

## Part II: Modeling via systems

- Mathematics of system of differential equations
- Models of interacting populations
- Chemotaxis models in [E-K] (biochemistry)
- Models of infectious diseases
- Models of neural impulses

## Modeling with system of differential equations

No species lives in isolation.

The interactions among species give interesting models.

**Model 1a:** (Lokta-Volterra) Predator-Prey model

Interaction: predator eats prey

Example: fox and rabbit

## Assumptions:

- If no foxes are present, the rabbits reproduce by the Malthus model;
- Without rabbits to eat, the fox population declines at a rate proportional to its size;
- The rate at which the rabbits are eaten is proportional to the rate at which the foxes and rabbits interact;
- The rate at which the foxes are born is proportional to the rate at which the rabbits are eaten by the foxes.

## Variables and parameters:

$t$ -time,  $R(t)$ -population of rabbits,  $F(t)$ -population of foxes

$a$ : growth rate per capita of the rabbits

$b$ : death rate per capita of the foxes

$c$ : constant of proportionality that measures the number of rabbits eaten and the interaction between rabbits and foxes

$d$ : constant of proportionality that measures the number of foxes born and the interaction between rabbits and foxes

$$\begin{aligned}\frac{dR}{dt} &= aR - cFR \\ \frac{dF}{dt} &= -bF + dFR\end{aligned}$$

## History:

$$\begin{aligned}\frac{dR}{dt} &= aR - cFR \\ \frac{dF}{dt} &= -bF + dFR\end{aligned}$$

Canadian lynx and snowshoe hare (observed in 1840)

Lotka-Volterra predator-prey model (1925-1926)

Alfred James Lotka (1925)

Vito Volterra (1926):  
oscillations in fish population in the Mediterranean

**Model 1b**: logistic prey population

$$\begin{aligned}\frac{dR}{dt} &= aR \left(1 - \frac{R}{N}\right) - cFR \\ \frac{dF}{dt} &= -bF + dFR\end{aligned}$$

**Model 1c**: Holling type predation

$$\begin{aligned}\frac{dR}{dt} &= aR \left(1 - \frac{R}{N}\right) - \frac{cFR}{1 + eF} \\ \frac{dF}{dt} &= -bF + \frac{dFR}{1 + eF}\end{aligned}$$

## First order system of ODEs:

$$\begin{aligned}\frac{dR}{dt} &= 0.1R - 0.2FR \\ \frac{dF}{dt} &= -0.2F + 0.04FR\end{aligned}$$

Equilibrium solutions:  $0.1R - 0.2FR = 0$ ,  $-0.2F + 0.04FR = 0$   
 $(R, F) = (0, 0)$ ,  $(R, F) = (5, 0.5)$

Analytic method: possible but hard

Qualitative method: more efficient

Numerical method: not covered in class, but we will use `pplane`

## Qualitative tools:

$$\frac{dR}{dt} = 0.1R - 0.2FR$$

$$\frac{dF}{dt} = -0.2F + 0.04FR$$

$$R(0) = R_0 > 0, \quad F(0) = F_0 > 0.$$

a solution:  $R(t)$  and  $F(t)$ .

Graphing program: `pplane`

## **Two kinds of graphs:**

solution orbits:  $(R(t), F(t))$  on  $(R, F)$  plane

solution curves:  $(t, R(t)), (t, F(t))$  on  $(t, R - F)$  plane

## Orbit Graph: phase portrait

$$\frac{dx}{dt} = f(x, y)$$
$$\frac{dy}{dt} = g(x, y)$$

$(x, y)$ -plane is called **phase plane**,

For fixed  $t$ ,  $(x(t), y(t))$  is a point on the phase plane

The solution  $(x(t), y(t))$  is a moving point (an orbit) on the phase plane

The slope mark at  $(x, y)$  is the vector  $(f(x, y), g(x, y))$

The slope is  $\frac{g(x, y)}{f(x, y)}$  since  $\frac{dy}{dx} = \frac{g(x, y)}{f(x, y)}$ .

## Vector form of system of equations:

$$\begin{pmatrix} \frac{dx}{dt} \\ \frac{dy}{dt} \end{pmatrix} = \begin{pmatrix} f(x, y) \\ g(x, y) \end{pmatrix}$$

**Vector** is a pair of numbers, and we can use a line segment with direction to represent it.

The length of a vector  $(x, y)$  is  $\sqrt{x^2 + y^2}$ .

The right hand side of the equation is a **vector field**.

## Different kinds of functions:

$P(t)$ : function (one variable, one function)

$P(x, y)$ : multi-variable function (two variables, one function)

$(P(t), Q(t))$ : vector valued function (one variable, two functions)

$(P(x, y), Q(x, y))$ : vector field (two variables, two functions)

## Comparison of Behavior of the solutions in 1-d and 2-d :

	1-d	2-d
solution	$x(t)$	$(x(t), y(t))$
solution curves	on $t - x$ graph	on $t - (x, y)$ graph
monotonicity	increasing or decreasing	may not be monotone
orbit	a moving point on phase line	a moving point on phase plane
asymptotic behavior $t \rightarrow \infty$	(i) tends to equilibrium (ii) goes away to infinity	(i) tends to equilibrium (ii) goes away to infinity (iii) tends to a periodic orbit

Note: there is no chaos in 1-d or 2-d, but in 3-d system, chaos is another asymptotic behavior

## Studies of phase portrait (1): nullclines

$$\begin{aligned}\frac{dx}{dt} &= f(x, y) \\ \frac{dy}{dt} &= g(x, y)\end{aligned}$$

The sets  $f(x, y) = 0$  and  $g(x, y) = 0$  are curves on the phase portrait, and these curves are called **nullclines**.

$f(x, y) = 0$  is the  $x$ -nullcline, where the vector field  $(f, g)$  is vertical.

$g(x, y) = 0$  is the  $y$ -nullcline, where the vector field  $(f, g)$  is horizontal.

The nullclines divide the phase portraits into regions, and in each region, the direction of vector field must be one of the following:

north-east, south-east, north-west and south-west

(So nullclines are where the vector field is exactly east, west, north and south)

In each region, we use an arrow to indicate the direction.

(In 1-d, we use only up-arrow and down-arrow in phase lines.)

## Studies of phase portrait (2): equilibrium points

$$\begin{aligned}\frac{dx}{dt} &= f(x, y) \\ \frac{dy}{dt} &= g(x, y)\end{aligned}$$

Equilibrium points are points where  $f(x, y) = 0$  and  $g(x, y) = 0$ .

Equilibrium points are the intersection points of  $x$ -nullcline and  $y$ -nullcline.

Equilibrium points are constant solutions of the system.

Equilibrium points are also called steady state solutions, fixed points, etc.

## Qualitative analysis from nullclines:

Suppose that there is a solution from a point in one of the regions formed by nullclines, then there is only three possibilities for the orbit:

**A.** tends to an equilibrium on the border of this region

**B.** goes away to infinity

**C.** enter other neighboring region following the arrow

More information is needed for equilibrium points to further determination.