

# Numerical continuation in computational biology

Mark Blyth



## What is computational biology?

- Keep Goal: use maths to understand the mechanisms behind living processes
- Differential equations are used to explain lots of these processes
  - Hodgkin-Huxley: neural dynamics
  - Lotka-Volterra: population dynamics
  - SIR model: epidemic dynamics



## Differential equations for biology

#### Ordinary differential equation

Description of how a system state changes in time

#### System state

Minimal amount of information to describe something's behaviour

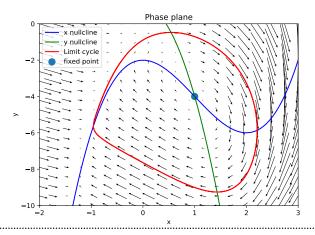
#### Nonlinear system

A set of ordinary differential equations, where the change in state doesn't follow a simple proportional relationship

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## **Drawing pictures**





#### The role of parameters

Every equation has parameters:

- Some of these are fixed
- Some of these we can play with

The dynamics of a system necessarily depend on these parameters



#### **Bifurcations**

#### Bifurcation

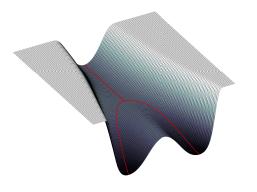
If the dynamics of a system change at some parameter value, a bifurcation is said to have occurred

This usually means equilibria or periodic orbits appearing and disappearing – but not always!

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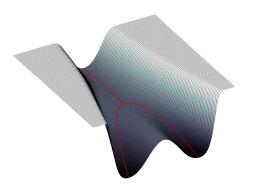
## Biological bifurcations

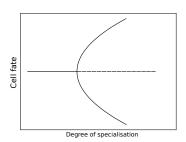


- Waddington describes cell specialisation like marbles rolling down a valley
- When the valley splits, two cell fates emerge
- This is a nice example of a bifurcation!



## Biological bifurcations







## The role of bifurcation analysis in biology

- Elifurcations can explain seisures, heart attacks, Parkinson's, and many other diseases
- ₩ Bifurcations can be used to explain the functionality of biological systems
- ₩ Bifurcations can be used to design biological systems



## Methods for bifurcation analysis

- Analytical calculations
- Brute force computation
- Numerical continuation

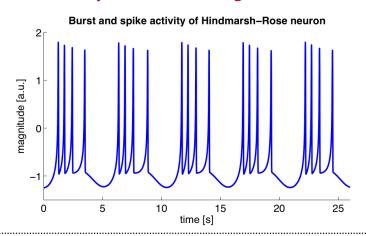


#### Numerical continuation

- We use numerical continuation to track 'interesting' points
  - We vary a parameter
  - Continuation tells us how the point changes
- Test functions indentify bifurcations



#### Bifurcation analysis of a bursting neuron





#### The Hindmarsh Rose model

$$\frac{\mathrm{d}x}{\mathrm{d}t} = y - ax^3 + bx^2 - z + I,$$

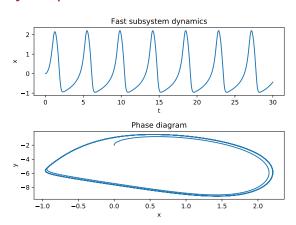
$$\frac{\mathrm{d}y}{\mathrm{d}t} = c - dx^2 - y,$$

$$\frac{\mathrm{d}z}{\mathrm{d}t} = r \left[ s(x - x_R) - z \right].$$
(1)

$$|r| \ll 1$$

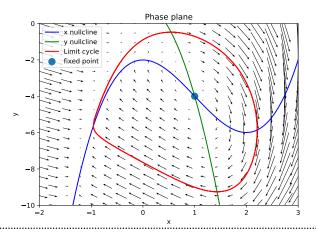


## **Exploratory step**



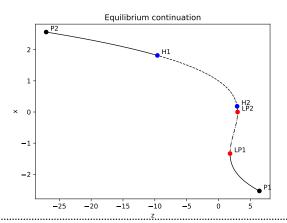


## Initialisation step



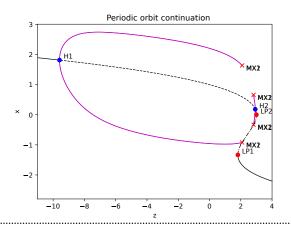


# Equilibrium point curve



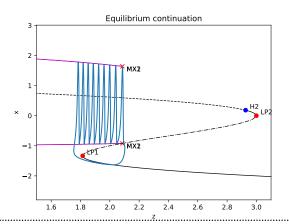


#### Periodic orbit continuation





## Full system dynamics





#### Software tools

There's lots of software to do these sorts of calculations!



Questions? Feedback?