

# Física e Biologia do Crescimento Populacional

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## Data collapse, scaling functions, and analytical solutions of generalized growth models

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We consider a nontrivial one-species population dynamics model with finite and infinite carrying capacities. Time-dependent intrinsic and extrinsic growth rates are considered in these models. Through the model *per capita* growth rate we obtain a heuristic general procedure to generate scaling functions to collapse data into a simple linear behavior even if an extrinsic growth rate is included. With this data collapse, all the models studied become independent from the parameters and initial condition. Analytical solutions are found when time-dependent coefficients are considered. These solutions allow us to perceive nontrivial transitions between species extinction and survival and to calculate the transition's critical exponents. Considering an extrinsic growth rate as a cancer treatment, we show that the relevant quantity depends not only on the intensity of the treatment, but also on when the cancerous cell growth is maximum.



## Effective carrying capacity and analytical solution of a particular case of the Richards-like two-species population dynamics model

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### ABSTRACT

We consider a generalized two-species population dynamic model and analytically solve it for the amensalism and commensalism ecological interactions. These two-species models can be simplified to a one-species model with a time dependent extrinsic growth factor. With a one-species model with an effective carrying capacity one is able to retrieve the steady state solutions of the previous one-species model. The equivalence obtained between the effective carrying capacity and the extrinsic growth factor is complete only for a particular case, the Gompertz model. Here we unveil important aspects of sigmoid growth curves, which are relevant to growth processes and population dynamics.

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# Full analytical solution and complete phase diagram analysis of the Verhulst-like two-species population dynamics model

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**Abstract.** The two-species population dynamics model is the simplest paradigm of interspecies interaction. Here, we include intraspecific competition to the Lotka-Volterra model and solve it analytically. Despite being simple and thoroughly studied, this model presents a very rich behavior and some characteristics not so well explored, which are unveiled. The forbidden region in the mutualism regime and the dependence on initial conditions in the competition regime are some examples of these characteristics. From the stability of the steady state solutions, three phases are obtained: (i) extinction of one species (Gause transition), (ii) their coexistence and (iii) a forbidden region. Full analytical solutions have been obtained for the considered ecological regimes. The time transient allows one to defined time scales for the system evolution, which can be relevant for the study of tumor growth by theoretical or computer simulation models.

## Generalized competitive Lotka-Volterra model

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(Dated: November 26, 2012)*

The two-species population dynamics model is the simplest paradigm of inter- and intra-species interaction. Here, we present a generalized competitive Lotka-Volterra model, which retrieves as particular cases, some well known two-population dynamic models. We identify the model generalization parameter with the environmental fractal dimension and the individuals interaction range. The species interaction parameters are not restricted, consequently they can represent different ecological regimes. The asymptotic solutions stability analysis leads to represent the ecological regimes as a phase diagram in the parameter space. In this diagram we call attention to: a forbidden region in the mutualism regime and to the region with dependence on initial conditions, in the competition regime. Also, we have identified predation and competition to be weak, if there are species coexistence or strong if there are species extinction. Moreover, contrasting to known two-species models,



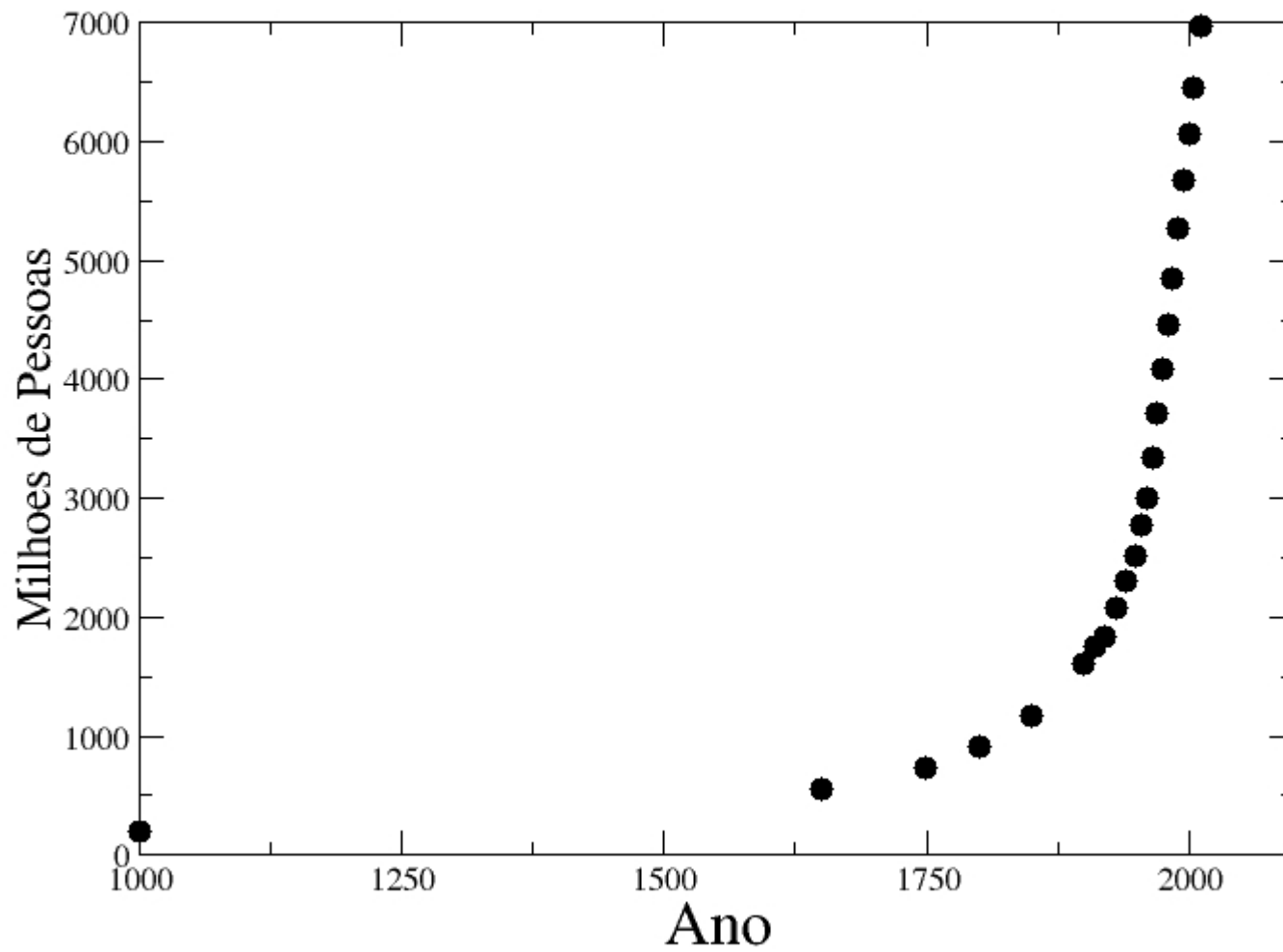
## World human population.

Year	Population (millions)	Year	Population (millions)
1000	200	1955	2780
1650	545	1960	3005
1750	728	1965	3345
1800	906	1970	3707
1850	1171	1975	4086
1900	1608	1980	4454
1910	1750	1985	4850
1920	1834	1990	5263
1930	2070	1995	5674
1940	2295	2000	6070
1950	2517	2005	6453

**18/06/2013: 7.092.566.780 Habitantes**

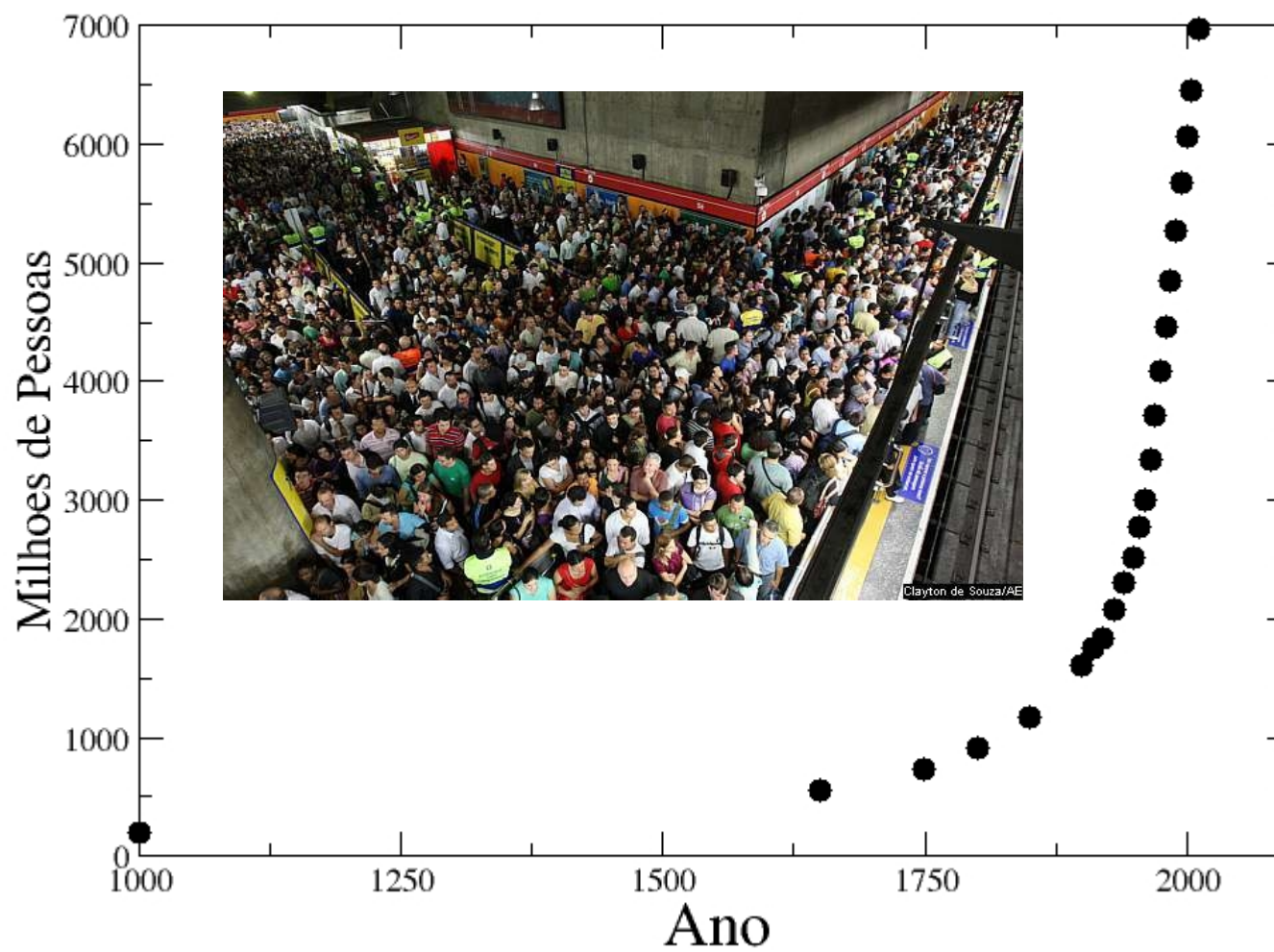
Fonte: Fundo de População das Nações unidas (UNFPA/ONU)

# Populacao Humana





# Populacao Humana



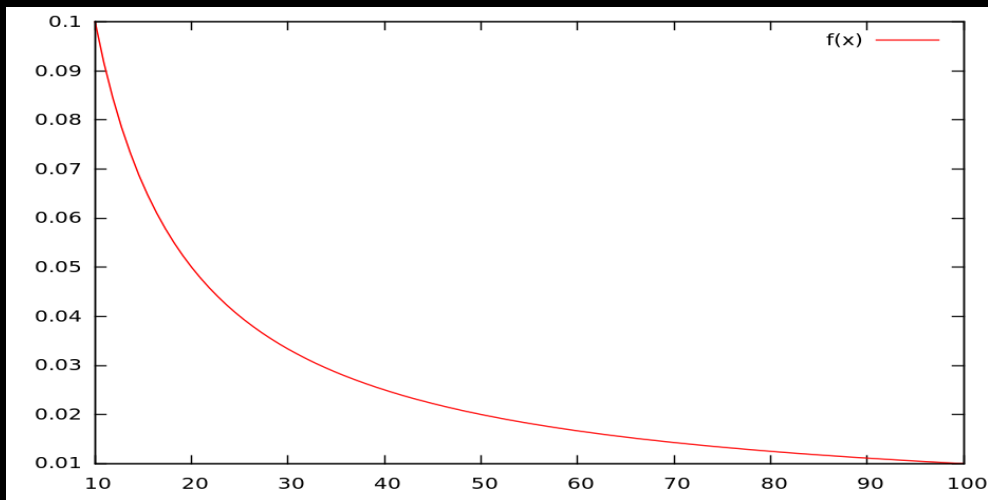


Blue whale *Balaenoptera musculus*

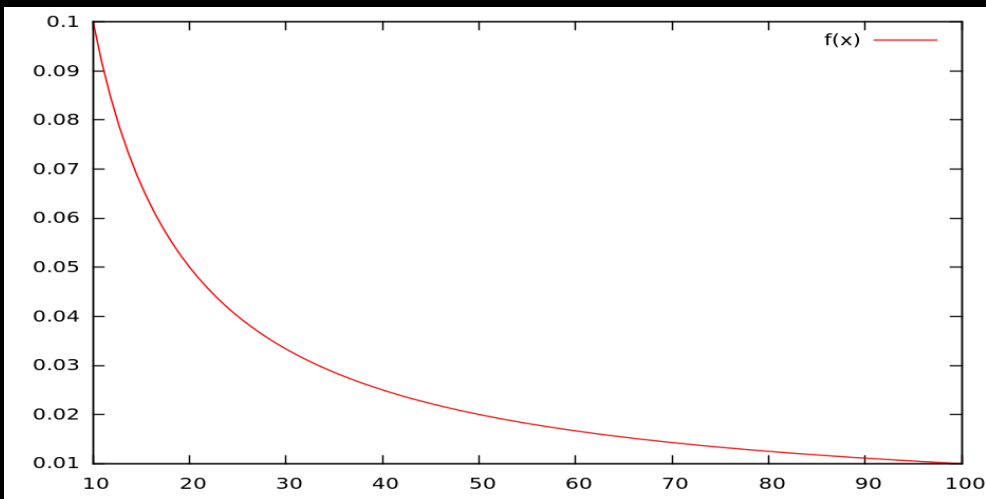
Informational sign about the blue whale.

Informational sign about the rhinoceros skull.

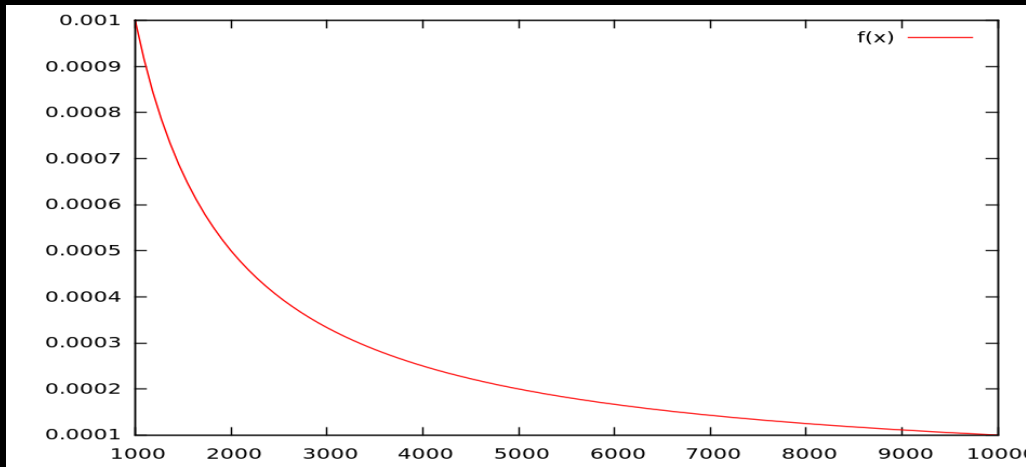
# **Busca de uma Lei do Crescimento**

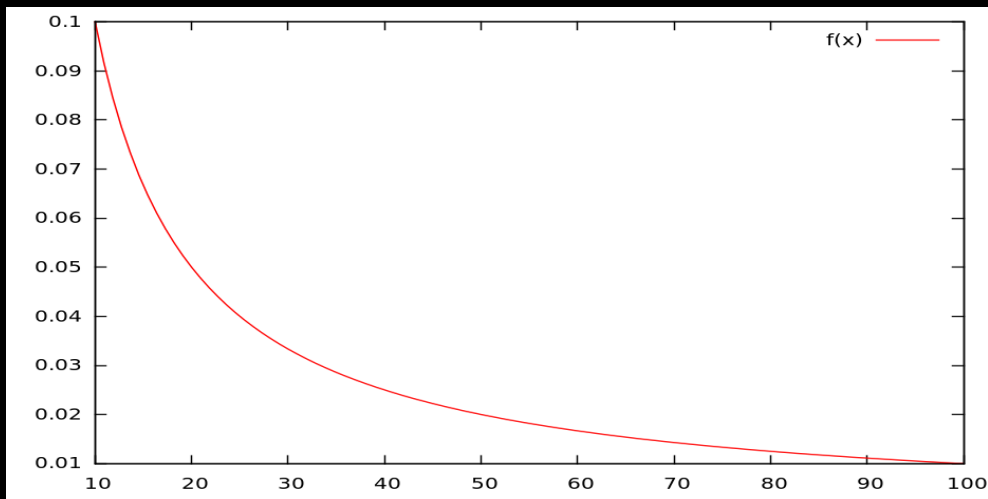


$$y(x) = x^{-1}$$

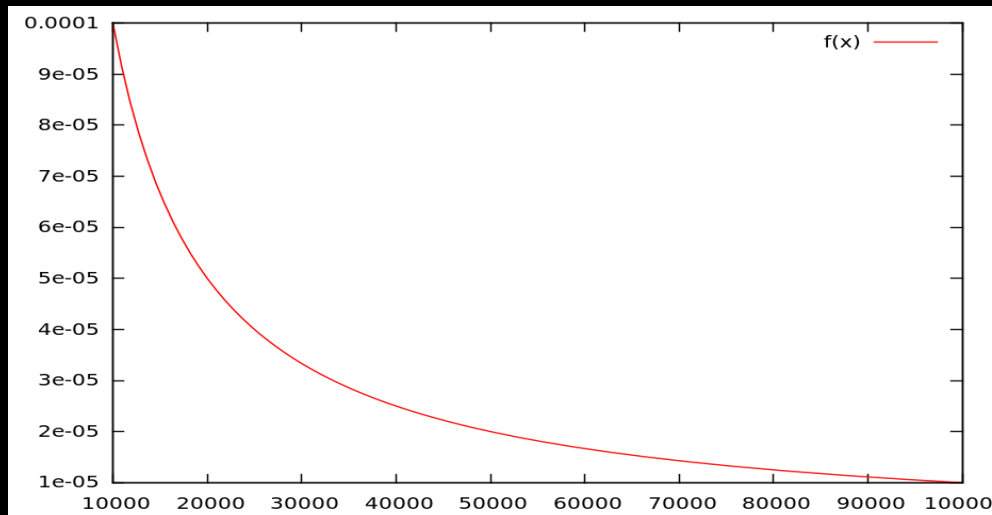
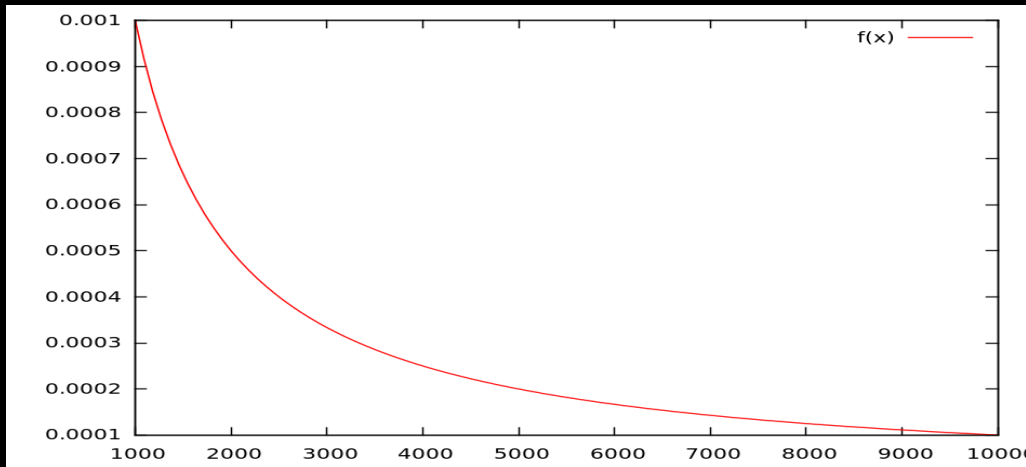


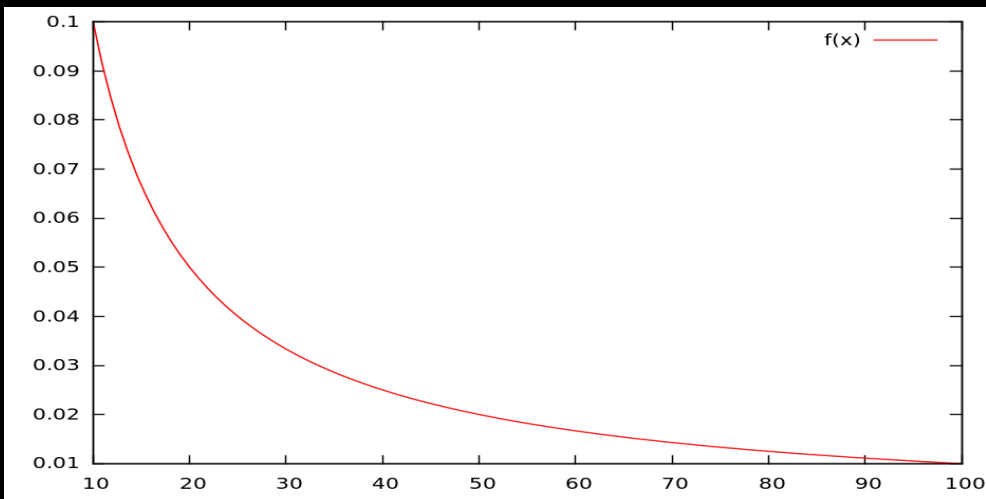
$$y(x) = x^{-1}$$



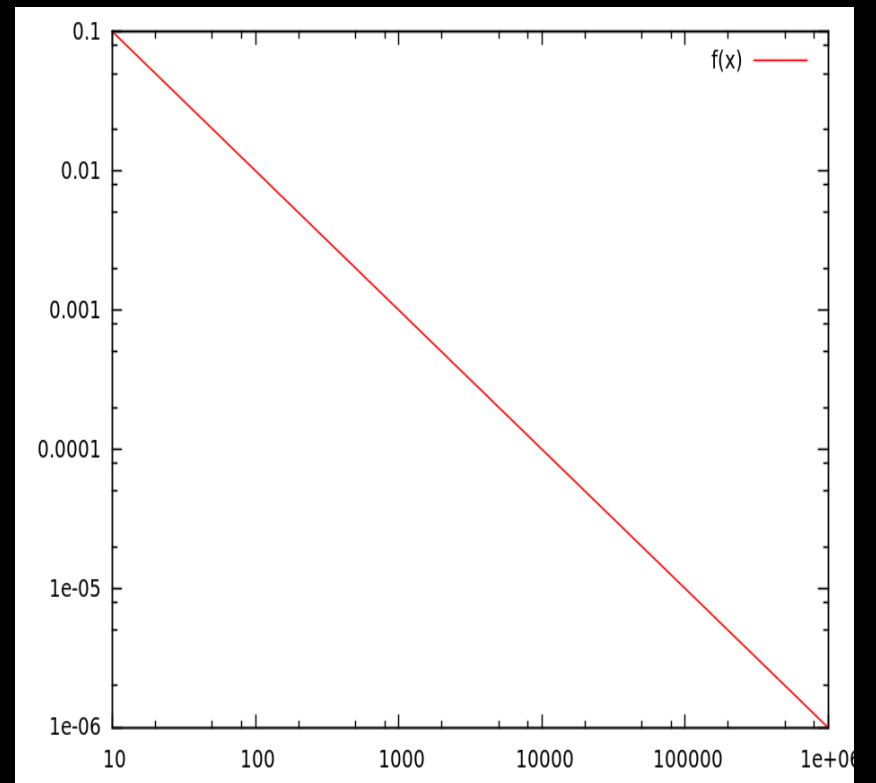
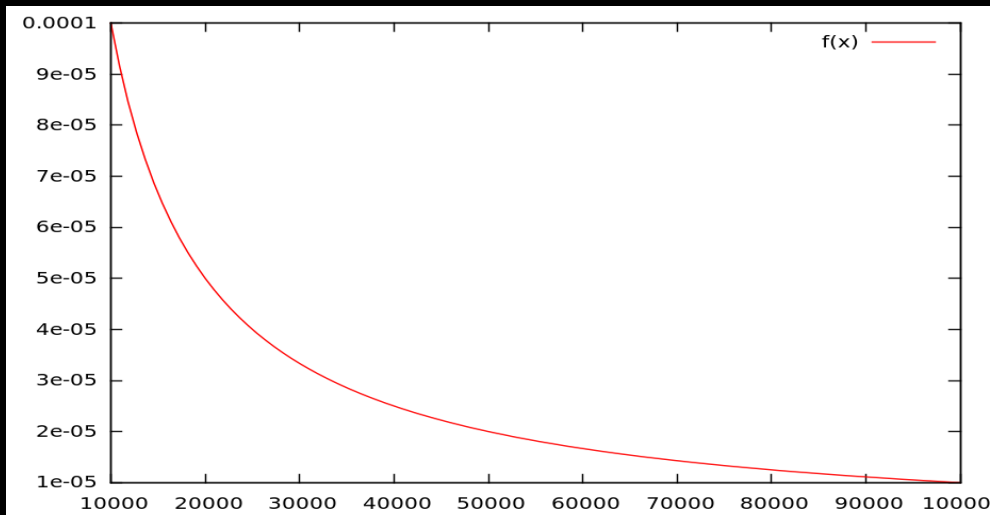
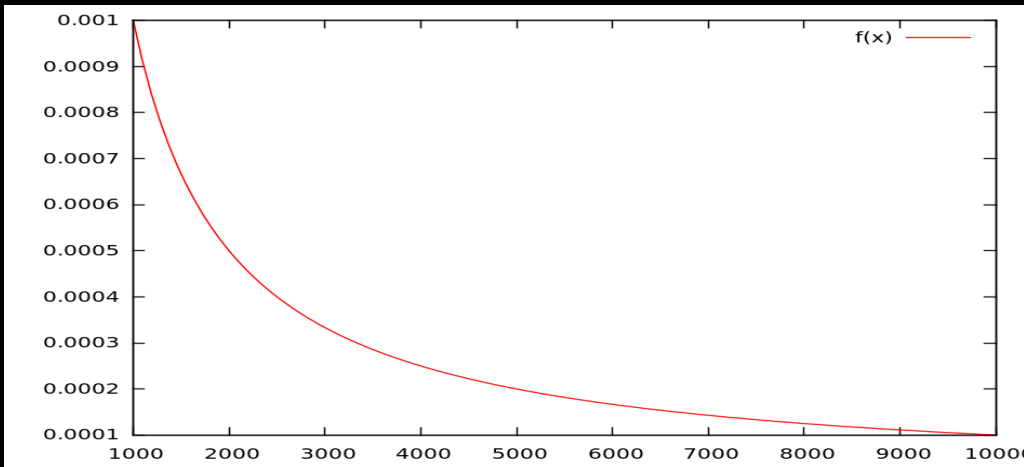


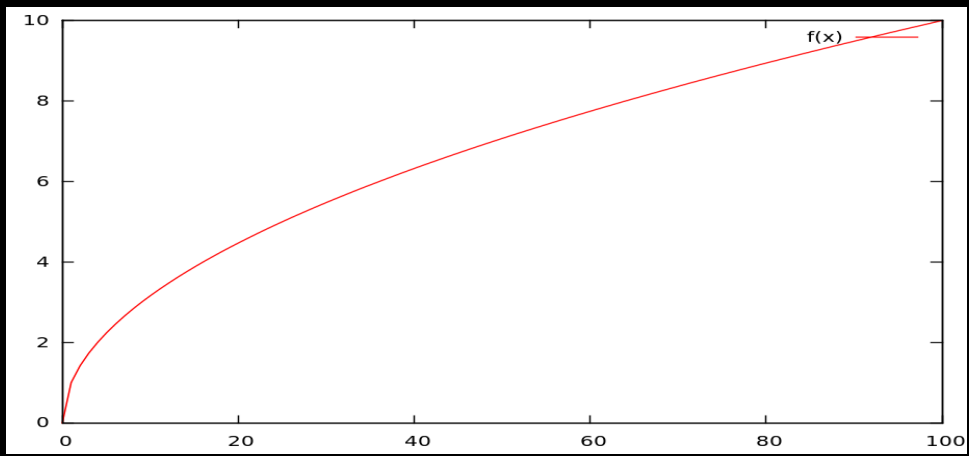
$$y(x) = x^{-1}$$





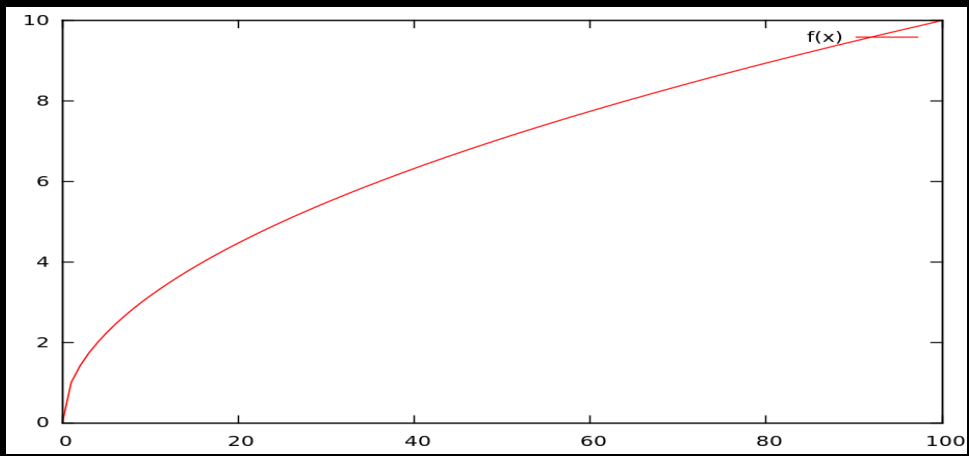
$$y(x) = x^{-1}$$



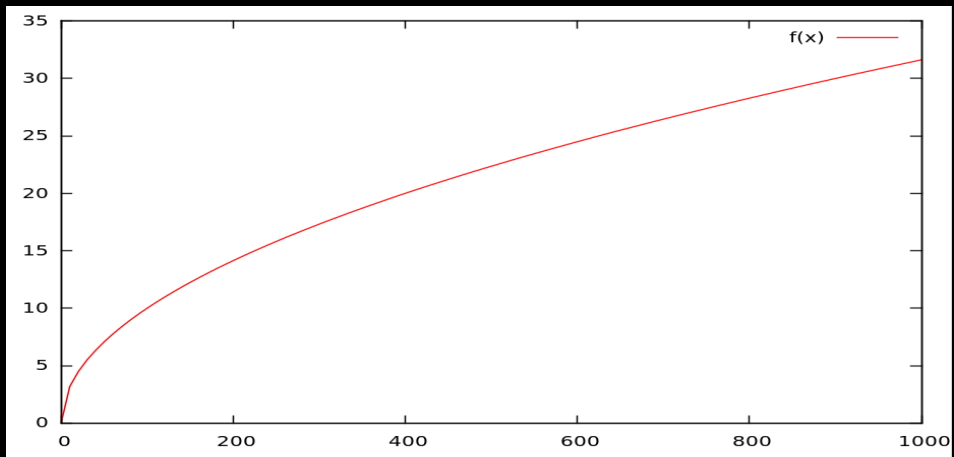


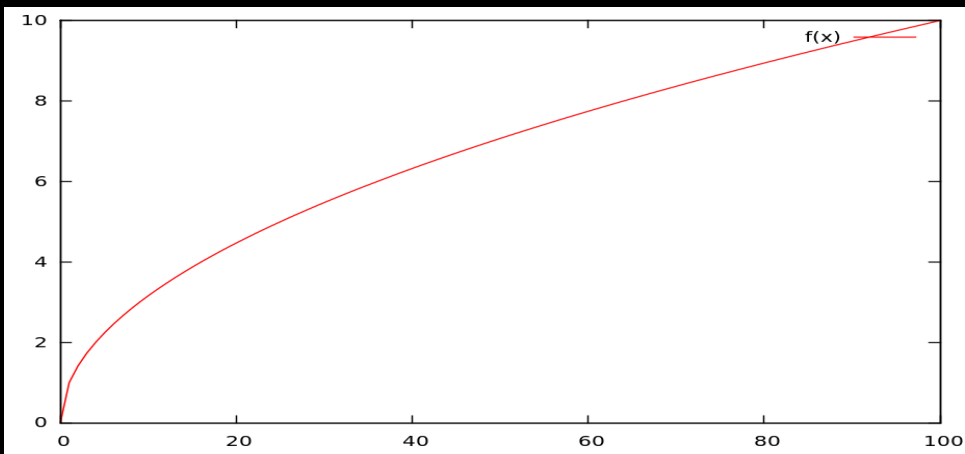
$$y(x) = x^{1/2}$$



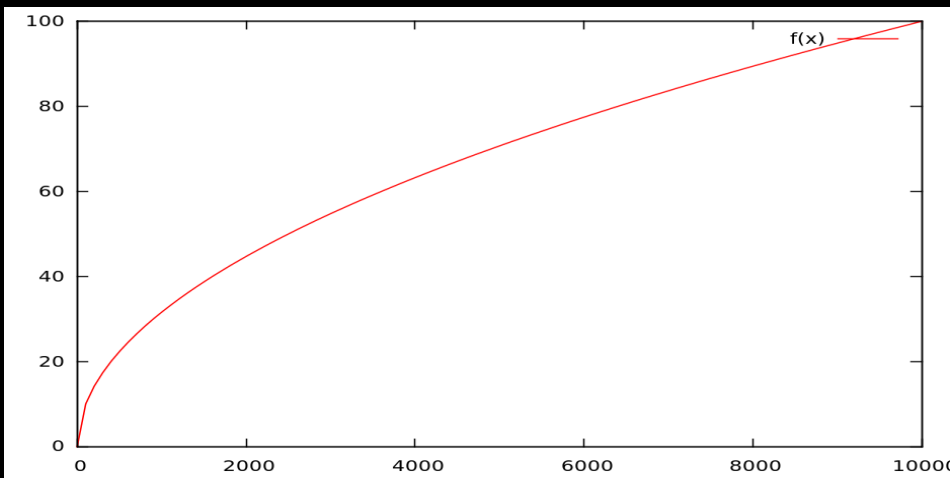
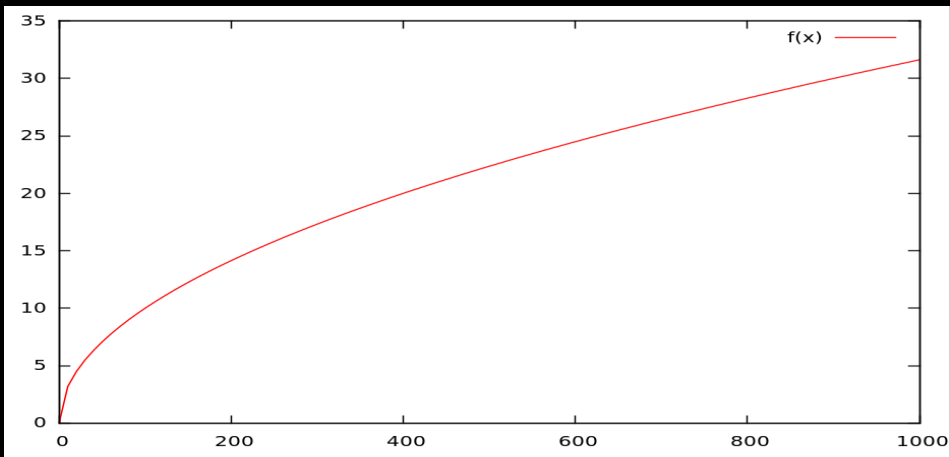


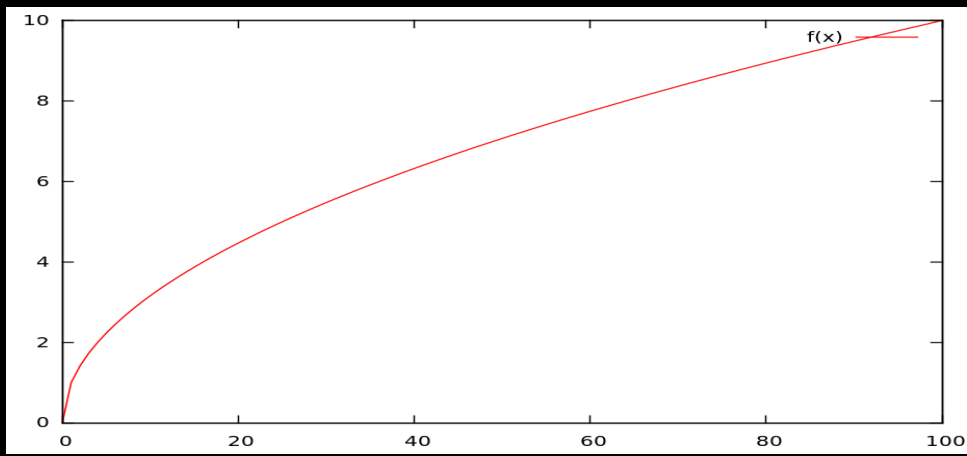
$$y(x) = x^{1/2}$$



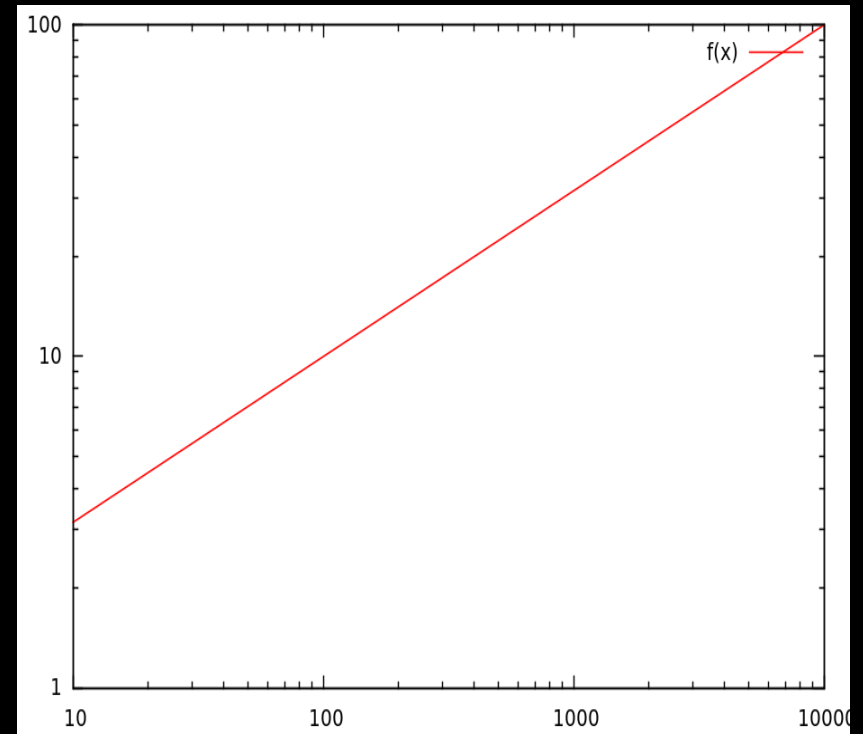
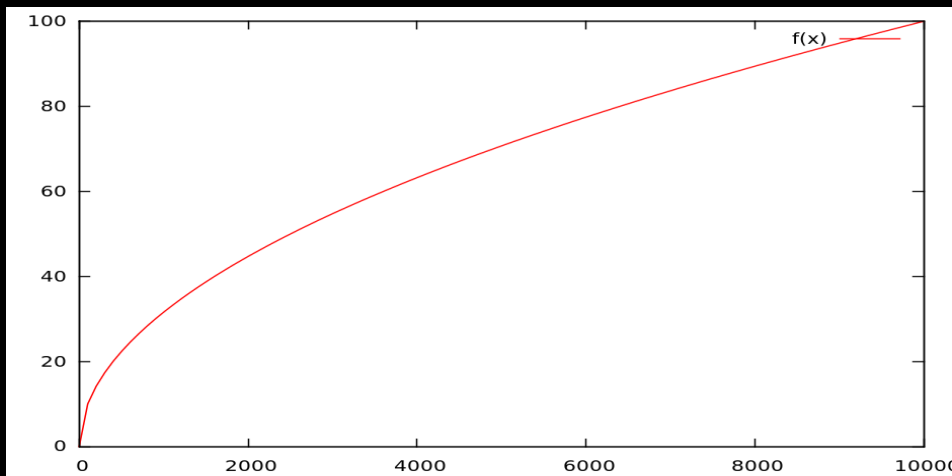
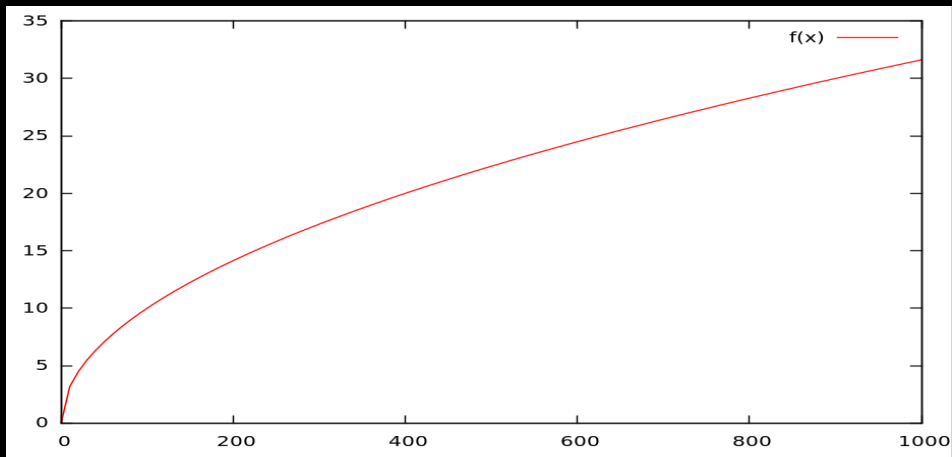


$$y(x) = x^{1/2}$$





$$y(x) = x^{1/2}$$



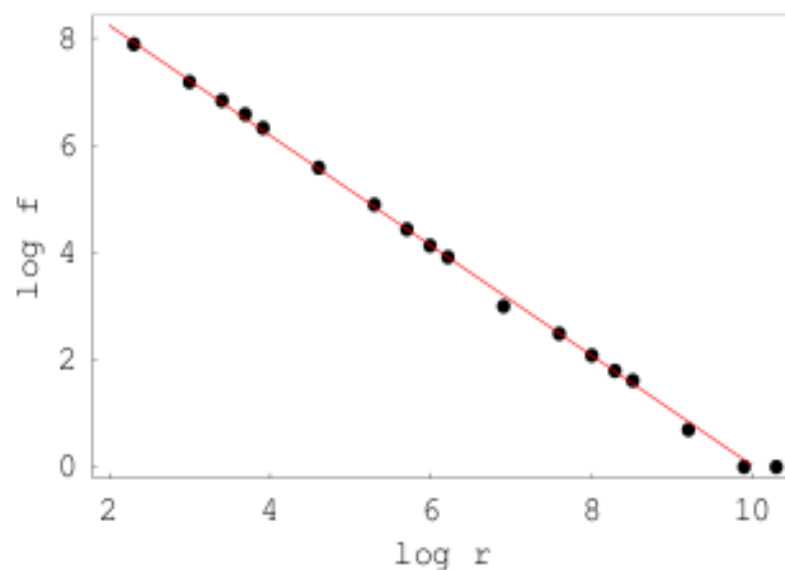
Lei de Potência:

$$y(x) = a x^{\beta}$$

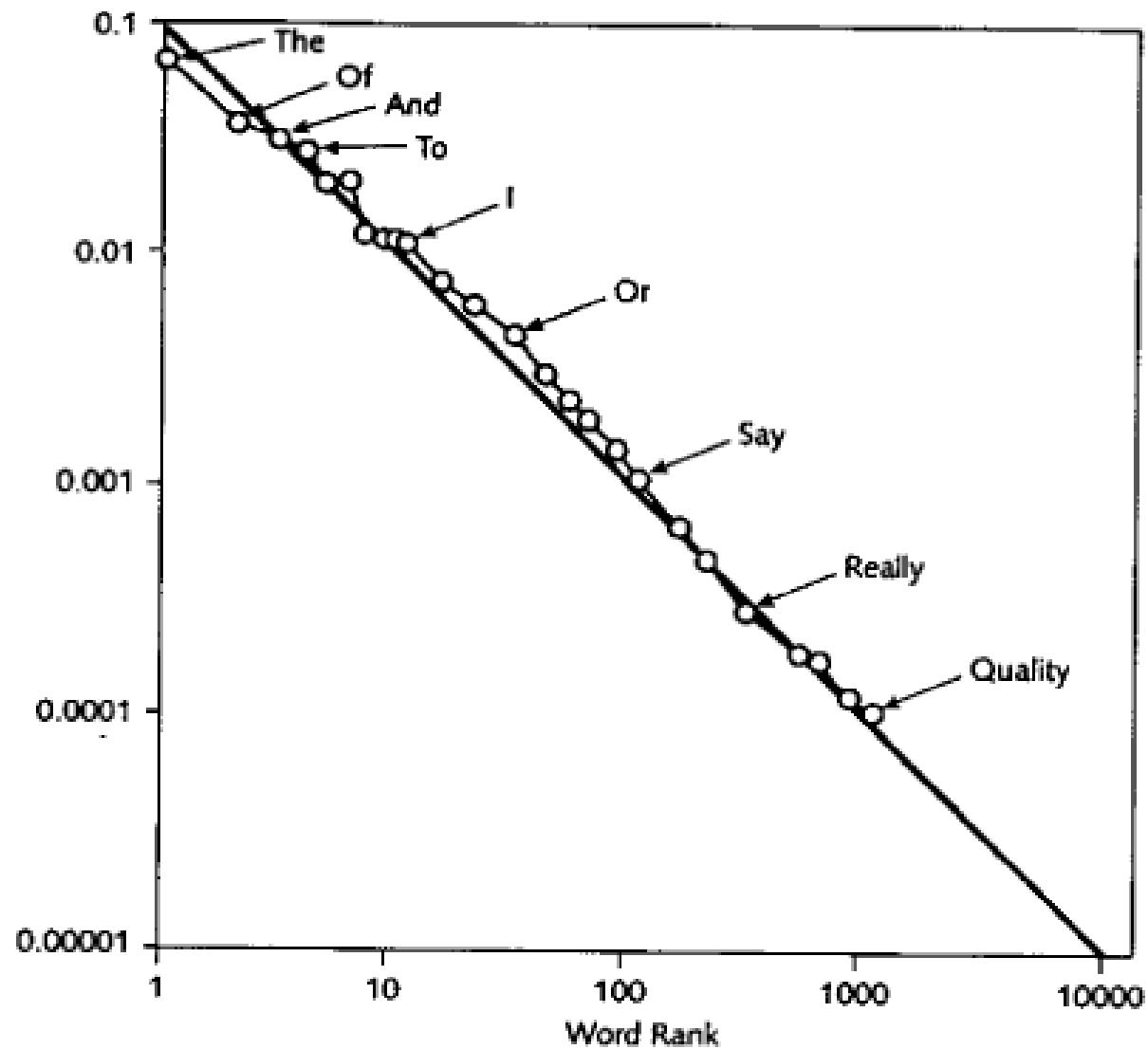
For example, James Joyce's novel *Ulysses* contains 260,430 words. If words such as *give*, *gives*, *gave*, *given*, *giving*, *giver*, and *gift* are considered to be different, there are, in *Ulysses*, 29,899 different words. Zipf data, taken from *Human Behavior and the Principle of Least Effort*, p. 24, are reproduced in the table below.

$r$	$f$	$r$	$f$	$r$	$f$
10	2653	200	133	3000	8
20	1311	300	84	4000	6
30	926	400	62	5000	5
40	717	500	50	10,000	2
50	556	1000	20	20,000	1
100	265	2000	12	29,899	1

A log-log plot of the word frequency  $f$  as a function of the word rank  $r$  is shown in Figure 8.2 with a straight line representing the least-squares fit. The slope of this line is equal to 1.02.

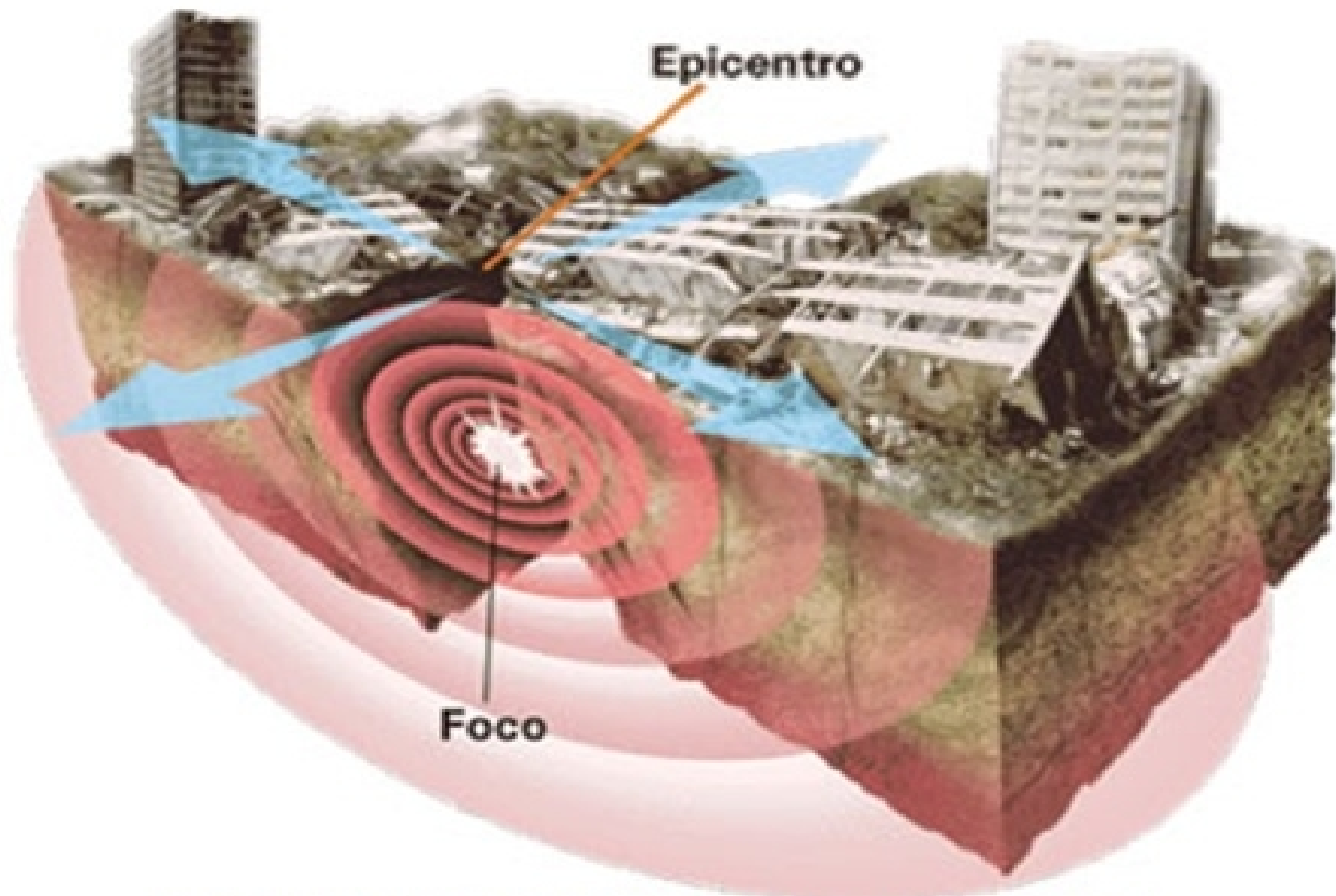


**Fig. 8.2.** Log-log plot of word frequency  $f$  as a function of word rank  $r$  (dots) and the least-squares fit (straight line). Zipf data taken from *Human Behavior and the Principle of Least Effort* are reproduced in the table above.

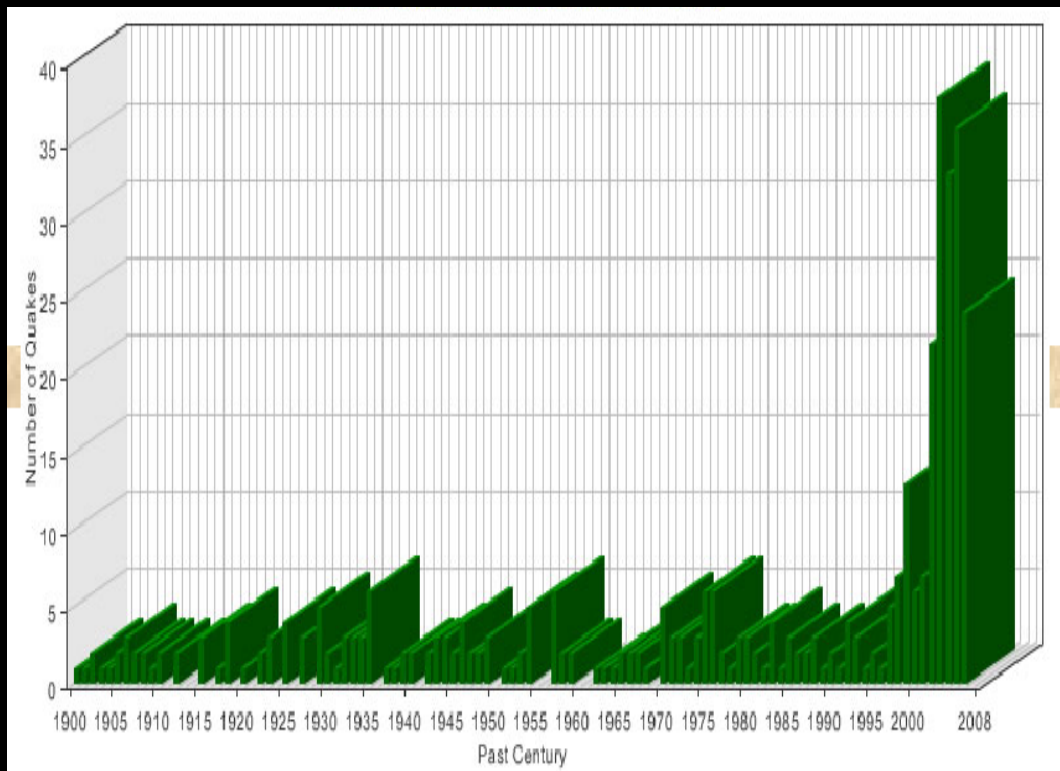


Zipf's Law for the English language.

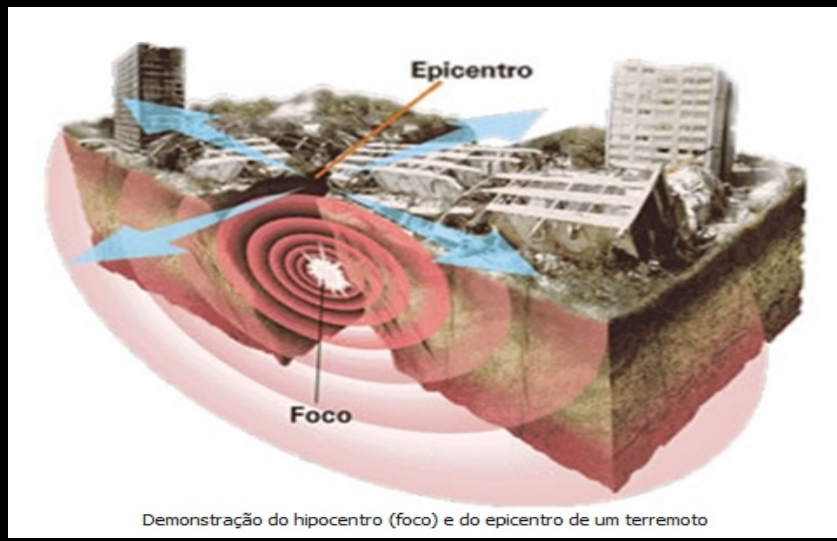
**Figure 8.** Continued (b) Ranking of words in the English language. The curve shows how many words appear with more than a given frequency.



Demonstração do hipocentro (foco) e do epicentro de um terremoto

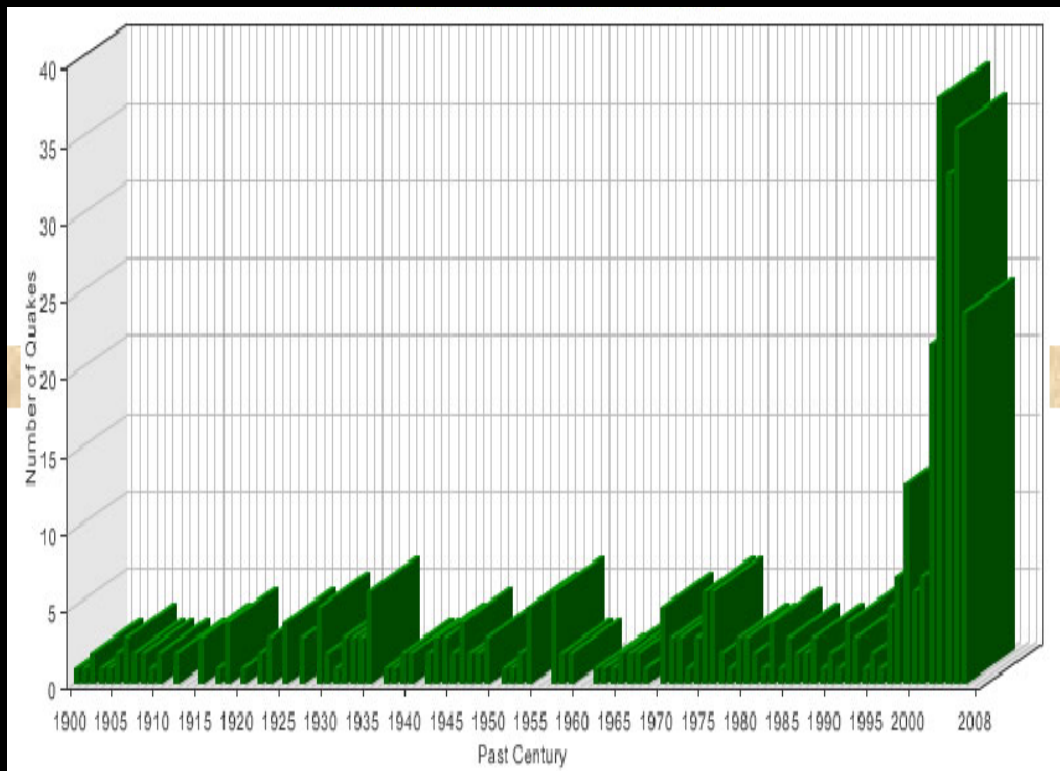


\*Incidência de terremotos de 1900 a 2008\*

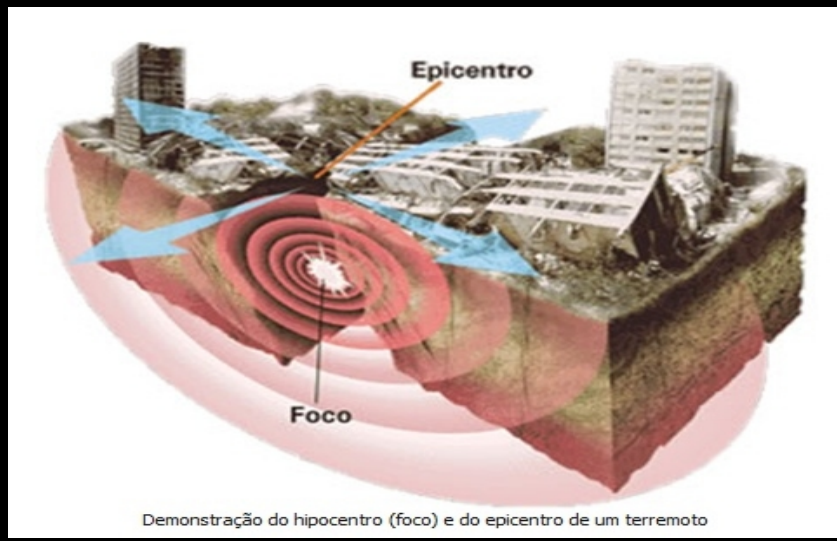
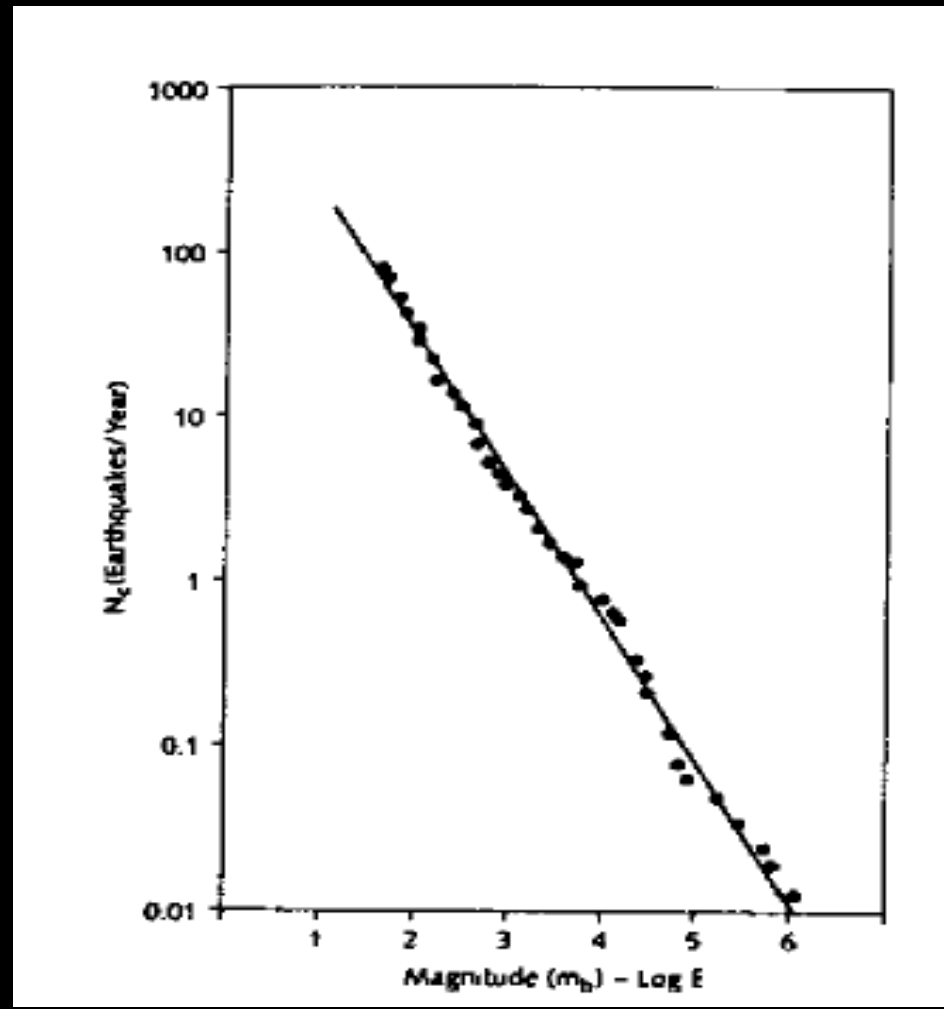


Demonstração do hipocentro (foco) e do epicentro de um terremoto

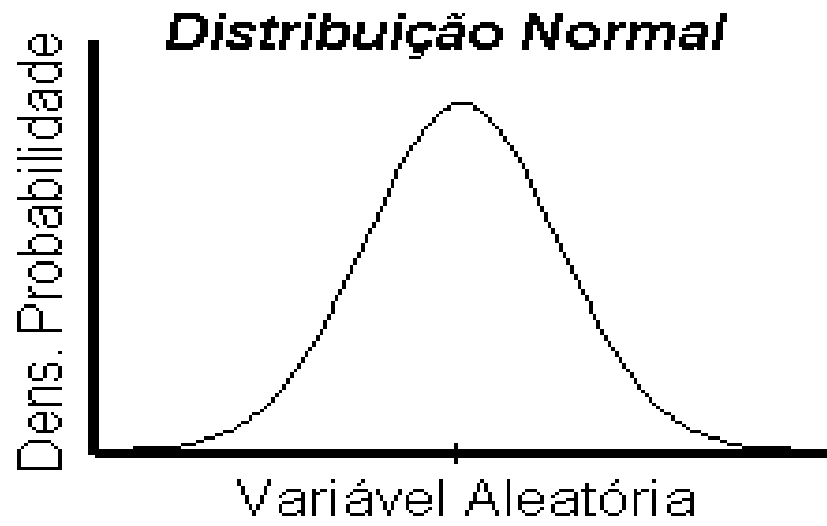




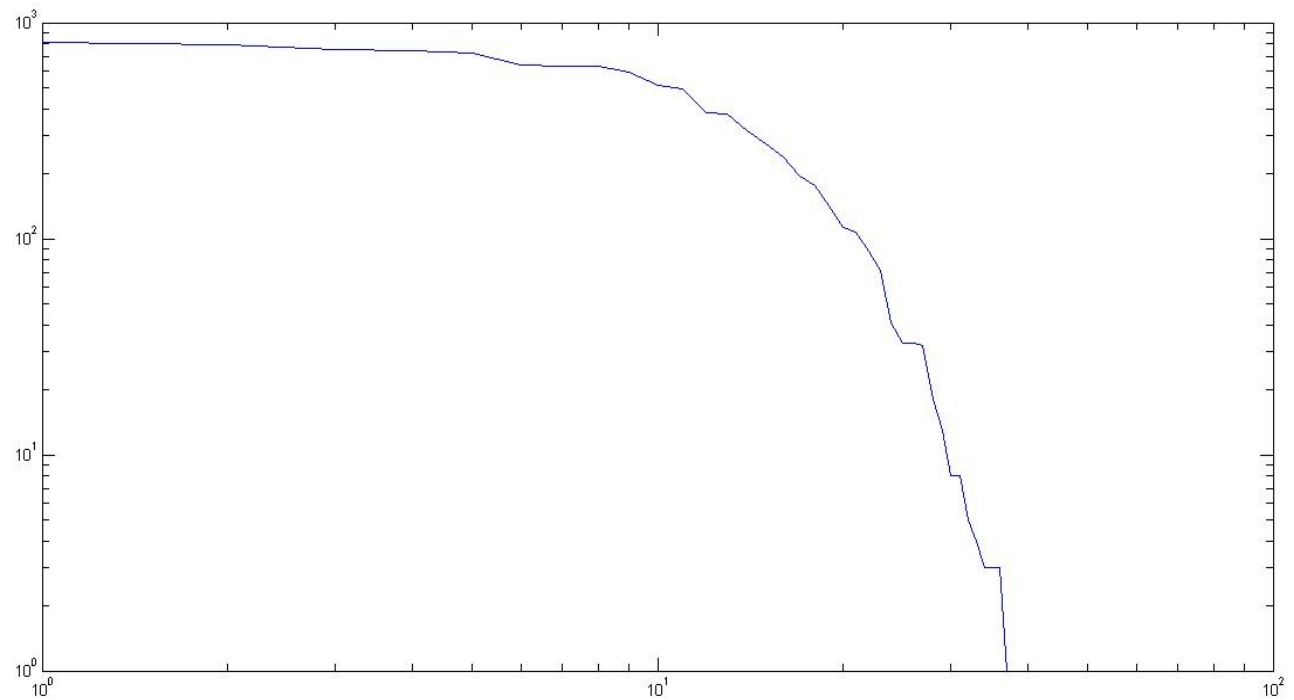
\*Incidência de terremotos de 1900 a 2008\*



Demonstração do hipocentro (foco) e do epicentro de um terremoto



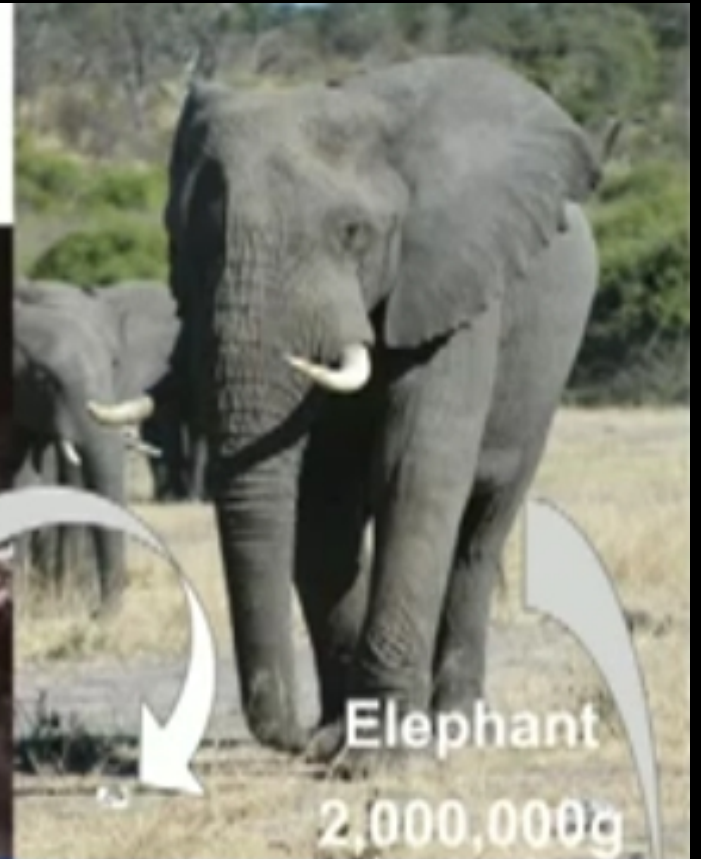
Frequencia



Ranqueamento

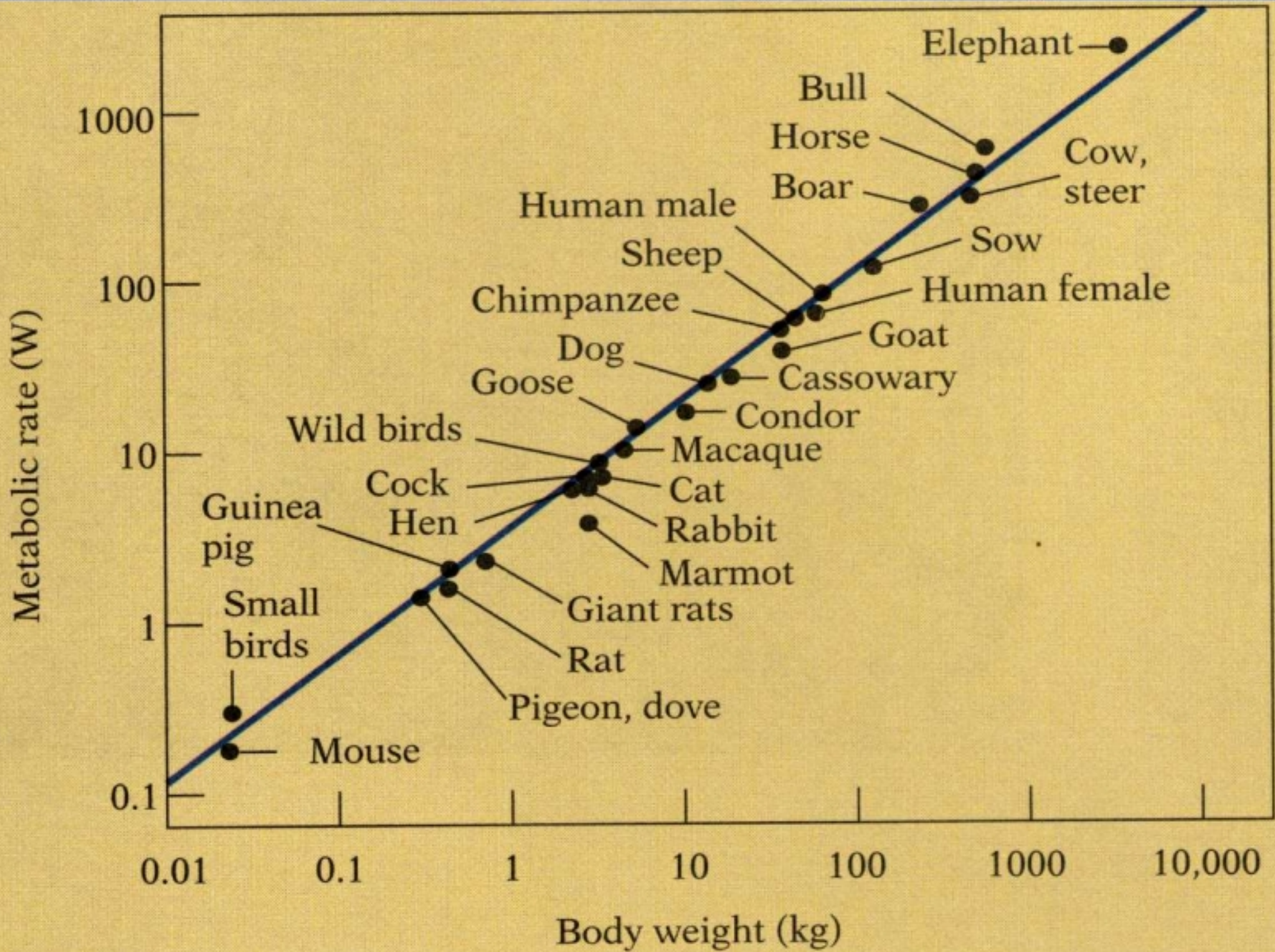
# Leis de Escala em Biologia?

# Mammals vary in size by 8 orders of magnitude

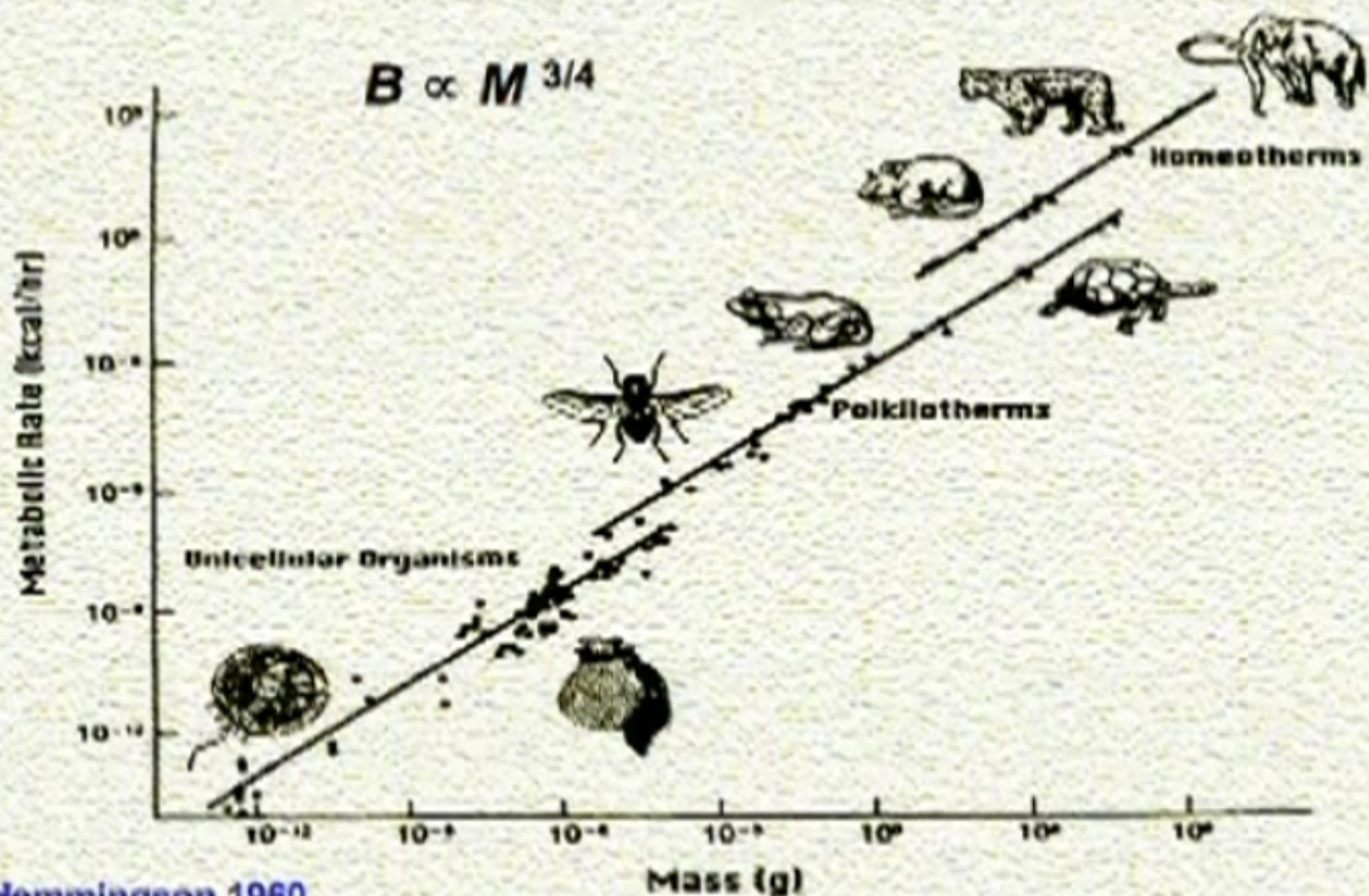


Blue Whale  
200,000,000g



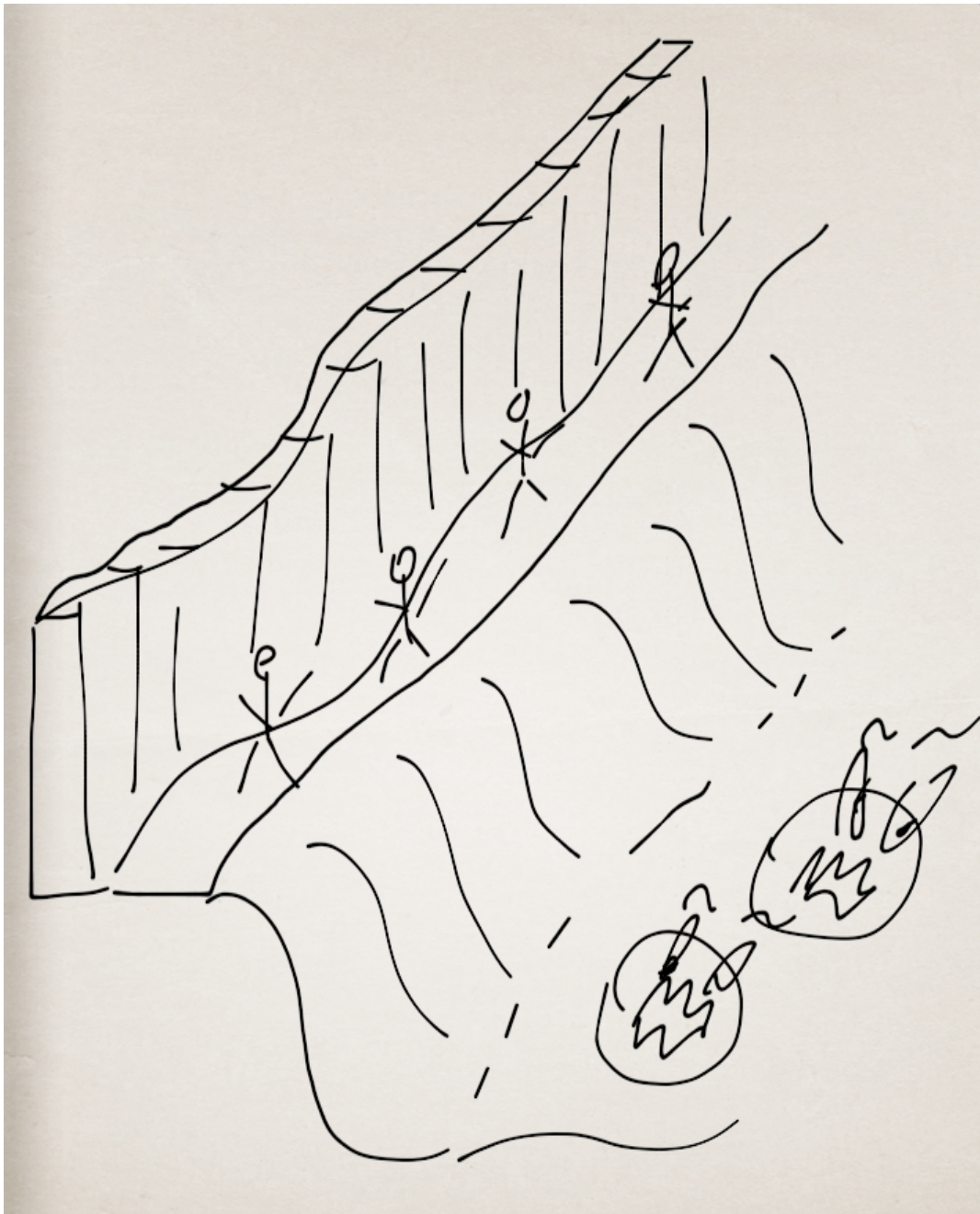


# Whole-organism metabolic rate ( $B$ ) scales as the $3/4$ power of body mass ( $M$ )





YAHOO

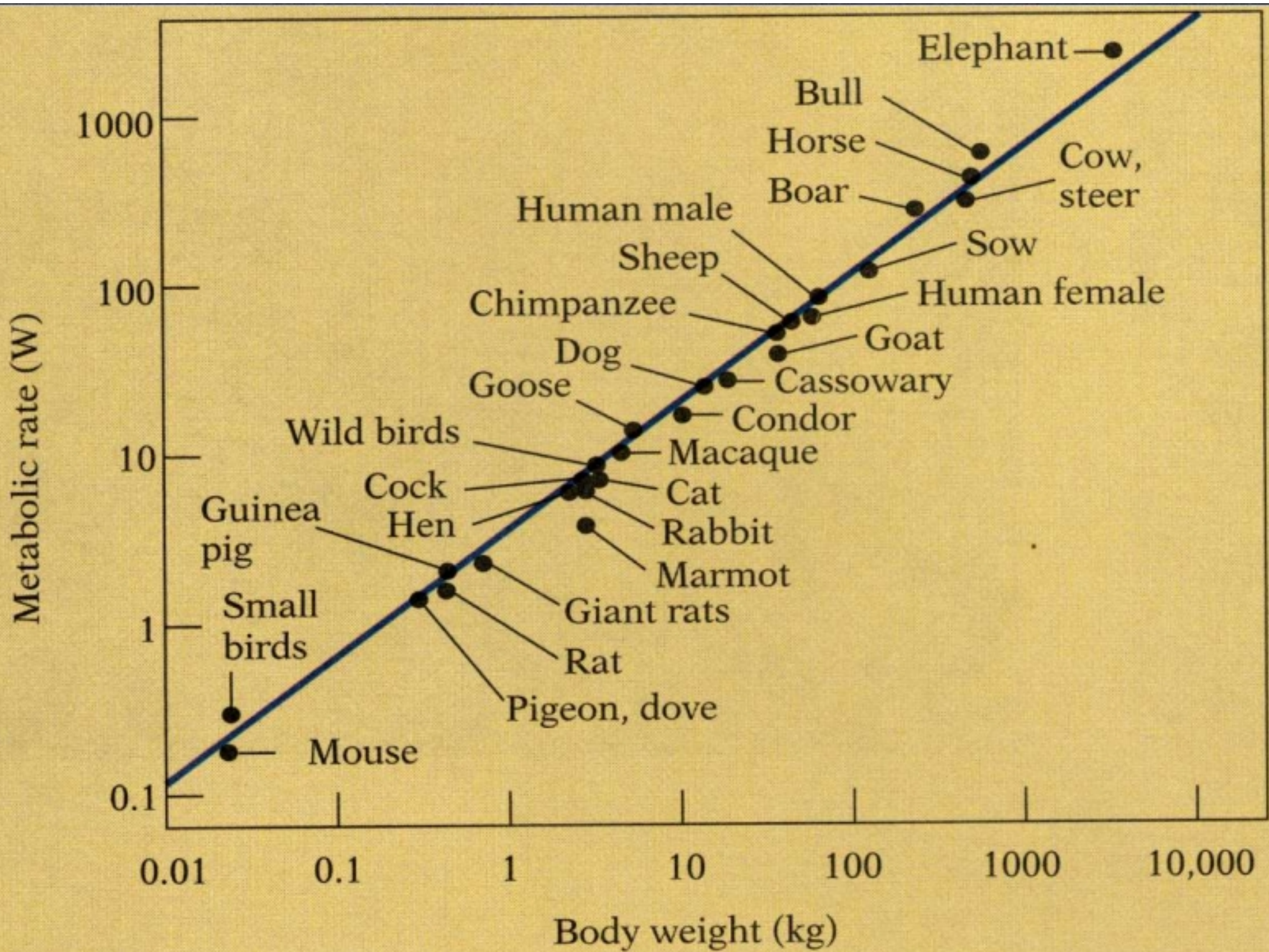


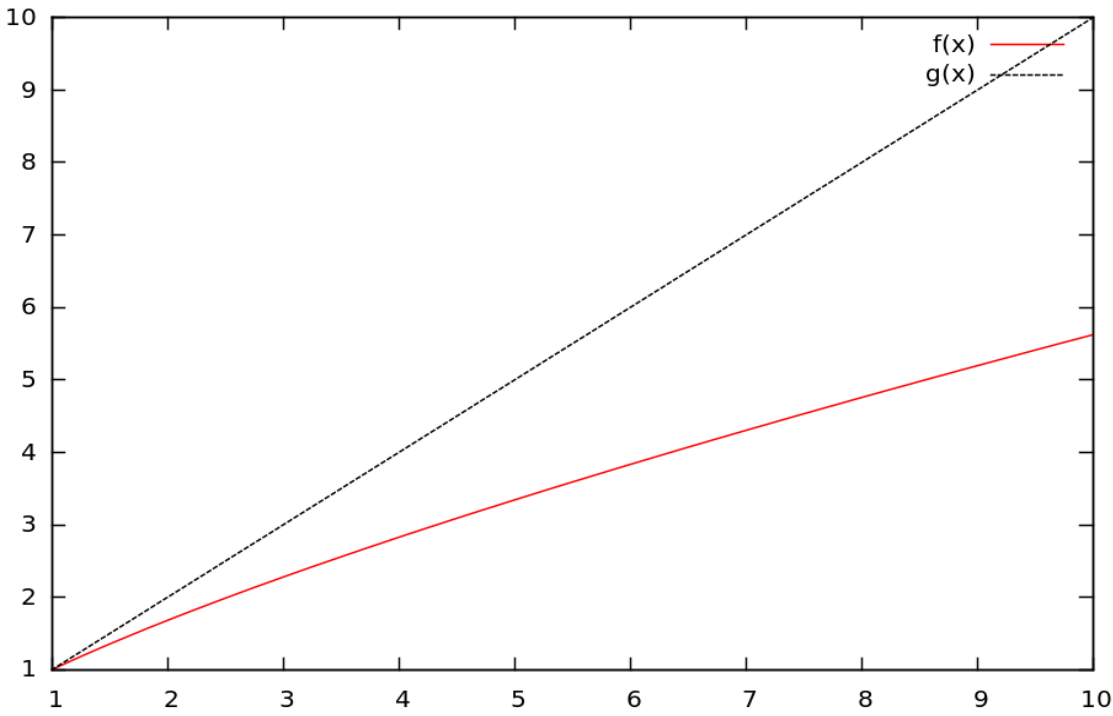
Muro: Limite imposto pelas  
Leis da Física;

Meninos: espécies biológicas;

Monstros: Seleção Natural;



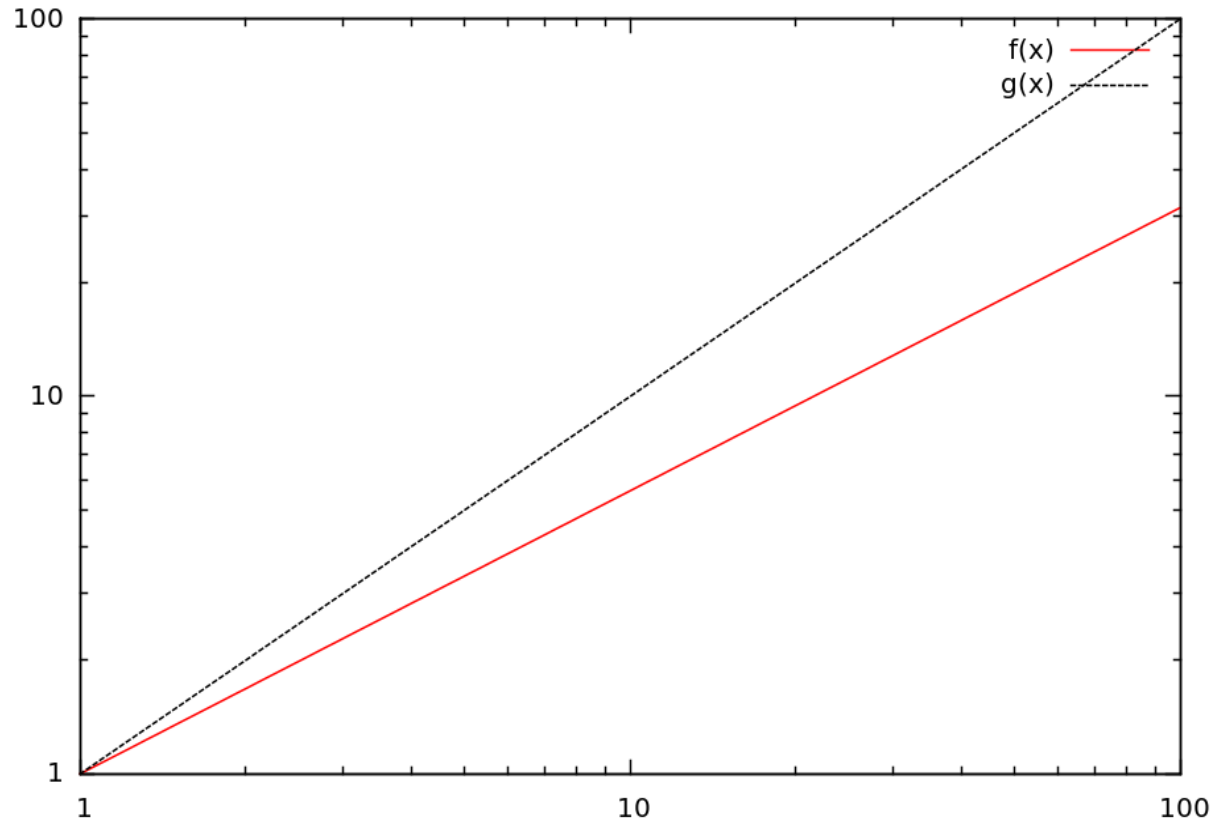




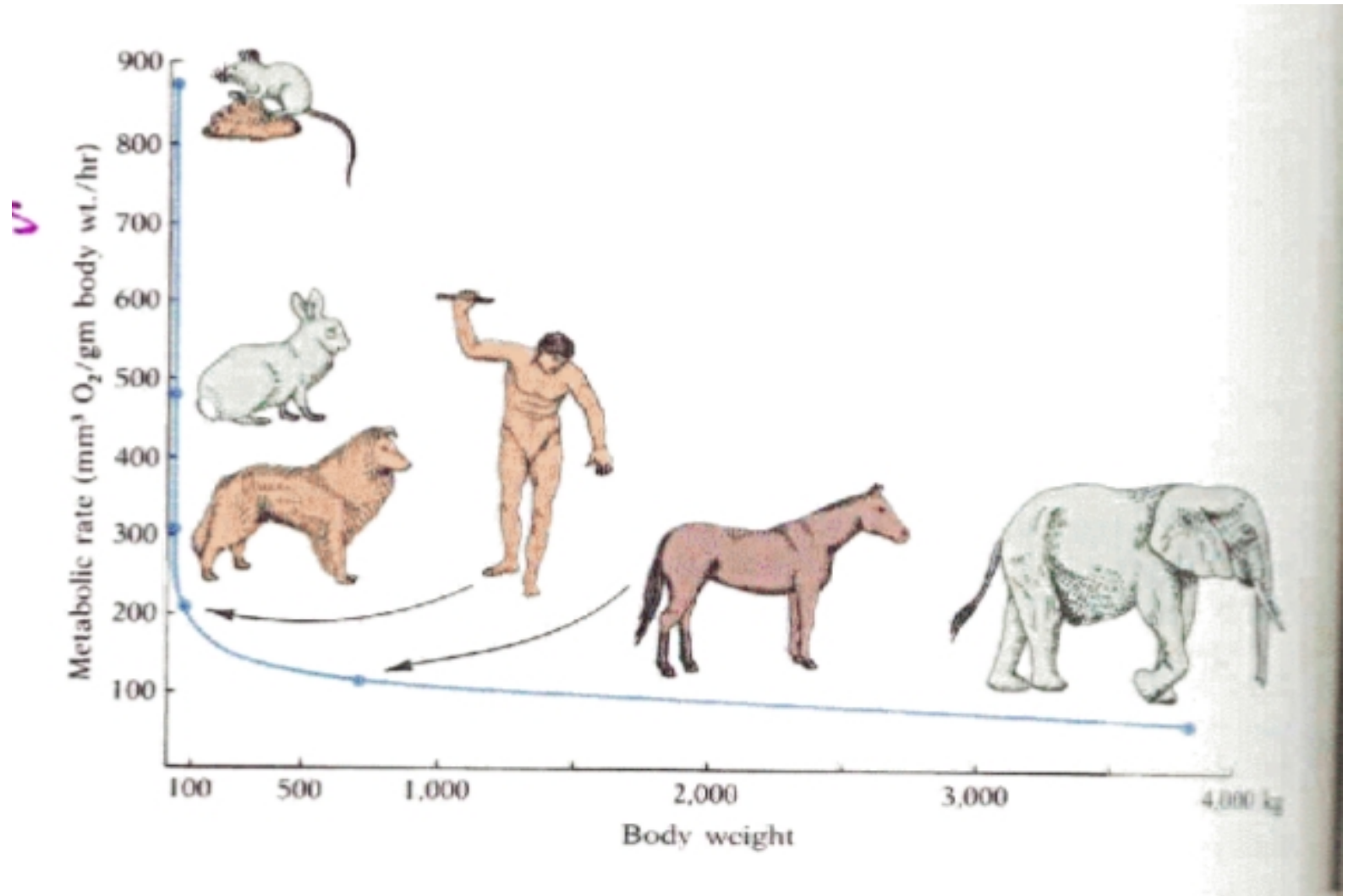
$$g(x) = x$$

$$f(x) = x^{3/4}$$

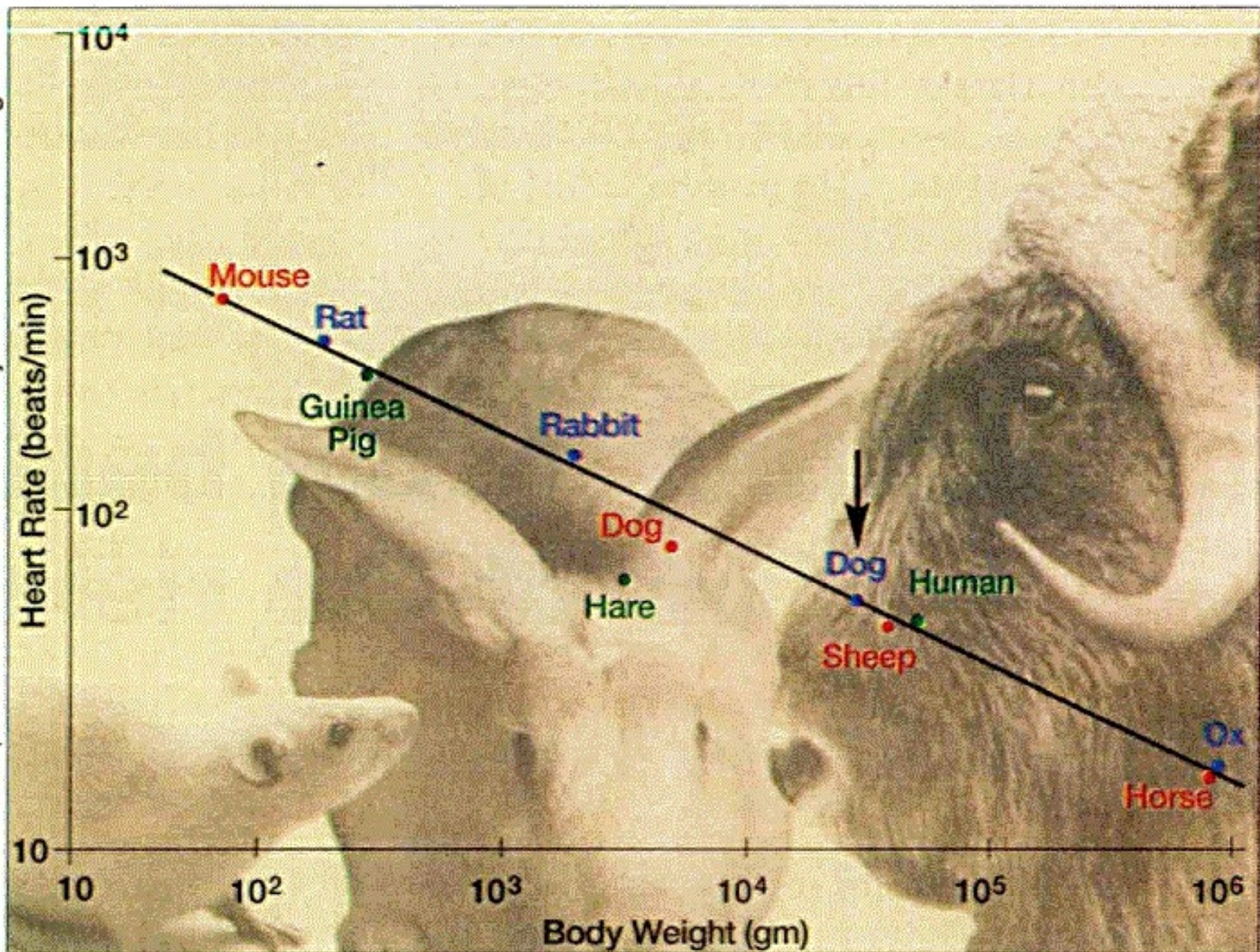
**Economia  
Energética com  
a Escala!**



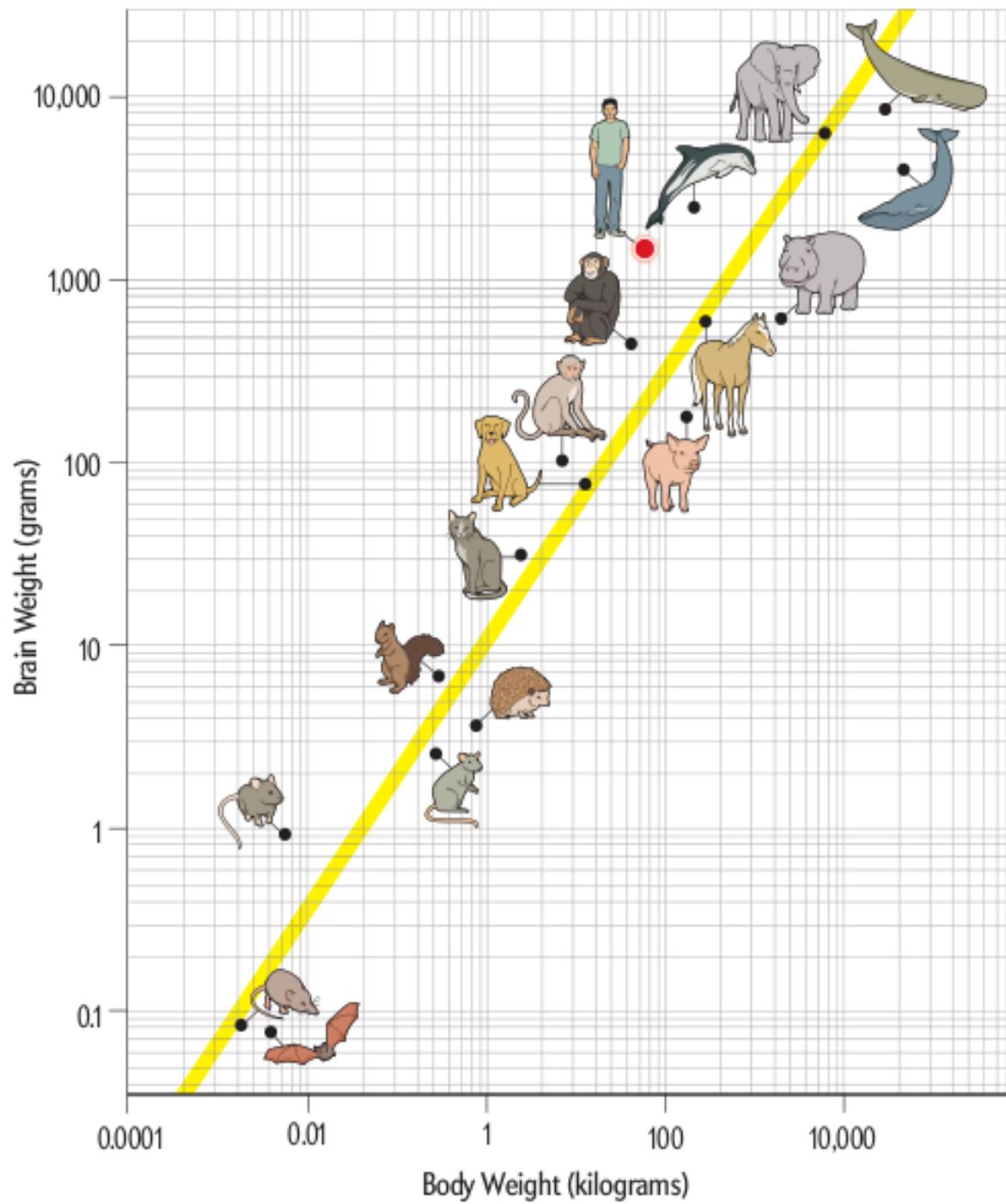
# Economia Energética com a Escala!



Adapted from: American Society of Mechanical Engineers



*Small mammals live fast and die young compared to big ones. Because heart rate tracks weight by a 1/4-power law, a dog (arrow) about 1/16 as heavy as a horse has a pulse about twice as fast as the horse's, not 16 times faster.*



$$\begin{array}{l} \text{Energia total} \\ \text{Metabolizada} \end{array} = \begin{array}{l} \text{Manutenção} \\ \text{(das células existentes)} \end{array} + \begin{array}{l} \text{Crescimento} \\ \text{(de novas células)} \end{array}$$

Energia total  
Metabolizada = Manutenção + Crescimento  
(das células existentes) (de novas células)

$$B_0 m^\beta =$$

Energia total  
Metabolizada = Manutenção + Crescimento  
(das células existentes) (de novas células)

$$B_0 m^\beta = B_c m +$$



Energia total  
Metabolizada = Manutenção + Crescimento  
(das células existentes) (de novas células)

$$B_0 m^\beta = B_c m + E_0 dm/dt$$

Energia total  
Metabolizada = Manutenção + Crescimento  
(das células existentes) (de novas células)

$$B_0 m^\beta = B_c m + E_0 dm/dt$$

$$\beta = 3/4 < 1$$

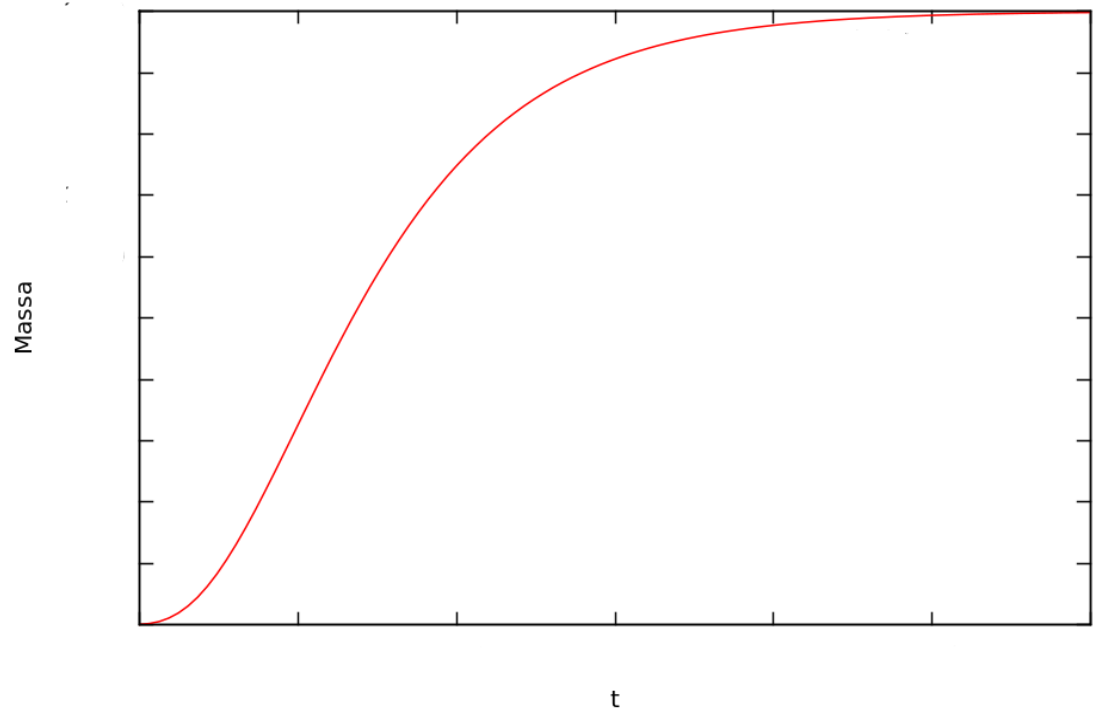
(escala sub-linear)

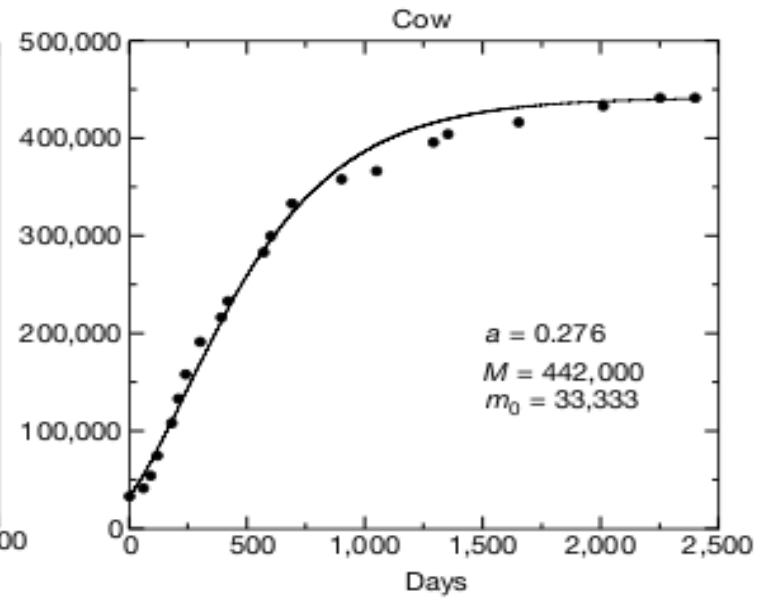
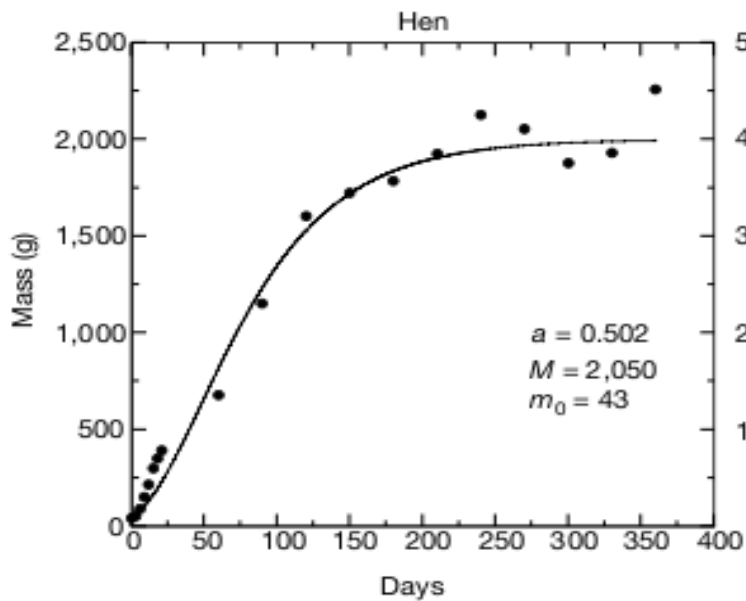
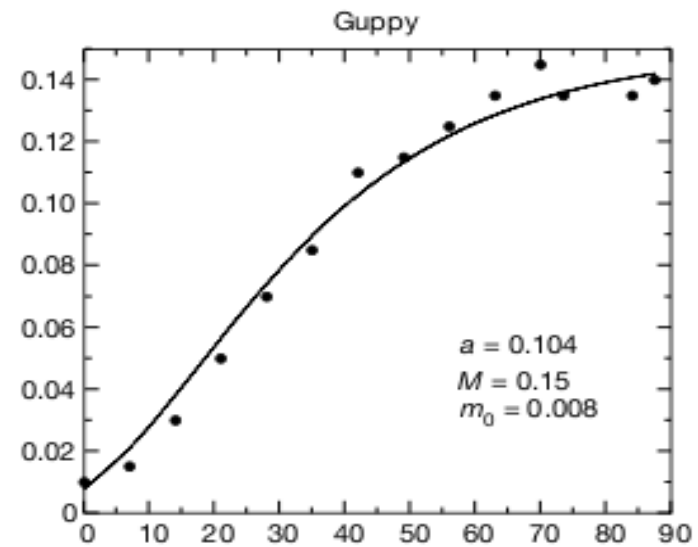
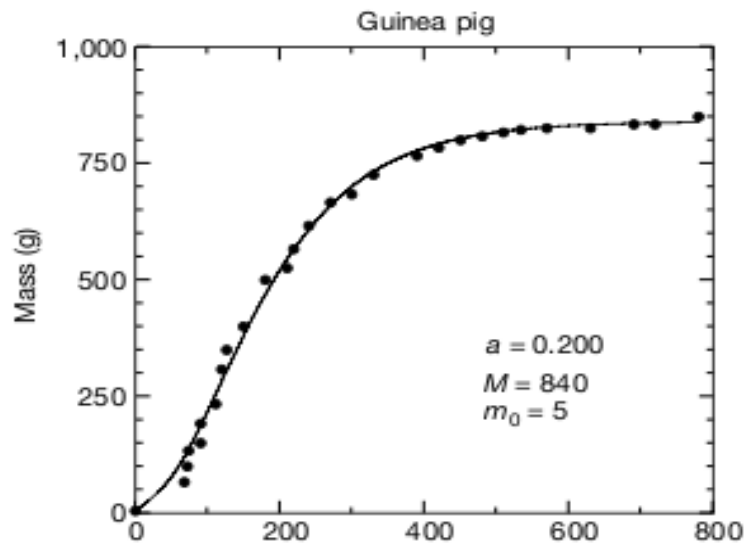
Energia total  
Metabolizada = Manutenção + Crescimento  
(das células existentes) (de novas células)

$$B_0 m^\beta = B_c m + E_0 dm/dt$$

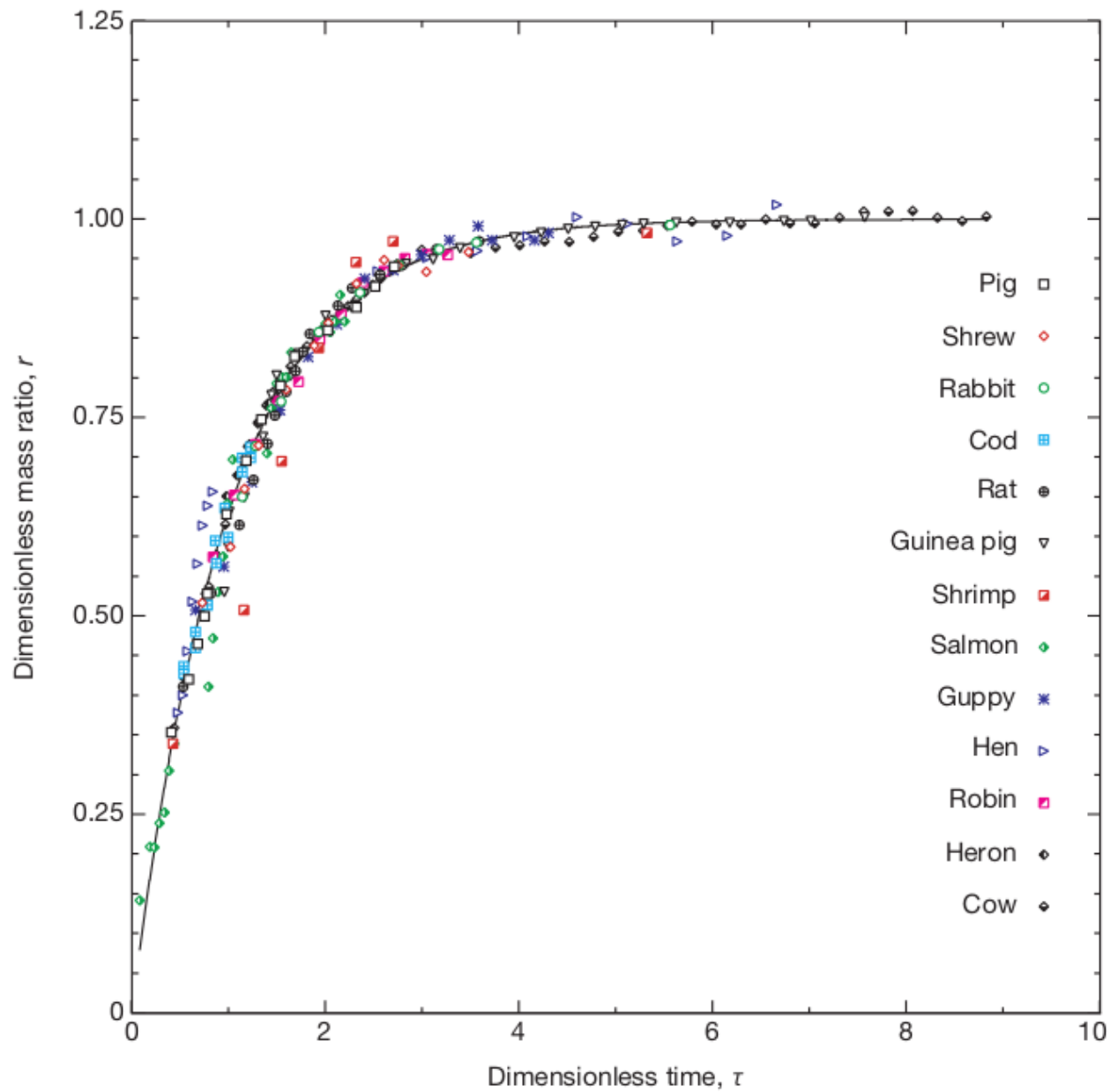
$$\beta = 3/4 < 1$$

(escala sub-linear)





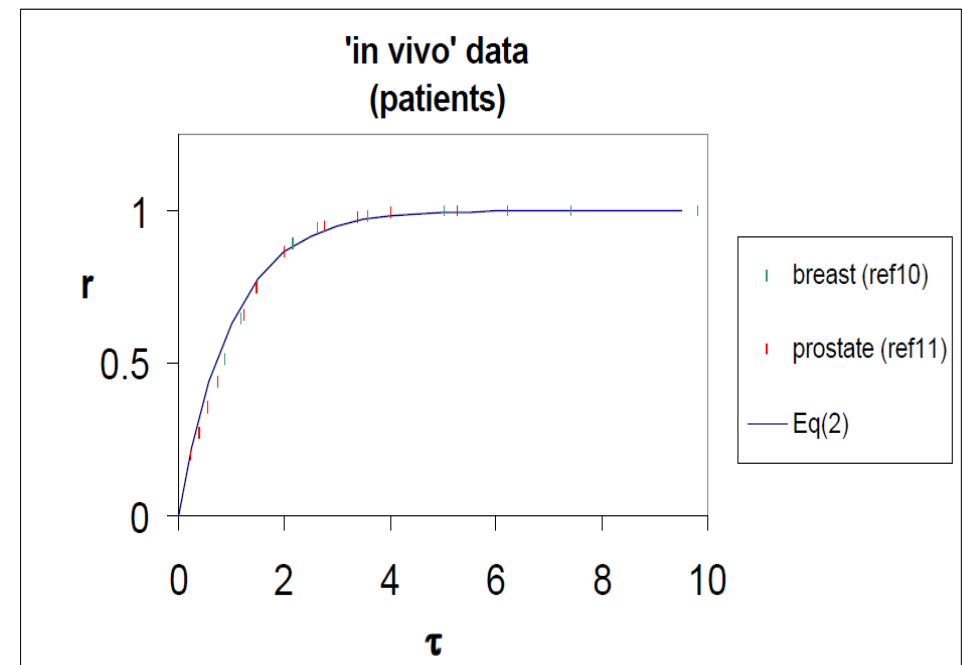
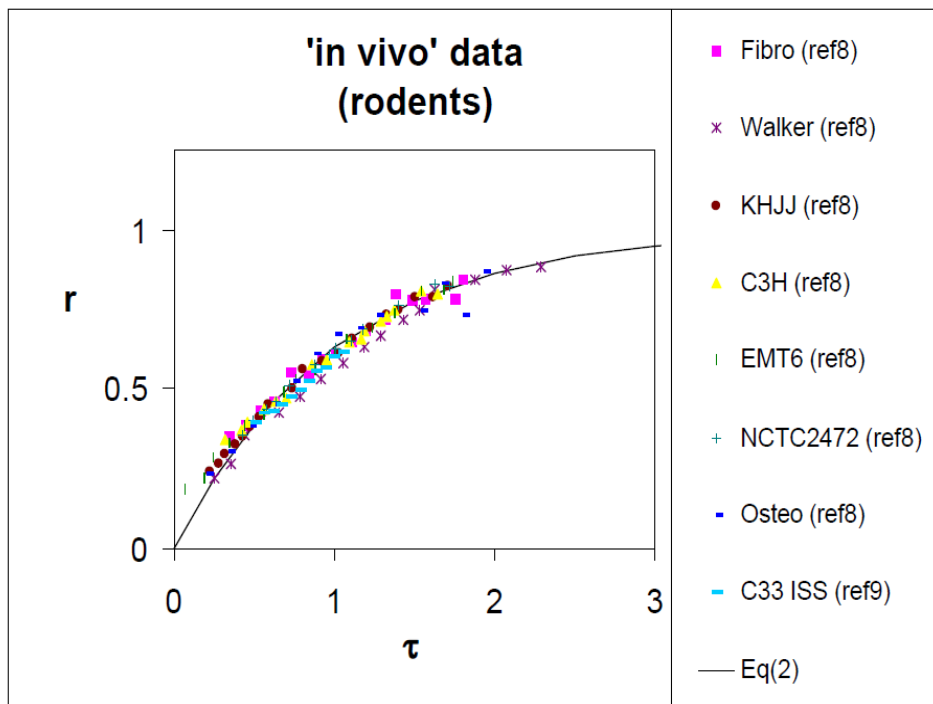
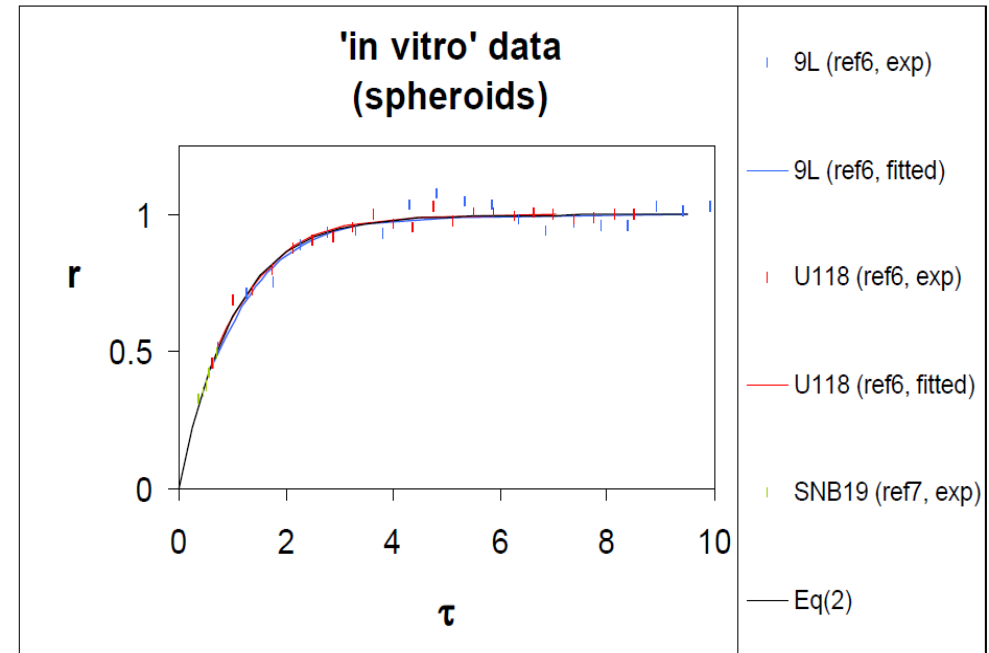
G. West et al , Nature Vol 413 (2001)



G. West et al , Nature Vol 413 (2001)

# Curva de Crescimento de Tumor

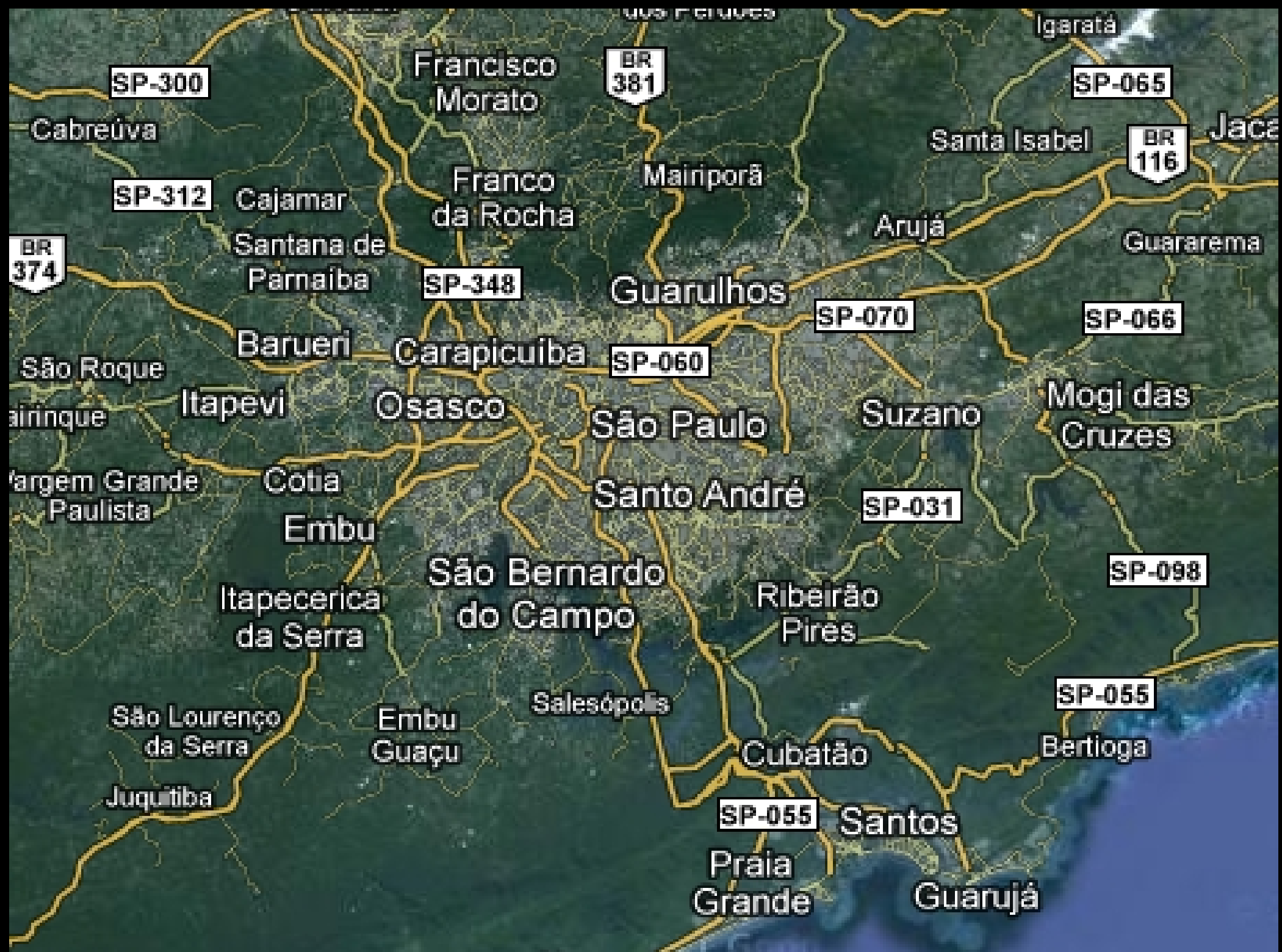
Guiot et al , J. Theor. Biology  
225, 147 (2003)



# Leis de Escala na População Humana?







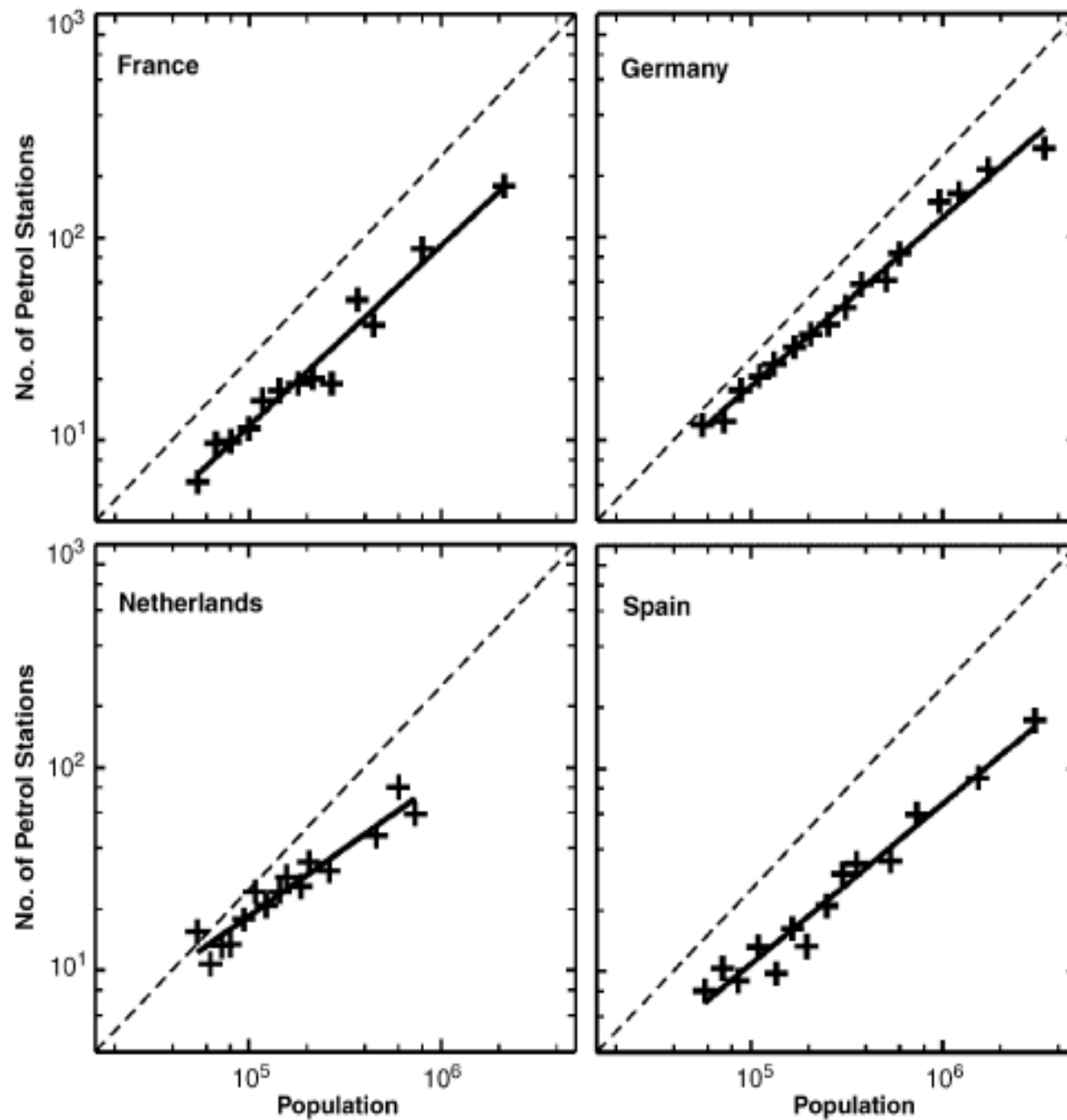
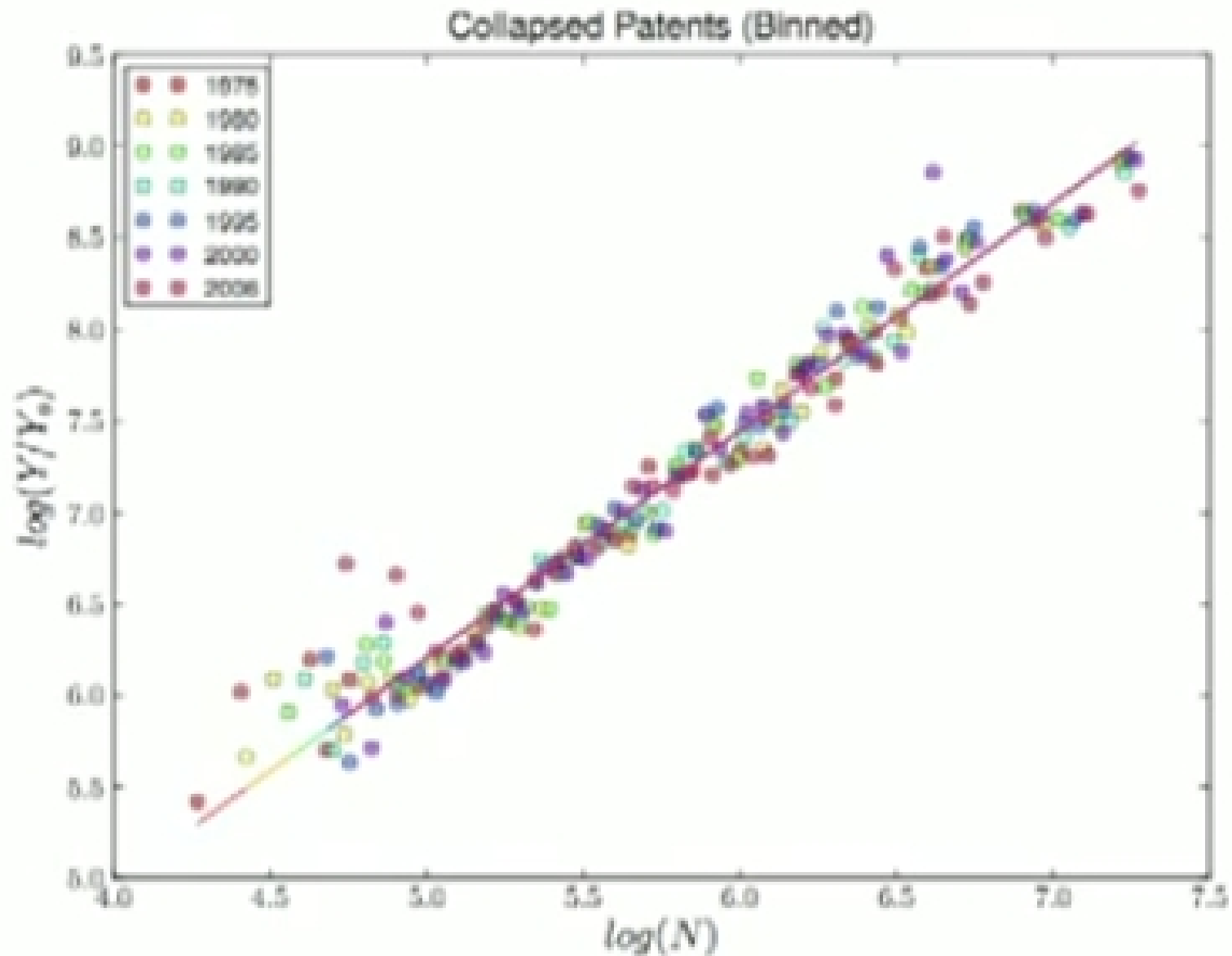
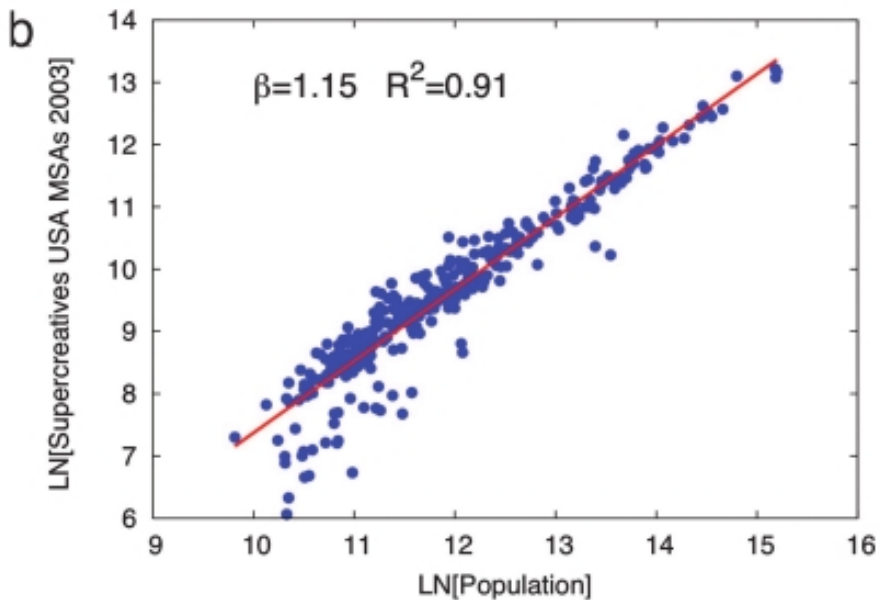
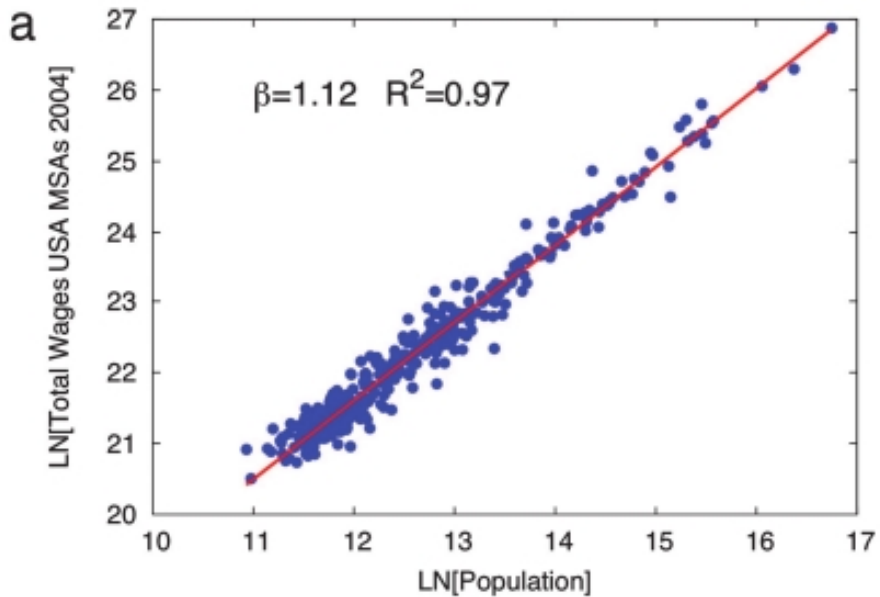


Fig. 4. Double-logarithmic representation of the number of petrol stations as a function of the population size of cities of France, Germany, Netherlands and Spain, after a logarithmic binning method has been applied. The solid lines correspond to the respective linear regression and the dashed lines indicate the slope 1.

# Innovation measured by Patents





### Example of scaling relationships

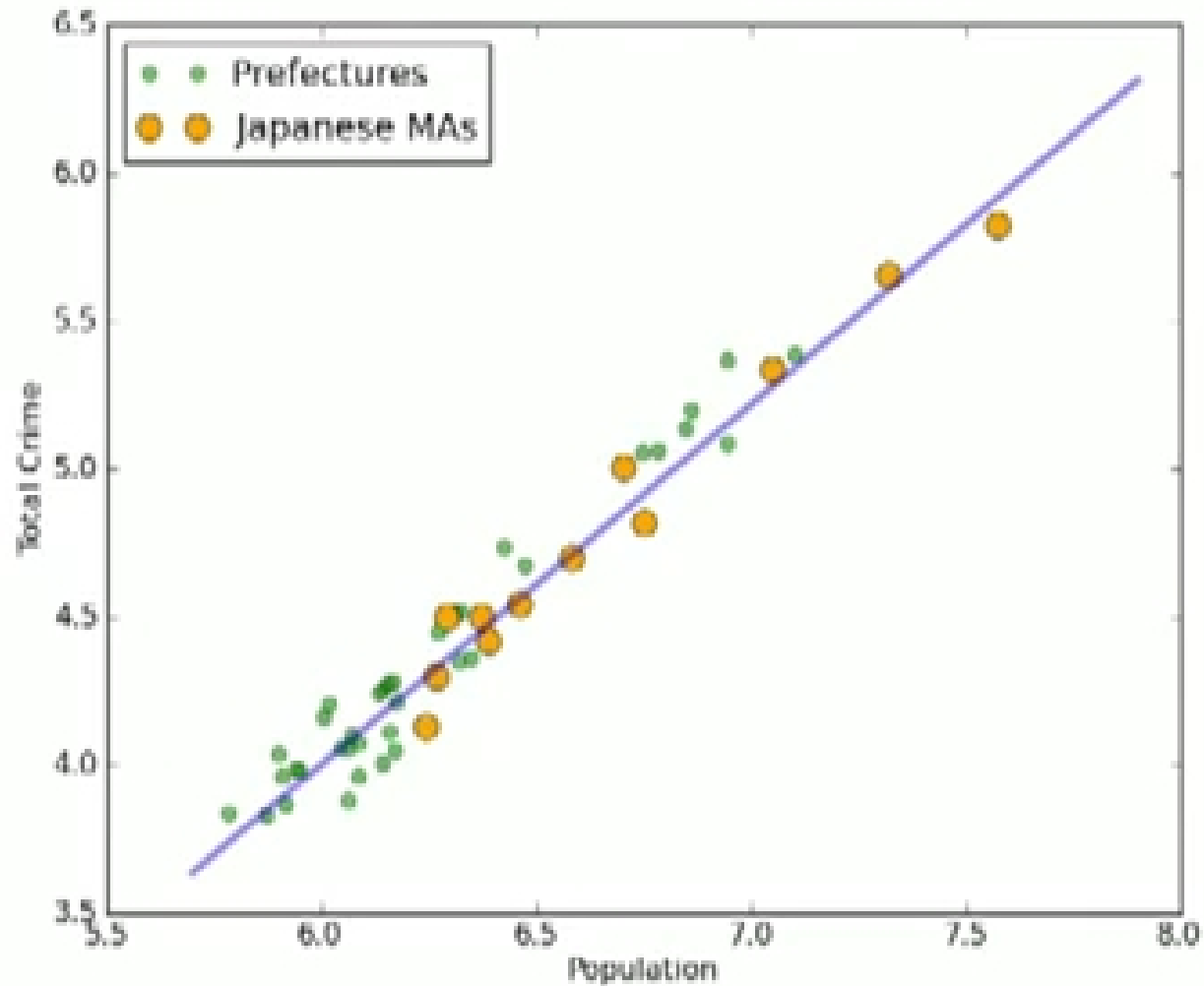
a) Total **WAGES** per MSA in 2004 for the USA vs. metropolitan population.

b) **SUPERCREATIVE** employment per MSA in 2003, for the USA vs. metropolitan population.

**SUPER-LINEAR  
SCALING**

16

# TOTAL CRIME (JAPAN)



Slope = 1.21      [1.08, 1.35]

$\beta > 1$   
 Interação  
 Social

Table 1. Scaling exponents for urban indicators vs. city size

Y	$\beta$	95% CI	Adj- $R^2$	Observations	Country-year
New patents	1.27	[1.25,1.29]	0.72	331	U.S. 2001
Inventors	1.25	[1.22,1.27]	0.76	331	U.S. 2001
Private R&D employment	1.34	[1.29,1.39]	0.92	266	U.S. 2002
"Supercreative" employment	1.15	[1.11,1.18]	0.89	287	U.S. 2003
R&D establishments	1.19	[1.14,1.22]	0.77	287	U.S. 1997
R&D employment	1.26	[1.18,1.43]	0.93	295	China 2002
Total wages	1.12	[1.09,1.13]	0.96	361	U.S. 2002
Total bank deposits	1.08	[1.03,1.11]	0.91	267	U.S. 1996
GDP	1.15	[1.06,1.23]	0.96	295	China 2002
GDP	1.26	[1.09,1.46]	0.64	196	EU 1999–2003
GDP	1.13	[1.03,1.23]	0.94	37	Germany 2003
Total electrical consumption	1.07	[1.03,1.11]	0.88	392	Germany 2002
New AIDS cases	1.23	[1.18,1.29]	0.76	93	U.S. 2002–2003
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$\beta = 1$   
 Necessidades  
 individuais

Total housing	1.00	[0.99,1.01]	0.99	316	U.S. 1990
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Household electrical consumption	1.00	[0.94,1.06]	0.88	377	Germany 2002
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$\beta < 1$

Gasoline stations	0.77	[0.74,0.81]	0.93	318	U.S. 2001
Gasoline sales	0.79	[0.73,0.80]	0.94	318	U.S. 2001
Length of electrical cables	0.87	[0.82,0.92]	0.75	380	Germany 2002
Road surface	0.83	[0.74,0.92]	0.87	29	Germany 2002

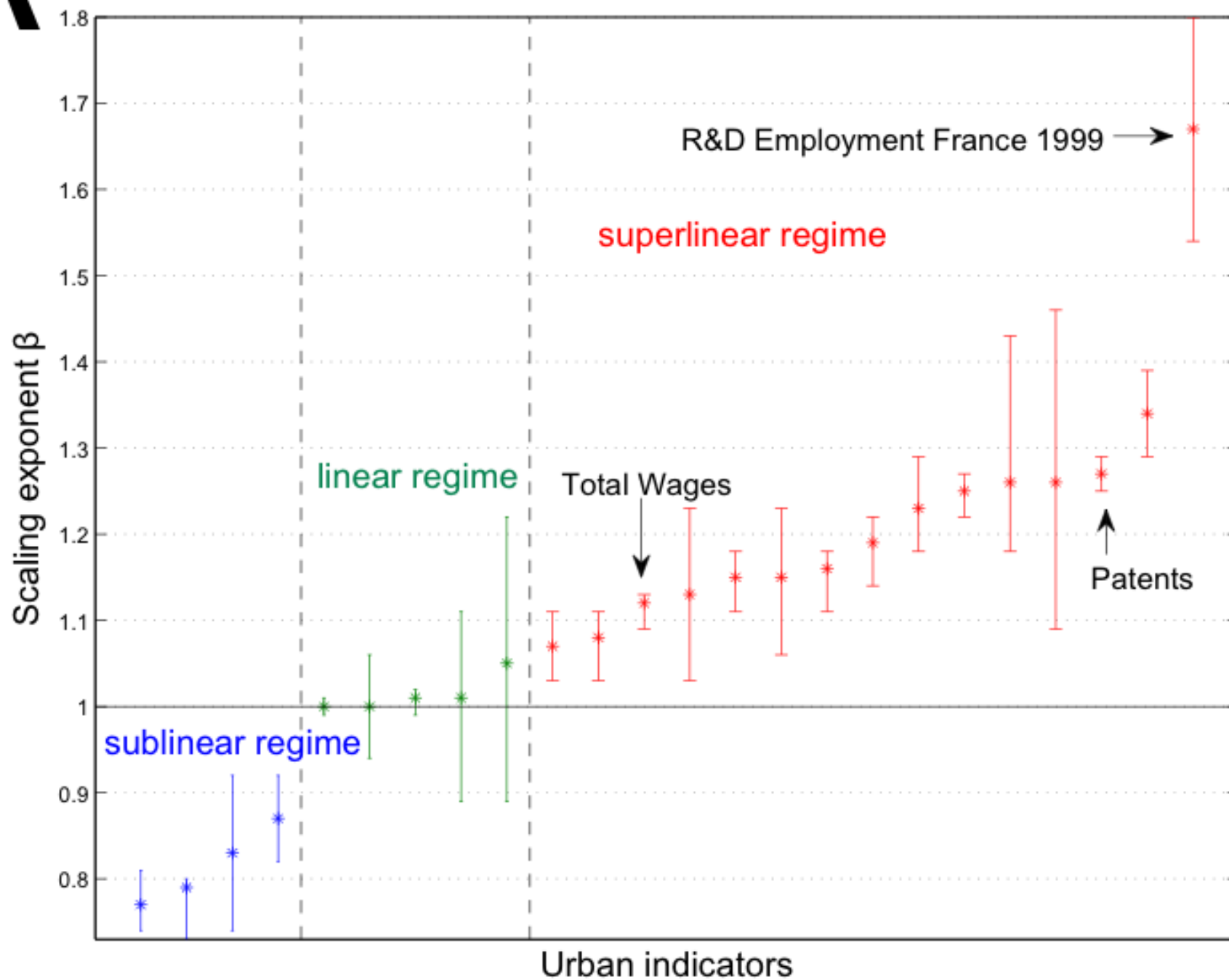
Data sources are shown in *SI Text*. CI, confidence interval; Adj- $R^2$ , adjusted  $R^2$ ; GDP, gross domestic product.

Infro-estrutura



# A

## Results from Bettencourt et al PNAS 2007



Duplicando o tamanho da cidade  
Aumenta-se sistematicamente  
(aproximadamente 15%):



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- Número de Policiais;
- Número de crimes;
- Número de casos de AIDS e outros;



$$\begin{array}{l} \text{Recursos} \\ \text{Disponíveis} \end{array} = \begin{array}{l} \text{Manutenção} \\ \text{(dos indivíduos existentes)} \end{array} + \begin{array}{l} \text{Crescimento} \\ \text{(de novos indivíduos)} \end{array}$$

Recursos Disponíveis = Manutenção + Crescimento  
(dos indivíduos existentes) (de novos indivíduos)

$$R_0 N^\beta =$$

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$$R_0 N^\beta = R_c N +$$

Recursos  
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$$R_0 N^\beta = R_c N + E_c dN/dt$$



Recursos Disponíveis = Manutenção + Crescimento  
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$$R_0 N^\beta = R_c N + E_c dN/dt$$

$$\beta > 1$$

(escala super-linear)

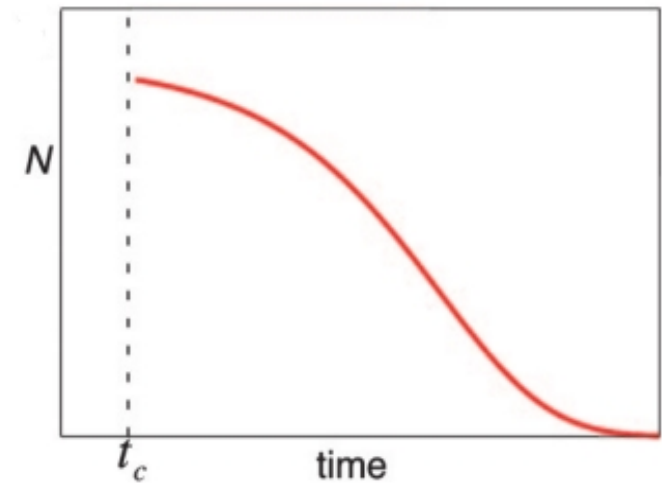
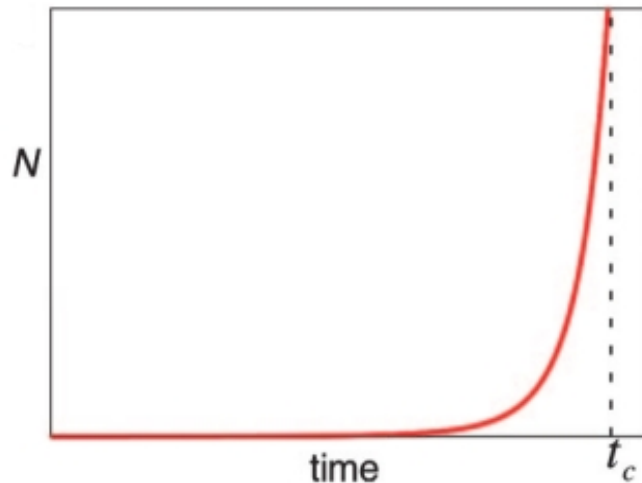
Recursos  
Disponíveis

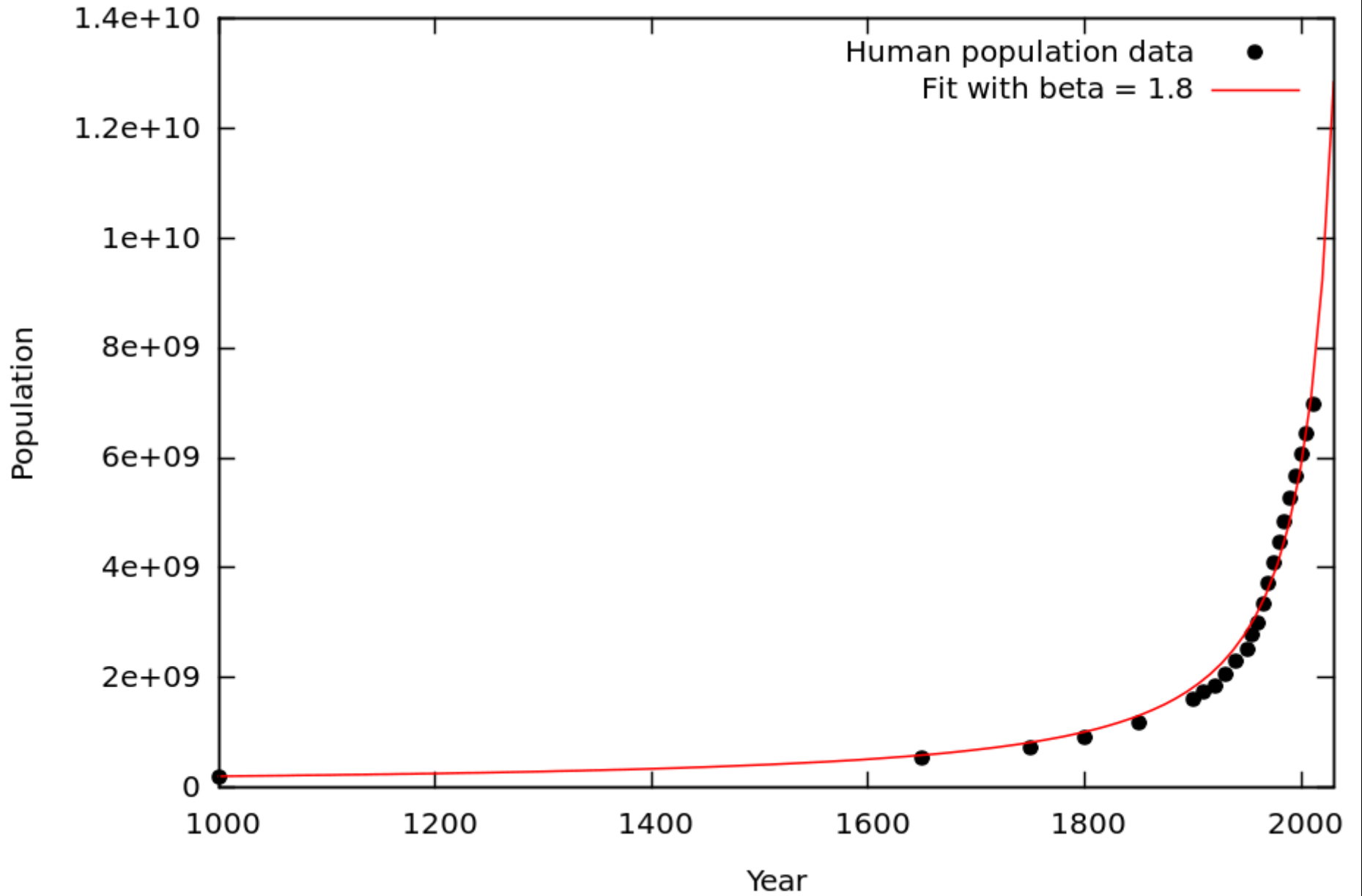
= Manutenção + Crescimento  
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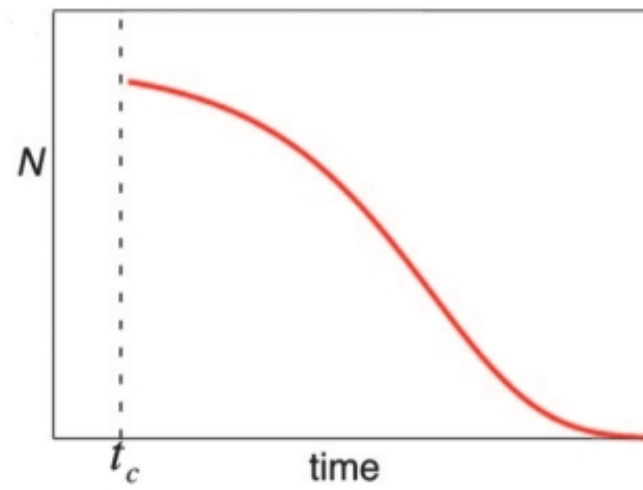
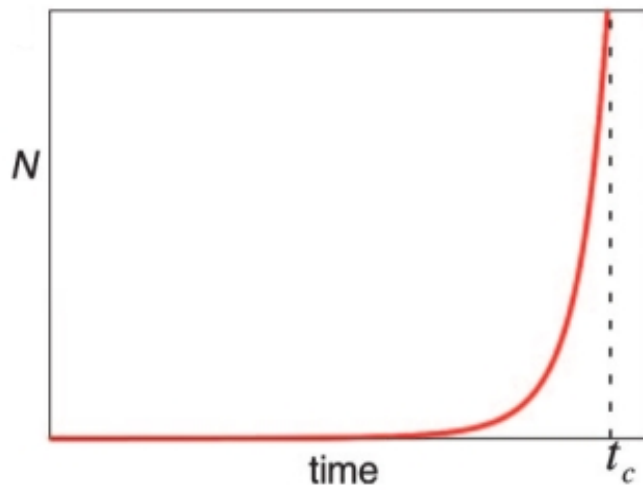
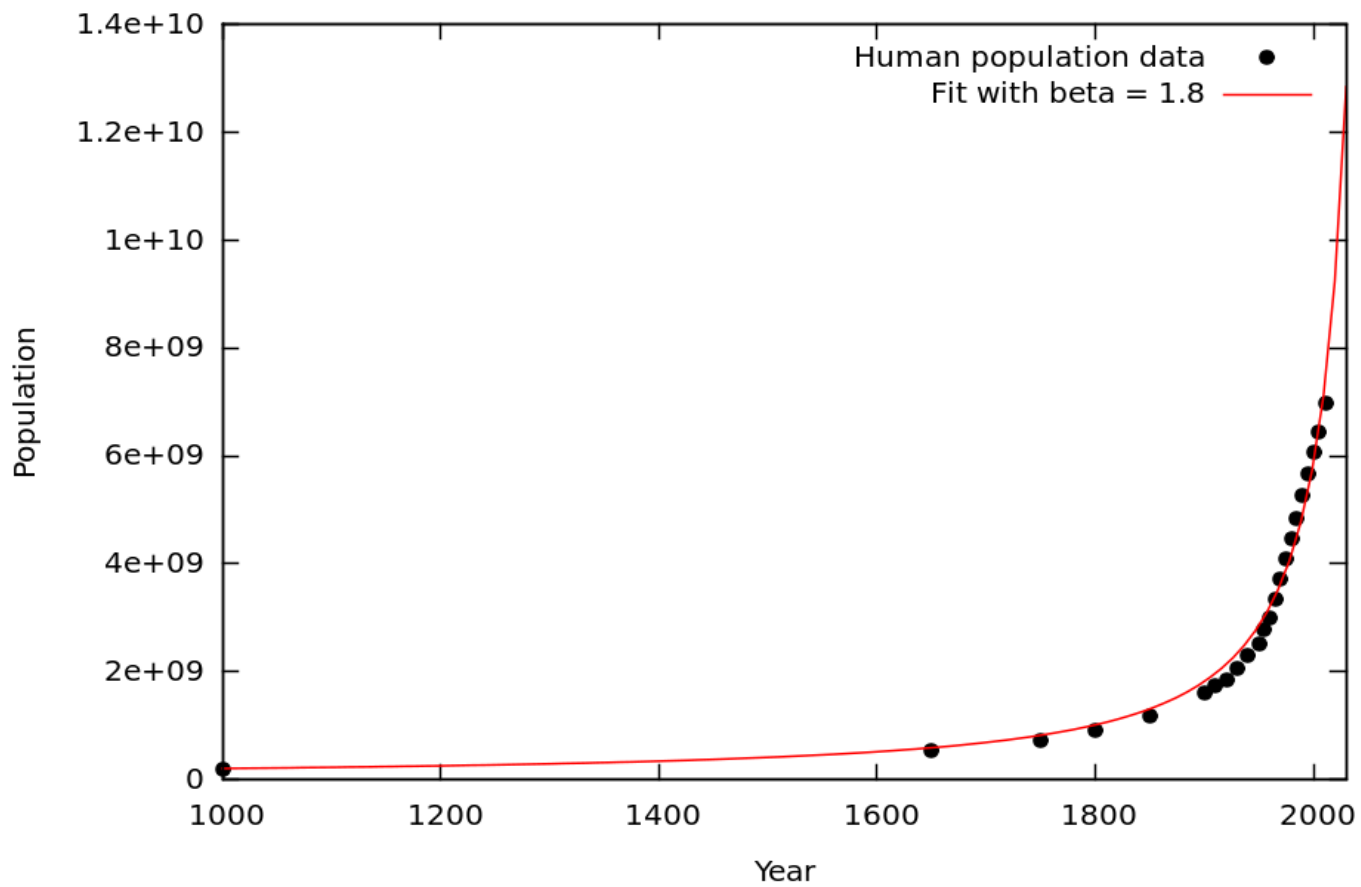
$$R_0 N^\beta = R_c N + E_c dN/dt$$

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(escala super-linear)







# Doomsday: Friday, 13 November, A.D. 2026

At this date human population will approach infinity  
if it grows as it has grown in the last two millenia.

Heinz von Foerster, Patricia M. Mora, Lawrence W. Amiot

Among the many different aspects which may be of interest in the study of biological populations ( $I$ ) is the one in which attempts are made to estimate the past and the future of such a population in terms of the number of its elements, if the behavior of this population is observable over a reasonable period of time.

All such attempts make use of two fundamental facts concerning an individual element of a closed biological population—namely, (i) that each element comes into existence by a sexual or asexual process performed by another element of this population (“birth”), and (ii) that after a finite time each element will cease to be a distinguishable member of this popula-

tion and has to be excluded from the population count (“death”).

Under conditions which come close to being paradise—that is, no environmental hazards, unlimited food supply, and no detrimental interaction between elements—the fate of a biological population as a whole is completely determined at all times by reference to the two fundamental properties of an individual element: its fertility and its mortality. Assume, for simplicity, a fictitious population in which all elements behave identically (equivariant population, 2) displaying a fertility of  $\gamma_0$  offspring per element per unit time and having a mortality  $\theta_0 = 1/t_m$ , derived from the life span for an individual element of  $t_m$  units of time. Clearly, the

elements in the population, is given by

$$\frac{dN}{dt} = \gamma_0 N - \theta_0 N = a_0 N \quad (1)$$

where  $a_0 = \gamma_0 - \theta_0$  may be called the productivity of the individual element. Depending upon whether  $a_0 \cong 0$ , integration of Eq. 1 gives the well-known exponential growth or decay of such a population with a time constant of  $1/a_0$ .

In reality, alas, the situation is not that simple, inasmuch as the two parameters describing fertility and mortality may vary from element to element and, moreover, fertility may have different values, depending on the age of a particular element.

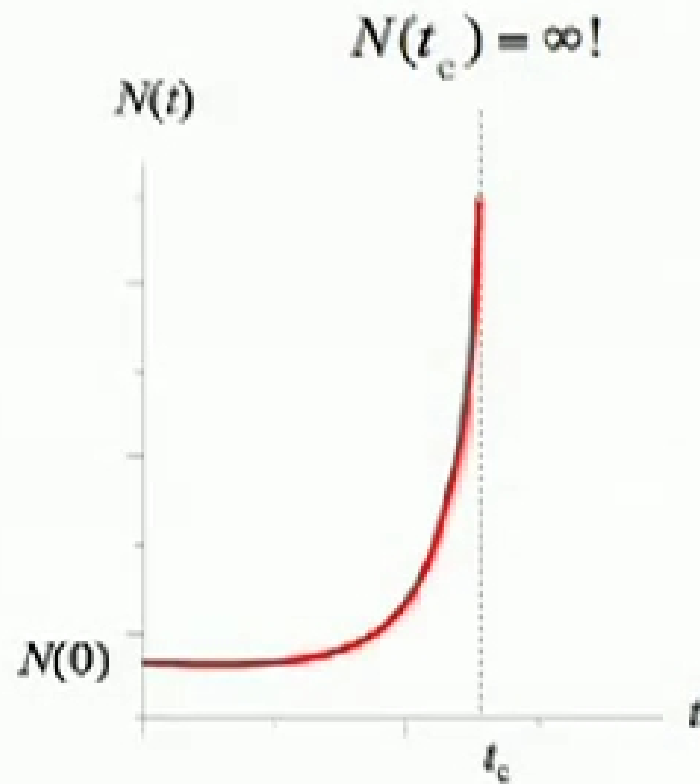
To derive these distribution functions from observations of the behavior of a population as a whole involves the use of statistical machinery of considerable sophistication (3, 4).

However, so long as the elements live in our hypothetical paradise, it is in principle possible, by straightforward mathematical methods, to extract the desired distribution functions, and the fate of the population as a whole, with all its ups and downs, is again determined by properties exclusively attributable to individual elements. If one foregoes the opportunity to describe the behavior of a population in all its temporal details and is satisfied

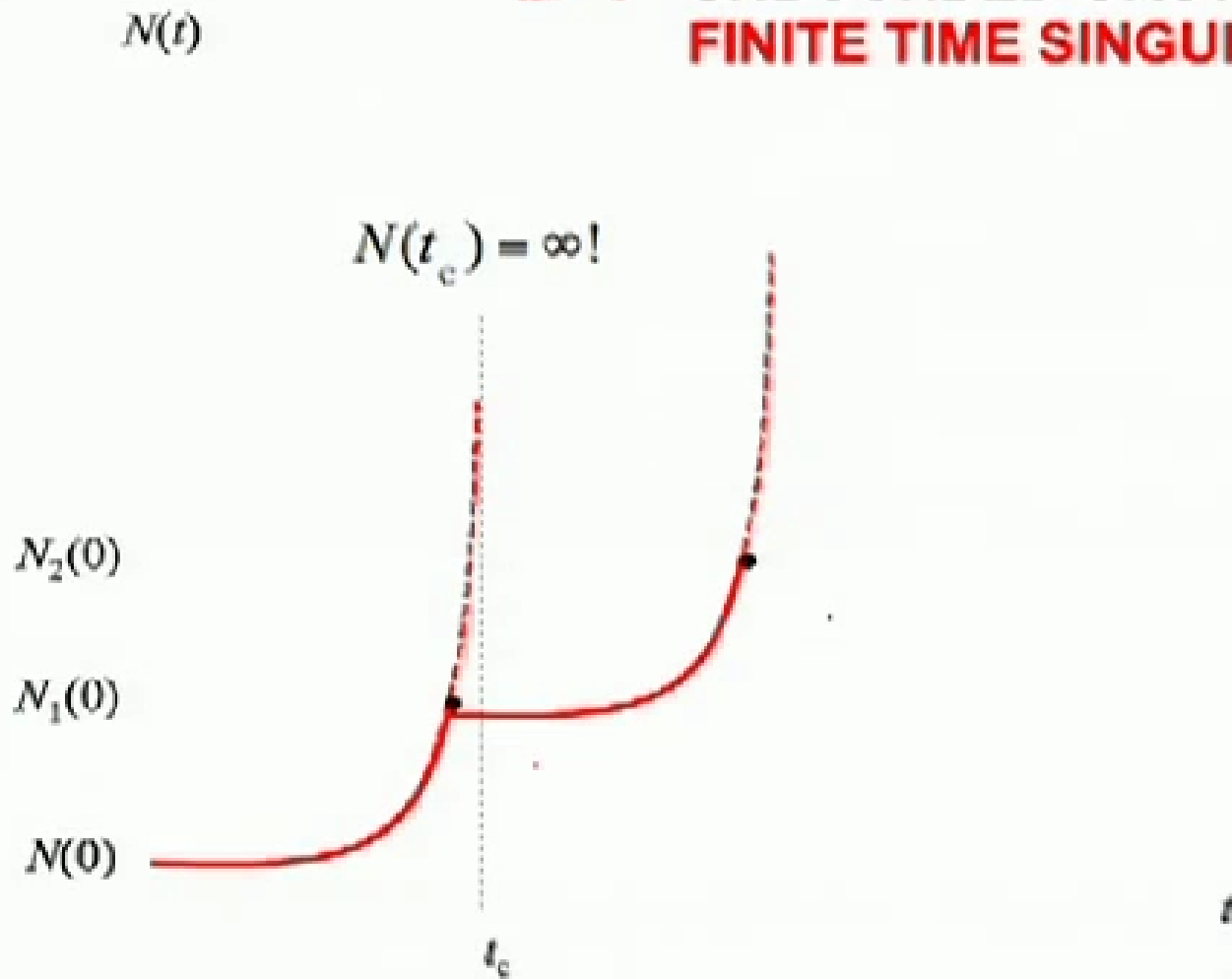
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The authors are members of the staff of the department of electrical engineering, University of Illinois, Urbana.

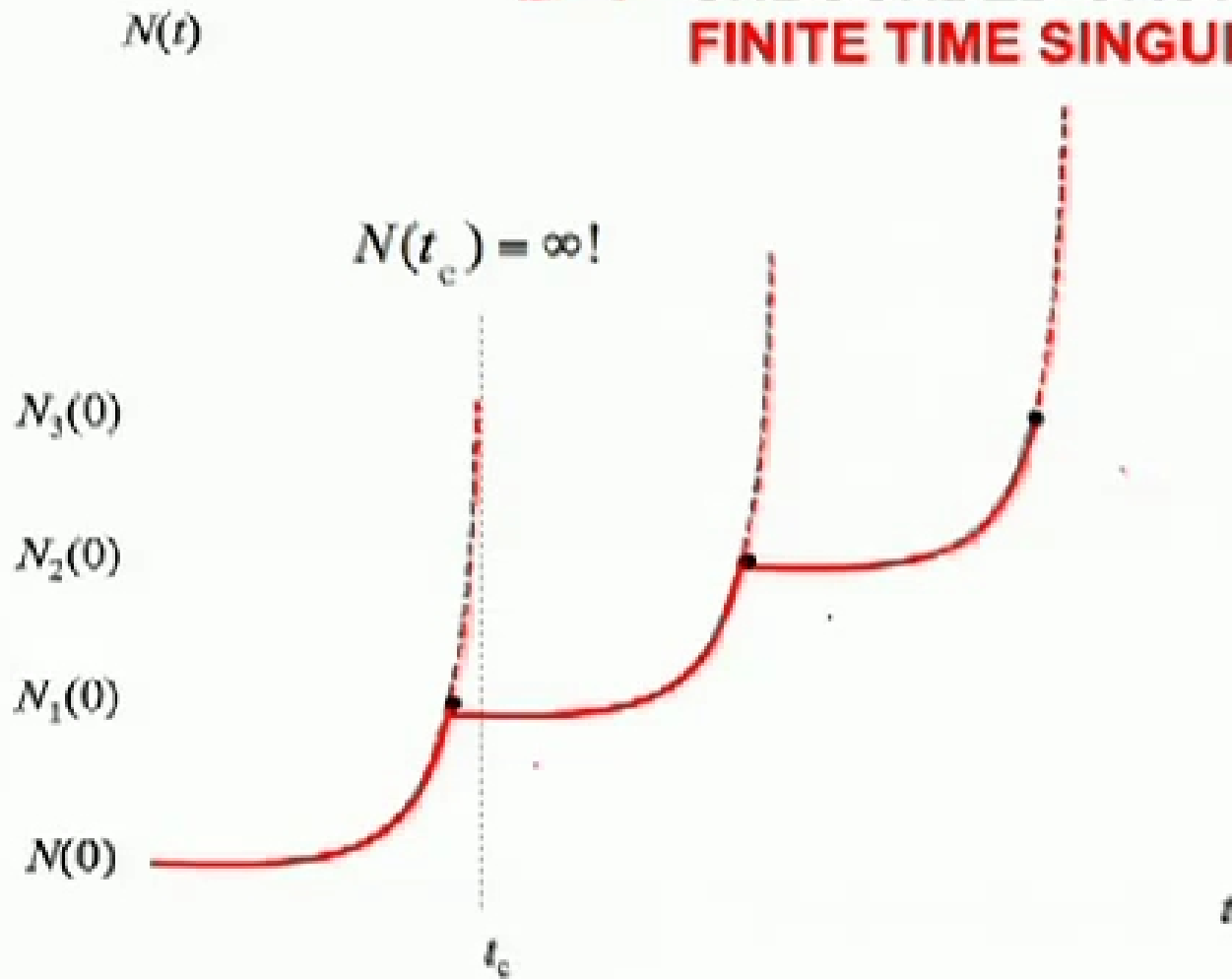
**$b > 1$  UNBOUNDED GROWTH UP TO  
FINITE TIME SINGULARITY**



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FINITE TIME SINGULARITY**

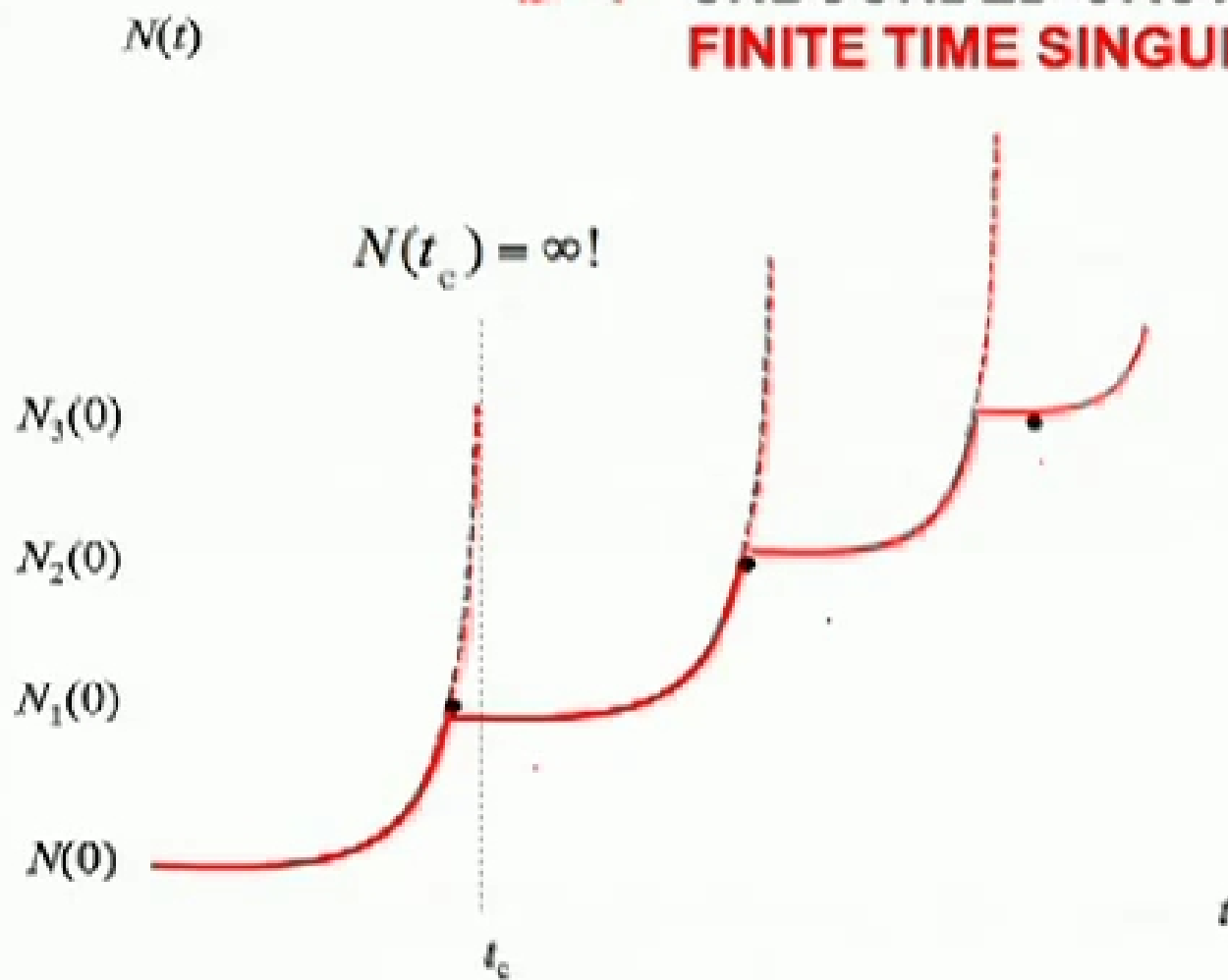


**$b > 1$  UNBOUNDED GROWTH UP TO  
FINITE TIME SINGULARITY**





**b > 1 UNBOUNDED GROWTH UP TO  
FINITE TIME SINGULARITY**



# Conclusões

$$c_1 N^\beta = c_2 N + c_3 dN/dt$$

- Interação Social:  $\beta > 1$   
(escala super-linear)
- Biologia e Infra-estrutura de cidades:  $\beta < 1$   
(escala sub-linear)

# Conclusões

$$c_1 N^\beta = c_2 N + c_3 dN/dt$$

