

# A Systems Approach to Biology

MCB 195

Lecture 4

Tuesday, 15 Feb 2005

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# LINEAR SYSTEMS

more about those dreaded  
*eigenvalues*

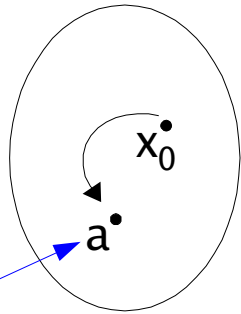
and then

# BISTABILITY

Why do we need to know about eigenvalues?

Because they tell us what trajectories look like near  
a steady state

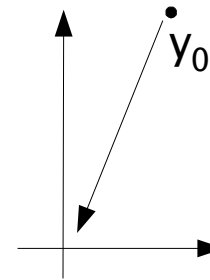
NONLINEAR SYSTEM  
 $dx/dt = f(x)$



hyperbolic steady state  
 $\text{Re}(\lambda) \neq 0$

license to linearise

LINEARISED SYSTEM  
 $dy/dt = (Df)|_a(y)$



EIGENVALUES

$\exp(Df)$  matrix exponential



$$A\mathbf{u} = \lambda\mathbf{u} \quad \mathbf{u} \neq \mathbf{0}$$

characteristic equation  $\det(A - \lambda I) = 0$

$$\begin{pmatrix} a & b \\ c & d \end{pmatrix}$$

$$\lambda^2 - (a + d)\lambda + (ad - bc) = 0$$

2 distinct real roots

$$(\lambda - 1)(\lambda - 2) = 0$$

2 equal real roots

$$(\lambda - 1)^2 = 0$$

2 complex conjugate roots

$$\lambda^2 + 1 = 0$$

$$\frac{dx}{dt} = Ax$$

if  $A$  has a real eigenvalue  $\lambda$  with eigenvector  $u$

$$Au = \lambda u$$

$\exp(At)$  has eigenvalue  $\exp(\lambda t)$  for the same eigenvector

*if the linear system is started anywhere along the line defined by  $u$ , it remains on that line and moves exponentially at rate  $\lambda$*

## THE SIMPLE CASE

*distinct real eigenvalues*

$$\frac{dx}{dt} = Ax \quad A = \begin{pmatrix} a & b \\ c & d \end{pmatrix}$$

$$Au = \lambda u \quad Av = \mu v$$

unstable node

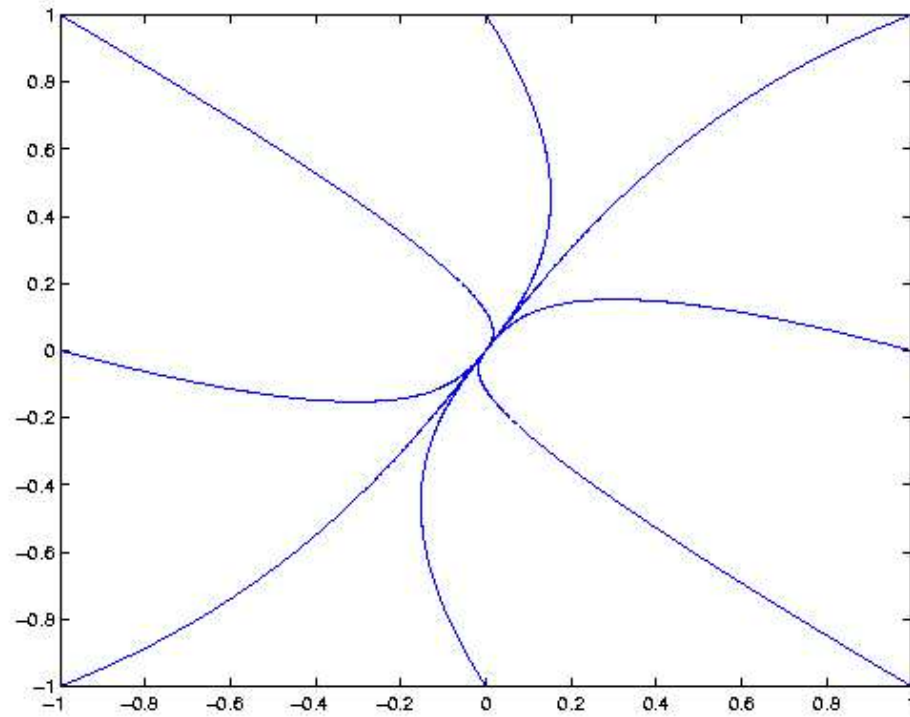
$$\lambda, \mu > 0$$

saddle

$$\lambda > 0, \mu < 0$$

stable node

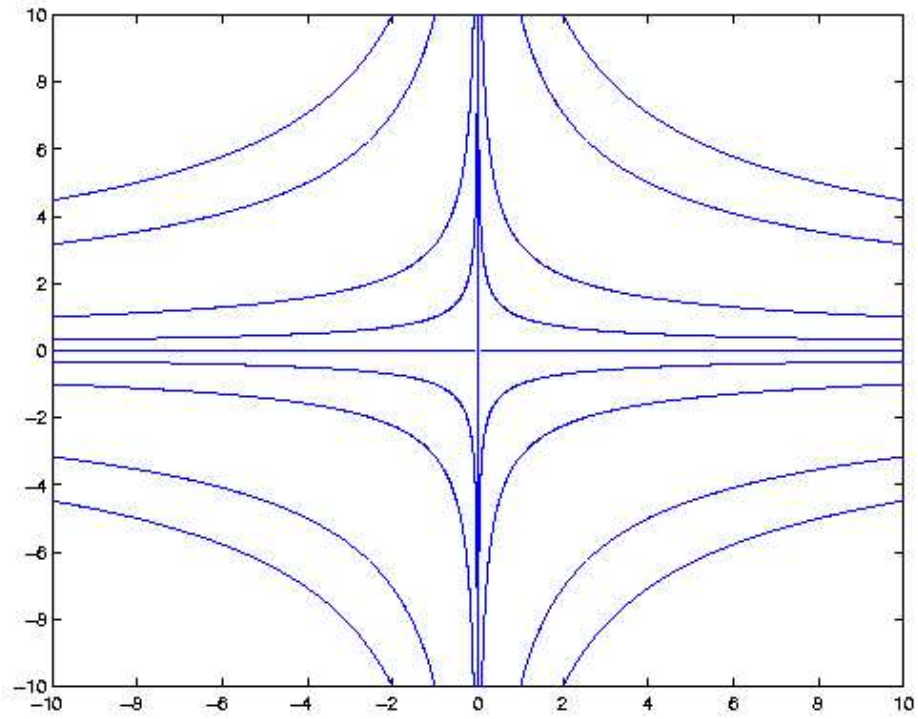
$$\lambda, \mu < 0$$



$$\begin{pmatrix} -3 & 1 \\ 1 & -2 \end{pmatrix}$$

stable node





$$\begin{pmatrix} 2 & 0 \\ 0 & -1 \end{pmatrix}$$

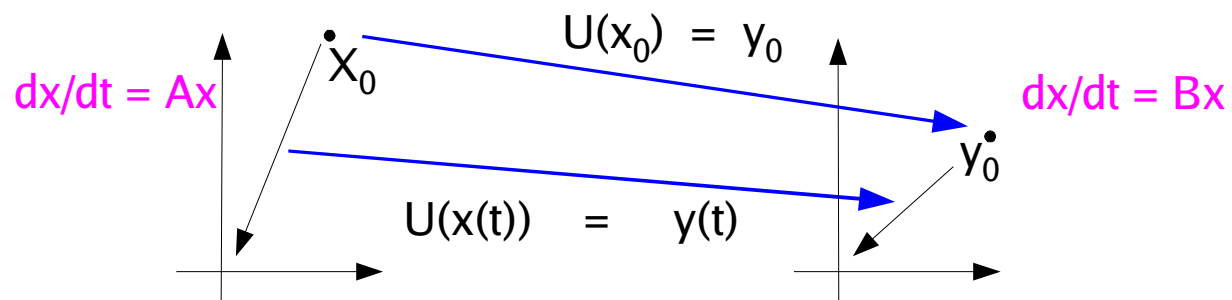
saddle

A and B are **conjugate** if there is an invertible matrix U such that

$$B = UAU^{-1}$$

*conjugate matrices have identical eigenvalues*

*conjugate matrices have identical dynamics*



# THE INTERESTING CASE

*complex eigenvalues*

$$A = \begin{pmatrix} a & -b \\ b & a \end{pmatrix}$$

can always find a conjugate matrix of this form

$$\begin{pmatrix} a & -b \\ b & a \end{pmatrix}$$



$$a + ib$$

sums and products of matrices



sums and products of complex numbers

$$\exp(A)$$

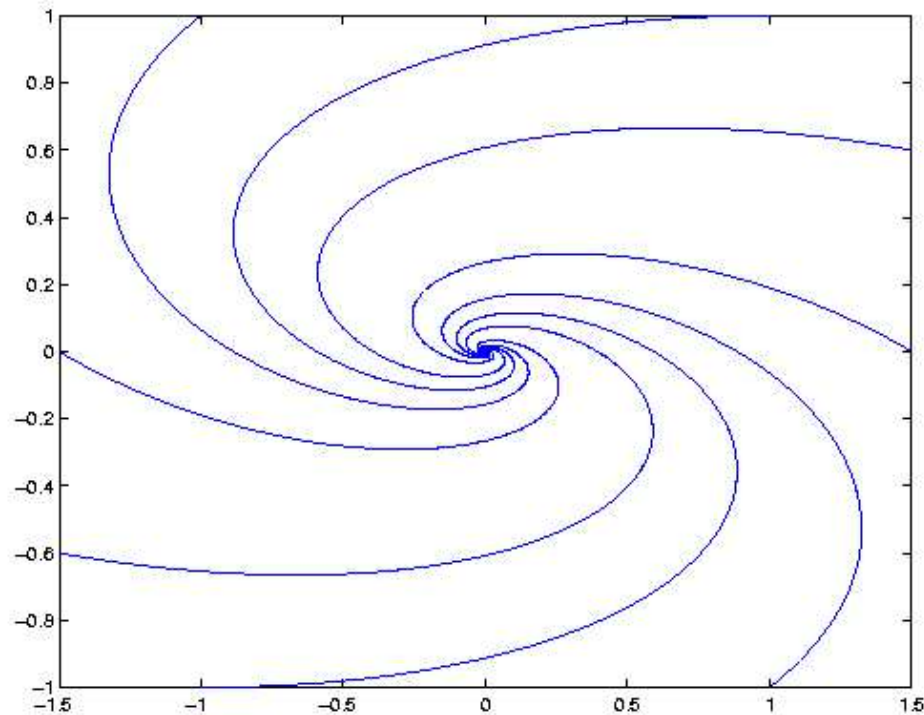
$$\exp(a+ib) = \exp(a) \exp(ib)$$

$$\exp(a) \begin{pmatrix} \cos(b) & -\sin(b) \\ \sin(b) & \cos(b) \end{pmatrix}$$



$$\exp(a) (\cos(b) + i\sin(b))$$

complex eigenvalues imply **SPIRALS**  
or damped oscillations

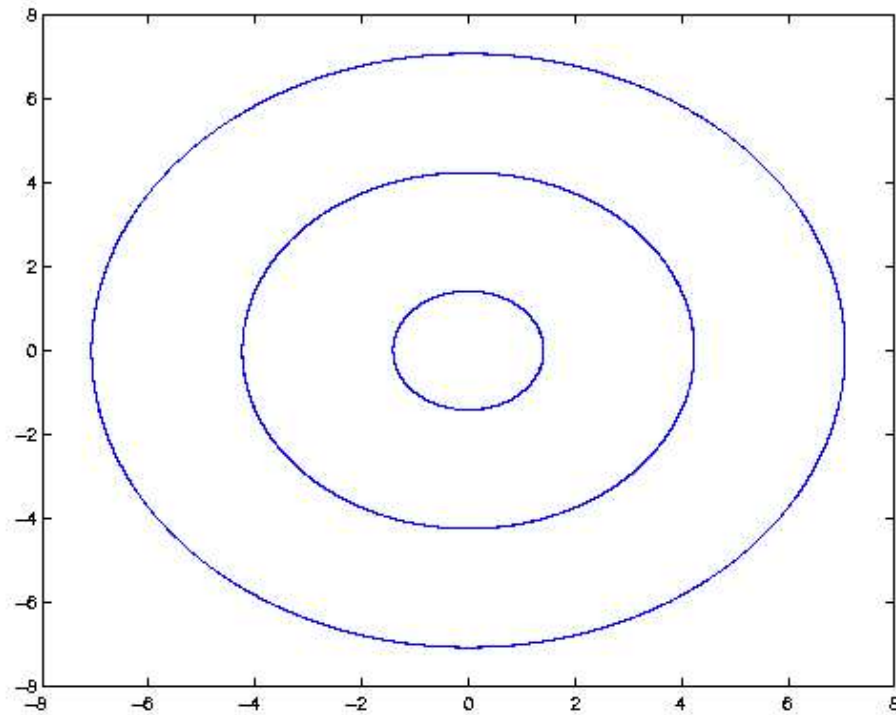


$$\begin{pmatrix} -2 & -5 \\ 1 & -1 \end{pmatrix}$$

stable spiral

$$x(t) = \exp(at)\cos(bt)x(0) - \exp(at)\sin(bt)y(0)$$
$$y(t) = \exp(at)\sin(bt)x(0) + \exp(at)\cos(bt)y(0)$$

except when  $a = 0$   
we get a **CENTER**



**THIS IS NON-HYPERBOLIC !!**

## THE AWKWARD CASE

*equal real eigenvalues*

$$A = \begin{pmatrix} a & b \\ 0 & a \end{pmatrix}$$

can always find a conjugate  
matrix of this form

$$\exp(A) = \exp(a) \begin{pmatrix} 1 & b \\ 0 & 1 \end{pmatrix}$$

*degenerate case which cant make up its mind whether to be a node or a spiral*

$$A = \begin{pmatrix} a & b \\ c & d \end{pmatrix}$$

$$\lambda^2 - (a + d)\lambda + (ad - bc) = 0 \quad \lambda^2 - \text{Tr}(A)\lambda + \det(A) = 0$$

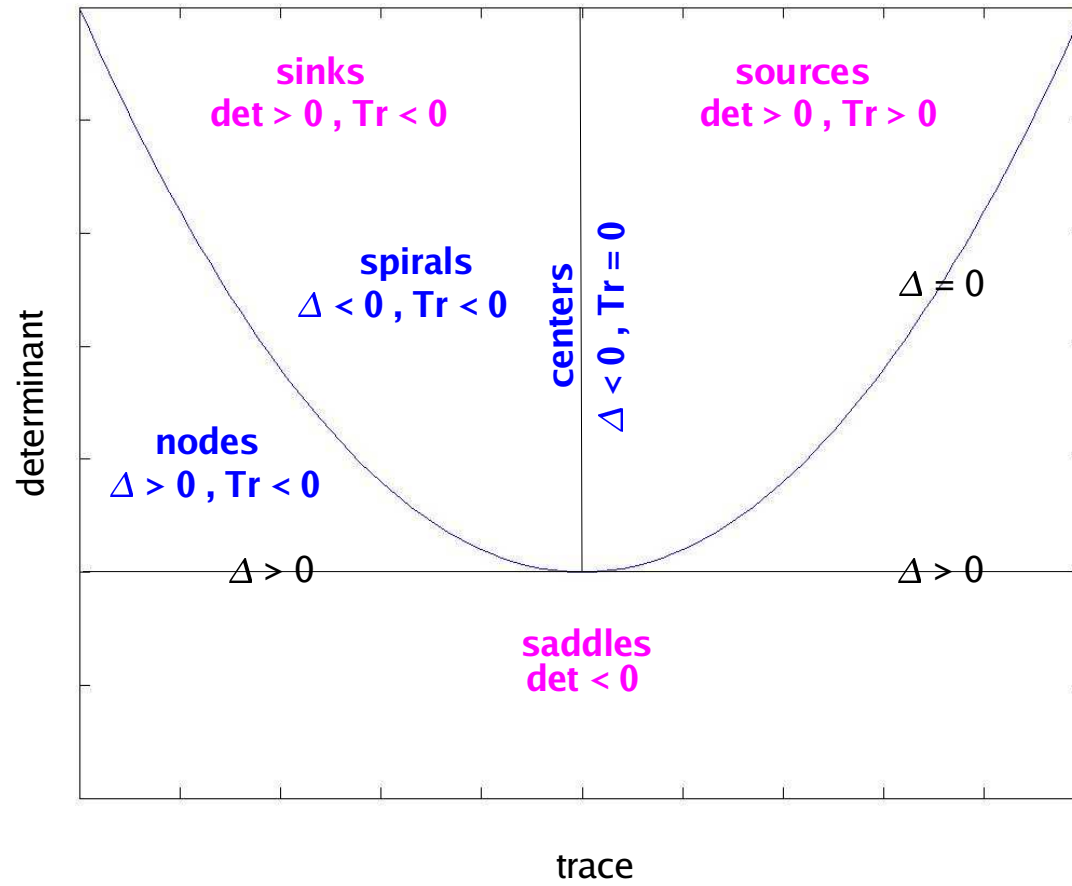
eigenvalues are  $\lambda = \frac{\text{Tr}(A) \pm \{ (\text{Tr}(A))^2 - 4 \det(A) \}^{1/2}}{2}$

$$\Delta = \text{Tr}(A)^2 - 4\det(A) \quad \text{DISCRIMINANT}$$

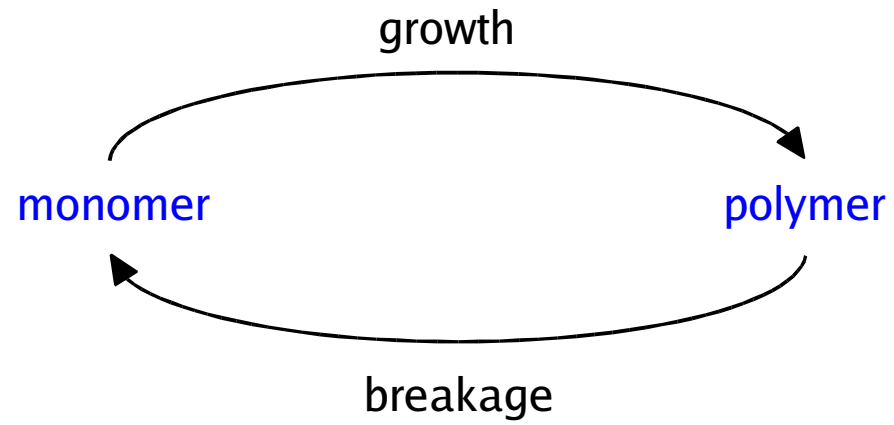
$\Delta > 0$   
distinct real roots

$\Delta = 0$   
equal real roots

$\Delta < 0$   
complex roots

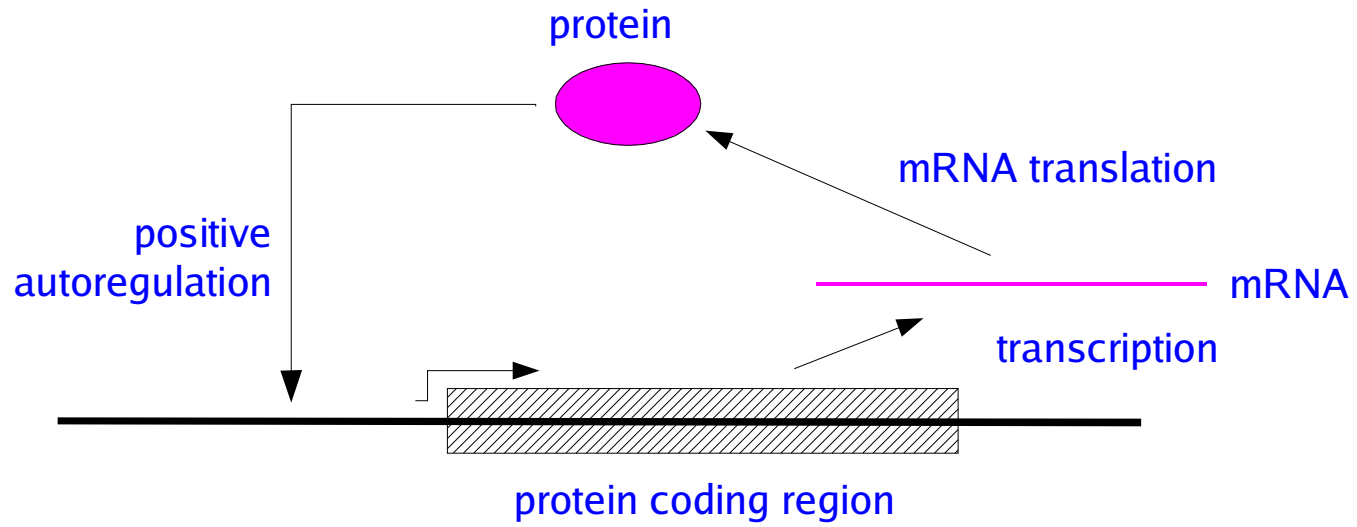






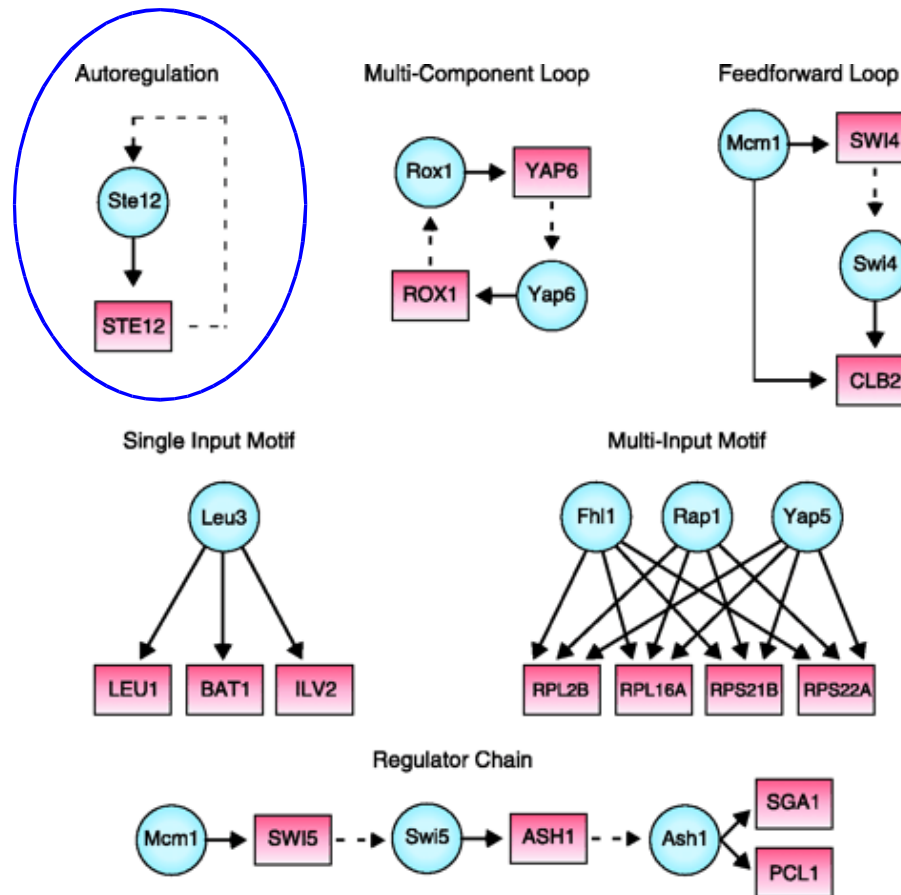
POSITIVE FEEDBACK

# GENETIC AUTOREGULATORY LOOP



POSITIVE FEEDBACK

# SIGNIFICANT REGULATORY MOTIF IN YEAST



Lee et al, "Transcriptional regulatory networks in *Saccharomyces cerevisiae*"  
Science 298:799-804 2002

## AND MORE COMPLEX ORGANISMS ...

Helms et al, "Autoregulation and multiple enhancers control *Math1* expression in the developing nervous system", *Development* **127**:1185-96 2000

x = protein concentration  
y = mRNA concentration

$$\frac{dx}{dt} = \lambda y - ax$$

$$\frac{dy}{dt} = \frac{\alpha x^c}{k + x^c} - by$$

$\lambda$	translation rate	$(\text{time})^{-1}$
$a$	protein degradation rate	$(\text{time})^{-1}$
$\alpha$	maximum gene expression rate	$(\text{mols})(\text{time})^{-1}$
$k$	“Michaelis-Menten” constant	$(\text{mols})$
$b$	mRNA degradation rate	$(\text{time})^{-1}$
$c$	cooperativity	