

# A systems approach to biology

SB200

Lecture 2

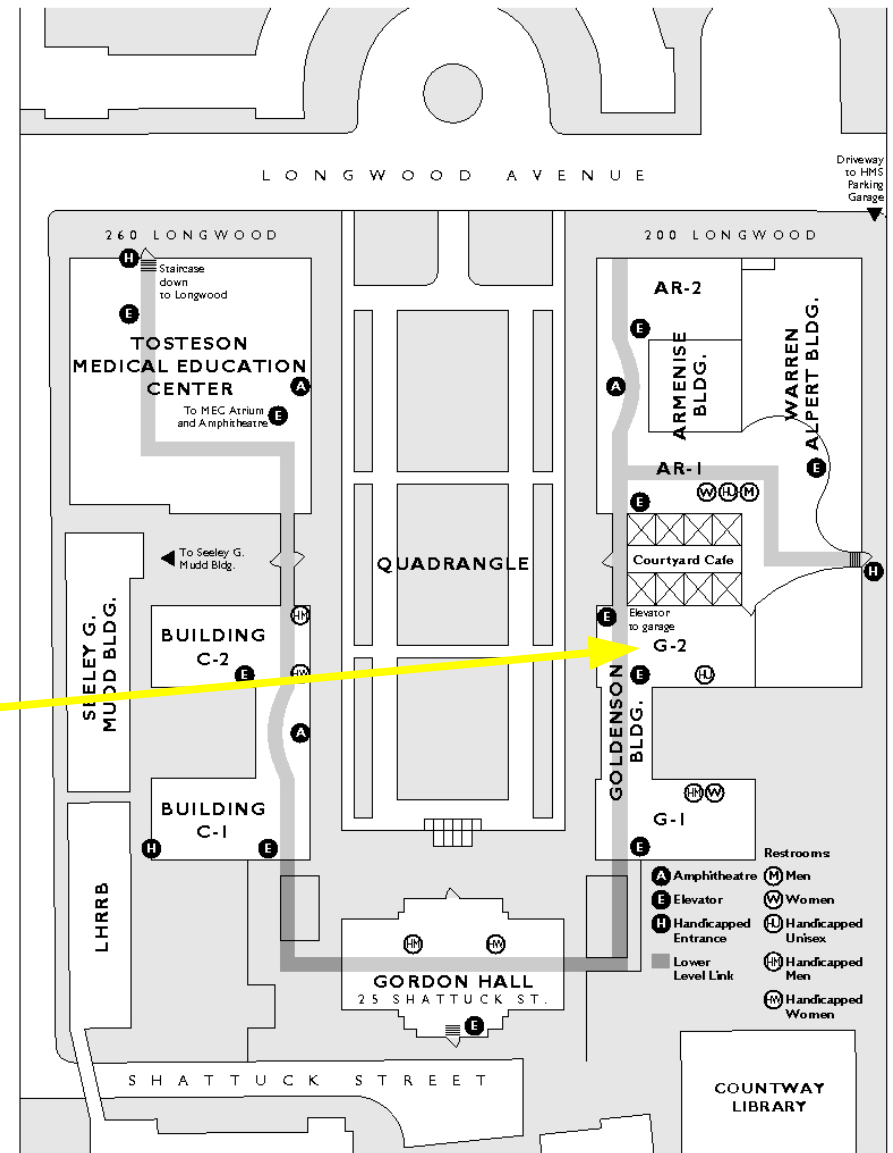
18 September 2008

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**I do not hold formal office hours.  
Please send me an e-mail if you have  
questions or would like to arrange a  
time to meet. My lab is in Goldenson  
504 on the Harvard Medical School  
campus.**

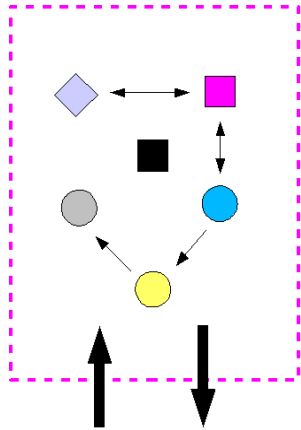
`jeremy@hms.harvard.edu`



<http://www.hms.harvard.edu/about/maps/quadmap.html>

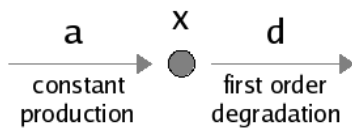
# Recap of Lecture 1

## systems biology



## mathematical foundations

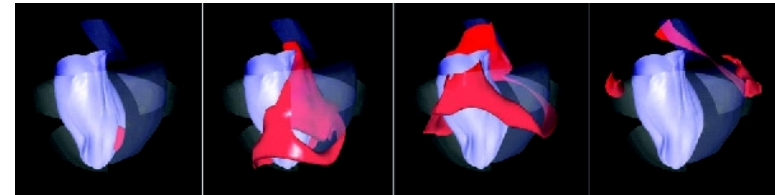
### differential equations



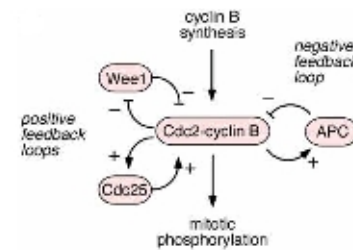
$$x_t = \frac{a}{d} + \left(x_0 - \frac{a}{d}\right) \exp(-dt)$$

## role of mathematics

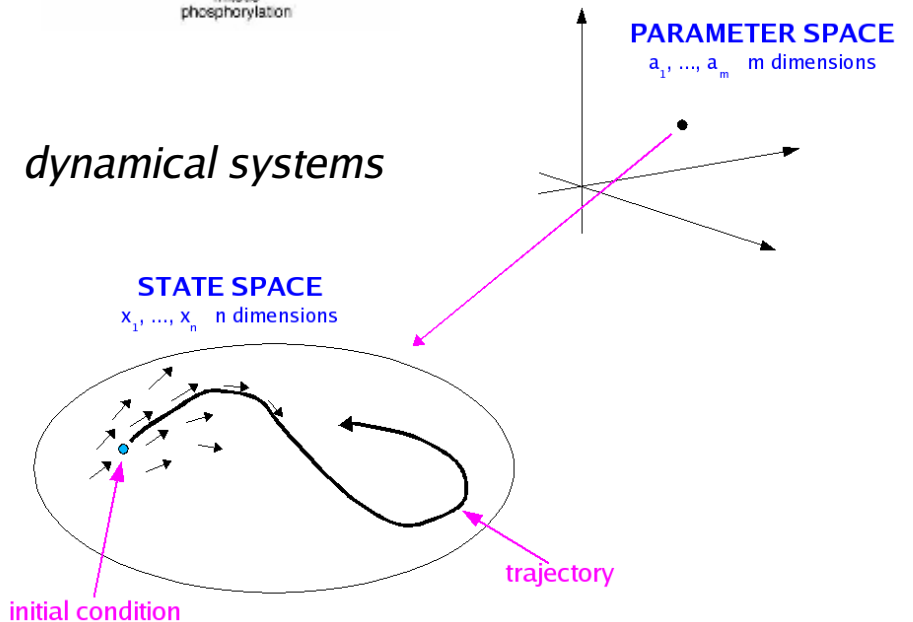
### thick models



### thin models - feedback control "an satz"

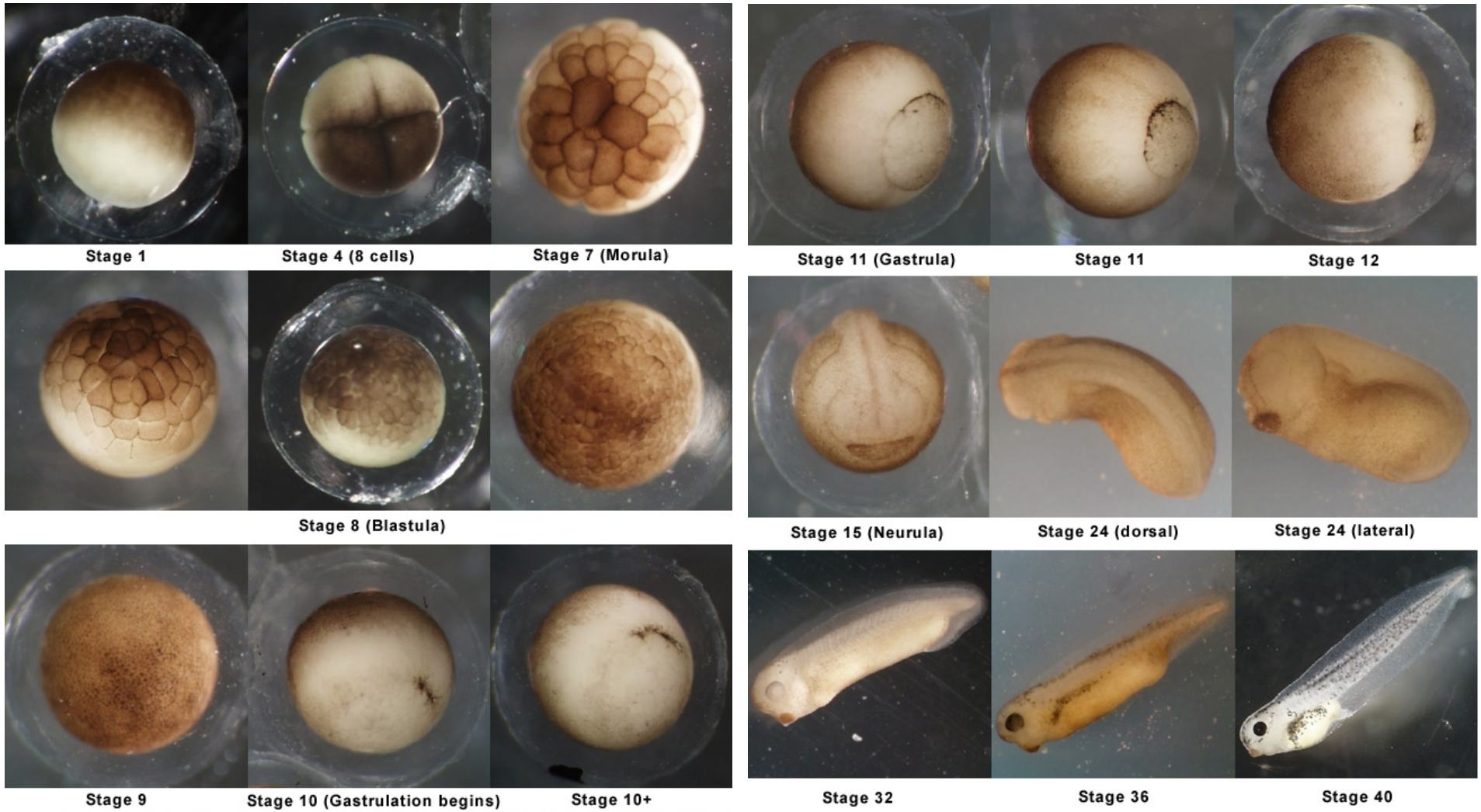


### dynamical systems



**decision making**

# decisions, decisions, decisions – making the organism

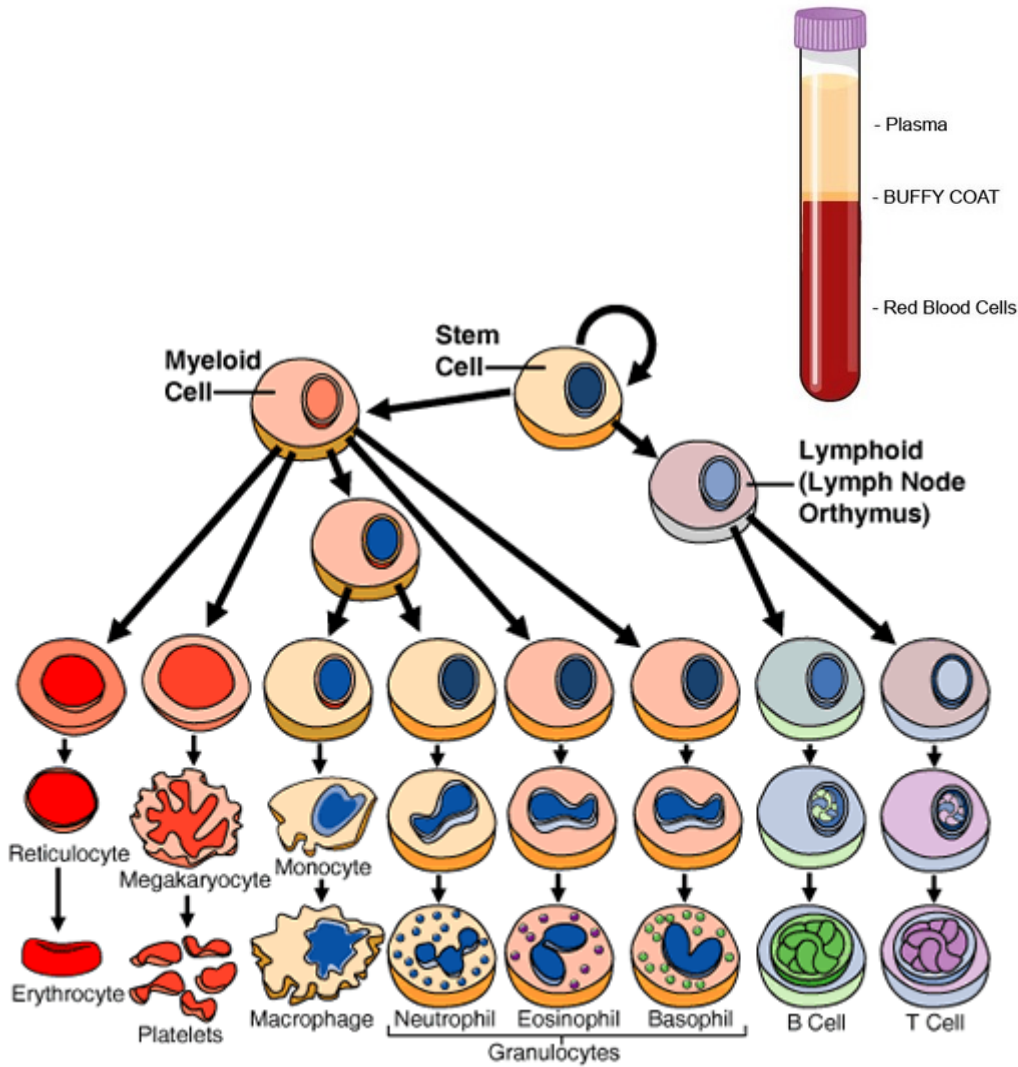


*developmental stages in Xenopus laevis*

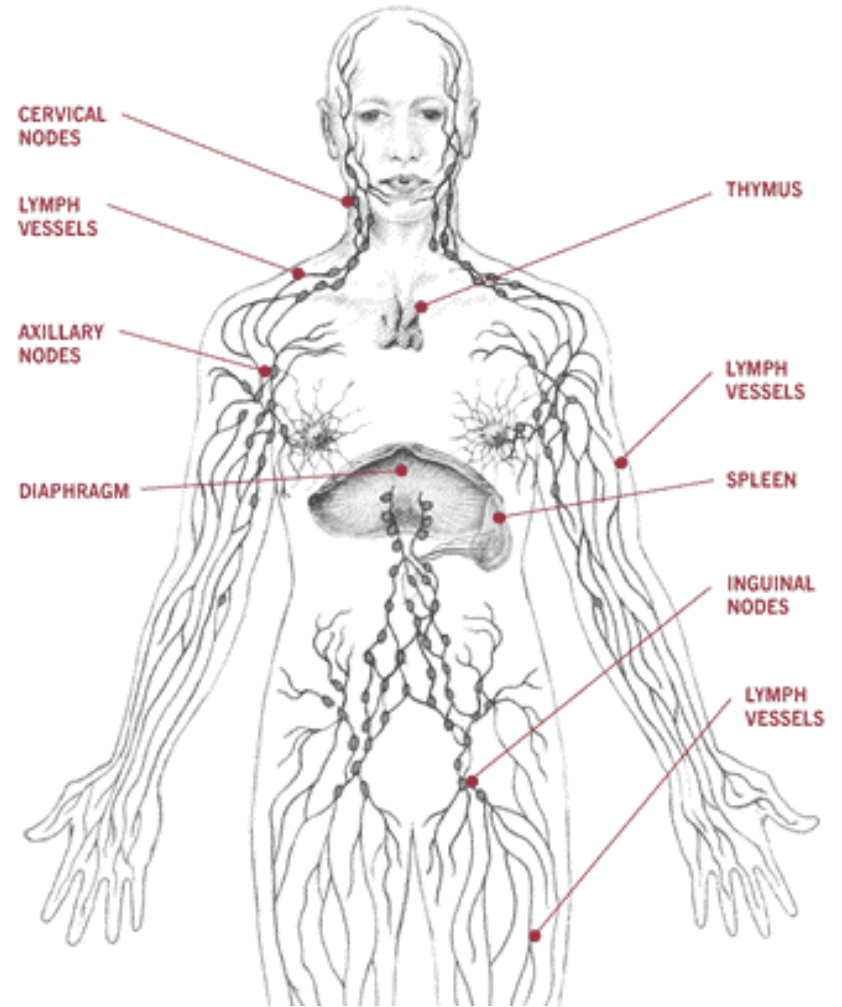
[www.xenbase.org](http://www.xenbase.org) ,

Manuel Thery & Michel Bornens, Institut Curie, Paris

# decisions, decisions, decisions – running the organism



*haematopoiesis*



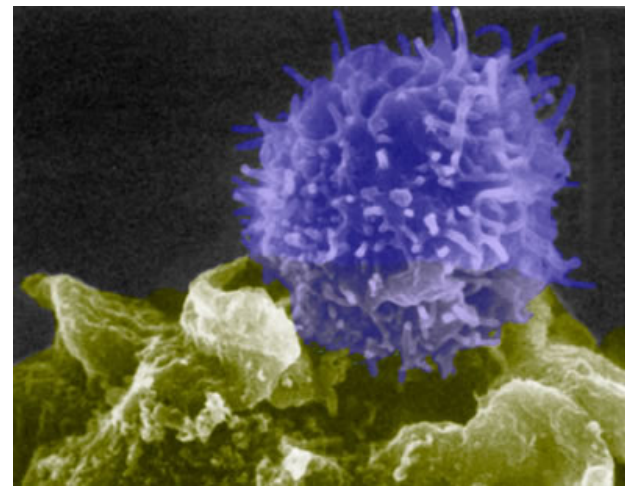
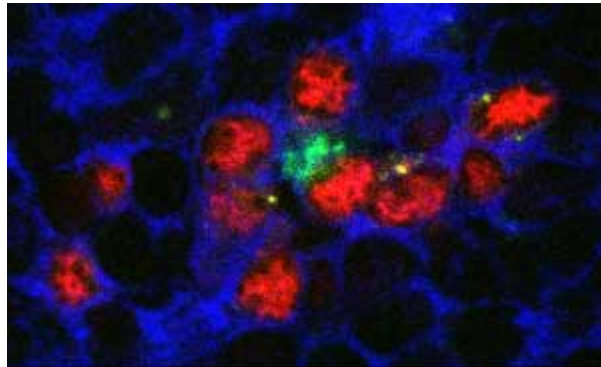
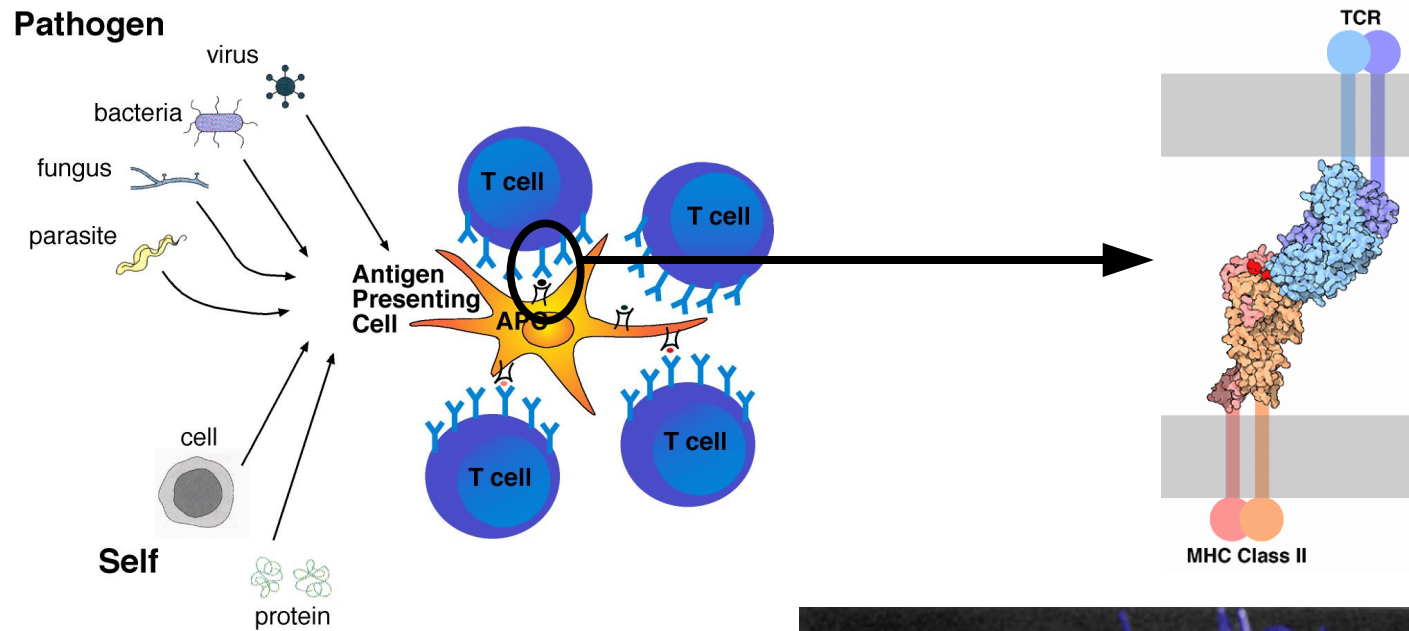
*lymphatic system*



# decisions, decisions, decisions – protecting the organism



Mempel, Henrickson, von Andrian, T-cell priming by dendritic cells in lymph nodes occurs in three distinct phases", Nature 427:154-9 2004



*T cells interrogating antigen-presenting cells – friend or foe?*

how do the molecular mechanisms (feedback control structures, etc) achieve

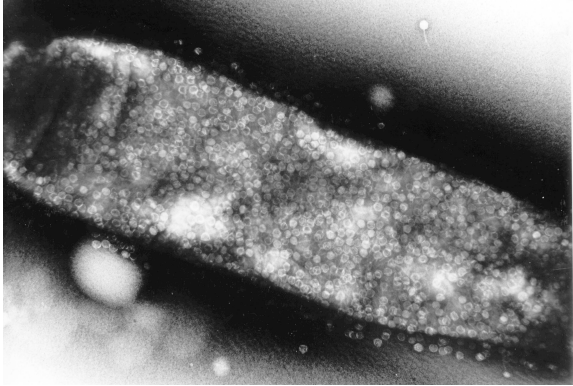
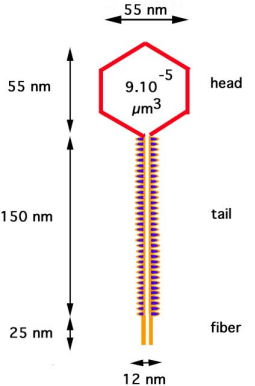
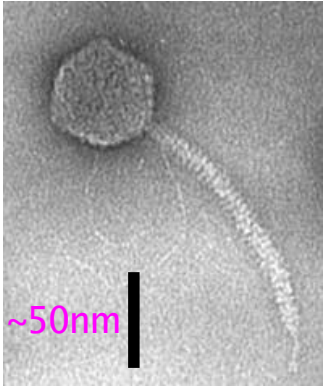
**multiple states?**  
**decisiveness?**

**sensitivity?**  
**resolution?**  
**speed?**

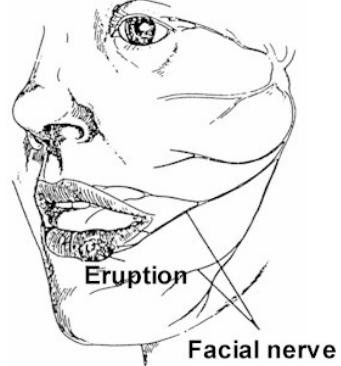
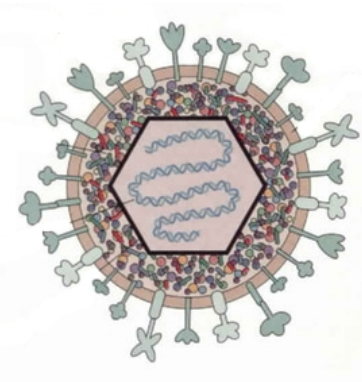
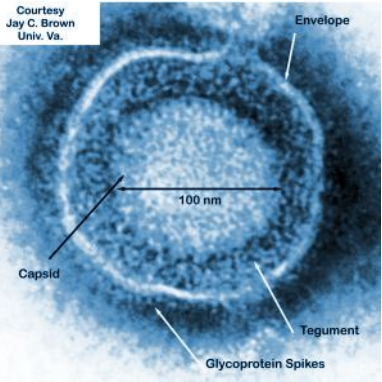


# **the lysis-lysogeny decision in viruses**

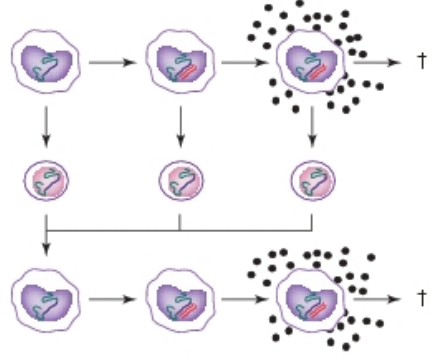
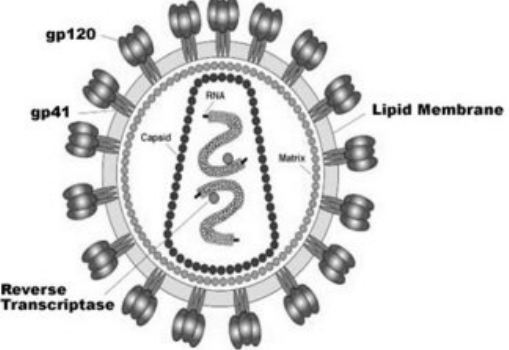
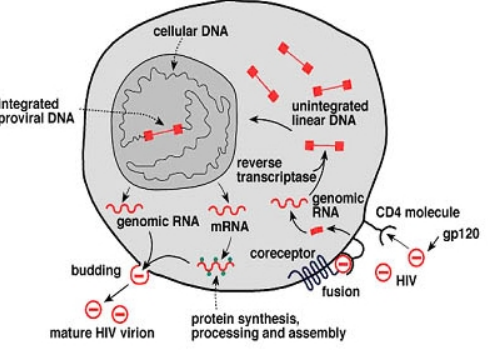
# phage lambda



# HSV 1

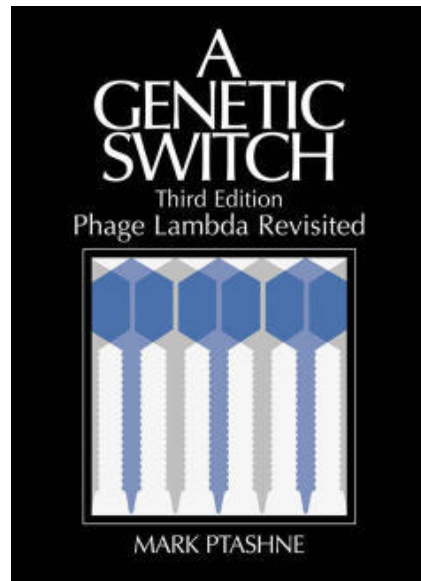


# HIV



# phage lambda

*lysis-lysogeny decision*

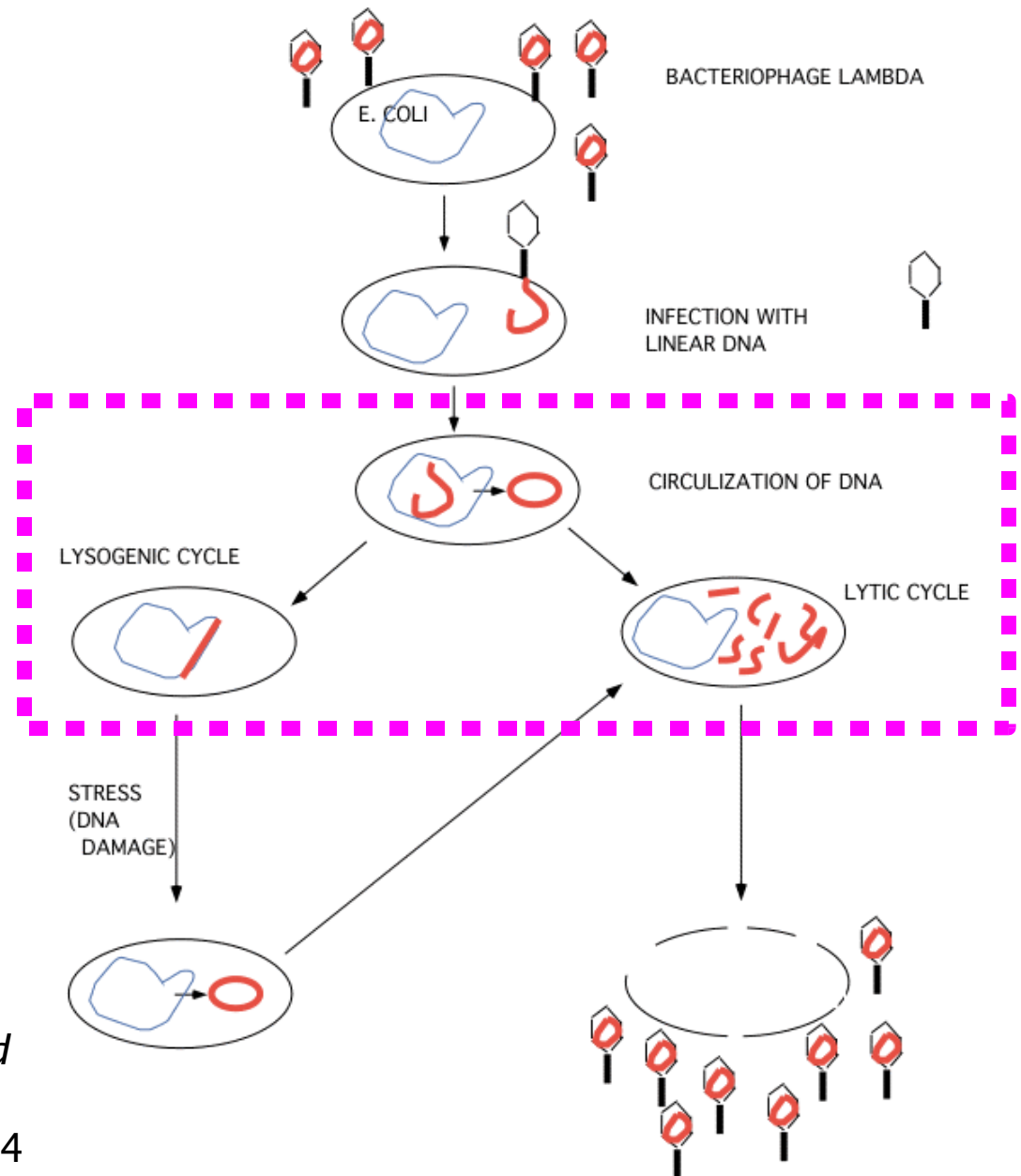


Ptashne

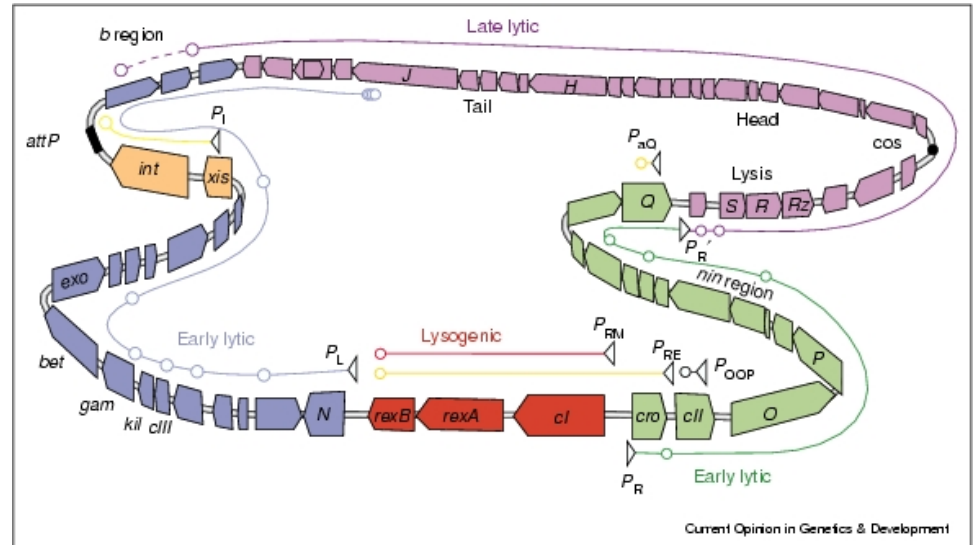
*A Genetic Switch: Phage Lambda Revisited*

3<sup>rd</sup> Edition

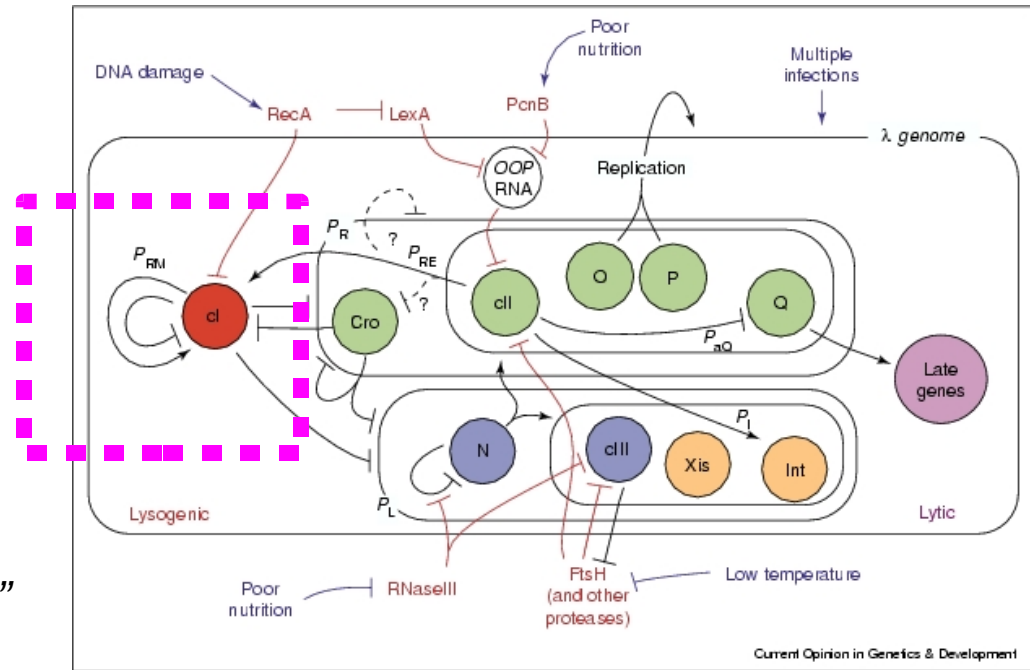
Cold Spring Harbor Laboratories Press 2004



# phage lambda

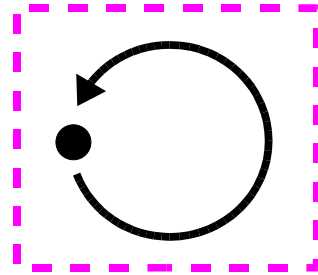


Friedman & Court, *Bacteriophage λ: alive and well and still doing its thing*, Curr Op Microbiology 4:201-7 2001



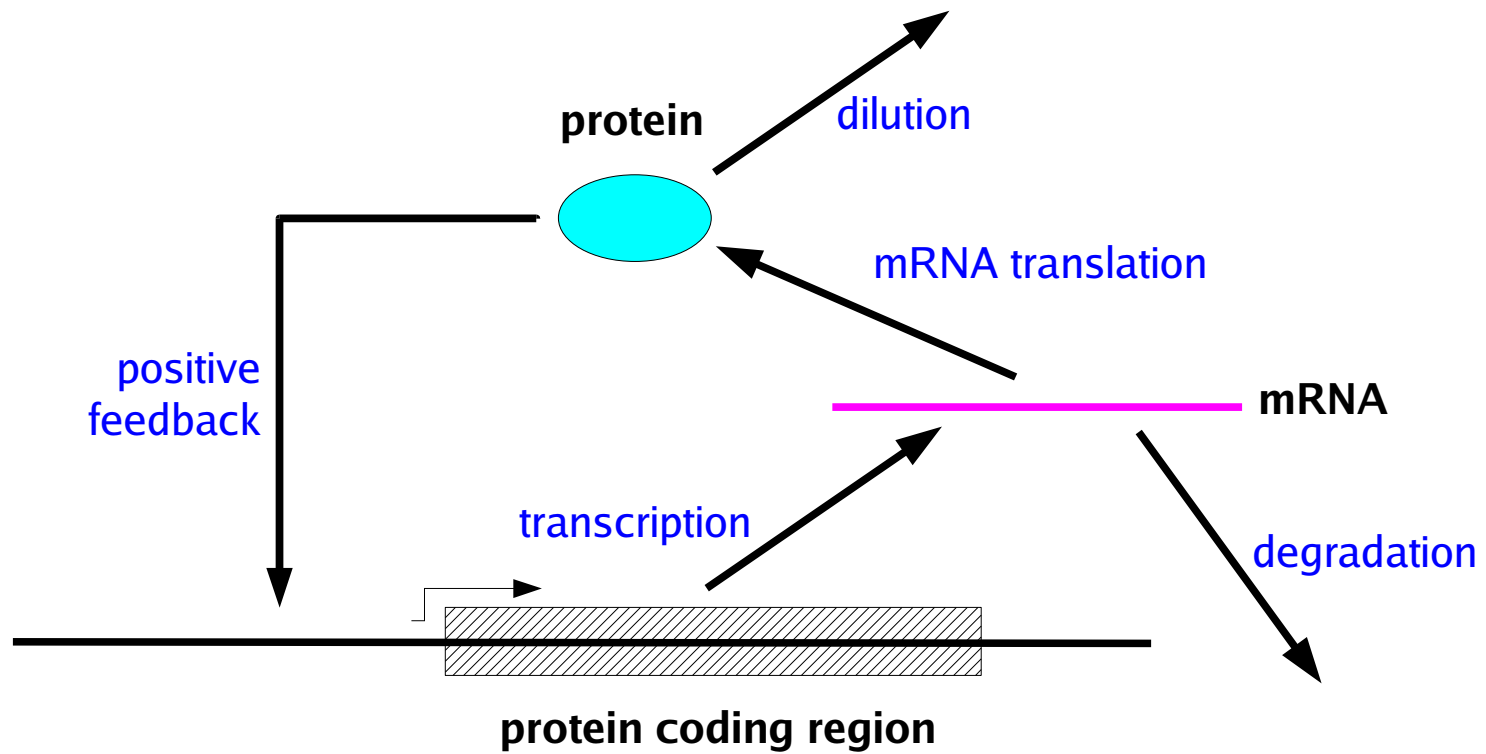
Dodd, Shearwin & Egan  
 "Revised gene regulation in bacteriophage λ"  
 Curr Op Gen Dev 15:145-52 2005

positive feedback control structure that exhibits decision making

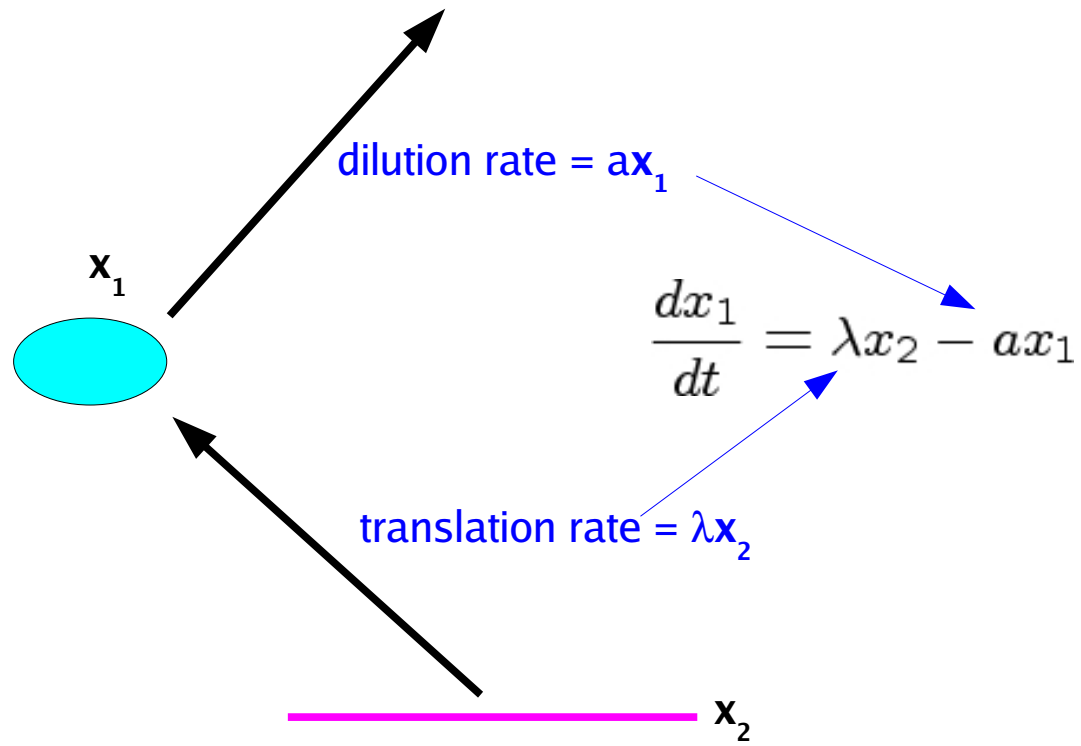


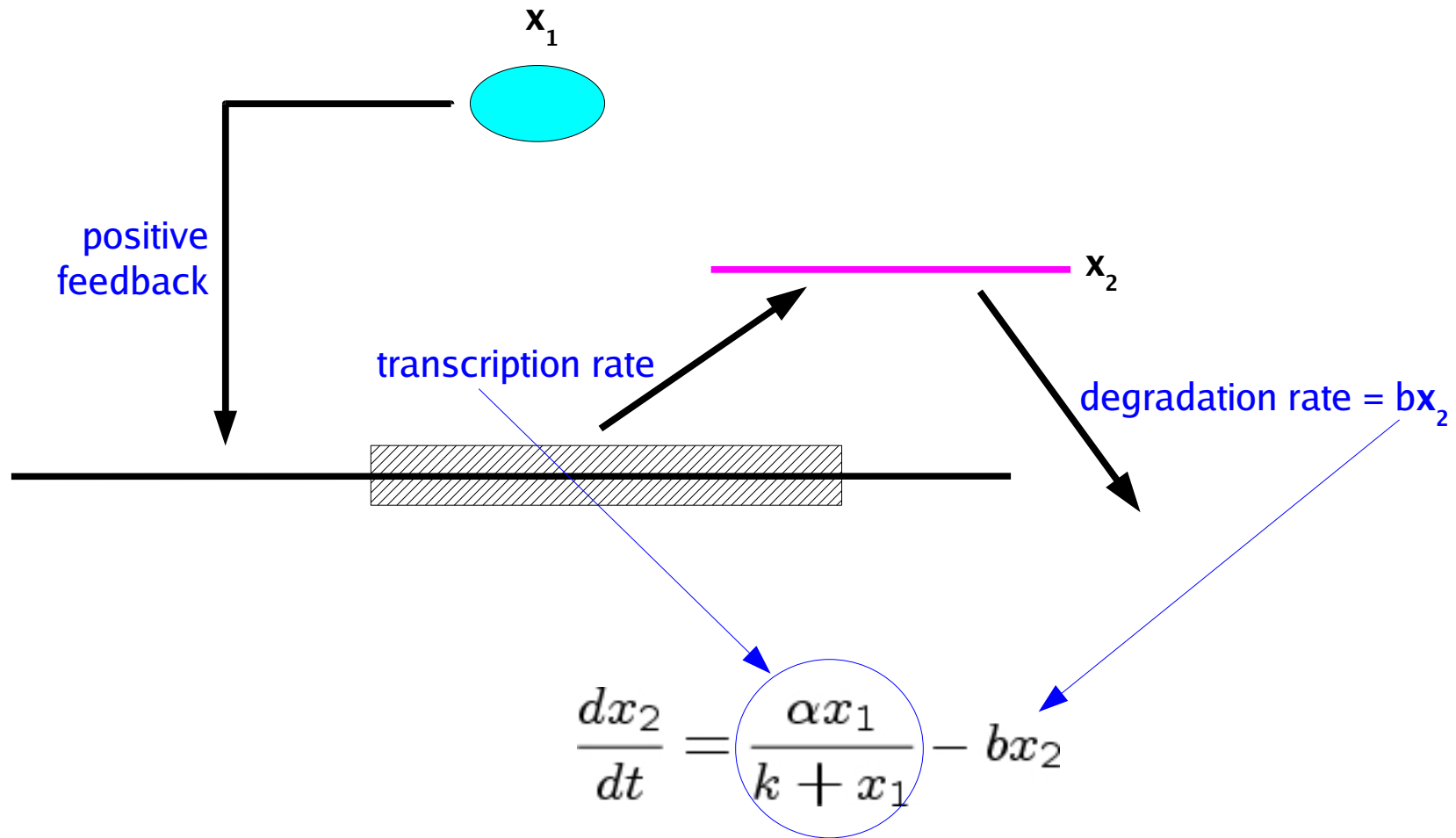
synthetically engineered –

Isaacs et al, "*Prediction and measurement of an autoregulatory genetic module*", PNAS  
**100**:7714-9 2003









$x_1$  = protein concentration  
 $x_2$  = mRNA concentration

state space

$$\frac{dx_1}{dt} = \lambda x_2 - ax_1$$

dynamical equations

$$\frac{dx_2}{dt} = \frac{\alpha x_1}{k + x_1} - bx_2$$

$\lambda$	mRNA translation rate	$(\text{sec})^{-1}$
$a$	protein degradation rate	$(\text{sec})^{-1}$
$b$	mRNA degradation rate	$(\text{sec})^{-1}$
$\alpha$	maximal gene expression rate	$(\text{M})(\text{sec})^{-1}$
$k$	Mic haelis-Menten”c onstant	$(\text{M})$

parameters

the first question to ask is -  
**are there any steady states?**

in two dimensions, the way to work this out is to determine the  
**NULLCLINES**

$$dx_1/dt = 0 \quad dx_2/dt = 0$$

$$x_2 = \left(\frac{a}{\lambda}\right) x_1$$

$$x_2 = \left(\frac{\alpha}{b}\right) \frac{x_1}{k + x_1}$$

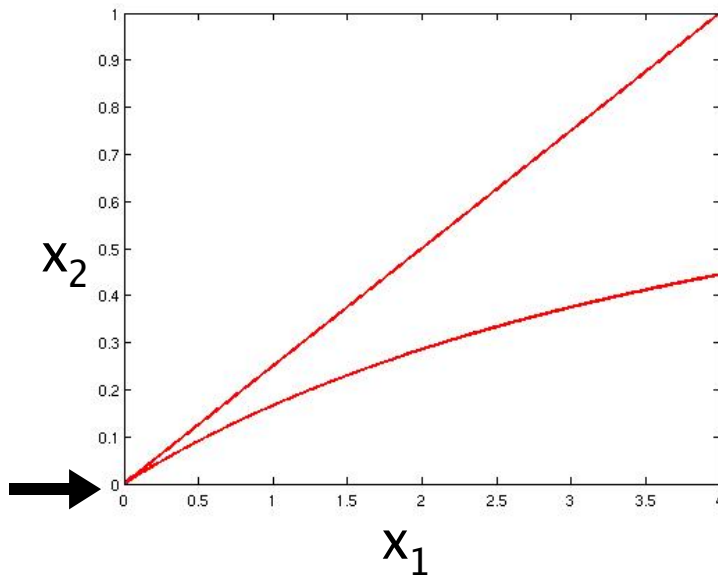
**steady states occur at the intersections of the nullclines**

# Two cases to consider

$k \geq \alpha\lambda/ab$  parameters  
Michaelis-Menten constant for transcription  
ratio of synthesis to degradation

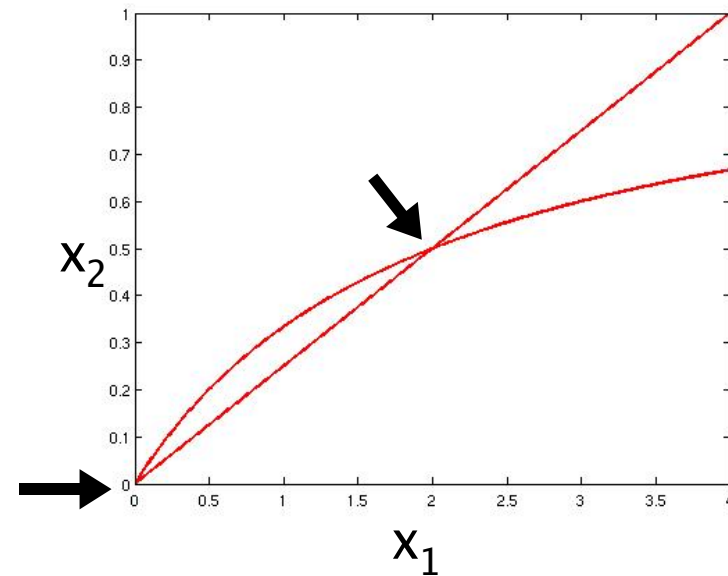
$$k < \alpha\lambda/ab$$

STATE SPACE



one steady state

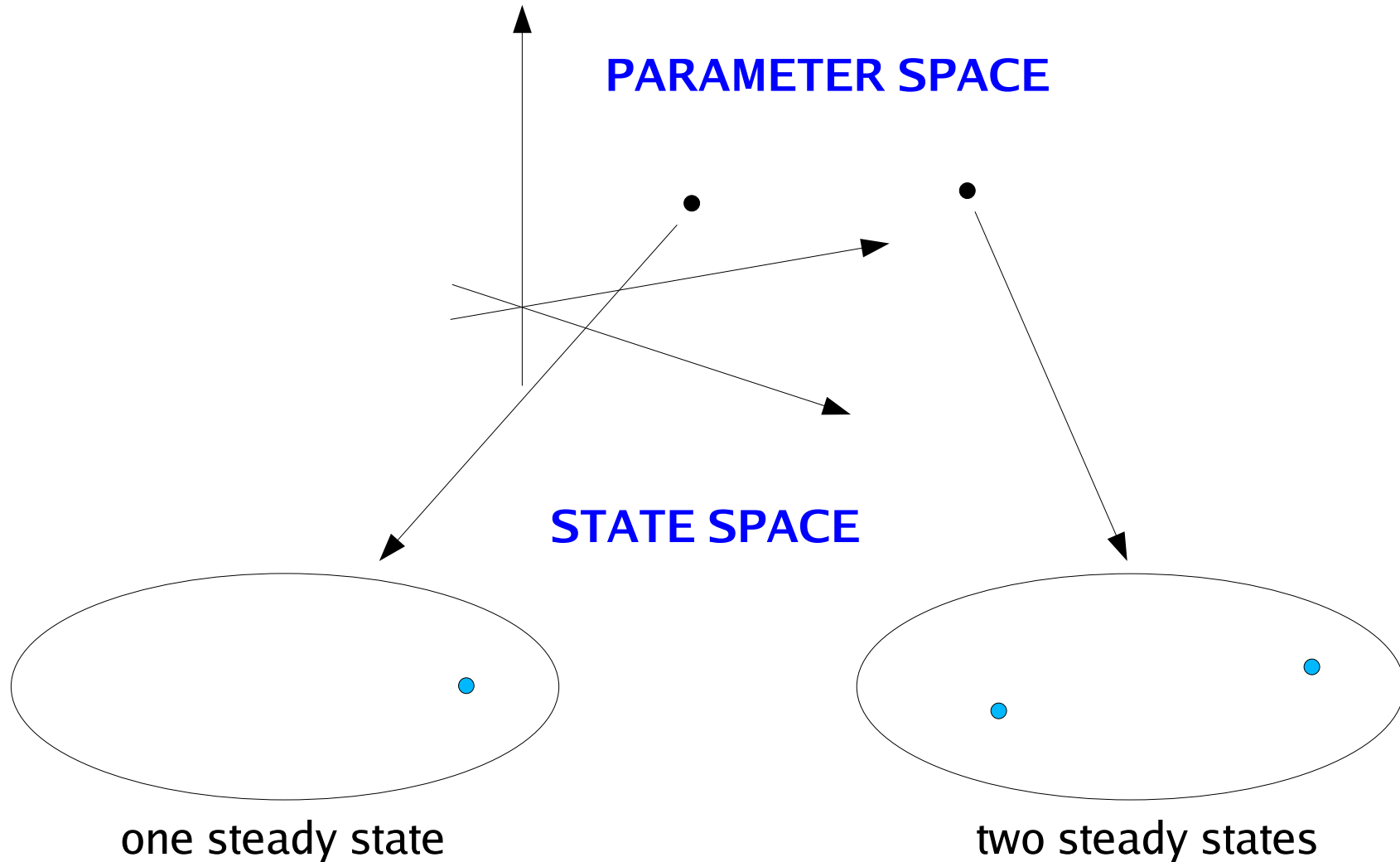
STATE SPACE



two steady states

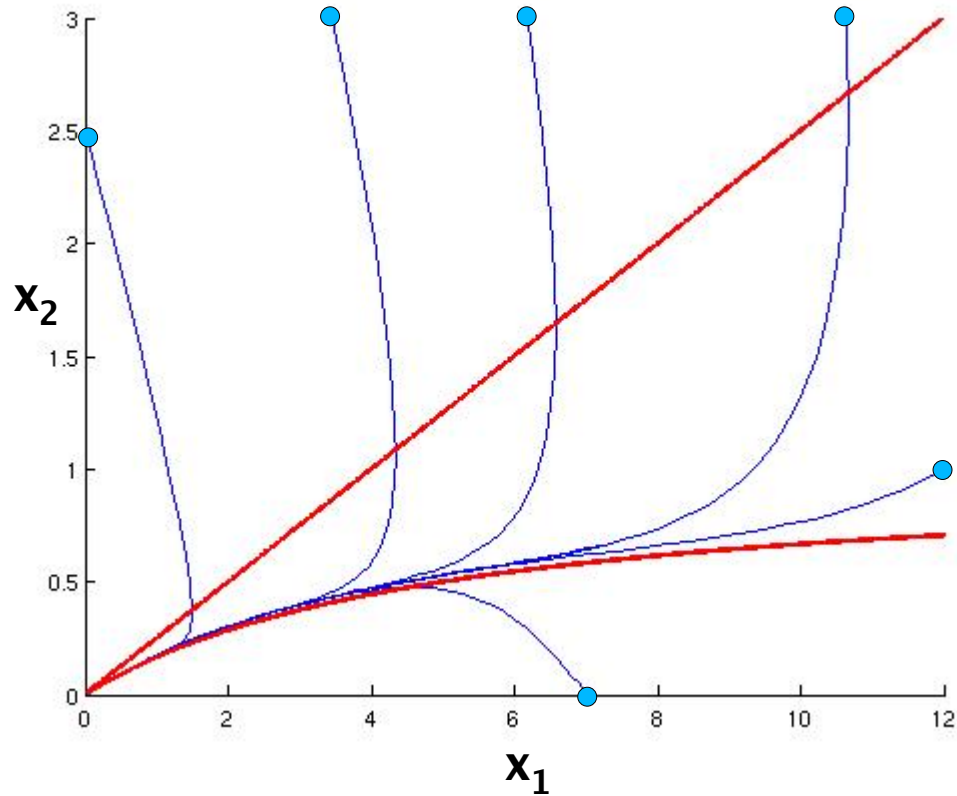
# BIFURCATION

*a qualitative change in dynamics due to variation of parameters*





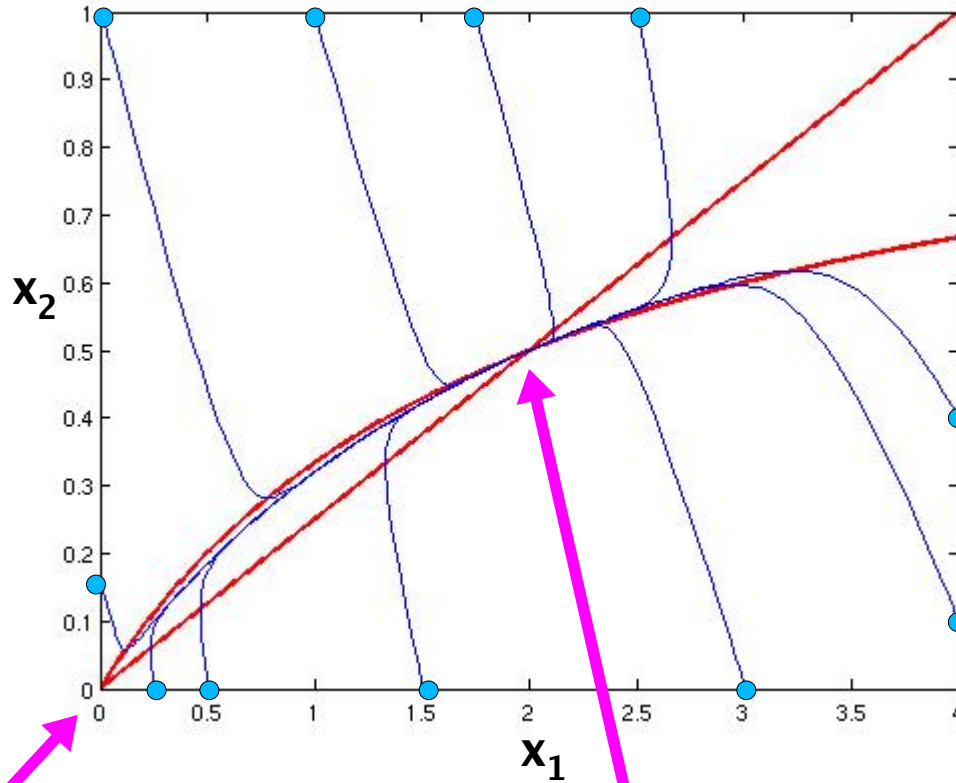
$$k \geq \alpha\lambda/ab$$



$\lambda$	0.08	(sec) <sup>-1</sup>
$a$	0.02	(sec) <sup>-1</sup>
$b$	0.1	(sec) <sup>-1</sup>
$\alpha$	0.1	( $\mu\text{M}$ )(sec) <sup>-1</sup>
$k$	5	( $\mu\text{M}$ )

$\alpha\lambda/ab$	= 4
$k$	= 5

$$k < \alpha\lambda/ab$$



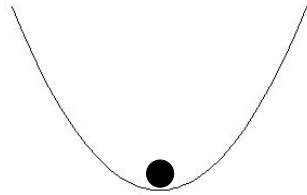
$\lambda$	0.08	(sec) <sup>-1</sup>
$a$	0.02	(sec) <sup>-1</sup>
$b$	0.1	(sec) <sup>-1</sup>
$\alpha$	0.1	( $\mu$ M)(sec) <sup>-1</sup>
$k$	2	( $\mu$ M)

$\alpha\lambda/ab$	= 4
$k$	= 2

unstable

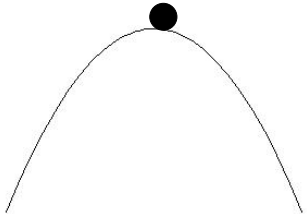
stable

stable steady state



any sufficiently small perturbation  
returns back to the steady state

unstable steady state



not stable - some perturbations do  
not return

You can prove **instability** by simulation but  
you can never prove **stability**

changing parameter values can cause a **bifurcation**

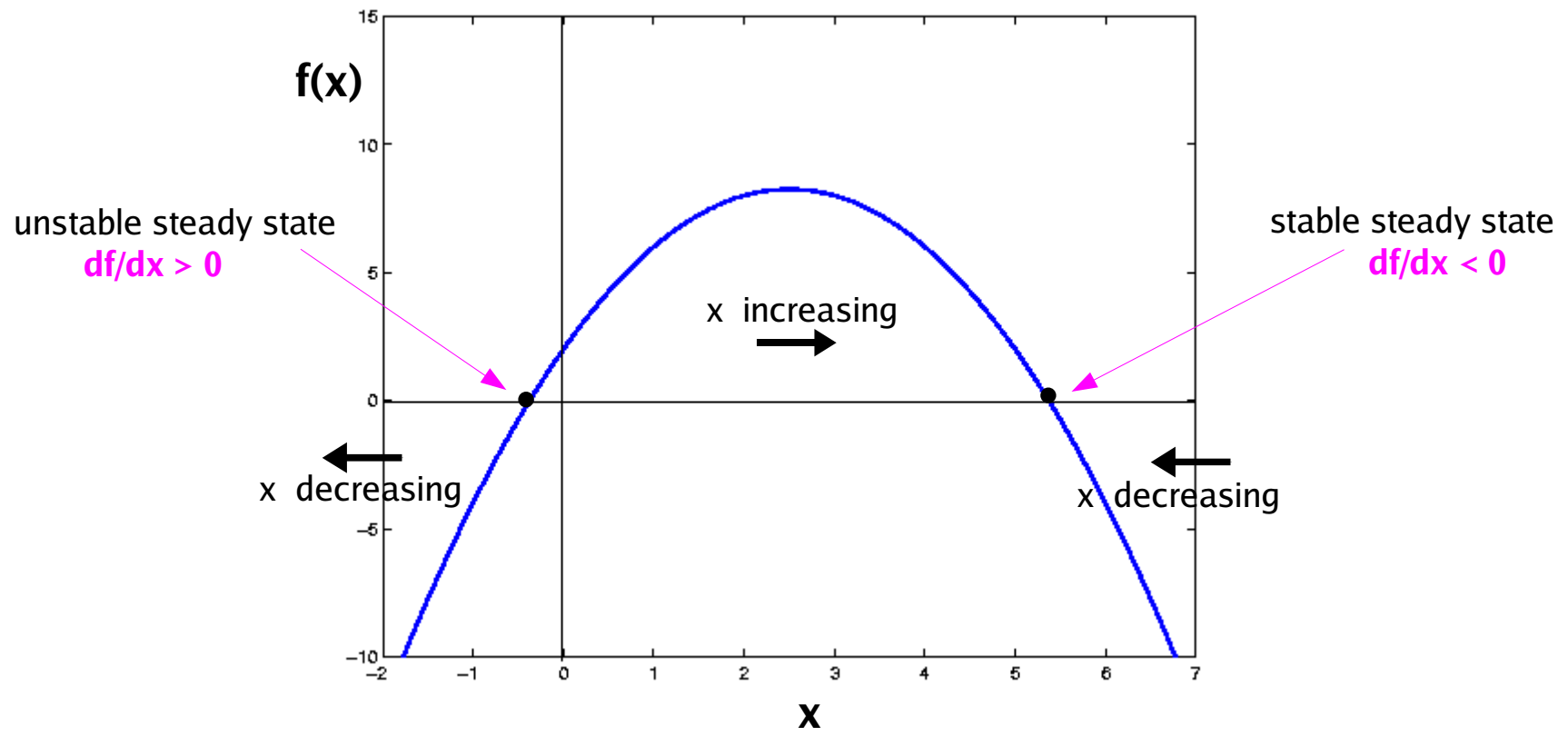
steady states can be **stable** or **unstable**

*how can we tell the difference without simulation?*

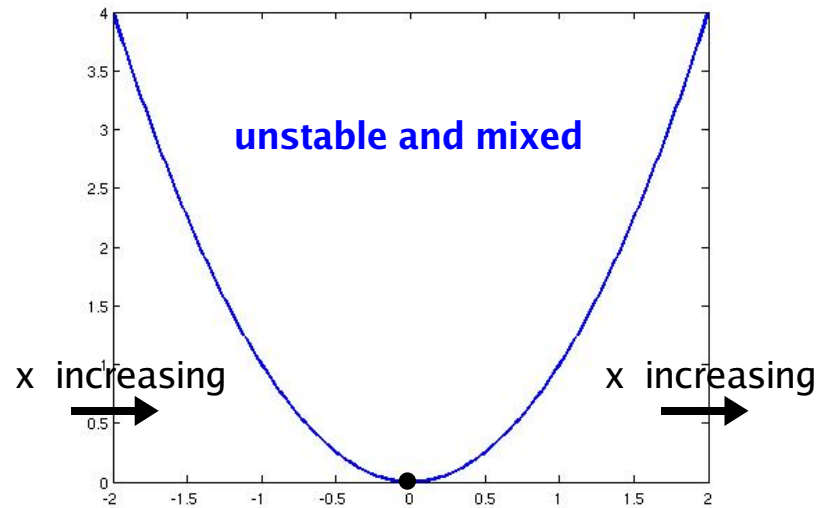
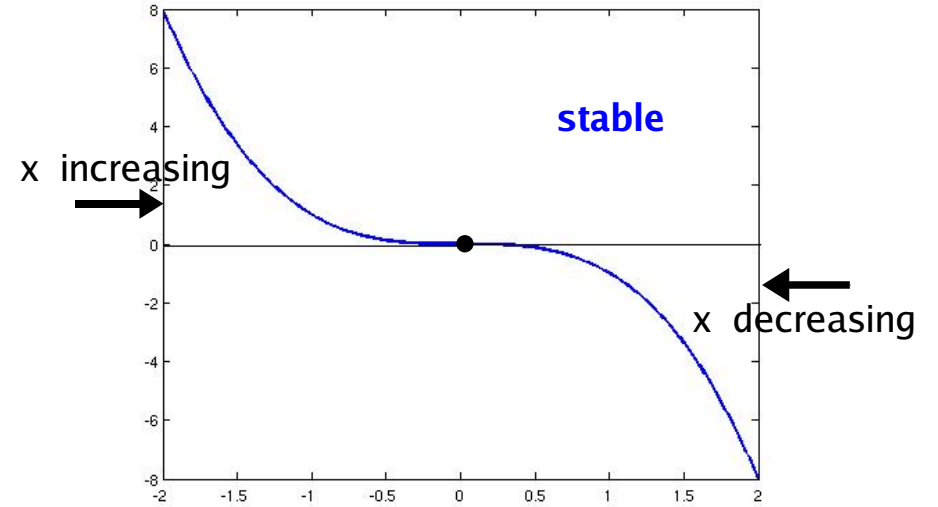
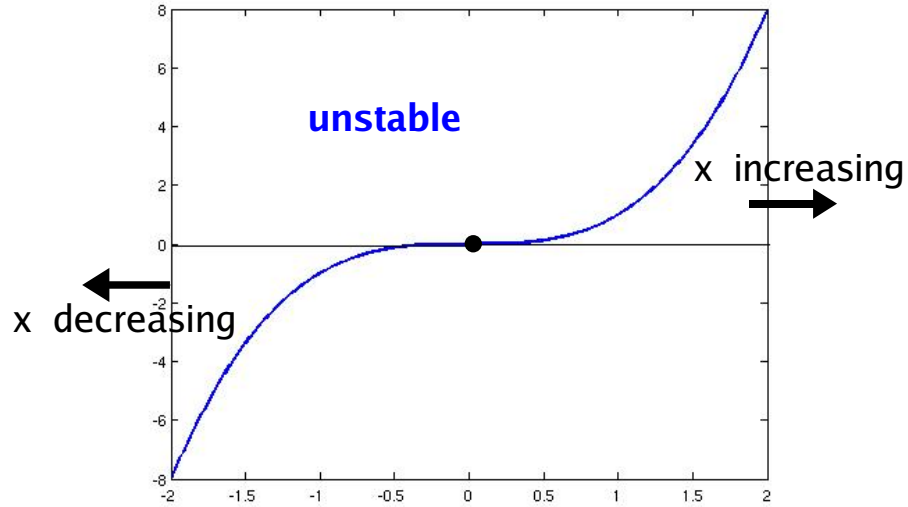
this feedback loop has only one stable steady state:  
the 'off' state is unstable.

*how does phage lambda create a stable "off" state?*

1 dimensional dynamical system  $\frac{dx}{dt} = f(x)$



$$df/dx = 0$$





# 1 dimensional dynamical system $\frac{dx}{dt} = f(x)$

1. find a steady state  $x = x_{st}$ , so that  $\left(\frac{dx}{dt}\right)\Big|_{x=x_{st}} = f(x_{st}) = 0$
2. calculate the derivative of  $f$  at the steady state  $\left(\frac{df}{dx}\right)\Big|_{x=x_{st}}$
3. if the derivative is **negative** then  $x_{st}$  is **stable**
4. if the derivative is **positive** then  $x_{st}$  is **unstable**
5. if the derivative is **zero** then  $x_{st}$  can be stable or unstable