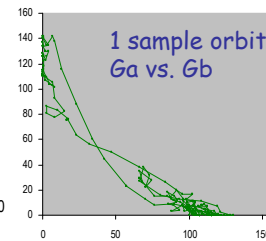
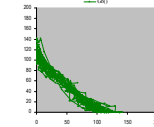
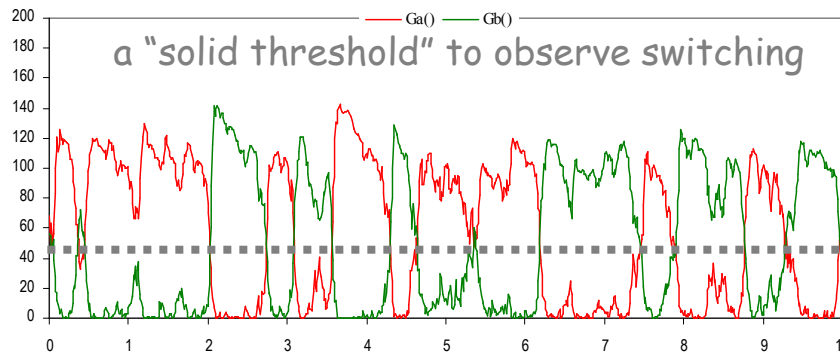
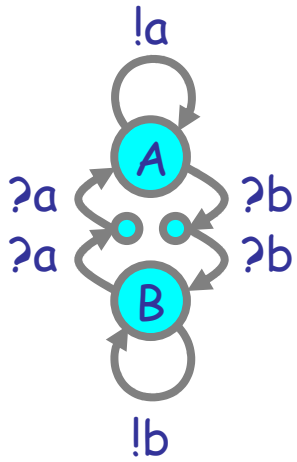
never  
deadlock



<sup>(1)</sup>A technical term in microelectronics

# Hysteric Groupies

We can get more regular behavior from groupies if they "need more convincing", or "hysteresis" (history-dependence), to switch states.



```
directive sample 10.0 1000
directive plot Ga(); Gb()

new a@1.0:chan()
new b@1.0:chan()

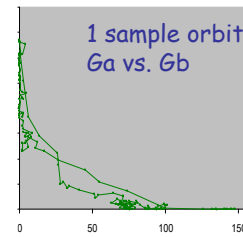
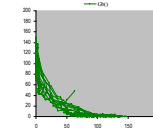
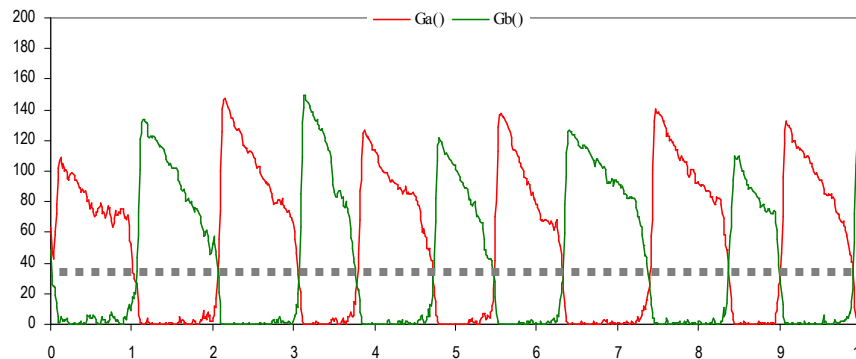
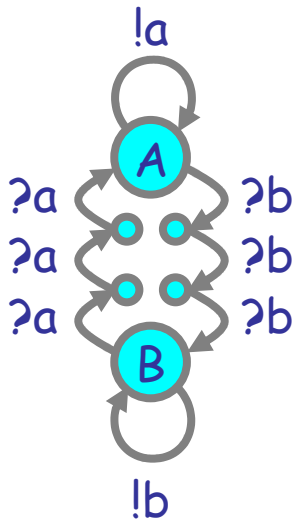
let Ga() = do !a; Ga() or ?b; ?b; Gb()
and Gb() = do !b; Gb() or ?a; ?a; Ga()

let Da() = !a; Da()
and Db() = !b; Db()

run 100 of (Ga() | Gb())
run 1 of (Da() | Db())
```



**N.B.:** It will not oscillate without doping (noise)



```
directive sample 10.0 1000
directive plot Ga(); Gb()

new a@1.0:chan()
new b@1.0:chan()

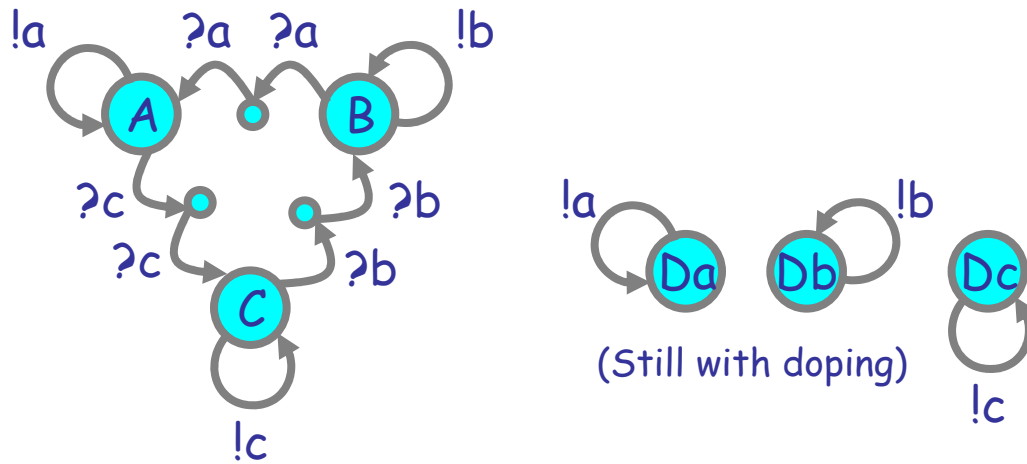
let Ga() = do !a; Ga() or ?b; ?b; ?b; Gb()
and Gb() = do !b; Gb() or ?a; ?a; ?a; Ga()

let Da() = !a; Da()
and Db() = !b; Db()

run 100 of (Ga() | Gb())
run 1 of (Da() | Db())
```



# Hysteric 3-Way Groupies



```
directive sample 3.0 1000
directive plot A(); B(); C()
```

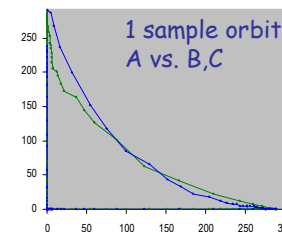
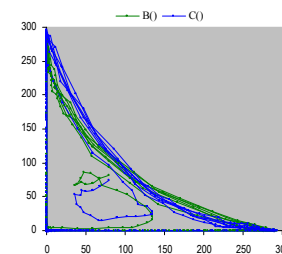
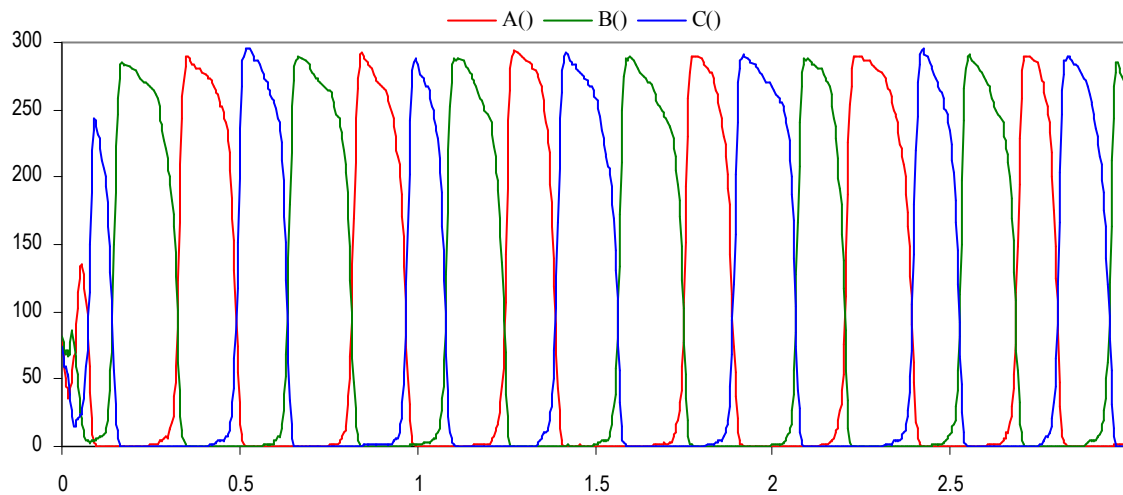
```
new a@1.0:chan()
new b@1.0:chan()
new c@1.0:chan()
```

```
let A() = do !a; A() or ?c; ?c; C()
and B() = do !b; B() or ?a; ?a; A()
and C() = do !c; C() or ?b; ?b; B()
```

```
let Da() = !a; Da()
and Db() = !b; Db()
and Dc() = !c; Dc()
```

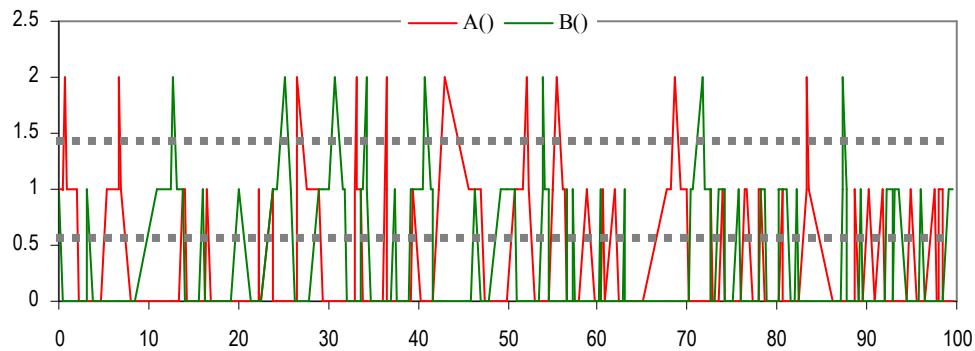
```
run 100 of (A() | B() | C())
run 1 of (Da() | Db() | Dc())
```

**N.B.:** It will not oscillate without doping (noise)



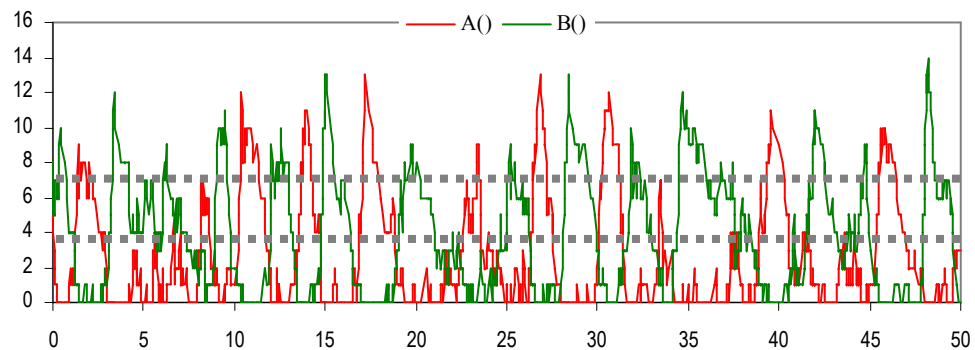


# Oscillation as Emergence



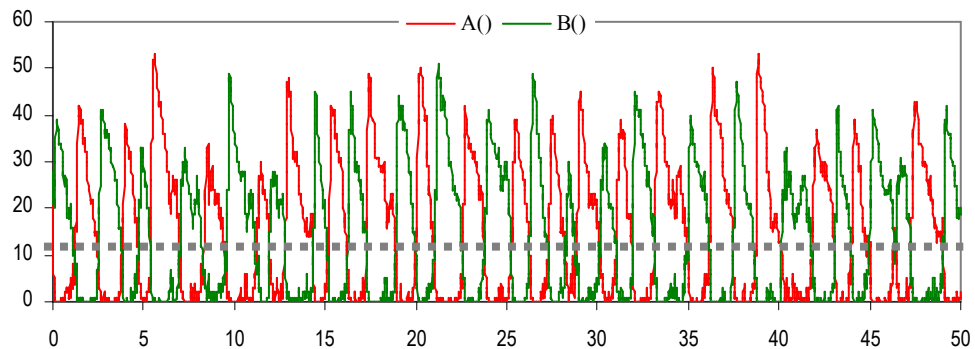
Just 2 of the hysteric groupies  
do not oscillate regularly at all!

Without changing the  
components, interesting  
properties emerge with a  
critical size of the population.



Nor 16...

Dotted lines indicate cross  
sections where one may look  
for evidence of alternation.



Pretty good with 64...

```
new a@1.0:chan()
new b@1.0:chan()
```

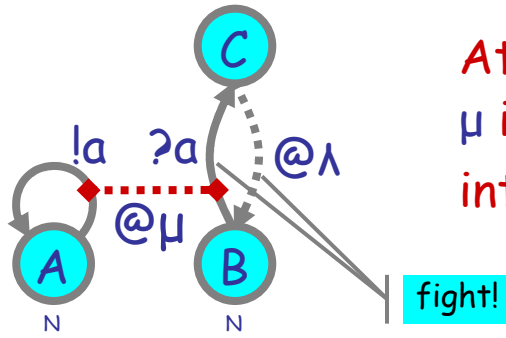
```
let A() = do !a; A() or ?b; ?b; B()
and B() = do !b; B() or ?a; ?a; A()
```

```
let As() = !a; As()
and Bs() = !b; Bs()
```

```
run 64 of (A() | B())
run 1 of (As() | Bs())
```

# Collective Boolean Logic

# The Strength of Populations



At size  $2N$ , on a shared channel,  
 $\mu$  is  $N$  times stronger than  $\lambda$ :  
 interaction easily wins over delay.

```
directive sample 0.01 1000
directive plot B()

val lam = 1000.0
val mu = 1.0

new a@mu:chan
let A() = !a; A()
and B() = ?a; C()
and C() = delay@lam; B()

run 1000 of (A() | B())
```

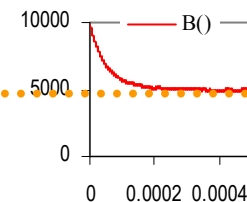
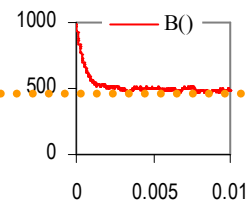
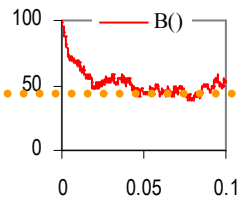
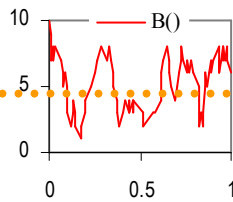
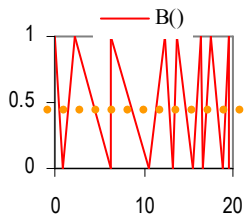
$N=1$   
 $\lambda=1$   
 $\mu=1$

$N=10$   
 $\lambda=10$   
 $\mu=1$

$N=100$   
 $\lambda=100$   
 $\mu=1$

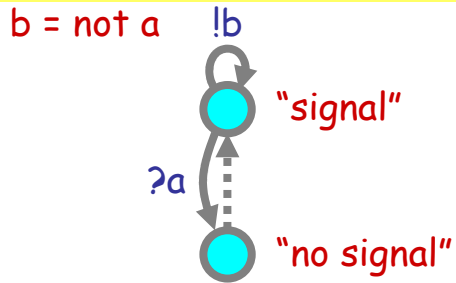
$N=1000$   
 $\lambda=1000$   
 $\mu=1$

$N=10000$   
 $\lambda=10000$   
 $\mu=1$

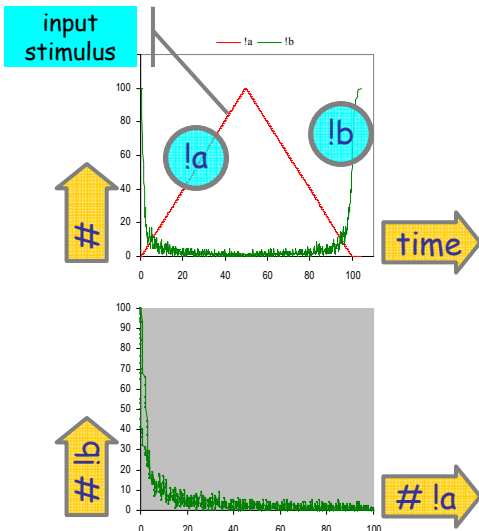


Equilibrium

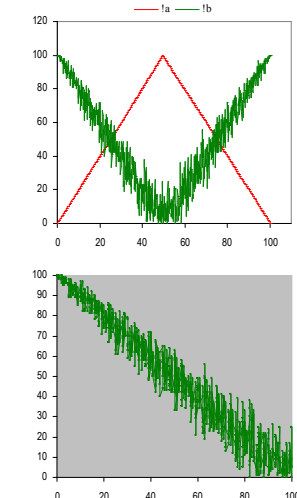
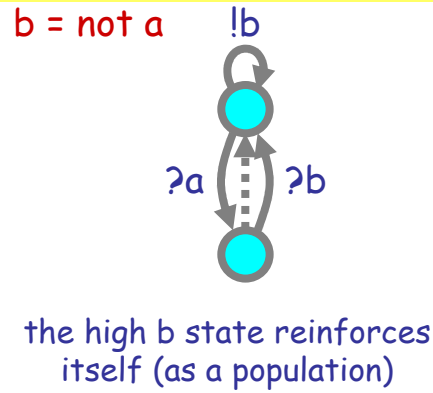
# Boolean Inverter Collectives



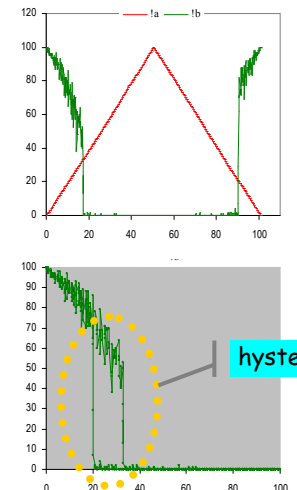
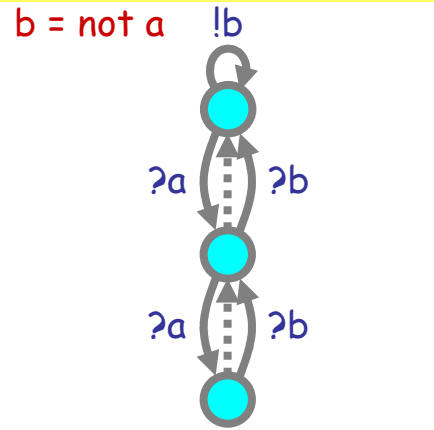
in presence of a, b goes low  
in absence of a, b goes high



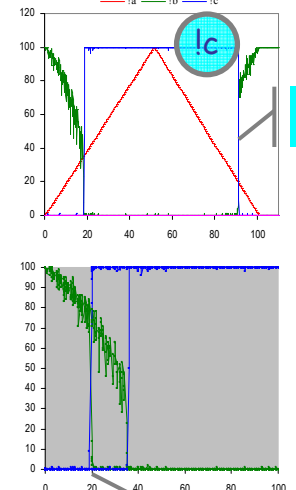
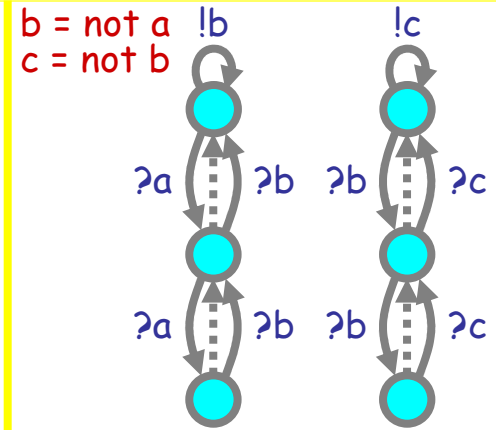
```
directive sample 110.0 1000
directive plot la, lb
new a@1.0 chan new b@1.0 chan
let Inv_h(a:chan, b:chan) =
  do la: Inv_h(a,b)
  or lb: Inv_h(a,b)
  and Inv_h(a:chan, b:chan) =
  delay@1.0: Inv_h(a,b)
run 100 of Inv_h(a,b)
let clock(t:float, tickchan) = (* sends a tick every t time *)
  (val t1 = 1/100.0 val d = 1.0/H (* by 100-step erlang timers *)
  let step(n:int) = if n=0 then tick: clock(t, tick) else delay@d: step(n-1)
  run step(100))
let SI(a:chan, tickchan) = do la: SI(a, tick) or Ptick ()
let SN(n:int, t:float, a:chan, tickchan, tickchan) =
  if n=0 then clock(t, tick) else Ptick (SI(a, tick) | SN(n-1, t, a, tick, tick))
let raisingfalling(a:chan, n:int, t:float) =
  (new tickchan new tickchan
  run (clock(t, tick) | SN(n, t, a, tick, tick)))
run raisingfalling(a, 100, 0.5)
```



```
directive sample 110.0 1000
directive plot la, lb
new a@1.0 chan new b@1.0 chan
let Inv_h(a:chan, b:chan) =
  do lb: Inv_h(a,b)
  or la: Inv_h(a,b)
  and Inv_h(a:chan, b:chan) =
  do lb: Inv_h(a,b)
  or la: Inv_h(a,b)
  delay@1.0: Inv_h(a,b)
run 100 of Inv_h(a,b)
let clock(t:float, tickchan) = (* sends a tick every t time *)
  (val t1 = 1/100.0 val d = 1.0/H (* by 100-step erlang timers *)
  let step(n:int) = if n=0 then tick: clock(t, tick) else delay@d: step(n-1)
  run step(100))
let SI(a:chan, tickchan) = do la: SI(a, tick) or Ptick ()
let SN(n:int, t:float, a:chan, tickchan, tickchan) =
  if n=0 then clock(t, tick) else Ptick (SI(a, tick) | SN(n-1, t, a, tick, tick))
let raisingfalling(a:chan, n:int, t:float) =
  (new tickchan new tickchan
  run (clock(t, tick) | SN(n, t, a, tick, tick)))
run raisingfalling(a, 100, 0.5)
```



```
directive sample 110.0 1000
directive plot la, lb
new a@1.0 chan new b@1.0 chan
let Inv2_h(a:chan, b:chan) =
  do lb: Inv2_h(a,b) or la: Inv2_m(a,b)
  and Inv2_m(a:chan, b:chan) =
  do lb: Inv2_h(a,b) or delay@1.0: Inv2_h(a,b)
  or la: Inv2_m(a,b)
  and Inv2_l(a:chan, b:chan) =
  do lb: Inv2_m(a,b) or delay@1.0: Inv2_m(a,b)
run 100 of Inv2_h(a,b)
let clock(t:float, tickchan) = (* sends a tick every t time *)
  (val t1 = 1/100.0 val d = 1.0/H (* by 100-step erlang timers *)
  let step(n:int) = if n=0 then tick: clock(t, tick) else delay@d: step(n-1)
  run step(100))
let SI(a:chan, tickchan) = do la: SI(a, tick) or Ptick ()
let SN(n:int, t:float, a:chan, tickchan, tickchan) =
  if n=0 then clock(t, tick) else Ptick (SI(a, tick) | SN(n-1, t, a, tick, tick))
let raisingfalling(a:chan, n:int, t:float) =
  (new tickchan new tickchan
  run (clock(t, tick) | SN(n, t, a, tick, tick)))
run raisingfalling(a, 100, 0.5)
```

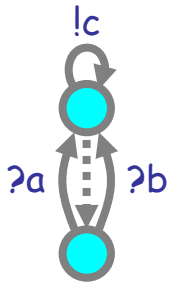


```
directive sample 110.0 1000
directive plot la, lb, lc, ld
new a@1.0 chan new b@1.0 chan new c@1.0 chan
let Inv2_h(a:chan, b:chan) =
  do lb: Inv2_h(a,b) or la: Inv2_m(a,b)
  and Inv2_m(a:chan, b:chan) =
  do lb: Inv2_h(a,b) or delay@1.0: Inv2_h(a,b)
  or la: Inv2_m(a,b)
  and Inv2_l(a:chan, b:chan) =
  do lb: Inv2_m(a,b) or delay@1.0: Inv2_m(a,b)
run 100 of (Inv2_h(a,b) | Inv2_l(b,c))
let clock(t:float, tickchan) = (* sends a tick every t time *)
  (val t1 = 1/100.0 val d = 1.0/H (* by 100-step erlang timers *)
  let step(n:int) = if n=0 then tick: clock(t, tick) else delay@d: step(n-1)
  run step(100))
let SI(a:chan, tickchan) = do la: SI(a, tick) or Ptick ()
let SN(n:int, t:float, a:chan, tickchan, tickchan) =
  if n=0 then clock(t, tick) else Ptick (SI(a, tick) | SN(n-1, t, a, tick, tick))
let raisingfalling(a:chan, n:int, t:float) =
  (new tickchan new tickchan
  run (clock(t, tick) | SN(n, t, a, tick, tick)))
run raisingfalling(a, 100, 0.5)
```

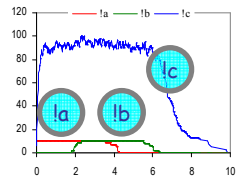
zero-point noise resistant

# Boolean Gate Collectives

$c = a \text{ or } b$



Inputs:  
10 1a for 4t  
2t; 10 1b for 4t



```
directive sample 10.0 1000
directive plot la lb lc

new a@1.0 chan new b@1.0 chan new c@1.0 chan
val del = 1.0

let Or_h(a:chan, b:chan, c:chan) =
do lc: Or_h(a,b,c) or delay@del: Or_h(a,b,c)
and Or_h(b,c,chan, c:chan) =
do %a: Or_h(a,b,c) or %a: Or_h(b,c,c)

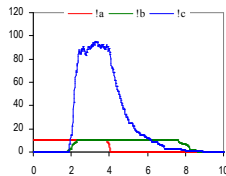
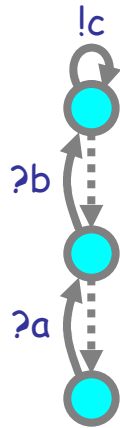
run 100 of Or_h(a,b,c)

let clock(float, tickchan) = (* sends a tick every 1 time *)
(val ti = 1/200.0 val d = 1.0/H)
let step(int) =
if #=0 then tick: clock(t, tick) else delay@d: step(n-1)
run step(200)

let S_a(tickchan) = do lb: S_a(tick) or %Tick ()
let S_b(tickchan) = %Tick S_b(tick)
and S_b1(tickchan) = do lb: S_b1(tick) or %Tick S_b2(tick)
and S_b2(tickchan) = do lb: S_b2(tick) or %Tick ()

run 10 of (new tickchan run (clock(4.0, tick) | S_a(tick)))
run 10 of (new tickchan run (clock(2.0, tick) | S_b1(tick)))
```

$c = a \text{ and } b$



```
directive sample 10.0 1000
directive plot la lb lc

new a@1.0 chan new b@1.0 chan new c@1.0 chan
val del = 1.0

let And_h(a:chan, b:chan, c:chan) =
do lc: And_h(a,b,c) or delay@del: And_h(a,b,c)
and And_h(b,c,chan, c:chan) =
do %a: And_h(a,b,c) or delay@del: And_h(b,c,b,c)
and And_h(c,chan, b:chan, c:chan) =
%b: And_h(a,b,c)

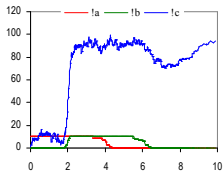
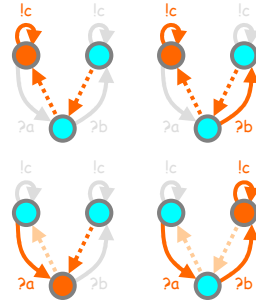
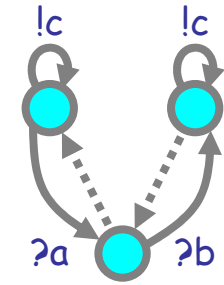
run 100 of And_h(a,b,c)

let clock(float, tickchan) = (* sends a tick every 1 time *)
(val ti = 1/200.0 val d = 1.0/H)
let step(int) =
if #=0 then tick: clock(t, tick) else delay@d: step(n-1)
run step(200)

let S_a(tickchan) = do lb: S_a(tick) or %Tick ()
let S_b(tickchan) = %Tick S_b(tick)
and S_b1(tickchan) = do lb: S_b1(tick) or %Tick S_b2(tick)
and S_b2(tickchan) = do lb: S_b2(tick) or %Tick S_b3(tick)
and S_b3(tickchan) = do lb: S_b3(tick) or %Tick ()

run 10 of (new tickchan run (clock(4.0, tick) | S_a(tick)))
run 10 of (new tickchan run (clock(2.0, tick) | S_b1(tick)))
```

$c = a \text{ imply } b$



```
directive sample 10.0 1000
directive plot la lb lc

new a@1.0 chan new b@1.0 chan new c@1.0 chan
val del = 1.0

let ImPLY_h(a:chan, b:chan, c:chan) =
do lc: ImPLY_h(a,b,c) or %a: ImPLY_h(a,b,c)
and ImPLY_h(b,c,chan, c:chan) =
do %a: ImPLY_h(a,b,c) or delay@del: ImPLY_h(a,b,c)
and ImPLY_h(c,chan, b:chan, c:chan) =
do %a: ImPLY_h(a,b,c) or delay@del: ImPLY_h(a,b,c)

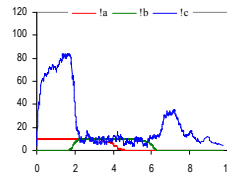
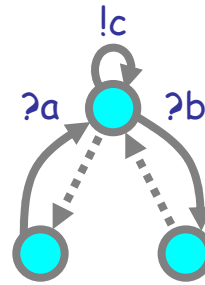
run 100 of ImPLY_h(a,b,c)

let clock(float, tickchan) = (* sends a tick every 1 time *)
(val ti = 1/200.0 val d = 1.0/H)
let step(int) =
if #=0 then tick: clock(t, tick) else delay@d: step(n-1)
run step(200)

let S_a(tickchan) = do lb: S_a(tick) or %Tick ()
let S_b(tickchan) = %Tick S_b(tick)
and S_b1(tickchan) = do lb: S_b1(tick) or %Tick S_b2(tick)
and S_b2(tickchan) = do lb: S_b2(tick) or %Tick ()

run 10 of (new tickchan run (clock(4.0, tick) | S_a(tick)))
run 10 of (new tickchan run (clock(2.0, tick) | S_b1(tick)))
```

$c = a \text{ unless } b$



```
directive sample 10.0 1000
directive plot la lb lc

new a@1.0 chan new b@1.0 chan new c@1.0 chan
val del = 1.0

let OOO_h(a:chan, b:chan, c:chan) =
do lc: OOO_h(a,b,c) or delay@del: OOO_h(a,b,c) or %b:
OOO_h(b,b,b,c)
and OOO_h(b,c,chan, c:chan) =
%a: OOO_h(a,b,c)
and OOO_h(c,chan, b:chan, c:chan) =
delay@del: OOO_h(a,b,c)

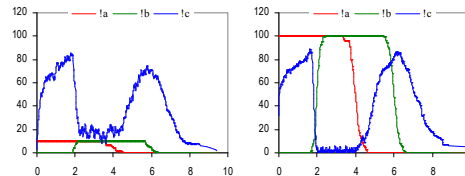
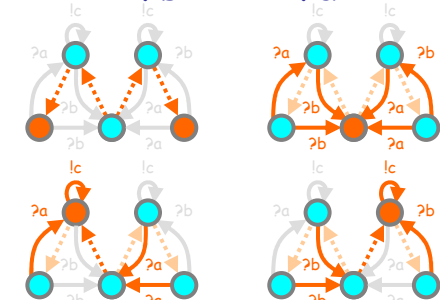
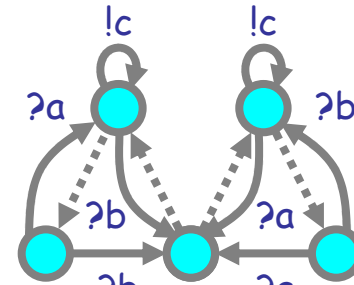
run 50 of (OOO_h(a,b,c) | OOO_h(b,b,c))

let clock(float, tickchan) = (* sends a tick every 1 time *)
(val ti = 1/200.0 val d = 1.0/H)
let step(int) =
if #=0 then tick: clock(t, tick) else delay@d: step(n-1)
run step(200)

let S_a(tickchan) = do lb: S_a(tick) or %Tick ()
let S_b(tickchan) = %Tick S_b(tick)
and S_b1(tickchan) = do lb: S_b1(tick) or %Tick S_b2(tick)
and S_b2(tickchan) = do lb: S_b2(tick) or %Tick ()

run 10 of (new tickchan run (clock(4.0, tick) | S_a(tick)))
run 10 of (new tickchan run (clock(2.0, tick) | S_b1(tick)))
```

$c = a \text{ xor } b$



```
directive sample 10.0 1000
directive plot la lb lc

new a@1.0 chan new b@1.0 chan new c@1.0 chan

let Xor_h(a:chan, b:chan, c:chan) =
do lc: Xor_h(a,b,c) or %b: Xor_h(a,b,c) or delay@1.0: Xor_h(a,b,c)
and Xor_h(b,c,chan, c:chan) =
do lc: Xor_h(b,c) or %a: Xor_h(a,b,c) or delay@1.0: Xor_h(a,b,c)
and Xor_h(c,chan, b:chan, c:chan) =
do %b: Xor_h(a,b,c) or %a: Xor_h(a,b,c)
and Xor_h(a,b,c,chan, c:chan) =
do %b: Xor_h(a,b,c) or delay@1.0: Xor_h(a,b,c)

run 50 of (Xor_h(a,b,c) | Xor_h(b,b,c))

let clock(float, tickchan) = (* sends a tick every 1 time *)
(val ti = 1/200.0 val d = 1.0/H)
let step(int) =
if #=0 then tick: clock(t, tick) else delay@d: step(n-1)
run step(200)

let S_a(tickchan) = do lb: S_a(tick) or %Tick ()
let S_b(tickchan) = %Tick S_b(tick)
and S_b1(tickchan) = do lb: S_b1(tick) or %Tick S_b2(tick)
and S_b2(tickchan) = do lb: S_b2(tick) or %Tick ()

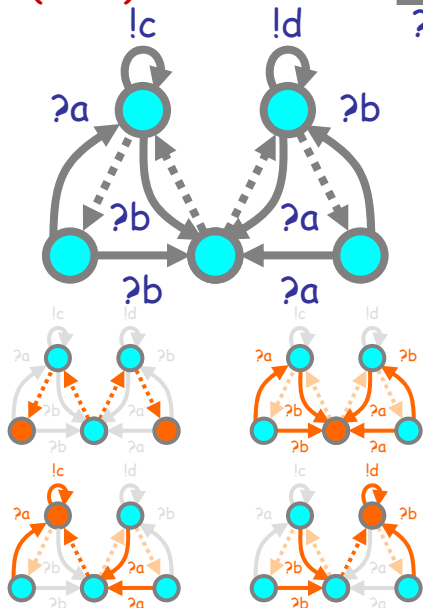
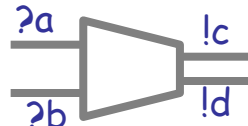
run 10 of (new tickchan run (clock(4.0, tick) | S_a(tick)))
run 10 of (new tickchan run (clock(2.0, tick) | S_b1(tick)))
```

# Collective Analog Devices

# Xor as an Op Amp

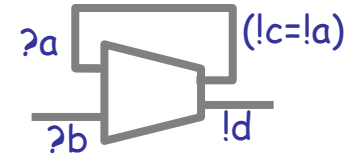
$$c = A*(a - b)$$

$$d = A*(b - a)$$



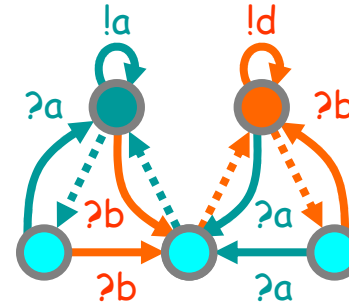
Follower (a standard OpAmp trick)

$a=0 \ b=0 \Rightarrow d=b-a=0 \ a=c=a-b=0$   
 $a=0 \ b=1 \Rightarrow d=b-a=1 \ a=c=a-b=0$   
 $a=1 \ b=0 \Rightarrow d=b-a=0 \ a=c=a-b=1$   
 $a=1 \ b=1 \Rightarrow d=b-a=0 \ a=c=a-b=0$   
 hence  $d=1$  at next step

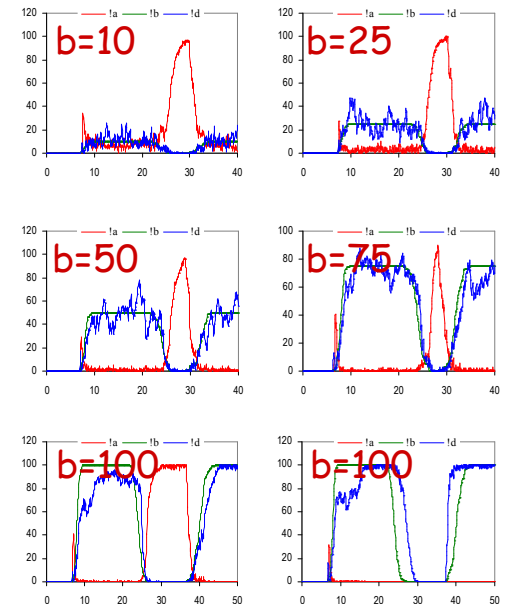


"Noninverting Configuration"

hence  $d=b$



$d=b$  analog response!!



$a=100$  may or may not happen

```

directive sample 20.0 1000
directive plot !a !b !c !d

new @!0.0 chan new @!1.0 chan new @!2.0 chan new @!3.0 chan

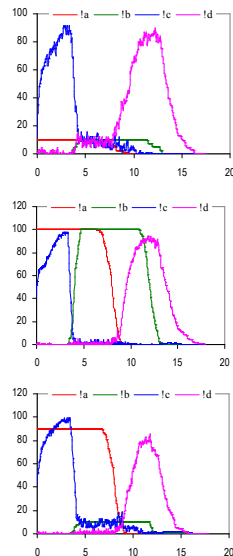
let Xor_h1_a(!a chan, !b chan, !c chan, !d chan) =
do !c: Xor_h1_a(!a,b,c,d) or !a: Xor_h1_a(!a,b,c,d) or delay@!1.0: Xor_h1_a(!a,b,c,d)
and Xor_h1_b(!a chan, !b chan, !c chan, !d chan) =
do !d: Xor_h1_b(!a,b,c,d) or !a: Xor_h1_a(!a,b,c,d) or delay@!1.0: Xor_h1_b(!a,b,c,d)
and Xor_h1_c(!a chan, !b chan, !c chan, !d chan) =
do !a: Xor_h1_c(!a,b,c,d) or !a: Xor_h1_a(!a,b,c,d)
and Xor_h1_d(!a chan, !b chan, !c chan, !d chan) =
do !b: Xor_h1_d(!a,b,c,d) or !a: Xor_h1_a(!a,b,c,d)
and Xor_h1_e(!a chan, !b chan, !c chan, !d chan) =
do delay@!1.0: Xor_h1_e(!a,b,c,d) or delay@!1.0: Xor_h1_b(!a,b,c,d)

run 50 of (Xor_h1_a(!a,b,c,d) | Xor_h1_b(!a,b,c,d))

let clock(float, tickchan) = (* sends a tick every 1 time *)
(val t1 = 1/200.0 val d = 1.0/h)
let step(n:int) =
if n=0 then tick: clock(t, tick) else delay@d: step(n-1)
run step(200)

let S_a(tickchan) = do !a: S_a(tick) or !tick: ()
let S_b(tickchan) = do !b: S_b(tick) or !tick: ()
let S_c(tickchan) = do !c: S_c(tick) or !tick: ()
let S_d(tickchan) = do !d: S_d(tick) or !tick: ()

run 100 of (new tickchan run (clock(8.0, tick) | S_a(tick)))
run 100 of (new tickchan run (clock(4.0, tick) | S_b(tick)))
  
```



```

directive sample 40.0 1000
directive plot !a !b !d

new @!1.0 chan new @!2.0 chan new @!3.0 chan

let Xor_h1_a(!a chan, !b chan, !c chan, !d chan) =
do !c: Xor_h1_a(!a,b,c,d) or !a: Xor_h1_a(!a,b,c,d) or delay@!1.0: Xor_h1_a(!a,b,c,d)
and Xor_h1_b(!a chan, !b chan, !c chan, !d chan) =
do !d: Xor_h1_b(!a,b,c,d) or !a: Xor_h1_a(!a,b,c,d) or delay@!1.0: Xor_h1_b(!a,b,c,d)
and Xor_h1_c(!a chan, !b chan, !c chan, !d chan) =
do !a: Xor_h1_c(!a,b,c,d) or !a: Xor_h1_a(!a,b,c,d)
and Xor_h1_d(!a chan, !b chan, !c chan, !d chan) =
do !b: Xor_h1_d(!a,b,c,d) or !a: Xor_h1_a(!a,b,c,d)
and Xor_h1_e(!a chan, !b chan, !c chan, !d chan) =
do delay@!1.0: Xor_h1_e(!a,b,c,d) or delay@!1.0: Xor_h1_b(!a,b,c,d)

run 50 of (Xor_h1_a(!a,b,c,d) | Xor_h1_b(!a,b,c,d))

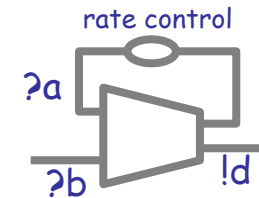
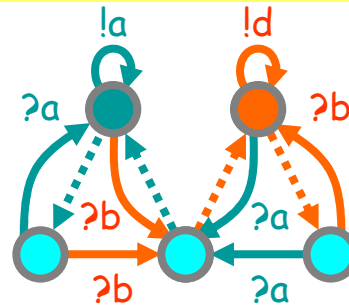
let clock(float, tickchan) = (* sends a tick every 1 time *)
(val t1 = 1/200.0 val d = 1.0/h)
let step(n:int) =
if n=0 then tick: clock(t, tick) else delay@d: step(n-1)
run step(200)

let S_b(tickchan) = !tick: S_b(tick)
and S_b1(tickchan) = do !b: S_b1(tick) or !tick: S_b2(tick)
and S_b2(tickchan) = do !b: S_b2(tick) or !tick: S_b3(tick)
and S_b3(tickchan) = !tick: S_b4(tick)
and S_b4(tickchan) = !b: S_b4(tick)

run 10 of (new tickchan run (clock(8.0, tick) | S_b(tick)))
  
```

# Changing the OpAmp Gain

An OpAmp provides "infinite" differential amplification, but a stable finite amplification can be obtained by a feedback loop with a load splitter (the *follower* is a special case of that, which gives gain 1). The equivalent here is simply changing the rate on the feedback link.



Empirical law:  
 $[d] = [b]/\text{rate}(a)$   
 but *why?*

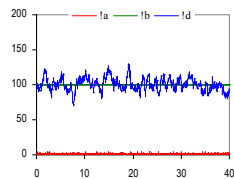
```

directive sample 40:0:1000
directive plot 'la, lb, ld

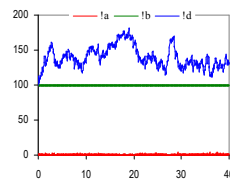
new a@1:0:chan new b@1:0:chan new d@1:0:chan

let Xor_hi_a(a:chan, b:chan, c:chan, d:chan) =
do lc: Xor_hi_a(a:b:c:d) or Pb: Xor_la_ab(a:b:c:d) or delay@1:0: Xor_la_ab(a:b:c:d)
and Xor_hi_b(a:chan, b:chan, c:chan, d:chan) =
do lb: Xor_hi_b(a:b:c:d) or Pa: Xor_la_ab(a:b:c:d) or delay@1:0: Xor_la_ab(a:b:c:d)
and Xor_la_ab(a:chan, b:chan, c:chan, d:chan) =
do Pa: Xor_hi_a(a:b:c:d) or Pb: Xor_la_ab(a:b:c:d)
and Xor_la_ab(a:chan, b:chan, c:chan, d:chan) =
do Pb: Xor_hi_b(b:c:d) or Pa: Xor_la_ab(a:b:c:d)
and Xor_la_ab(a:chan, b:chan, c:chan, d:chan) =
do delay@1:0: Xor_hi_a(a:b:c:d) or delay@1:0: Xor_hi_b(b:c:d)

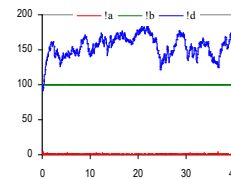
run 100 of (Xor_la_ab(a:b:c:d) | Xor_la_ab(a:b:c:d))
run 100 of replicate lb
    
```



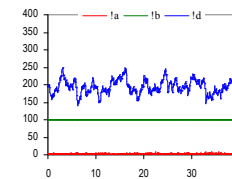
b=100  
 a@1.0  
 d gain 1.0  
 #OpAmp=200



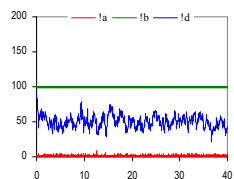
b=100  
 a@0.75  
 d gain 1.33  
 #OpAmp=200



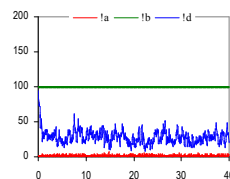
b=100  
 a@0.6  
 d gain 1.66  
 #OpAmp=200



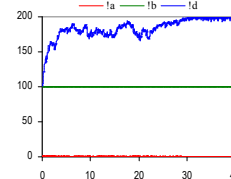
b=100  
 a@0.5  
 d gain 2.00  
 #OpAmp=400  
 (non saturated)



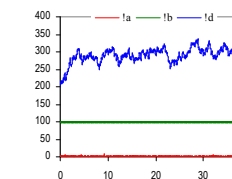
b=100  
 a@2.0  
 d gain 0.5  
 #OpAmp=200



b=100  
 a@4.0  
 d gain 0.25  
 #OpAmp=200



b=100  
 a@0.5  
 d gain 2.00  
 #OpAmp=200  
 (saturated)



b=100  
 a@0.33  
 d gain 3.00  
 #OpAmp=400



# Automata Polymers



# Bidirectional Polymerization

new c@μ new stop@1.0

$A_{free} =$

(new rht@λ; !c(rht);  $A_{brht}(rht)$ )  
 + ?c(lft);  $A_{blft}(lft)$ )

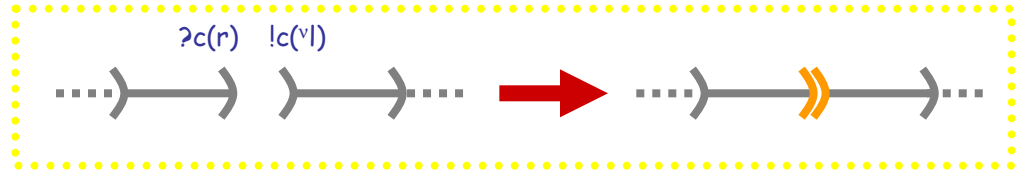
$A_{blft}(lft) =$

(new rht@λ; !c(rht);  $A_{bound}(lft,rht)$ )

$A_{brht}(rht) =$

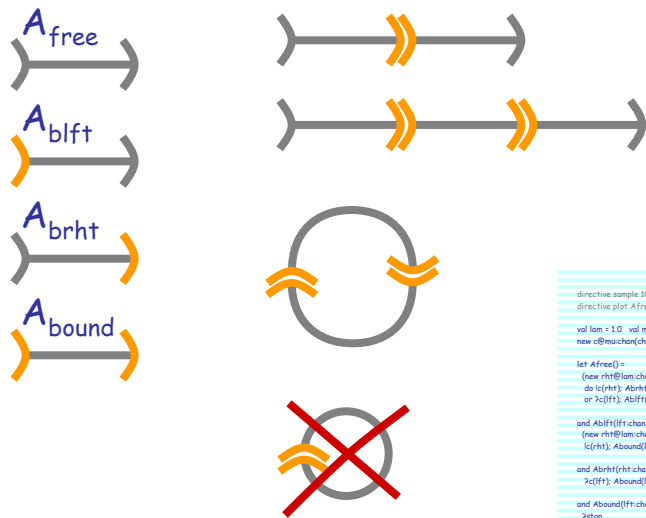
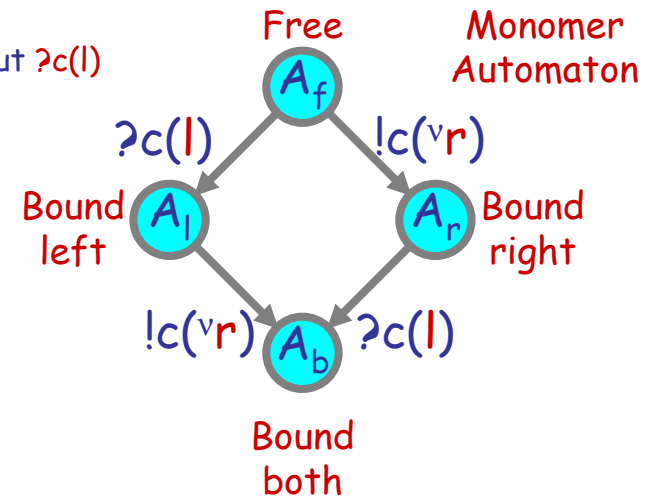
?c(lft);  $A_{bound}(lft,rht)$

$A_{bound}(lft,rht) = ?stop$



## Communicating Automata

Bound output !c(vr) and input ?c(l) on automata transitions to model complexation



```

directive sample 10000.0
directive plot Afree(), Ablft(), Abrht(), Abound()

val lam = 1.0 val mu = 1.0
new c@μchan chan new stop@1.0chan

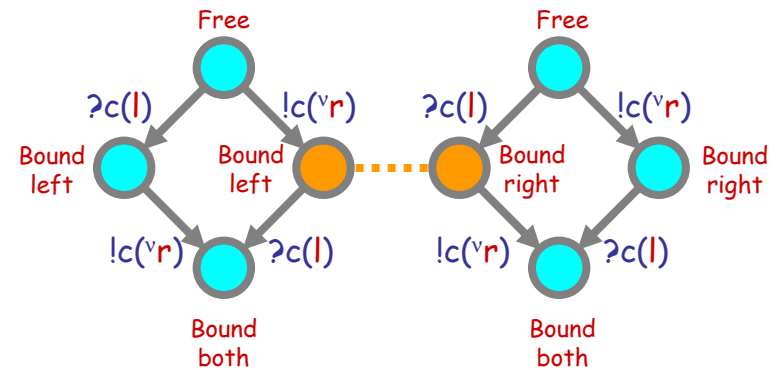
let Afree() =
  (new rht@lam chan run
   do !c(rht); Abrht(rht)
   or ?c(lft); Ablft(lft))

and Ablft(lft chan) =
  (new rht@lam chan run
   !c(rht); Abound(lft,rht))

and Abrht(rht chan) =
  ?c(lft); Abound(lft,rht)

and Abound(lft chan, rht chan) =
  ?stop

run (2 of Afree())
  
```

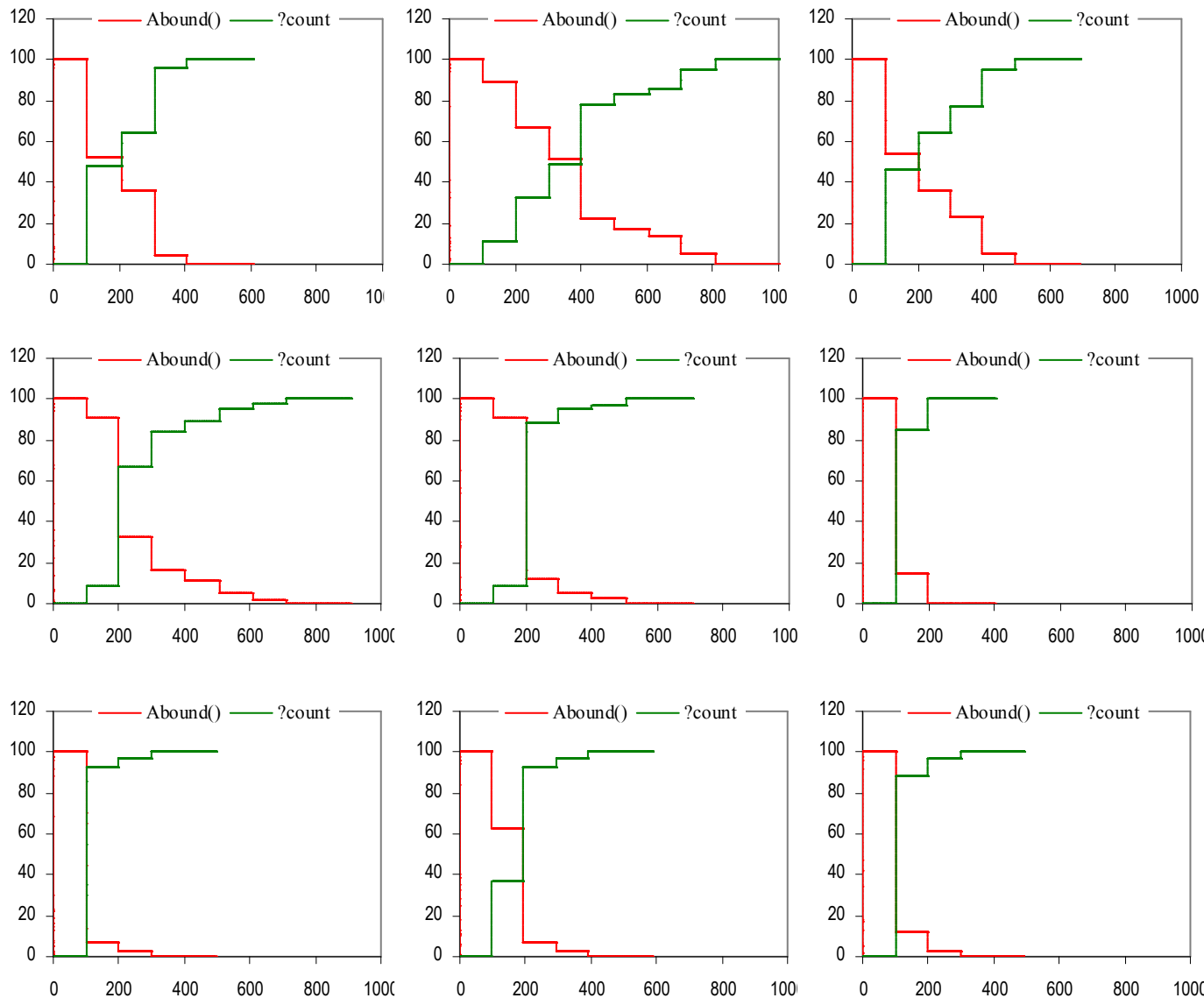


# Bidirectional Polymerization

## Circular Polymer Lengths

Scanning and counting the size of the circular polymers (by a cheap trick).

Polymer formation is complete within 10t; then a different polymer is scanned every 100t.



```

directive sample 1000.0
directive plot Abound(); ?count

type Link = chan(chan)
type Barb = chan

val lam = 1000.0 (* set high for better counting *)
val mu = 1.0
new c@mu:chan(Link)
new enter@lam:chan(Barb)
new count@lam:Barb

let Afree() =
  (new rht@lam:Link run
   do !c(rht); Abrht(rht)
   or ?c(lft); Ablft(lft))

and Ablft(lft:Link) =
  (new rht@lam:Link run
   !c(rht); Abound(lft,rht))

and Abrht(rht:Link) =
  ?c(lft); Abound(lft,rht)

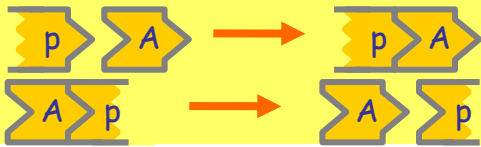
and Abound(lft:Link, rht:Link) =
  do ?enter(barb); (?barb | !rht(barb))
  or ?lft(barb); (?barb | !rht(barb))
  (* each Abound waits for a barb, exhibits it, and passes it to
  the right so we can plot number of Abound in a ring *)

let clock(t:float, tick:chan) = (* sends a tick every t time *)
  (val ti = t/1000.0 val d = 1.0/ti
   let step(n:int) =
     if n<=0 then !tick; clock(t,tick) else delay@d; step(n-1)
   run step(1000))

new tick:chan
let Scan() = ?tick; !enter(count); Scan()

run 100 of Afree()
run (clock(100.0, tick) | Scan())
  
```

$100 \times A_{free}$ , initially.  
 The height of each rising step is the size of a separate circular polymer. (Unbiased sample of nine consecutive runs.)



# Actin-like Poly/Depolymerization

new  $c@μ$

$A_{free} =$

(new  $lft@λ; !c(lft); A_{blft}(lft)) +$   
 $?c(rht); A_{brht}(rht)$

$A_{blft}(lft) =$

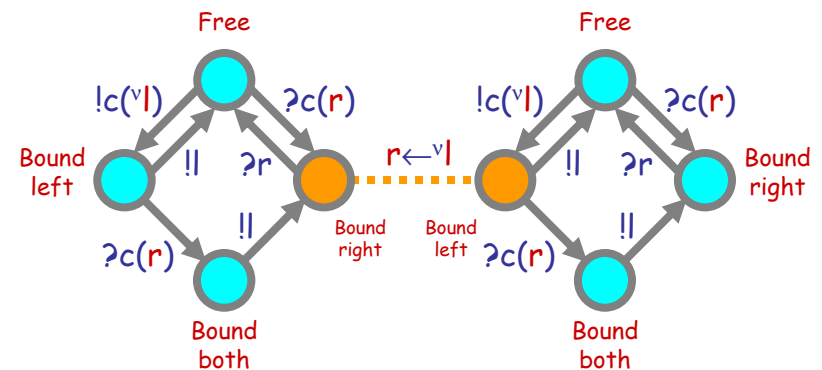
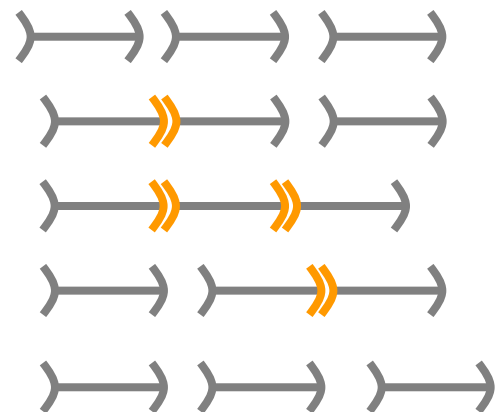
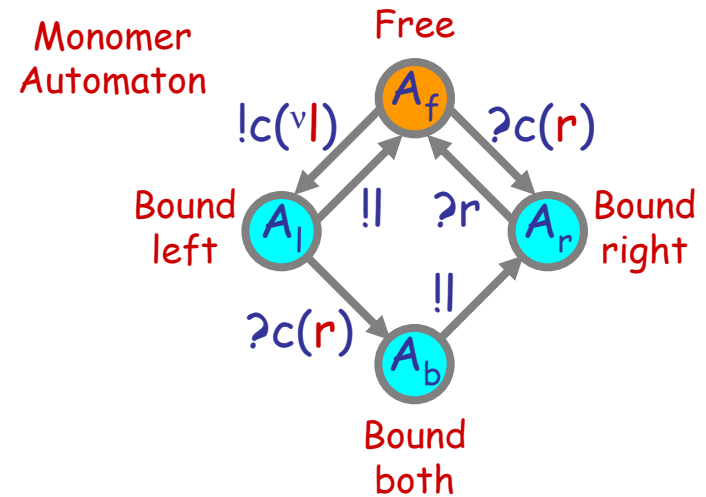
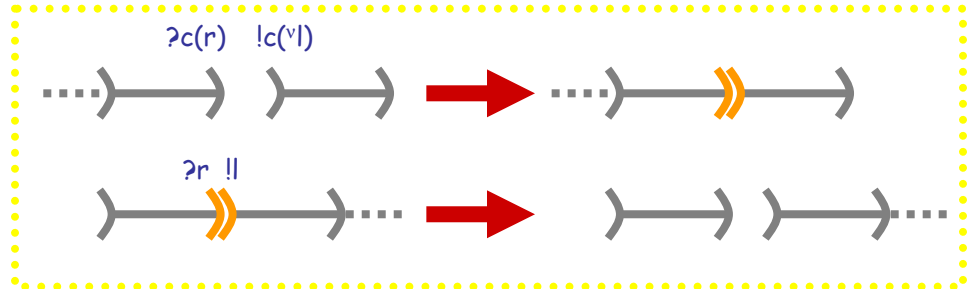
$!lft; A_{free} +$   
 $?c(rht); A_{bound}(lft,rht)$

$A_{brht}(rht) =$

$?rht; A_{free}$

$A_{bound}(lft,rht) =$

$!lft; A_{brht}(rht)$



# Semantics of Collective Behavior

# "Micromodels": Continuous Time Markov Chains

- The underlying semantics of stochastic  $\pi$ -calculus (and stochastic interacting automata). Well established in many ways.
  - Automata with rates on transitions.
- "The" correct semantics for chemistry, executable.
  - Gillespie stochastic simulation algorithm
- But does not give a good sense of "collective" properties.
  - Yes one can do simulation.
  - Yes one can do program analysis.
  - Yes one can do modelchecking.
  - But somewhat lacking in "predictive power".

# "Macromodels": Ordinary Differential Equations

- Micromodels have lots of advantages
  - Compositional, compact, mechanistic, etc.
- But they always ask:
  - "Yes, but how does your automata model relate to the 75 ODE models in the literature?"
- From processes/automata to ODEs directly:
  - *In principle*: just write down the **Rate Equation**:
    - Determine the set of all possible *states*  $S$  of each process.
    - Determine the rates of the transitions between such states.
    - Let  $[S]$  be the "number of processes in state  $S$ " as a function of time.
    - Define for each state  $S$ :
      - $[S]^*$  = (rate of change of the number of processes in state  $S$ )  
Cumulative rate of transitions from any state  $S'$  to state  $S$ , times  $[S']$ ,  
minus cumulative rate of transitions from  $S$  to any state  $S''$ , times  $[S]$ .
  - Intuitive (rate = inflow minus outflow), but often clumsy to write down precisely.
- But why go to the trouble?
  - If we first convert processes to chemical reactions, then we can convert to ODEs by standard means!

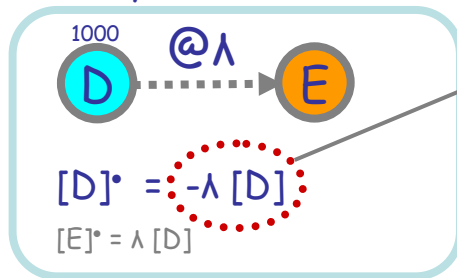


# Macromodel of Interaction

## Law of Mass Interaction

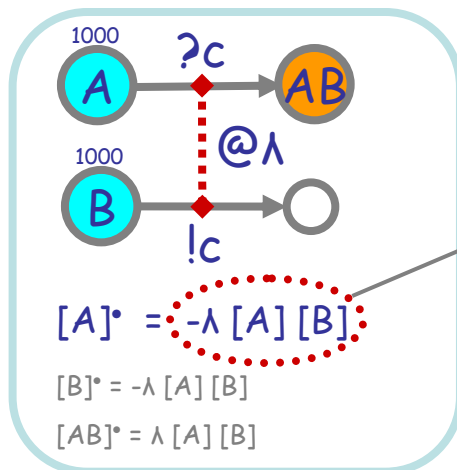
The speed of interaction<sup>†</sup> is proportional to the number of *possible interactions*.

Decay



Exponential  
Decay law  
Rate of change  
proportional to number  
of possible decays.

Mass interaction



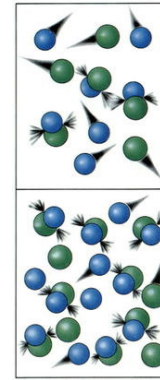
Interaction  
Law generalizes  
Decay Law

Mass  
Interaction law  
Rate of change  
proportional to number  
of possible interactions

<sup>†</sup> speed of interaction (formally definable)  
= number of interactions over time

not proportional to the number of interacting processes!

[P] is the number of processes P (this is informal; it is only meaningful for a set of processes offering a given action, but a set of such processes can be counted and plotted)



Chemical Law of Mass Action

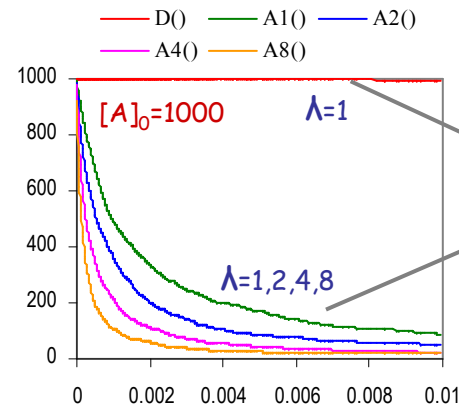
[http://en.wikipedia.org/wiki/Chemical\\_kinetics](http://en.wikipedia.org/wiki/Chemical_kinetics)

The **speed** of a chemical reaction is proportional to the **activity** of the reacting substances.

Activity = concentration, for well-stirred aqueous medium

Concentration = number of moles per liter of solution

Mole =  $6.022141 \times 10^{23}$  particles



decay

interaction

```
directive sample 0.01,1000
directive plot D(), A1(), A2(), A4(), A8()
new c1@1.0: chan() new c2@2.0: chan()
new c4@4.0: chan() new c8@8.0: chan()
let D() = delay@1.0
let A1() = ?c1 and B1() = !c1
let A2() = ?c2 and B2() = !c2
let A4() = ?c4 and B4() = !c4
let A8() = ?c8 and B8() = !c8
run 1000 of (D() | A1() | B1() | A2()
| B2() | A4() | B4() | A8() | B8())
```

2006-05-09



# Possible Interactions

The speed of interaction is proportional to the number of possible interactions.

But a process cannot interact with itself.

Assume each process P is in restricted-sum-normal-form. For each channel x:

$In(x,P)$  = Num of active  $?x$  in P

$Out(x,P)$  = Num of active  $!x$  in P

$Mix(x,P) = In(x,P) * Out(x,P)$   
#interactions that cannot happen in a given summation P

$In(x) = \text{Sum } P \text{ of } In(x,P)$

$Out(x) = \text{Sum } P \text{ of } Out(x,P)$

$Mix(x) = \text{Sum } P \text{ of } Mix(x,P)$   
total #interactions that cannot happen

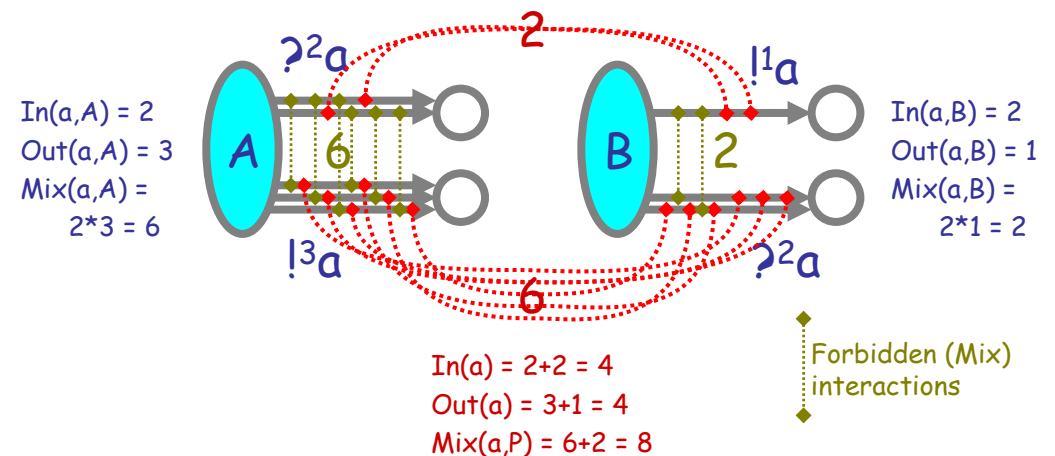
The global **Activity** on channel x:

$$Act(x) = (In(x) * Out(x)) - Mix(x)$$

total cross product of inputs and outputs minus total #interactions that cannot happen

The global **speed** of interaction on a channel x:

$$speed(x) = Act(x) * rate(x)$$



$$Act(a) = (In(a) * Out(a)) - Mix(a) = 4 * 4 - 8 = 8$$

$$speed(a) = Act(a) * rate(a) = 8 * rate(a)$$

# From Chemistry to ODEs

# Chemical Reactions

$A \rightarrow^r B_1 + \dots + B_n$	Degradation	$[A]^{\bullet} = -r[A]$	Exponential Decay
$A_1 + A_2 \rightarrow^r B_1 + \dots + B_n$	Asymmetric Collision	$[A_i]^{\bullet} = -r[A_1][A_2]$	Mass Action Law
$A + A \rightarrow^r B_1 + \dots + B_n$	Symmetric Collision	$[A]^{\bullet} = -r[A]([A]-1)$	Mass Action Law

(assuming  $A \neq B_i \neq A_j$  for all  $i, j$ )

No other reactions!

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## The chemical Langevin equation

Daniel T. Gillespie<sup>a)</sup>  
 Research Department, Code 4T4100D, Naval Air Warfare Center, China Lake, California 93555

Genuinely *trimolecular* reactions do not physically occur in dilute fluids with any appreciable frequency. *Apparently* trimolecular reactions in a fluid are usually the combined result of two bimolecular reactions and one monomolecular reaction, and involve an additional short-lived species.

## Chapter IV: Chemical Kinetics

[David A. Reckhow, CEE 572 Course]

... reactions may be either elementary or non-elementary. Elementary reactions are those reactions that occur exactly as they are written, without any intermediate steps. These reactions **almost always involve just one or two reactants**. ... Non-elementary reactions involve a series of two or more elementary reactions. Many complex environmental reactions are non-elementary. In general, **reactions with an overall reaction order greater than two, or reactions with some non-integer reaction order are non-elementary**.

## THE COLLISION THEORY OF REACTION RATES

[www.chemguide.co.uk](http://www.chemguide.co.uk)

The chances of all this happening if your reaction needed a collision involving more than 2 particles are remote. All three (or more) particles would have to arrive at exactly the same point in space at the same time, with everything lined up exactly right, and having enough energy to react. That's not likely to happen very often!

Trimolecular reactions:



the measured "r" is an (imperfect) aggregate of e.g.:



Enzymatic reactions:

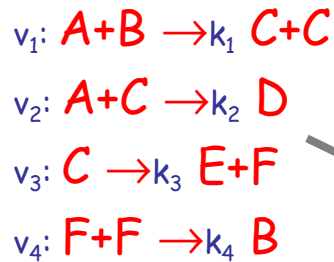


the "r" is given by Michaelis-Menten (approximated steady-state) laws:



# From Reactions to ODEs

CAVEAT: A deterministic *approximation* of a stochastic system (i.e. possibly *dead wrong*)

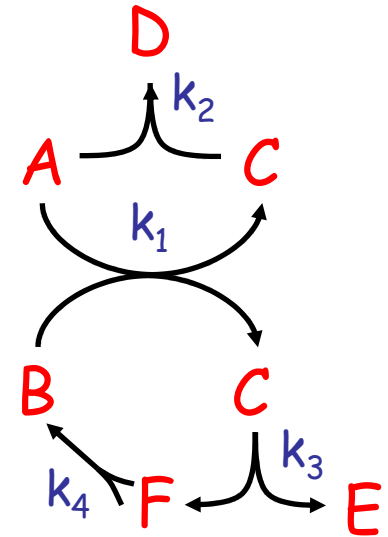


Write the coefficients by columns

	reactions				
species	N	$v_1$	$v_2$	$v_3$	$v_4$
A		-1	-1		
B		-1			1
C		2	-1	-1	
D			1		
E				1	
F				1	-2

**X**

Stoichiometric Matrix



Quantity changes

Stoichiometric matrix

Rate laws

$$[X]^\bullet = N \cdot I$$

$$\begin{aligned}
 [A]^\bullet &= -I_1 - I_2 \\
 [B]^\bullet &= -I_1 + I_4 \\
 [C]^\bullet &= 2I_1 - I_2 - I_3 \\
 [D]^\bullet &= I_2 \\
 [E]^\bullet &= I_3 \\
 [F]^\bullet &= I_3 - 2I_4
 \end{aligned}$$

Read the concentration changes from the rows

E.g.  $[A]^\bullet = -k_1[A][B] - k_2[A][C]$

Set a rate law for each reaction (Degradation/Asymmetric/Symmetric)

I	
$I_1$	$k_1[A][B]$
$I_2$	$k_2[A][C]$
$I_3$	$k_3[C]$
$I_4$	$k_4[F]([F]-1)/2$

**X**: chemical species  
**[-]**: quantity of molecules  
**I**: rate laws  
**k**: kinetic parameters  
**N**: stoichiometric matrix

# From Processes to Chemistry

# Chemical Ground Form (CGF)

$E ::= X_1=M_1, \dots, X_n=M_n$

Definitions ( $n \geq 0$ )

$M ::= \pi_1;P_1 \oplus \dots \oplus \pi_n;P_n$

Molecules ( $n \geq 0$ )

$P ::= X_1 | \dots | X_n$

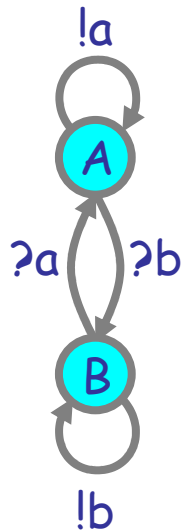
Solutions ( $n \geq 0$ )

$\pi ::= \tau_r ?n_{(r)} !n_{(r)}$

Interactions (delay, input, output)

(To translate chemistry back to processes we need a bit more than simple automata: we may have "+" on the right of  $\rightarrow$ , that is we may need "|" after  $\pi$ .)

$\oplus$  is stochastic choice (vs. + for chemical reactions)  
 $O$  is the null solution ( $P|O = O|P = P$ )  
 and null molecule ( $M \oplus O = O \oplus M = M$ ) ( $\tau_0;P = O$ )  
 $X_i$  are distinct in  $E$   
 Each name  $n$  is assigned a fixed rate  $r$ :  $n_{(r)}$



Ex: interacting automata  
 (which are CGFs using "|" only in Init):

$A = !a;A \oplus ?b;B$

Automaton in state A

$B = !b;B \oplus ?a;A$

Automaton in state B

$Init = \tau_\infty;(A|A|B|B)$

Initial conditions:  
 2A and 2B

# CGF to Chemistry

$E ::= X_1=M_1, \dots, X_n=M_n$	Definitions	$(n \geq 0)$
$M ::= \pi_1;P_1 \oplus \dots \oplus \pi_n;P_n$	Molecules	$(n \geq 0)$
$P ::= X_1   \dots   X_n$	Solutions	$(n \geq 0)$
$\pi ::= \tau_r \quad ?n \quad !n$	Interactions	

Each  $X$  in  $E$  is seen as a separate *species*.

Chemical system for  $E$ : (N.B.:  $\{\dots\}^m$  is a multiset, and  $P$  is  $P$  with all the  $|$  changed to  $+$ )

$$\begin{aligned}
 \text{Ch}_G(E) := & \{(X \xrightarrow{r} P) \text{ s.t. } (X \equiv \tau_r; P \oplus \dots) \in E\}^m \\
 & \cup^m \{(X + Y \xrightarrow{r} P + Q) \text{ s.t. } X \neq Y, \langle (X \equiv ?n_{(r)}; P \oplus \dots), (Y \equiv !n_{(r)}; Q \oplus \dots) \rangle \in E^2\}^m \\
 & \cup^m \{(X + X \xrightarrow{2r} P + Q) \text{ s.t. } (X \equiv ?n_{(r)}; P \oplus \dots \equiv !n_{(r)}; Q \oplus \dots) \in E\}^m
 \end{aligned}$$

# (Note on computing the multisets)

A multiset  $M \in \text{Multiset}(S)$ , where  $S$  is a set with equality, is a total function  $S \rightarrow \text{Nat}$ , which may also be written as a finite enumeration with repetitions:  $\{\dots\}^m$ .

Multiset binary union is the function  $\cup^m(M, M') = \lambda s. M(s) + M'(s)$ .

The shorthand

$$\{(X \rightarrow^r P) \text{ s.t. } (X \equiv \tau_r; P \oplus \dots) \in E\}^m$$

is defined as the following finite union of singleton multisets:

$$\cup^m \{(X = \pi_1; P_1 \oplus \dots \oplus \pi_n; P_n) \in E\} \\ \text{of } (\cup^m \{i \text{ s.t. } \pi_i = \tau_r\}) \\ \text{of } \{(X \rightarrow^r P_i)\}^m$$

i.e. "for each  $(X = \pi_1; P_1 \oplus \dots \oplus \pi_n; P_n) \in E$  and for each  $i$  such that  $\pi_i = \tau_r$ , return a copy of  $(X \rightarrow^r P_i)$ ".

The shorthand

$$\{(X + Y \rightarrow^r P + Q) \text{ s.t. } X \neq Y, \langle (X \equiv ?n_{(r)}; P \oplus \dots), (Y \equiv !n_{(r)}; Q \oplus \dots) \rangle \in E^2\}^m$$

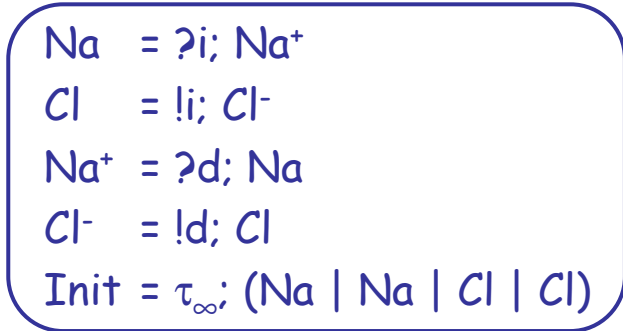
is defined as the following finite union of singleton multisets:

$$\cup^m \langle (X = \pi_1; P_1 \oplus \dots \oplus \pi_n; P_n), (Y = \rho_1; Q_1 \oplus \dots \oplus \rho_m; Q_m) \rangle \in E^2 \text{ with } X \neq Y \\ \text{of } \cup^m \{\langle i, j \rangle \text{ s.t. } \pi_i = ?n_{(r)}, \rho_j = !n_{(r)}\} \\ \text{of } \{(X + Y \rightarrow^r P_i + Q_j)\}^m$$

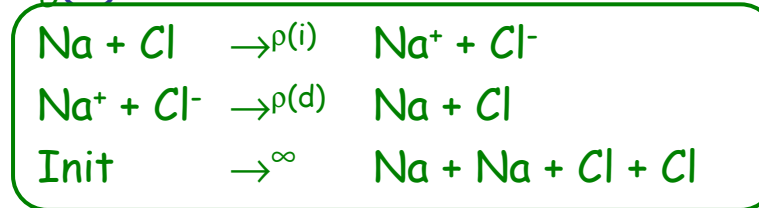


# Example

E:

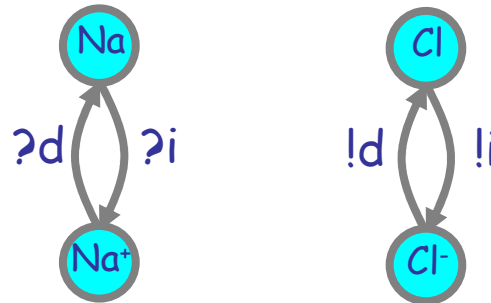


$\text{Ch}_E(E)$ :



$$\rho_E(n_{(r)}) = r$$

$$\begin{aligned}
 \text{Ch}_E(E) &:= \{(X \xrightarrow{r} P) \text{ s.t. } (X \equiv \tau_r; P \oplus \dots) \in E\}^m \\
 &\cup^m \{(X + Y \xrightarrow{r} P + Q) \text{ s.t. } X \neq Y, \langle (X \equiv ?n_{(r)}; P \oplus \dots), (Y \equiv !n_{(r)}; Q \oplus \dots) \rangle \in E^2\}^m \\
 &\cup^m \dots
 \end{aligned}$$



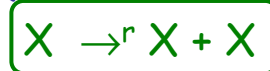
# Subtler Examples

These are not *finite state systems*, but *finite species systems* are ok!

E:



C(E):

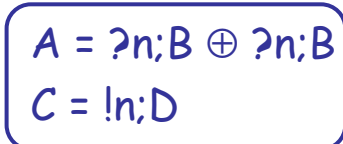


Unbounded state,  
but only 1 species.  
No problem!

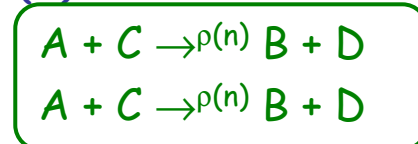
Multisets:

The same interaction can occur multiple times and must be taken into account:

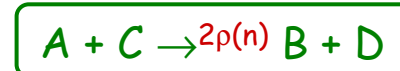
E:



C(E):



That is:

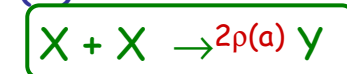


Symmetric reactions:

E:



C(E):

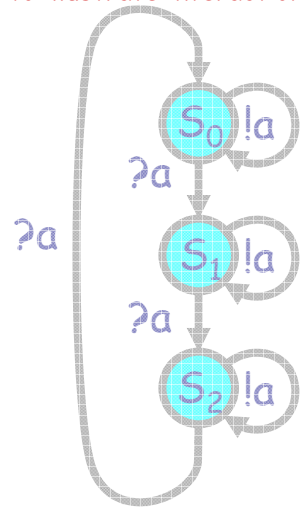
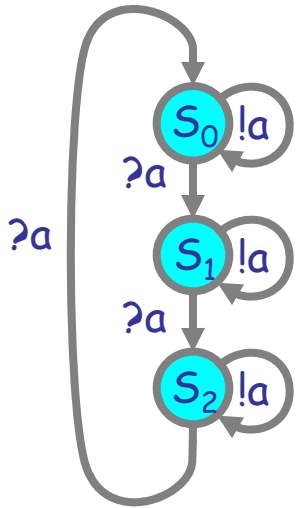


The rate of a was pre-halved and must be restored.

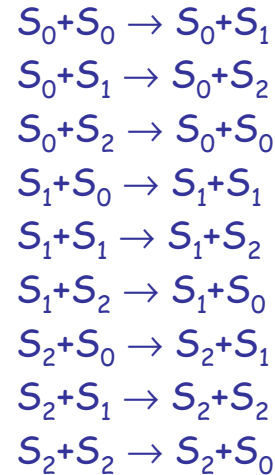
# Automata Descriptions are $n^2$ More Compact

## Automaton

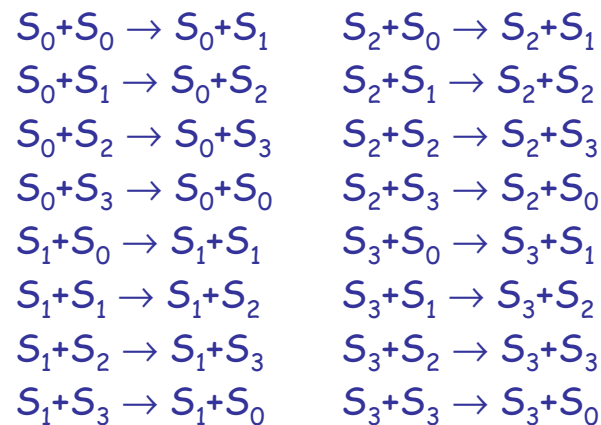
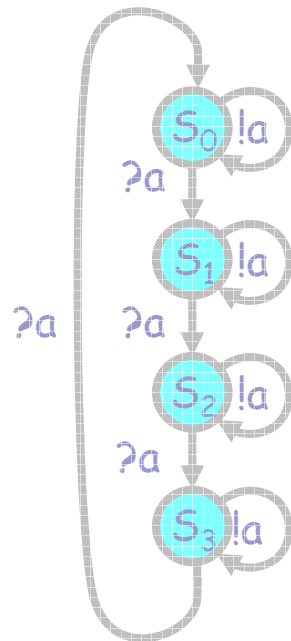
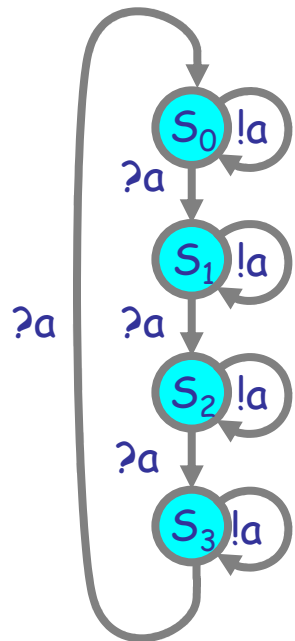
A copy of the automaton to illustrate interactions



## Chemistry



3 states  
 (2\*3 transitions)  
 =  
 3<sup>2</sup> reactions

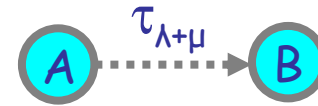
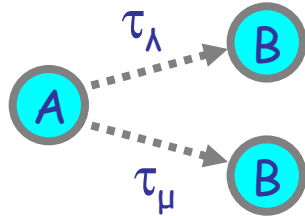


4 states  
 (2\*4 transitions)  
 =  
 4<sup>2</sup> reactions

# From Processes to ODEs via Chemistry

# Choice Law by ODEs

$$\tau_\lambda;B \mid \tau_\mu;B = \tau_{\lambda+\mu};B$$



$$A = \tau_\lambda;B \oplus \tau_\mu;B$$

$$A = \tau_{\lambda+\mu};B$$

$$\begin{array}{l} A \xrightarrow{\lambda} B \\ A \xrightarrow{\mu} B \end{array}$$

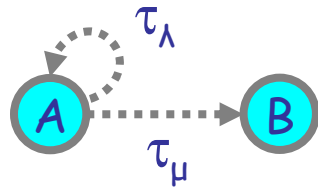
$$A \xrightarrow{\lambda+\mu} B$$

$$\begin{array}{l} [A]^\bullet = -\lambda[A] - \mu[A] \\ [B]^\bullet = \lambda[A] + \mu[A] \end{array}$$

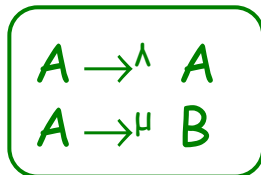
=

$$\begin{array}{l} [A]^\bullet = -(\lambda+\mu)[A] \\ [B]^\bullet = (\lambda+\mu)[A] \end{array}$$

# Idle Loop Law by ODEs

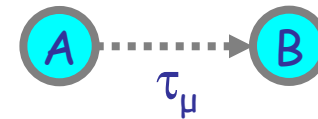


$$A = \tau_\lambda; A \oplus \tau_\mu; B$$

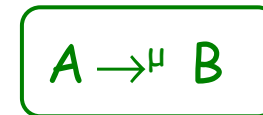


$$\begin{array}{l} [A]^\bullet = -\mu[A] \\ [B]^\bullet = \mu[A] \end{array}$$

=



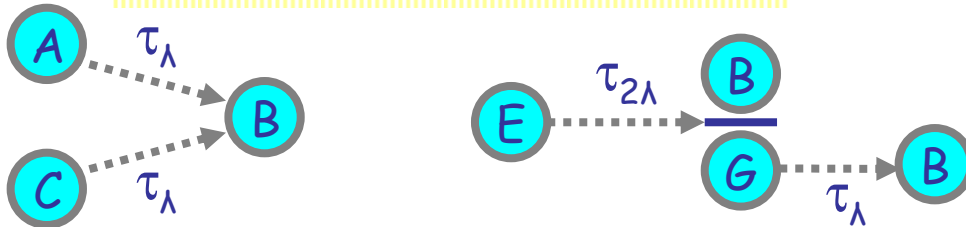
$$A = \tau_\mu; B$$



$$\begin{array}{l} [A]^\bullet = -\mu[A] \\ [B]^\bullet = \mu[A] \end{array}$$

# Equiconfluence Law by ODEs

$$\tau_{\lambda};B \mid \tau_{\lambda};B = \tau_{2\lambda};(B \mid \tau_{\lambda};B)$$



Want to show that B on both sides has the "same behavior" (equal quantities of B produced at all times)

$$F = \tau_{\infty};(A \mid C)$$

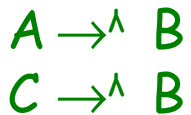
$$A = \tau_{\lambda};B$$

$$C = \tau_{\lambda};B$$

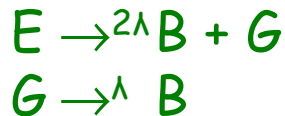
=?

$$E = \tau_{2\lambda};(B \mid G)$$

$$G = \tau_{\lambda};B$$



=?



$$[A]^{\bullet} = -\lambda[A]$$

$$[C]^{\bullet} = -\lambda[C]$$

$$[B]^{\bullet} = \lambda[A] + \lambda[C]$$

$$[E]^{\bullet} = -2\lambda[E]$$

$$[G]^{\bullet} = 2\lambda[E] - \lambda[G]$$

$$[B]^{\bullet} = 2\lambda[E] + \lambda[G]$$

$$\text{let } A' = C' = E + G/2$$

$$\lambda[A'] + \lambda[C']$$

$$= \lambda[E + G/2] + \lambda[E + G/2]$$

$$= 2\lambda[E] + \lambda[G] = [B]^{\bullet}$$

$$[A']^{\bullet} = [E + G/2]^{\bullet} = [E]^{\bullet} + [G]^{\bullet}/2$$

$$= -2\lambda[E] + (2\lambda[E] - \lambda[G])/2$$

$$= -\lambda[E] - \lambda[G]/2$$

$$= -\lambda[E + G/2] = -\lambda[A']$$

=

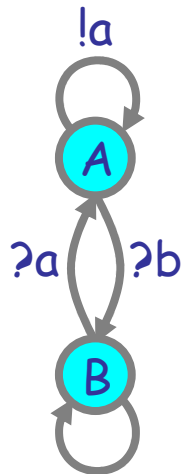
$$[A']^{\bullet} = -\lambda[A']$$

$$[C']^{\bullet} = -\lambda[C']$$

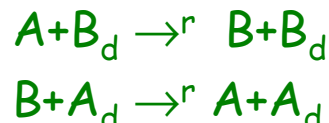
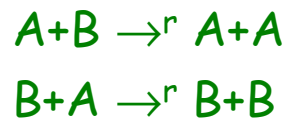
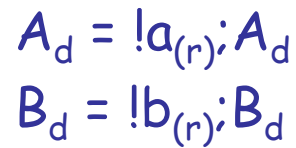
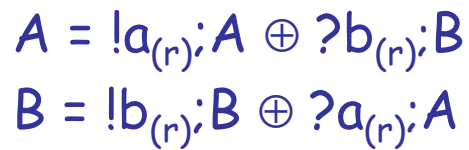
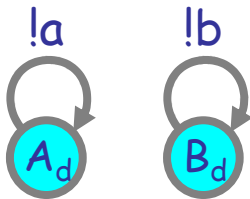
$$[B]^{\bullet} = \lambda[A'] + \lambda[C']$$

Equal ODEs up to a change of variables ( $A' = E + G/2$ ,  $C' = E + G/2$ ), where [B] has the same behavior!

# Groupies ODE



!b  
Doping



$$[A]^* = r[A][B] - r[B][A] - r[A][B_d] + r[B][A_d]$$

$$[B]^* = r[B][A] - r[A][B] - r[B][A_d] + r[A][B_d]$$

$$[A_d]^* = 0$$

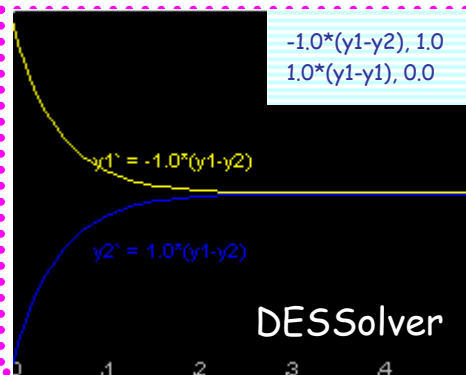
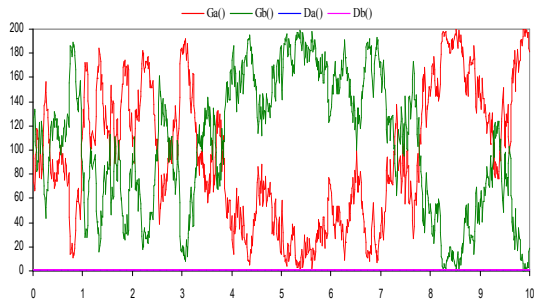
$$[B_d]^* = 0$$

$$[A]^* = -rk([A]-[B])$$

$$[B]^* = rk([A]-[B])$$

At  $[B]=0$ :  $[A]^* = -rk[A]$ ,  
 $[B]^* = rk[A]$   
 At  $[A] \approx [B]$ :  $[A]^* = [B]^* \approx 0$   
 At  $[A]=[B]$ :  $[A]^* = [B]^* = 0$

$[A_d], [B_d]$  are constant;  
 assume them both =  $k$



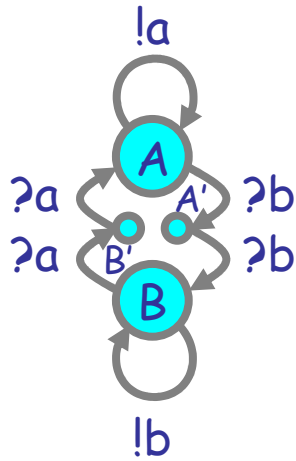
**Wrong Answer!**

ODE predicts converging stable equilibrium at  $[A]=[B]$  instead of the total chaos observed in the stochastic system!

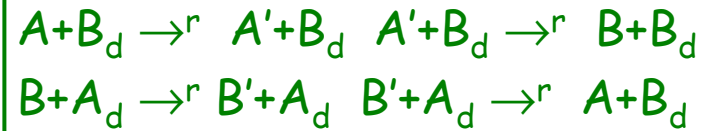
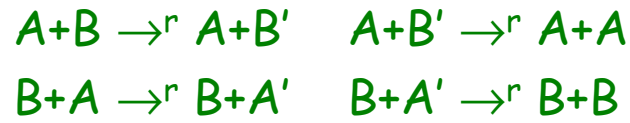
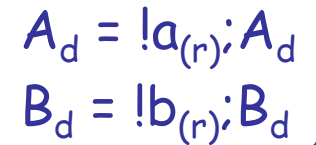
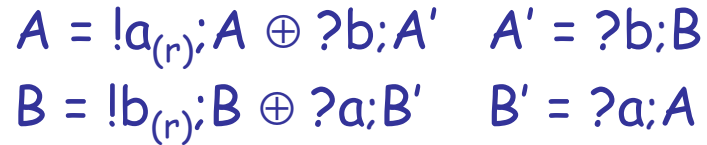
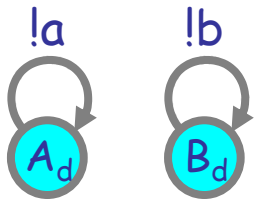
For  $k=0$  (no dope), predicts deadlock  $[A]^*=[B]^*=0$  but at any value of  $[A]$ , which is definitely not true in the stochastic system.



# Hysteric Groupies ODE



Doping



$$[A]^* = r[A][B'] - r[B][A] - r[A][B_d] + r[B'][A_d]$$

$$[A']^* = r[B][A] - r[B][A'] + r[A][B_d] - r[A'][B_d]$$

$$[B]^* = r[B][A'] - r[A][B] - r[B][A_d] + r[A'][B_d]$$

$$[B']^* = r[A][B] - r[A][B'] + r[B][A_d] - r[B'][A_d]$$

$$[A_d]^* = 0$$

$$[B_d]^* = 0$$

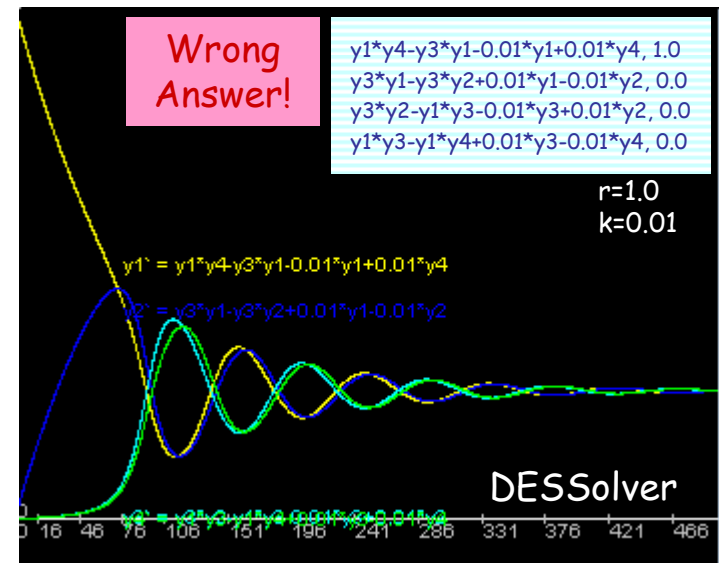
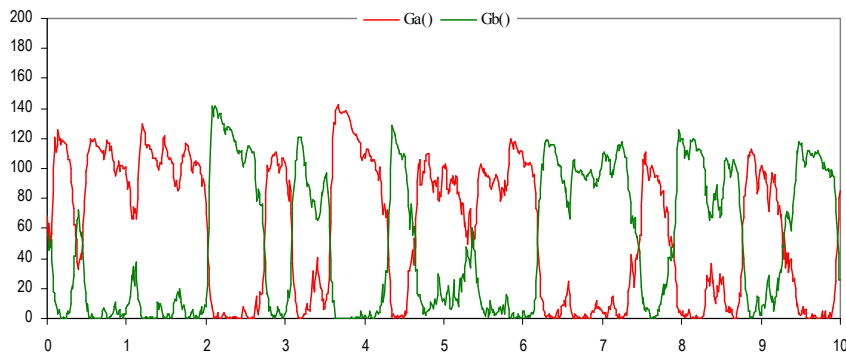
$$[A]^* = r[A][B'] - r[B][A] - rk[A] + rk[B']$$

$$[A']^* = r[B][A] - r[B][A'] + rk[A] - rk[A']$$

$$[B]^* = r[B][A'] - r[A][B] - rk[B] + rk[A']$$

$$[B']^* = r[A][B] - r[A][B'] + rk[B] - rk[B']$$

$[A_d], [B_d]$  are constant;  
assume them both = k



# Conclusions

# Conclusions

- **Stochastic Collectives**
  - Complex global behavior from simple components
  - Emergence of collective functionality from "non-functional" components
  - (Cf. "swarm intelligence": simple global behavior from complex components)
- **Artificial Biochemistry**
  - Stochastic collectives with Law of Mass Interaction kinetics
  - Connections to classical Markov theory, chemical Master Equation, and Rate Equation
- **The agent/automaton/process point of view**
  - *Individuals* that transition between states (vs. *transmutation* between unrelated chemical species)
  - More appropriate for Systems Biology
  - Stochastic  $\pi$ -calculus (SPiM) for investigating stochastic collectives
    - Restriction+Communication  $\Rightarrow$  Polymerization: FSA that "stick together"
- **Properties of collective behavior**
  - ??