## Mathematical Cell Biology Graduate Summer Course University of British Columbia, May 1-31, 2012 Leah Edelstein-Keshet

## Switches, Oscillators, and the Cell Cycle

www.math.ubc.ca/MkeshetMCB2012

## What to notice so far

- There are two ways to design a regulatory cell network:
- (1) protein-protein interactions (mutual phosphorylation, etc etc) (time scale: secmin)
- (2) gene networks (time scale: hrs day)


## Gene circuits

## Gene $U$



Gene $V$

## Construction of a genetic toggle

 switch in Escherichia coliTimothy S. Gardner* $\dagger$, Charles R. Cantor* \& James J. Collins ${ }^{*} \dagger$
Noise-based switches and amplifiers for gene expression
Jeff Hasty*†, Joel Pradines*, Milos Dolnik**, and J. J. Collins*


## Protein circuits



## Protein circuits



## Other things to notice

- By building up feedback interactions it is possible to obtain new dynamics :
- (1) Simple decay to steady state
- (2) Switch (bistability)
- (3) Oscillator (stable cycles)


## No feedback



Decay to a single stable steady
state

## No feedback

Decay to a single stable steady
state

## Positive feedback

Bistability and switch-like

behaviour
possible

## Add negative feedback

Stable cycles possible

## Example: Phosphorylation cycle



## Add positive feedback to kinase



Bistability and switch-like behaviour possible

## Add further negative feedback



Stable cycles possible phosphatase

## Simple mathematical example

$$
\frac{d x}{d t}=c\left(x-\frac{1}{3} x^{3}+A\right)
$$



## A switch (Generic bistability)

$$
\frac{d x}{d t}=c\left(x-\frac{1}{3} x^{3}+A\right)
$$




The parameter A controls the switch

## A controls the switch



## "Switch" (Generic bistability)

$\frac{d x}{d t}=c\left(x-\frac{1}{3} x^{3}+y\right)$


The "parameter" $y$ controls the switch

The curve $d x / d t=0$

## y controls the switch



## As $y$ varies, we can go around the

 hysteresis loop

## Add negative feedback to the switch



## Now $y$ is dynamic

$$
\begin{aligned}
& \frac{d x}{d t}=c\left[x-\frac{1}{3} x^{3}-y\right] \\
& \frac{d y}{d t}=\frac{1}{c}[x+a-b y] .
\end{aligned}
$$



## Switch becomes an oscillator

$$
\begin{aligned}
& \frac{d x}{d t}=c\left[x-\frac{1}{3} x^{3}-y\right] \\
& \frac{d y}{d t}=\frac{1}{c}[x+a-b y] .
\end{aligned}
$$

Example:
This is the Fitzhugh
Nagumo model

## "Switch" (Generic bistability)

$$
\frac{d x}{d t}=c\left(x-\frac{1}{3} x^{3}+v\right)
$$




Bifurcation
diagram

## "Switch" (Generic bistability)

$\frac{d x}{d t}=c\left(x-\frac{1}{3} x^{3}+y\right)$


## "Switch" (Generic bistability)

$\frac{d x}{d t}=c\left(x-\frac{1}{3} x^{3}+y\right)$



## The $x y$ phase plane



## Oscillator



## Get an oscillator



## Application to the Cell Cycle

- Work by John Tyson (Virginia Tech):
- The control of the cell division is maintained by an intricate web of signaling pathways, that incorporates many signals to decide when to divide.
- The cycle has "checkpoints" at which decisions are made.






## Checkpoints

in phase
G1 there is low Cdk and low cyclin

buildup of cyclin/Cdk

APC is activated, leading to destruction of cyclin and loss of CdK activity.

## Cyclin is produced and degraded


cyclin: $\quad \frac{d Y}{d t}=k_{1}-\left(k_{2 p}+k_{2 p p} P\right) Y$,

## APC is inactivated by phosphorylation

Active form (no phosphate)


## APC is inactivated by phosphorylation

This will be modeled by a typical equation that we have already seen.


$$
\frac{d P}{d t}=\frac{V_{i} P_{i}}{J_{3}+P_{i}}-\frac{V_{a} P}{J_{4}+P} .
$$

## Schematic



$$
\frac{d P}{d t}=\frac{V_{i} P_{i}}{J_{3}+P_{i}}-\frac{V_{a} P}{J_{4}+P}
$$

## Negative feedback



## APC and Cyclin mutually antagonistic



$$
\begin{aligned}
\text { cyclin: } & \frac{d Y}{d t}=k_{1}-\left(k_{2 p}+k_{2 p p} P\right) Y, \\
\text { APC: } & \frac{d P}{d t}=\frac{V_{i} P_{i}}{J_{3}+P_{i}}-\frac{V_{a} P}{J_{4}+P} .
\end{aligned}
$$



## Model

$$
\begin{aligned}
\text { cyclin: } & \frac{d Y}{d t}=k_{1}-\left(k_{2 p}+k_{2 p p} P\right) Y, \\
\text { APC: } & \frac{d P}{d t}=\frac{V_{i} P_{i}}{J_{3}+P_{i}}-\frac{V_{a} P}{J_{4}+P} .
\end{aligned}
$$

## Model

$$
\begin{aligned}
& \frac{d Y}{d t}=k_{1}-\left(k_{2 p}+k_{2 p p} P\right) Y, \\
& \frac{d P}{d t}=\frac{\left(k_{3 p}+k_{3 p p} A\right) P_{i}}{J_{3}+P_{i}}-k_{4} m \frac{Y P}{J_{4}+P} .
\end{aligned}
$$

$$
P_{i}=1-P .
$$

## Model

$$
\begin{aligned}
& \frac{d Y}{d t}=k_{1}-\left(k_{2 p}+k_{2 p p} P\right) Y, \\
& \frac{d P}{d t}=\frac{\left(k_{3 p}+k_{3 p p} A\right)(1-P)}{J_{3}+(1-P)}-k_{4} m \frac{Y P}{J_{4}+P}
\end{aligned}
$$

## Bistable switch

Cyclin


Cell Mass

## Cell mass is the parameter that flips the switch




## Activation of APC by Cdc20 ("A")



A= Cdc20. It increases sharply during metaphase and activates APC

## A is turned on by cyclin (sigmoidally)



## Activation of APC by Cdc20 ("A")



A= Cdc20. It increases sharply during metaphase and activates APC

## Three variable model:

$$
\begin{aligned}
& \frac{d Y}{d t}=k_{1}-\left(k_{2 p}+k_{2 p p} P\right) Y, \\
& \frac{d P}{d t}=\frac{\left(k_{3 p}+k_{3 p p} A\right)(1-P)}{J_{3}+(1-P)}-k_{4} m \frac{Y P}{J_{4}+P}, \\
& \frac{d A}{d t}=k_{5 p}+k_{5 p p} \frac{\left(m Y / J_{5}\right)^{n}}{1+\left(Y m / J_{5}\right)^{n}}-k_{6} A .
\end{aligned}
$$

## Now we get a cell cycle.




