

# Scientific Computing I

## Module 3: Population Modelling – Continuous Models

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Outlines

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Part II: More Than One  
Species – Systems of ODE

# Part I: ODE Models

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- 3 Model of Verhulst
- 4 Logistic Growth
- 5 Threshold

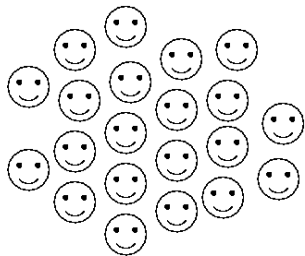
# Part II: More Than One Species – Systems of ODE

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# Part I

## ODE Models

# Discrete vs. Continuous Models



discrete model:

$p(t) \in \mathbb{N}$  individuals

$$\frac{dp}{dt} = F(p, t, \dots)$$

$$p(t) = ?$$

continuous model:

$$p : \mathbb{R} \rightarrow \mathbb{R}, p(t) = ?$$

## Advantage:

- easier(?) type of mathematical problem:  
differential equations, calculus
- analytical solutions available(?)

# Model of Maltus (1798)

Only one species:

- 1 birth rate  $\gamma$  (number of births per time interval) proportional to size of population
- 2 death rate  $\delta$  proportional to size of population
- 3 thus: constant growth (or decay) rate:  $r = \gamma - \delta$

Modelling:

- constant growth rate

$$\frac{dp}{dt} = r \cdot p$$

- growth within a time interval

$$p(t + \delta t) = p(t) + r \cdot p(t) \cdot \delta t$$

# Model of Maltus – Differential Equation

Written as an ordinary differential equation:

$$\dot{p}(t) = r \cdot p(t)$$

Requires initial condition (population at start)

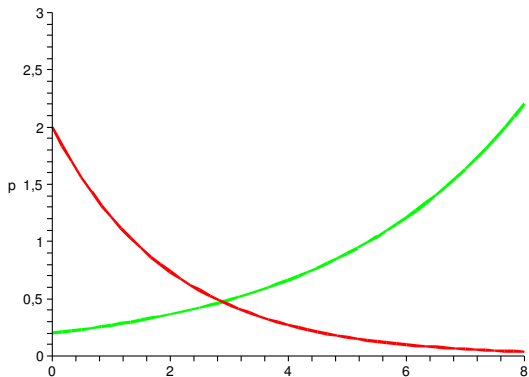
$$p(0) = p_0$$

Analytical solution:

$$p(t) = p_0 e^{rt}$$

# Model of Maltus – Solutions

The model of maltus describes exponential growth or decay of a population:





# Model of Verhulst (19th century)

## Objective:

- model populations that approach saturation value

## Assumptions:

- growth/death rate depend on population size; assume linear dependency:

$$g(t) = g_0 - g_1 \cdot p(t) \quad d(t) = d_0 + d_1 \cdot p(t)$$

- leads to differential equation:

$$\dot{p}(t) = g(t) - d(t) = \underbrace{(g_0 - d_0)}_{=: \alpha} - \underbrace{(g_1 + d_1)}_{=: \beta} p(t)$$

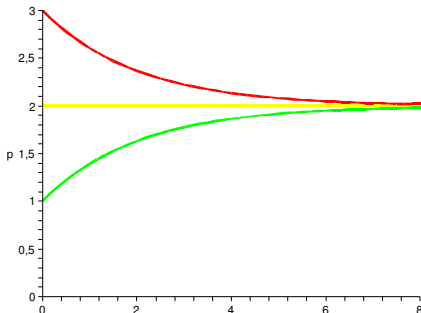
# Model of Verhulst – Saturation

- solve initial value problem:

$$\dot{p}(t) = \alpha - \beta p(t), \quad p(0) = p_0$$

- solution:

$$p(t) = p_\infty + e^{-\beta t} (p_0 - p_\infty), \quad p_\infty = \frac{\alpha}{\beta}$$



# Model of Verhulst – Logistic Growth

- saturation model does no longer model exponential growth
- let growth/death rate decrease linearly with time
- but keep growth/death rate proportional to population size
- leads to differential equation:

$$\dot{p}(t) = (\alpha - \beta p(t))p(t)$$

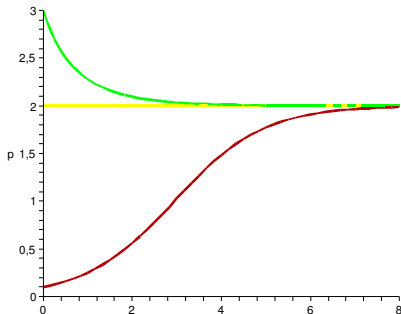
# Logistic Growth

- other formulation

$$\dot{p}(t) = \alpha \left( 1 - \frac{p(t)}{\beta} \right) p(t)$$

- solution:

$$p(t) = \frac{\beta}{(1 - e^{-\alpha t}) + \frac{\beta}{p_0} e^{-\alpha t}}$$

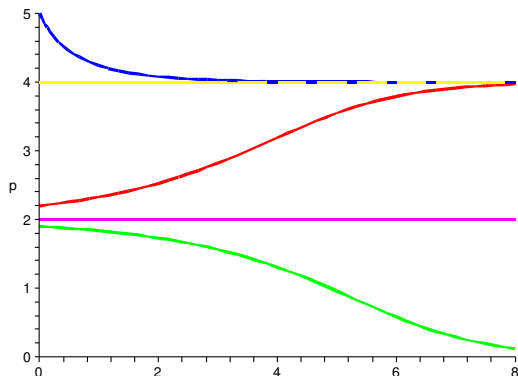


# Logistic Growth with Threshold

- extended version of Verhulst's model:

$$\dot{p}(t) = \alpha \left(1 - \frac{p(t)}{\beta}\right) \left(1 - \frac{p(t)}{\delta}\right) p(t)$$

- solutions ( $\beta = 2, \delta = 4$ ):



## Example – The Passenger Pigeon

- beginning of the 19th century, estimated population in North America: four billion
- hunting diminished its number below a critical threshold (late 1880s)
- The last passenger pigeon died on September, 1st 1914.



## Part II

# More Than One Species – Systems of ODE

# A Linear Model

## A Linear Model

First Example: Arms Race

Second Example:  
Competition

## A Non-Linear Model

The Non-Linear  
Competition Model

Predator-Prey

## Open Questions

- similar to Verhulst's saturation model
- additional growth term proportional to other species
- leads to system of differential equations:

$$\dot{p}(t) = b_1 + a_{11}p(t) + a_{12}q(t)$$

$$\dot{q}(t) = b_2 + a_{21}p(t) + a_{22}q(t)$$

- typically:
  - $b_1 > 0, b_2 > 0$  (growth term)
  - $a_{11} < 0, a_{22} < 0$  (saturation)
  - $a_{12}, a_{21}$ ?



# First Example: Arms Race

- armament of two (hostile) countries
- our suspicion:  $a_{12} > 0$ ,  $a_{21} > 0$

## Observation:

- long-time behaviour depends on size of parameters
- steady-state solutions exist
- solutions exist that show unlimited growth

# Second Example: Competition

- two species sharing a common natural habitat
- competition:  $a_{12} < 0$ ,  $a_{21} < 0$

## Observation:

- long-time behaviour depends on size of parameters
- steady-state solutions exist
- some scenarios are physically incorrect!  
(negative population size)

# A Non-Linear Model

- similar to Verhulst's logistic growth model
- additional growth term proportional to other species
- leads to system of differential equations:

$$\dot{p}(t) = (b_1 + a_{11}p(t) + a_{12}q(t))p(t)$$

$$\dot{q}(t) = (b_2 + a_{21}p(t) + a_{22}q(t))q(t)$$

- typically:
  - $b_1 > 0, b_2 > 0$  (growth term)
  - $a_{11} < 0, a_{22} < 0$  (saturation)
  - $a_{12}, a_{21}$ ?

# The Non-Linear Competition Model

## A Linear Model

First Example: Arms Race

Second Example:  
Competition

## A Non-Linear Model

The Non-Linear  
Competition Model

Predator-Prey

## Open Questions

- two species sharing a common natural habitat
- competition:  $a_{12} < 0, a_{21} < 0$

## Possible Scenarios:

- steady-state
- one species dies out (extinction)
- no obvious nonsense

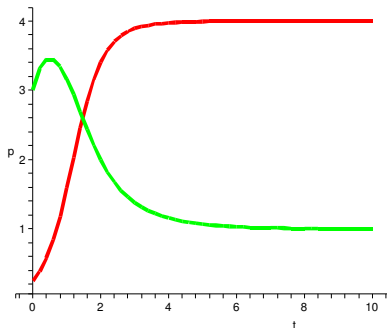
# Competition – Steady State

- system of differential equations:

$$\dot{p}(t) = \left( \frac{5}{2} + \frac{\sqrt{3}}{24} - \frac{5}{8}p(t) - \frac{\sqrt{3}}{24}q(t) \right) p(t)$$

$$\dot{q}(t) = \left( \frac{7}{8} + \frac{3\sqrt{3}}{2} - \frac{3\sqrt{3}}{8}p(t) - \frac{7}{8}q(t) \right) q(t)$$

- solution for  $p_0 = \frac{1}{4}$ ,  $q_0 = 3$ :



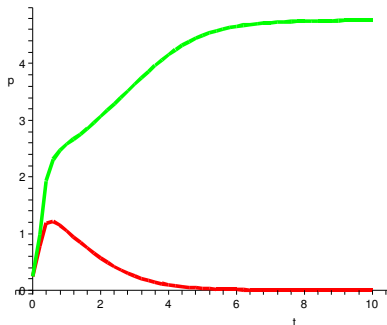
# Competition – Extinction

- system of differential equations:

$$\dot{p}(t) = \left( \frac{71}{8} - \frac{23}{12}p(t) - \frac{25}{12}q(t) \right) p(t)$$

$$\dot{q}(t) = \left( \frac{73}{8} - \frac{25}{12}p(t) - \frac{23}{12}q(t) \right) q(t)$$

- solution for  $p_0 = \frac{1}{4}$ ,  $q_0 = \frac{1}{4}$ :



# Predator-Prey

- two species: predator  $p$  and prey  $q$
- predator eats prey:  $a_{12} > 0$
- prey is eaten by predator:  $a_{21} < 0$

## Possible Scenarios:

- stable oscillations
- one species dies out (what happens with the other, then?)

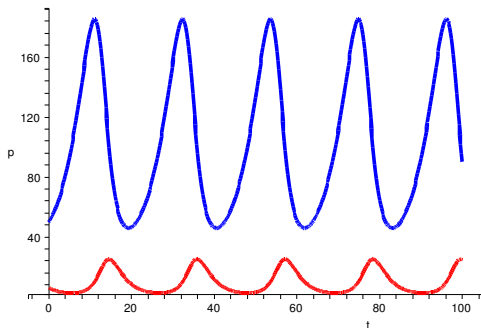
# Predator-Prey by Lotka & Volterra

- system of differential equations:

$$\dot{p}(t) = \left(-\frac{1}{2} + \frac{1}{200}q(t)\right)p(t)$$

$$\dot{q}(t) = \left(\frac{1}{5} - \frac{1}{50}p(t)\right)q(t)$$

- solution for  $p_0 = 6$ ,  $q_0 = 50$ :



## A Linear Model

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Second Example:  
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## A Non-Linear Model

The Non-Linear  
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Predator-Prey

## Open Questions



# Open Questions

## A Linear Model

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## Open Questions

## Methods to Analyse a Given Model?

- predict approximate solution or shape of solution?
- predict possible steady states?
- predict critical points?  
(species on edge of extinction?)

## Methods to Improve Modeling?

- predict failure of the model?
- tune parameters to model a specific situation?