## Positive Feedback and Bistable Systems

## Non-Hysteretic Switches; Ultrasensitivity; Memoryless Switches

These systems have no 'memory', that is, once the input signal is removed, the system returns to its original state.


## Hysteretic Switches Bistability

Bistable systems, in contrast, have memory. That is, when switched to one state or another, these systems remain in that state unless forced to change back.

The light switch is a common example of a bistable system from everyday life.


## Hysteretic Switches Bistability

All bistable systems are based around some form of positive feedback loop.

Very common in electronic circuits.


## Synthetic Bistable Systems

T. S. Gardner, C. R. Cantor, and J. J. Collins. Construction of a genetic toggle switch in Escherichia coli. Nature, 403:339-342, (2000).

## Toggle Switch



A number of variants were made but a group of successful constructs were made from Lacl and CI lambda phage repressor. The toggle switch only requires two genes.

## Toggle Bistable Systems



## Bistable Systems



## Bistable Systems



IPTG was used to switch the circuit on.
They used a temperature sensitive repressor (cl) to knock the switch back down (42C).

## Bistable Systems



One that didn't work - repression too weak on one arm of the switch.

## Bistable Systems - Alternative Design

## Rational design of memory in eukaryotic cells

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The ability to logically engineer novel cellular functions promises a deeper understanding of biological systems. Here we demonstrate the rational design of cellular memory in yeast that employs autoregulatory transcriptional positive feedback. We built a set of transcriptional activators and quantitatively characterized their effects on gene expression in living cells. Modeling in conjunction with the quantitative characterization of the acti-vator-promoter pairs accurately predicts the behavior of the memory network. This study demonstrates the power of taking advantage of components with measured quantitative parameters to specify eukaryotic regulatory networks with desired properties.

Supplemental material is available at http://www.genesdev.org.

## Bistable Systems - Alternative Design



VP64 is a virus derived protein domain that is used to enhance the binding efficiency of the DNA binding protein.

## Bistable Systems - Alternative Design



## Controls



## Bistable Systems - Alternative Design

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## With Positive Feedback

## Natural Examples

## Lac Operon



Green fluorescence measures the level of TMG in the cytoplasm and therefore indirectly the lac operon expression level in the Lac operon. TMG is a lactose analog that can be transported by the permease but isn't metabolized.

Multistability in the lactose utilization network of Escherichia coli, Ertugrul M. Ozbudak et al, Nature, vol 247, (2004), 737-740

## Natural Examples

Sin (Sporlation Inhibition) Operon
Sporulation is an expensive and dramatic response to stress.

The sin operon is central to the timing and early dynamics of sporulation. The circuit that makes the final decision is bistable.

http://www2.kenyon.edu
The Bacillus subtilis sin Operon
Christopher A. Voigt, Denise M. Wolf and Adam P. Arkin Genetics, Vol. 169, 1187-1202, March 2005

## Natural Examples

## Stem Cell Fate Decision Circuit



Transcriptional Dynamics of the Embryonic Stem Cell Switch Chickarmane et al. (2006), PLoS Comp Bio, 2(9): e123 doi:10.1371/journal.pcbi. 0020123

## Natural Examples

## Cell Cycle

# A bistable circuit is also at the core of the cell cycle. Part of its function is to prevent the cycle from slipping back to interphase. 

Network dynamics and cell physiology John J. Tyson, Kathy Chen and Bela Novak Nature Reviews Molecular Cell Biology, 2, 908-916 (2001)

Hysteresis meets the cell cycle Mark J. Solomon Proc Natl Acad Sci U S A. 2003 February 4; 100(3): 771-772.

## Bistable Systems

## Natural Bistable Networks

E. M. Ozbudak, M. Thattai, H. N. Lim, B. I. Shraiman, and A. Van Oudenaarden. Multistability in the lactose utilization network of Escherichia coli. Nature, 427:737-740, (2004).
W. Xiong and J. E. Ferrell. A positive-feedbackbased bistable `memory module' that governs a cell fate decision. Nature, 426:460-465, 2003.

Multistability in the lactose utilization network of Escherichia coli, Ertugrul M. Ozbudak et al, Nature, vol 247, (2004), 737-740

Review: Phenotypic variation in bacteria: the role of feedback regulation Nature Reviews Microbiology 4, 259-271 (April 2006) , Wiep Klaas Smits et al.

## Synthetic Bistable Networks

T. S. Gardner, C. R. Cantor, and J. J. Collins. Construction of a genetic toggle switch in Escherichia coli. Nature, 403:339342, (2000).

Prediction and measurement of an autoregulatory genetic module Farren J. Isaacs, Jeff Hasty, Charles R. Cantor, and J. J. Collins, PNAS, 100:7714 (2003)

Ajo-Franklin et al. Rational design of memory in eukaryotic cells. Genes and Dev. 21:2271-2276 (2007)

An engineered epigenetic transgene switch in mammalian cells. Nature Biotechnology 22, 867-870 (2004), Beat P Kramer et al.

## Bistable Systems



$$
\begin{aligned}
& \text { p = defn cell } \\
& \quad \$ \mathrm{So}->\mathrm{S} 1 ; \quad 0.5+\mathrm{Vmax}^{*} \mathrm{~S} 1^{\wedge} \mathrm{n} /\left(15+\mathrm{S} 1^{\wedge} \mathrm{n}\right) ; \\
& \quad \mathrm{S} 1->\$ \mathrm{~K} 1 ; \mathrm{k} 1^{*} \mathrm{~S} 1 ; \\
& \text { end; } \\
& \text { p.Xo }=1 ; \\
& \text { p.X1 }=0 ; \\
& \text { p.S1 }=1 ; \\
& \text { p.n }=4 ; \\
& \text { p. } \mathrm{Vmax}=10 ; \\
& \text { p.k1 }=2 ;
\end{aligned}
$$

## Bistable Systems




$\longleftarrow$ High State

Time

## Bistable Systems



## Bistable Systems



## Bistable Systems



## Bistable Systems



## Bistable Systems



## Bistable Systems



## Bistable Systems



## Bistable Systems



## Bistable Systems




$\longleftarrow$ High State

Time

## Bifurcation Plots



Parameter: k1

## Bifurcation Plots




Parameter: Vmax on v1 Generated using Jarnac/Excel

> _- Upward scan
> Downward scan


## Jacnac Script to Generate Previous Plot

```
p = defn cell
    $Xo -> S1; 0.5 + Vmax*S1^n/(15 + S1^n);
    S1 -> $X1; k1*S1;
end;
p.Xo = 0.1; // downward scan
p.X1 = 0; m2 = matrix (50, 2);
p.S1 = 1; p.sim.eval (0, 100, 100, []);
p.n = 4; p.ss.eval;
p.Vmax = 0.1;
p.k1 = 1;
// Upward scan
m1 = matrix (50, 2);
p.sim.eval (0, 100, 100, []);
p.ss.eval;
for i = 1 to 50 do
    begin
    p.Vmax = p.Vmax + 0.5;
    p.sim.eval (0, 100, 100, []);
    p.ss.eval;
    m1[i] = {p.Vmax, p.S1};
    end;
graph (m1);
```


## Irreversible Bistable System






Sniffers, buzzers, toggles and blinkers: dynamics of regulatory and signaling pathways in the cell John J Tysony, Katherine C Chenz and Bela Novak Current Opinion in Cel Biology, vol 15, 221-231 (2003)

## Toggle System

$$
\begin{aligned}
\dot{\alpha} & =\frac{\alpha_{1}}{1+v^{\beta}}-u \\
\dot{x} & =\frac{\alpha_{2}}{1+u^{\gamma}}-v \\
u & =\frac{\alpha_{1}}{1+v^{\beta}} \\
v & =\frac{\alpha_{2}}{1+u^{\gamma}}
\end{aligned}
$$

These are called Nullclines


## Toggle System - Jarnac Model

```
p = defn cell
    $x -> u; al/(1 + v^g);
        u -> $w; u;
        v -> $w; v;
        $x -> v; a2/(1 + u^b);
```

```
p.sim.eval (0, 100, 100, []);
p.ss.eval;
// Unstable point
println "Eigenvalues:";
println eigenvalues (p.jac);
println "Unstable: u = ", p.u, " v = ",
p.v;
```

end;
p.u $=0$;
P.v $=0$;
P.x $=0$;
p.g $=3 ;$
p.b $=3$;
p.a1 = 10;
p.a2 $=10 ;$

```
// The first stable point
p.u = 0.1;
p.v = 1;
m = p.sim.eval (0, 100, 100, [<p.time>,
<p.u>, <p.v>]);
p.ss.eval;
println "Stable A: u = ", p.u, " v = ",
P.v;
```

// The second stable point
p.u $=1$;
$\mathrm{P} \cdot \mathrm{v}=1$;
$m=p . s i m . e v a l(0,100,100, \quad[<p . t i m e>$,
<p.u>, <p.v>]);
p.ss.eval;
println "Stable B: u = ", p.u, " v = ", 35
P.v;

## Noise and Bistable Systems

If the jump distance between the two states is small compared to the level of noise, then bistable switches can spontaneously switch between the two states.



C



Chang et al. BMC Cell Biology 2006
7:11 doi:10.1186/1471-2121-7-11

