

# Introduction to Dynamical Systems

## Part 3



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## Outline

### Analyzing stability of ODE systems

What we mean by stability in general

One-dimensional examples

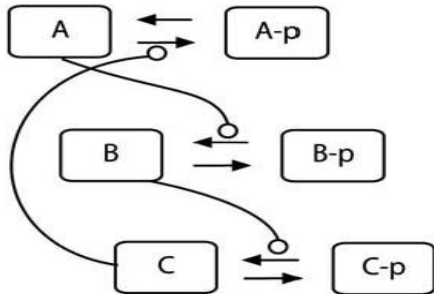
Phase-plane techniques for two-dimensional systems

Example: a mathematical model of yeast glycolytic oscillations

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# Analyzing stability of ODE systems

Example: a generic three-component repressive network



Mogilner et al., *Developmental Cell*  
11:279–287, 2006

The scheme implies a set of differential equations

$$\frac{d[A]}{dt} = \frac{k_{p1}([A]_T - [A])}{[A]_T - [A] + K_{p1}} - \frac{k_{k1}[A][C]}{[A] + K_{k1}}$$

$$\frac{d[B]}{dt} = \frac{k_{p2}([B]_T - [B])[A]}{[B]_T - [B] + K_{p2}} - \frac{k_{k2}[B]}{[B] + K_{k2}}$$

$$\frac{d[C]}{dt} = \frac{k_{p3}([C]_T - [C])[B]}{[C]_T - [C] + K_{p3}} - \frac{k_{k3}[C]}{[C] + K_{k3}}$$

**Model parameters:**

$k_{cat}$ 's and  $K_m$ 's for phosphorylation reactions

$k_{cat}$ 's and  $K_m$ 's for dephosphorylations

total amounts of [A], [B], and [C]

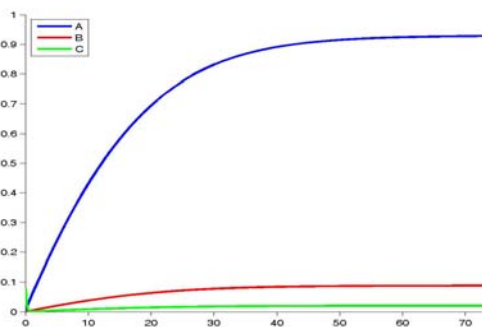
The equations are solved using standard numerical techniques

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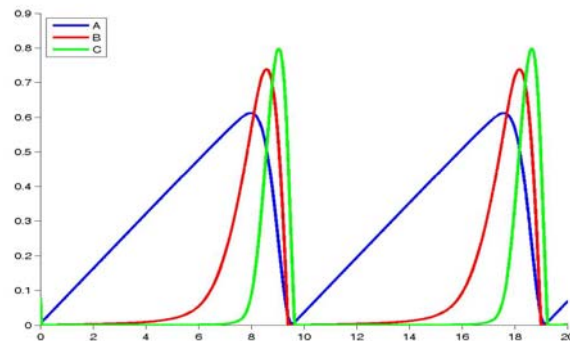
# ODE models

Two solutions to this system

Parameter set 1



Parameter set 2



Parameter values greatly influence system behavior

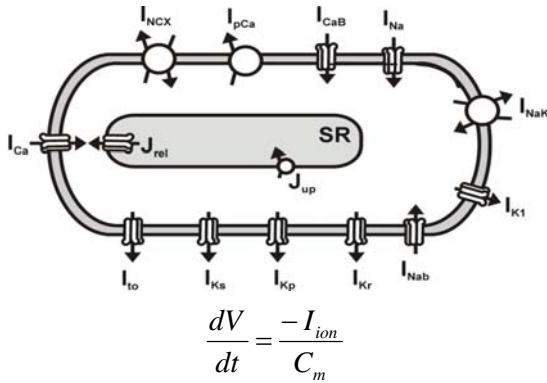
We use tools of “dynamical systems” to understand different behaviors

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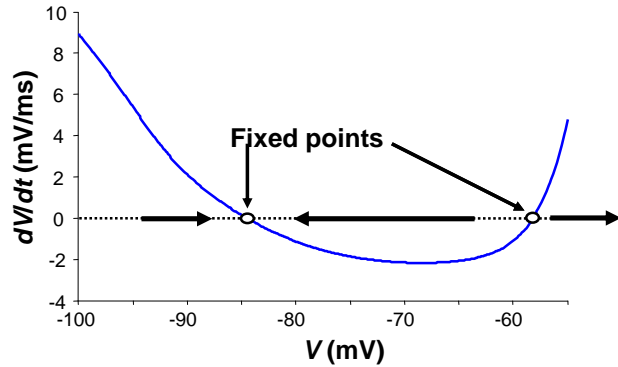
# Stability analysis of ODE systems

## A one-dimensional example

### Isolated cardiac myocyte



Beginning with a myocyte at rest (-85 mV), simulate instantaneous change in voltage, resulting  $I_{ion}$ , then resulting  $dV/dt$



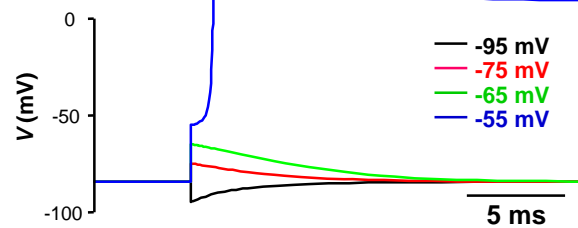
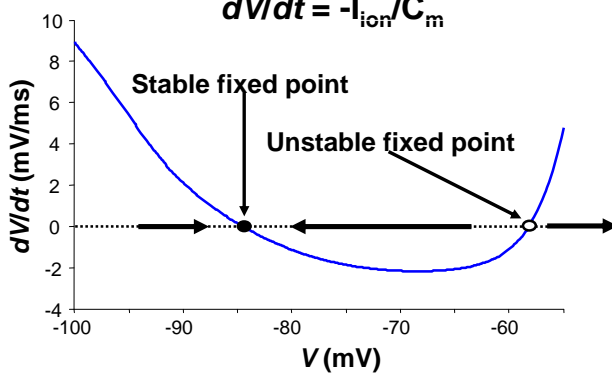
Change to  $< -85 \rightarrow$  positive  $dV/dt$   
 Change to  $\sim -70 \rightarrow$  negative  $dV/dt$   
 Change to  $> \sim -58 \rightarrow$  positive  $dV/dt$

# Stability analysis of ODE systems

## Instantaneous changes in membrane potential

$$dV/dt = -I_{ion}/C_m$$

Change V, then integrate equations



Deviations below -85 mV or between -85 and  $\sim -58$  mV result in a return to the resting state.

**This is a stable fixed point**

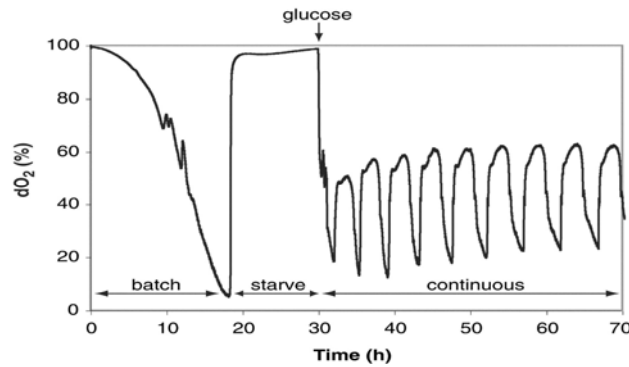
Small deviations from -58 mV cause action potentials or return to the resting state.

**This is an unstable fixed point**

**We will learn to analyze these more rigorously**

# Stability analysis of ODE systems

## A two-dimensional example: Yeast glycolytic oscillations



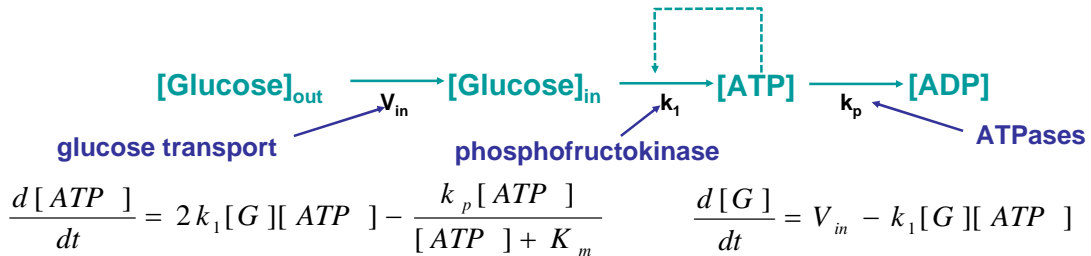
Tu et al., *Science* 310:1152-1158, 2005

Many mathematical models of this process have been developed  
 Bier, Bakker, & Westerhoff published a very simple one (*Biophys. J.* 78:1087-1093, 2000)

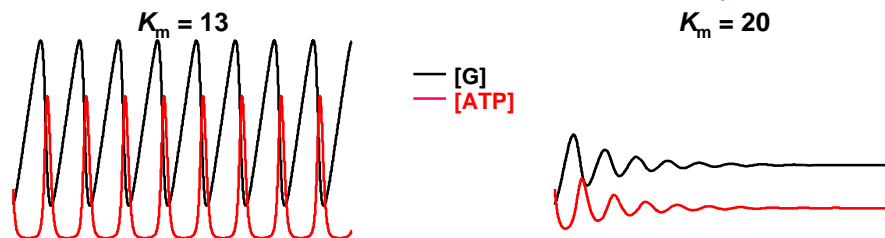
We will analyze stability using this example system

# Stability analysis of ODE systems

## Bier model of yeast glycolytic oscillations



Default parameter values:  $V_{\text{in}} = 0.36$ ,  $k_1 = 0.02$ ,  $k_p = 6$

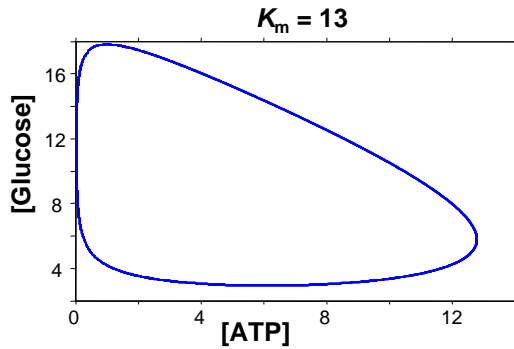


How can we understand the qualitatively different behavior?

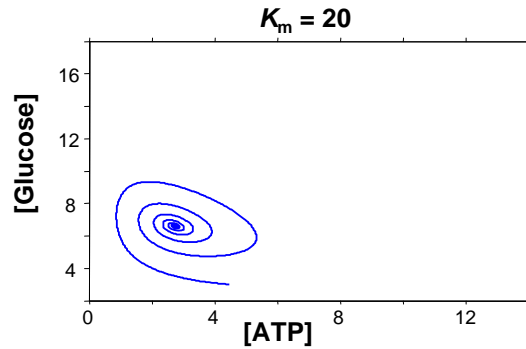
## Stability analysis of ODE systems

### Phase-plane techniques for 2D systems

Instead of plotting [G] and [ATP] vs. time, plot [G] vs. [ATP]



[G] and [ATP] oscillate indefinitely in a “stable limit cycle”



[G] and [ATP] converge to a “stable fixed point”

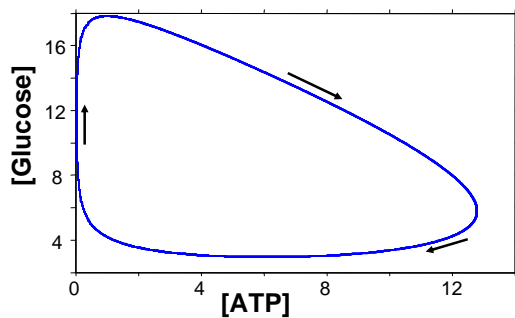
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## Stability analysis of ODE systems

In 2D phase plane, direction determined by:

$$\begin{bmatrix} d[ATP]/dt \\ d[G]/dt \end{bmatrix}$$

At any given location, the derivatives define a vector in the phase plane



$$\frac{d[G]}{dt} = V_{in} - k_1[G][ATP]$$

$$\frac{d[ATP]}{dt} = 2k_1[G][ATP] - \frac{k_p[ATP]}{[ATP] + K_m}$$

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## Summary

A "fixed point" of a dynamical system is a set of variables where all derivatives are equal to zero.

A fixed point can be stable, meaning that after a small perturbation away from the fixed point, the system will return to that fixed point.

With two-variable systems, it can be helpful to plot one variable versus the other, in the "phase-plane."