

#### Allometric Scaling Laws In Nature pt. 1

Alexander Bujotzek

Gute Ideen in der theoretischen Systembiologie, 10<sup>th</sup> of July 2007

"In jeder reinen Naturlehre ist nur soviel an eigentlicher Wissenschaft enthalten, als Mathematik in ihr angewandt werden kann."

Immanuel Kant (1724 - 1804)

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Physics and chemistry (e.g. Newton's laws) have been elevated to true science...

qualitative  $\rightarrow$  quantitative, predictive

#### But what about biology?



We know about general principles:

- Mendelian laws of inheritance
- Natural selection (Darwin's theory of evolution)



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Does life have more, universal and quantifiable laws? qualitative → quantitative, predictive

Scaling of biological systems might give us a hint...

# Allometric Scaling Scaling?



toy ship [3]

Scaling laws deal with: real ship [4]



- measuring and comparing the relation of scale to the parameters of a system
- revealing scale invariant quantities

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In physics, scaling laws typically...

- reflect underlying generic features and physical principles
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Therefore, scaling also has relevance for biology. This brought up the idea of *allometry*. [*greek: allos = different; metrie = to measure*]

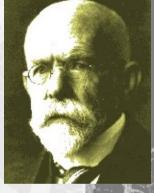
# Allometric Scaling Definition

Allometry deals with

 measuring and comparing the relation of body size / mass to different biological parameters

Classical allometric equation (Otto Snell, 1892):

$$Y = Y_0 \cdot M^b$$
 ,



[5]

## Allometric Scaling Definition

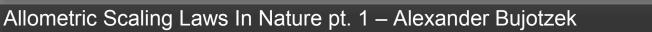
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dependent parameter Y integration constant  $Y_0$ body mass M scaling exponent b b > 0 pos. allometry, b < 0 neg. allometry, b = 1 isometry





# Allometric Scaling Definition

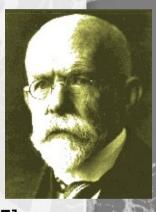
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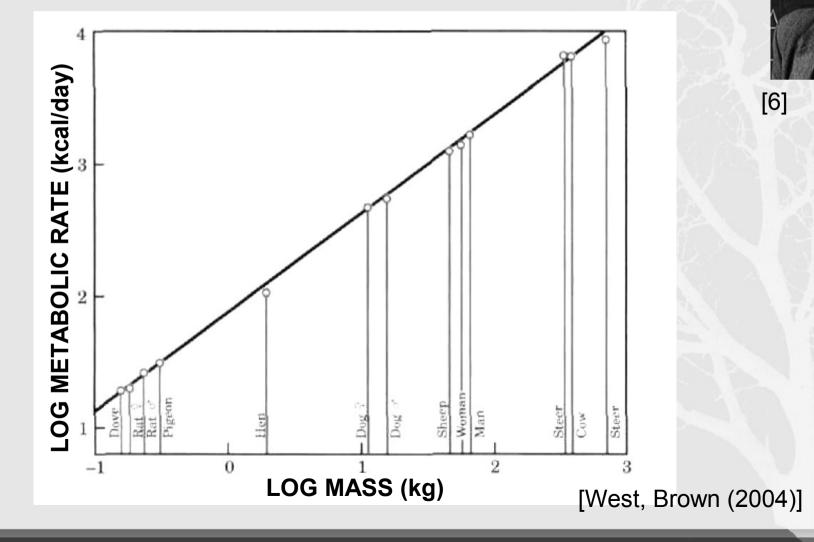
 $\log Y = b \, \log M + \log Y_0$ 



[5]

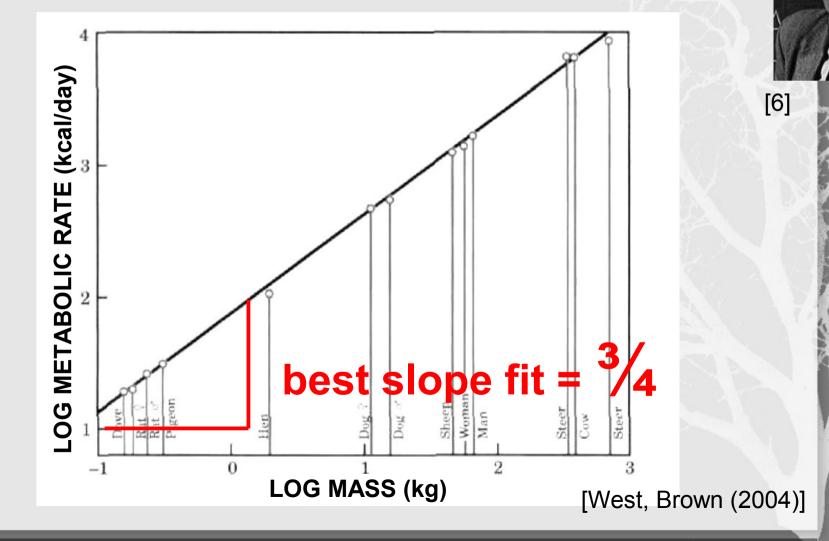
The work of Max Kleiber (1932):

metabolic rates (kcal/day) of mammals and birds

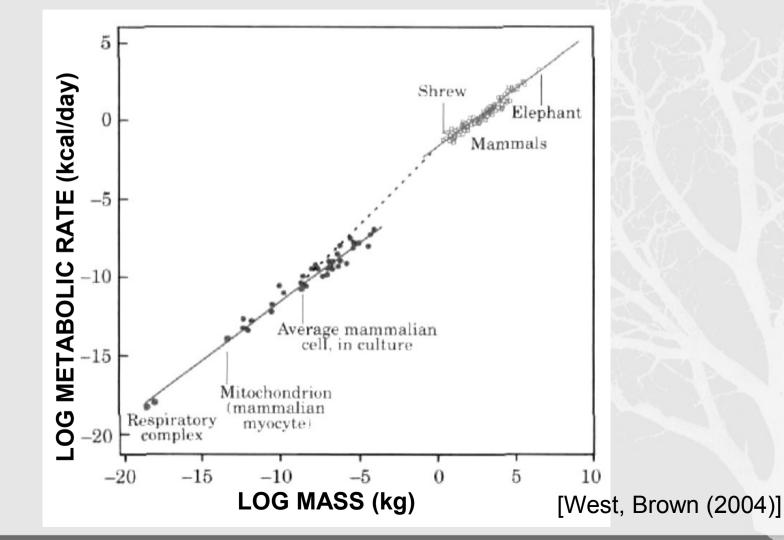


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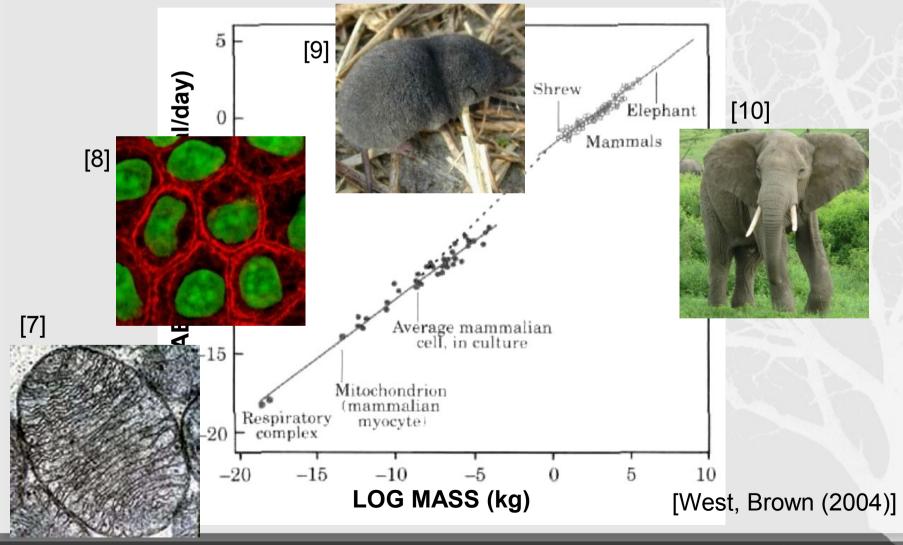
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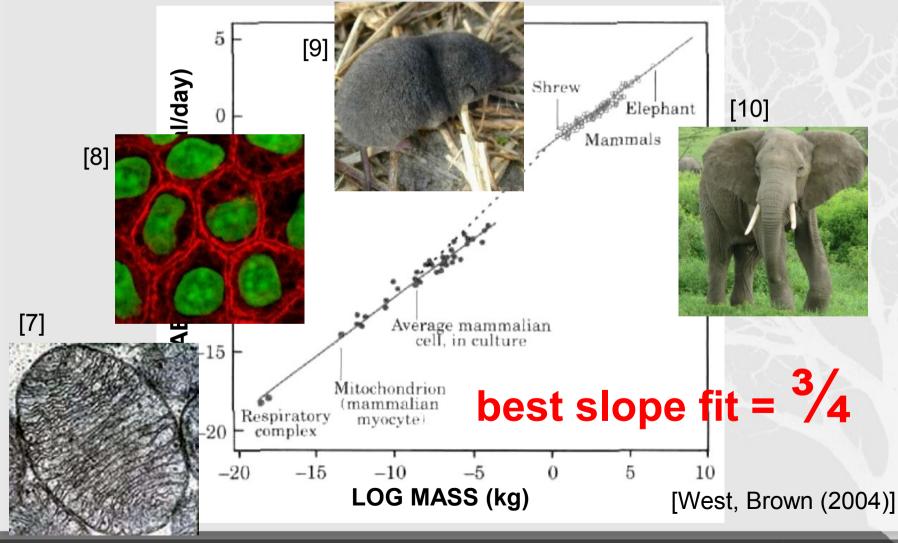
Extension of Kleiber's work: metabolic rates of life covering over 27 orders of magnitude in mass



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This leads to Kleiber's law:

$$B \propto M^{3/4}$$

,

metabolic rate *B* body mass *M* metabolic exponent  $b \approx 3/4$ 

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Scaling with *multiples of 1/4* seems to be a common principle in nature...

Examples for quarter-power scaling:

- heart rate  $\rightarrow$  b  $\approx$   $\frac{1}{4}$
- life span  $\rightarrow$  b  $\approx \frac{1}{4}$
- aorta / tree trunk diameters  $\rightarrow$  b  $\approx \frac{3}{8}$
- genome lengths  $\rightarrow$  b  $\approx \frac{1}{4}$
- population density in forests  $\rightarrow$  b  $\approx$  - $\frac{3}{4}$

As a consequence of quarter-power scaling, some *invariant quantities* emerge.

→ size-independent

Invariant quantities can be regarded as *fundamental, underlying constraints* of a system.

life span increases as  $M^{\frac{1}{4}}$ , heart rate decreases as  $M^{\frac{1}{4}}$ 

- heartbeats / lifetime
   ≈ 1.5 · 10<sup>9</sup>
- ATP molecules synthesized / lifetime ≈ 10<sup>16</sup>

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population density in forests decreases as M<sup>-34</sup>, individual power use increases as M<sup>34</sup>

power used by all individuals in any size class
 ≈ invariant

How can the predominance of quarter power scaling be explained mathematically? [West, Brown, Enquist 1997]

Life:

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need to service high numbers of microscopic units with

- energy
- metabolites
- information

in a highly efficient way

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- animal circulatory systems
- plant vascular systems
- ecosystems (e.g. forests)
- intracellular networks

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These networks have to fulfill certain properties / there exist certain constraints...

Constraints on biological *networks*:

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 → space filling, *fractal-like* branching pattern

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(3) the energy to distribute resources is minimized
 → evolution towards optimal state



evolution of Sierpinski triangle, recursion depth four [11]

Fractals (lat. fractus: broken):

- fragmented geometric shapes
- each fragment is reduced-size copy of the whole
   → self-similarity
- simple and recursive definition



evolution of Sierpinski triangle, recursion depth four [11]

Fractal dimensionality:

- indicates "how completely a fractal will fill space"
- Mandelbrot (1975): fractals, usually, have nonwhole numbered dimensionality
- "too big to be thought of as one-dimensional, but too thin to be two-dimensional"



evolution of Sierpinski triangle, recursion depth four [11]

Example: dimensionality D of Sierpinski triangle

$$D = \lim_{\epsilon \to 0} \frac{\log N(\epsilon)}{\log(\frac{1}{\epsilon})} = \lim_{k \to \infty} \frac{\log 3^k}{\log 2^k} = \frac{\log 3}{\log 2} \approx 1.585$$

 $\epsilon$  = linear size of self-similar fragments  $N(\epsilon) = \#$  self-similar fragments to cover whole original object k = recursion depth



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in each step k  $3^k$  new triangles with side length  $(\frac{1}{2})^k$ 

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# Derivation of Quarter-Power Scaling

Fractal-like structures in nature:

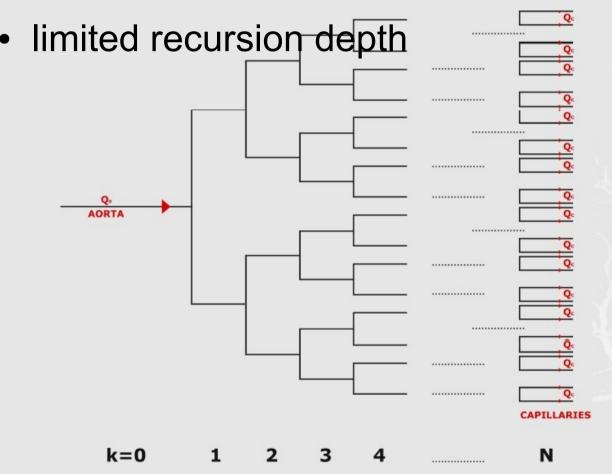
- self-similarity not perfect, but stochastic
- limited recursion depth



# Derivation of Quarter-Power Scaling

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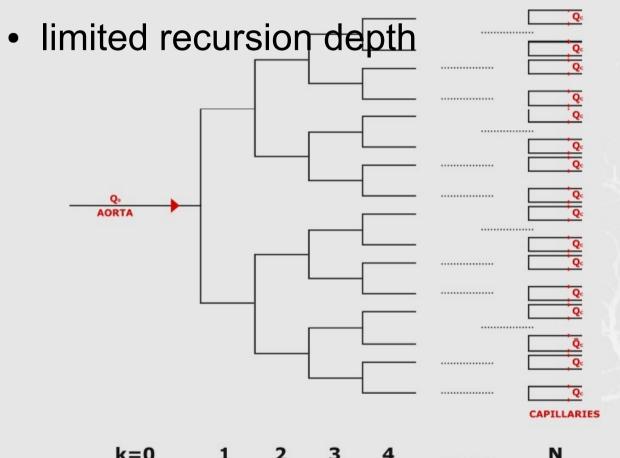
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biological networks (here: circulatory system) are fractal-like

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- (1) space filling, fractal-like branching pattern
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3 = dimensionality of space

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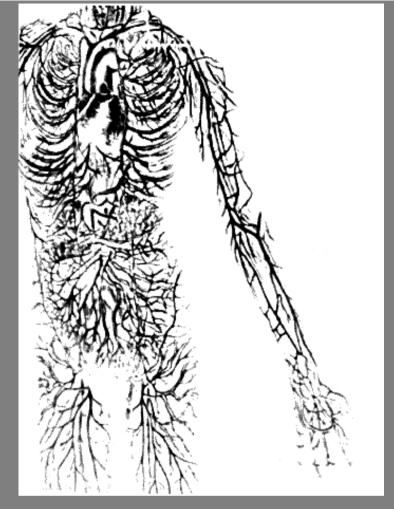
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3 = dimensionality of space

4 = 3 + 1 = increase in dimensionality due to fractal-like space filling

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 $B \propto M^4$ 



#### Allometric Scaling Laws In Nature pt. 2

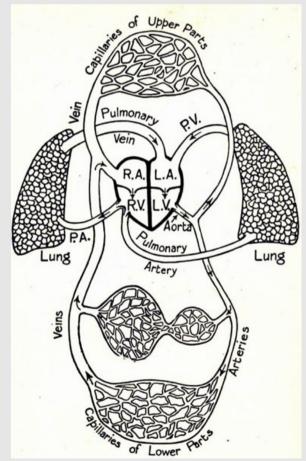
Marcel Grunert

Gute Ideen in der theoretischen Systembiologie, 10<sup>th</sup> of July 2007

### **Blood Circulation**

#### **Cardiovascular system**

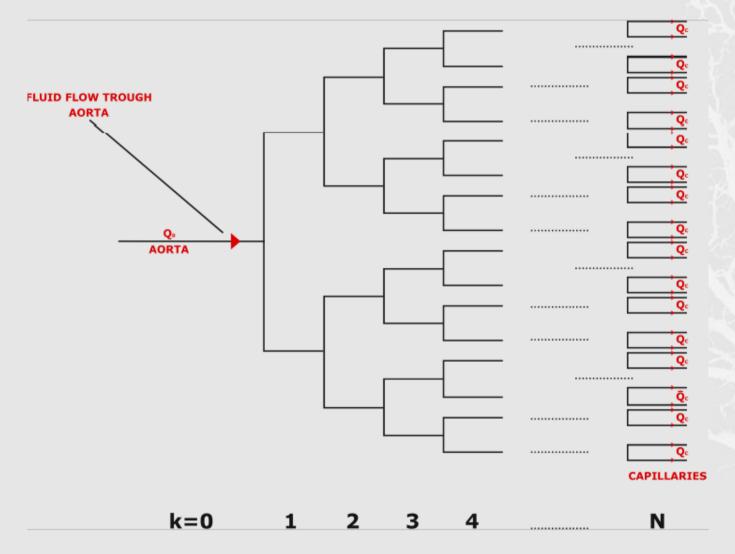
→ aorta, arteries, arterioles and capillaries



*Figure:* A representation of the circulatory system of the blood. (http://www.uh.edu/engines/)

# Blood Circulation

→ N branchings from aorta (level 0) to capillaries (level N)



<u>*Recall*</u>: B  $\propto$  M<sup>3/4</sup> (Kleiber's Law)

Since the fluid transports oxygen, nutrients, etc. for metabolism:

 $\label{eq:bound} \begin{array}{l} \textbf{B} \propto \textbf{Q}_{\textbf{0}} \\ (metabolic \ rate \ \propto \ volume \ flow \ rate) \end{array}$ 

 $\Rightarrow \text{ if } \mathbf{B} \propto \mathbf{M}^{a} \qquad (a \text{ will be determined later}) \\ then \ \mathbf{Q}_{\mathbf{0}} \propto \mathbf{M}^{a}$ 

Conservation of fluid:

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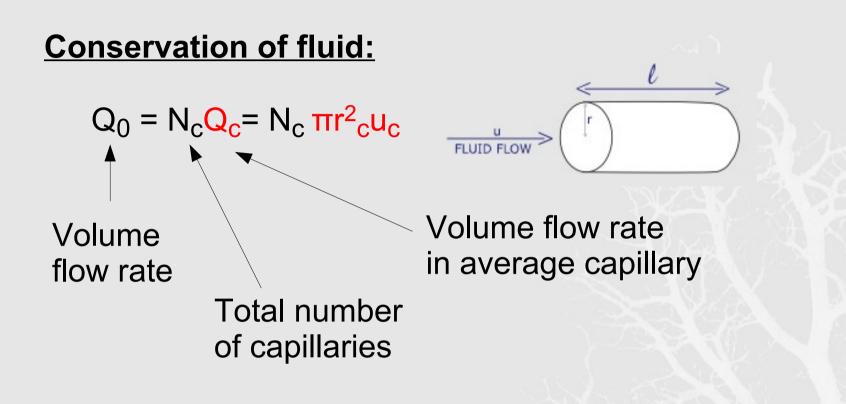
 $Q_0 = N_c Q_c = N_c \pi r^2 c u_c$ Volume
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Total number
of capillaries

#### **Conservation of fluid:**

 $Q_0 = N_c Q_c = N_c \pi r_c^2 u_c$ 

Volume flow rate Volume flow rate in average capillary

Total number of capillaries



→ Capillary is an invariant unit (Recall: scale invariance)

**Capillary is an invariant unit** (Q<sub>c</sub> is equal for all mammals)

⇒ number of capillaries (N<sub>c</sub>) must scale in same way as the metabolic rate (B ∝ Q<sub>0</sub>): B ∝ M<sup>3/4</sup> then N<sub>c</sub> ∝ M<sup>3/4</sup> (*if a=3/4* → *to be shown*)

 $N_c \propto M^{3/4}$  but: total number of cells:  $N_{cell} \propto M$ (linear)

⇒ number of cells fed by a single capillary increases as M<sup>1/4</sup> (*efficiency increases with size*)

How do radii and length of tubes scale through the network?

- scale factors: 
$$\beta_k = r_{k+1}/r_k$$
,  
 $\gamma_k = l_{k+1}/l_k$ 

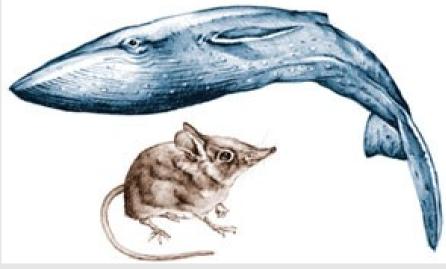
**Recall:** terminal branches of the network are invariant units

- ⇒ network must be a conventional self-similar fractal  $(\beta_k = \beta, \gamma_k = \gamma \& n_k = n)$
- ⇒ number of branches increase in geometric proportion (N<sub>k</sub>=n<sup>k</sup>) as their size geometrically decreases from level 0 to N

 $N_c = n^N \Rightarrow$  number of generations of branches scales only logarithmically with size:

$$N = \frac{a \cdot \ln\left(M/M_0\right)}{\ln(n)}$$

⇒ a whale is 10<sup>7</sup> times heavier than a mouse but has only about 70% more branchings from aorta to capillary



*Figure: http://www.the-scientist.com* 

**Total volume of fluid** in the network ("blood" volume  $V_b$ ): N

$$V_{b} = \sum_{k=0}^{N} N_{k} V_{k} = \sum_{k=0}^{N} \pi r_{k}^{2} l_{k} n^{k} \propto (\gamma \beta^{2})^{-N} V_{c}$$

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Total number of Volume Volume

Volume of tube

**Total volume of fluid** in the network ("blood" volume  $V_b$ ): N = N

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Volume of tube

Reflects the fractal nature of the system

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Total number of branches at level k

Volume of tube

Volume of capillary

Reflects the fractal nature of the system

Total volume of fluid in the network ("blood" volume  $V_{\rm b}$ ):  $V_{b} = \sum_{k=1}^{N} N_{k} V_{k} = \sum_{k=1}^{N} \pi r_{k}^{2} l_{k} n^{k} \propto (\gamma \beta^{2})^{-N} V_{c}$  $\land k=0$ Volume of Total number of Volume capillary branches at level k of tube Reflects the fractal nature of the system <u>Remember</u>:  $N = \frac{a \cdot \ln(M/M_0)}{\ln(n)}$  &  $V_b \propto (\gamma \beta^2)^{-N} V_c$  $a = - \ln(n)/\ln(\gamma\beta^2)$ 

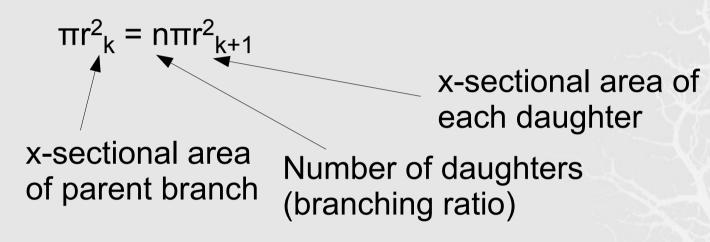
#### Further knowledge about $\beta$ and $\gamma$ :

N<sub>k</sub>I<sup>d</sup><sub>k</sub> ≈ N<sub>k+1</sub>I<sup>d</sup><sub>k+1</sub> ("volume preserving")
d-dimensional volume of space filled by branch of size I<sub>k</sub>
Number of branches of size I<sub>k</sub>

$$\Rightarrow \gamma_{k} = \frac{l_{k+1}}{l_{k}} = \left(\frac{N_{k}}{N_{k+1}}\right)^{1/d} = \frac{1}{n^{1/d}}$$

branches ratio

The sum of the cross-sectional areas of the daughter branches equals that of the parent:



$$\Rightarrow \beta_k = \frac{r_{k+1}}{r_k} = \frac{1}{n^{1/2}}$$

Recall: if B∞M<sup>a</sup> ⇒ N<sub>c</sub>=n<sup>N</sup>∞M<sup>a</sup> if V<sub>b</sub>∞M and V<sub>c</sub>∞M<sub>0</sub> ⇒ a = - ln n / ln (γβ<sup>2</sup>) with γ = n<sup>-1/3</sup> (space-filling) β = n<sup>-1/2</sup> (area-preserving) ⇒ a = <sup>3</sup>⁄<sub>4</sub> (independent of n)

In d-Dimensions:  $B \propto M^{d/(d+1)}$ 

 $\Rightarrow$  we live in 3 spatial dimensions, so B  $\propto$  M<sup>3/4</sup>

- "3" represents dimensionality of space
- "4" increase in dimensionality due to fractal-like space filling

#### Radius and length of aorta:

• Radius: 
$$r_0 = \beta^{-N} r_c = N_c^{1/2} r_c \Rightarrow r_0 \propto M^{3/8}$$

• Length: 
$$l_o = \gamma^{-N} r_c = N_c^{1/3} l_c \Rightarrow l_0 \propto M^{1/4}$$

#### Hydrodynamic resistance of the network:

$$\sim 1/M^{3/4}$$

#### ⇒ Total resistance decrease with size (small may be beautiful but large is more efficient)

#### **Respiratory system**

- Tracheal radius ~  $M^{3/8}$
- Oxygen consumption rate  $\sim M^{3/4}$
- Total resistance  $\sim 1/M^{3/4}$
- Volume flow to lung  $\sim M^{3/4}$



*Figure:* 3D-Lung (*http://www.newportbodyscan.com*)

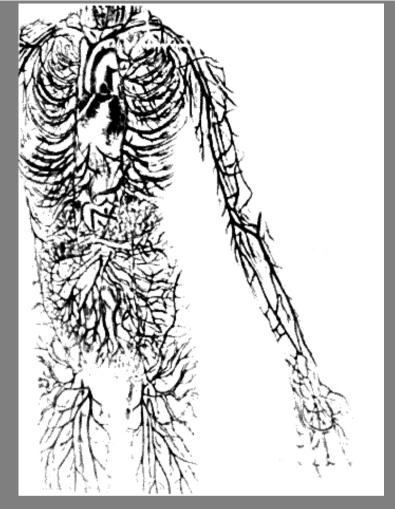
#### **Overview of further scaling laws**

Physiological variables	Dimension	Scaling exponent
Heart Beat Rate	-1	-1⁄4
Period of Heart Beat	1	1⁄4
Life Span	1	1⁄4
Diameter of Tree Trunks	3	3/4
Diameter of Aortas	3	3/4
Brain Mass	3	3/4
Metabolic Rate	3	3/4

# Model (Y=Y<sub>0</sub>M<sup>b</sup>) predicts the known scaling relations of mammalian systems:

Cardiovascular			
Variable	Exponent		
	Predicted	Observed	
Aorta radius	3/8 = 0.375	0.36	
Circulation time	1/4 = 0.25	0.25	
Total resistance	-3/4 = -0.75	-0.76	
Metabolic rate	3/4 = 0.75	0.75	

Respiratory			
Variable	Exponent		
	Predicted	Observed	
Tracheal radius	3/8 = 0.375	0.39	
Volume flow to lung	3/4 = 0.75	0.80	
Respiratory frequency	-1/4 = -0.25	-0.26	
Total resistance	-3/4 = -0.75	-0.70	
Oxygen consumption rate	3/4 = 0.75	0.76	

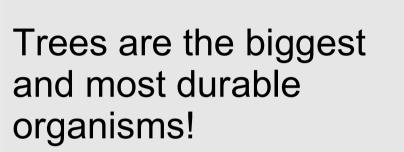


#### Allometric Scaling Laws In Nature pt. 3

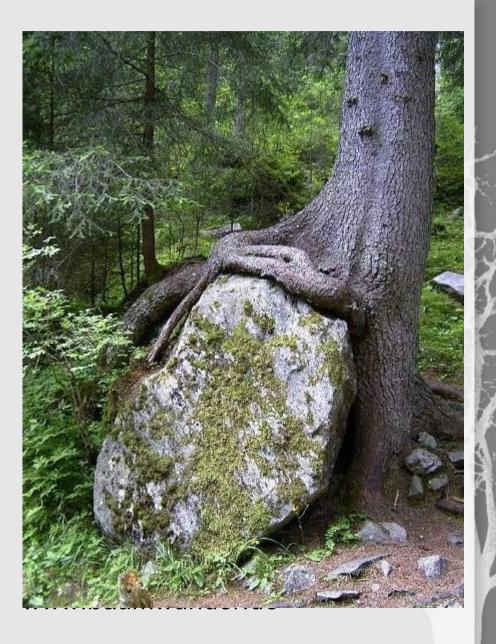
Katharina Albers

Gute Ideen in der theoretischen Systembiologie, 10<sup>th</sup> of July 2007

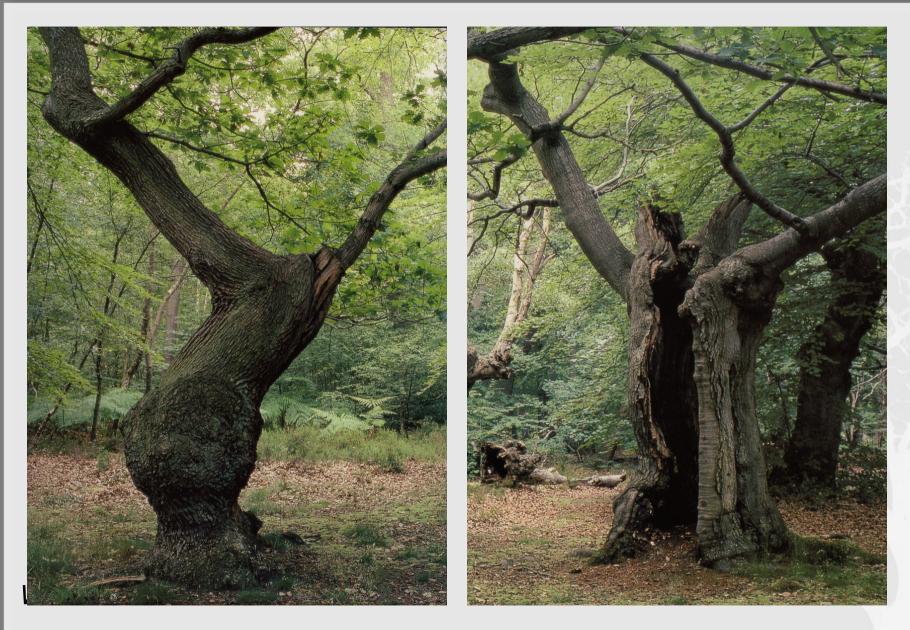
### Motivation



Why do they grow as they do?



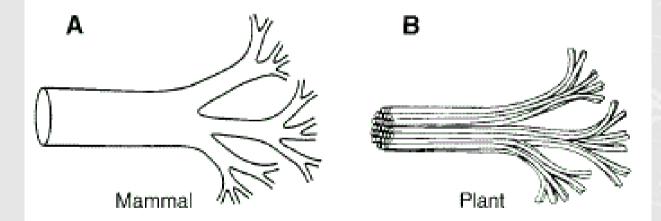
#### Motivation



#### Allometric Scaling Laws In Nature pt. 3 – Katharina Albers

### Scaling laws for trees

Diameter of aortas Diameter of tree trunks in both cases: b ≈ 3/8

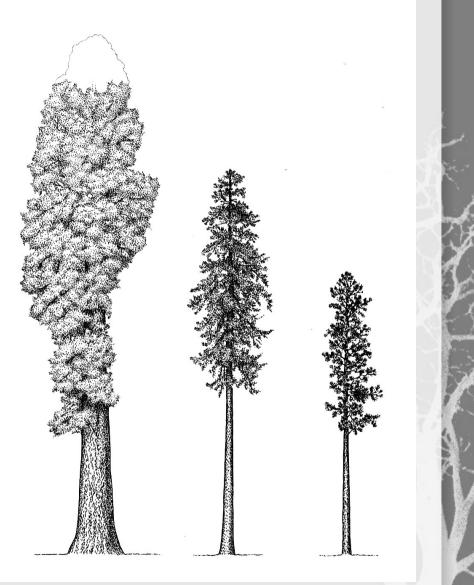


West et al: A General Model for ... (1997)

# Scaling laws for trees

•Diameter of trunk in proportion to the height bigger in larger trees

 Can be explained with help of dimensional analysis



McMahon et al: Form und Leben (1985)

# Dimensional Analysis

- Conceptual tool applied in physics, chemics and engineering
- To understand physical situations involving a mix of different kinds of physical quantities
- Used to form reasonable hypotheses about complex physical situations
- Example: Mach-number. Air stream around plane changes dramatically when it's faster than Sound. Dimensionless relation flight velocity/acoustic velocity given by Mach-number.

 Important variables: Diameter Height Elastic modulus Relative density

• Dimensional analysis yields:

 $\frac{Elastic modulus \cdot (Diameter)^2}{Gravity \cdot Relative density \cdot (Height)^3}$ 

 Relation of elastic modulus and specific gravity alike for living wood

$$\stackrel{(Diameter)^2}{(Height)^3} \quad nearly \ constant$$

*Height*  $\propto$  *Diameter*<sup>2/3</sup>

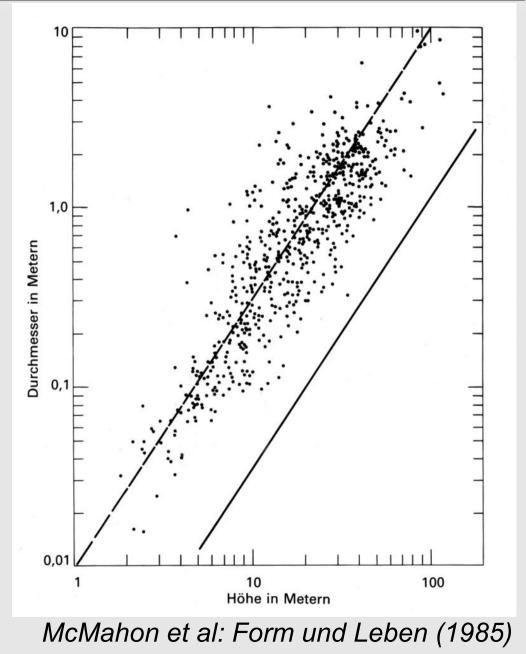
Same conclusion by Greenhill in 1881, but with different arguments:

How high can a (cylindric) flag pole become without collapsing?

Laws of solid mechanics: A pole with diameter 53 cm can be 91 m high at most.



Complies with conclusion of dimensional analysis!!



- Trees react on outer stimuli like gravity or wind by thickening according to the stress
- Controlled by growth hormone auxin, which supports growth of cambium
- If trees in the greenhouse are bend regularly, the trunk grows bigger, and trees outside shouldn't be supported for too long, because they cannot stand alone afterwards

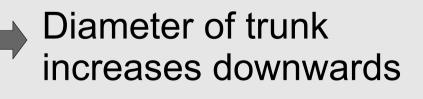
 stems represent a mechanical optimum with respect to tapering, branch and root junctions, and inner architecture



www.umdiewelt.de

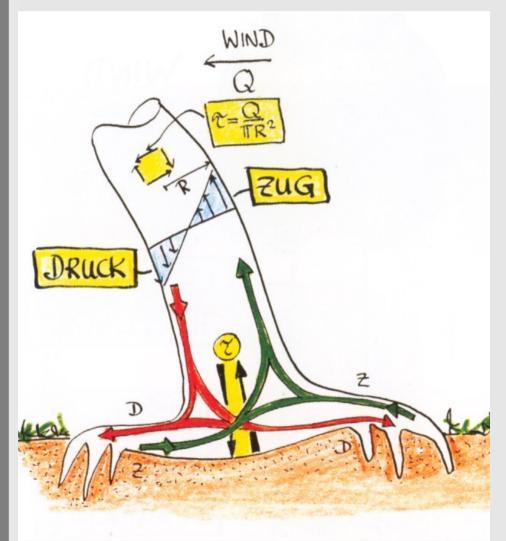
#### Trees are perfect selfadjusting optimizers:

- grow according to forces
- aim at an even distribution of the mechanical stresses



Mattheck: Warum alles kaputt geht (2003)

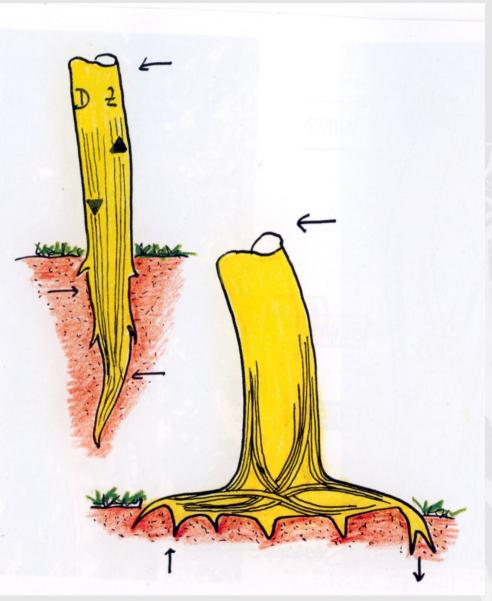
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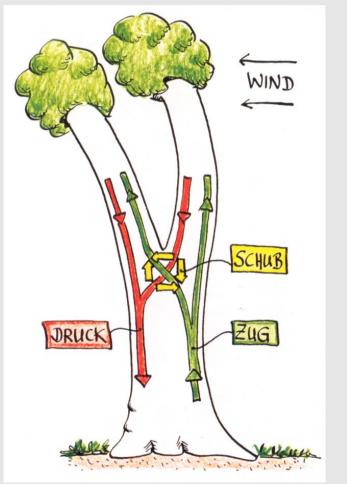
In transition of trunk and radix tractive efforts and compressive forces cross

Mattheck: Warum alles kaputt geht (2003)

 Woodfibres run unfavourably



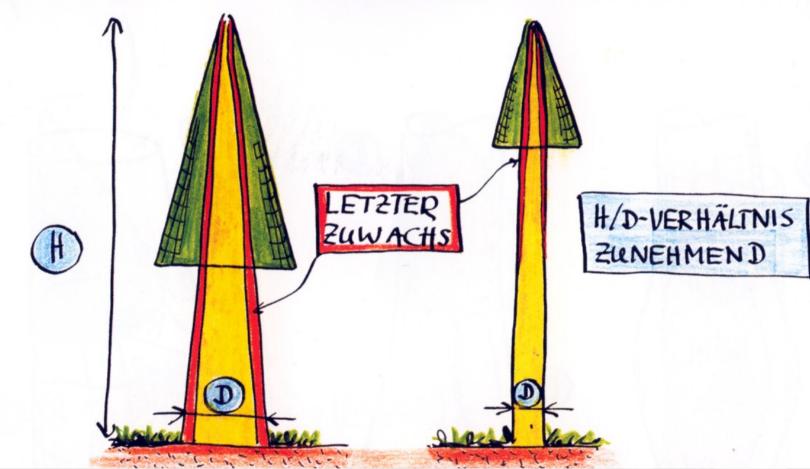
Mattheck: Warum alles kaputt geht (2003)





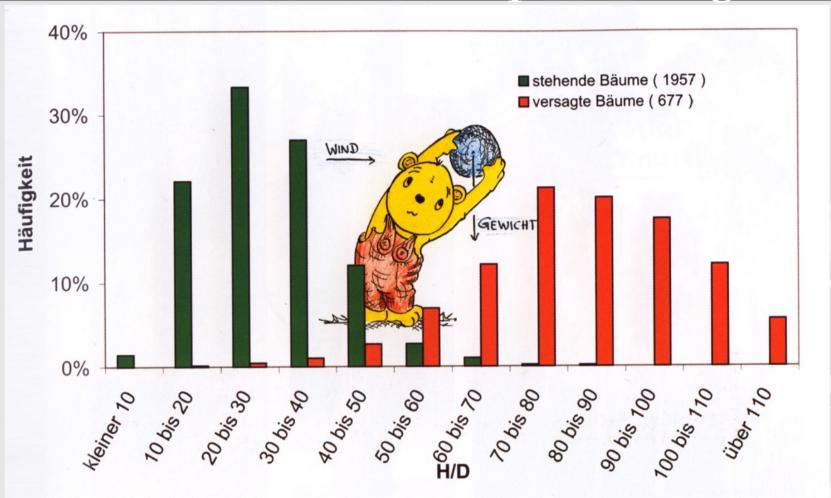
Mattheck: Warum alles kaputt geht (2003)

In bifurcations the same forces take effect



Mattheck: Warum alles kaputt geht (2003)

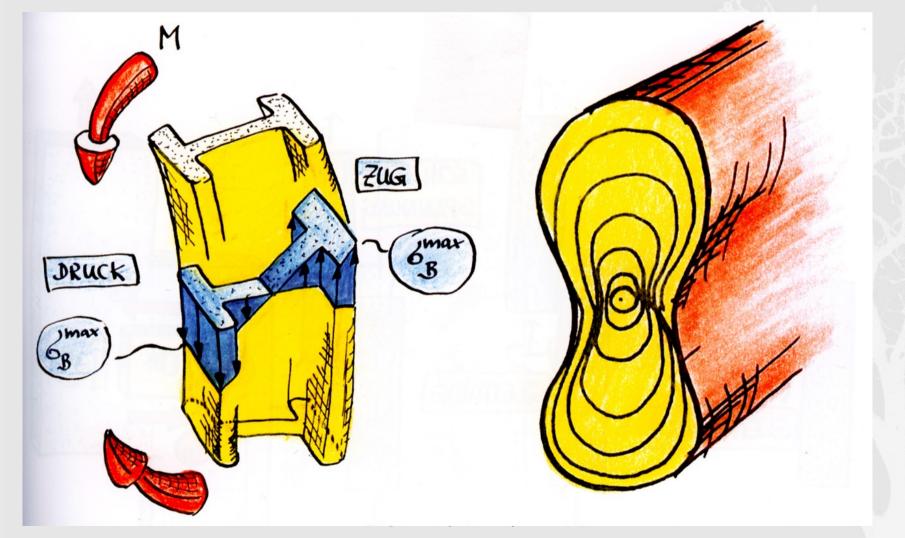
 Increasing trunk-diameter only in vital trees with low top

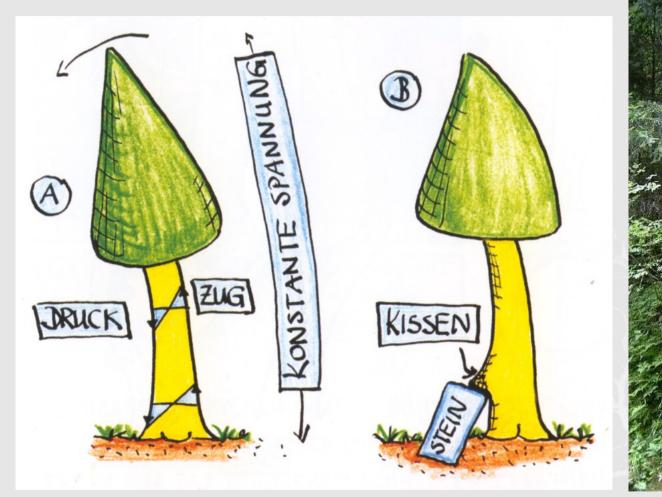


Mattheck: Warum alles kaputt geht (2003)

 Rule of thump: with relation H/D > 50, tree likely to collaps

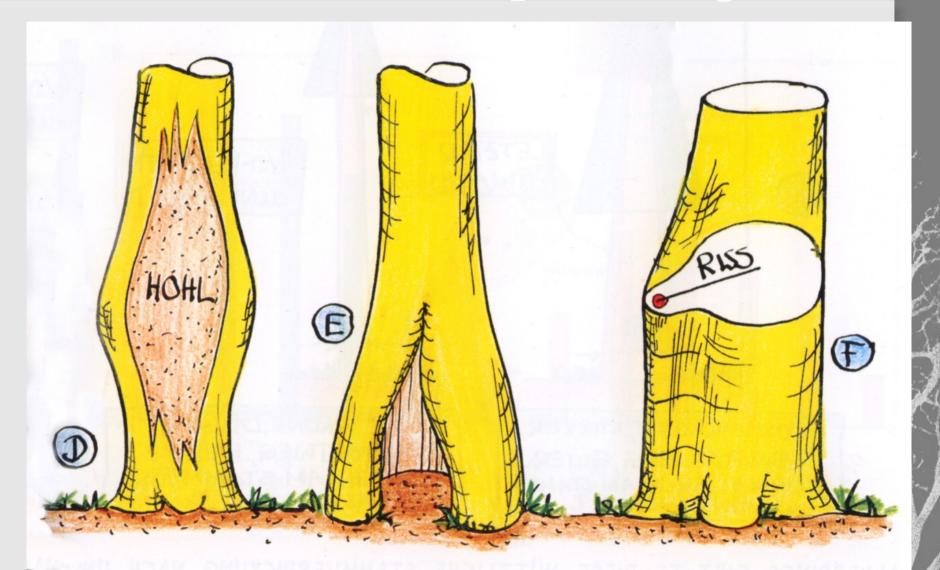
• Radix forms an eight, alike the I-beam





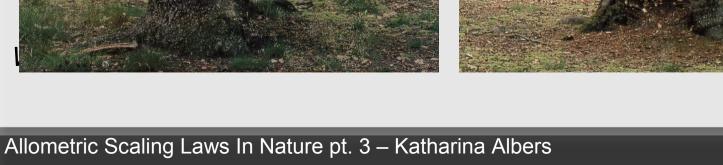
Mattheck: Warum alles kaputt geht (2003)

www.baumwunder.de

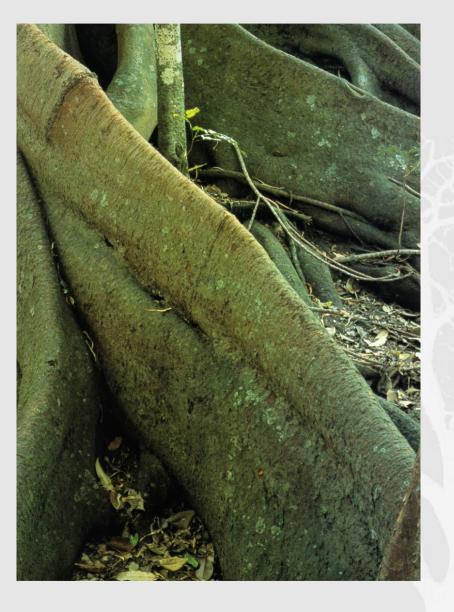


Mattheck: Warum alles kaputt geht (2003)





In tropical rain forest trees have huge wide-spread roots, because they grow very high



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## Thanks for your attention!



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