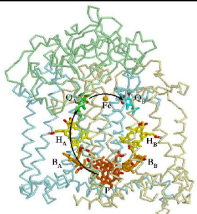




Ecology




Biophysics of proteins




## Simulation in Biology



**Péter Maróti**  
Professor of Biophysics  
University of Szeged, Hungary



Maróti P. és Tandori Júlia: Biofizikai Példatár, JATEPress 1996  
P. Maróti, L. Berkes and F. Tölgyesi: Biophysics Problems.  
A Textbook with Answers, Akadémiai Kiadó, Budapest 1998.



Prof. Albert Szent-Györgyi  
Bioenergetics, Nobel Prize 1937

If the Lord Almighty had consulted me

Before embarking on creation

I should have recommended something simpler.

Alphonso the Wise (1221-1284)

King of Castile and Leon (attributed)

## Population Biology, Ecological questions Concepts and Models

Simulation

Appropriate model,  
many parameters



Fitting

Strict conditions,  
few parameters

## Hypotheses for population regulation

- Populations are limited by density-independent factors such as changes in the weather.
- Populations are limited by their food supply.
- Populations regulate themselves through mechanisms such as territoriality or cannibalism.
- Populations are regulated through competition.
- Populations are regulated by predators.
- Populations are regulated by parasites or diseases.

### Topics:

#### I. Logistic equation

one species populates alone the living space („Lebensraum”)



#### II. Competition (Lotka-Volterra equation)

two species compete for the common living space (food)



#### III. Predator-Prey Interactions (Lotka-Volterra Models)

One species is the exclusive food of the other species.



## I. Logistic equation: the population does not grow to infinity

One species dominates the living space only and the equilibrium population (carrying capacity,  $K$ ) is determined by the conditions.

For separate generations: the relative increase of the population density  $N$  from generation  $n$  to generation  $(n+1)$  is proportional to the actual deviation of the population from the equilibrium value  $K$ :

$$\frac{N_{n+1} - N_n}{N_n} = C \cdot (K - N_n)$$

Recursive  
equation

For not separate generations, the logistic equation turns to differential equation:

$$\frac{dN}{dt} = C \cdot (K - N) \cdot N$$

Differential  
equation

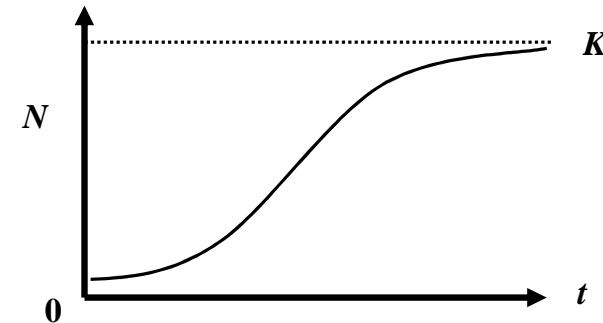
The logistic equation can be integrated by separation of the variables:

$$t = \frac{1}{C \cdot K} \cdot \ln \left| \frac{N}{K - N} \right| + B$$

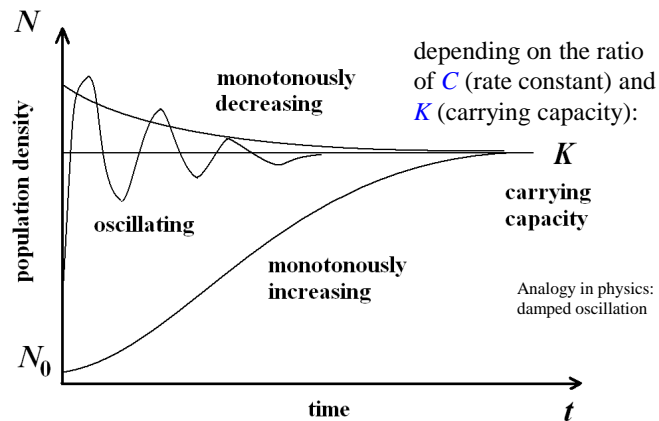
where  $C \cdot K$  the rate of the increase if  $N \ll K$ ,  $C \cdot (K - N)$  is the actual rate

$K$  population in equilibrium

$B$  constant of integration



## How does the system approach the equilibrium (if exists)?



## Homeworks

### 1) Growth cultures, chemostates, reactors

The equilibrium capacity of a bacterium growth culture is  $K = 5 \cdot 10^8$  cells/ml. In the lag phase of the growth (when the culture is dilute) the doubling time (generation time) is

$$T_0 = (\ln 2) / (C \cdot K) = 40 \text{ minutes.}$$

How large will be the population density of the culture after 2 hours if the initial population density (concentration) is

- $1 \cdot 10^8$  cells/ml,
- $1 \cdot 10^9$  cells/ml?

## 2) Harvesting the species.

How many fish can be harvested without reducing the viability of the population? (When the population level becomes too low, the population will decline. This is the *Allee effect*.)

Hint:

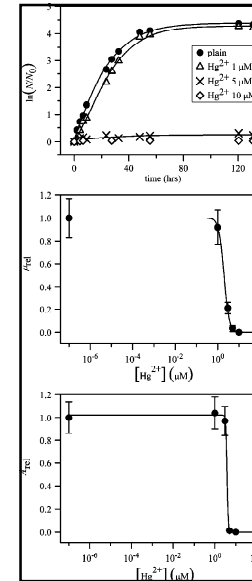
Complete the simple logistic equation with a term that considers the harvest:

$$\frac{dN}{dt} = C \cdot N(K - N) - H \cdot N$$

where  $H$  is the rate of the harvest.

- Find the non-zero equilibrium of this model, which will depend on the value of  $H$ . What restriction on  $H$  is necessary for this equilibrium to be positive? Discuss biologically why this condition makes sense.
- What happens to the population if  $H$  is larger than the value determined in part a?

## Growth curve of photosynthetic bacteria



The anaerobic growth curves were obtained by plotting the logarithm of the relative population size,  $\ln(N/N_0)$ , against the time elapsed from the light exposure. Growth rate ( $\mu$ ), lag phase duration ( $\lambda$ ) and the asymptotic population size ( $K$ ) were determined by fitting the modified **Gompertz equation** to growth curves

$$\ln(N/N_0) = K \cdot \exp\{-\exp[\mu \cdot e/K \cdot (\lambda - t) + 1]\}$$

where  $N$  is the cell concentration at the time  $t$ ,  $N_0$  is the initial cell concentration and  $e$  (the Napier number) is the base of the natural logarithm.

## II. Lotka-Volterra Competition

➤ The dynamics of the two species:

$$\frac{\Delta N_1(t)}{\Delta t} = r_1 N_1(t) \left( \frac{K_1 - N_1(t) - \alpha \cdot N_2(t)}{K_1} \right)$$

$$\frac{\Delta N_2(t)}{\Delta t} = r_2 N_2(t) \left( \frac{K_2 - N_2(t) - \beta \cdot N_1(t)}{K_2} \right)$$

where  $\alpha$  and  $\beta$  are the interspecific **competition coefficients** of the two species.

$N_1$ : population density of the first species

$N_2$ : population density of the second species

$K_1$ : carrying capacity of the living space for the first species

$K_2$ : carrying capacity of the living space for the second species

$r_1$ : growth rate of the first species ( $C_1 \cdot K_1$ )

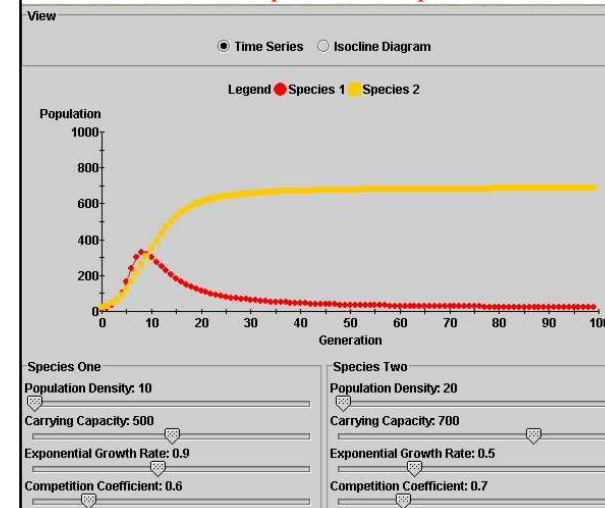
$r_2$ : growth rate of the second species ( $C_2 \cdot K_2$ )

$\Delta N_1$ : increase of the population density of the first species within time  $\Delta t$

$\Delta N_2$ : increase of the population density of the second species within time  $\Delta t$

➤ **Kinetics:** Dynamics of the two populations between  $t = 0$  and  $t = 100$  units.

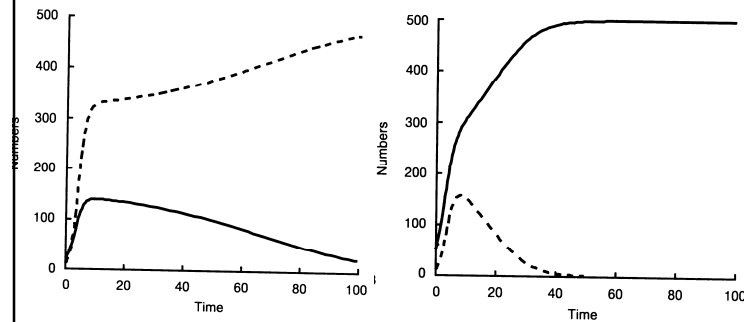
**One species outcompetes the other.**



$N_1(0) = 10$ ,  
 $N_2(0) = 20$ ,  
 $r_1 = 0.9$ ,  
 $r_2 = 0.5$ ,  
 $K_1 = 500$ ,  
 $K_2 = 700$ ,  
 $\alpha = 0.6$ ,  
 $\beta = 0.7$

Dynamics of competition: the outcome depends on the initial conditions.

$$r_1 = 0.9, r_2 = 0.5, K_1 = 500, K_2 = 500, \alpha = 1.2, \beta = 1.1$$



The only difference between the two figures is the initial condition.

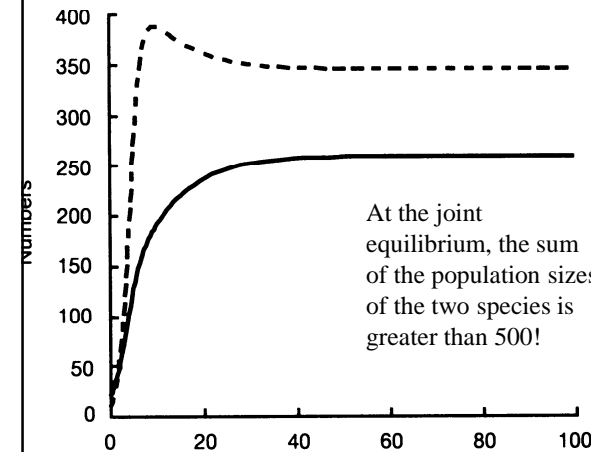
$$N_1(0) = 10$$

$$N_2(0) = 10$$

$$N_1(0) = 10$$

$$N_2(0) = 60$$

Dynamics of competition with coexistence



At the joint equilibrium, the sum of the population sizes of the two species is greater than 500!

$$N_1(0) = 10$$

$$N_2(0) = 20$$

$$r_1 = 0.9$$

$$r_2 = 0.5$$

$$K_1 = 500$$

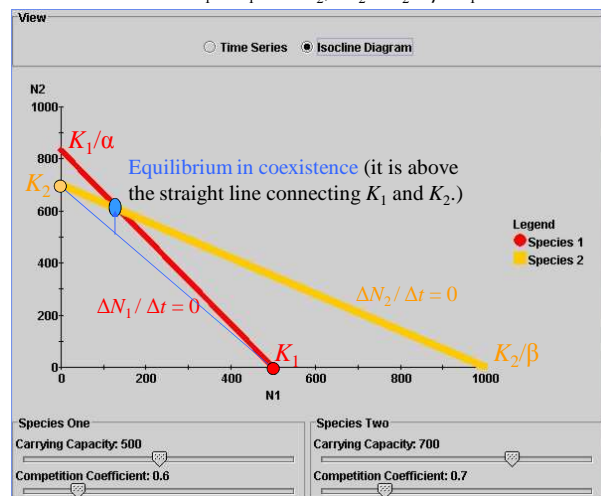
$$K_2 = 500$$

$$\alpha = 0.6$$

$$\beta = 0.7$$

➤ **Equilibrium:** neither  $N_1$ , nor  $N_2$  does change ( $\Delta N_1 = \Delta N_2 = 0$ )

$$K_1 = N_1 + \alpha \cdot N_2, K_2 = N_2 + \beta \cdot N_1$$



## Homework

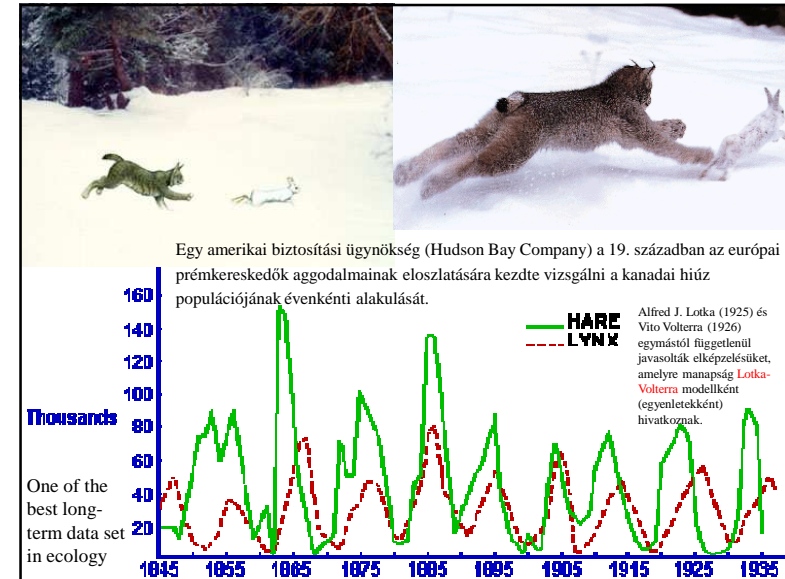
The ecologist Slobodkin (1961, 1964) looked at competition between a **brown hydra** (*Hydra littoralis*) and a **green hydra** (*Chlorohydra viridissima*) in laboratory experiments. He was able to achieve coexistence only by the process he called **rarefaction**, removing a fraction of the population of both species at regular intervals by removing part of the medium in which the animals were grown.

Demonstrate how this works by adding the terms  $-m \cdot N_1$  and  $-m \cdot N_2$  to the Lotka-Volterra equations! Show that it is possible to have coexistence with proper choice of the the additional terms, even if the coexistence is impossible without the additional terms (i.e. one species always eliminates the other).

$$\frac{\Delta N_1(t)}{\Delta t} = r_1 N_1(t) \left( \frac{K_1 - N_1(t) - \alpha \cdot N_2(t)}{K_1} \right) - m \cdot N_1$$

$$\frac{\Delta N_2(t)}{\Delta t} = r_2 N_2(t) \left( \frac{K_2 - N_2(t) - \beta \cdot N_1(t)}{K_2} \right) - m \cdot N_2$$

### III. The Lotka-Volterra-Equations for the Predator-Prey model



- **Characteristics:** One species (prey) is the exclusive food of the other species (predator).
- **Conditions:**
  - The prey lives under unlimited (food) conditions (e.g. it is grass-eating and the grass supply is inexhaustible),
  - The increase of the predator population is determined solely by the prey population,
  - The rates of reproduction of both species are independent on the age of the species,
  - The number of captured prey is proportional to the number of encounters between predators and preys.

$N$ : actual population of the prey,  
 $r_1$ : rate of increase of the population of the prey,  
 $P$ : actual population of the predator,  
 $r_2$ : rate of death of the predator

- If no predators are present, the population of the prey increases exponentially:

$$\Delta N(t) = r_1 N(t) \cdot \Delta t.$$

(The capacity of the living space is extremely large for the prey.)

- If no preys are available, the population of the predator decreases exponentially:

$$\Delta P(t) = -r_2 P(t) \cdot \Delta t.$$

- The number of encounters within unit interval of time („bimolecular process”):

$$C_1 N \cdot P,$$

where the constant  $C_1$  offers the magnitude of the chance that a predator catches (kills and eats) a prey.

➤ Taking into account both species:

$$\Delta N(t)/\Delta t = r_1 N(t) - C_1 N(t) \cdot P(t)$$

$$\Delta P(t)/\Delta t = -r_2 P(t) + C_2 N(t) \cdot P(t)$$

where the constant  $C_2$  indicates in what extent (yield) the predator utilizes (for his own purposes, e.g. metabolism, sexual potential etc.) the captured prey.

➤ The Lotka-Volterra equations are coupled differential equations.

We have to check

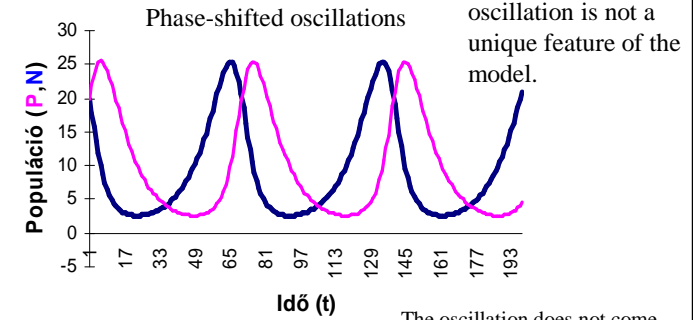
- the existence of the solution,
- the unicity of the solution and
- the stability of the solution (e.g. what does the noise do?).

➤ It can be proven, that there are solutions but cannot be obtained by analytical methods (in „closed” forms).

➤ The solutions can be derived by approximate (numerical) methods. The Lotka-Volterra differential equation will be converted to difference equation and starting from time  $t = 0$ , we proceed with  $\Delta t$  steps and calculate the actual populations  $N(t)$  and  $P(t)$ .

### KINETICS

#### Lotka-Volterra ragadozó-zsákmány: idő trajektória

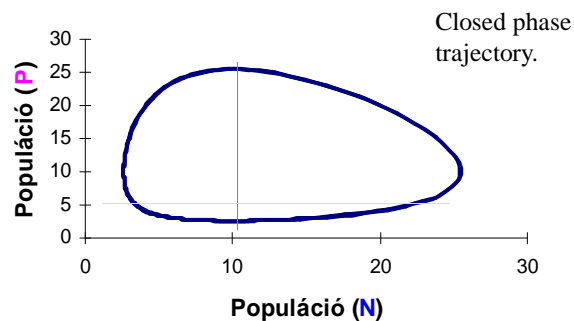


$$P_0 = 20, r_1 = 0.1, C_1 = 0.01; \\ N_0 = 20, r_2 = 0.1, C_2 = 0.01$$

The oscillation does not come from the presence of the predator, the population of the prey can oscillate even in the absence of the predator and *vica versa*.

### PHASE TRAJECTORY

#### Lotka-Volterra ragadozó-zsákmány

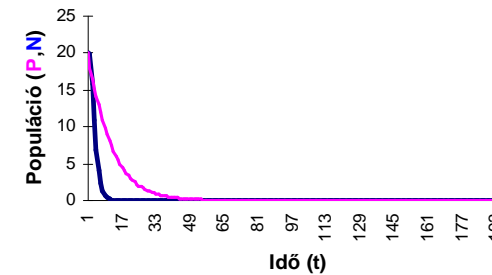


$$P_0 = 20, r_1 = 0.1, C_1 = 0.01; \\ N_0 = 20, r_2 = 0.1, C_2 = 0.01$$

The variable (hidden) parameter is the time.

### Decreasing populations. Extinction of both predator and prey.

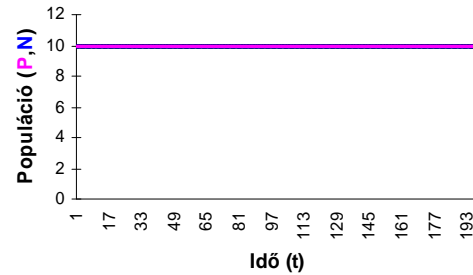
#### Lotka-Volterra ragadozó-zsákmány: idő trajektória



$$P_0 = 20, r_1 = 0.01, C_1 = 0.1; \\ N_0 = 20, r_2 = 0.1, C_2 = 0.01$$

➤ Stable condition means **equilibrium**: if  $\Delta N = \Delta P = 0$ , then  $P = \frac{r_1}{C_1}$  and  $N = \frac{r_2}{C_2}$ .

Lotka-Volterra ragadozó-zsákmány: idő trajektória



$$P_0 = 10, r_1 = 0.1, C_1 = 0.01;$$

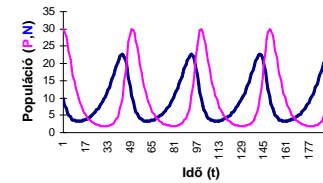
$$N_0 = 10, r_2 = 0.2, C_2 = 0.02$$

➤ Meaning of the two equations:

### KINETICS

- above predator population  $P = r_1/C_1$ , the prey population decreases and below predator population  $P = r_1/C_1$ , the prey population increases.

Lotka-Volterra ragadozó-zsákmány: idő trajektória

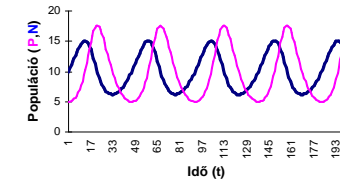


$$P_0 = 30, r_1 = 0.1, C_1 = 0.01;$$

$$N_0 = 10, r_2 = 0.2, C_2 = 0.02$$

$$r_1/C_1 = 10$$

Lotka-Volterra ragadozó-zsákmány: idő trajektória



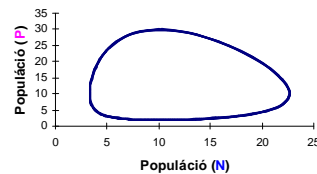
$$P_0 = 5, r_1 = 0.1, C_1 = 0.01;$$

$$N_0 = 10, r_2 = 0.2, C_2 = 0.02$$

### PHASES

The time is eliminated.

Lotka-Volterra ragadozó-zsákmány

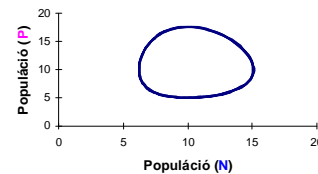


above

$$P_0 = 30, r_1 = 0.1, C_1 = 0.01;$$

$$N_0 = 10, r_2 = 0.2, C_2 = 0.02$$

Lotka-Volterra ragadozó-zsákmány



below

$$P_0 = 5, r_1 = 0.1, C_1 = 0.01;$$

$$N_0 = 10, r_2 = 0.2, C_2 = 0.02$$

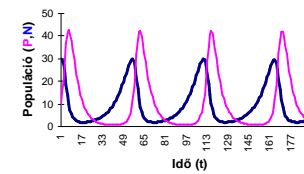
$$r_1/C_1 = 10$$

➤ Meaning of the two equations:

### KINETICS

- above the prey population of  $N = r_2/C_2$ , the predator population increases and below the prey population of  $N = r_2/C_2$ , the predator population decreases.

Lotka-Volterra ragadozó-zsákmány: idő trajektória

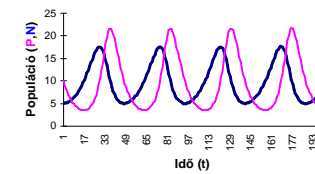


$$P_0 = 10, r_1 = 0.1, C_1 = 0.01;$$

$$N_0 = 30, r_2 = 0.2, C_2 = 0.02$$

$$r_2/C_2 = 10$$

Lotka-Volterra ragadozó-zsákmány: idő trajektória



$$P_0 = 10, r_1 = 0.1, C_1 = 0.01;$$

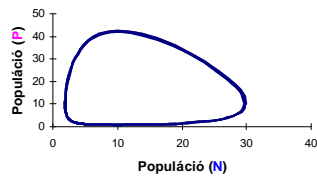
$$N_0 = 5, r_2 = 0.2, C_2 = 0.02$$



The phase diagrams are closed curves.

### PHASE PLANE

Lotka-Volterra ragadozó-zsákmány

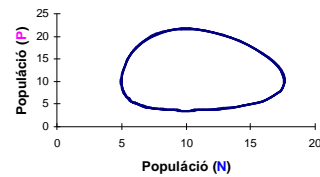


$$P_0 = 10, r_1 = 0.1, C_1 = 0.01;$$

$$N_0 = 30, r_2 = 0.2, C_2 = 0.02$$

above

Lotka-Volterra ragadozó-zsákmány



$$P_0 = 10, r_1 = 0.1, C_1 = 0.01;$$

$$N_0 = 5, r_2 = 0.2, C_2 = 0.02$$

below

$$r_2 / C_2 = 10$$

### Trajektorias

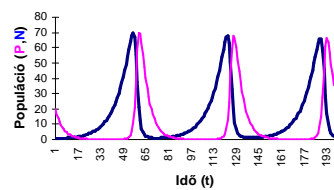
to visualize the solutions of the Lotka-Volterra model for predator-prey: simulations in planes of time and phases

Many thanks to Ms

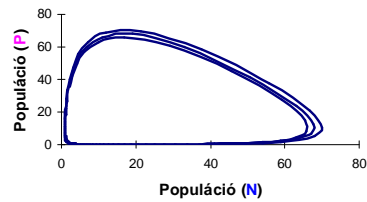
**Kornélia Szabényi**

student of biophysics who calculated the time and phase trajectories with great diligence, patience and expertise.

Lotka-Volterra ragadozó-zsákmány: idő trajektória

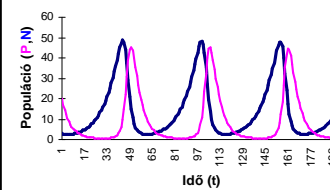


Lotka-Volterra ragadozó-zsákmány

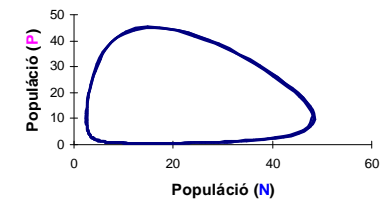


$$P_0 = 20, r_1 = 0.1, C_1 = 0.01; N_0 = 30, r_2 = 0.2, C_2 = 0.013$$

Lotka-Volterra ragadozó-zsákmány: idő trajektória

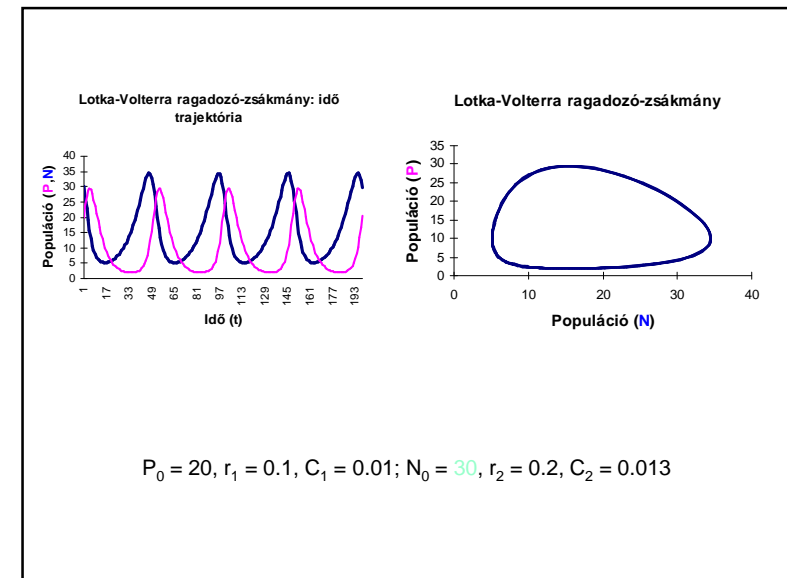
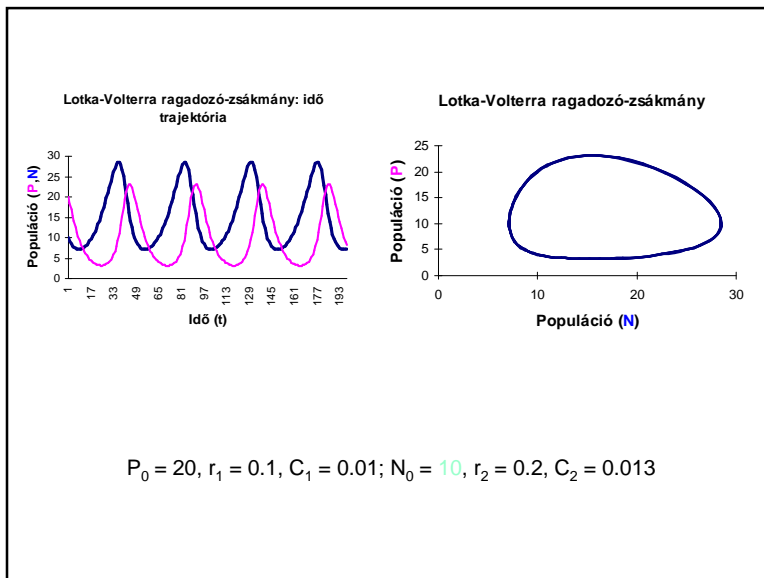
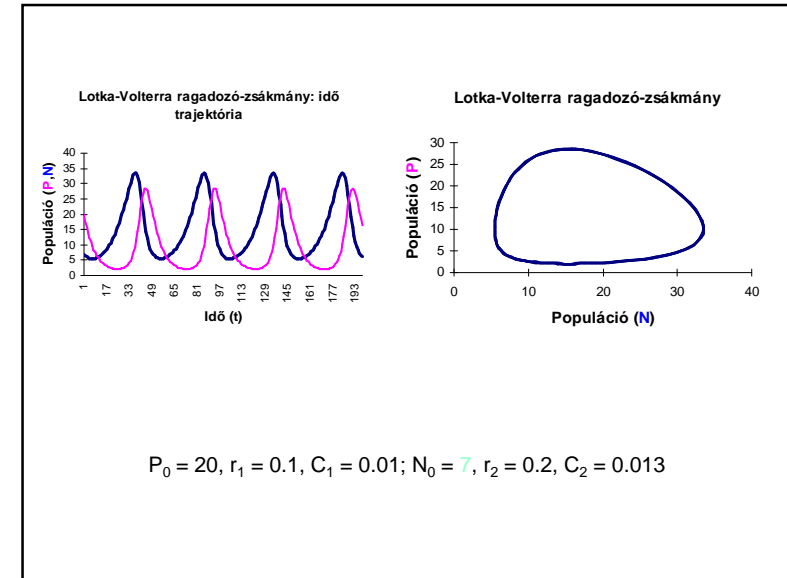
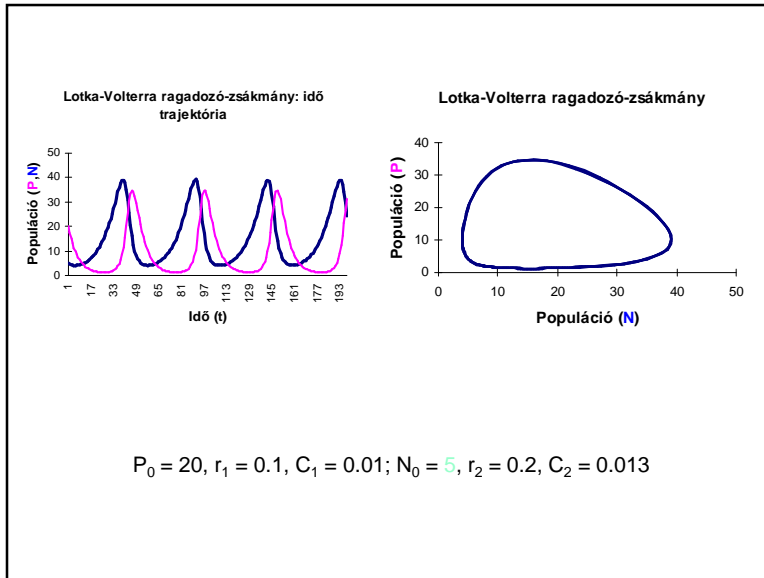


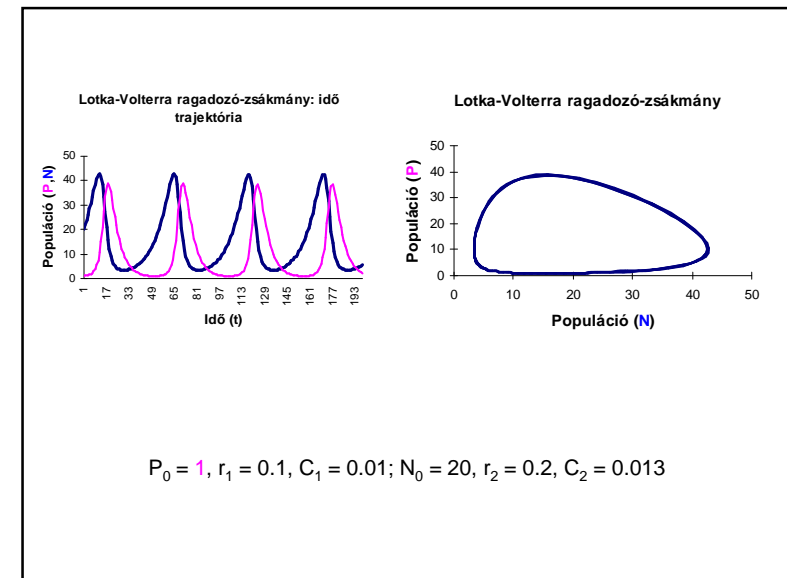
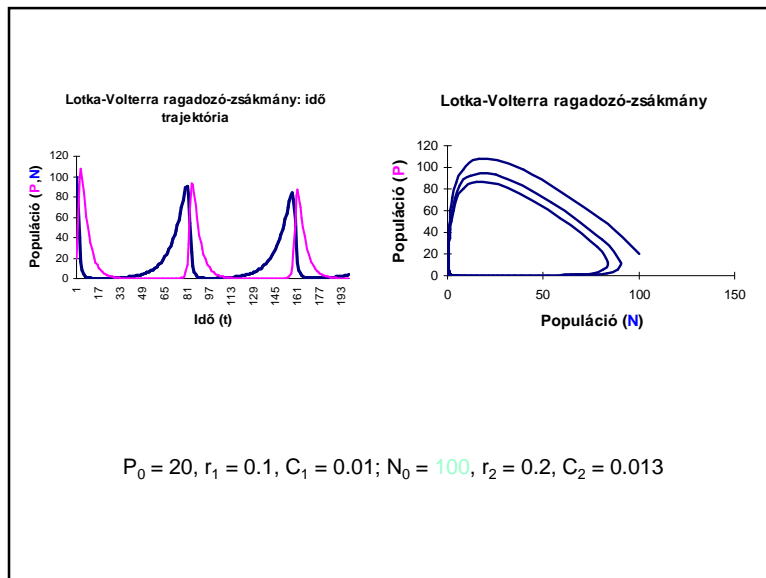
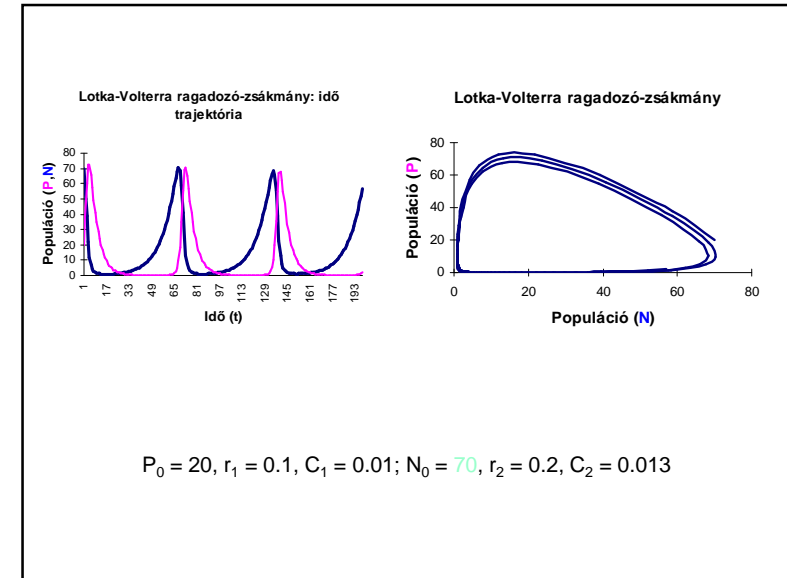
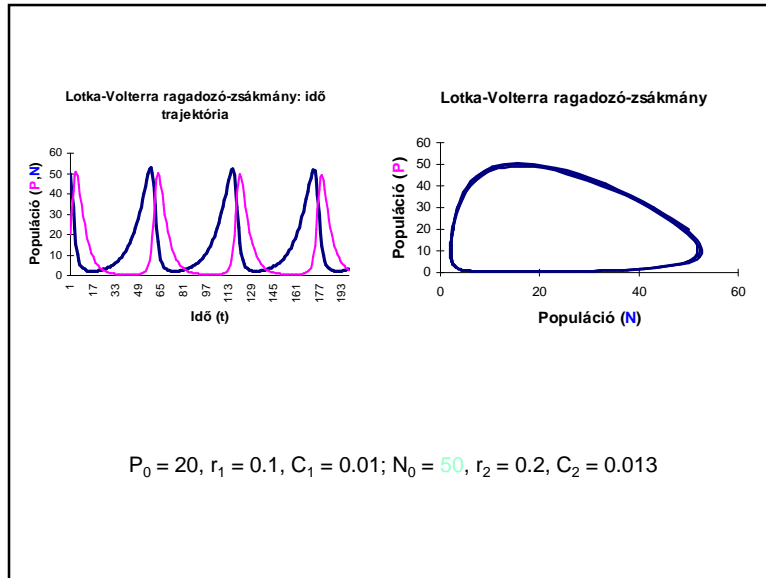
Lotka-Volterra ragadozó-zsákmány

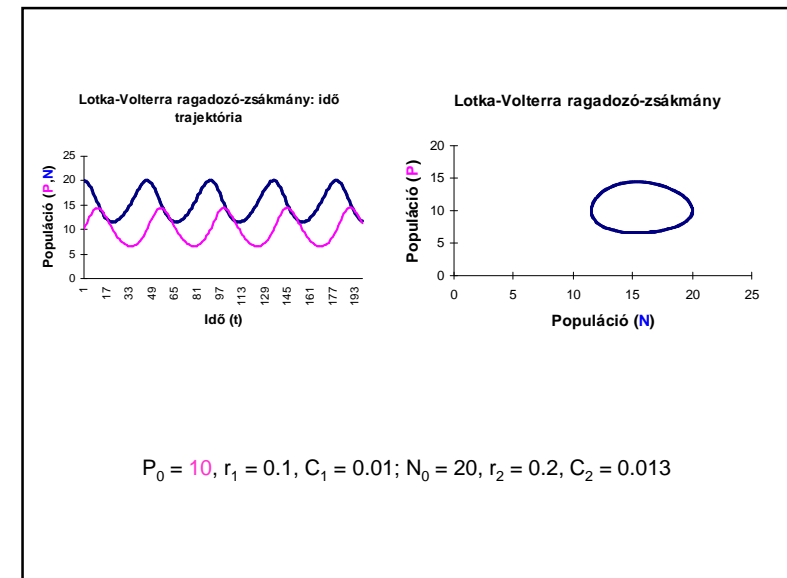
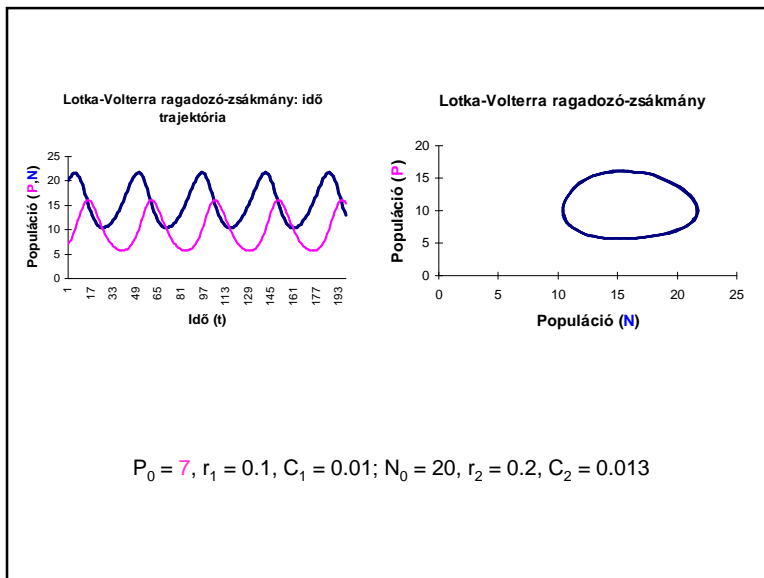
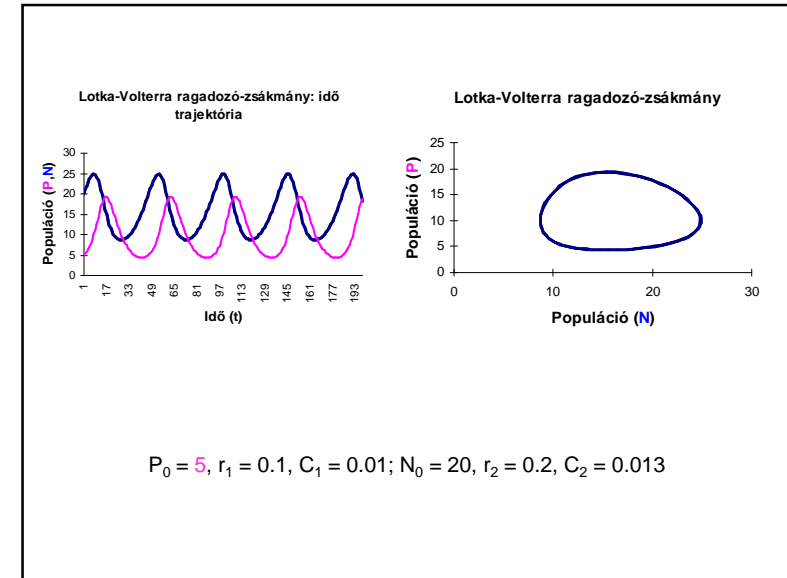
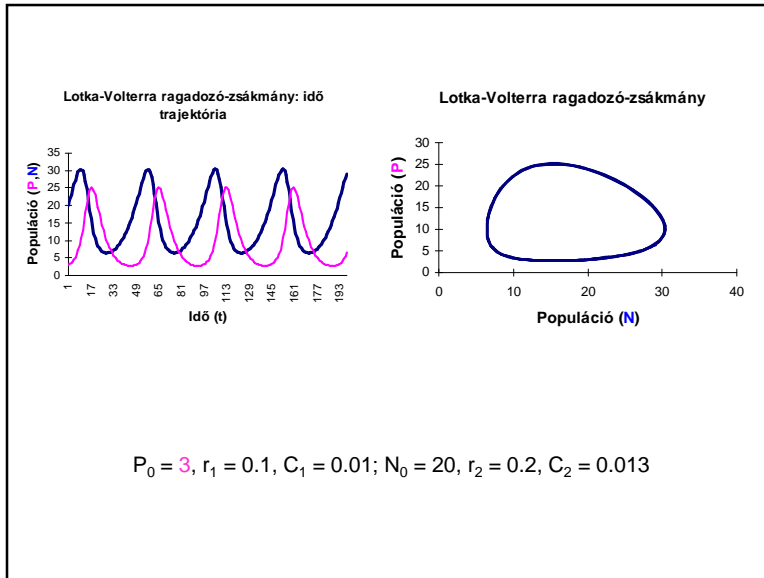


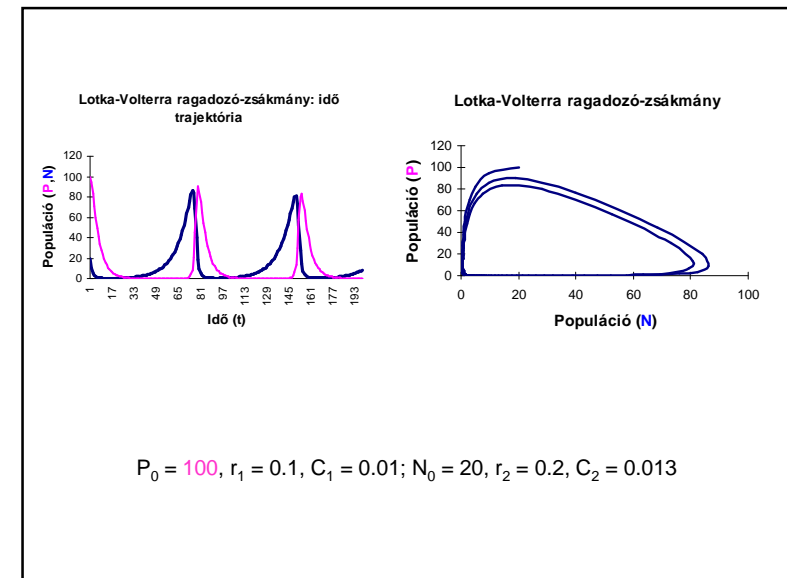
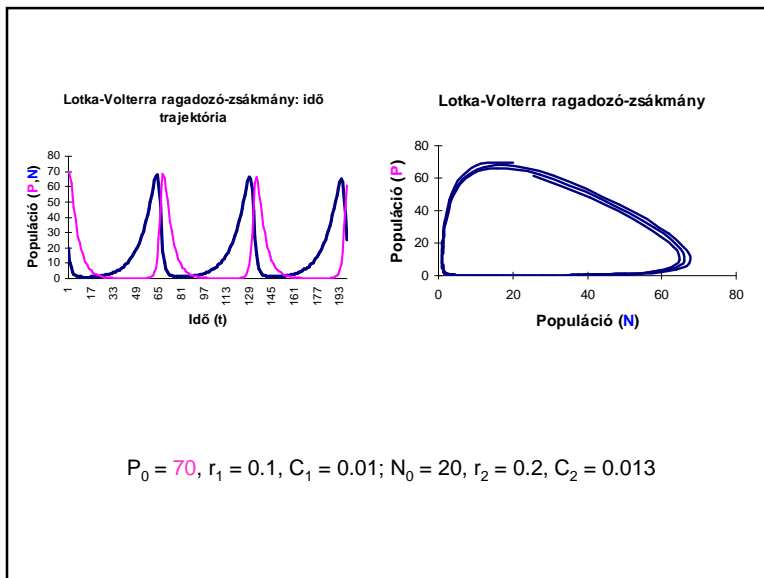
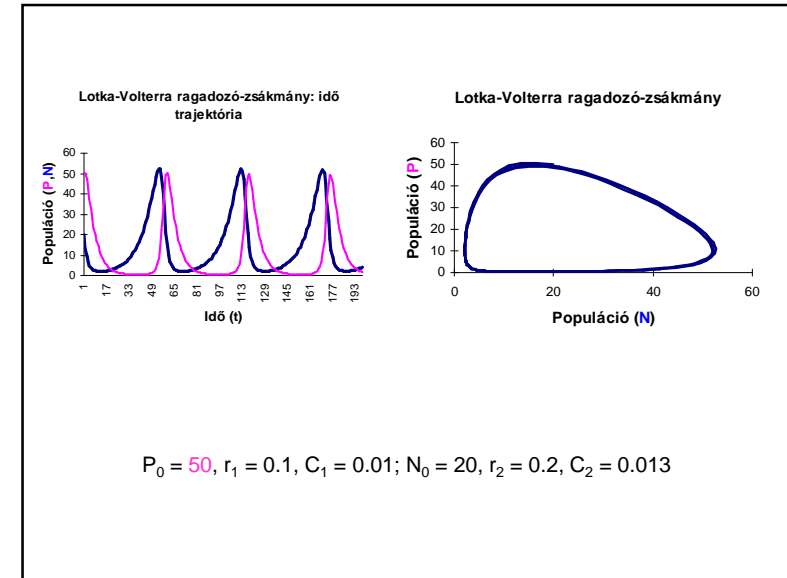
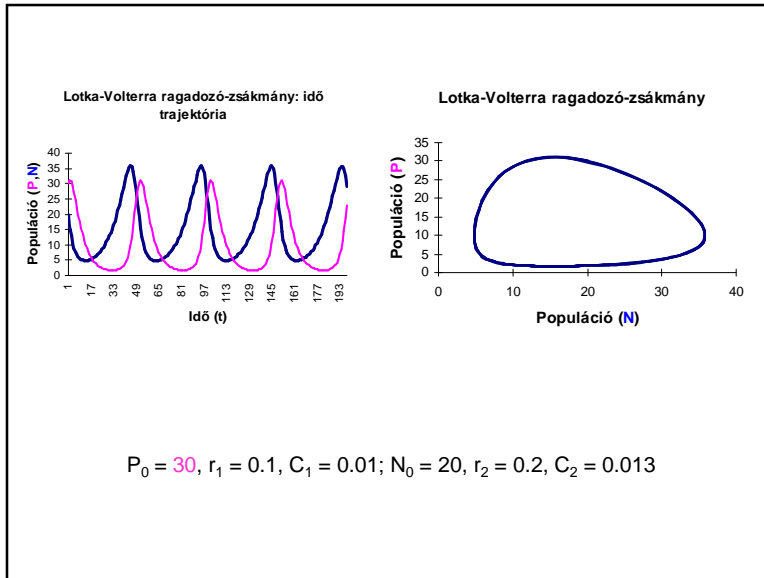
$$P_0 = 20, r_1 = 0.1, C_1 = 0.01; N_0 = 3, r_2 = 0.2, C_2 = 0.013$$

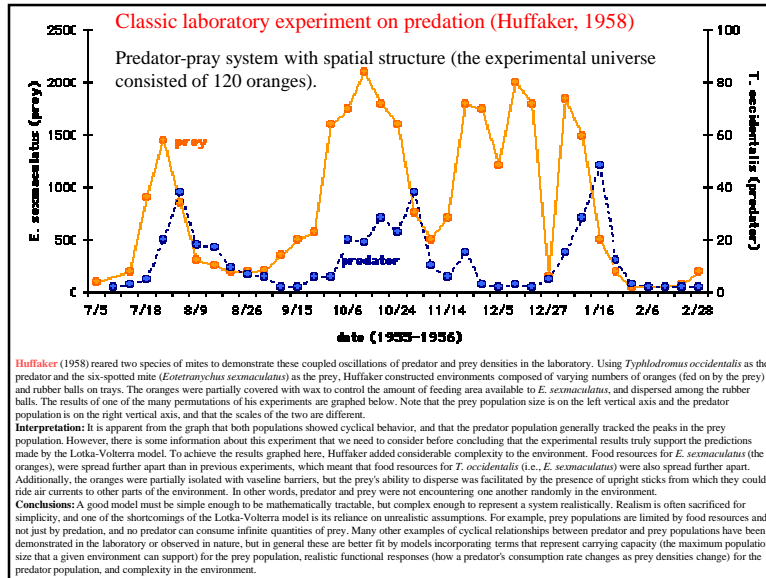












## Predation in natural systems

One of the difficulties of relating the theory to interactions between predator and prey in natural systems is finding a relatively contained (in space) system where there is **a single predator feeding on a single prey**. In most natural systems, predators have alternate prey, and the spatial extent is important (see the Huffaker's experiment, 1958). A way to limit the role of spatial extent is to look at an island, which may also serve to limit the number of alternate prey.

The predator-prey interaction between **wolves and moose** on Isle Royale (located in Lake Superior) has been long studied and can provide insight into the dynamics of predator-prey systems in nature. It is relatively easy to demonstrate that wolves in fact kill moose, but showing that **wolves are responsible for regulating the moose population is more difficult**; the wolves might only be killing moose that would die anyway. To demonstrate that wolves regulate the moose population, one must show that, as the density of moose increase, the number of deaths from wolf predation also increases. (In all the models, the predation terms include this effect.) The data do not provide a clear-cut answer.

## Homework

A farmer discovered a pest eating his crops. After spraying with a pesticide, the farmer found to his great surprise that the level of the pest increased! How can it occur?

**Hint:**

Assume that the pest was being eaten by a predator and that the pesticide affected both the predator and the pest. Also assume that the interaction between the pest and the predator can be described by a continuous time Lotka-Volterra model.

## Summary

We know what **can** regulate populations:

- finite size of food supply („Lebensraum“),
- cannibalism,
- competitors,
- predators (or parasitoids),
- diseases etc.,

but we do not know what actually **does** regulate populations.

We have two possibilities:

1) Dynamics observed in the nature ↔ model-calculation.

**Drawback:** can clearly **reject** a proposed explanation of regulation but cannot **prove** one.

2) Field experiment: removal of a putative competitor or augmentation of the food supply, etc.

**Drawback:** some potential regulating mechanisms

a) cannot be manipulated at all (e.g. diseases), or

b) can be manipulated **in time** (e.g. long-lived organisms as trees or tortoises) or **in space** with great difficulties.