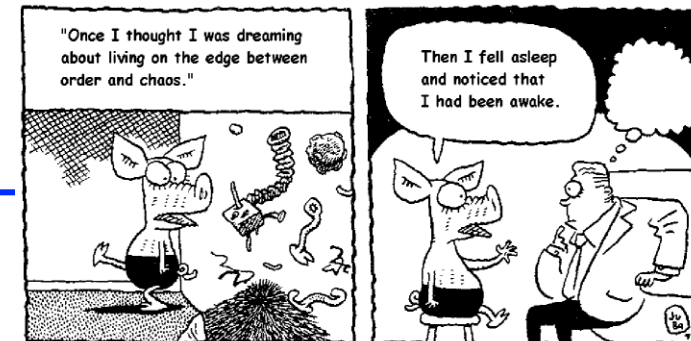

AS-74.4192 Elementary Cybernetics

Lecture 2: Research on Complex Systems



Philosopher's Stone of Today?

- J. Holland:

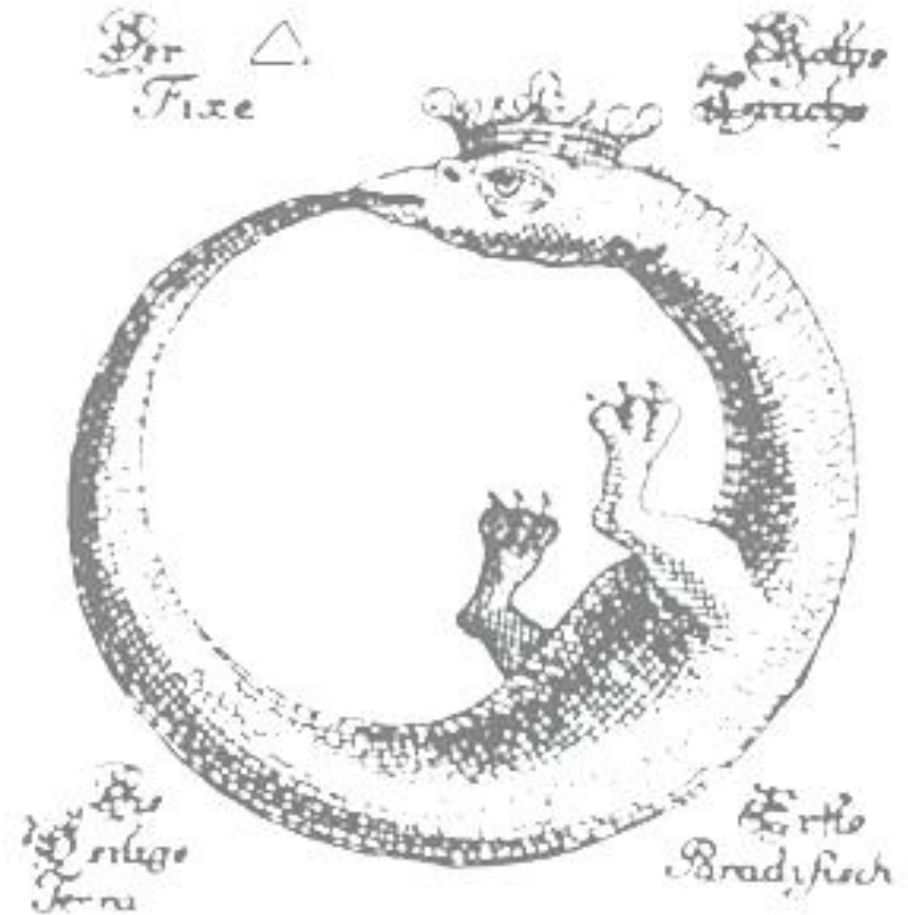
*“Many of our most troubling long-range problems — **trade imbalances, sustainability, AIDS, genetic defects, mental health, computer viruses** — center on certain systems of extraordinary complexity. The systems that host these problems — economies, ecologies, immune systems, embryos, nervous systems, computer networks — appear to be as diverse as the problems. Despite appearances, however, the systems do share characteristics ... This is more than terminology. It signals our **intuition that there are general principles** that govern all cas behavior, principles that point to ways of solving the attendant problems. ...”*



What do you
know about
alchemy?

Do you laugh at
alchemists?

(remember Newton ...)



Credo

- “Clearly, there is something special about complex systems”
- Truly? Do you think so?

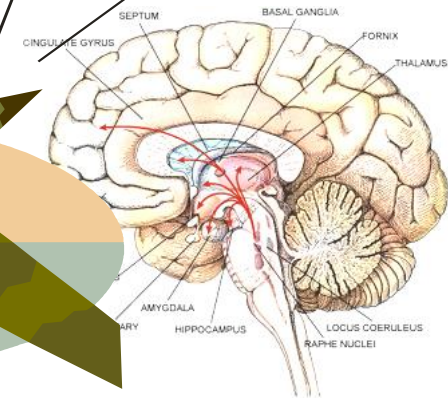
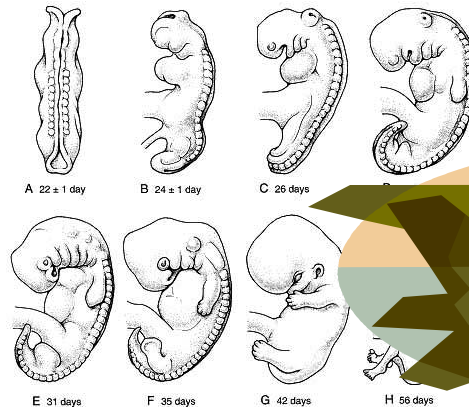
Complex Systems Theory ?

NN structures

fuzzy systems

AI techniques

Mathematical innovations



“Negativism” vs. positivism

- “Key theories are already there, one only needs to fill in the gaps”
- K. Enqvist (etc.): Everything is energy – one only needs to write the Hamiltonians ... Nonlinearities *of course* then result in observed illusion of complexity
- And *of course*, these system-specific energy expressions are extremely complicated ...



Something to ponder

- Aristotle : “Heart is the home of soul”
 - Heart is in the “innermost” organ
 - Speech comes from the chest, where the heart is
 - Heartbeat accelerates when one is excited, etc.
 - Brain is only needed for cooling of blood!
- Aristotle was the big authority for more than 1000 years, offering the most logical explanations at that time
 - Before gravitation law, based on the Aristotelian world view, the best explanations based on flat Earth hypothesis (objects want to fall “down”)
- Further: Before the theory of relativity, the best explanation for diversity of species was divine (there is not enough coal in the Sun to last for millions of years)

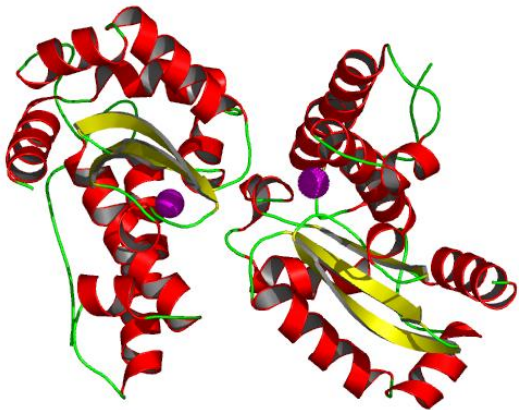


-
- One's thinking is bound to one's own world view; are we now on the correct track?
 - Thinking patterns 500 years ago seem so ridiculous – what do they think about us 500 years from now in the future?
 - Today there are so many new incompatible observations that one can say that there are more mysteries than ever before
 - The “best explanations” are probably to be changed again
 - Evidence & explanations are not yet in balance – examples:
 - *Gene transcription + translation* – intelligence needed in coordination!?
 - *Proteins + enzymes* – huge number of functionalities: Pattern recognition?!
 - How to understand and model *protein folding*?
 - What is the nature of *orbitals*, the predestinated structures in molecules?

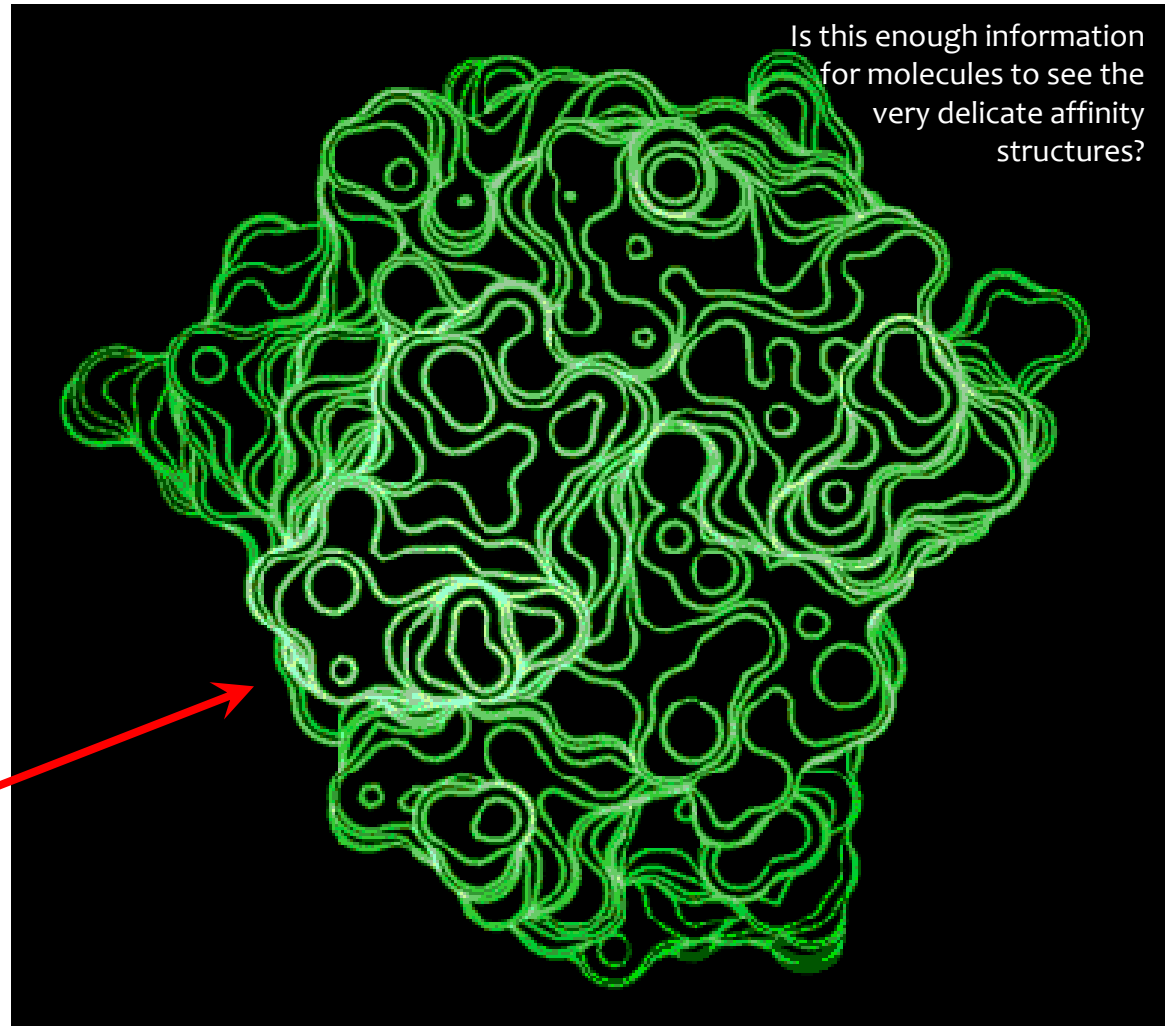


Example #1

- For example:
Enzyme *superoxide dismutase*



- Only electric fields can be experienced by other molecules



Example #2

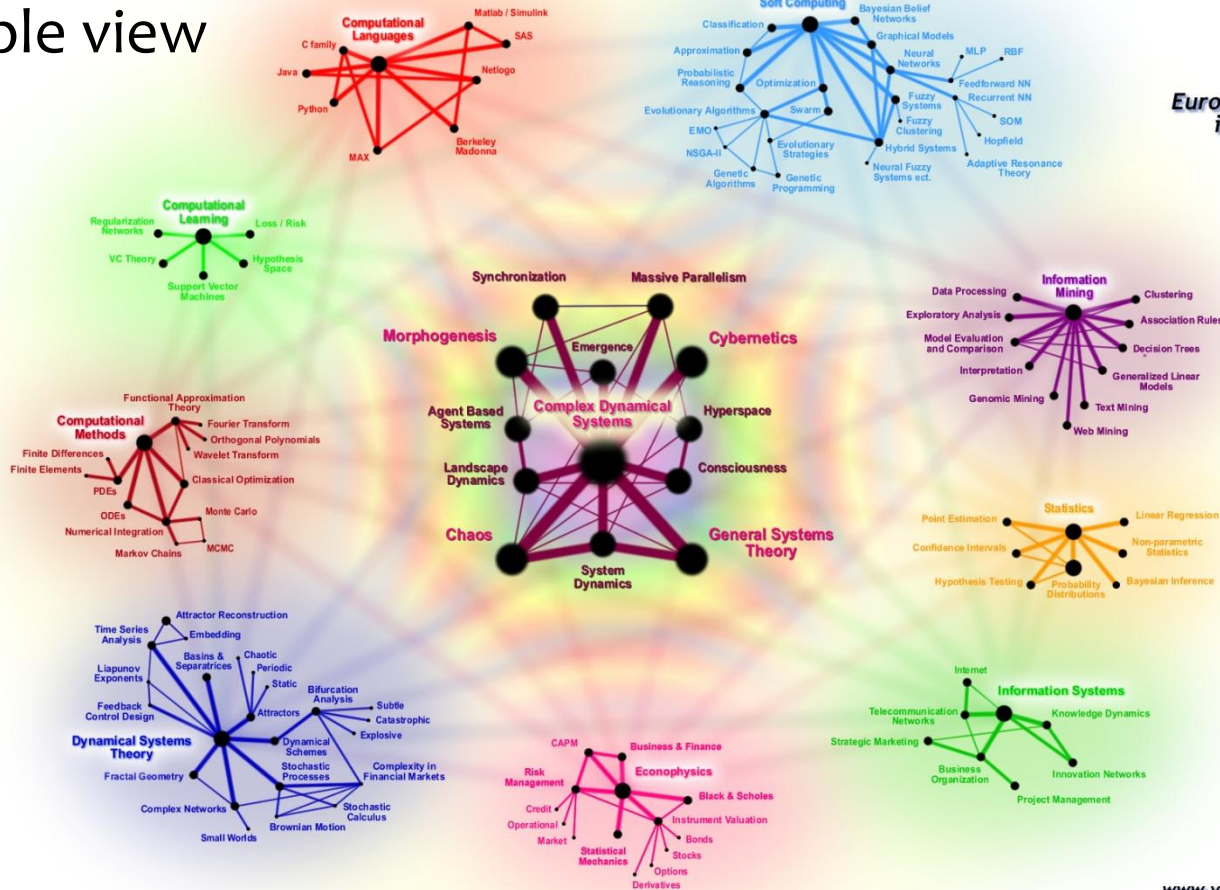


- How to explain the symmetry in snow crystals?
- Does there exist some internal communication?
- Today's explanation: "All parts of a single snowflake experience exactly the same environmental parameters"
- However – clearly, different parts are NOT in the same phase of development



Complexity – how to attack it?

Mapping complexity – an example view



Elemental Complexity Network

* Not all Links are included

European School for Advanced Studies
in Methods for Management of
Complex Systems



Prime Fields of Application

- | | |
|------------------|-----------------|
| Architecture | Fluid Mechanics |
| Art | Geology |
| Astronomy | History |
| Biology | Linguistics |
| Chemistry | Neuroscience |
| Computer Science | Mathematics |
| Ecology | Physics |
| Economics | Psychology |
| Engineering | Psychobiology |
| Ethnobotany | Quantum Physics |
| Finance | Sociology |

Milestones of Complexity

- 1882: Dynamical Systems Theory founded by Poincare
- 1930: Morphogenetic Field introduced by Rashevsky
- 1942: Cybernetics created by Norbert Wiener
- 1942: Digital Neural Networks by McCulloch and Pitts
- 1945: Cellular Automaton created by John von Neumann
- 1950: General Systems Theory created by Von Bertalanffy
- 1950: System Dynamics founded by Jay Forrester
- 1952: Morphogenesis founded by Alan Turing
- 1955: Dissipative Structures by Prigogine
- 1962: Genetic Algorithms by John Holland
- 1968: Catastrophe Theory created by Rene Thom
- 1990s: Agent Based Modeling
- 2004: Landscape Dynamics created by Abraham & Friedman

www.visual-chaos.org/complexity/

www.gaianxaos.com/chaos_complexity_pdf_library.htm



An age-old challenge indeed

- Traditional way to tackle with complexity: Construct *hierarchies*, study levels reductionistically one at a time
- Natural approach for humans + also “natural for nature”?
 - Aristotle, Linné: Taxonomies (Systematic but not systemic!)
 - H. Simon (1969): “Architecture of Complex Systems” – *robustness*
 - Correspondingly in large-scale industrial systems: Hierarchical control
- However, fixed hierarchies cannot capture *emergent phenomena* – the essence of complex systems
 - How to define *intelligence*?
 - How to define *life*?
 - How to define *robustness*?
- Something new is needed ...
- Now: **Contemporary approaches to seeing complex systems**

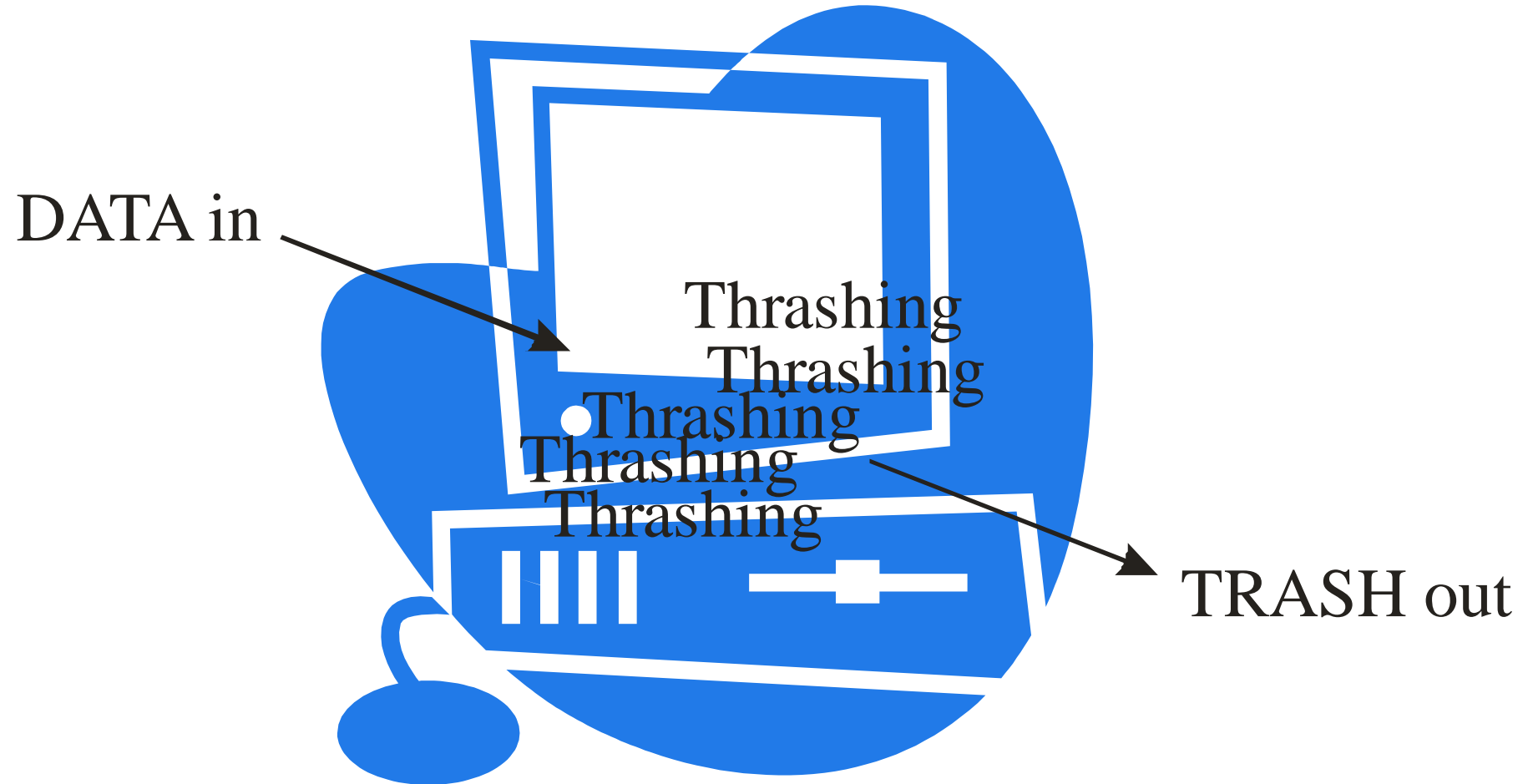


Emergence with Computation?

- Challenge: Complex systems are characterized by *emergent* properties – “the whole is more than the sum of the parts”
- How to master something that by definition defies reductionistic analysis attempts?
- New kind of thinking (“non-Greek”!) is needed ...
- *Computationalism* promises escape from the deadlock?
- Trust in thrust of computing: “In 20 years, computer will be more intelligent than a human”
- But it is not only computing power that is needed; how can computation make non-trivial phenomena emerge?
- Conceptual tools + rigor needed



... Otherwise ...



Background: Chaos “theory”

- ... Would never have been discovered without computer!?
- Observation: Very simple (nonlinear) functions, when iterated, result in very complex-looking forms
- For example, study the simplest possible (?) discrete-time constrained growth model (logistic model):

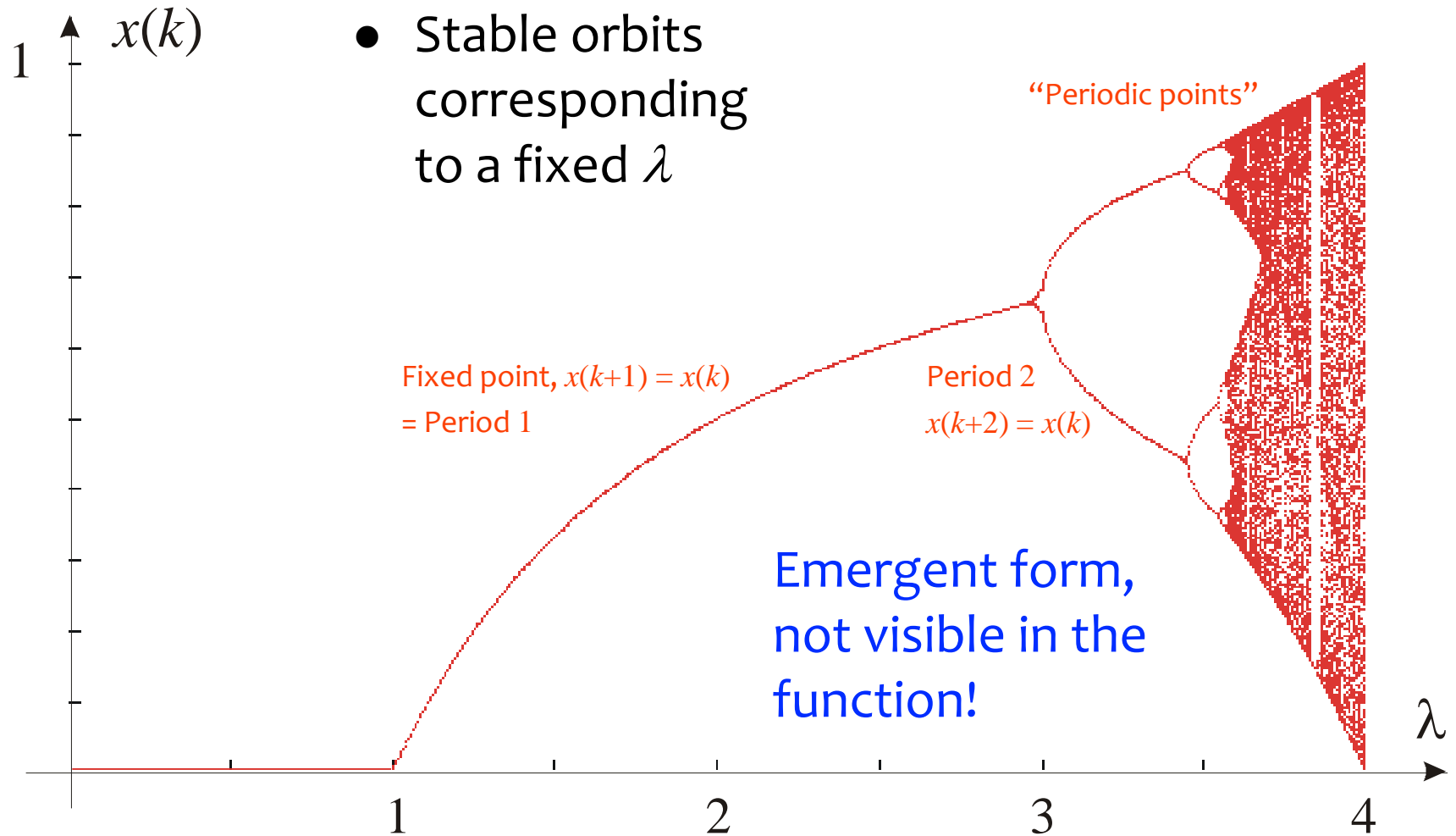
$$\begin{aligned}x(k+1) &= \lambda x(k) \cdot (1 - x(k)) \\ &= \lambda x(k) - \lambda x^2(k).\end{aligned}$$

Power of
feedback
reinvented!

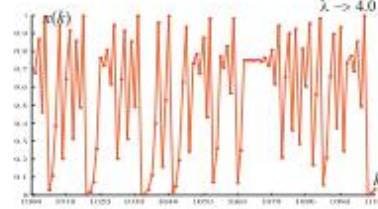
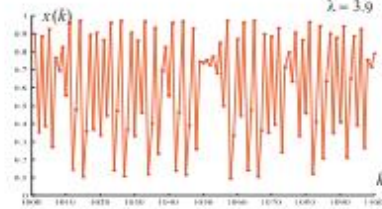
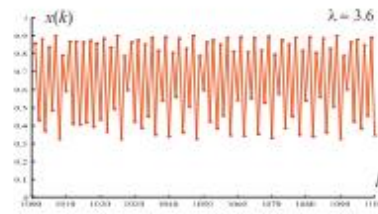
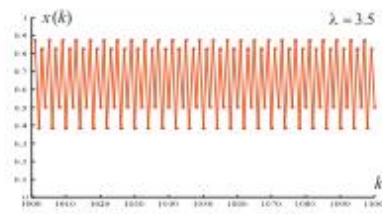
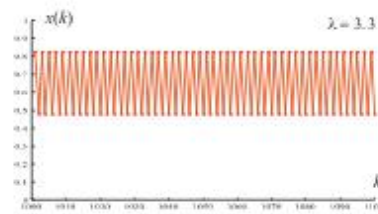
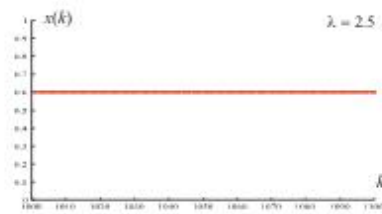
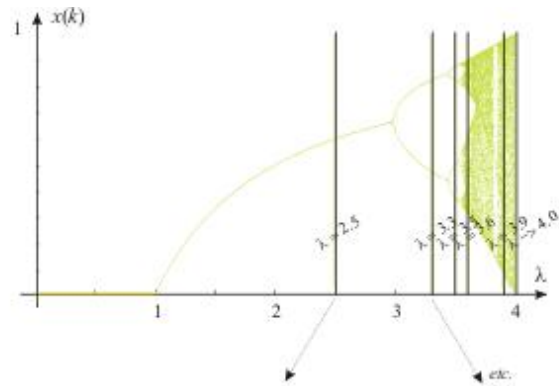
- Linear term: Exponential growth if no constraints
- Quadratic term: Inverse effect if population is too large
- Parameter λ is the *growth factor*



“Bifurcation diagram”



Route to chaos



- For small $\lambda < 1$, extinction
- For $1 < \lambda < 3$, steady state
- After that, *doubling* of the length of the stable orbit
- Orbit lengths 2, 4, 8, 16, ... in order
- After that, also odd cycles; indeed, any cycle found if λ is selected appropriately
- When λ goes towards 4, cycle length goes to infinity = *chaos*



-
- What does this look like in higher dimension?
 - For simplicity, the complex-valued iteration (a “complex complex” system?!) is defined as

$$z(k+1) = z^2(k) + z_0$$

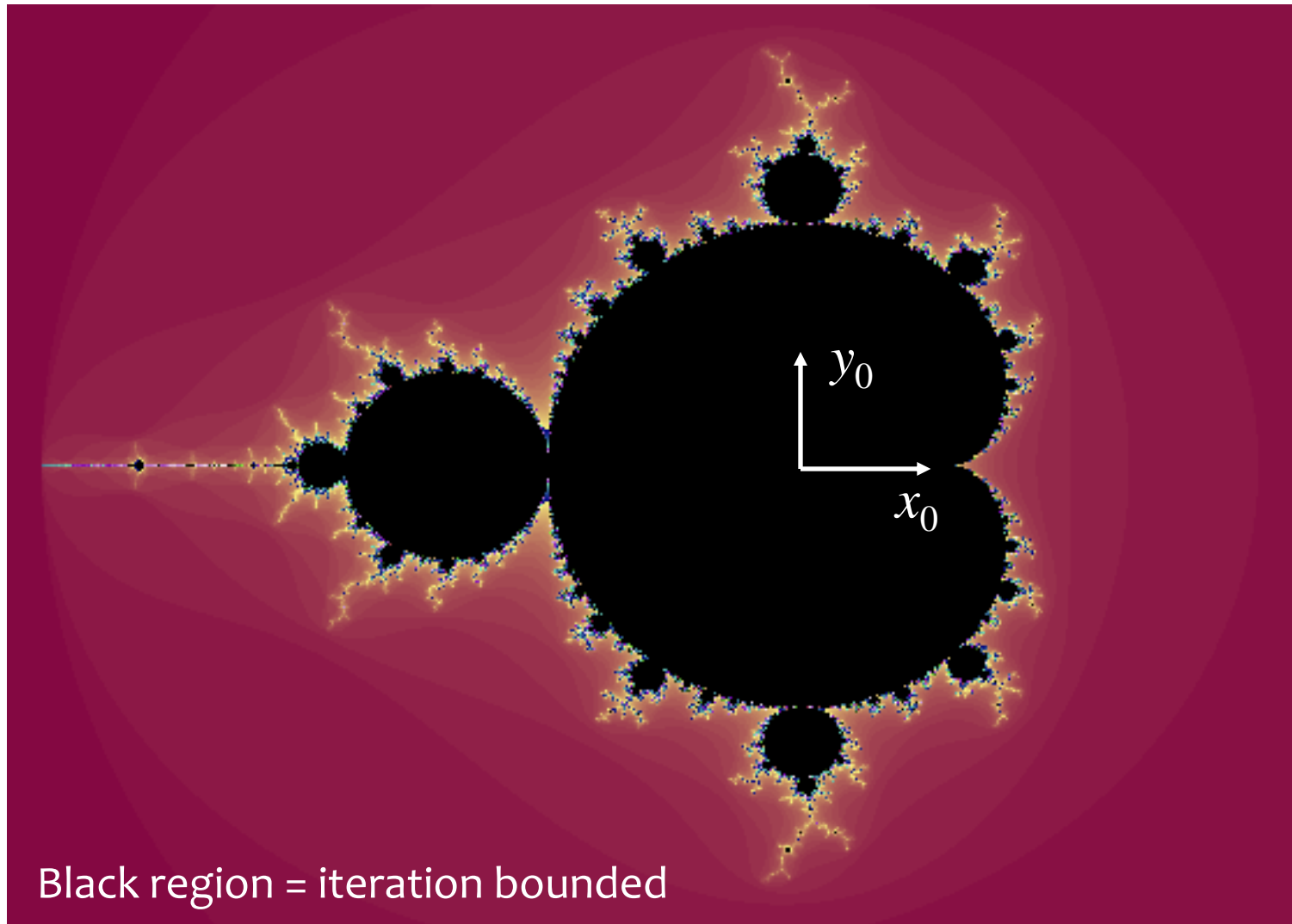
- Using only real variables, this can be written

$$\begin{cases} x(k+1) = x^2(k) - y^2(k) + x_0 \\ y(k+1) = 2x(k)y(k) + y_0. \end{cases}$$

- Assuming that one selects some constants x_0 and y_0 , and starts from $x(0) = y(0) = 0$, what will happen?



“Mandelbrot set”

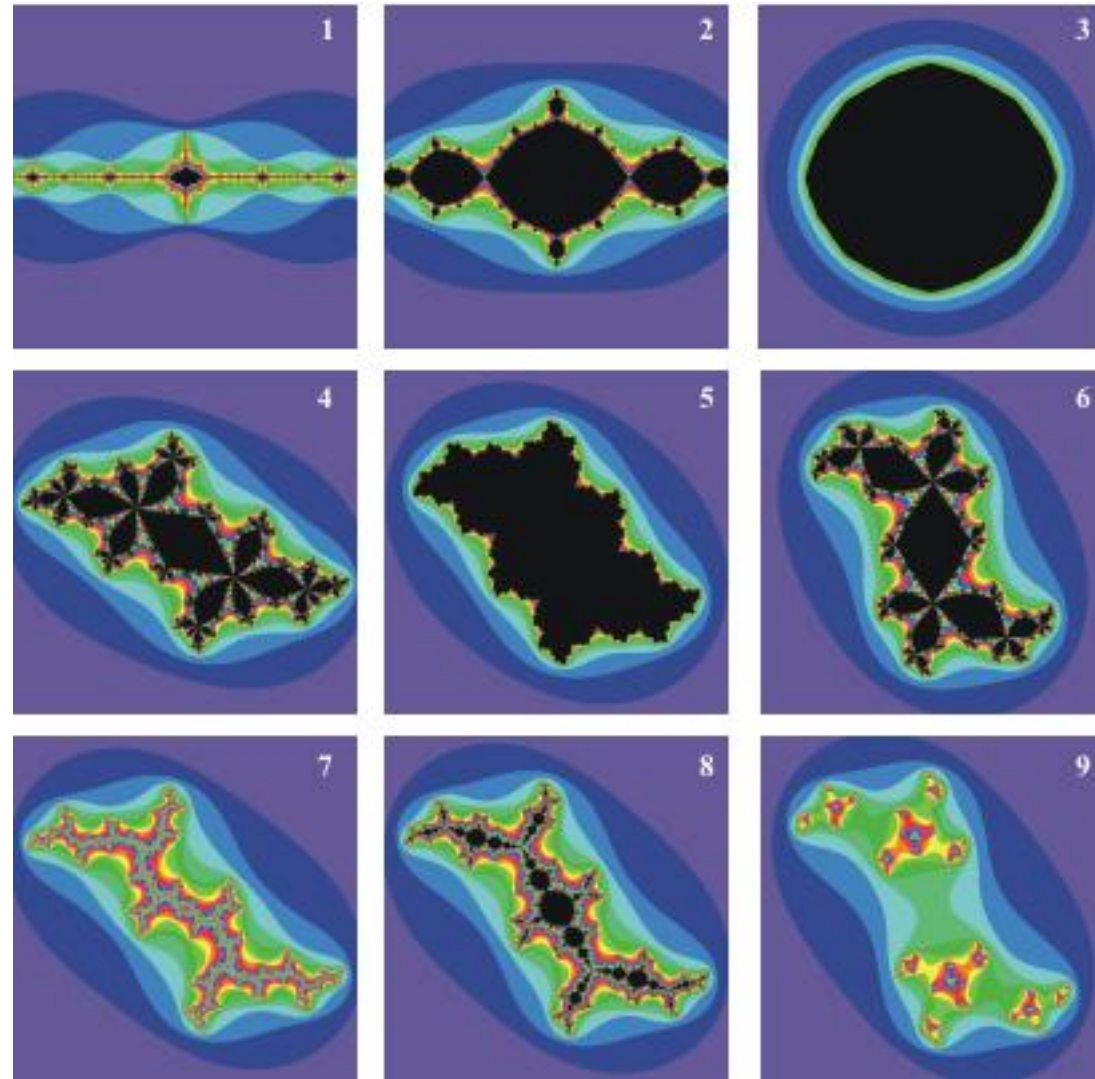
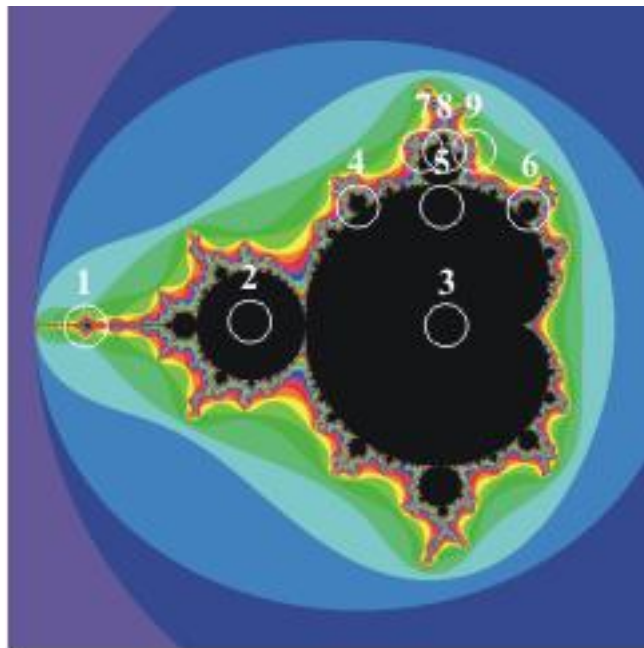


Black region = iteration bounded

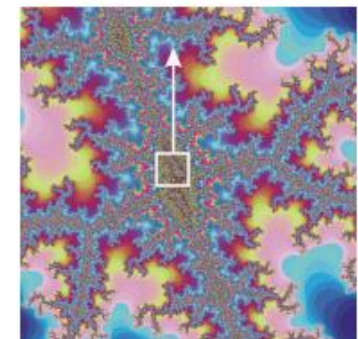
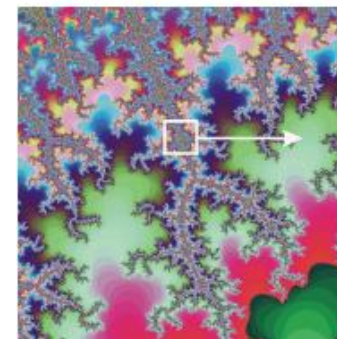
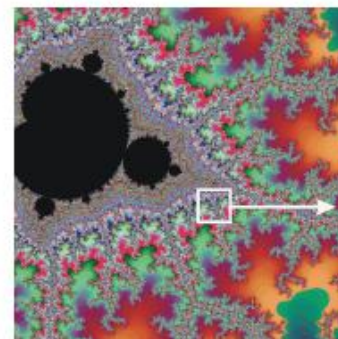
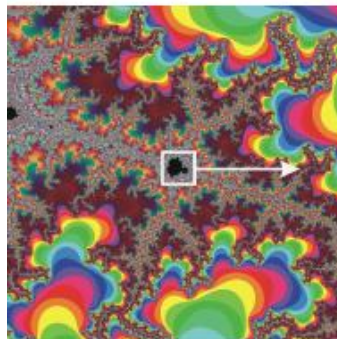
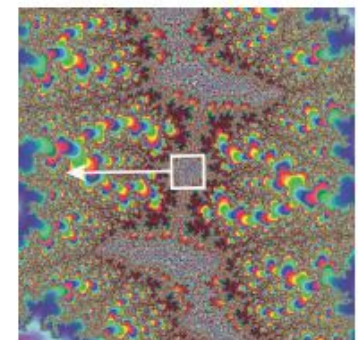
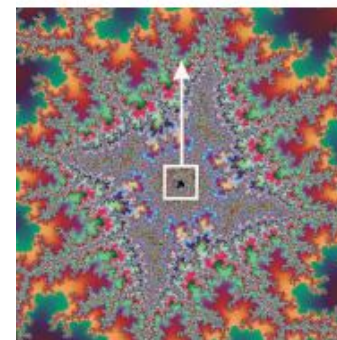
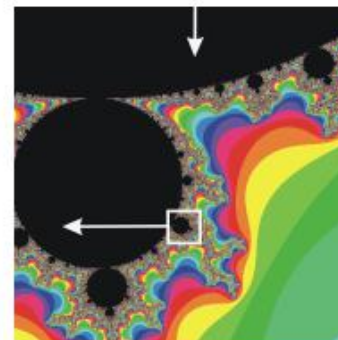
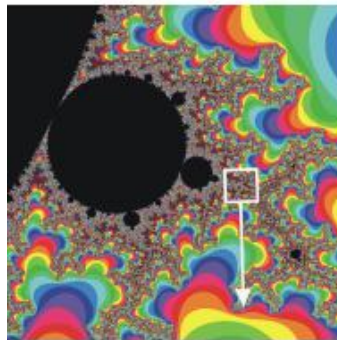
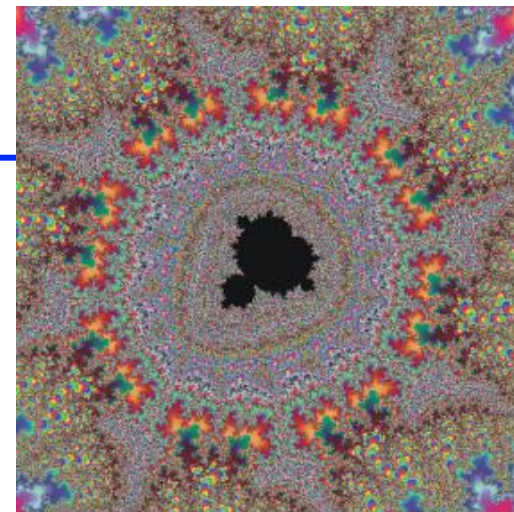
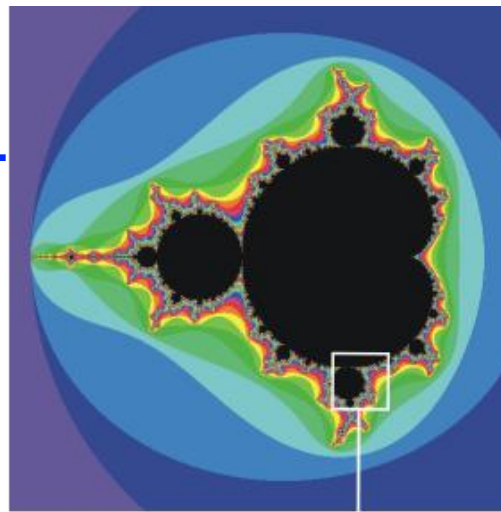


“Julia sets”

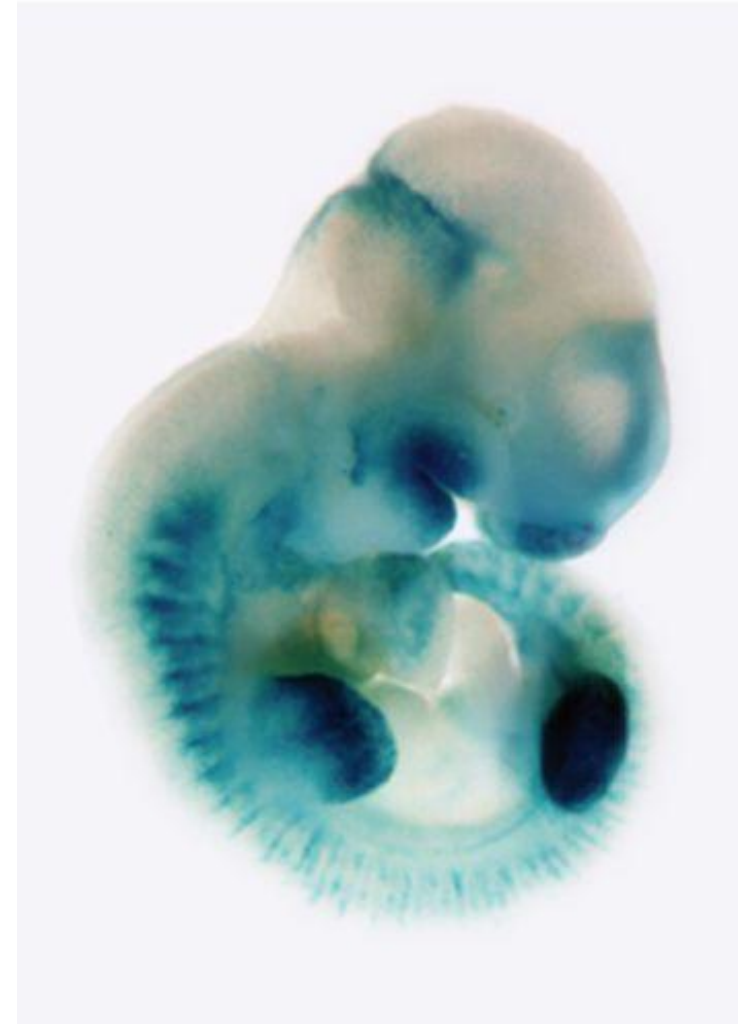
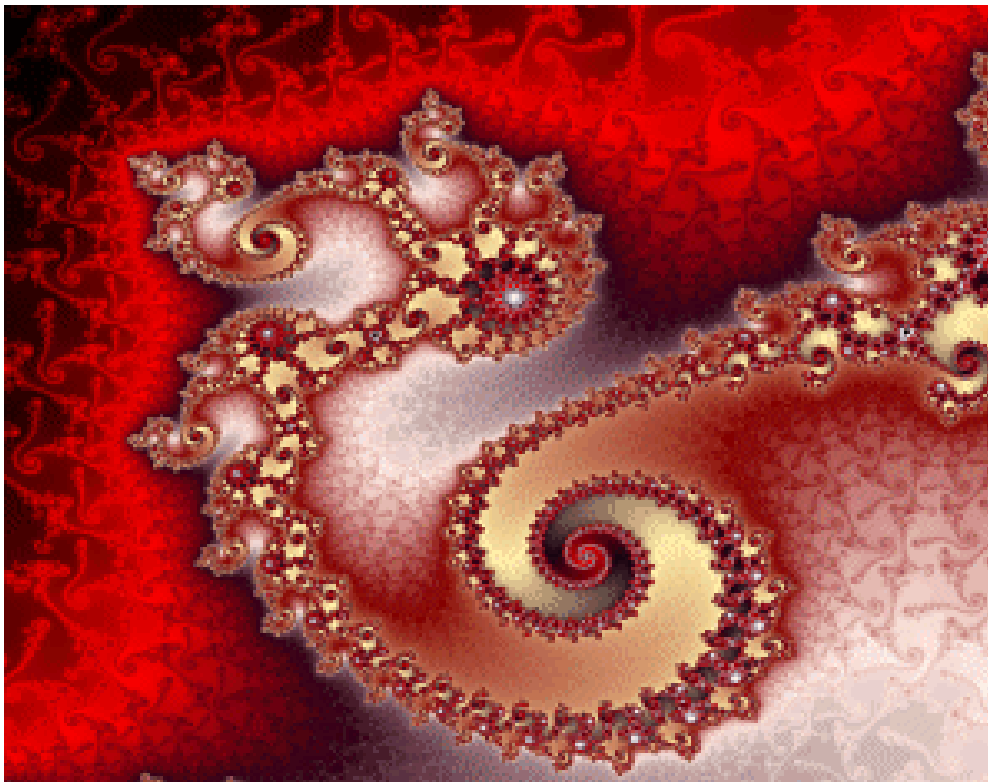
- Orbits for fixed (x_0, y_0)
– as shown below –
 $(x(k), y(k))$ shown in
black on the right



- Concepts:
Fractality and self-similarity



-
- Now it seems we are touching the essence of complex systems!?



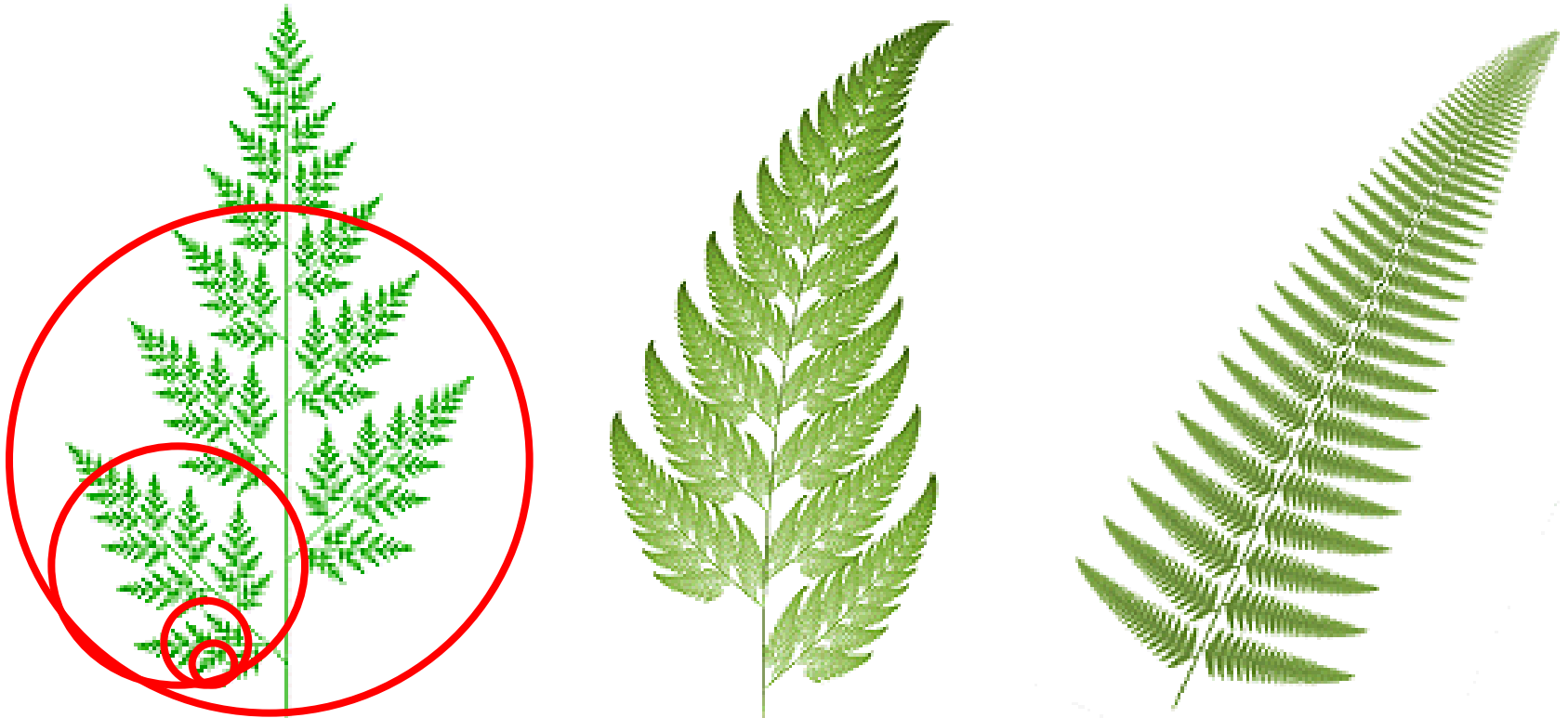
Dilemma: “Butterfly Effect”

- Basic problem in chaos thinking: Chaotic models are highly sensitive to the initial conditions and parameters
... And **there exist more systems than there can exist models!**
- The models cannot then reliably simulate real systems
... Are models of any use? *Specially – data-based models!?*



There are also convergent behaviors

- No matter where you start from, there sometimes emerge interesting self-similar patterns in iterative systems ...



From chaos to complexity theory

- Universality in nonlinear systems: The same behavioral complexity is found in many classes of nonlinearities
- **Assume that Nature is based on such function iterations**
- Stephen Wolfram's Theory of Everything: "Universe can be coded in four lines of Mathematica code"!
- Compare to alchemists and the Philosopher's Stone ... Similarly, one is searching for the fundamental principle
- How could the chaos process be inverted: **How to find the underlying formulas beneath observed patterns?**
- To elaborate on this, solid formulations are needed ...



Result of convergent iterations: *Fractals*

- Fractals = New framework for “data-based hierarchies”
- Similar-looking structures repeat themselves in different scales

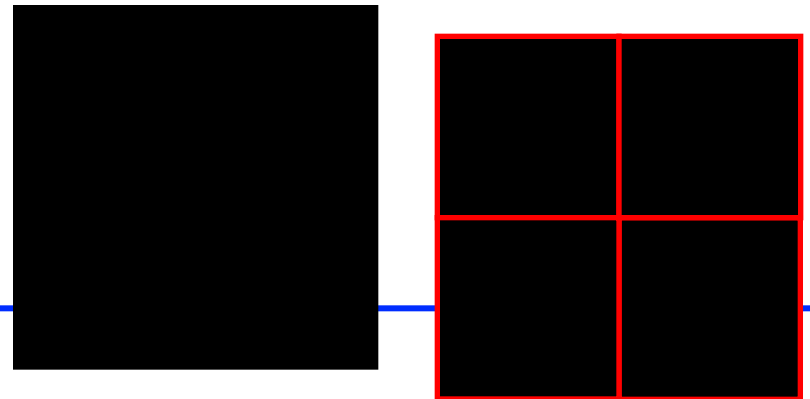
$$\text{fractal dimension } D = \frac{\log(\text{self-similar fractions})}{\log(\text{magnification factor})}$$

- Simple examples:

$$D = \log(3)/\log(3) = 1$$

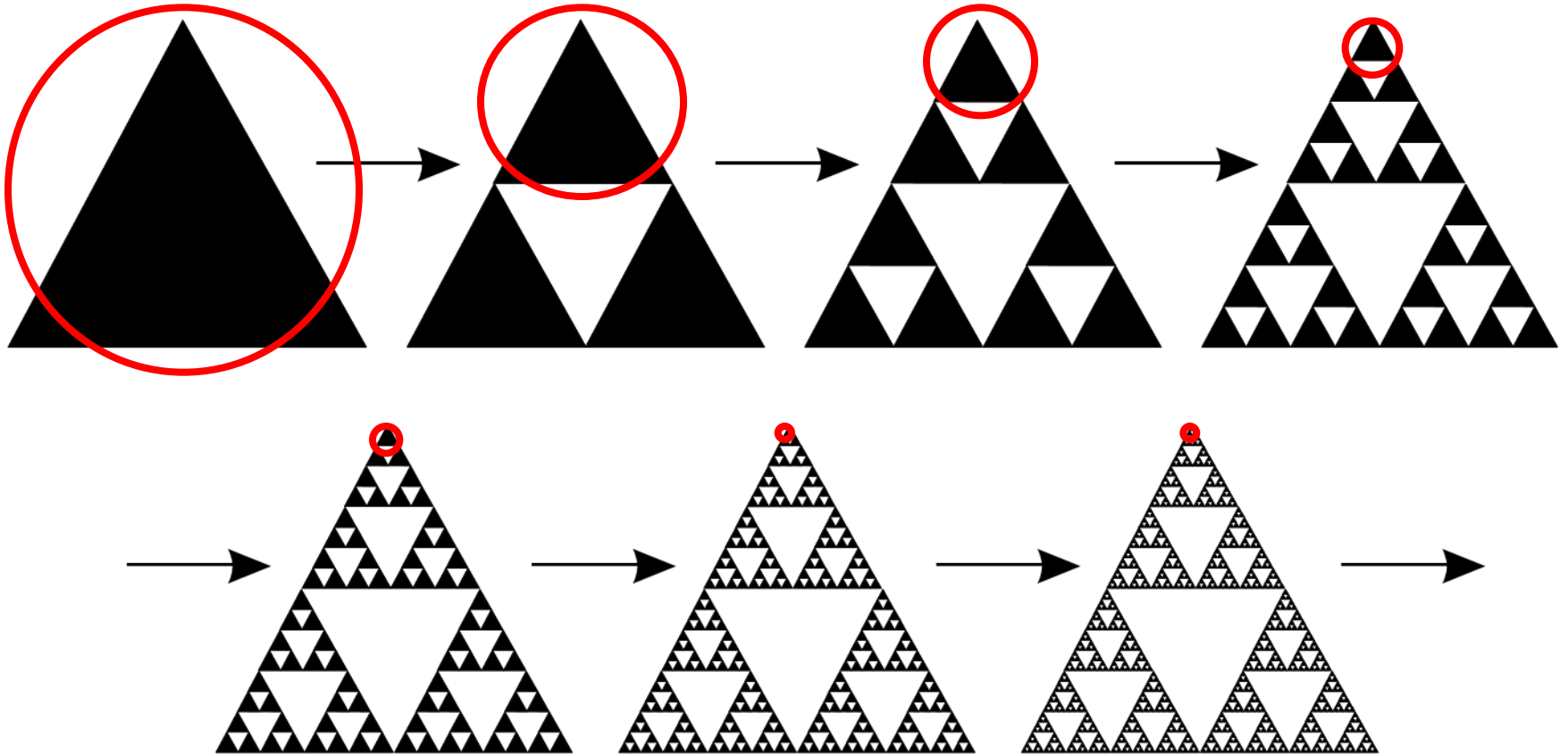


$$D = \log(4)/\log(2) = 2$$



“Sierpinski triangle”

- Dimension $D = \log(3)/\log(2) = 1.585$



“Power law”

- Inverse look at fractality:

$$\log(\text{self-similar fractions}) = D \cdot \log(\text{magnification factor})$$

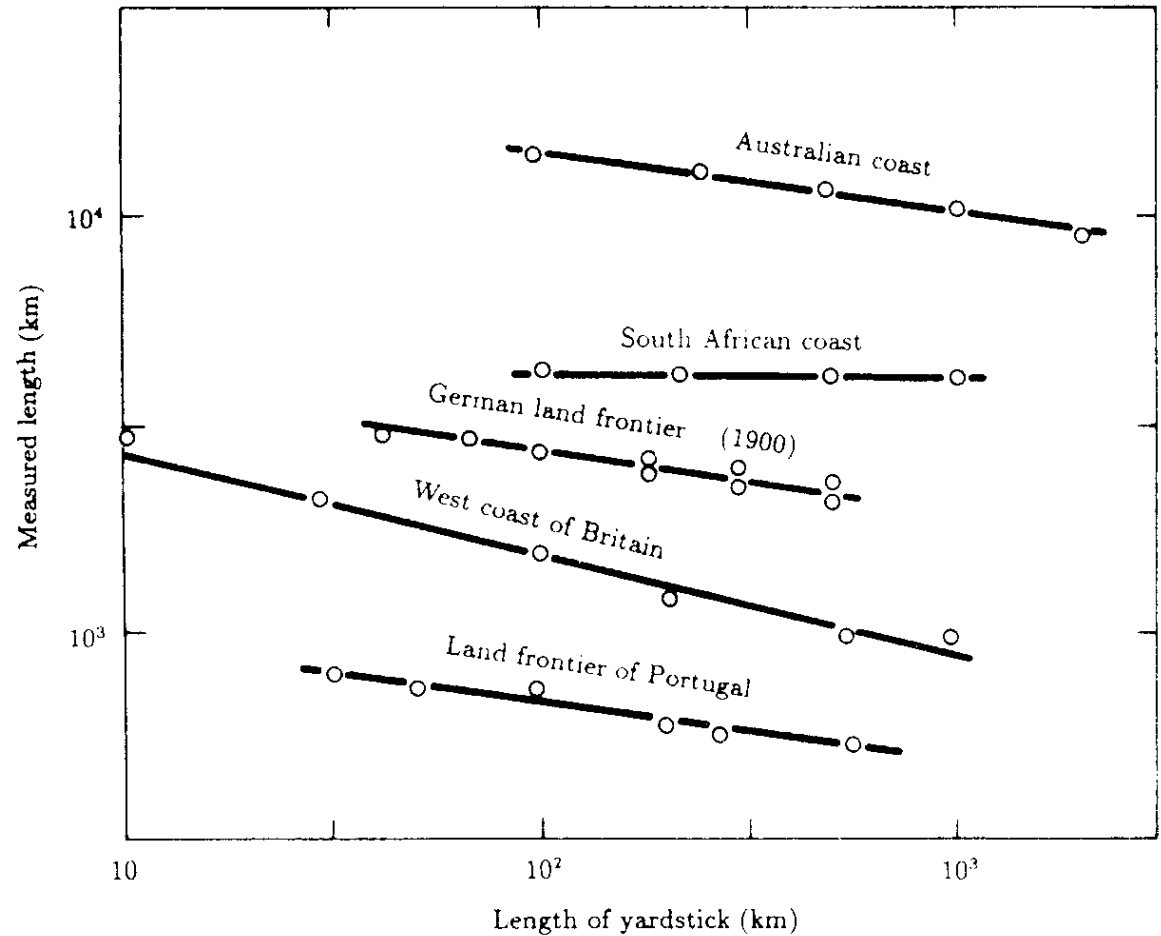
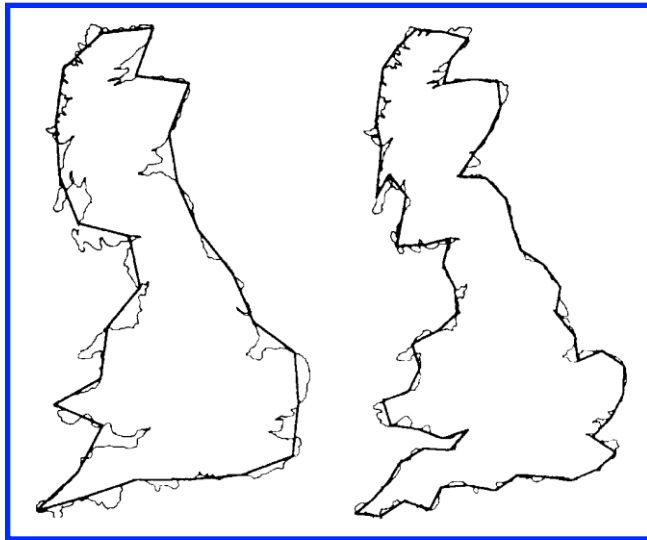
or

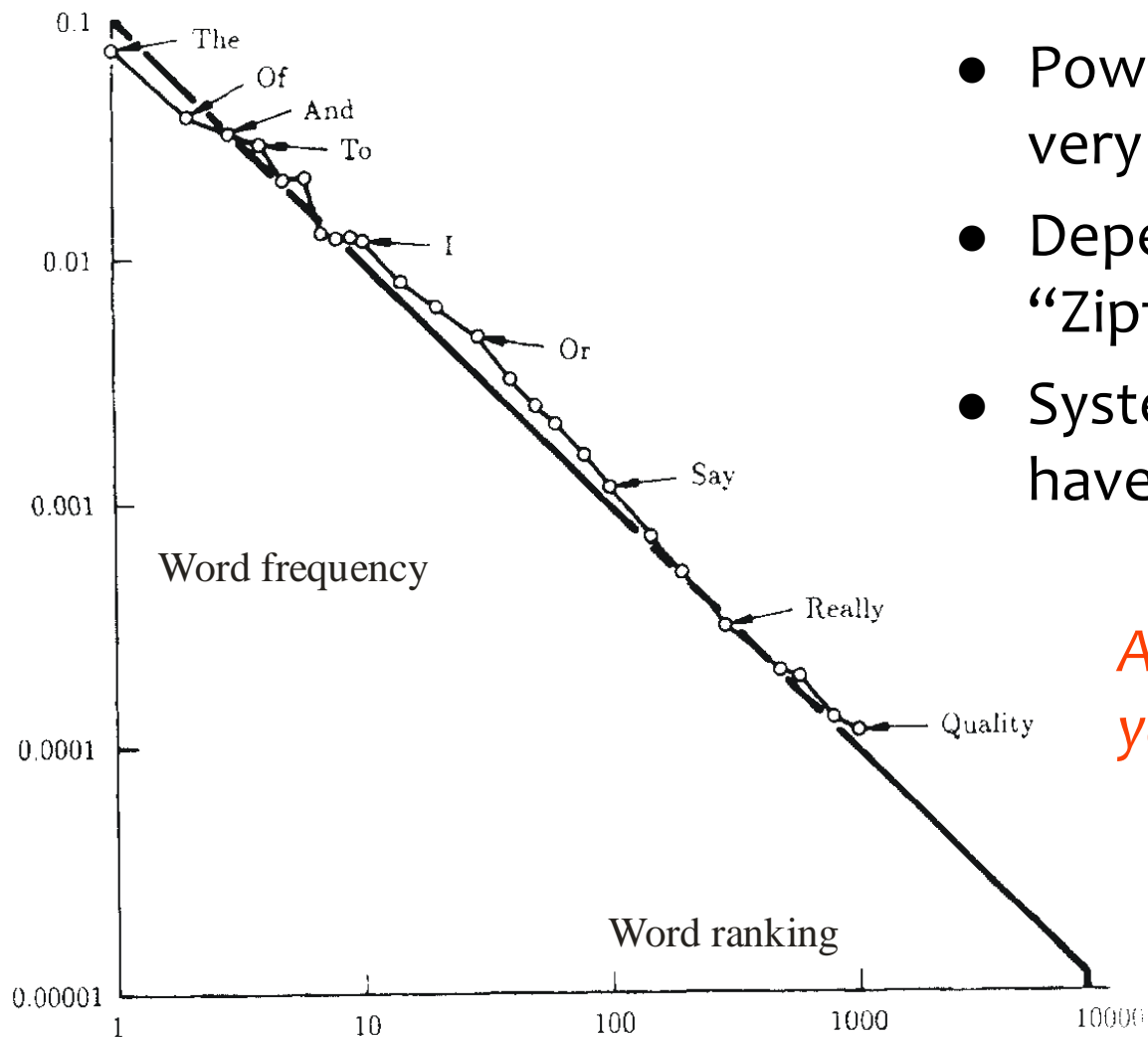
$$\text{self-similar fractions} = (\text{magnification factor})^D$$

- Fractality is manifested as linearity on the log/log scale = *power law*
- Rate of growth/decay = fractal dimension
- Offers a practical way to analyze existing systems
 - and power law is observed in very different environments!



- Natural formations follow power law
- For example, fractalities of coastlines:





- Power law is observed also in very abstract systems
- Dependency known also as “Zipf’s law”
- Systems (for some reason) have been *self-organized*

Applicable to any kind of yardstick + quantity!?



Theories and buzzwords

edge of chaos

scale invariance

phase transitions

critical exponents

inverse-square law

Hausdorff dimension

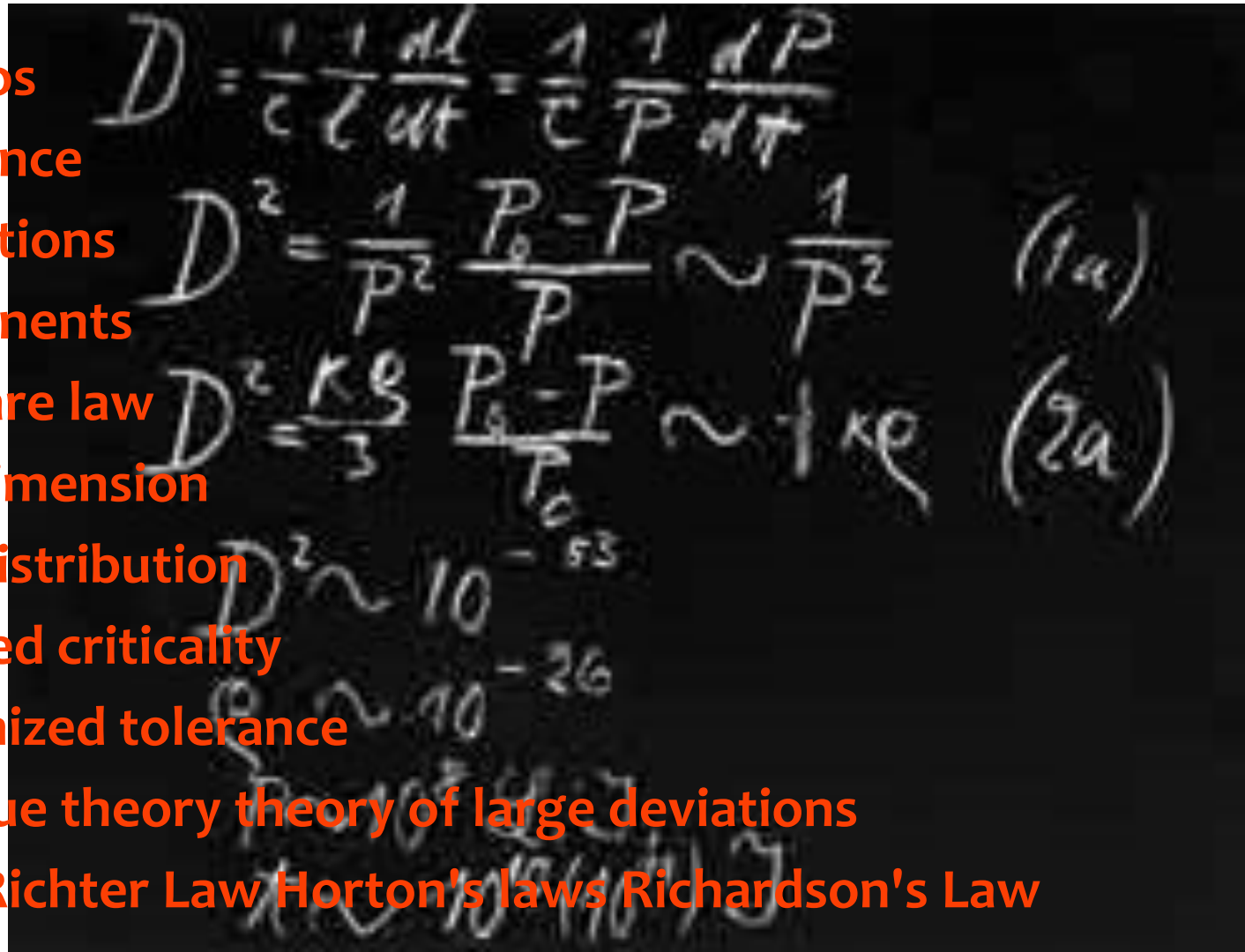
lognormal distribution

self-organized criticality

highly optimized tolerance

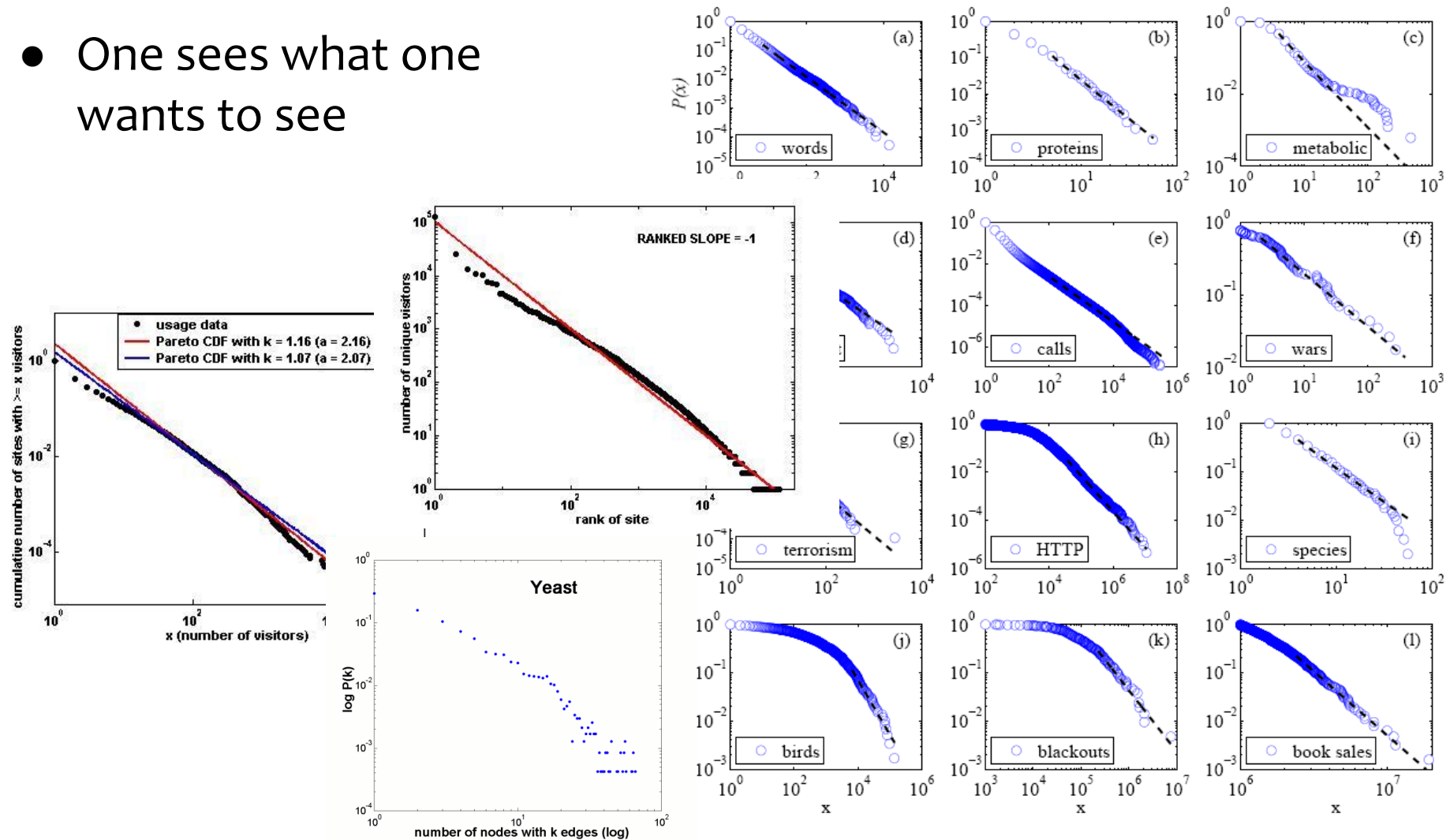
extreme value theory theory of large deviations

Gutenberg-Richter Law Horton's laws Richardson's Law



... However, to be quite honest ...

- One sees what one wants to see



Wikipedia: ... random fractals can be used to describe many highly irregular real-world objects. Other applications of fractals include:

- Classification of histopathology slides in medicine
- Fractal landscape or Coastline complexity
- Enzyme/enzymology (Michaelis-Menten kinetics)
- Generation of new music
- Generation of various art forms
- Signal and image compression
- Seismology
- Fractal in Soil Mechanics
- Computer and video game design, especially computer graphics for organic environments and as part of procedural generation
- Fractography and fracture mechanics
- Fractal antennas — Small size antennas using fractal shapes
- Small angle scattering theory of fractally rough systems
- Neo-hippies t-shirts and other fashion
- Generation of patterns for camouflage, such as MARPAT
- Digital sundial
- Generation of Price Series

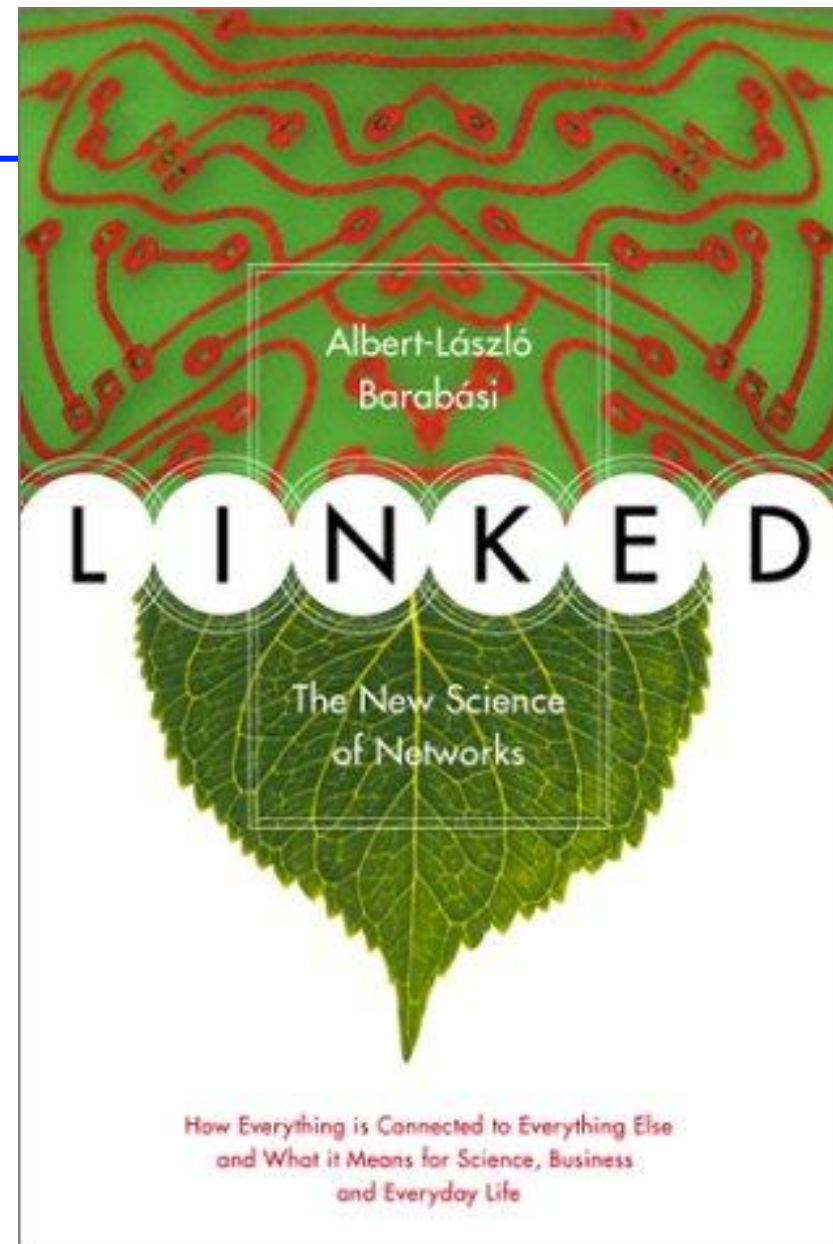


Hmmm ... remember, for example,
that r and F also follow power law!

$$F = \gamma \frac{m_1 m_2}{r^2}$$

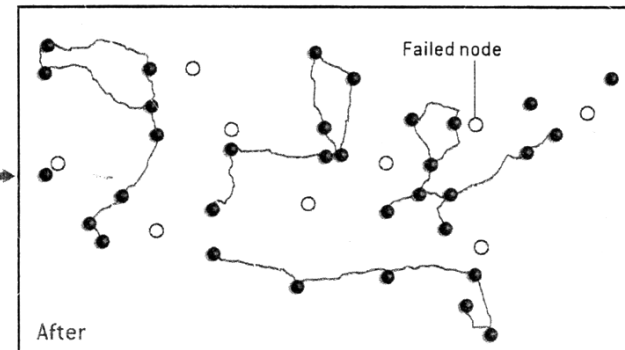
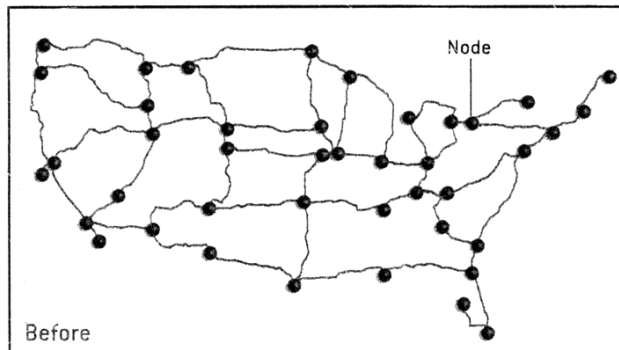
Another starting point

- Albert-László Barabási:
Everything is linked and part
of a network
- Result:
Networks follow power law

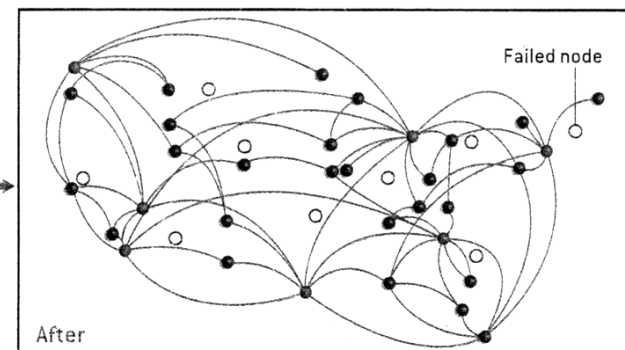
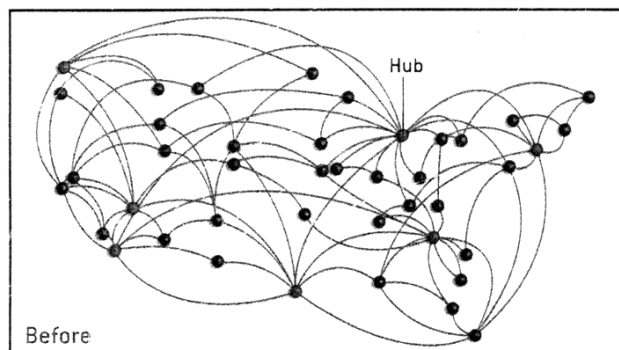


- Motivation for fractal structure: increased robustness

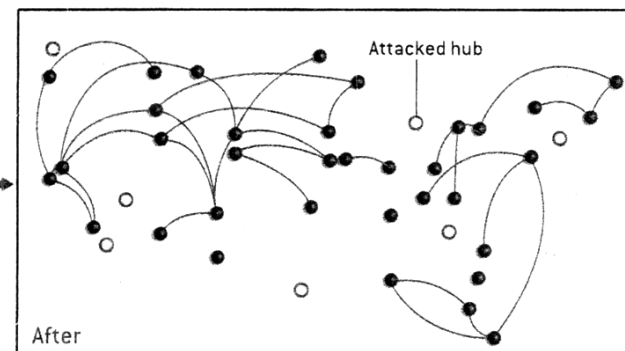
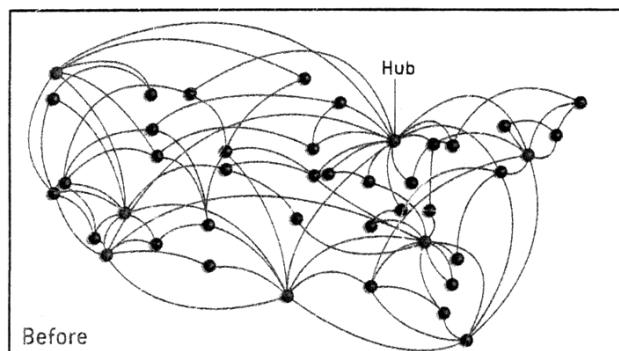
Random Network, Accidental Node Failure



Scale-Free Network, Accidental Node Failure



Scale-Free Network, Attack on Hubs



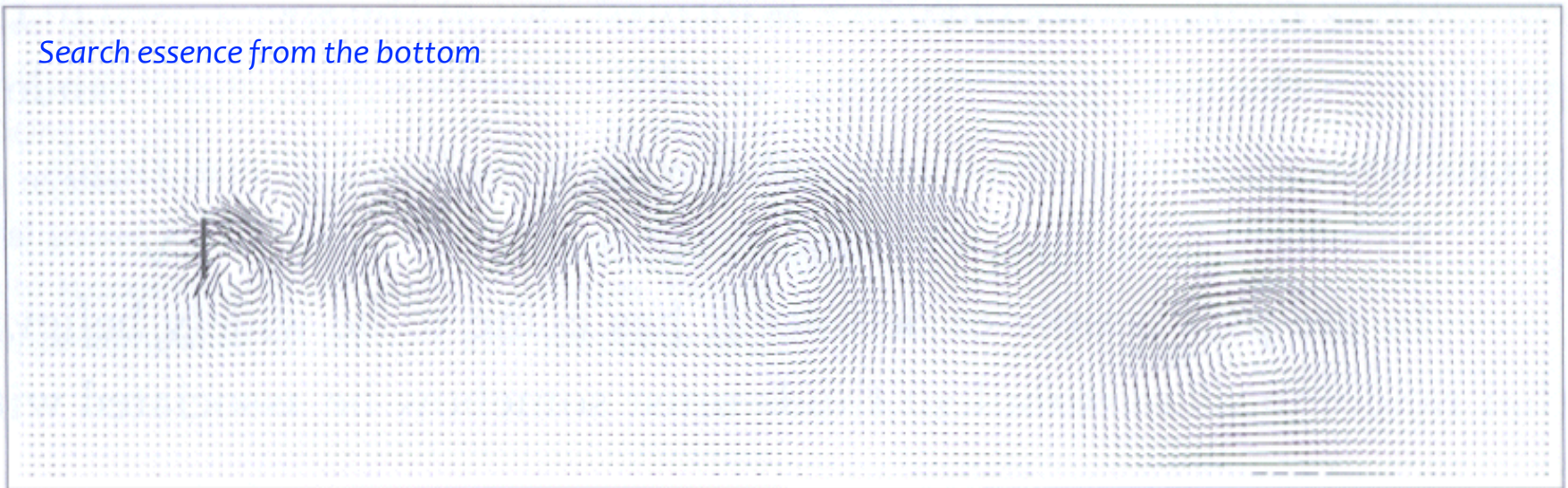
-
- If nature has in its evolutionary optimization processes arrived at fractal designs, why not directly and explicitly imitate the ideas?
 - However, fractal theory is not compatible with the existing control engineering paradigm: Traditions are very different
 - And, after all, there are no ready-to-use tools for control engineering tasks
 - Fractal theory is better for analysis (studying existing structures) than for synthesis (design of new ones)

Are there any other available approaches?



Yet another vision

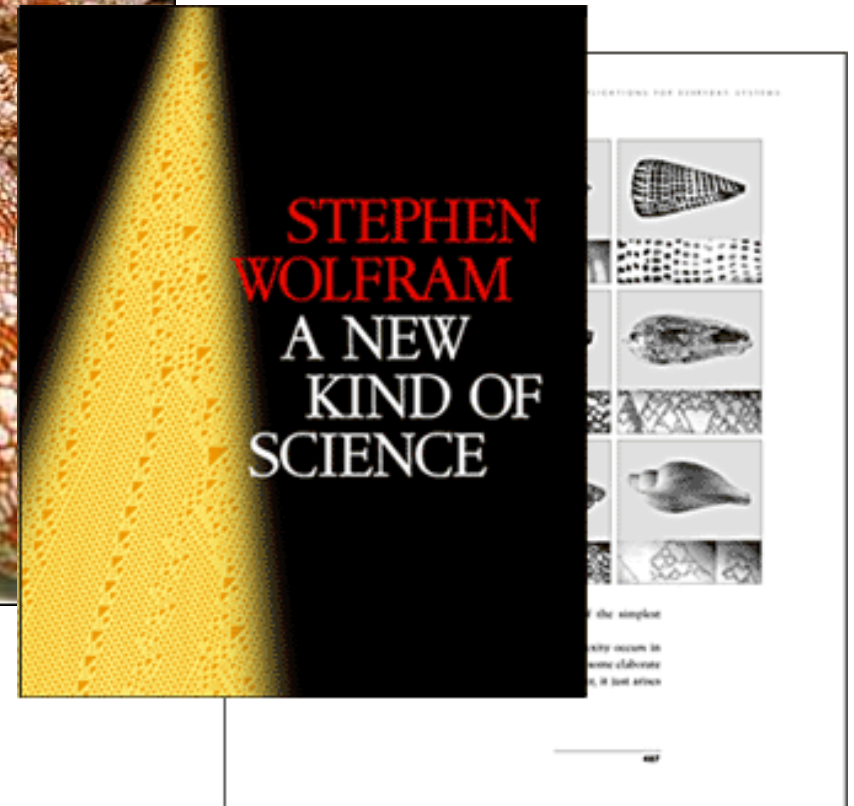
- Other class of approaches – regressing back to simpler levels
 - Kari Enqvist: “Cognition can be explained in terms of elementary particles”
 - Roger Penrose: “Intelligence + free will are quantum-level phenomena”
 - Stephen Wolfram: “Cellular automata can substitute explicit formulas”



- Of course, phenomena ARE implemented by low-level agents
-



The Ultimate Theory?

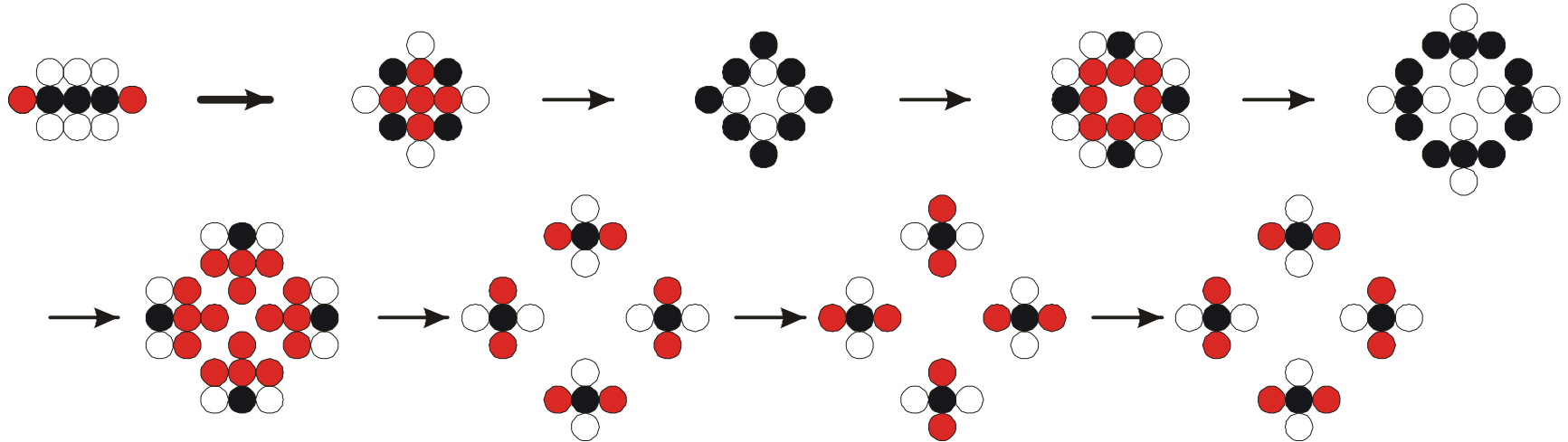


- Hot in 2002!
Not in 2009?



... Too much power!

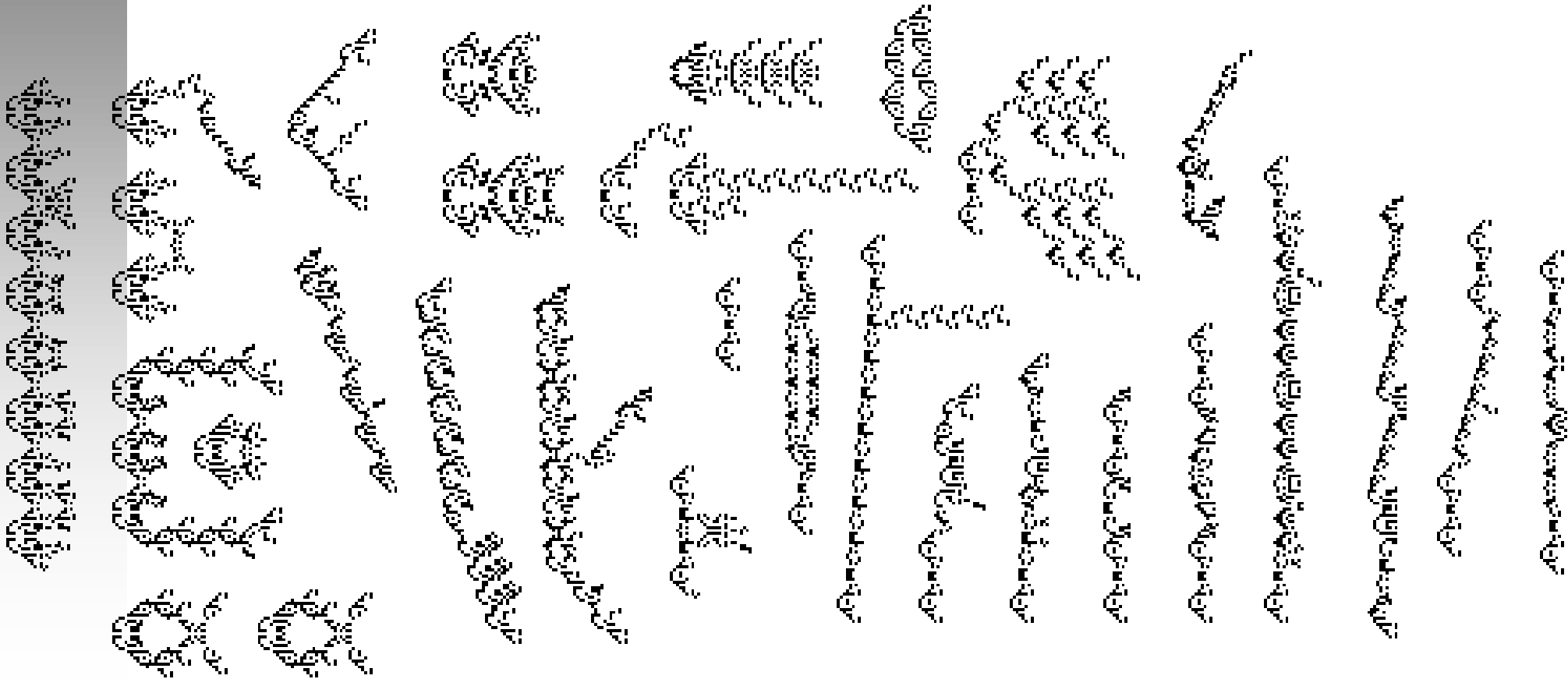
- Wolfram's starting point: Cellular Automata models ...
- ... resulting in a “universal machine” – being unanalyzable!
- Perhaps the simplest interpretation is that the selected model structure is too strong, but Wolfram concludes that ...
- ... this is not only a new theory but a New Science!



John Conway's "Game of Life"

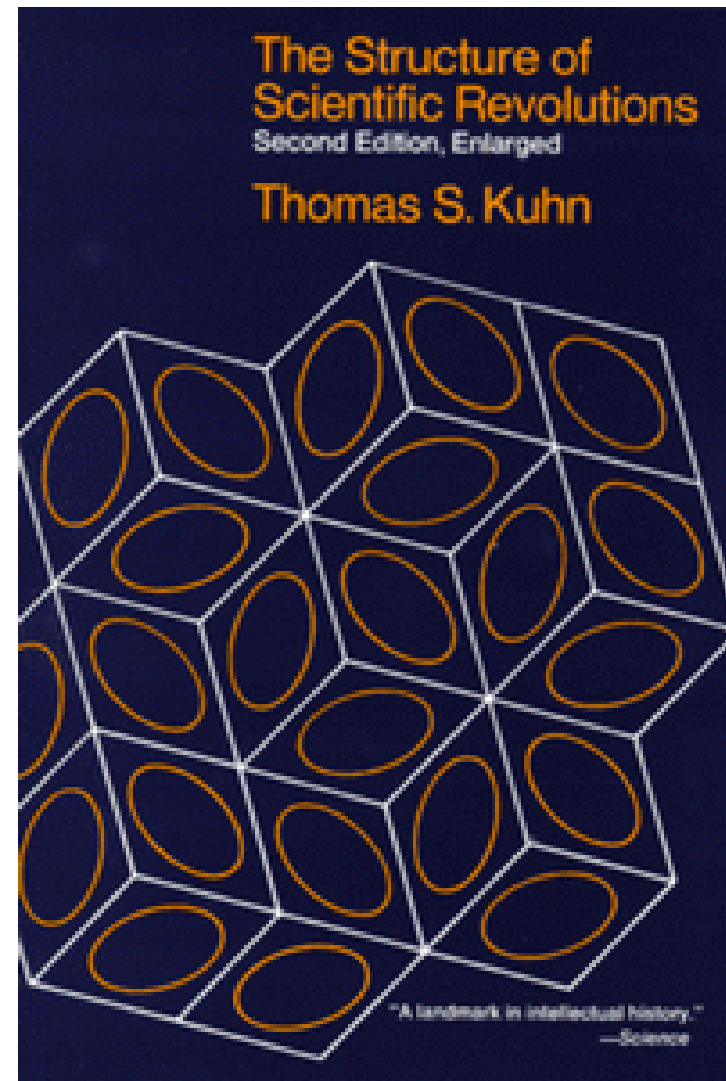


Patterns in the “Game of Life”

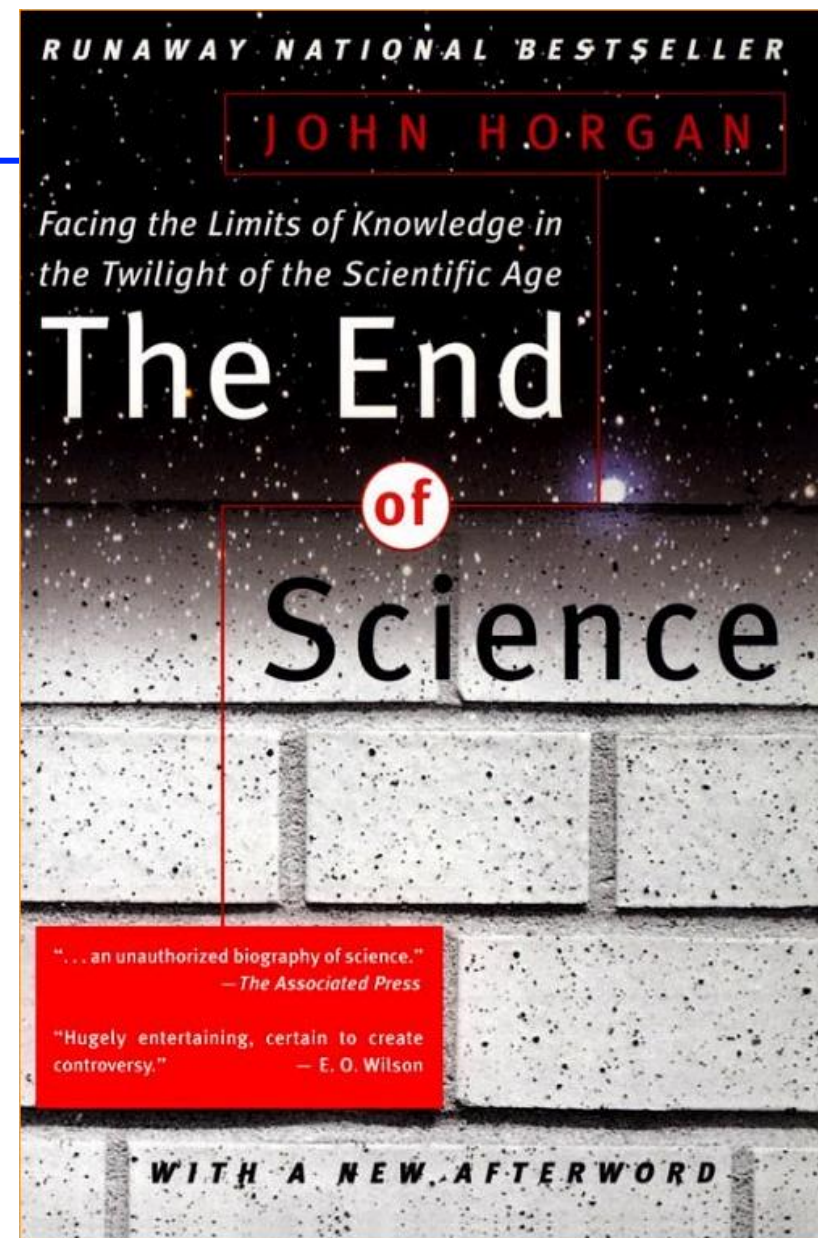


“A New Kind of Science” ...?

- Science on science (Kuhn): *Normal science* fills in the holes in theories
- A *revolution* takes place when the *antitheses* against the old theory cumulate, and a *synthesis* is found, resulting in a *new paradigm*
- All paradigm shifts this far have happened within the framework of “old science”
- What would the “new science” *mean* in the first place?



- Chaoplexity – “ironic science”:
 - Unsubstantiated promises
 - Buzzwords, fashions, gurus, ...
- Fuzz around the hot topics has affected traditional schools too
- Applies also to “hard” sciences
 - Physics becoming *metaphysics*
 - Cosmology being based on wild hypotheses (wormholes, multiverses, etc.)
- Counterattack of “old science” – cybernetic turmoil taking place today!



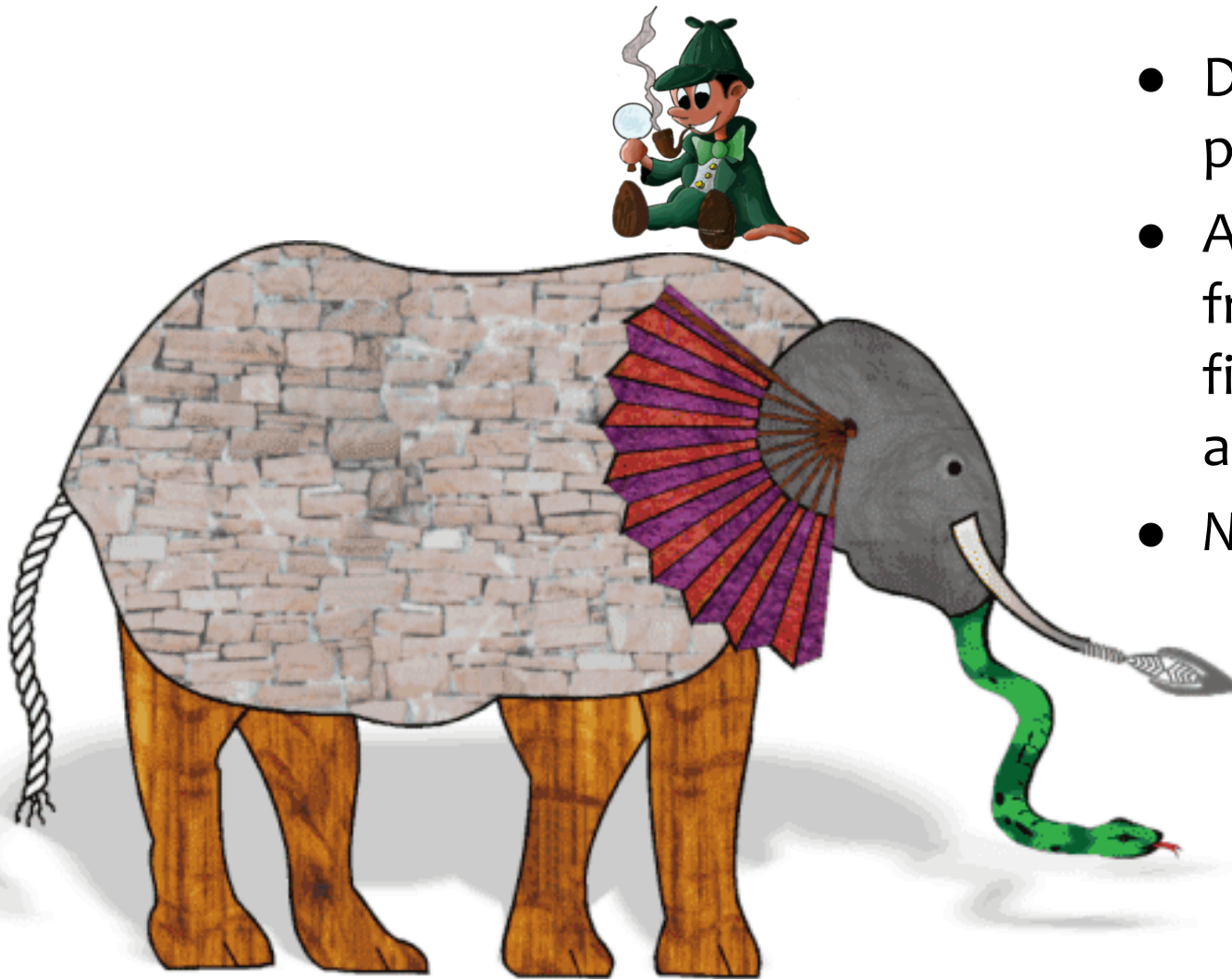
About intuition

- Richard Feynman: You must not try to understand world, “You just have to trust formulas!”
- However, here, when studying systems in general, contrary to Feynman, it is assumed that *intuition is a resource*
- Modeling is about putting one’s understanding into concise (mathematical) form
- Now: Try to stay on the “edge of chaos” between scientific method and chaoplexity intuitions
- When facing complex systems, intuition is the *only* resource there is when trying to capture the true essence

Problem: Everybody has his/her own intuition



... What is this system?



- Depends on the point of view
- A consistent framework and fixed concepts are needed
- *Next lesson ...*



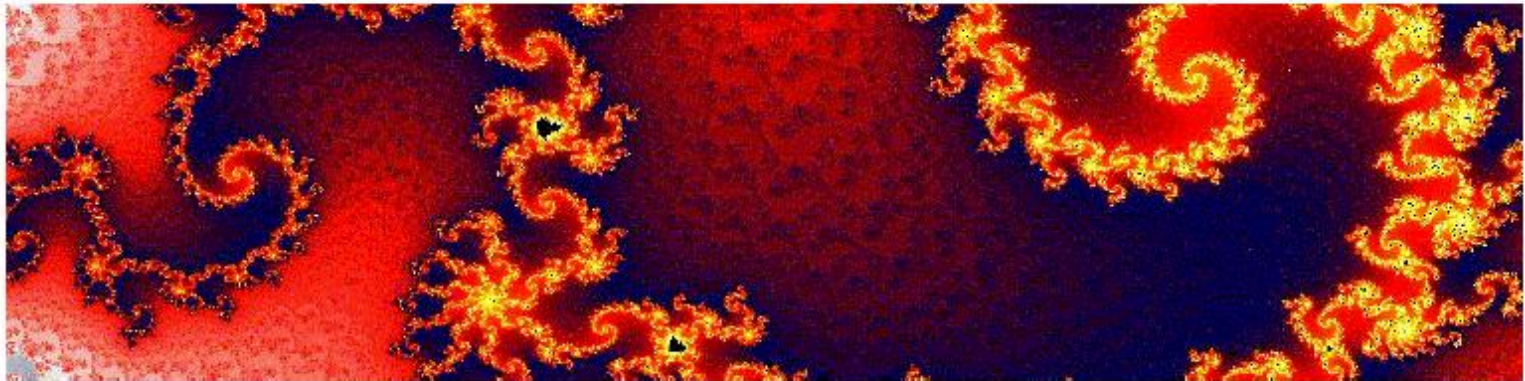
Report 145

- More material on the topics in complex systems research

COMPLEX SYSTEMS: SCIENCE AT THE EDGE OF CHAOS

Collected papers of the Spring 2003 postgraduate seminar

Heikki Hyötyniemi (ed.)



Chaos Concluded

- There are some lasting results reached in chaos theory.
- Perhaps one of them is the *universality of bifurcation behavior* (as studied by M. Feigenbaum)
- Another such result is surely *Sharkovskii's theorem*:

Suppose that f is a real-valued continuous function. We are interested in the possible periods of f . Consider the following ordering of the positive integers:

$$3, 5, 7, 9, \dots, 2 \cdot 3, 2 \cdot 5, 2 \cdot 7, \dots, 2^2 \cdot 3, 2^2 \cdot 5, \dots, 2^4, 2^3, 2^2, 2, 1.$$

That is, start with the odd numbers in increasing order, then 2 times the odds, 4 times the odds, etc., and at the end put the powers of two in decreasing order.

Sarkovskii's theorem states that if f has a periodic point of period m and $m \leq n$ in the above ordering, then f has also a periodic point of period n .

- This fact implies the famous observation that “**period three implies chaos**”.



Example

- Define the continuous mapping f as

$$x(k+1) = f(x(k)) = \begin{cases} 1+x(k), & \text{when } x < 0 \\ 1-2x(k), & \text{when } x \geq 0 \end{cases}$$

- This mapping has period three because

$$f(f(f(1))) = f(f(-1)) = f(0) = 1$$

Thus, it must have a period of arbitrary length!

- Is it possible to determine such cycles in practice? – In this case, *it is indeed possible*, as shown below.

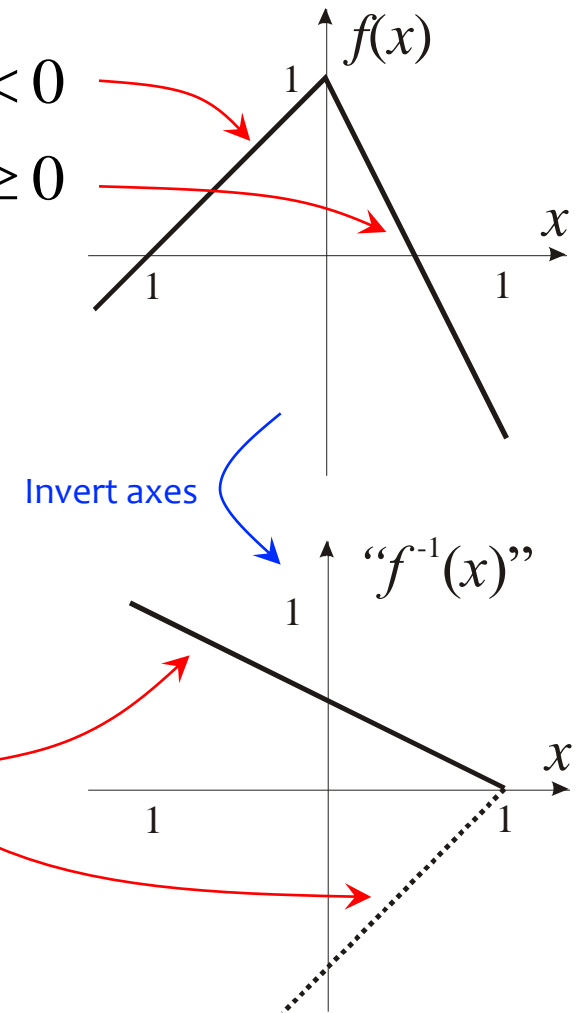


$$x(k+1) = \begin{cases} f_1(x(k)) = 1 + x(k), & \text{when } x < 0 \\ f_2(x(k)) = 1 - 2x(k), & \text{when } x \geq 0 \end{cases}$$

- One is only interested of the periodicity properties here – this means that the same cycle can be studied stepping in the “inverse direction”:

$$x(k-1) = \begin{cases} f_1^{-1}(x(k)) = x(k) - 1 \\ f_2^{-1}(x(k)) = \frac{1}{2}(1 - x(k)) \end{cases} \quad \text{or}$$

Here, *either* of the branches can be selected at a time.



-
- Above, the constraint $x(k) < 1$ remains always valid if the branch 1 is selected only once in succession.
 - For example, a four-step cycle can be found as

$$\begin{aligned}x(k) &= f_2^{-1}\left(f_2^{-1}\left(f_2^{-1}\left(f_1^{-1}(x(k))\right)\right)\right) \\ &= \frac{1}{2}\left(1 - \frac{1}{2}\left(1 - \frac{1}{2}(1 - x(k) + 1)\right)\right) \\ &= \frac{1}{2} - \frac{1}{8}x(k)\end{aligned}$$

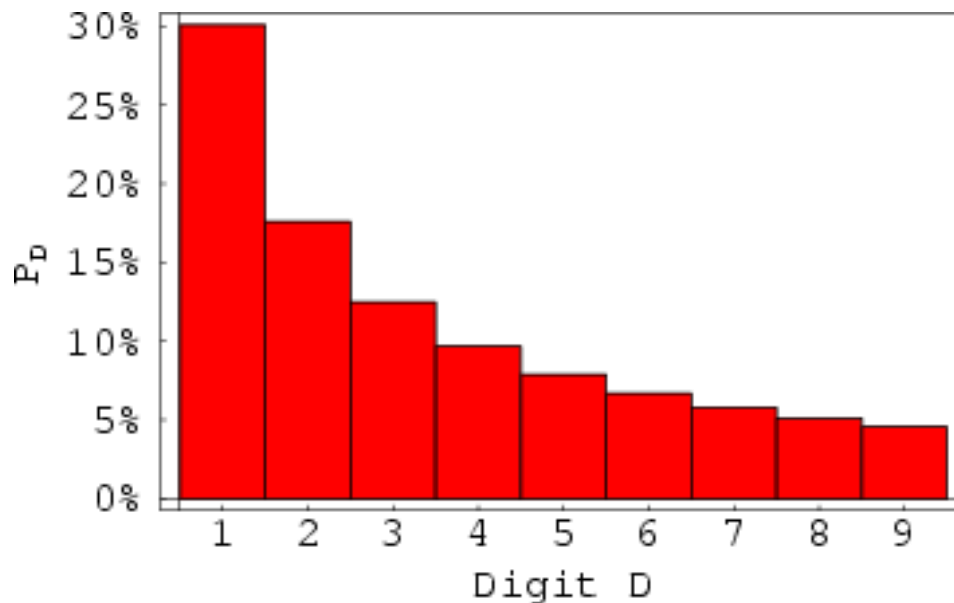
giving the solution $x(k) = 4/9$. *Test it!*

- **Because of piecewise linearity, any cycle length analyzable!**



Bonus: “Benford law”

- Result of scale invariance:
The first digit in a real-life number is 1 more probably than some other



FUNDAMENTAL PHYSICAL CONSTANTS

- [Version of this page using math mode](#) (you need a browser such as *Arena!*)
- [PostScript Version](#)

(without warranty)

Planck constant h

$$6.6260755 \cdot 10^{-34} \text{ J}\cdot\text{s}$$

$$h / (2 \pi) = 1.05457266 \cdot 10^{-34} \text{ J}\cdot\text{s}$$

Boltzmann constant k_B

$$1.380658 \cdot 10^{-23} \text{ J/K} \quad (= 8.617385 \cdot 10^{-5} \text{ eV/K})$$

Elementary charge e

$$1.60217733 \cdot 10^{-19} \text{ C}$$

Avogadro number N_A

$$6.0221367 \cdot 10^{23} \text{ particles/mol}$$

Speed of light c

$$2.99792458 \cdot 10^8 \text{ m/s}$$

Permeability of vacuum μ_0

$$\mu_0 = 4 \pi \cdot 10^{-7} \text{ T}^2\cdot\text{m}^3/\text{J}$$

$$12.566370614 \cdot 10^{-7} \text{ T}^2\cdot\text{m}^3/\text{J}$$

Permittivity of vacuum ϵ_0

$$\epsilon_0 = 1 / (\mu_0 c^2)$$

$$8.854187817 \cdot 10^{-12} \text{ C}^2/\text{J}\cdot\text{m}$$

Fine structure constant α

$$1 / 137.0359895$$

Electron rest mass m_e

$$9.1093897 \cdot 10^{-31} \text{ kg}$$

Proton rest mass m_p

$$1.6726231 \cdot 10^{-27} \text{ kg}$$

Neutron rest mass m_n

$$1.6749286 \cdot 10^{-27} \text{ kg}$$

Bohr magneton μ_B

$$\mu_B = e h / (4 \pi m_e)$$

$$9.2740154 \cdot 10^{-24} \text{ J/T}$$

Nuclear magneton μ_N

$$\mu_N = e h / (4 \pi m_p)$$

$$5.0507866 \cdot 10^{-27} \text{ J/T}$$

Free electron g factor g_e

$$2.002319304386$$