

# CENT'ANNI DI BIOMATEMATICA

un percorso lungo il sentiero  
tracciato da Volterra e Lotka

Mimmo Iannelli  
Università di Trento

Milano, 21 ottobre, 2024

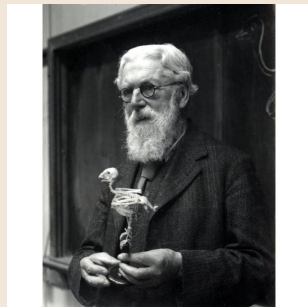
# Cent'anni di Biomatemematica

Qualche anno fa, la ESMTB (European Society for Mathematical and Theoretical Biology), ha celebrato il 2018 come centenario della nascita della Biomatemematica. Allora, infatti, si decise che la nascita della disciplina potesse essere identificata con la pubblicazione, nel 1917, della monografia "On Growth and Form" da parte di D'Arcy Thompson.

# Cent'anni di Biomatemematica

One hundred years ago, in 1917, D'Arcy Thompson published his classic "*On Growth and Form*". Explaining biological morphology based on physical analogy and mathematical transformations, he was among the first to argue that mathematical theory should have a prominent role in biological explanation. In D'Arcy Thompson's opinion, mathematics described and explained biological morphology more elegantly and efficiently than "*mere words*".

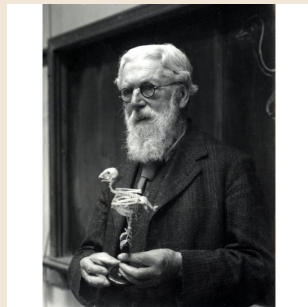
From: The letter from the president of



# Cent'anni di Biomatemematica

One hundred years ago, in 1917, D'Arcy Thompson published his classic *"On Growth and Form"*. Explaining biological morphology based on physical analogy and mathematical transformations, he was among the first to argue that mathematical theory should have a prominent role in biological explanation. In D'Arcy Thompson's opinion, mathematics described and explained biological morphology more elegantly and efficiently than *"mere words"*.

From: The letter from the president of



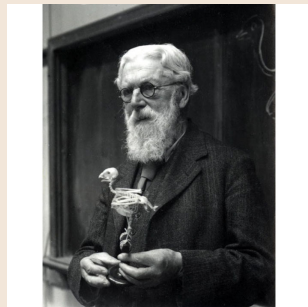
1917



# Cent'anni di Biomatemematica

One hundred years ago, in 1917, D'Arcy Thompson published his classic *"On Growth and Form"*. Explaining biological morphology based on physical analogy and mathematical transformations, he was among the first to argue that mathematical theory should have a prominent role in biological explanation. In D'Arcy Thompson's opinion, mathematics described and explained biological morphology more elegantly and efficiently than *"mere words"*.

From: The letter from the president of



1202

1760

1917



# Cent'anni di Biomatemematica

One hundred years ago, in 1917, D'Arcy Thompson published his classic *"On Growth and Form"*.

Explaining biological morphology based on physical analogy and mathematical transformations, he was

among the first to argue that mathematical

should have a prominent role in biology.

In D'Arcy Thompson's opinion,

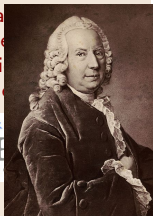
and explained biological morphology more

and efficiently than "mere

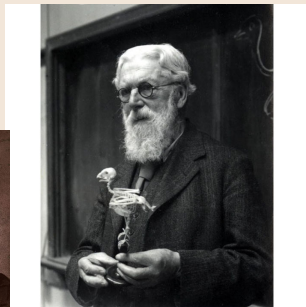
From: The letter from the



EULERO



BERNOULLI



1202

1760

1917



# Cent'anni di Biomatemematica

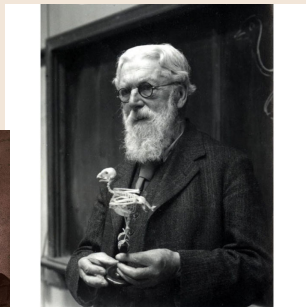
One hundred years ago, in 1917, D'Arcy Thompson published his classic *"On Growth and Form"*.

Explaining biological morphology based on physical analogy and mathematical transformations, he was among the first to argue that mathematical

should have a prominent role in biology.

Thompson's opinion was not shared by all biological mathematicians, but it was more than "mere

curiosity" and it was a step forward from the



FIBONACCI

1202



EULERO

1760



BERNOULLI

1917



# Cent'anni di Biomatemematica

One hundred years ago, in 1917, D'Arcy Thompson published his classic "*On Growth and Form*".

Explaining biological morphology based on analogy and mathematical transformation, he was among the first to argue that mathematics should have a prominent role in biology.



FIBONACCI

1202



EULERO

1760



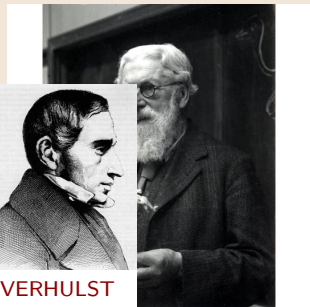
BERNOULLI

1798



VERHULST

1838



1917



# Cent'anni di Biomatemematica

One hundred years ago, in 1917, D'Arcy Thompson published his classic "*On Growth and Form*".

Explaining biological morphology based on analogy and mathematical transformation, he was among the first to argue that mathematics should have a prominent role in the study of biology.



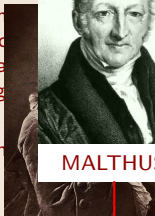
FIBONACCI

1202



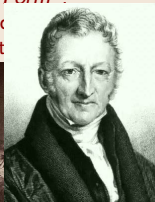
EULERO

1760



BERNOULLI

1798



MALTHUS

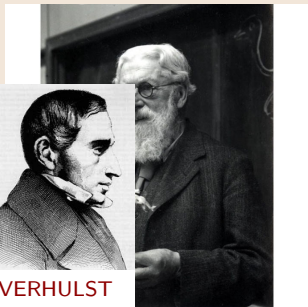
1838



VERHULST

1917

1927



THE GOLDEN AGE

# THE GOLDEN AGE



Alfred Lotka



Vito Volterra

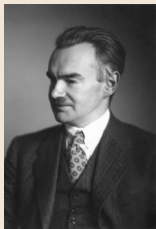
Lotka, A.J. *Elements of Mathematical Biology*. Dover Publication, New York (1924).

Volterra, V. *Variazioni e fluttuazioni del numero d'individui in specie animali conviventi*, Mem. della R. Accademia dei Lincei, ser. VI, vol II, 31-113 (1926)

# THE GOLDEN AGE



Alfred Lotka



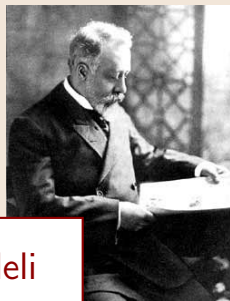
Vito Volterra

W. O. Kermack  
A.G. McKendrick

# THE GOLDEN AGE

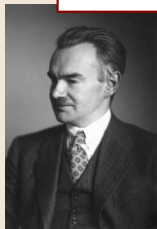


Alfred Russel Wallace



Gregor Mendel

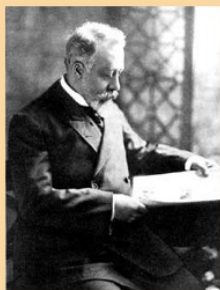
due percorsi paralleli  
destinati ad incrociarsi



W. O. Kermack  
A.G. McKendrick



# THE GOLDEN AGE



Vito Volterra  
1927

Mi permetto presentare alcuni studi sulla coabitazione di specie in un medesimo ambiente .... Per poter trattare la questione matematicamente conviene partire da ipotesi che, pure allontanandosi dalla realtà, ne diano un'immagine approssimata .... Ecco come può impostarsi la questione: cerchiamo di esprimere con parole come procede all'ingrosso il fenomeno; quindi traduciamo queste parole in linguaggio matematico. Questa traduzione conduce ad equazioni differenziali. Se allora ci lasciamo guidare dai metodi dell'analisi siamo condotti molto più lontani di quanto potrebbero portarci il linguaggio ed il ragionamento ordinario e possiamo formulare delle leggi precise matematiche

# THE GOLDEN AGE

Two basic equations (models) for the growth of a single population

Malthus:  $N'(t) = rN(t)$

Verhulst:  $N'(t) = r \left( 1 - \frac{N(t)}{K} \right) N(t)$

- ▶ growth rate:  $r = \beta - \mu$
- ▶ carrying capacity:  $K$

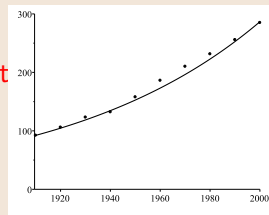
# THE GOLDEN AGE

Two basic equations (models) for the growth of population

Malthus:  $N'(t) = rN(t)$

Verhulst:  $N'(t) = r \left( 1 - \frac{N(t)}{K} \right) N(t)$

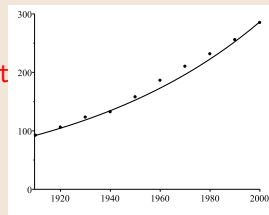
- ▶ growth rate:  $r = \beta - \mu$
- ▶ carrying capacity:  $K$



# THE GOLDEN AGE

Two basic equations (models) for the growth of population

Malthus:  $N'(t) = rN(t)$



Verhulst:  $N'(t) = r \left( 1 - \frac{N(t)}{K} \right) N(t)$

► growth

► carrying capacity

Cette équation étant intégrée donne, en observant que  $t=0$  répond à  $p=b$ ,

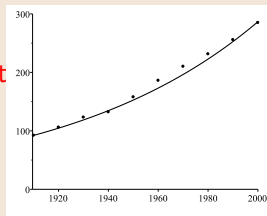
$$t = \frac{1}{m} \log. \left[ \frac{p(m-nb)}{b(m-np)} \right] \dots \dots \dots (4)$$

Nous donnerons le nom de **logistique** à la courbe (*voyez la figure*)

# THE GOLDEN AGE

Two basic equations (models) for the growth of a population

Malthus:  $N'(t) = rN(t)$



Verhulst:  $N'(t) = r \left( 1 - \frac{N(t)}{K} \right) N(t)$

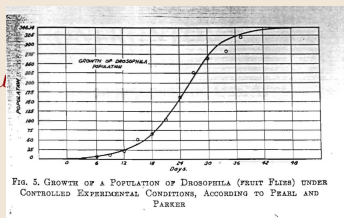
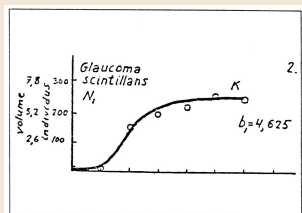


FIG. 5. GROWTH OF A POPULATION OF DROSOPHILA (FRUIT FLIES) UNDER CONTROLLED EXPERIMENTAL CONDITIONS, ACCORDING TO PEARL AND PARKER

## Two prototypes for Ecology

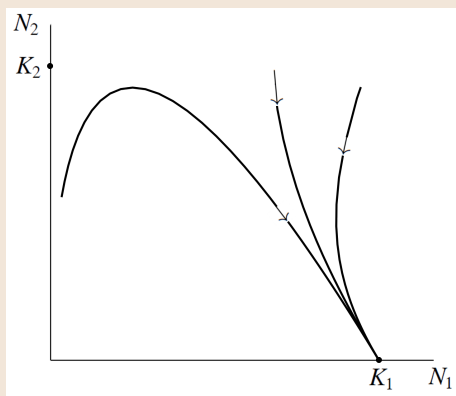
$$\text{competition} \quad \left\{ \begin{array}{l} N_1'(t) = r_1 (1 - \gamma_1(h_1 N_1(t) + h_2 N_2(t))) N_1(t) \\ N_2'(t) = r_2 (1 - \gamma_2(h_1 N_1(t) + h_2 N_2(t))) N_2(t) \end{array} \right.$$

$$\text{predator-prey} \quad \left\{ \begin{array}{l} H'(t) = rH(t) - \gamma H(t)P(t) \\ P'(t) = -\mu P(t) + \omega H(t)P(t) \end{array} \right.$$

# THE GOLDEN AGE

## Two prototypes for Ecology

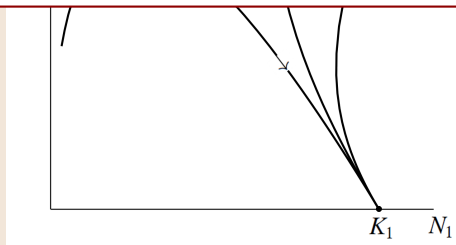
**competition: the principle of exclusion**



## Two prototypes for Ecology

### competition: the principle of exclusion

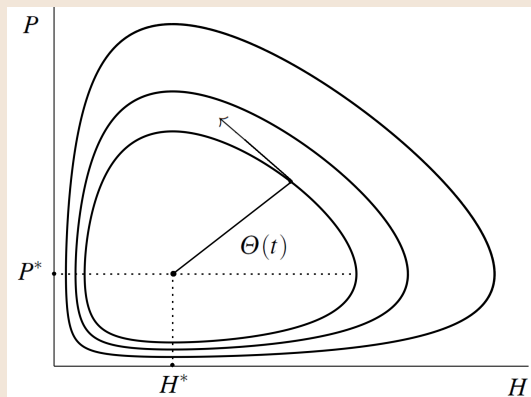
two different species cannot indefinitely occupy the same ecological niche, but one of the two necessarily goes extinct, while the other saturates the niche



# THE GOLDEN AGE

## Two prototypes for Ecology

**predator-prey: periodic fluctuation**



## Two prototypes for Ecology

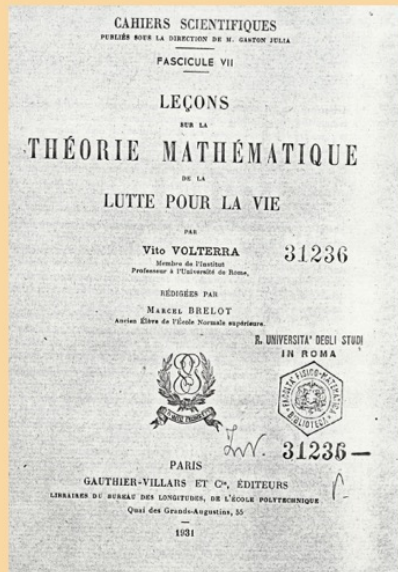
### **predator-prey: Volterra basic laws**

- ▶ **Law of periodic cycle:** the fluctuations of the two species are periodic;
- ▶ **Law of conservation of averages:** the averages of the numbers of the individuals of the two species over a period of time are constant and do not depend upon initial values;
- ▶ **Law of perturbation of averages:** if the two species are uniformly destroyed proportionally to the number of their individuals, the average of the number of individuals of the devoured species increases and the average of the number of individuals of the devouring species decreases.

# THE GOLDEN AGE



1931



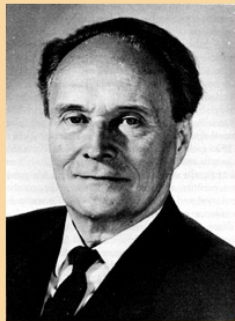
# THE GOLDEN AGE



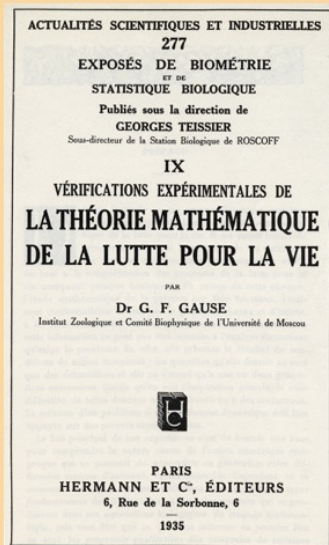
1931

We will present only the researches relative to what we can call the rational phase of the study of the biological associations. Those who will work on the experimental verifications of the theoretical results and will enter into the applied phase will be concerned with a careful discussion of the assumptions and of the biological validity of the arguments, mainly based on experiments, observations and statistics.

# THE GOLDEN AGE



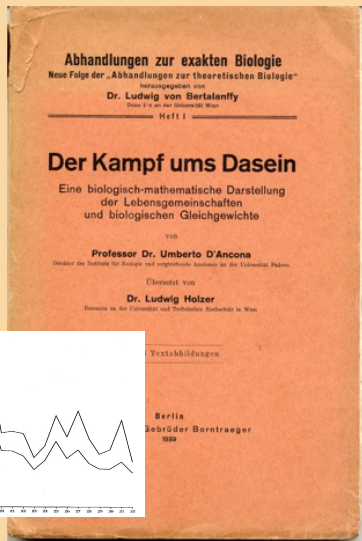
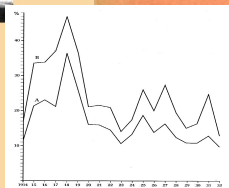
G. F. Gause  
1935



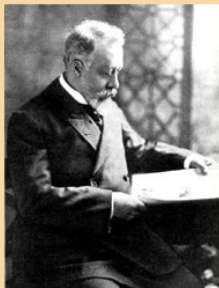
# THE GOLDEN AGE



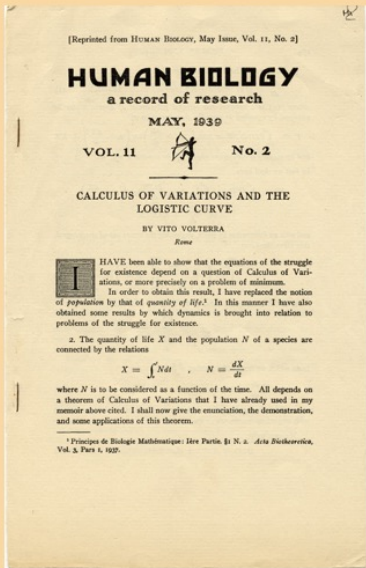
Umberto D'Ancona  
1939



# THE GOLDEN AGE

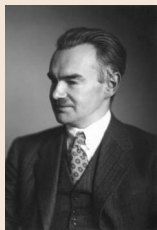


1939



# THE GOLDEN AGE

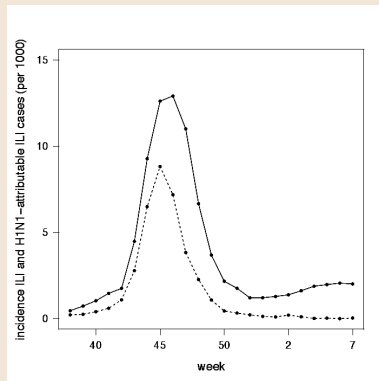
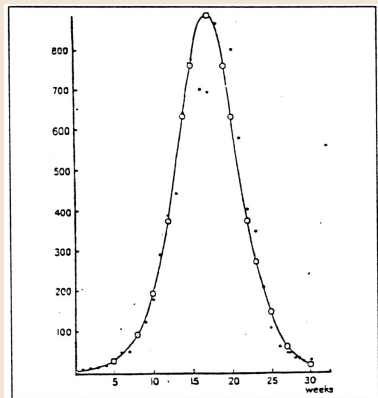
## The mathematical approach to epidemics (1927)



A.G. McKendrick  
W. O. Kermack

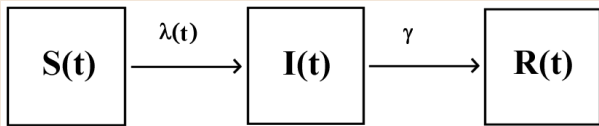
# THE GOLDEN AGE

## A look to data (the single epidemic outbreak)



## The Kermack-McKendrick model (the single epidemic outbreak)

$$\left\{ \begin{array}{ll} S'(t) = -\lambda(t)S(t), & S(0) = S_0 \\ I'(t) = \lambda(t)S(t) - \gamma I(t), & I(0) = I_0 \\ R'(t) = \gamma I(t), & R(0) = R_0 \end{array} \right.$$



## The Kermack-McKendrick model (the single epidemic outbreak)

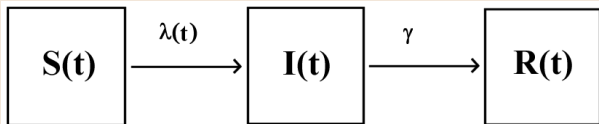
$$\left\{ \begin{array}{l} S'(t) = -\lambda(t)S(t), \\ I'(t) = \lambda(t)S(t) - \gamma I(t) \\ R'(t) = \gamma I(t), \end{array} \right.$$

- $\tau = \frac{1}{\gamma}$  = durata dell'infezione
- $\lambda(t) = \frac{c\chi}{N} I(t)$  = forza di infezione

$c$  = contatti nell'unità di tempo

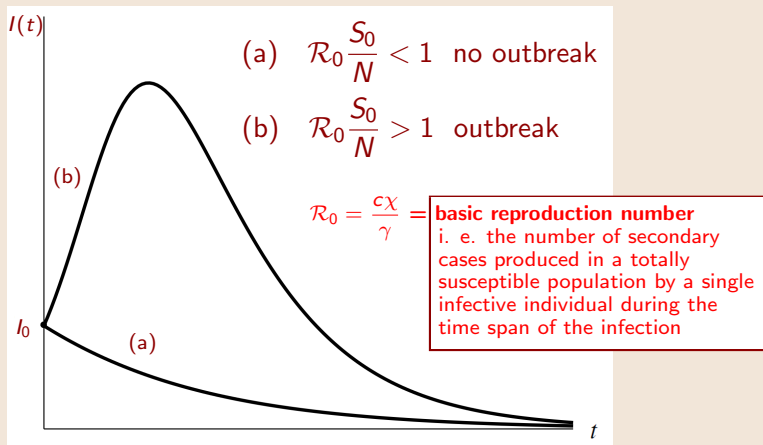
$\chi$  = infettività di un contatto

$N$  = popolazione totale



# THE GOLDEN AGE

## The Kermack-McKendrick model (the single epidemic outbreak)



## The importance of $\mathcal{R}_0$

- ▶ Herd immunity :  $\frac{R_0}{N} > 1 - \frac{1}{\mathcal{R}_0}$
- ▶ Quarantine :  $\rho < \frac{1}{\mathcal{R}_0}$
- ▶ Critical vaccination ratio :  $V_c = 1 - \frac{1}{\mathcal{R}_0}$

## QUIESCENZA 1940-1970 ...

Quando Vito Volterra muore la Biomatemática sembra scomparire. I matematici dimenticano le equazioni di Lotka-Volterra e le applicazioni ai fenomeni biologici. D'altra parte Volterra stesso viene dimenticato, dopo essere stato messo da parte a seguito della sua vicenda personale e politica. La guerra fa il resto, coinvolgendo la scienza in questioni molto differenti dai problemi ecologici, mentre il dopoguerra si concentra sulla ricostruzione e sulla crescita economica industriale. Così, gli anni che vanno dal 1940 al 1970 sono una pagina bianca per la Biomatemática.

# GLI ANNI SETTANTA (formidabili quegli anni ...)

▶ 1974, Journal of Mathematical Biology



▶ 1973, Bulletin of Mathematical Biology



▶ 1967, Mathematical Biosciences



▶ 1961, Journal of Theoretical Biology



# GLI ANNI SETTANTA (formidabili quegli anni ...)

- ▶ 1974, Journal of Mathematical Biology



## Editorial

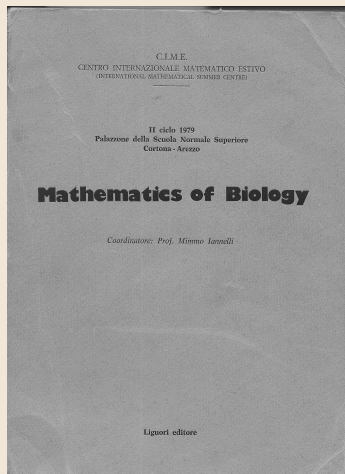
### Experimental Results Motivated by a Theory

### Theoretical Work Disciplined by Biological Facts

Developing a better theoretical understanding of biology is a continuing challenge. Physics and the engineering sciences, which are inconceivable without interaction with mathematics, are the example and the envy of mathematical biology. The example can be misleading. Biological phenomena are physical-chemical phenomena of higher complexity than those usually studied in physics and chemistry. Mathematical methods have limitations. Stating laws of nature is just the beginning. Consequences must be derived by logical-analytical deductions or through computations or through a combination of both. The same as a microscope has a limit of resolution so deductive inference and computation have limits of resolution. These limits may not be very important for some questions in the physical sciences, they are always important in the life sciences.

Because of the limited resolving power the standard method of mathematical biology is to consider simplified descriptions of the biological reality, that is mathematical models. A model should be as realistic as possible yet simple enough so that inferences can be drawn from it. These two requirements often conflict with each other. Also, sometimes very simple models give a

# GLI ANNI SETTANTA (formidabili quegli anni ...)



CONTENTS	
K. L. COOKE	: Delay Differential Equations Pag. 5
J. M. CUSHING	: Volterra Integrodifferential Equations in Populations Dy- namics " 81
K. P. HADELER	: Diffusion Equations in Biology" 149
S. HASTINGS	: Some Mathematical Problems Arising in Neurobiology " 179
F. C. HOPPENSTEADT	: Perturbation Methods in Biolo- gy " 265
STIG-OLOF LODEN	: Integral Equations of Volterra Type " 323

# Metodi Matematici per la Biologia

- ▶ **Analisi qualitativa di O.D.E.**
  - ▶ equilibri, stabilità, coesistenza, esclusione, persistenza, endemicità, oscillazioni, chaos, ...
- ▶ **Equazioni con ritardo (concentrato o distribuito)**
  - ▶ effetti ereditari, struttura di età, gestazione, tempi di maturazione, incubazione di malattie ...
- ▶ **PDE**
  - ▶ struttura spaziale, movimento di popolazioni, propagazione di epidemie, habitat eterogeneo, crescita dei tessuti, struttura di età ...
- ▶ **Matematica discreta e algebra lineare**
  - ▶ modelli a tempo discreto ...
- ▶ **Individual-based modeling (IBM)**
  - ▶ simulazione di sistemi complessi, descrizione dettagliata individuale, learning ....
- ▶ **Equazioni stocastiche**

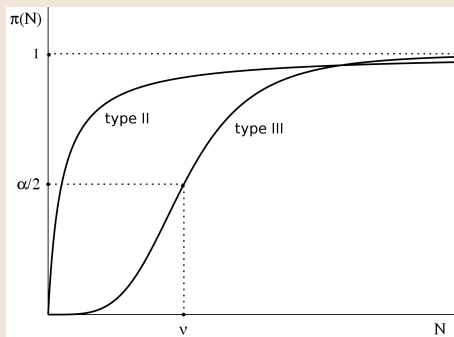
## Qualche Esempio Significativo

- ▶ **Predatore generalista**
- ▶ **Struttura di età**
- ▶ **COVID-19 e controllo ottimale**

# Predatore Generalista

$$N'(t) = r \left( 1 - \frac{N(t)}{K} \right) N(t) - \alpha \frac{N^2(t)}{\nu^2 + N^2(t)}$$

Holling type III  
functional response

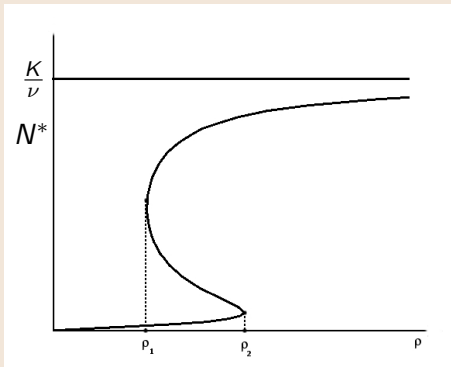


# Predatore Generalista

$$0 = r \left( 1 - \frac{N^*}{K} \right) N^* - \alpha \frac{N^{*2}}{\nu^2 + N^{*2}}$$

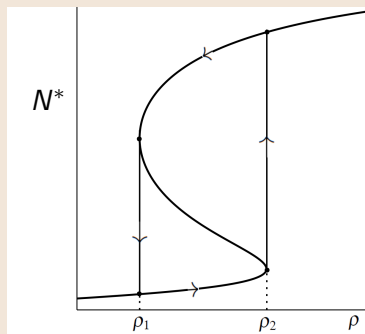
Stati stazionari  
in funzione  
del parametro

$$\rho = \frac{r\nu}{\alpha}$$



# Predatore Generalista

$$0 = r \left( 1 - \frac{N^*}{K} \right) N^* - \alpha \frac{N^{*2}}{\nu^2 + N^{*2}}$$



# Struttura di età

## the elements of a description

- ▶ **age**  $a \in [0, \alpha_{\dagger}]$  ( $\alpha_{\dagger}$  is the maximum age, usually  $\alpha_{\dagger} < +\infty$ )
- ▶ **density** of the population with respect to age, at time  $t$ .

$$p(t, a), \quad t \geq 0, \quad a \in [0, \alpha_{\dagger}] \quad \left( N(t) = \int_0^{\alpha_{\dagger}} p(t, a) da \right)$$

- ▶ **birth rate**  $B(t)$ : the number of newborn in a time unit at time  $t$

$$B(t) = \int_0^{\alpha_{\dagger}} \beta(a) p(t, a) da$$

where  $\beta(a)$  is the age-specific fertility.

- ▶ **survival probability**  $\Pi(a)$  : the probability for a newborn to survive to age  $a$

$$\Pi(a) = e^{-\int_0^a \mu(a) da}$$

where  $\mu(a)$  is the age-specific mortality

two equivalent approaches

- ▶ **Lotka** an equation for the birth rate

$$B(t) = \int_0^t \beta(a)\Pi(a)B(t-a)da + F(t) \quad \left( F(t) = \int_{-\infty}^0 \beta(t-a)\Pi(t-a)\phi(a)da \right)$$

- ▶ **McKendrick** an hyperbolic PDE with a non-local boundary condition

$$\begin{cases} p_t + p_a + \mu(a)p(t, a) = 0 \\ p(0, t) = \int_0^{a_+} \beta(a)p(t, a)da \\ p(0, a) = p_0(a) \end{cases}$$

connected by

$$p(t, a) = B(t-a)\Pi(a) \quad t \geq 0, \quad a \in [0, a_+]$$

# Struttura di età

the demographer's delight: the stable distribution  
(Sharpe-lotka theorem)

The population eventually forgets  
its initial age distribution  $p_0(a)$ ,  
to attain the stable population profile

$$\omega^*(a) = \frac{e^{-\alpha^* a} \Pi(a)}{\int_0^{a^\dagger} e^{-\alpha^* a} \Pi(a)}$$

where  $\alpha^*$  is the (unique) real solution of the characteristic equation

$$\int_0^{a^\dagger} \beta(a) \Pi(a) e^{-\lambda a} da = 1$$

indeed

$$B(t) = b_0 e^{\alpha^* t} (1 + \Omega(t)) \quad \text{with} \quad \lim_{t \rightarrow +\infty} \Omega(t) = 0$$

# Struttura di età

the demographer's delight: the stable distribution  
(Sharpe-lotka theorem)

The population eventually forgets  
its initial age distribution  $p_0(a)$ ,  
to attain the stable population profile

$$\frac{p(t, a)}{N(t)}$$

$$\omega^*(a) = \frac{e^{-\alpha^* a} \Pi(a)}{\int_0^{a^\dagger} e^{-\alpha^* a} \Pi(a)}$$

where  $\alpha^*$  is the (unique) real solution of the characteristic equation

$$\int_0^{a^\dagger} \beta(a) \Pi(a) e^{-\lambda a} da = 1$$

indeed

$$B(t) = b_0 e^{\alpha^* t} (1 + \Omega(t)) \quad \text{with} \quad \lim_{t \rightarrow +\infty} \Omega(t) = 0$$

# Struttura di età

the demographer's delight: the stable distribution  
(Sharpe-lotka theorem)

The population eventually attains its stable age distribution to attain the stable population growth rate

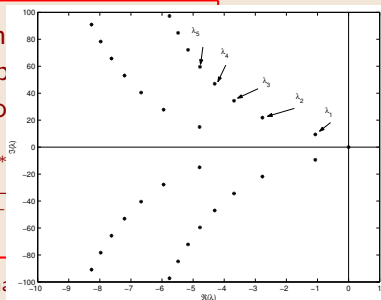
$$\omega^*(a) = \frac{e^{-\alpha^* a}}{\int_0^{a^\dagger} e^{-\alpha^* a} \beta(a) \Pi(a) da}$$

where  $\alpha^*$  is the (unique) real solution of the characteristic equation

$$\int_0^{a^\dagger} \beta(a) \Pi(a) e^{-\lambda a} da = 1$$

indeed

$$B(t) = b_0 e^{\alpha^* t} (1 + \Omega(t)) \quad \text{with} \quad \lim_{t \rightarrow +\infty} \Omega(t) = 0$$



# Struttura di età

the demographer's delight: the stable distribution

$$\mathcal{R}_0 = \int_0^{a^\dagger} \beta(a)\Pi(a)da$$

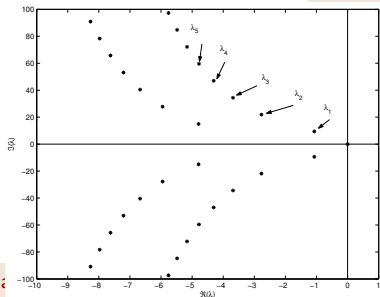
$\alpha^* > 0$  if and only if  $\mathcal{R}_0 > 1$

where  $\alpha^*$  is the (unique) real solution of the ch:

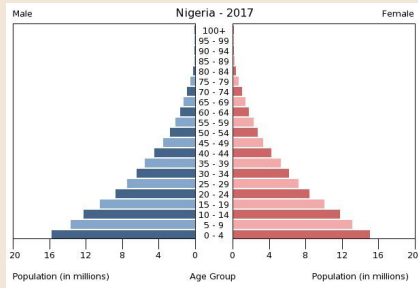
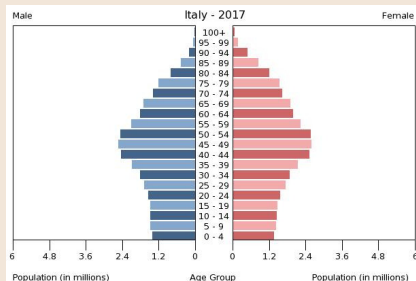
$$\int_0^{a^\dagger} \beta(a)\Pi(a)e^{-\lambda a}da = 1$$

indeed

$$B(t) = b_0 e^{\alpha^* t} (1 + \Omega(t)) \quad \text{with} \quad \lim_{t \rightarrow +\infty} \Omega(t) = 0$$



# Struttura di età



# Struttura di età

Yet another approach: semigroups

$$\begin{cases} p_t + p_a + \mu(a)p(t, a) = 0 \\ p(0, t) = \int_0^{a_+} \beta(a)p(t, a)da \\ p(0, a) = p_0(a) \end{cases} \longrightarrow \begin{cases} u'(t) = \mathcal{A} u(t) \\ u(0) = u_0 \end{cases}$$

$$u(t) := p(\cdot, t), \quad u_0 := p_0(\cdot), \quad \text{in } E = L^1(0, a_+)$$

$$\mathcal{A} := \begin{cases} D_{\mathcal{A}} := \left\{ f(\cdot) \in E \mid f'(\cdot) + \mu(\cdot)f(\cdot) \in E, \right. \\ \left. f(0) = \int_0^{a_+} \beta(a)f(a)da \right\} \\ \mathcal{A}f(\cdot) := -f'(\cdot) - \mu(\cdot)f(\cdot) \end{cases}$$

# COVID-19 e controllo ottimale

Determining optimal strategies for controlling the disease

State system ( $t \in [0, T]$ )

$$\left\{ \begin{array}{l} i) \quad \left( \frac{\partial}{\partial t} + \frac{\partial}{\partial x} \right) Y(x, t) = -\gamma(x)Y(x, t), \\ ii) \quad Y(0, t) = c(t) \int_0^{x^+} \chi(x)Y(x, t)dx, \end{array} \right.$$

Cost function to be minimized

$$\mathcal{C}_{total}(c) = \chi \mathcal{C}_E(c) + (1 - \chi) \mathcal{C}_w(c)$$

# COVID-19 e controllo ottimale

Deterministic

disease

State system (

Direct health costs of the epidemic:

all cases of serious disease following infection  
i.e., yielding to hospitalizations and deaths.

These cases arise from the total incidence:

$$C_E \int_0^T c(t) \int_0^\infty \chi(x) Y(t, x) dx dt$$

$C_E$  is the average cost generated by one infected individual per unit of time over period  $[0, T]$

Cost function to be minimized



$$C_{total}(c) = \chi C_E(c) + (1 - \chi) C_w(c)$$

# COVID-19 e controllo ottimale

Determina

la diffusione della malattia

Il sistema di stato (

Overall indirect cost, arising from a prescribed *social distancing policy*  $c(t)$  through  $[0, T]$ .


$$C_w \int_0^T Q(c(t)) dt$$

$Q(x)$  is a loss function, it is decreasing and

$$Q(c_-) = 1 \quad , \quad Q(c_0) = 0$$

$C_w$  is the maximum cost occurring at  $c = c_-$   
(a fraction of the total welfare per unit time)

Cost function to be minimized


$$C_{total}(c) = \chi C_E(c) + (1 - \chi) C_w(c)$$

# COVID-19 e controllo ottimale

Determining optimal strategies for controlling the disease

State system ( $t \in [0, T]$ )

$$(i) \quad \left( \frac{\partial}{\partial t} + \frac{\partial}{\partial x} \right) Y(x, t) = -\alpha(x) Y(x, t)$$

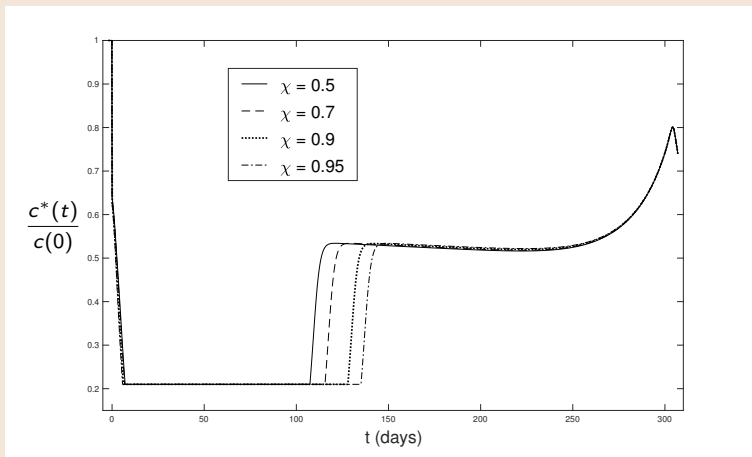
The relative weight of the epidemics cost against economic cost. It reflects the governmental preference for indirect costs

Cost function to be minimized

$$C_{total}(c) = \chi C_E(c) + (1 - \chi) C_w(c)$$

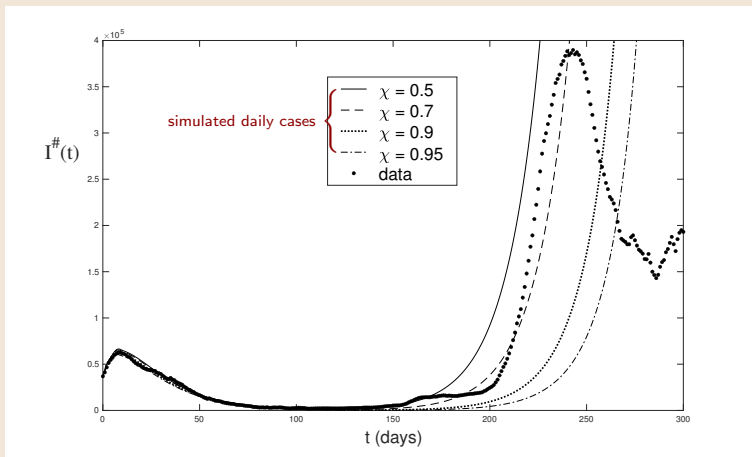
# COVID-19 e controllo ottimale

Optimal lock-down (parameters from COVID-19)



# COVID-19 e controllo ottimale

## Optimal lock-down (parameters from COVID-19)



# Daniel Bernoulli

## 1760



A proposito della inoculazione contro il vaiolo

“ ... io spero solo che su una questione che riguarda così da vicino il bene dell'umanità, non si decida nulla se non con quella cognizione di causa che un po' di analisi e di calcolo possono fornire ...”

**La costruzione d'un modello era dunque per lui un miracolo d'equilibrio tra i principi (lasciati nell'ombra) e l'esperienza (inafferrabile), ma il risultato doveva avere una consistenza molto più solida degli uni e dell'altra.**

**Italo Calvino**

**da "Il modello dei modelli" in "Palomar", 1983**

**GRAZIE PER L'ATTENZIONE**