#### ON THE FUTURE OF THE PLANET:

THE UNIVERSAL LAWS OF LIFE, GROWTH, DEATH & SUSTAINABILITY FROM ORGANISMS TO CITIES

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The ever accelerating progress of technology....gives the appearance of approaching some essential singularity in the history of the race beyond which human affairs, as we know them, could not continue.



John von Neumann (1953)

World population growth	Population	Year
	9.2 billion*-	<b>9</b> 2050
Fertility rates are declining, the United Nations says, but not fast enough to stop population growth. The U.N.'s medium-level projection is for the world's population to reach 9.2 billion by 2050 but still more than 3 billion higher since the turn of the century. Population activists say that's too much for the world to handle.	8 billion*-	• 2025
	7.3 billion*-	2015
	6.7 billion -	2007
6 billion	6 billion	2000
	5 billion-	1987
4	4 billion -	1975
	3 billion -	1960
	2.5 billion-	1950
2	2 billion -	1930
5 million 10,000 B.C. 250 million 1 A	.D1 billion -	1800
10000 8000 6000 4000 2000 Sources: United Nations; Sustainable Scale Project; World Resources Institute; NationMast	0 20 ter.com * Projec	000 ction

#### THE GREAT ACCELERATION



Updated Great Acceleration Graphs

Source: Will Steffen et al. "The trajectory of the Anthropocene: The Great Acceleration." The Anthropocene Review, March 2015

## WE LIVE IN AN EXPONENTIALLY EXPANDING SOCIO-ECONOMIC UNIVERSE!!





AVERAGED FROM FROM NOW TILL 2050 WE ARE URBANISING OVER ONE MILLION PEOPLE EVERY WEEK AVERAGED FROM FROM NOW TILL 2050 WE ARE URBANISING OVER ONE MILLION PEOPLE EVERY WEEK

EQUIVALENT TO ADDING A NEW YORK METROPOLITAN AREA EVERY THREE MONTHS AVERAGED FROM FROM NOW TILL 2050 WE ARE URBANISING OVER ONE MILLION PEOPLE EVERY WEEK

#### EQUIVALENT TO ADDING A NEW YORK METROPOLITAN AREA EVERY THREE MONTHS

OR.....A HAMBURG EVERY 9-10 DAYS

## FATE OF OUR PLANET IS the fate of our cities









#### THE CITY IS THE MARVELLOUS MACHINE WE DEVELOPED FOR FACILITATING THE CREATION OF

#### THE CITY IS THE MARVELLOUS MACHINE WE DEVELOPED FOR FACILITATING THE CREATION OF

- WEALTH
- KNOWLEDGE, INNOVATION AND IDEAS
- INCREASED STANDARDS & QUALITY OF LIFE

#### BUT UNINTENTIONALLY AND INEVITABLY IT ALSO CREATES

## SOCIAL AND PHYSICAL ENTROPY:



















#### **DISEASE AND PANDEMICS!**



## SOCIAL UNREST!



### London After Climate Change?



Population, health, well-being,...

Energy, resources, food,... *Thermodynamics* metabolics,... Social, political, cultural,... Organization, structure,...

Economy, finance, development,... *Risk, information, innovation,...* 

Ecology, environment, climate,...

#### THESE ARE NOT INDEPENDENT

# They are all highly coupled, inter-related, multi-scale *complex adaptive systems*.







#### CITIES ARE QUINTESSENTIAL COMPLEX ADAPTIVE SYSTEMS

### ENERGY & RESOURCES (METABOLISM, INFRASTRUCTURE)



#### INFORMATION (GENOMICS, INNOVATION)

Q: Some say that while the 20th century was the century of physics, we are now entering the century of biology. What do you think of this?

Stephen Hawking interview, January, 2000

Q: Some say that while the 20th century was the century of physics, we are now entering the century of biology. What do you think of this?

A: I think the next century will be the century of complexity.

Stephen Hawking interview, January, 2000

#### CAN THERE BE "NEWTON'S LAWS OF COMPLEX ADAPTIVE SYSTEMS"?
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ALMOST CERTAINLY NOT!

#### CAN THERE BE "NEWTON'S LAWS OF COMPLEX ADAPTIVE SYSTEMS"?

#### ALMOST CERTAINLY NOT!

BUT, CAN STILL ASK WHETHER THERE ARE EMERGENT COARSE -GRAINED LAWS AND PRINCIPLES THAT LEAD TO A QUANTITATIVE COMPUTATIONAL (MATHEMATISABLE) PREDICTIVE CONCEPTUAL FRAMEWORK















Large vessels branch into smaller ones

**Beating heart** 

Pulse wave propagates through elastic vessels





5 A slice through the cerebellum showing the progressive branching structure vhite matter is distributed throughout the cerebellar volume. The geometric :ity of these structures provides for rapid dissemination of information (or
>) via a large surface area in a compact space. This feature is a hallmark of tructures which maximize the surface area within a finite volume.



# **Relation between number and** size of branches within a tree





Fig. 1. Mitochondrial network in a mammalian fibroblast. A COS-7 cell labeled to visualize mitochondria (green) and microtubules (red) was analyzed by indirect immunofluo-rescence confocal microscopy. Mitochondria were labeled with antibodies to the  $\beta$  subunit of the F<sub>1</sub>-ATPase and a rhodamine-conjugated secondary antibody. Microtubules were labeled with antibody to tubulin and a fluorescein-conjugated secondary antibody. Pseudocolor was added to the digitized image. Scale: 1 cm = 10  $\mu$ m.

From M. P. Yaffe, Science, 283, 1493 (1999).





- I. AT ALL SCALES ORGANISMS ARE SUSTAINED BY THE TRANSPORT OF ENERGY AND ESSENTIAL MATERIALS THROUGH HIERARCHICAL BRANCHING NETWORK SYSTEMS IN ORDER TO SUPPLY ALL LOCAL PARTS OF THE ORGANISM
- I. THESE NETWORKS ARE SPACE-FILLING
- III. THE TERMINAL BRANCHES OF THE NETWORK

ARE INVARIANT UNITS

I. ORGANISMS HAVE EVOLVED BY NATURAL SELECTION

SO AS TO

- i) MINIMISE ENERGY DISSIPATED IN THE NETWORKS
- IND OR (1) MAXIMISE THE SCALING OF THEIR AREA OF

INTERFACE WITH THEIR RESOURCE ENVIRONMENT

West, Brown & Enquist, Science 1997, 1999,...., Nature, 1999, 2001,.....



IN & DIMENSIONS

M 1+1 Bx

WE LIVE IN 3 SPATIAL DIMENSIONS SO BOX M

> " 3" REPRESENTS DIMENSIONALITY OF SPACE

"4" INCREASE IN DIMENSIONALITY DUE TO FRACTAL-LIKE SPACE FILLING

LIFE HAS TAKEN ADVINITAGE OF THE POSSIBILITY OF USING SPACE-FILLING FRACTAL-LIKE SURFACES (WHERE ENERGY AND RESOURCES ARE EXCHANGED)

TO MAKIMISE ENERGY TRANSFER FROM THE

ENVIRON MENT

NON-FRACTAL : M2134

DIMENSIONALITY OF SPACE (VOLUME)

BIOLOGICAL (FRACIAL)

M SPACE (Vot

AREA

BY ANALOGY : LIFE EFFECTIVELY OPERATES IN FOUR SPATIAL DIMENSIONS

[FIVE IF TIME IS INCLUDED]





#### SLOPE = $\frac{3}{4}$ < 1 SUB-LINEAR ECONOMY OF SCALE





#### SLOPE = $\frac{3}{4}$ < 1 SUB-LINEAR ECONOMY OF SCALE

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





Cardiovascular			
Variable	Exponen	t	
variable	Predicted	Observed	
Aorta radius r <sub>o</sub>	3/8 = 0.375	0.36	
Aorta pressure $\Delta p_{o}$	0 = 0.00	0.032	
Aorta blood velocity uo	0 = 0.00	0.07	
Blood volume V <sub>b</sub>	1 = 1.00	1.00	
Circulation time	1/4 = 0.25	0.25	
Circulation distance /	1/4 = 0.25	ND	
Cardiac stroke volume	1 = 1.00	1.03	
Cardiac frequency ω	-1/4 = -0.25	-0.25	
Cardiac output É	3/4 = 0.75	0.74	
Number of capillaries N <sub>c</sub>	3/4 = 0.75	ND	
Service volume radius	1/12 = 0.083	ND	
Nomersley number α	1/4 = 0.25	0.25	
Density of capillaries	-1/12 = -0.083	-0.095	
$D_2$ affinity of blood $P_{50}$	-1/12 = -0.083	-0.089	
Fotal resistance Z	-3/4 = -0.75	-0.76	
Vetabolic rate B	3/4 = 0.75	0.75	

Respiratory				
Veriable	Exponent			
Variable	Predicted	Observed		
Tracheal radius Interpleural pressure Air velocity in trachea Lung volume Volume flow to lung Volume of alveolus V <sub>A</sub> Tidal volume Respiratory frequency Power dissipated	3/8 = 0.375 0 = 0.00 1 = 1.00 3/4 = 0.75 1/4 = 0.25 1 = 1.00 -1/4 = -0.25 3/4 = 0.75	0.39 0.004 0.02 1.05 0.80 ND 1.041 -0.26 0.78		
Number of alveoli $N_A$ Radius of alveolus $r_A$ Area of alveolus $A_A$ Area of lung $A_L$ O <sub>2</sub> diffusing capacity Total resistance O <sub>2</sub> consumption rate	3/4 = 0.75 1/12 = 0.083 1/6 = 0.083 11/12 = 0.92 1 = 1.00 -3/4 = -0.75 3/4 = 0.75	ND 0.13 ND 0.95 0.99 -0.70 0.76		

Table 1 Predicted values of scaling exponents for physiological and anatomical variables of plant vascular systems.

Variable	Plant mass		Branch radius		
	Exponent	Symbol	Symbol	Exponent	
	predicted			Predicted	Observed
Number of leaves	$\frac{3}{4}(0.75)$	n <sup>L</sup>	nk k	2 (2.00)	2.007 (ref. 12)
Number of branches	$\frac{3}{4}(0.75)$	No	N <sub>k</sub>	-2 (-2.00)	–2.00 (ref. 6)
Number of tubes	$\frac{3}{4}(0.75)$	n <sub>o</sub>	n <sub>k</sub>	2 (2.00)	n.d.
Branch length	<sup>1</sup> / <sub>4</sub> (0.25)	<i>I</i> 0	l <sub>k</sub>	<sup>2</sup> / <sub>3</sub> (0.67)	0.652 (ref. 6)
Branch radius	<sup>3</sup> / <sub>8</sub> (0.375)	<i>г</i> о			
Area of conductive tissue	7/8 (0.875)	A <sub>0</sub> <sup>CT</sup>	$A_k^{CT}$	7/3 (2.33)	2.13 (ref. 8)
Tube radius	1/16 (0.0625)	ao	a <sub>k</sub>	1/6 (0.167)	n.d.
Conductivity	1 (1.00)	Ko	K <sub>k</sub>	<sup>8</sup> / <sub>3</sub> (2.67)	2.63 (ref. 12)
Leaf-specific conductivity	<sup>1</sup> / <sub>4</sub> (0.25)	Lo	L <sub>k</sub>	<sup>2</sup> / <sub>3</sub> (0.67)	0.727 (ref. 17)
Fluid flow rate			$\dot{Q}_k$	2 (2.00)	n.d.
Metabolic rate	$\frac{3}{4}(0.75)$	Q <sub>0</sub>			
Pressure gradient -	- <u>1</u> (-0.25)	$\Delta P_0/I_0$	$\Delta P_k / l_k$	- <sup>2</sup> / <sub>3</sub> (-0.67)	n.d.
Fluid velocity -	- <sup>1</sup> / <sub>8</sub> (–0.125)	u <sub>o</sub>	U <sub>k</sub>	- <sup>1</sup> / <sub>3</sub> (-0.33)	n.d.
Branch resistance -	- <sup>3</sup> / <sub>4</sub> (-0.75)	Z <sub>0</sub>	Z <sub>k</sub>	- <sup>1</sup> / <sub>3</sub> (-0.33)	n.d.
Tree height	<sup>1</sup> / <sub>4</sub> (0.25)	h			
Reproductive biomass	$\frac{3}{4}(0.75)$				
Total fluid volume	25 24 (1.0415)				

#### PLANTS

VERY DIFFERENT EVOLVED ENGINEERING DESIGN (NON-PULSATILE FIBRE BUNDLES) BUT SAME NETWORK PRINCIPLES



Table 1. Similarity of predicted scaling relations for branches within a tree [quantities denoted by uppercase symbols and subscripts *i* (20)], and for trees within a forest (denoted by lowercase symbols and subscripts *k*)\*

Scaling quantity	Individual tree	Entire forest	
Area preserving	$\frac{R_{i+1}}{R_i} = \frac{1}{n^{1/2}}$	$\frac{r_{k+1}}{r_k} = \frac{1}{\lambda^{1/2}}$	
Space filling	$\frac{L_{i+1}}{L_i} = \frac{1}{n^{1/3}}$	$\frac{l_{k+1}}{l_k} = \frac{1}{\lambda^{1/3}}$	
Biomechanics	$R_i^2 = L_i^3$	$r_k^2 = l_k^3$	
Size distribution*	$\Delta N_i \propto R_i^{-2} \propto M_i^{-3/4}$	$\Delta n_k \propto r_k^{-2} \propto m_k^{-3/4}$	
Energy and material flux*	$B_i \propto R_i^2 \propto N_i^L \propto M_i^{3/4}$	$B_k \propto r_k^2 \propto n_k^L \propto m_k^{3/4}$	

Stand property	Predicted stem radius, based scaling function
Size class neighbor separation	$d_k \propto r_k$
Canopy scaling	$r_k^{\rm can} \propto r_k^{2/3}$
Canopy spacing	$d_k^{\rm can} = c_1 r_k \left[ 1 - \left( \frac{r_{\bar{k}}}{r_k} \right)^{1/3} \right]$
Energy Equivalence	$\Delta n_k B_k \propto r_k^0$
Total forest resource use	$B_{\text{Tot}} \propto \Sigma \Delta n_k r_k^2 \le \dot{R}$
Mortality rate	$\mu_k \approx A r_k^{-2/3}$
Size distribution	$N_k \approx \frac{\dot{R}}{(K+1)b_0} r_k^{-2}$

#### **PLANTS/TREES**



 $B \propto M^{0.780 \pm 0.037}$ 

 $B \sim M^{3/4}$ SINCE

#### (OVER 27 ORDERS OF MAGNITUDE)

#### SPECIFIC METABOLIC RATE (PER UNIT MASS)

$$\frac{B}{M} \propto M^{-1/4}$$

AND METABOLIC RATE OF AVERAGE CELL

$$B_{cell} \propto M^{-1/4}$$



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## EXTRAORDINARY SYSTEMATIC ECONOMY OF SCALE (THE BIGGER YOU ARE, THE LESS ENERGY/FOOD YOU NEED PER CELL)

## EXTRAORDINARY SYSTEMATIC ECONOMY OF SCALE (THE BIGGER YOU ARE, THE LESS ENERGY/FOOD YOU NEED PER CELL)

SIMILAR SCALING LAWS HOLD FOR ALMOST ALL PHYSIOLOGICAL AND LIFE HISTORY EVENTS ACROSS THE ENTIRE SPECTRUM OF LIFE FROM CELLS TO ECOSYSTEMS Slopes (exponents) are typically sub-linear and simple multiples of  $\frac{1}{4}$ 

"quarter-power scaling"

# NETWORK GEOMETRY AND DYNAMICS CONTROLS THE PACE OF LIFE AT ALL SCALES LEADING TO AN EMERGENT "UNIVERSAL" TIME SCALE

$$B_{cell} \propto \frac{B}{M} = B_0 M^{-1/4}$$

THE PACE OF LIFE SYSTEMATICALLY SLOWS WITH INCREASING SIZE
# Metabolic rate sets the pace of life Small animals live fast and die young





#### DEPENDENCE OF GENOME LENGTH ON CELLULAR MASS



log (Cellular mass, g)



### WHITE & GREY MATTER IN BRAINS



K. Zhang, T.J.A. Sejnowski, PNAS 2000

LIFESPAN

T~ M"+

IF HEART-RATE (NUMBER OF BEATS PER SEC.) ~ M-14

> TOTAL NUMBER OF HEART-BEATS IN A TYPICAL LIFE-TIME IS INDEPENDENT OF SIZE! ~ 1.5×109

EACH ANIMAL SPECIES REGARDLESS OF SIZE HAS APPROXIMATELY THE SAME NUMBER OF HEART-BEATS IN ITS LIFE-TIME (ROUGHLY I BILLION)

### NUMBER OF HEARTBEATS PER LIFETIME OF ANIMALS



RECALL SPECIFIC METABOLIC RATE  $\overline{B} = \frac{B}{M} \propto M^{-1/4}$ 

D TOTAL ENERGY NEEDED TO SUPPORT UNIT MASS OF AN ANIMAL DURING A LIFETIME IS THE SAME FOR ALL ANIMALS REGARDIESS OF SIZE : ETT = 1.2 × 10 Joures / gm = 300 kcals/gm



**Fig. 2.** Relationship between the total metabolic energy per life span per unit body mass ( $A_{ls}=PT_{ls}/M$  kJ/kg) and the body mass (M, kg) for 86 terrestrial mammals in captivity (Prototheria, Metatheria and Eutheria). The 95% confidence limits are shown by dashed lines.

A. T. Atanasov, Bulg. J. of Vet. Med. (2006), 9, No 3, 159-174

## **TEMPERATURE DEPENDENCE**

METABOLIC RATE IS THE SUM OF ALL CONTRIBUTING REACTION SUB-PROCESSES (IN PARALLEL):

$$B = \sum_{i} P_{i}$$

P<sub>i</sub> ~ (CONCENTRATIONS) x (FLUXES) x (KINETICS)

(CONCENTRATIONS) x (FLUXES) ~ NETWORK ~  $M^{3/4}$ 

(KINETICS) ~ BOLTZMANN - ARRENHIUS ~  $e^{-E/kT}$ 

E = AVERAGE ACTIVATION ENERGY FOR RATE-LIMITING PROCESS IN RESPIRATORY COMPLEX (PRODUCTION OF ATP) ~ 0.7 eV ~ 2x10<sup>-20</sup> cal **ALL RATES** ~ *M*<sup>-1/4</sup>

METABOLISM GROWTH EVOLUTION LONGEVITY DIFFUSION FLUXES ALL TIMES ~  $M^{1/4}$ 

LIFESPANS TURNOVER TIMES TIMES TO MATURITY CIRCULATION TIMES

. . . . . . . . . . . . . .

. . . . . . . . . . .

## TEMPERATURE REACTION RATES GOVERNED BY STATISTICAL PHYSICS (BOLTZMANN-ARRENHIUS)

ALL RATES ~  $M^{-1/4}e^{-E/kT}$  ALL TIMES ~  $M^{1/4}e^{E/kT}$ 

METABOLISM GROWTH EVOLUTION LONGEVITY DIFFUSION FLUXES LIFESPANS TURNOVER TIMES TIMES TO MATURITY CIRCULATION TIMES

. . . . . . . . . . . . .

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MASS AND TEMPERATURE ARE THE MAJOR DETERMINANTS OF THE MEASURABLE TRAITS OF ORGANISMS ACROSS THE ENTIRE SPECTRUM OF LIFE

**GOVERNED BY JUST TWO PARAMETERS:** 

## 1/4 AND E ~ 0.7 ev

IF THE MASS AND TEMPERATURE DEPENDENCIES ARE ACCOUNTED FOR, OR COMPENSATED FOR, THEN:

> (TIMES) x M<sup>-1/4</sup>e<sup>-E/kT</sup> (RATES) x M<sup>1/4</sup>e<sup>E/kT</sup>

ARE INVARIANT, IMPLYING A "UNIVERSAL" RATE OF LIVING, DYING, GROWING, REPRODUCING, EVOLVING,.....



# GROWTH



# Energy and human life





GBW, J.H. Brown & B.J. Enquist, Nature 2001

$$B = N_{cells} B_{cell} + E_{cell} \frac{dN_{cell}}{dt}$$

#### IN TERMS OF MASS AT AGE t

$$\Rightarrow \frac{dm}{dt} = am^{3/4} - bm$$

wher

 $a = \frac{B_0 m_c}{E_c}$ 

e

 $b = \frac{B_c}{E_c}$ 

SOLUTION :

$$\left(\frac{m}{M}\right)^{1/4} = 1 - \left[1 - \left(\frac{m_0}{M}\right)^{1/4}\right] e^{-at/4M^{4/4}}$$
  
WHERE MO = MASS AT BIRTH (M=M. WHEN t



### PREDICTED GROWTH CURVES OF ANIMALS



## UNIVERSAL COLLAPSED GROWTH CURVE

## RESCALED MASS VS. RESCALED AGE



## **COUPLED NETWORK PROBLEM: TUMORS**

# Pre- and post-angiogenesis







### **BIOLOGY (LIFE)**

- a) DOMINATED BY SYSTEMATIC, PREDICTABLE, NON-LINEAR (UNIVERSAL) SCALING LAWS
- **b)** ECONOMIES OF SCALE (THE BIGGER YOU ARE, THE LESS YOU NEED PER "CAPITA") -SUBLINEAR
- c) PACE OF LIFE SYSTEMATICALLY SLOWS WITH INCREASING SIZE
- d) GROWTH IS SIGMOIDAL REACHING A STABLE SIZE AT MATURITY
- e) FINITE LIFESPAN

# ARE CITIES (AND COMPANIES) SCALED VERSIONS OF EACH OTHER?

# DO THEY MANIFEST "UNIVERSALITY"?

#### HIDDEN LAWS OF BIOLOGY ----- HIDDEN LAWS OF CITIES



#### HIDDEN LAWS OF BIOLOGY ----- HIDDEN LAWS OF CITIES



C. Kuhnert, D. Helbing & G.B. West, Physica A (2005)

## **SOCIAL NETWORKS**



## MODULARITY AND **PLACE**





# POSITIVE FEEDBACK MECHANISM IN SOCIAL NETWORKS



# SUPERLINEAR SCALING

# POSITIVE FEEDBACK MECHANISM IN SOCIAL NETWORKS



## **SUPERLINEAR SCALING**

# **& INCREASING PACE OF LIFE**

L.M.A. Bettencourt, D. Helbing, C. Kuhnert, J. Lobo, G.B. West PNAS, 2007 L. M. A. Bettencourt & G. B. West *Nature* 2010 L. M. A. Bettencourt *Science* 2017

#### **NETWORK "PRINCIPLES"**

i) SOCIO-ECONOMIC SYSTEMS ARE SUSTAINED BY THE TRANSPORT OF ENERGY, RESOURCES AND INFORMATION THROUGH (HIERARCHICAL) BRANCHING NETWORKS IN ORDER TO SUPPLY AND SUSTAIN ALL LOCAL PARTS OF THE SYSTEM (PEOPLE, BUILDINGS, BUSINESSES,...)

ii) NETWORKS ARE SPACE-FILLING

iii) TERMINAL UNITS ARE INVARIANT

iv) EVOLVED TO (JOINTLY) MINIMISE TRAVEL TIME AND DISTANCE AND MAXIMISE SOCIAL INTERACTION VIA EXCHANGE OF INFORMATION TO CREATE "WEALTH" AND "INNOVATE"

v) UNIVERSALITY OF HIERARCHICAL MODULAR STRUCTURES

### WITHIN SOCIO-ECONOMIC ORGANISATIONS THESE LEAD TO FRACTAL-LIKE STRUCTURES AND FLOWS

### AND TO (APPROXIMATE) POWER LAW SCALING ACROSS ORGANISATIONS:

 $Y(N) \propto N^{b}$
### SOCIO-ECONOMIC QUANTITIES DEPEND ON "TWO-BODY" INTERACTIONS (INFORMATION EXCHANGE) AND THEREFORE THE NUMBER AND DENSITY OF SOCIAL INTERACTIONS:

$$Y(N) \propto N_{\rm int}$$

### THE CONSTRAINTS AND DYNAMICS OF SOCIAL & INFRASTRUCTURAL NETWORKS (AND THE DATA!) LEAD TO

 $N_{\rm int} \sim N^{1.15}$ 

# SO, FOR THE AVERAGE INDIVIDUAL, THE NUMBER OF INTERACTIONS $\sim N^{0.15}$

### CONSEQUENTLY,

$$Y(N) \propto N_{\rm int} \propto N^{1.15}$$

L. M. A. Bettencourt and G.B. West, Nature 467, 912 (2010); L. M. A. Bettencourt, Science 340, 1438 (2013).

#### SUPER-LINEAR SCALING



Total wages per MSA in 2004 for the USA vs. metropolitan population.



Supercreative employment per MSA in 2003, for the USA vs. metropolitan population.







#### RESTAURANTS IN THE NETHERLANDS









## ON AVERAGE DOUBLING THE SIZE OF A CITY SYSTEMATICALLY

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## SAVES APPROXIMATELY 15% ON ALL INFRASTRUCTURE (ROADS, ELECTRICAL LINES, GAS STATIONS,.....)

## ON AVERAGE DOUBLING THE SIZE OF A CITY SYSTEMATICALLY

SAVES APPROXIMATELY 15% ON ALL INFRASTRUCTURE (ROADS, ELECTRICAL LINES, GAS STATIONS,.....) AND

### **INCREASES**

INCOME, WEALTH, PATENTS, COLLEGES, CREATIVE PEOPLE, POLICE, CRIME, SOCIAL INTERACTIONS, AIDS, FLU, AND

### INCREASES

INCOME, WEALTH, PATENTS, COLLEGES, CREATIVE PEOPLE, POLICE, CRIME, SOCIAL INTERACTIONS, AIDS, FLU, AND

## COVID-19

ALL BY ABOUT 15%

A CITY OF 10 MILLION WILL HAVE DOUBLE THE NUMBER OF COVID CASES IN HALF THE TIME A CITY OF 100,000 WILL..... AND HAVE ~ 200 TIMES AS MANY CASES



L.M.A. Bettencourt, D. Helbing, C. Kuhnert, J. Lobo, G.B. West PNAS, 2007 104 (17) 7301



M. Schlapfer, L.M.A.Bettencourt, M. Raschke, R, Claxton, Z. Smoreda, G.B. West, C. Ratti J. R. Soc. Interface 11 (98), 20130789 (2014) Turn to Degrad Stand +

fotdoon vidro participante 1 \*



### WIKIPEDIA

#### **BOTH HAVE SLOPE ~ 1.15**

SUBREDDIT





## Growth

### Incoming "Social Metabolic Rate" (Resources, Products, Patents,.... "Energy" or "Dollar" equivalent)

≈ Maintenance (Repair, Replacement,
 Sustenance of Infrastructure, People, Institutions,
 Companies …)

+

**New Growth (**of Infrastructure, People, Institutions, Companies ...)

 $R = \sum_{i=1}^{n} Y_{i}(N) = \sum_{j=1}^{N} r_{j} + \frac{d}{dt} \sum_{j=1}^{N} c_{j}$ 

 $n = \text{NUMBER OF "DRIVERS" } Y_i \text{ CONTRIBUTING TO THE CITY "METABOLISM"}$ 

r<sub>J</sub> = RATE AT WHICH THESE RESOURCES ARE USED BY THE j<sup>th</sup> INDIVIDUAL (MAINTAIN HIS/ HER/ITS LIFE-STYLE, ETC)

 $c_j$  = COST OF ADDING A NEW INDIVIDUAL TO THE CITY POPULATION

$$R \approx NR_{\rm O} + E_{\rm O} \frac{dN}{dt}$$
$$\frac{dN}{dt} = \left(\frac{R_{\rm I}}{E_{\rm 0}}\right) \left[N^{\beta} - \left(\frac{R_{\rm 0}}{R_{\rm I}}\right)N\right]$$

SOLUTION:  

$$N^{1-\beta} = \frac{R_1}{R_0} + \left[ N^{1-\beta}(0) - \frac{R_1}{R_0} \right] e^{-\frac{R_0}{E_0}(1-\beta)t}$$

CHARACTER OF SOLUTION SENSITIVE TO  $\beta > =, < 1$ 



#### SUB-LINEAR SCALING LEADS TO BOUNDED GROWTH

#### SUPERLINEAR SCALING LEADS TO UNBOUNDED GROWTH



#### SUPERLINEAR SCALING LEADS TO UNBOUNDED GROWTH BUT ALSO TO A



### FINITE TIME SINGULARITY



### FINITE TIME SINGULARITY



UNBOUNDED GROWTH REQUIRES **CYCLES OF INNOVATION TO AVOID** COLLAPSE

SOCIDECONOMIC METRIC

TIME



Time



#### SEQUENCE OF SINGULARITIES



UNBOUNDED GROWTH LEADING TO "FINITE-TIME SINGULARITY" & COLLAPSE

### UNLESS INNOVATIONS OCCCUR (SYSTEMATICALLY) FASTER AND FASTER

UNBOUNDED GROWTH LEADING TO "FINITE-TIME SINGULARITY" & COLLAPSE

### UNLESS INNOVATIONS OCCCUR (SYSTEMATICALLY) FASTER AND FASTER

### EXAMPLE OF THE ACCELERATING PACE OF ALL SOCIO-ECONOMIC LIFE!!

NEED TO ADAPT FASTER AND FASTER USING THE SAME BRAIN AND BIOLOGY WE'VE ALWAYS HAD!



SUSTAINABLE????

## Our "natural" metabolic rate ~90 watts Our social metabolic rate ~11,000 watts



**SLOPE =**  $\frac{3}{4}$  < 1; **SUB-LINEAR**; ECONOMY OF SCALE


## We are equivalent to a ( 30,000 kg Gorilla

## 12 Elephants

## THE SINGULARITY IS NEAR!

The ever accelerating progress of technology....gives the appearance of approaching some essential singularity in the history of the race beyond which human affairs, as we know them, could not continue.



John von Neumann (1903 - 1957)



Jim Brown (UNM)



Jamie Gillooly (U of Florida)



Alex Herman (Minnesota)



Woody Woodruff (LANL)



Chen Hou (MissouriTech)



Chris Kempes (SFI)



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