

# Computer Organization

## Mihai Udrescu

@MihaiUdrescu



mudrescu@gmail.com



# About me

- Computer Architecture and Design
  - Arithmetic devices
  - Cache memory design
  - Hardware description languages (HDL) and FPGA design
  - Evolvable hardware
  - Crypto-chip design for testability
  - Reliability assessment
- Physics of computation
  - Quantum computers and quantum circuit design
  - Quantum algorithms
  - Quantum computer simulation
  - Genetic algorithms in QC

# About me

- Network science and science of complexity
  - Social networks
  - Network medicine, network pharmacology, systems biology
  - Cyber-physical systems
- Publications (journals)
  - Nature Scientific Reports
  - PLoS One
  - PeerJ Computer Science, PeerJ
  - Computer Communications
  - Simulation Modeling Practice and Theory
  - International Journal of Computer Mathematics
  - Microelectronics Reliability
  - ACM Transactions on Emerging Technologies in Computing Systems
  - Pharmaceutics, Irish Journal of Medicine, Chest, ERS Journal

# About me

- Review activity
  - IEEE Transactions on Computers
  - IEEE Transactions on Computer-Aided Design of Integrated Circuits and Systems
  - IEEE Transactions on Evolutionary Computation
  - IEEE Transactions on Computational Social Science
  - ACM Transactions on Embedded Computing Systems
  - Microelectronics Journal
  - Nature Scientific Reports
- Conference committees
  - ACM/IEEE International Conference on Hardware/Software Codesign and System Synthesis (CODES+ISSS)
  - IEEE Congress on Evolutionary Computation
  - IEEE International Conference on Computer and Information Technology
  - IEEE International Symposium on Design & Diagnostics of Electronic Circuits & Systems

# About me

- Invited researcher
  - Electrical and Computer Engineering Department – Carnegie Mellon University (2011)
- Fulbright Scholar
  - Electrical and Computer Engineering Department – Carnegie Mellon University (2019-2020)
- Invited Speaker
  - Viterbi School of Engineering, Center for Cyber-Physical Systems and the Internet of Things, University of Southern California (2020)
- Research grants
  - ACM – Association for Computing Machinery
  - ERS – European Respiratory Society
  - Linde Healthcare
  - CNCSIS, UEFICSDI

# The computing realm

- ACM/IEEE Curricula
  - Computer Science
    - Using science (math, physics, statistics) to describe the behavior of computer systems
  - Computer Engineering
    - Basic hardware-software, embedded systems, operating systems: lower-level computation issues
    - Computer science + electrical engineering
  - Information Systems
    - Technology-enabled business development
  - Information Technology
    - Managers of computer systems acting as advocates of computing that collaborate with professionals from other fields
  - Software Engineering
    - Techniques and technologies for developing efficient software

# Science vs. Engineering

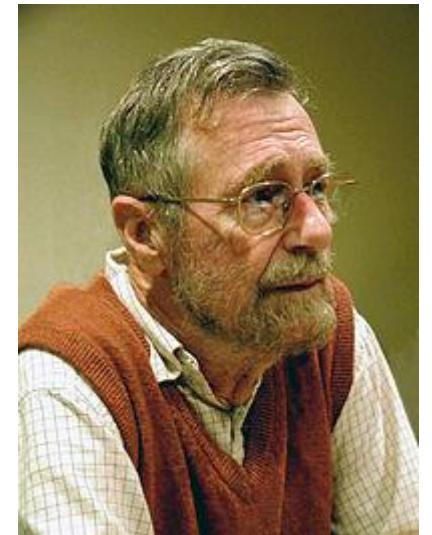
- Richard Feynman

“I don't believe in Computer Science. To me science is the study of the behavior of nature and engineering or applied things is the behavior of things we make.” – Talk at Bell Labs, 1985



- Edsger Dijkstra

“Computer science is no more about computers than astronomy is about telescopes.”



## SHARE

SHARE  
130,258

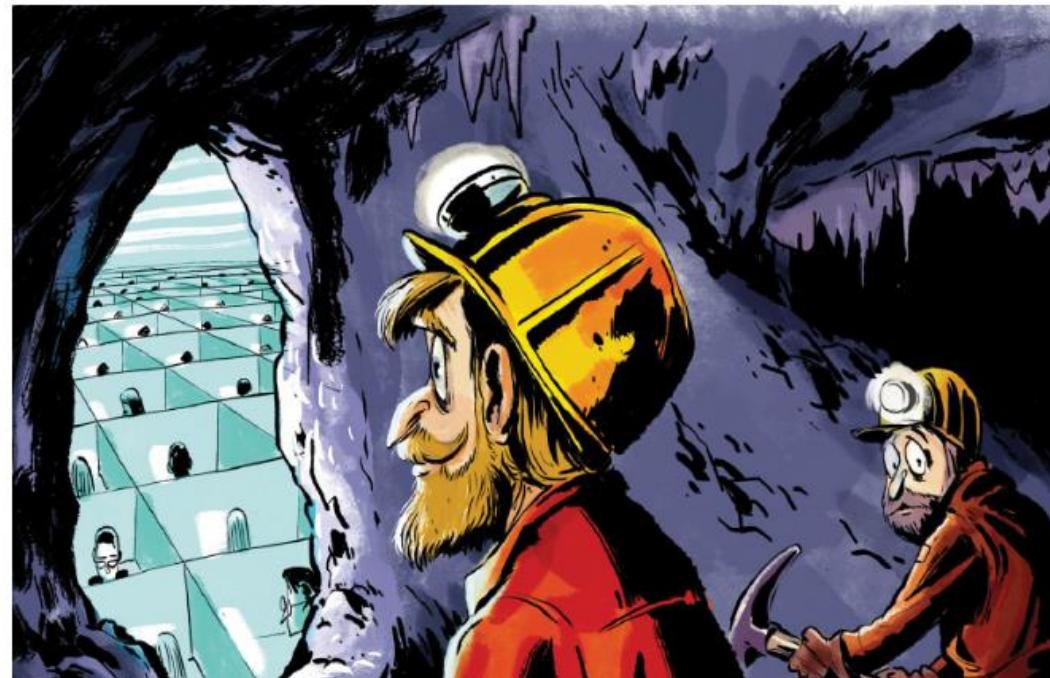
TWEET

COMMENT  
195

EMAIL

CLIVE THOMPSON BUSINESS 02.08.17 12:30 PM

# THE NEXT BIG BLUE-COLLAR JOB IS CODING



# EDUCATION HIERARCHY IN MODERN SOCIETY

## Thinkers: Philosophy, Economics, Politics

Thought leaders, VC groups, Heads of State, Thinktanks



Drivers of Society: Scientists and Artists  
Cognitive neuroscience, Biomolecular Computing, Quantum Computing  
Literature, Art



Worker Bees: Technical skills  
Electrical engineering, financial analysts, doctors, lawyers  
currently being replaced by AI

Producers: Materials and Products  
currently being replaced by AI and 3D printing

Educators/Teachers:  
soon to be partially replaced by AI



Slaves: Software engineering, Comp Sci, coders  
Short career life span, soon to be replaced by AI

Slaves: Soldiers, Police Officers, Govt Workers  
Manual labour  
currently being replaced by AI

Slaves: Poverty sweatshop workers, helpers, assistants  
Manufacturing, Manual Labour, Repetitive labour  
currently being replaced by AI

# Why computer hardware and computer architecture & organization?

- Hardware is the basis of all computation
  - After all, computation is physical
  - The best SW professionals have good HW skills



David Patterson

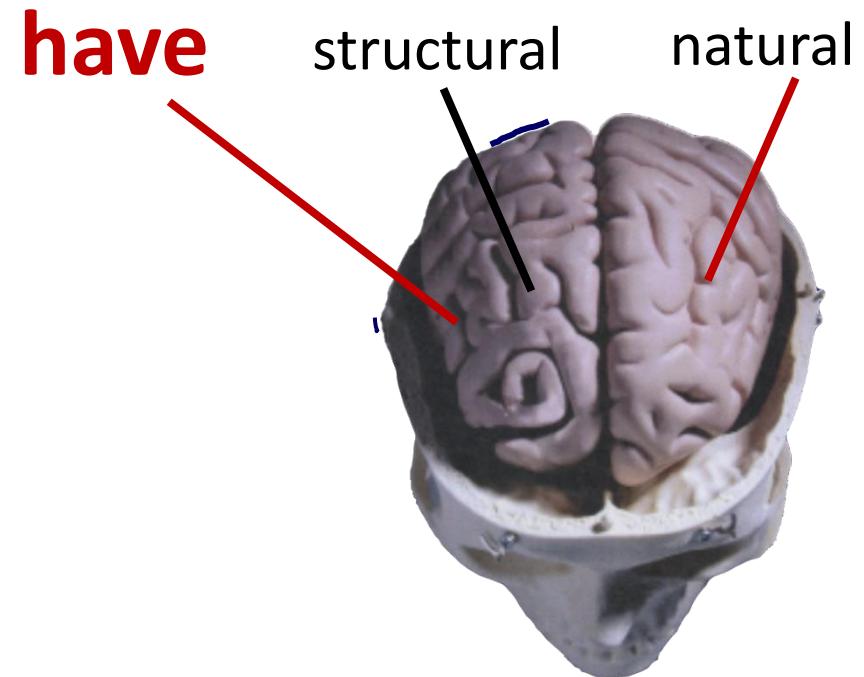
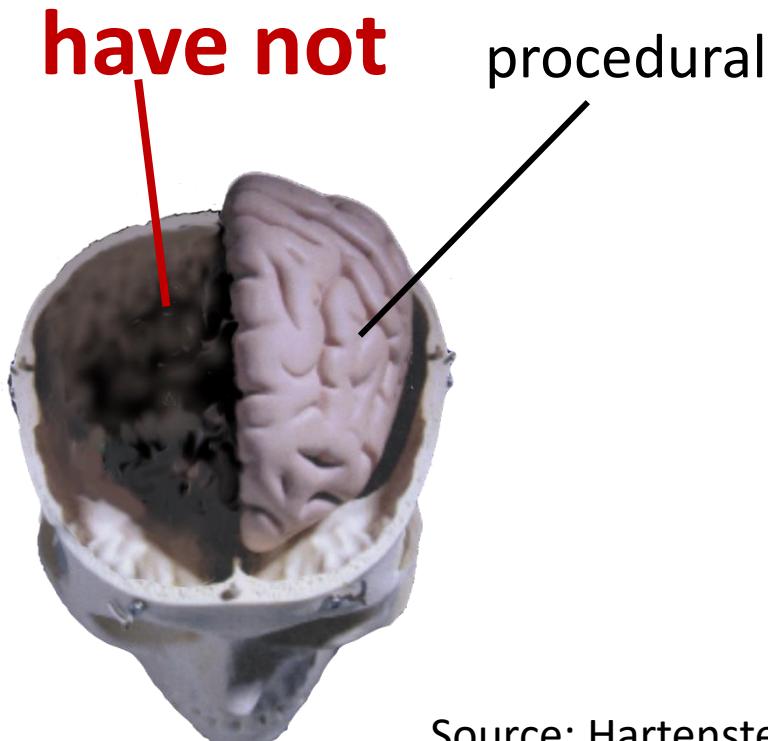
- Understanding HW prepares you for the new era in computation
  - We are at crossroads
  - The computing industry is at deadlock

# Why not computer architecture & organization?

- Hardware is **hard**

You cannot \*teach Hardware  
to a Programmer

\*) efficiently



**But to a Hardware guy  
you always can  
teach Programming**

# Singularity [John von Neumann]

## “Singularity is near” – R. Kurzweil

### 1 The accelerating pace of change ...



$10^{26}$   
Surpasses brainpower equivalent to that of all human brains combined

$10^{20}$   
Surpasses brainpower of human in 2023



$10^{15}$   
Surpasses brainpower of mouse in 2015



### 3 ... will lead to the Singularity



**UNIVAC I**  
The first commercially marketed computer, used to tabulate the U.S. Census, occupied 943 cu. ft.



**Power Mac G4**  
The first personal computer to deliver more than 1 billion floating-point operations per second



**Colossus**  
The electronic computer, with 1,500 vacuum tubes, helped the British crack German codes during WW II

### COMPUTER RANKINGS

By calculations per second per \$1,000

**Analytical engine**  
Never fully built, Charles Babbage's invention was designed to solve computational and logical problems



Hollerith Tabulator

IBM Tabulator

National Ellis 3000

Zuse 2

Zuse 3

ENIAC

EDVAC

IBM SSEC

Whirlwind

BINAC

DEC PDP-4

IBM 1130

IBM 1620

Datamatic 1000

DEC PDP-10

Intellic-8

Data General Nova

IBM PC

Compaq Deskpro 386

Pentium PC

Pentium II PC

Mac Pro

Dell Dimension 8400

Nvidia Tesla GPU & PC

Apple II

Power Mac G4

2045

1900

1920

1940

1960

1980

2000

2020

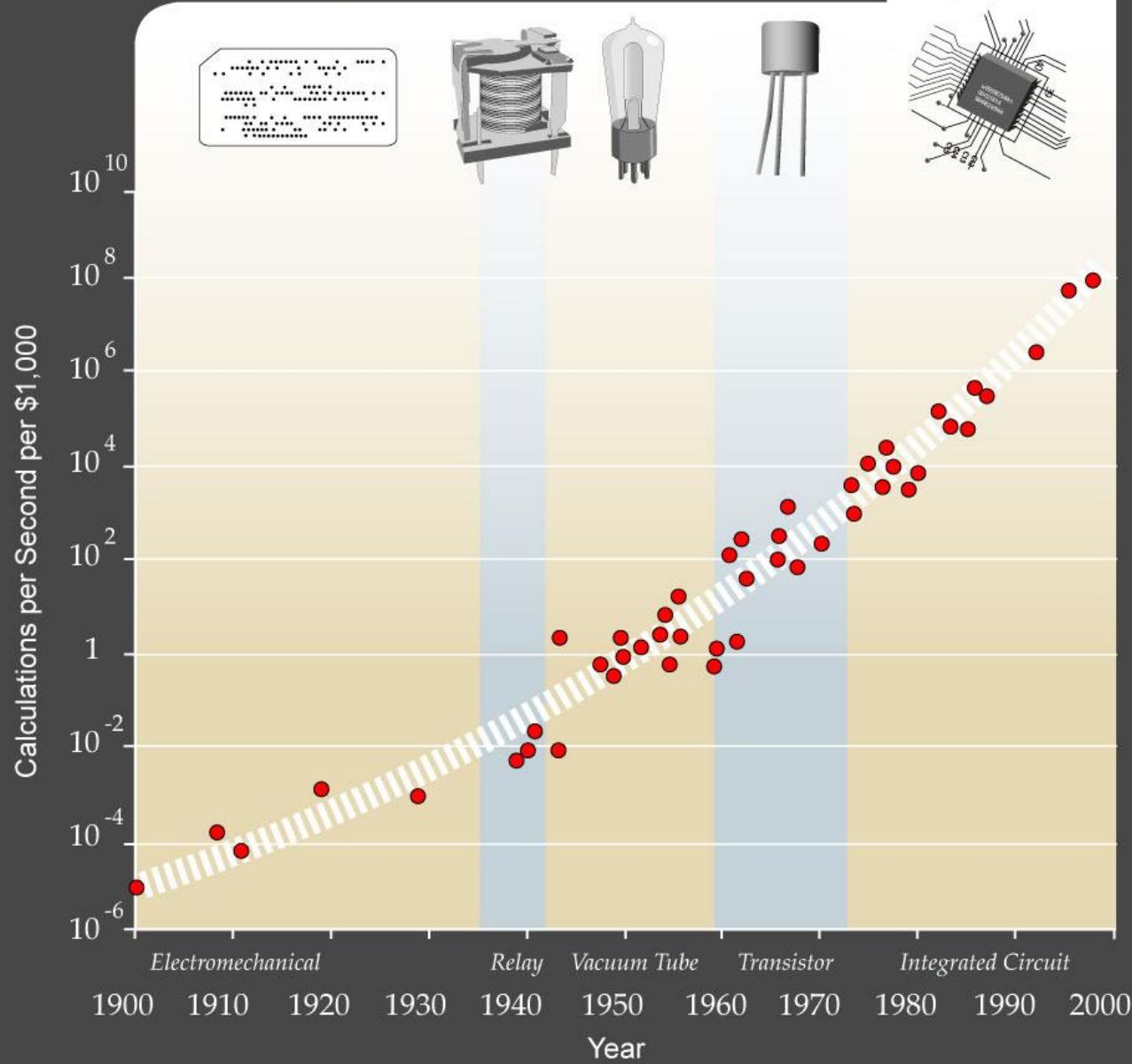
2045

ELECTROMECHANICAL → RELAYS → VACUUM TUBES → TRANSISTORS → INTEGRATED CIRCUITS →

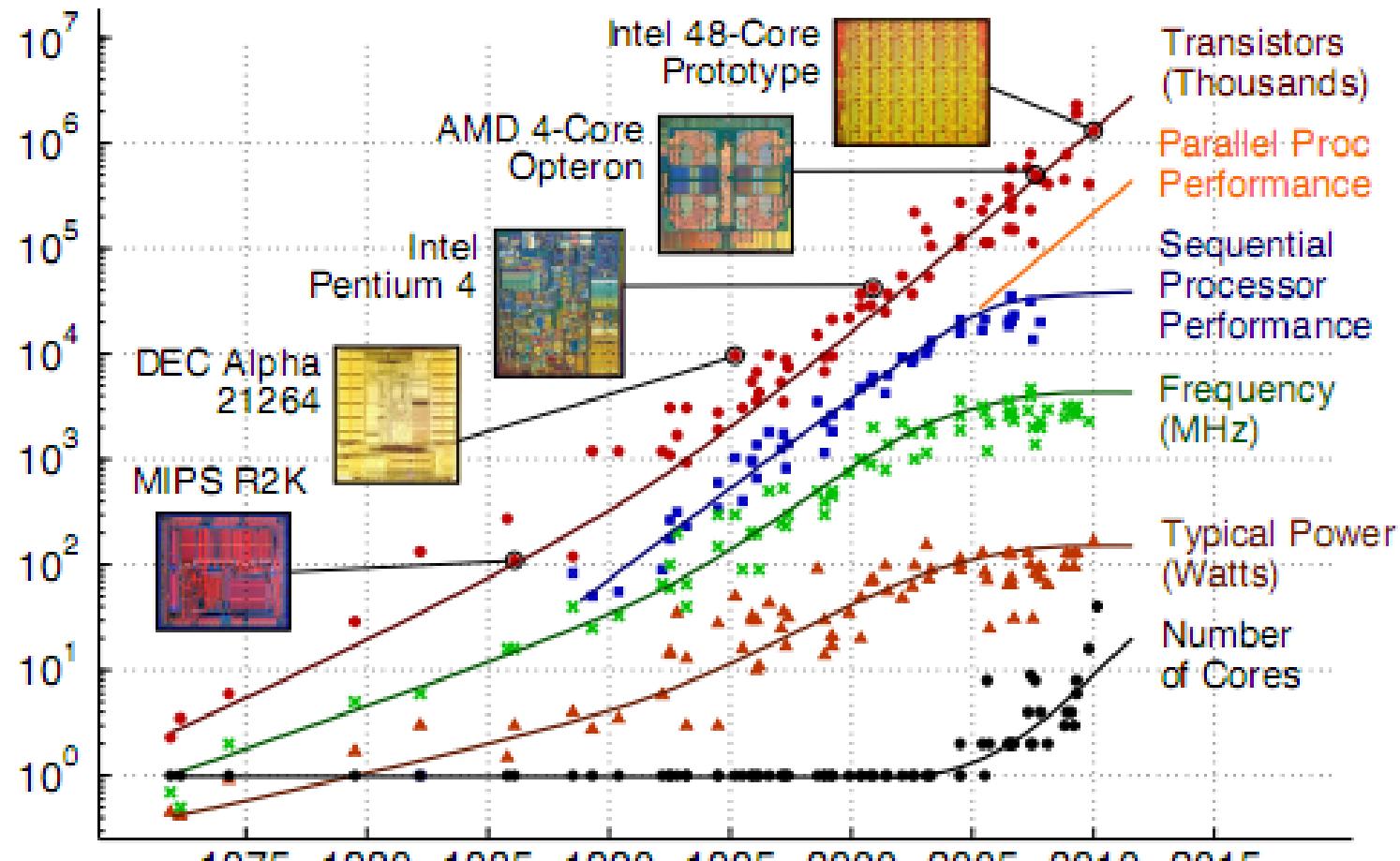
## Moore's Law

### The Fifth Paradigm

Logarithmic Plot



# Consequences of Power Wall



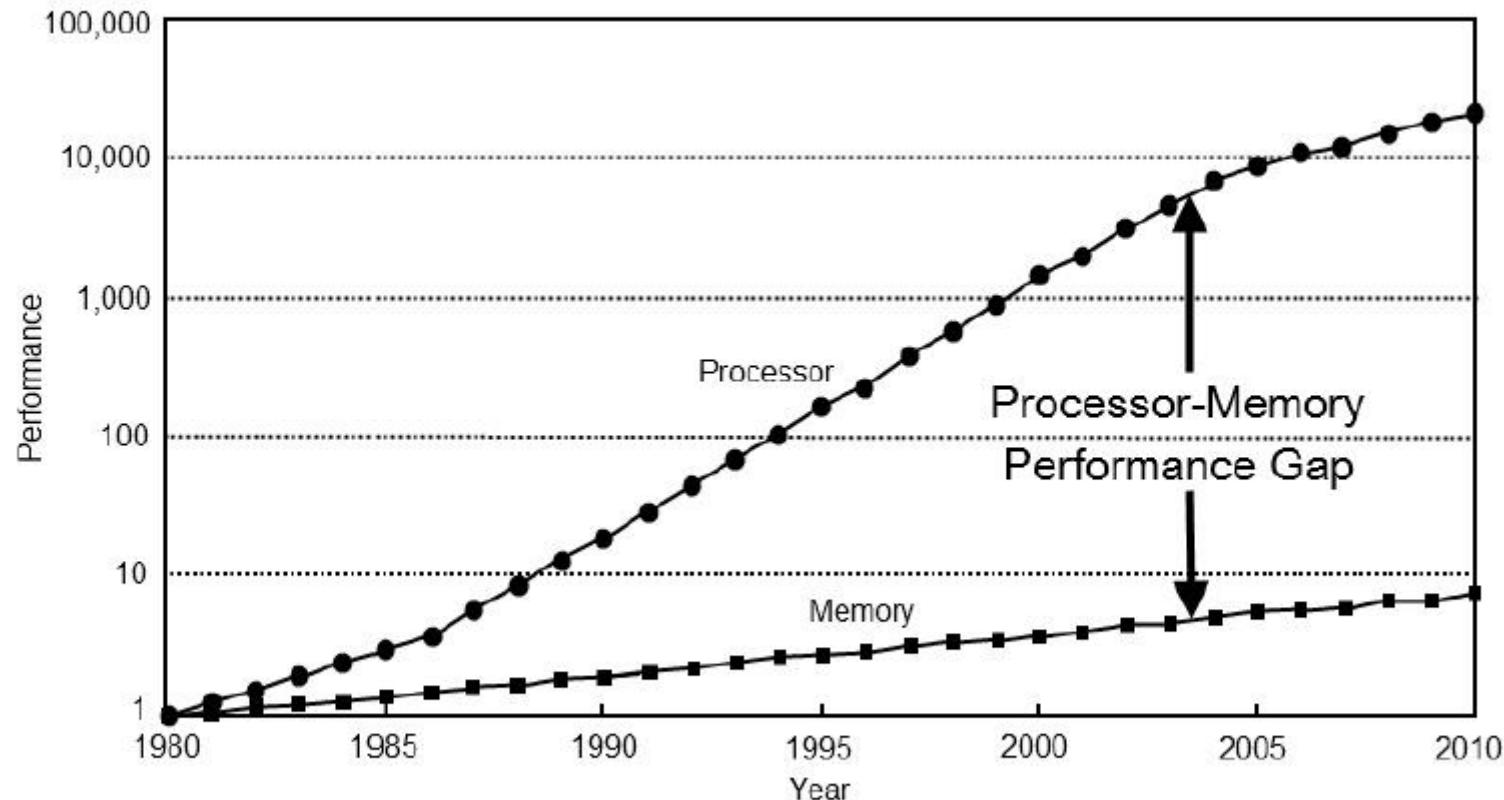
Data partially collected by M. Horowitz, F. Labonta, O. Shacham, K. Olukotun, L. Hammond

Prepared by C. Batten - School of Electrical and Computer Engineering - Cornell University - 2005 - retrieved Dec 12 2012 -  
<http://www.csl.cornell.edu/courses/ece5950/handouts/ece5950-overview.pdf>

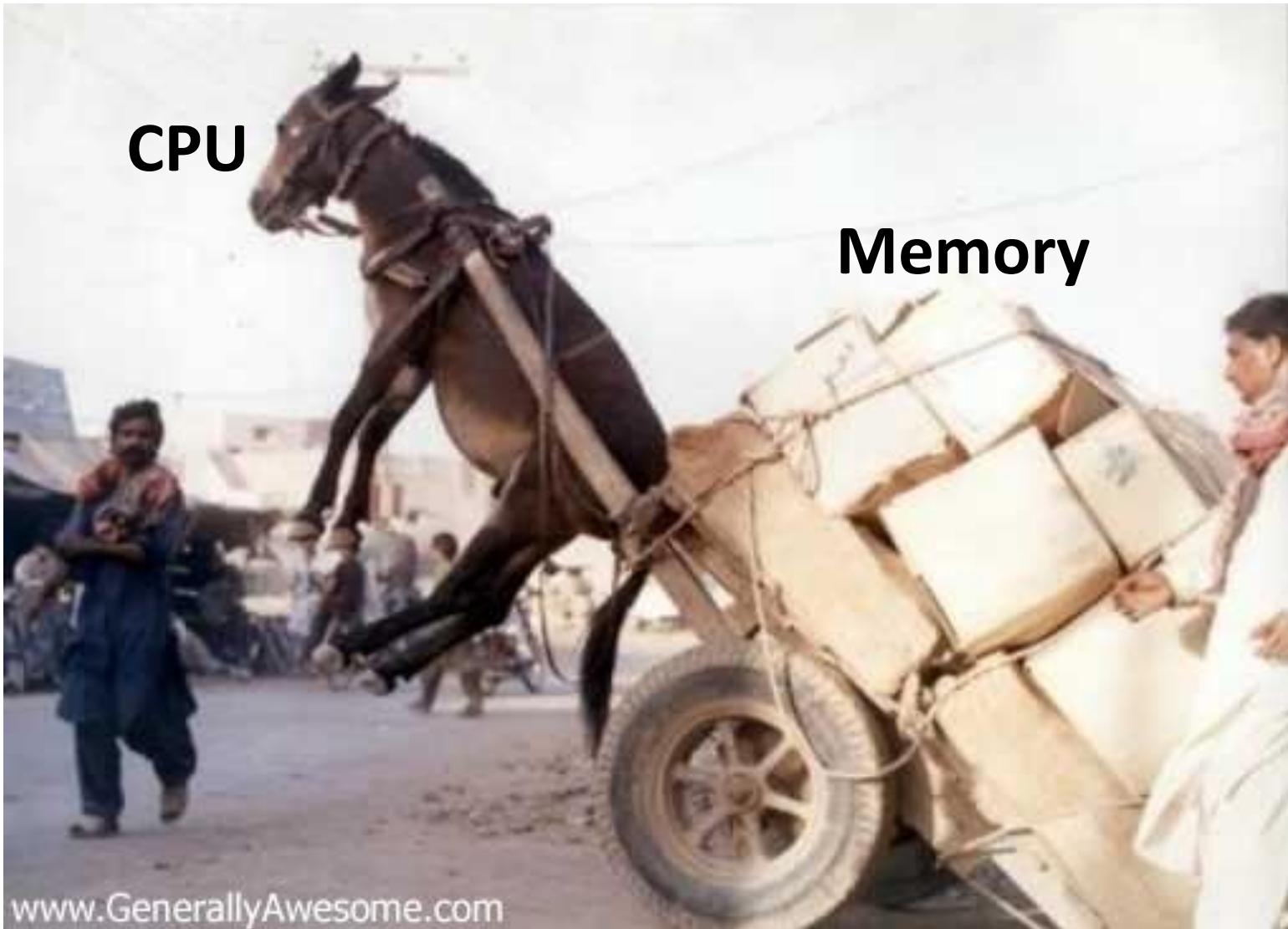
# Consequences of Memory Wall

## CPU/Memory performance

Developed by



# CPU vs. Memory



# Progress, uninterrupted evolution?

- Scientism vs. science
  - Dogmatic support for “scientific” method
  - Scientific positivism
  - "Twenty years from now, the author envisages the brain builder industry as being one of the world's top industries, comparable with oil, automobile, and construction." - Hugo de Garis, 1996

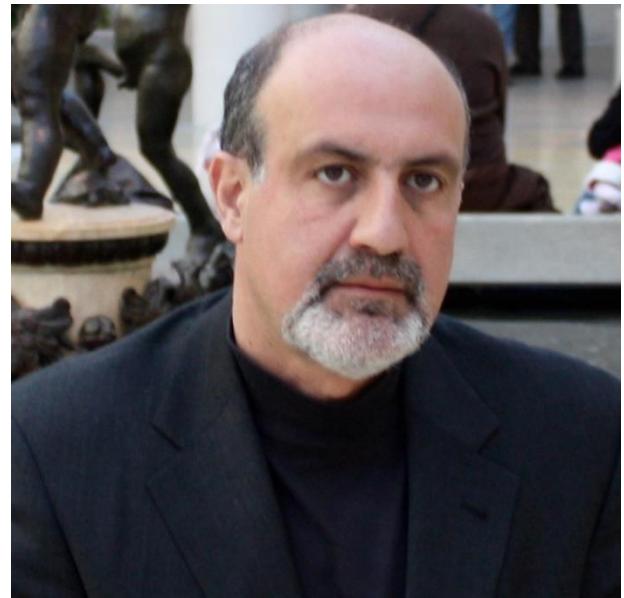
Source: machineslikeus.com



- Computer industry: always faster, smaller, cheaper

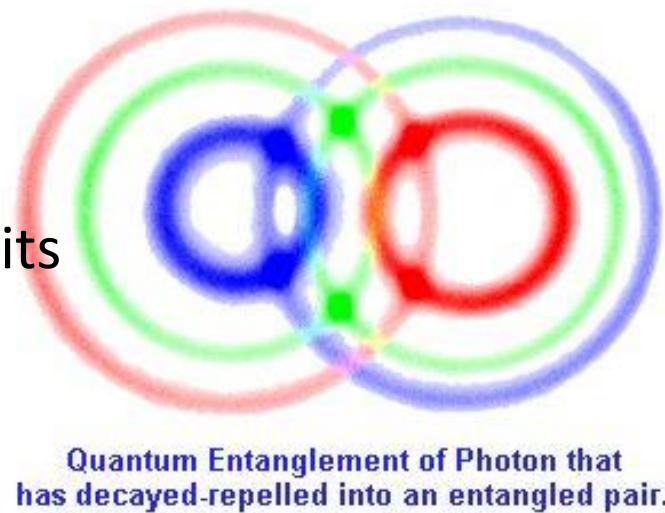
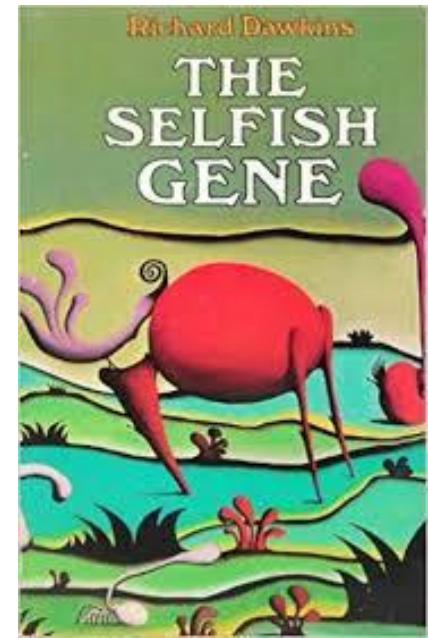
# Voices of reason

- Nassim Nicholas Taleb
  - Coined the term IYI
  - Exposed bad (bogus) science
  - Exposed badly used statistics
  - <http://www.fooledbyrandomness.com/>



# Scientific method

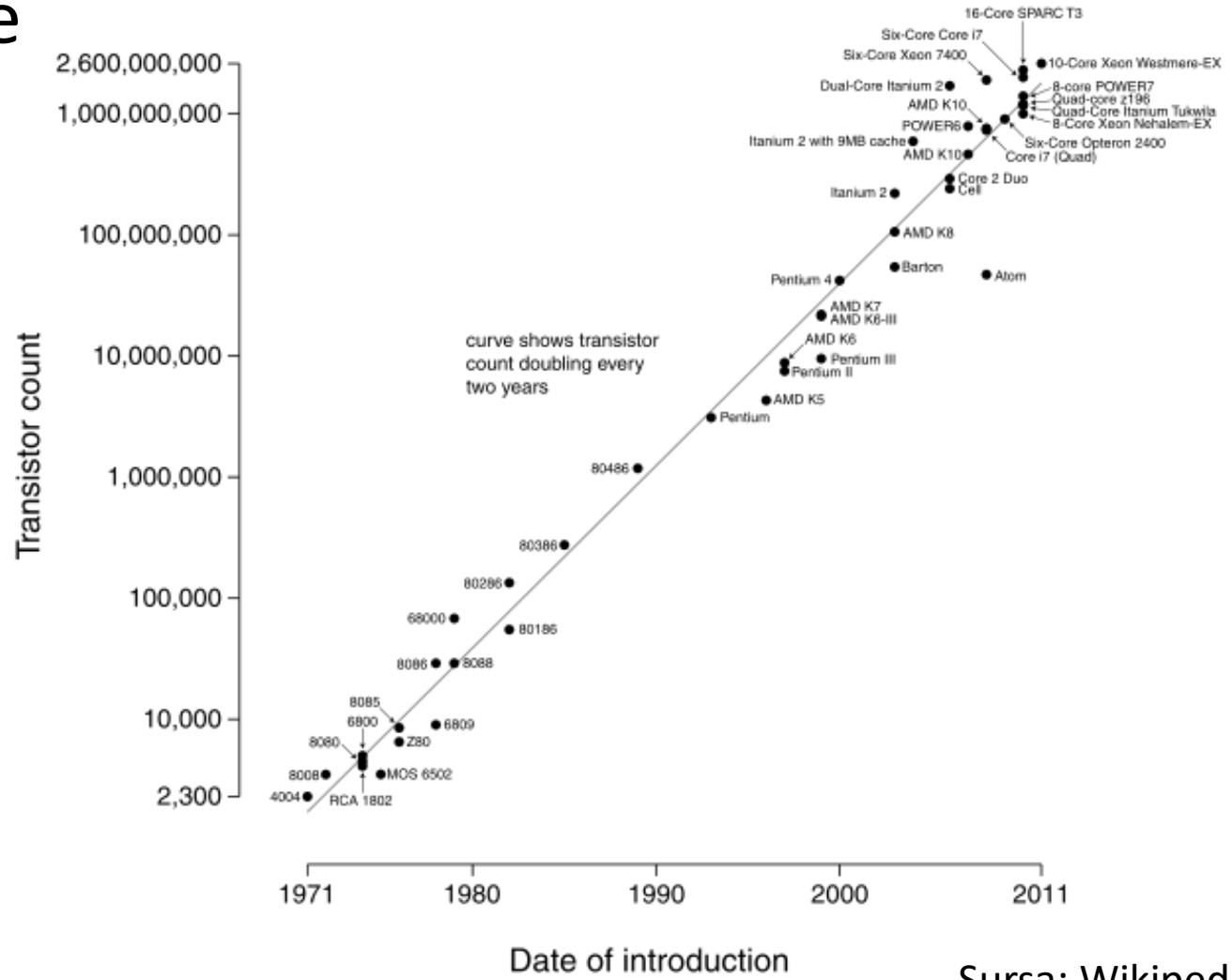
- Reductionism
  - Any complex system is merely the sum of its components
  - Richard Dawkins – hierarchical reductionism
    - Living organisms compared with computers
  - Limits of reductionism
    - “The whole is more than the sum of its parts” – Aristotle, Metaphysics
    - Quantum physics – entanglement



# Source of progress in computers

Microprocessor Transistor Counts 1971-2011 & Moore's Law

- Consequence of Moore's law



Sursa: Wikipedia

# Moore's law has consequences

- 2019-2020, **1 atom/1 bit**
- ITRS – International Technology Roadmap for Semiconductors
  - Quantum computing
  - Bio-inspired computing

# Quantum computing?

The Nobel Prize in Physics 2012

Nobel Prize Award Ceremony

Serge Haroche

David J. Wineland



Photo: U. Montan

Serge Haroche

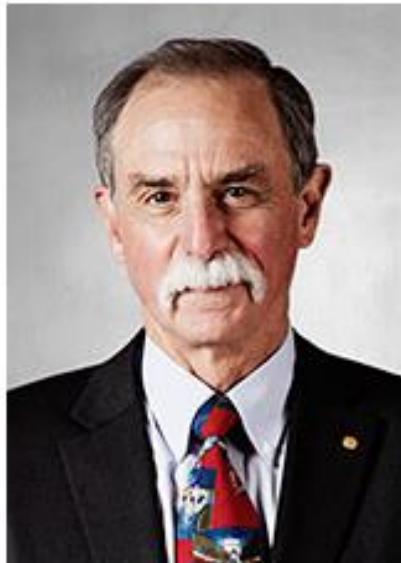
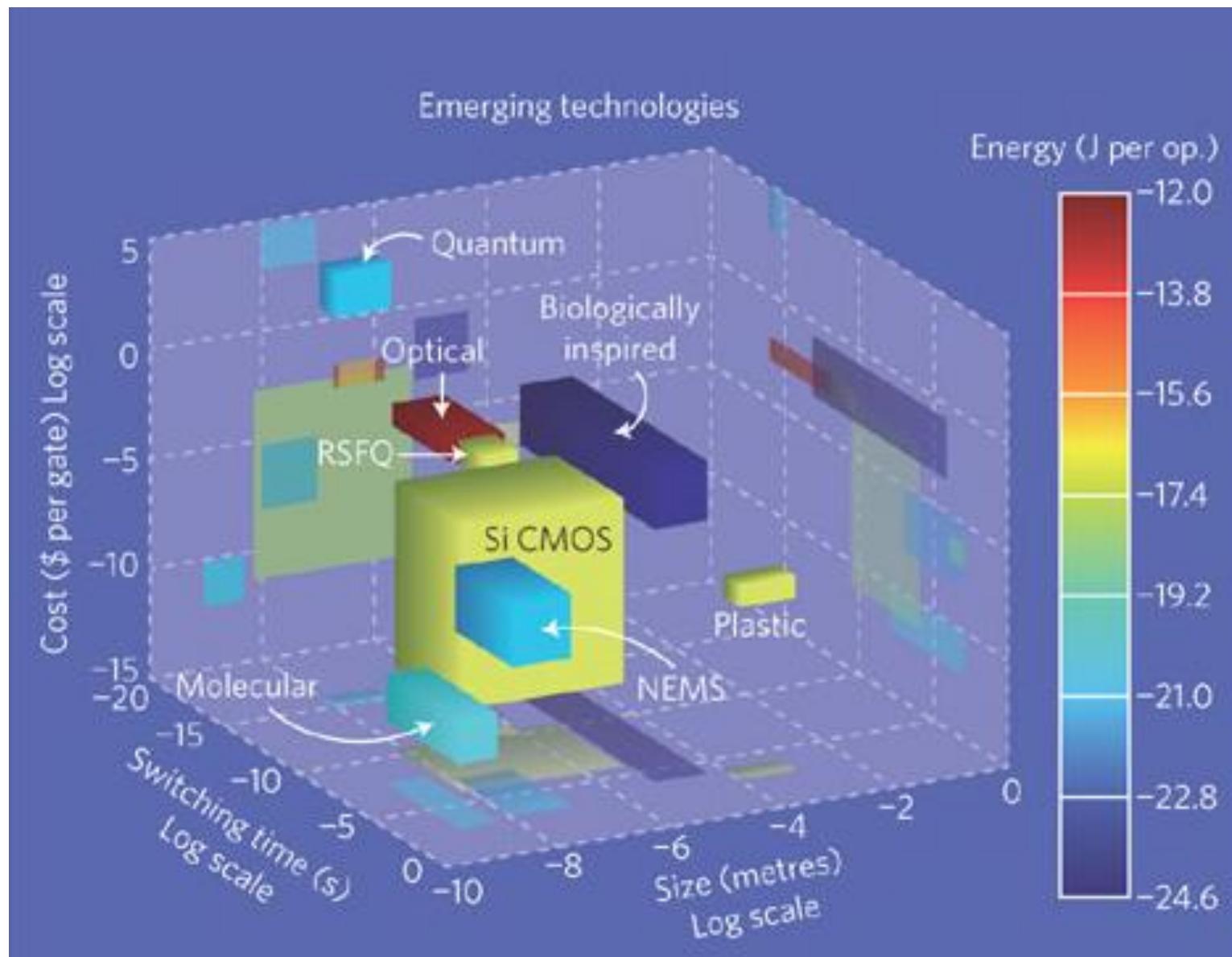


Photo: U. Montan

David J. Wineland

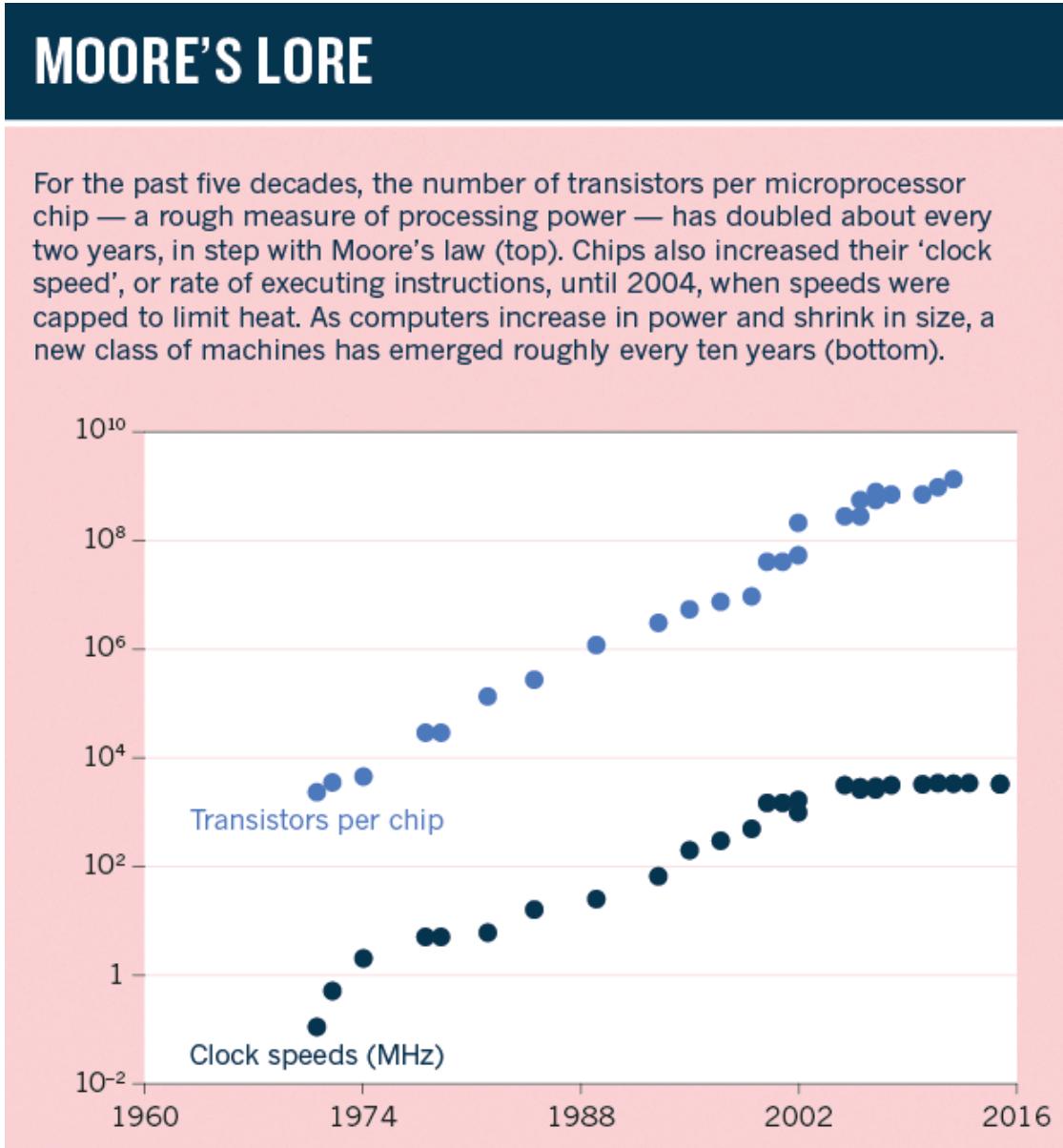
The Nobel Prize in Physics 2012 was awarded jointly to Serge Haroche and David J. Wineland "for ground-breaking experimental methods that enable measuring and manipulation of individual quantum systems"

# ITRS – Emerging Research Devices



# In the meantime

- Moore's law is DEAD
- Today: 14nm
- 2020: 2-3nm
  - 10 atoms across



What's next?

# A multi-core perspective

## Press Release



David Patterson (Peg Skorpinski photo)

### Intel and Microsoft launch parallel computing research center at UC Berkeley

By Sarah Yang, Media Relations | 18 March 2007

**BERKELEY** – The University of California, Berkeley, is partnering with Intel Corp. and Microsoft Corp. to accelerate developments in parallel computing and advance the powerful benefits of multi-core processing to mainstream consumer and business computers.

#### FEATURE

### The Trouble With Multicore

Chipmakers are busy designing microprocessors that most programmers can't handle

By DAVID PATTERSON / JULY 2010



Page 1 2 3 4 5 // View All

In 1975, future Hall of Famer Roger Staubach had the football but little else in a playoff game against the Minnesota Vikings. Behind by four points at midfield with 24 seconds to go, the Dallas Cowboys quarterback closed his eyes, threw the ball as hard as he could, and said a Hail Mary. (For you soccer fans, this would be like David Beckham taking a shot on goal from midfield late in injury time.)

His prayer was answered. Staubach's receiver collided with a Viking defender just as the ball arrived but nevertheless managed to pin the football against his leg, scoring the touchdown that took the Cowboys to the Super Bowl. (Imagine Beckham's long ball beating the goalie.) Ever since that game, a desperate pass with little chance of success has been labeled a Hail Mary.

Thirty years later, the semiconductor industry threw the equivalent of a Hail Mary pass when it switched from making microprocessors run faster to putting more of them on a chip—doing so without any clear notion of how such devices would in general be programmed. The hope is that someone will be able to figure out how to do that, but at the moment, the ball is still in the air.

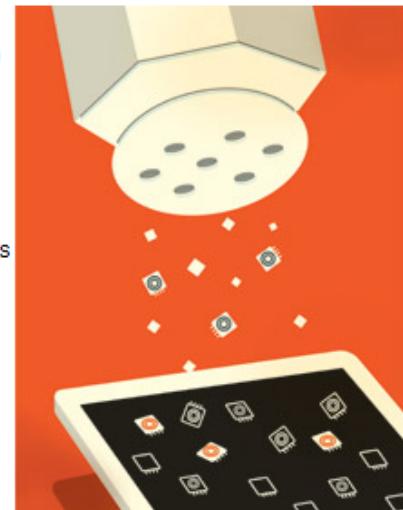


Illustration: Harry Campbell

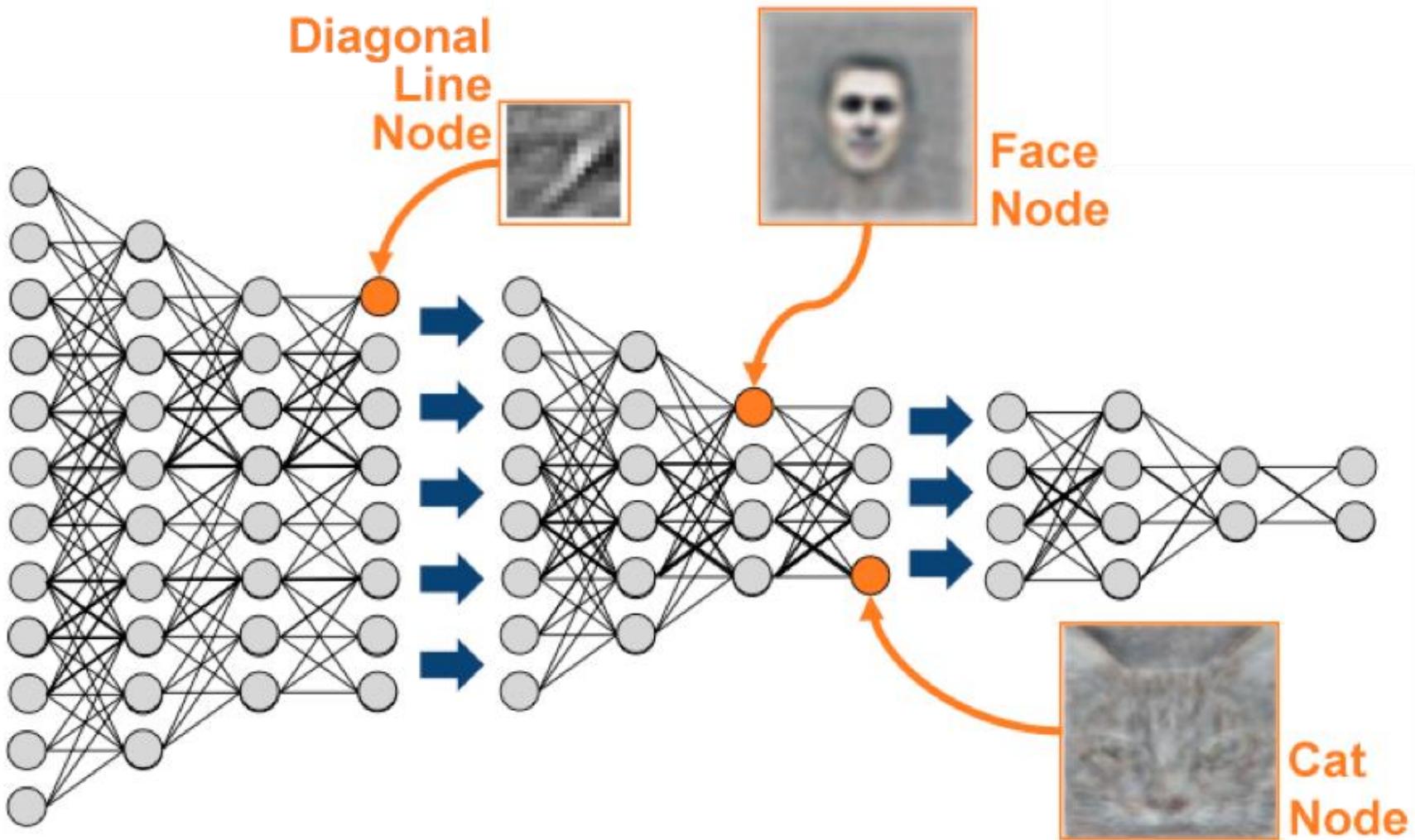
# Motivation

- Multi-Core is THE hot top topic as we speak



- David Patterson
  - “The Trouble With Multi-Core” – IEEE Spectrum, vol. 47, no. 7, pp. 24-29 (August 2010)
  - “Chipmakers are busy designing microprocessors that most programmers can’t handle”

# Feasible solutions



Deep learning, source [forbes.com](http://forbes.com)

# Deep learning is powerful

- Google's AlphaGo program mauled Lee Sedol, one of the highest-ranking Go players in the word
- A particular case of Machine Learning
  - The computer learns to do something without being specifically programmed for that purpose
    - Recognizing an SUV
    - Some SUV pictures are “shown” to the computer and labeled as SUVs => training
      - The computer builds a model
      - Subsequent model adjustments until the model becomes accurate enough

# Deep learning uses neural networks

- Multi-level (layer) artificial neural networks
- Implemented and accelerated with multi-core GPUs
- NVIDIA Tesla



# Deep learning applications

LIVE SCIENCE

NEWS TECH HEALTH PLANET EARTH SPACE STRANGE NEWS ANIMALS

Sponsored by Rekoverr K

Live Science > Health

## AI Boosts Cancer Screens to Nearly 100 Percent Accuracy

By Christopher Wanjek | June 21, 2016 01:54pm ET

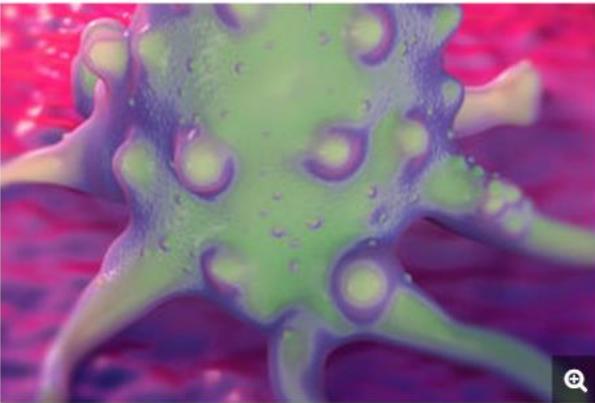
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t 63

g+ 2

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MORE ▾



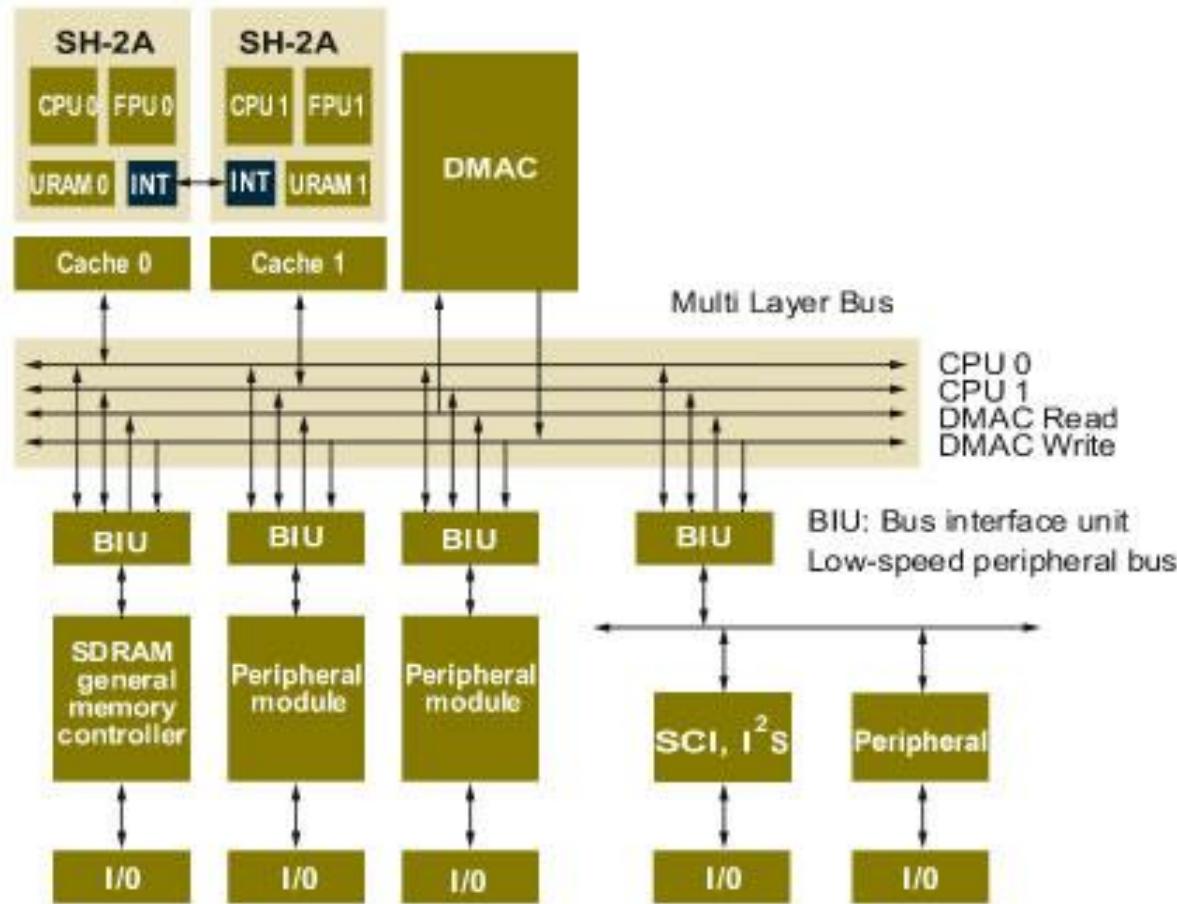
Combining artificial intelligence with a human pathologist could boost the accuracy of cancer diagnosis.

Credit: royaltystockphoto.com / Shutterstock.com

Diagnosing cancer is about to get more accurate, with the help of artificial intelligence. Pathologists have diagnosed diseases in more or less the same way for the past 100 years, by laboring over a microscope reviewing biopsy samples on little glass slides. Working almost robotically, they sift through millions of normal cells to identify just a few diseased ones. The task is

# Inter-core communication

- Bus – unique communication resource



# Inter-core communication

- Many-core  
(> 100 processors)



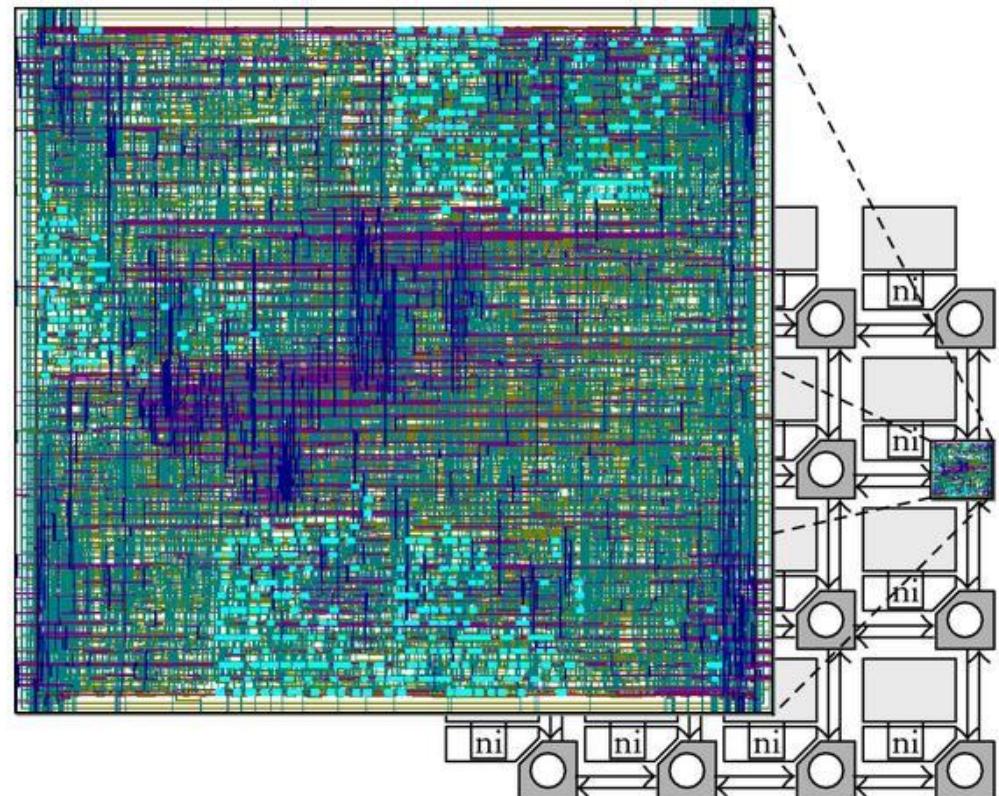
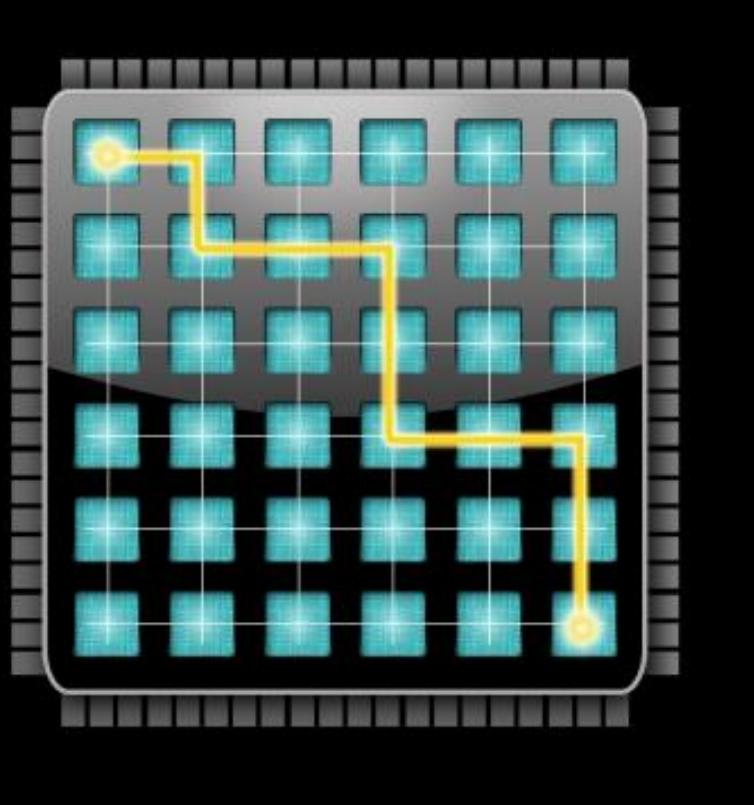
# Many-core communication

- Network



# Networks-On-Chip

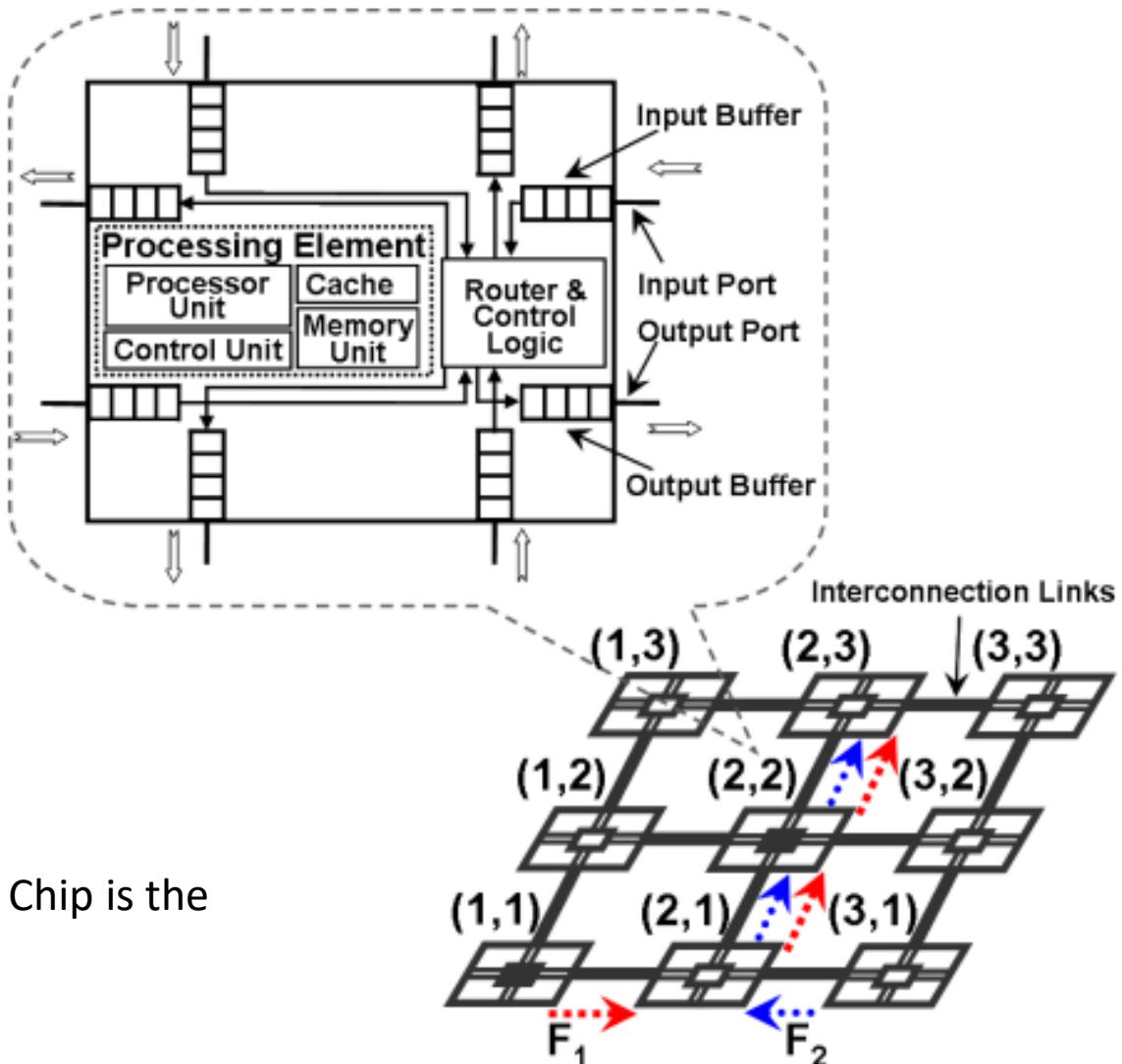
- Topology: regulated, limited by VLSI technology



F. Samman, T. Hollstein, M. Glesner. Networks-On-Chip Based on Dynamic Wormhole Packet Identity Mapping Management. VLSI Design (2009)

# Communication: dynamic problems

- Congestion



Marculescu & Bogdan, The Chip is the Network, 2009

# Congestion prediction

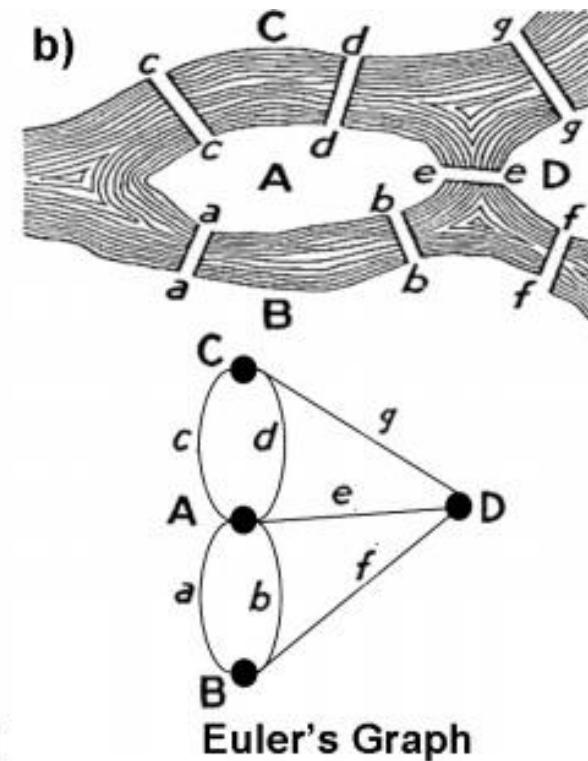
- Difficult problem
- Hard to suggest a NoC design which avoids congestion

# NoC- design approaches

- Deterministic



- Stochastic



Leonhard Euler [1707-1783]

- Statistical physics & complex network science

# NoC- design approaches

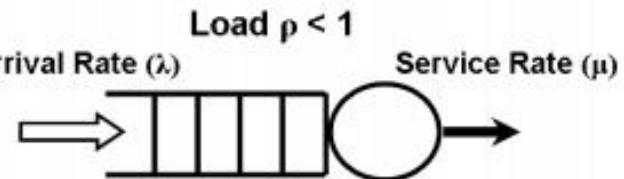
- Deterministic
- Stochastic
- Statistical physics and complex network science

a)

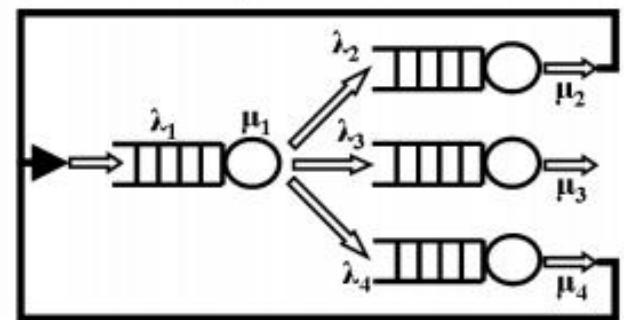


Andrey Markov [1856-1922]

b) Single Queue Problem

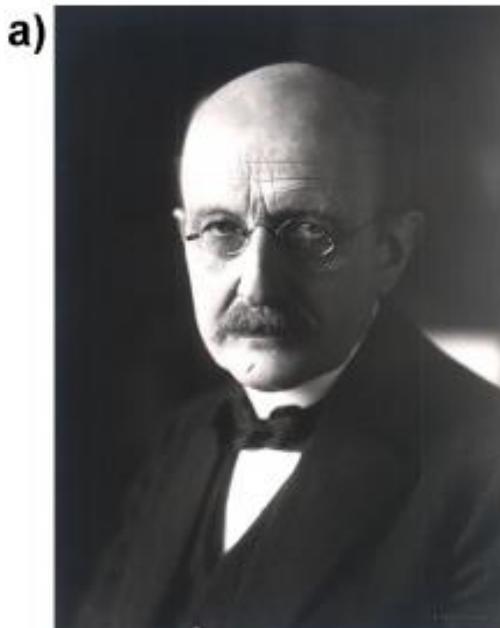


Queueing Network Problem



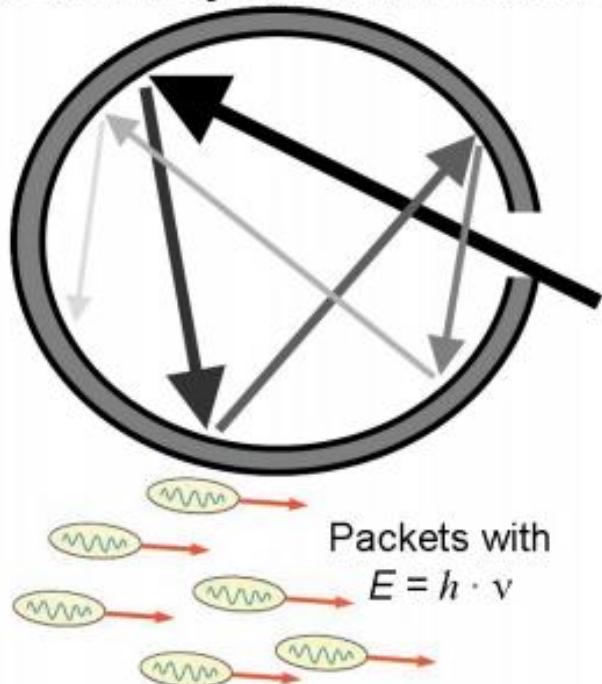
# NoC- design approaches

- Deterministic
- Stochastic
- Statistical physics and complex network science



Max Planck [1858-1947]

b) Blackbody Radiation Problem



# New roles for computers

- Modeling and controlling uncertain systems
  - Nature and society



Social network dynamics

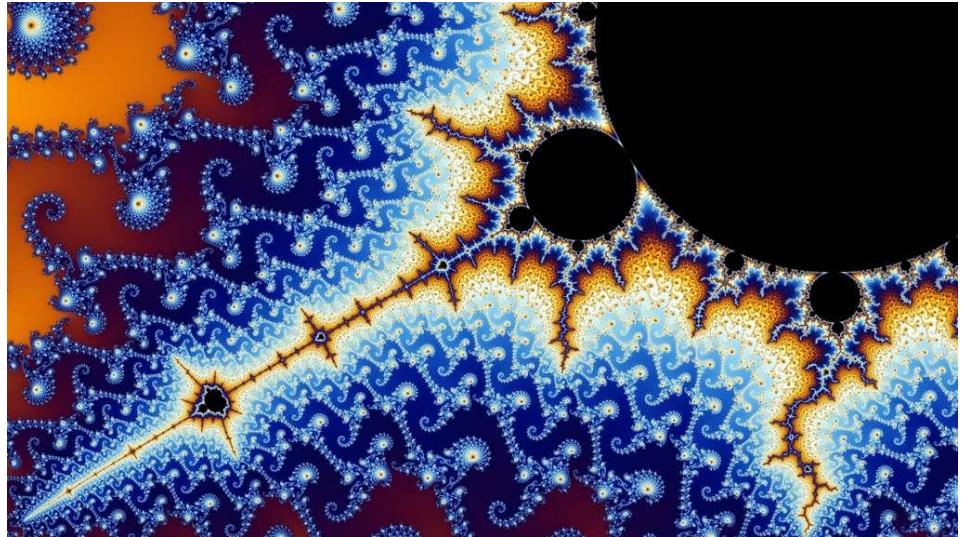


Urban traffic

# These are complex systems

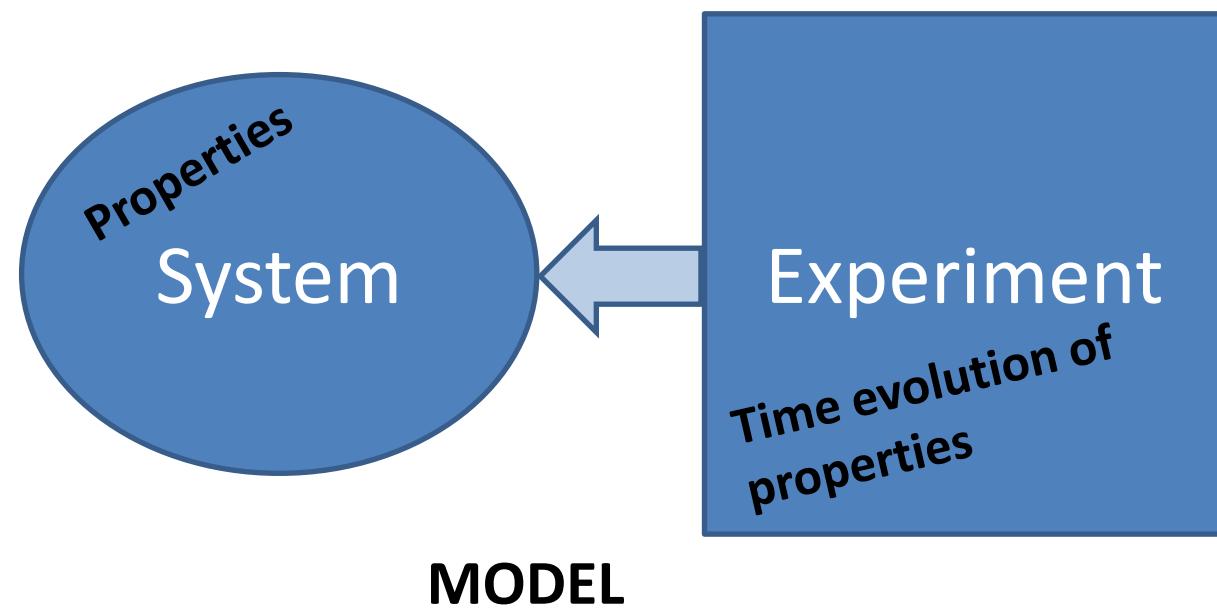


Daniel Tiago 2006



# What is a complex system?

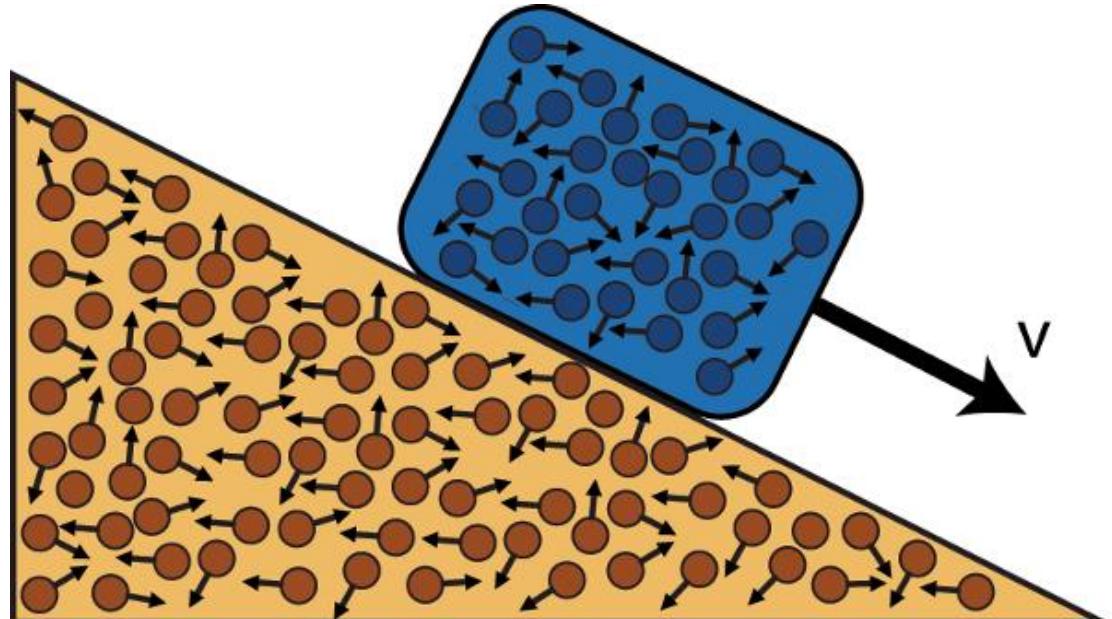
- “One of the hardest things to explain is why complex systems are actually different from simple systems.” – Yaneer Bar-Yam, Why complexity is different.
- Scientific methodology:



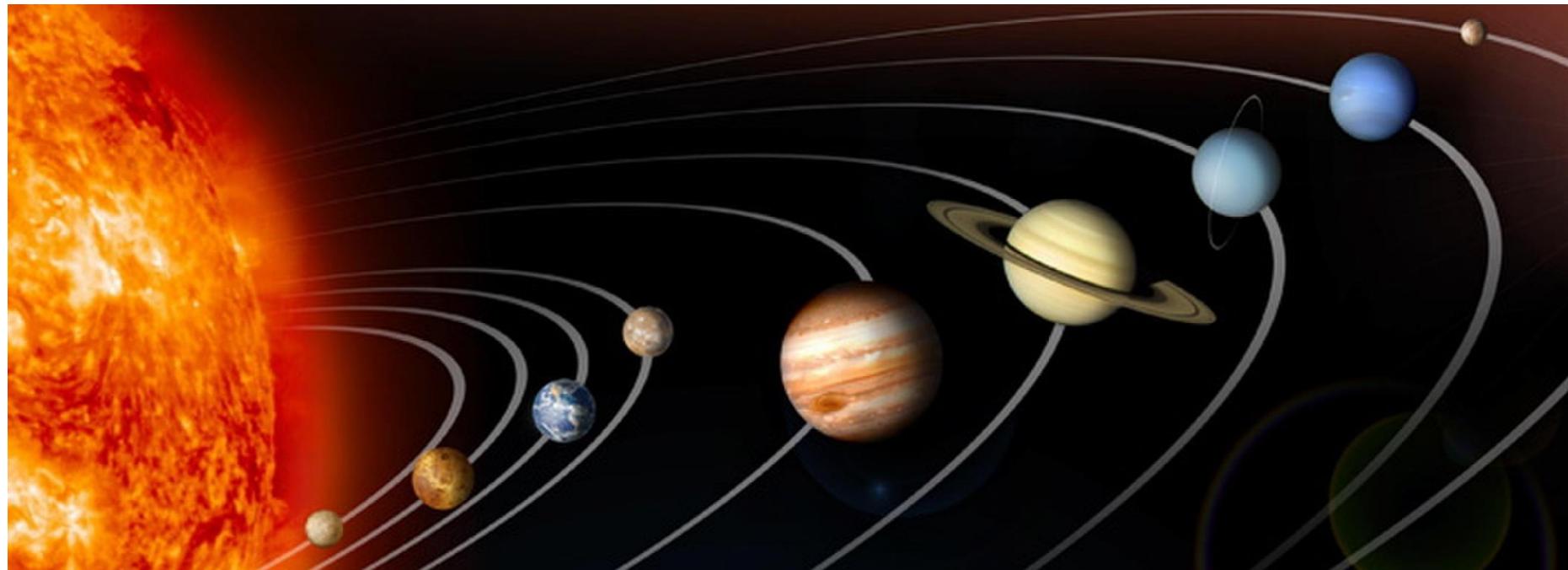
- Did we include all properties?
- Properties are changing over time
- Consider as many as possible properties
- **What properties are the most important?**

# In physics we have

- **Separation of scales**
- Traditionally, any system is characterized by
  - Scale
  - Average



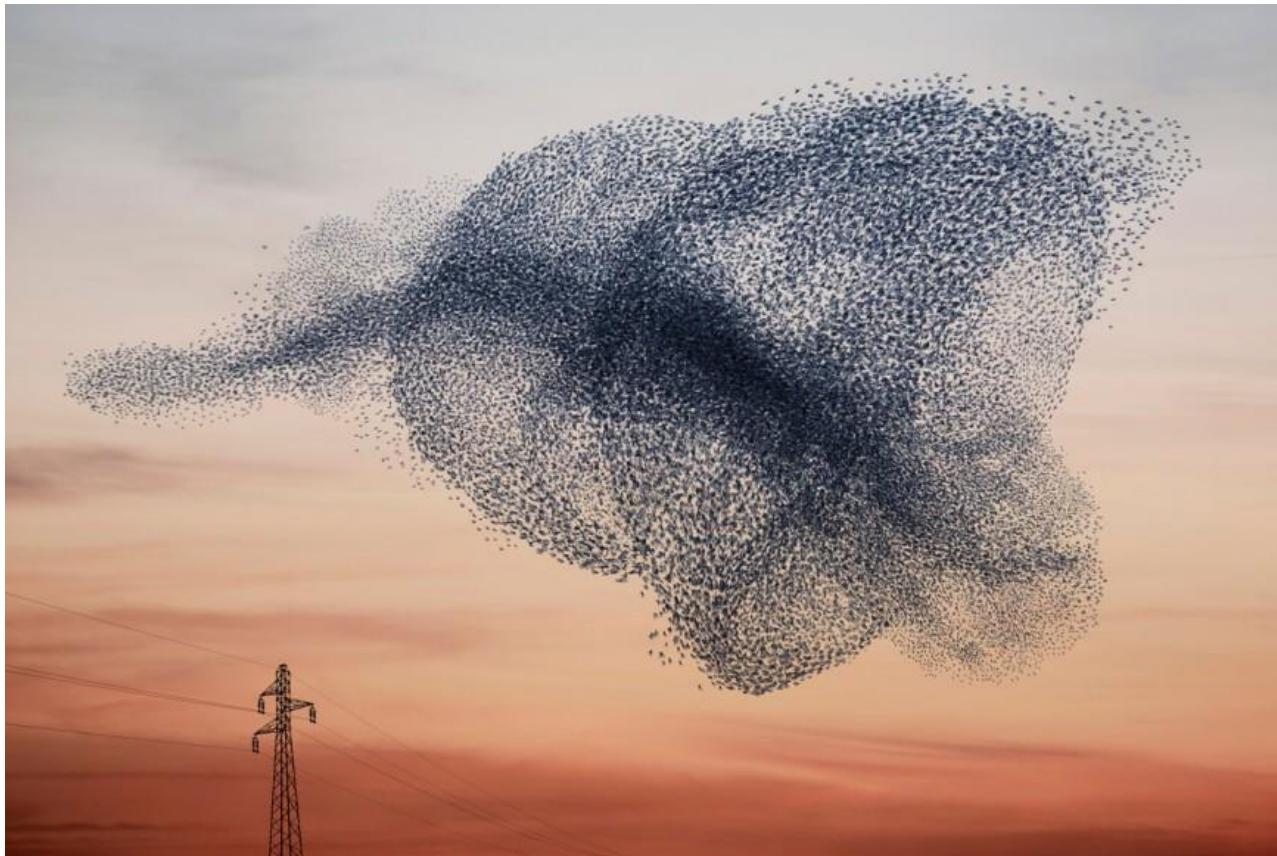
# Separation of scales work



- Insulated solar system
- Interaction with external bodies/objects (e.g., asteroids, comets)

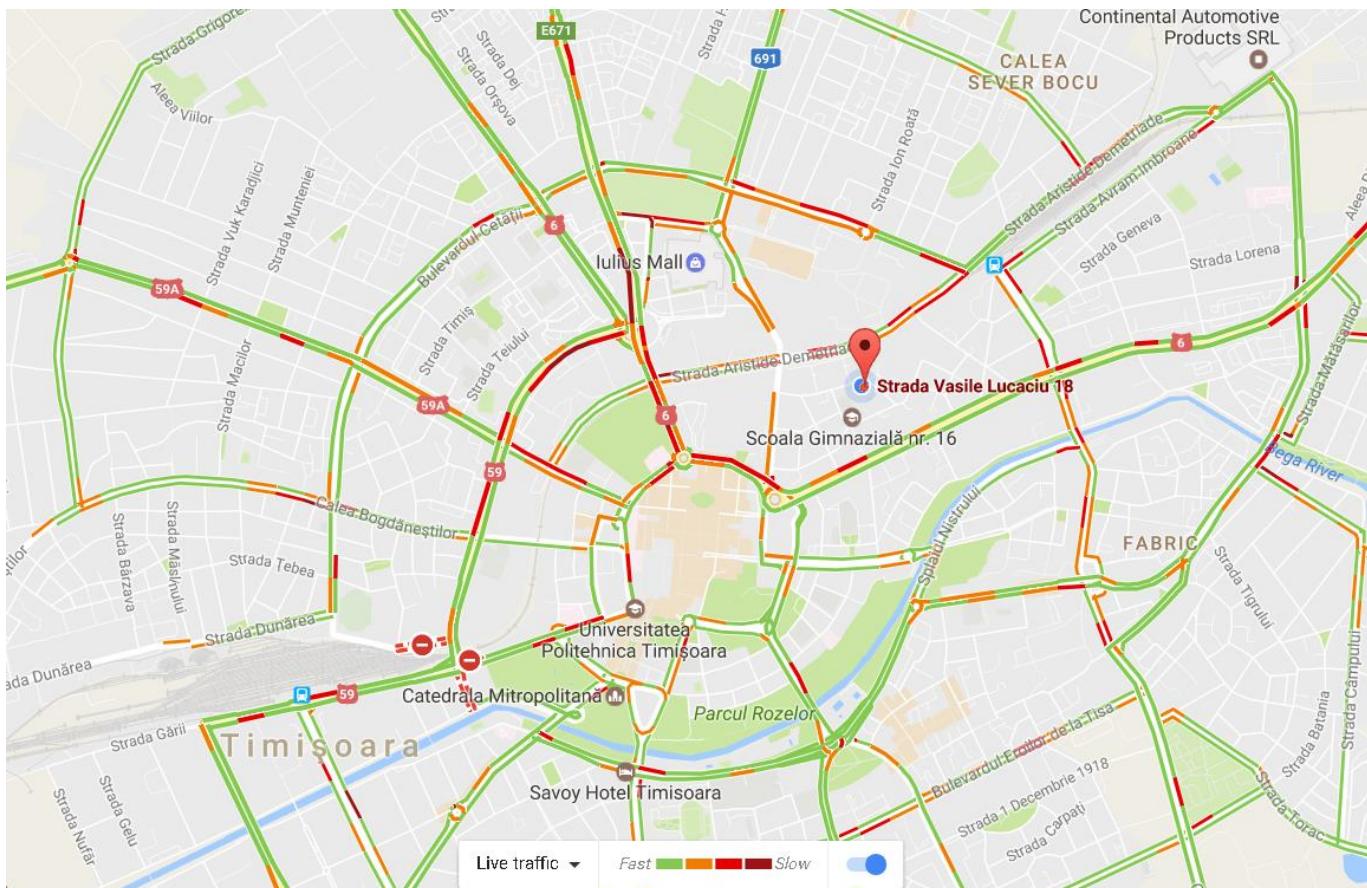
# Complex systems

- Cannot be described by separating micro from macro levels



# Other examples

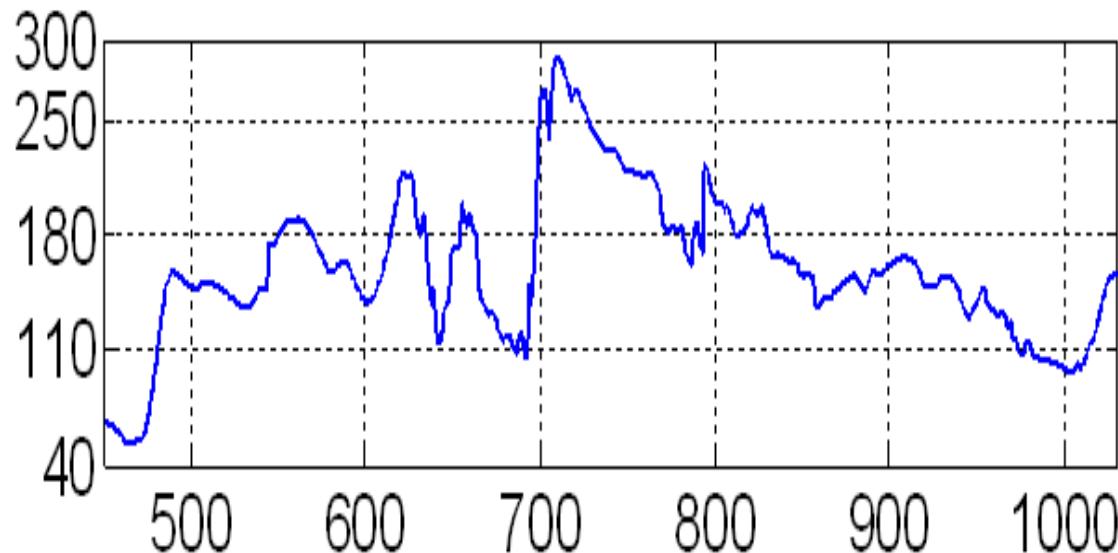
- Urban traffic



Sursa: maps.google.com

# Other examples

- Human metabolism



Sursa: M. Ghorbani, P. Bogdan. A cyber-physical approach to artificial pancreas design.  
CODES+ISSS 2013

# Other examples

- Markets

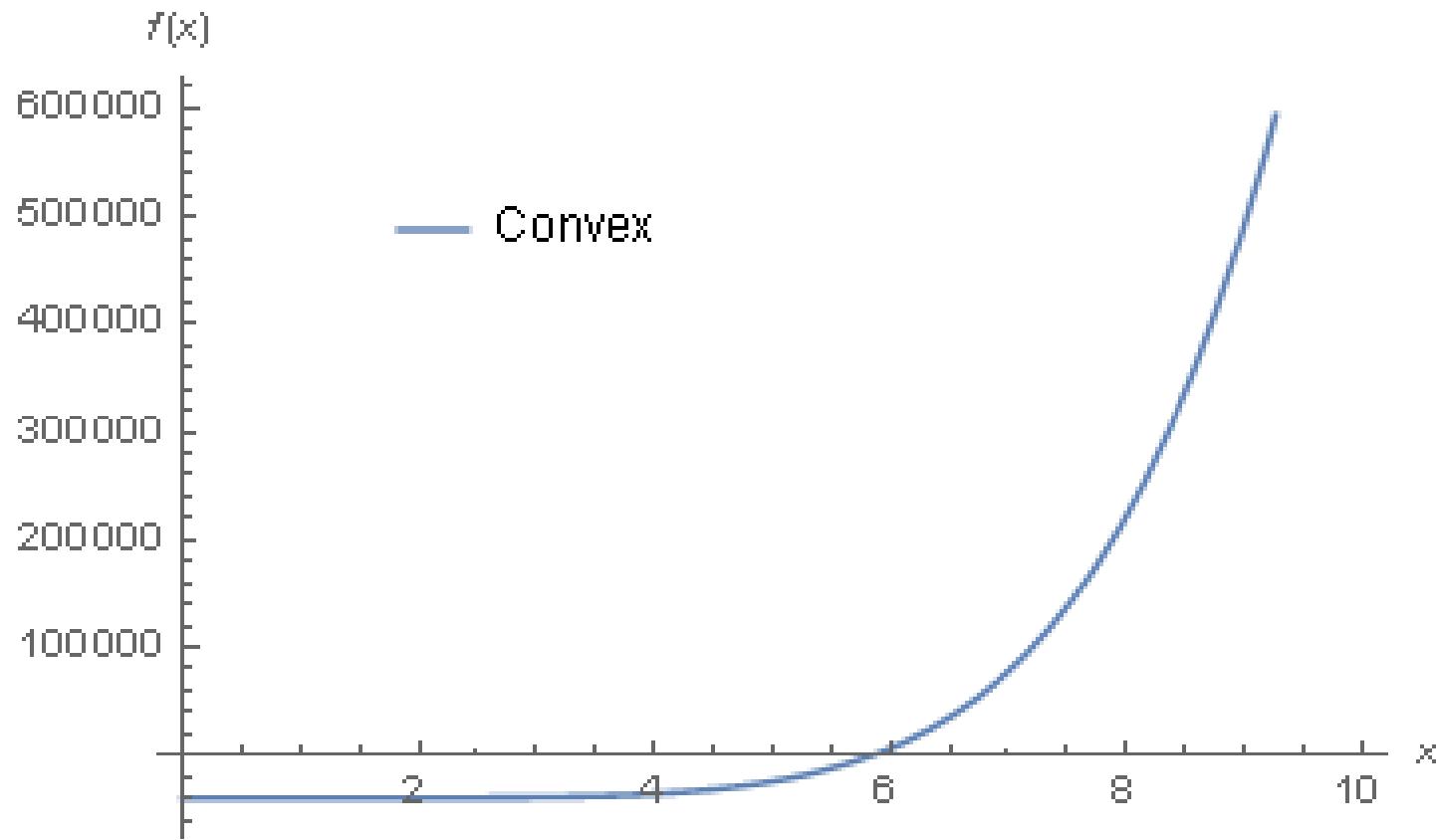


# Complex systems

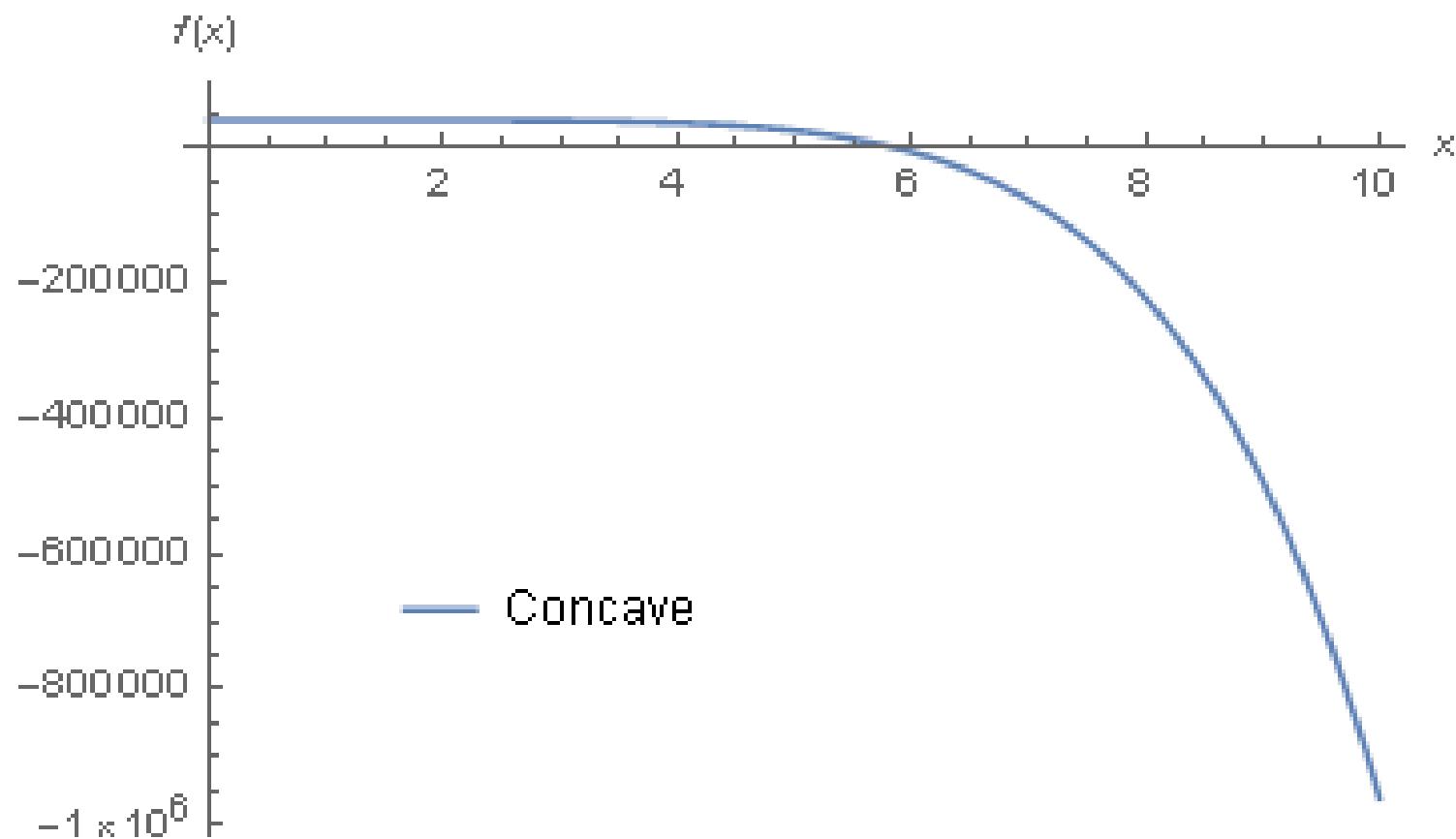
- Components/agents
  - Many
  - Not independent
  - Do not have a coherent behavior
- Aggregate systems
  - Non-linear behavior
  - Asymmetric response to interactions (2nd, 3rd order effects)
  - Tend towards antifragility

**Gall's Law:** A *complex system* that **works** is invariably found to have **evolved** from a *simple system* that worked. A complex system designed from scratch never works and cannot be patched up to make it work. You have to start over with a working simple system. – John Gall (1975)

# Antifragile-fragile

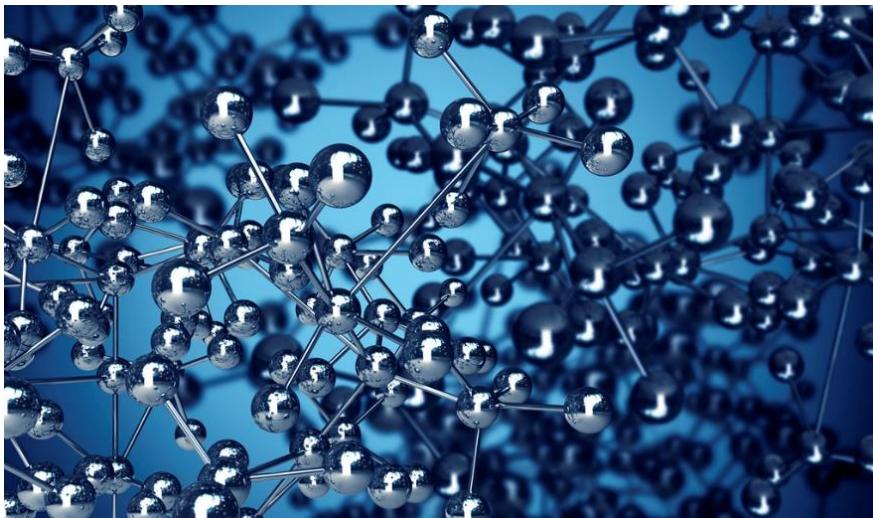


# Antifragile-fragile



# Statistical physics

- H<sub>2</sub>O – properties described by minimizing the free energy of the sysyem, relatively to the observable, macroscopic variables

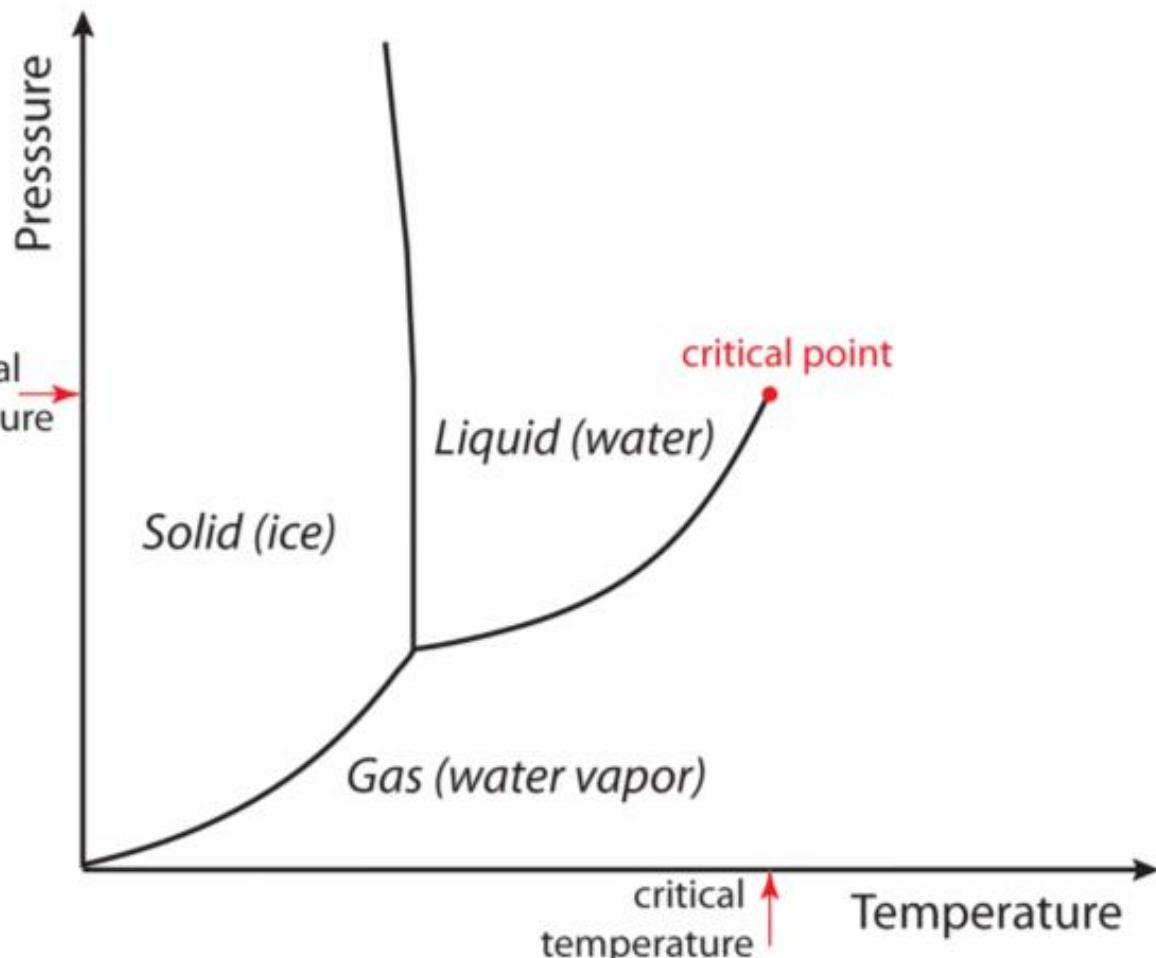


- Pressure
- Temperature
- Volume

These are averages

# The average method (*almost*) always works

- Doesn't work for transitions
  - Water – vapor
- 2nd order phase transition points)



# Density discontinuity disappears

- Power-law distribution
- Patches (liquid, gas)

$$\rho \propto d^\gamma$$

$$\gamma = 0.326$$

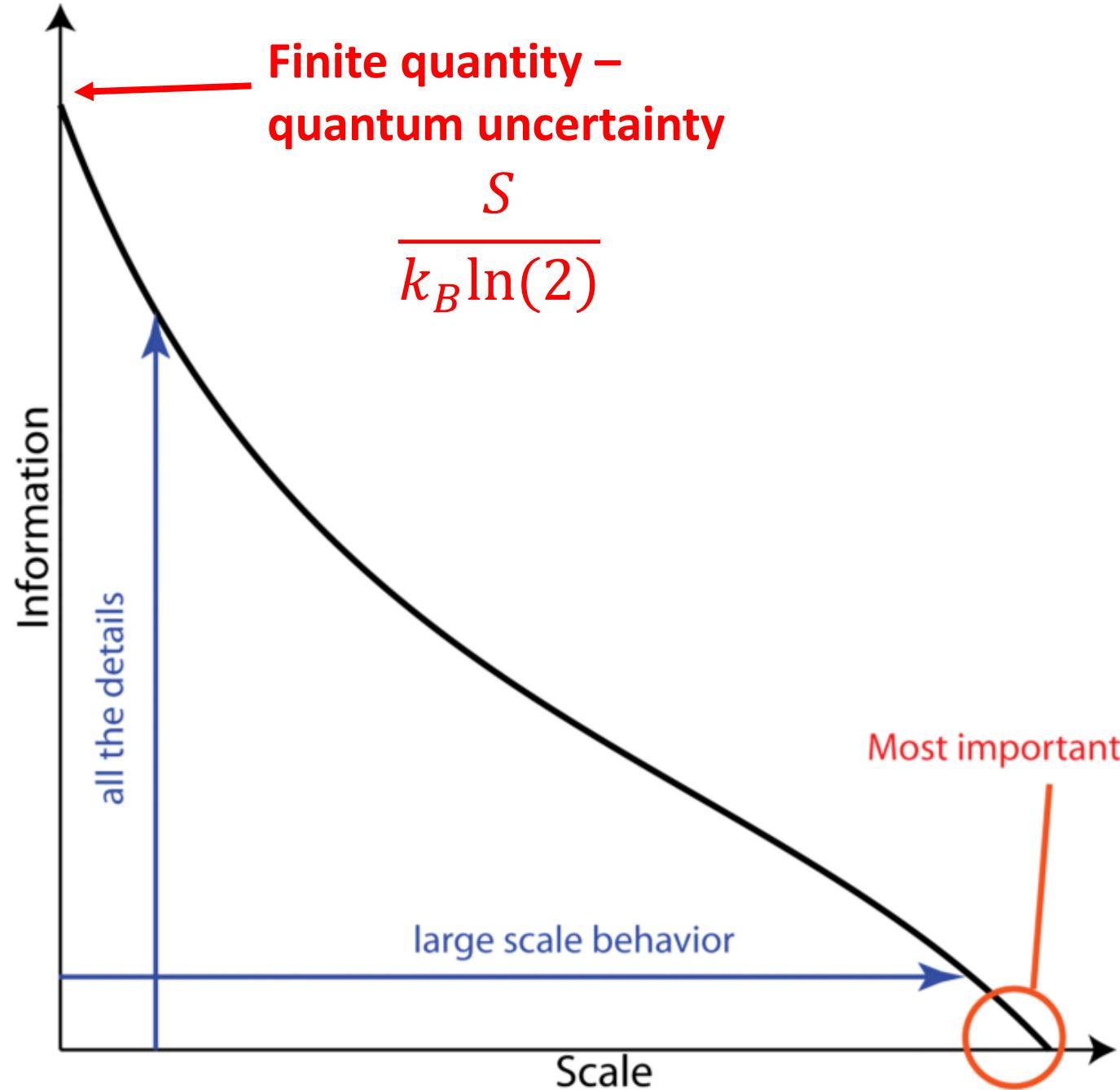
- Landau theory (minimizing free energy):  $\gamma = 0.5$
- False premises
  - Matter is homogenous – affects calculus
  - Local averages can be extrapolated – affects statistics

# Non-homogenously distributed patches

- **Group renormalization:** a method for identifying relevant parameters for the current scale

# Information as function of scale

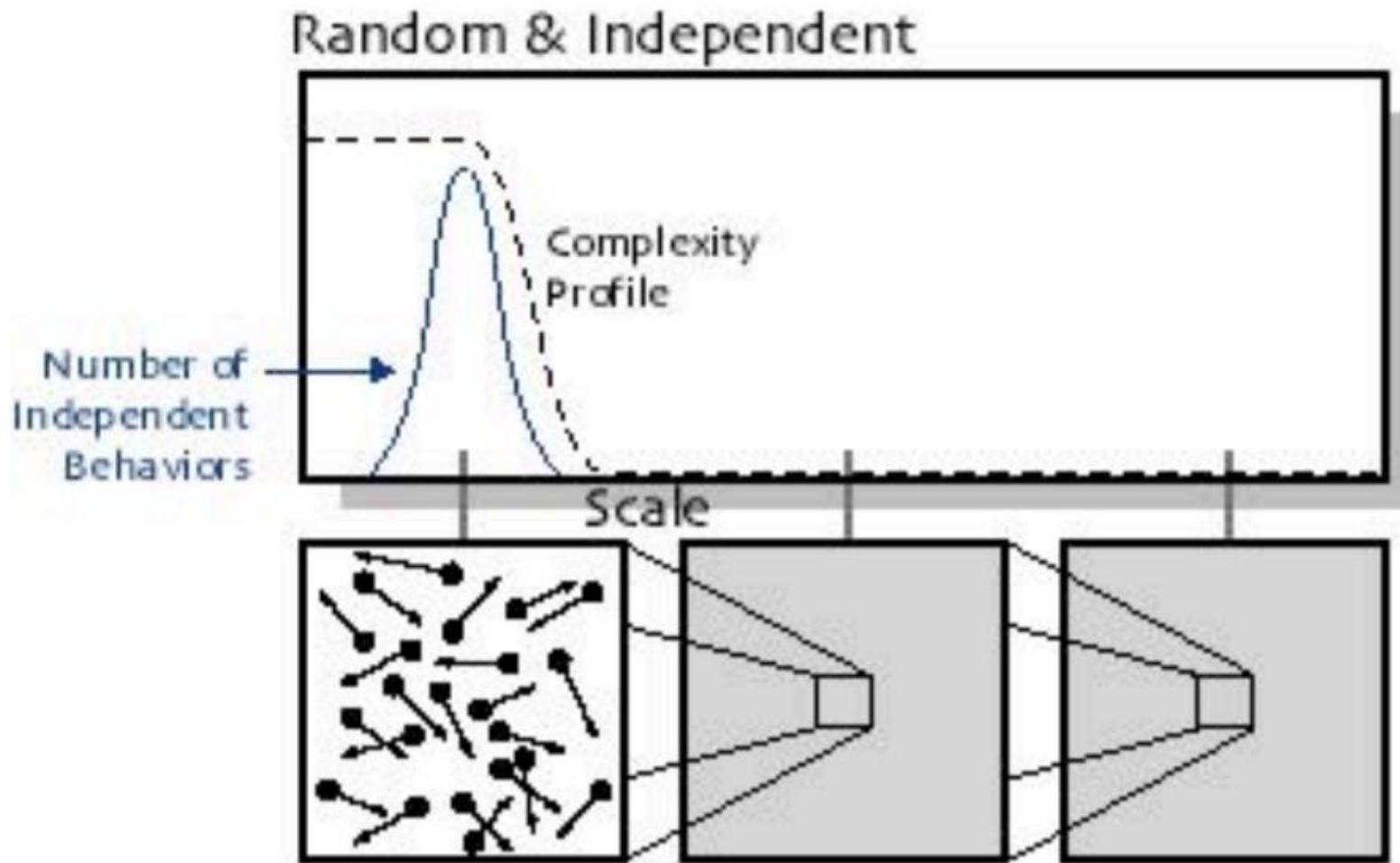
Complexity  
profile



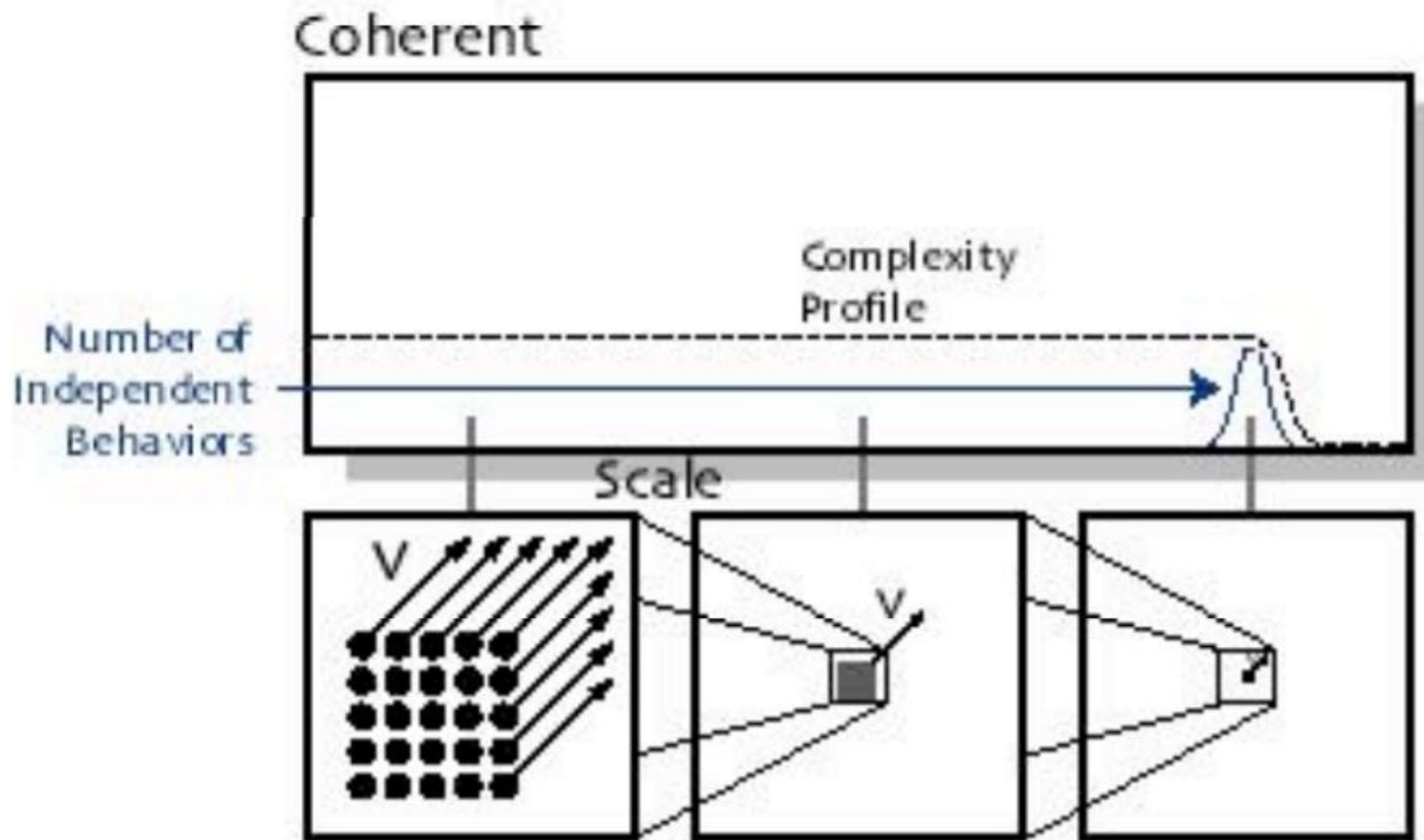
# Complexity profile for humans

Y. Bar-Yam, Complexity rising: From human beings to human civilization, a **complexity profile**, Encyclopedia of Life Support Systems, EOLSS UNESCO Publishers, Oxford, 2002

# Behavior types

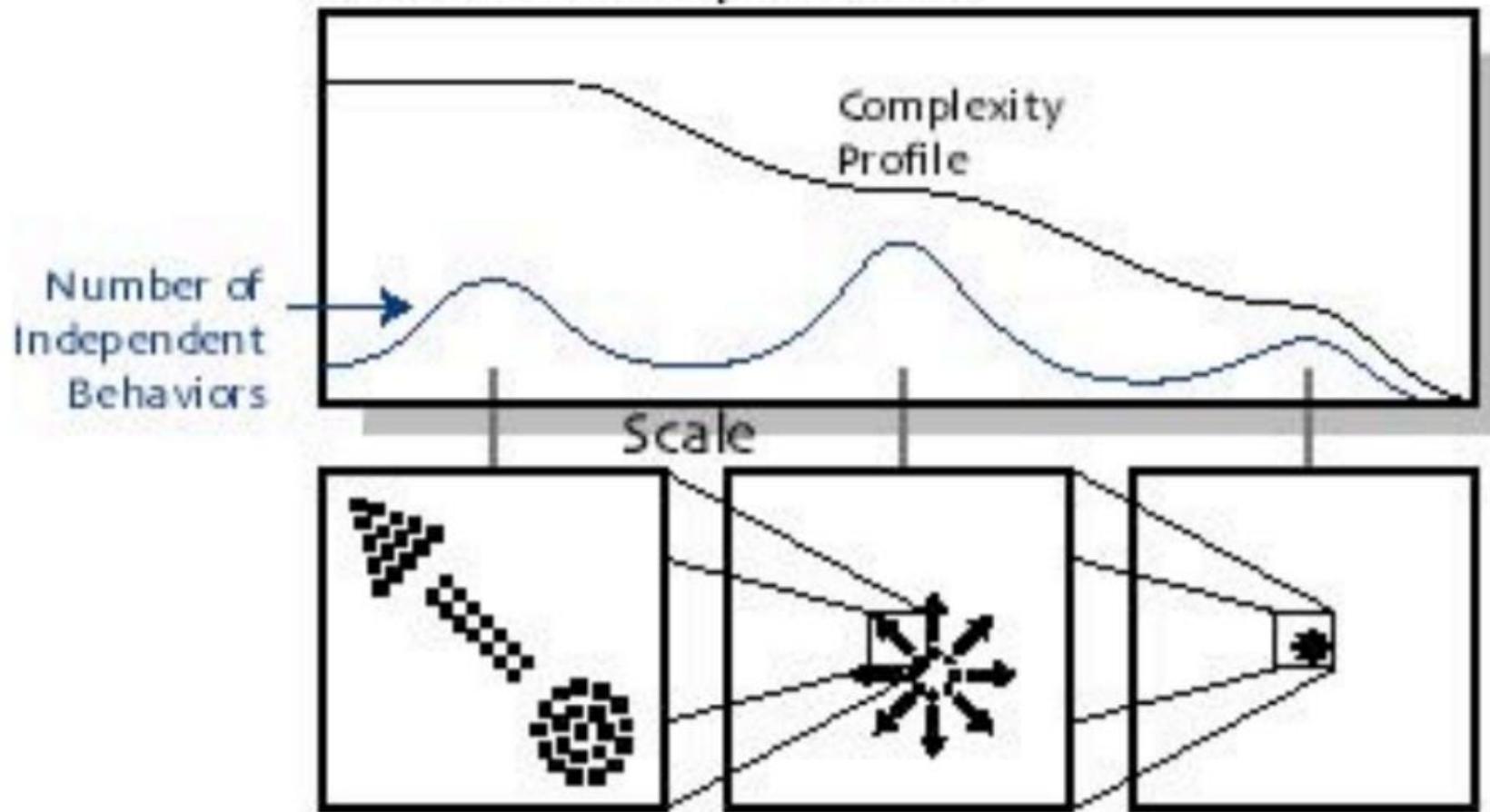


# Behavior types

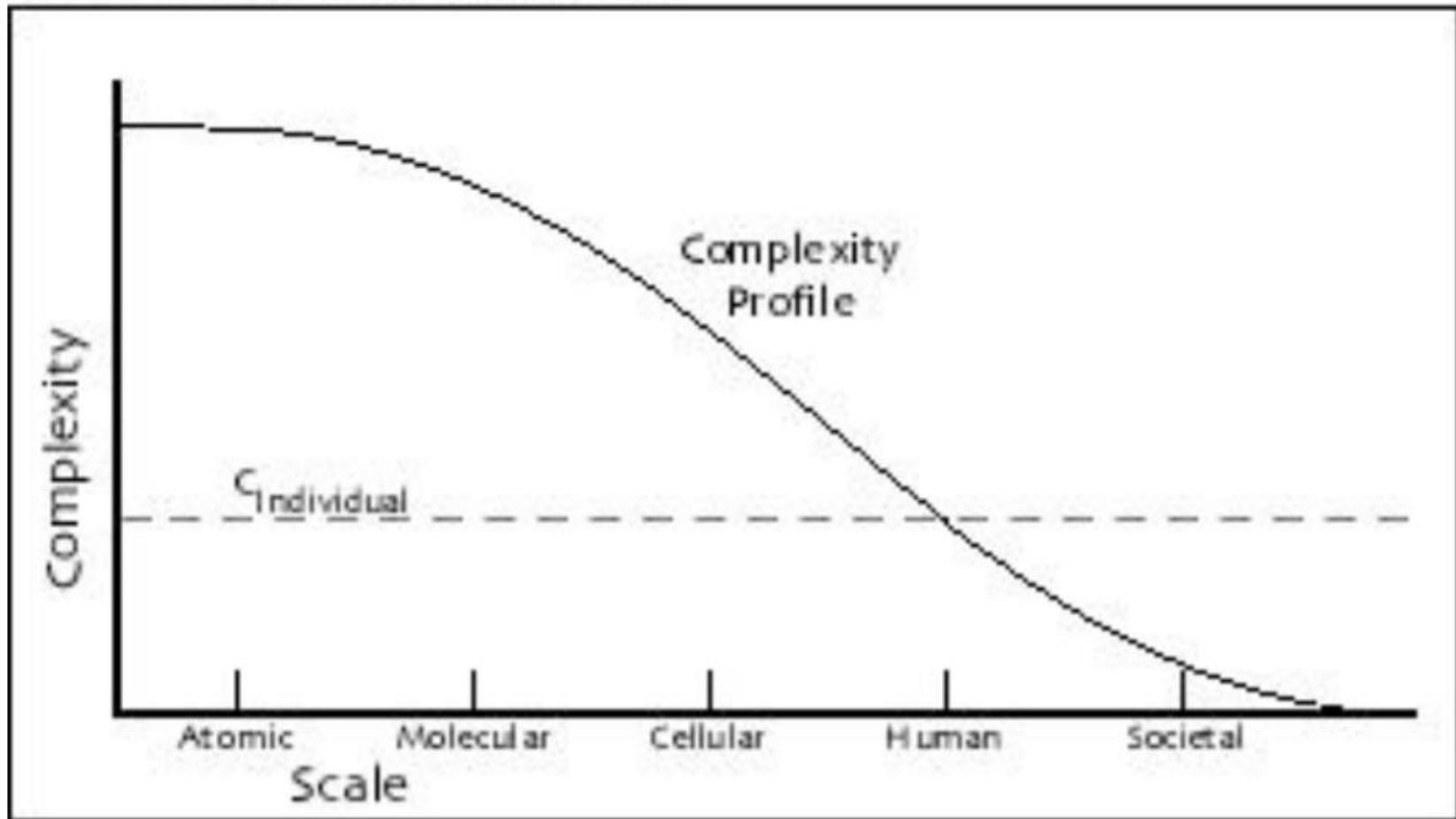


# Behavior types

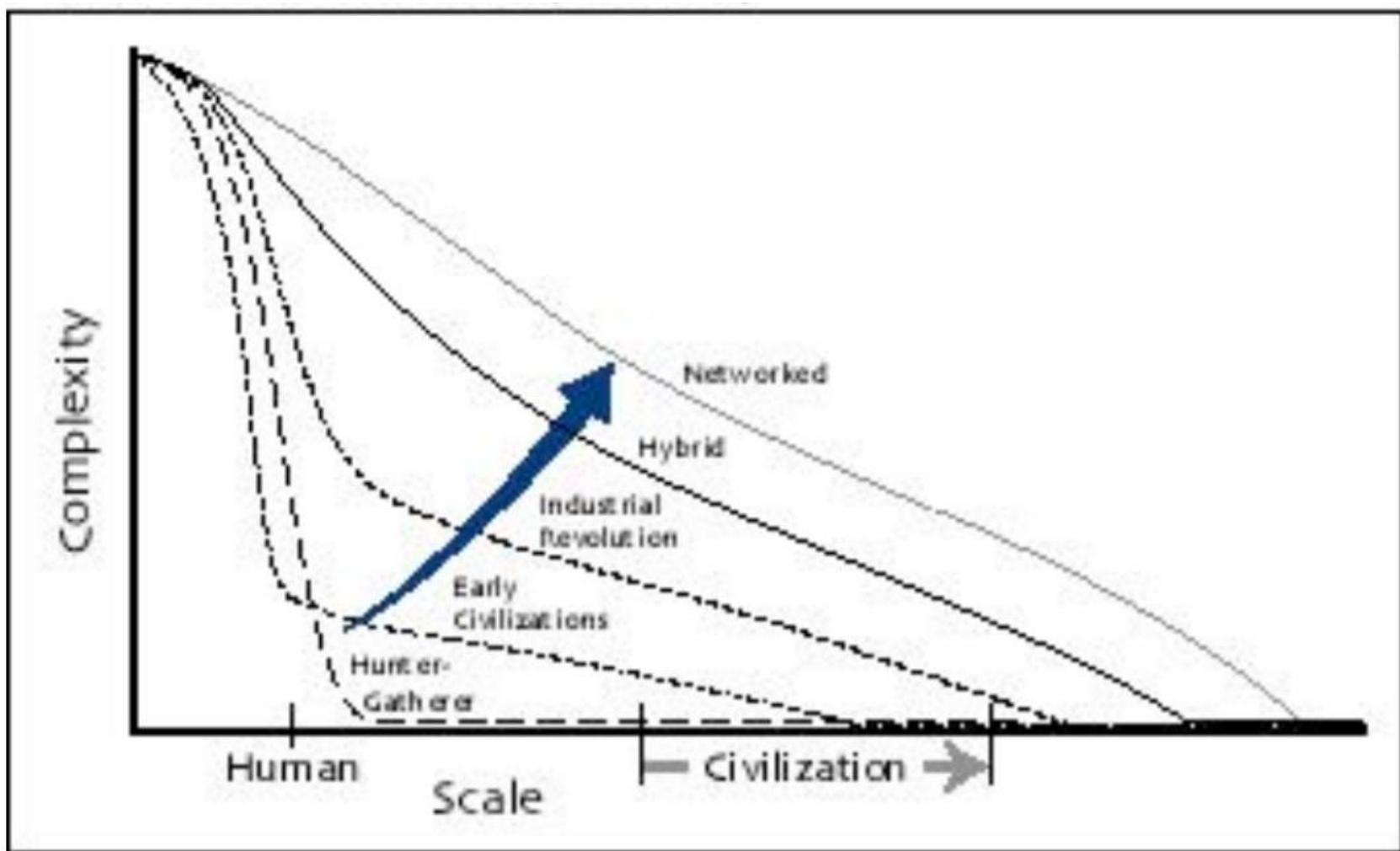
Correlated & Specialized



# Human complexity



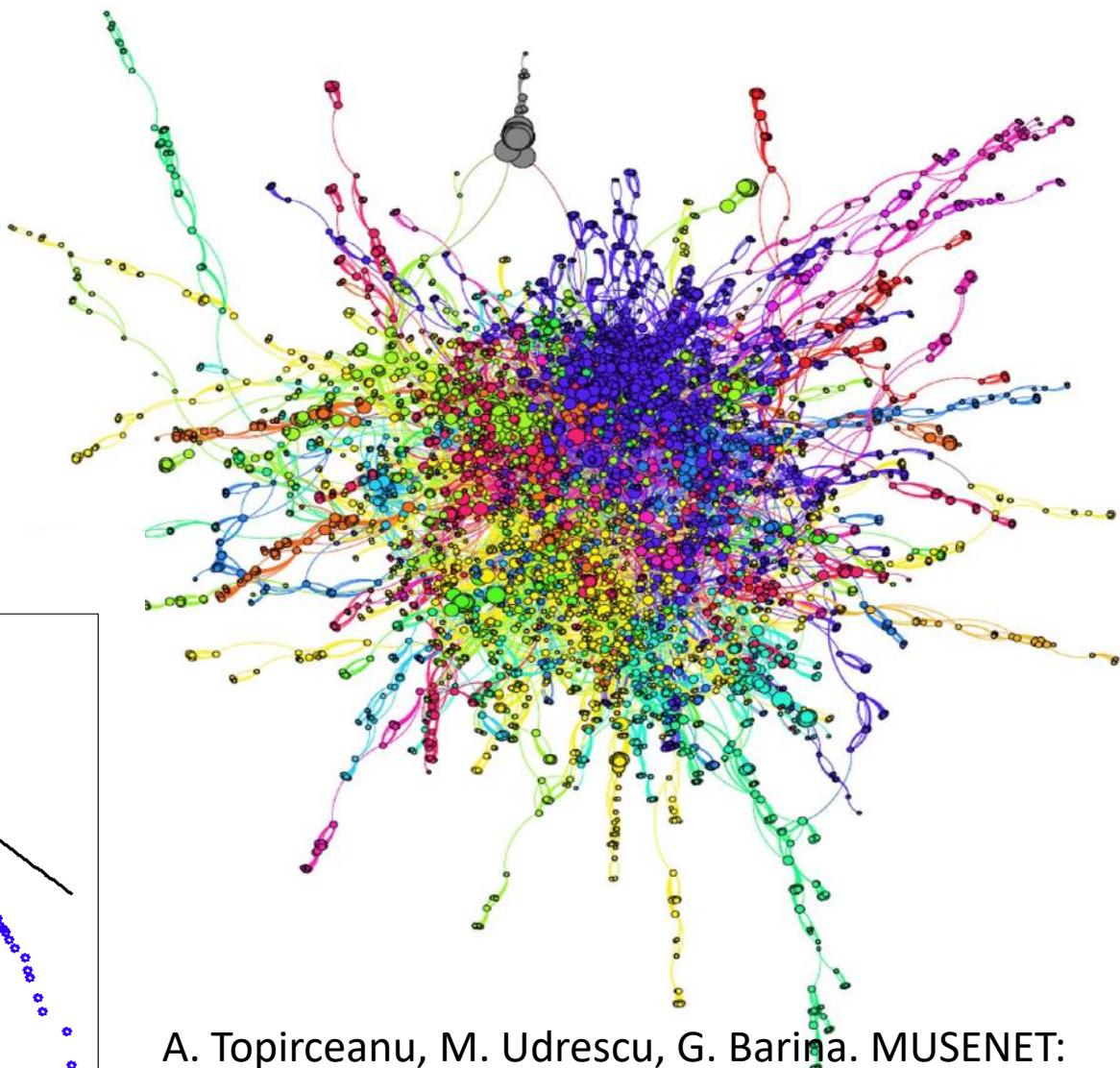
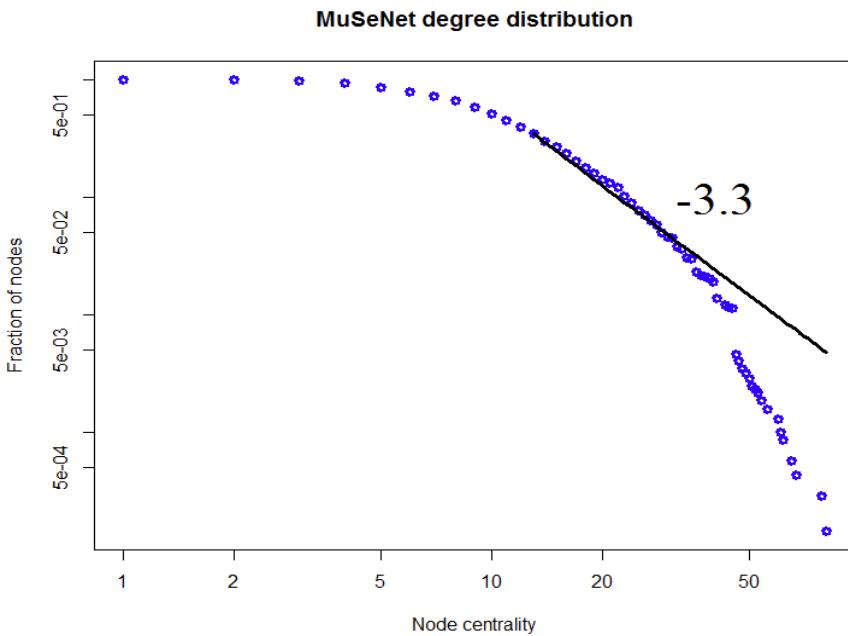
# Human complexity evolution



# Human collaboration

- MuseNET

$$p(x) = x^{-3.3}$$

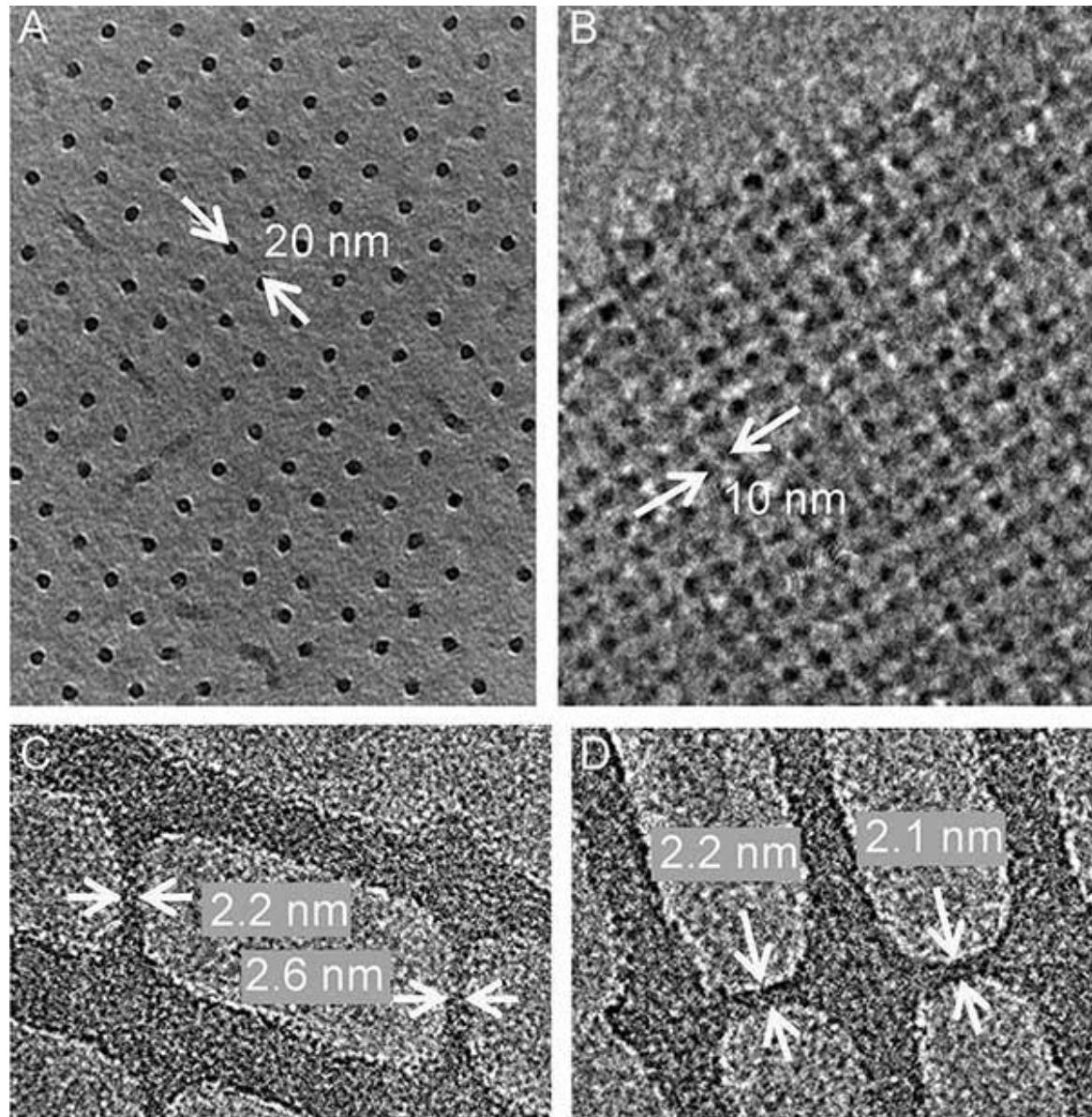


A. Topirceanu, M. Udrescu, G. Barina. MUSENET:  
Collaboration in the music artists industry.  
European Conf. Network Intelligence, 2015

**Are computers complex systems?**

# Computer systems: atomic level

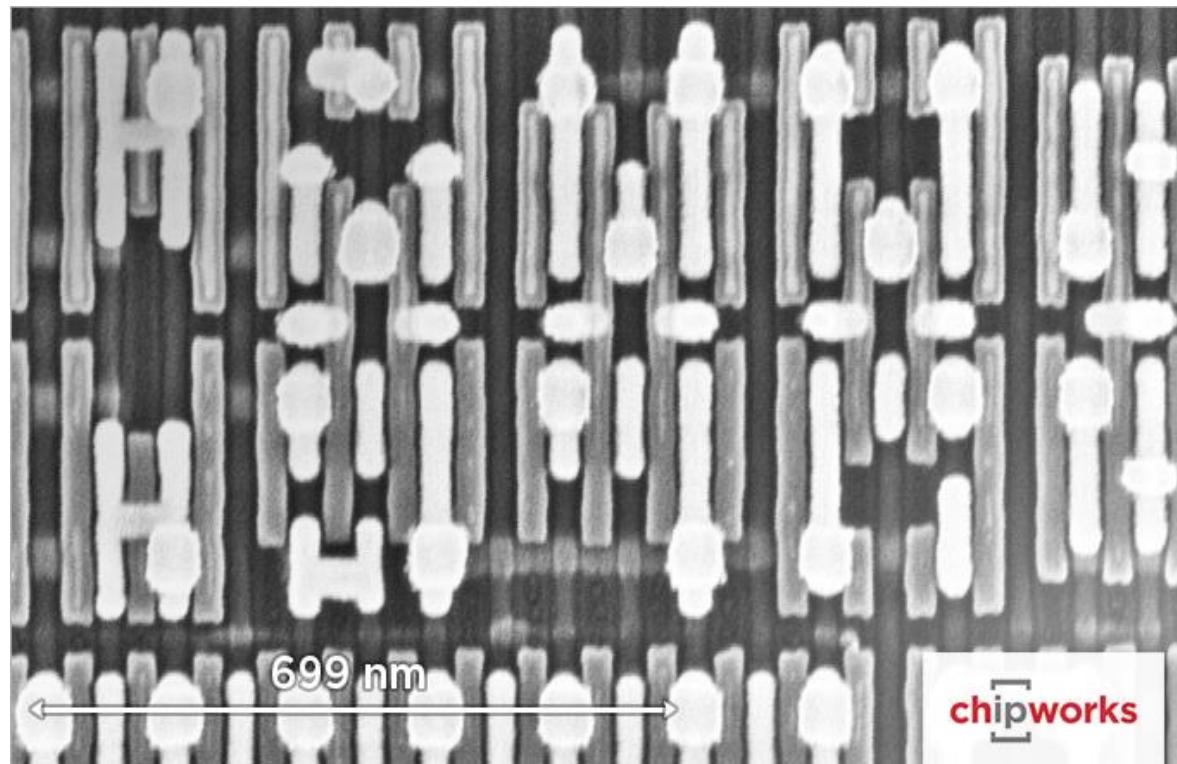
- 1 Si atom:  
 $\phi = 0.22 \text{ nm}$
- Crystallography:  
36 atoms in 14 nm
- AMD Polaris chip:  
232mm<sup>2</sup>
- **$\approx 10^{12} \text{ atoms/chip}$**



Sursa: V. R. Manfrinato et. al. Resolution Limits of Electron-beam Lithography toward the Atomic Scale. MIT Annual Research Report, 2013

# Computer systems: transistor-level

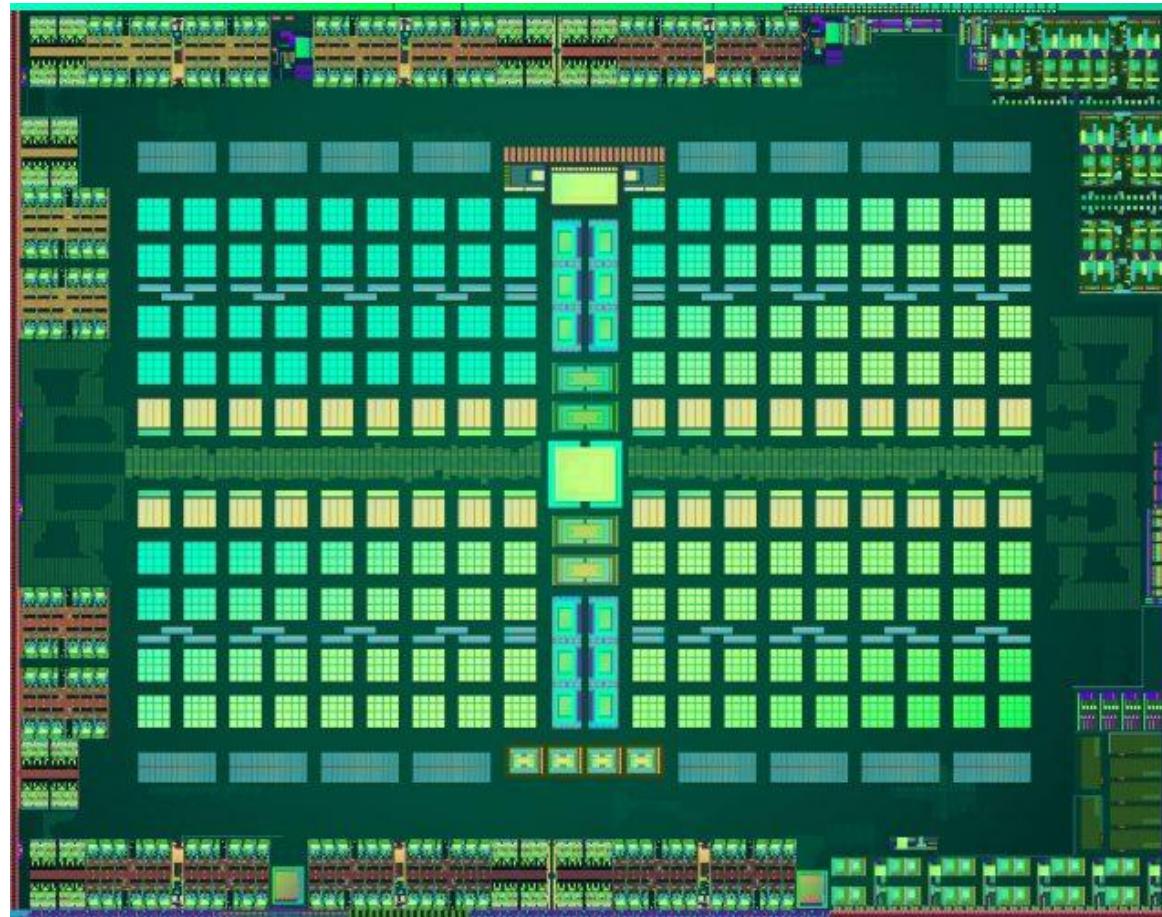
- Tranzistori FinFET 14nm, Broadwell chip
  - **$5.7 \times 10^9$**  in AMD Polaris Radeon RX 480(Ellesmere X)



Sursa: chipworks

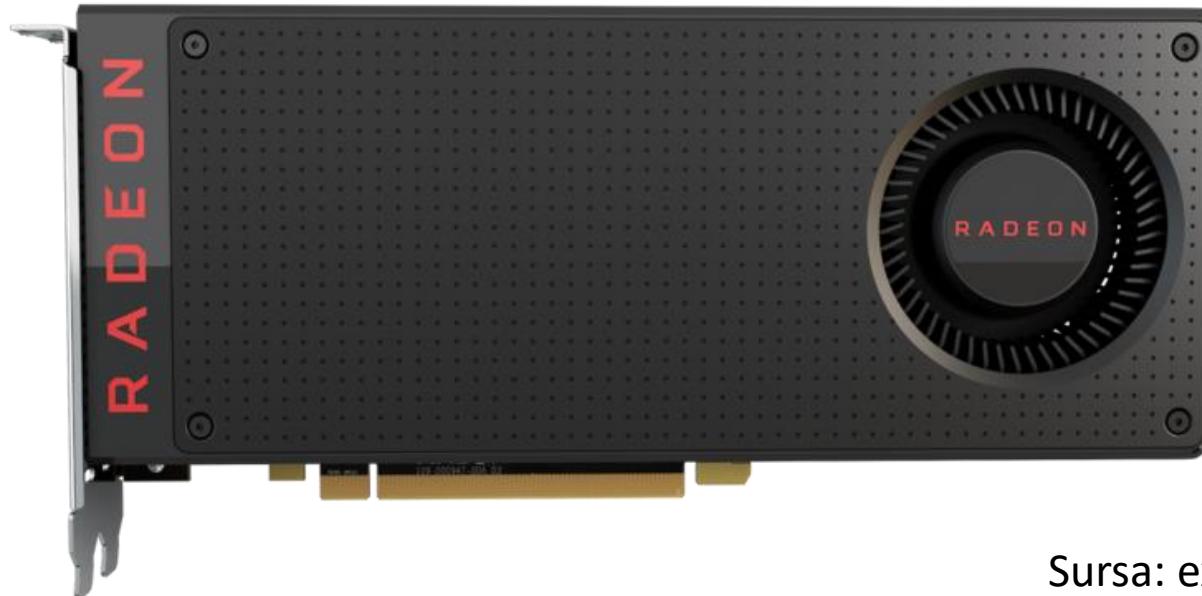
# Computer system: chip level

- AMD Polaris: 2304 GPU cores,  $232 \text{ mm}^2 \approx (16 \text{ mm})^2$



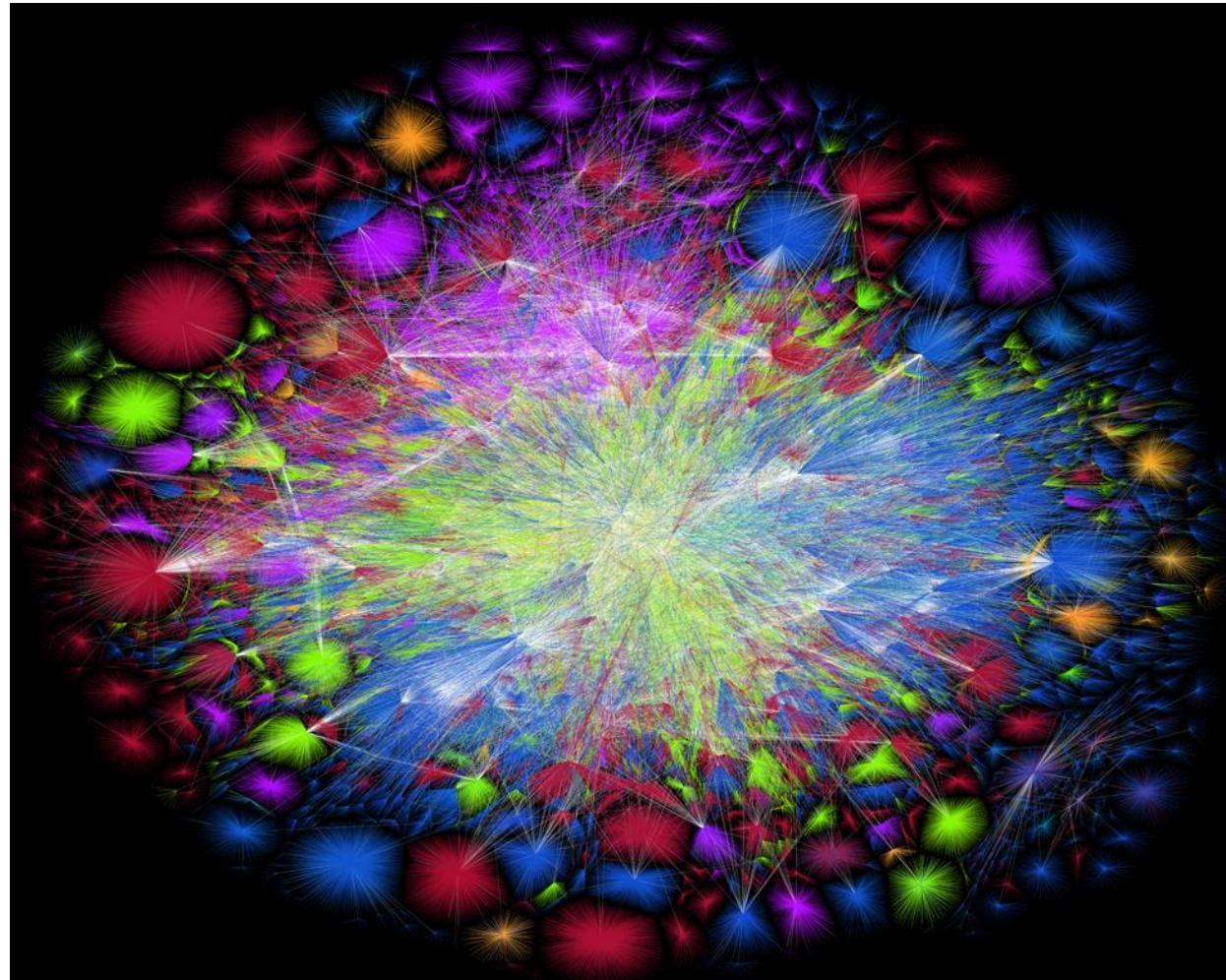
# Computer system: system level

- Performance: 5834 GFLOPS > 5TFLOPS =  $5 \times 10^{12}$  FLOPS
  - Information: 2304 cores  $\times$  16KB core state  $\approx$  **36  $\times$  10<sup>6</sup>**
  - Scală: 0.241m

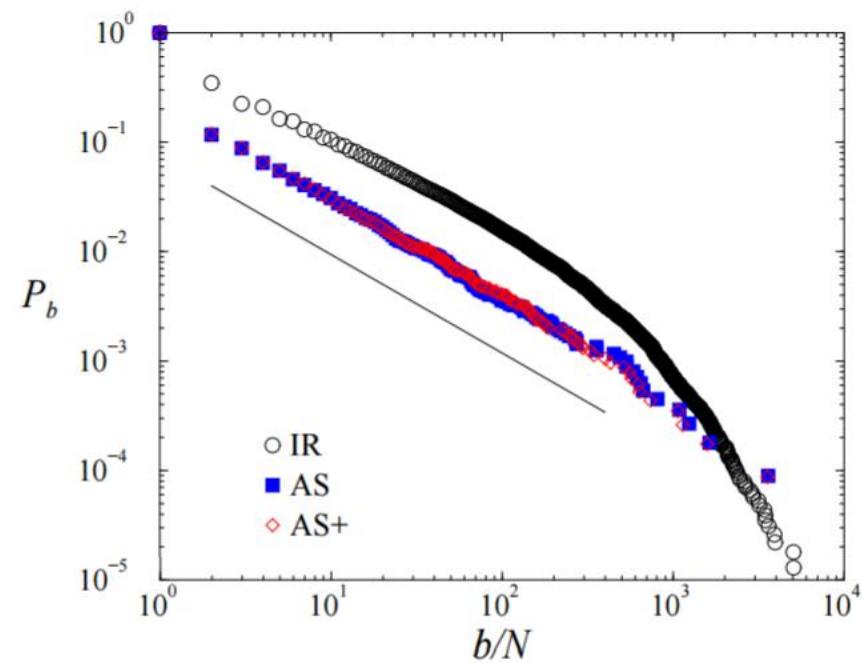
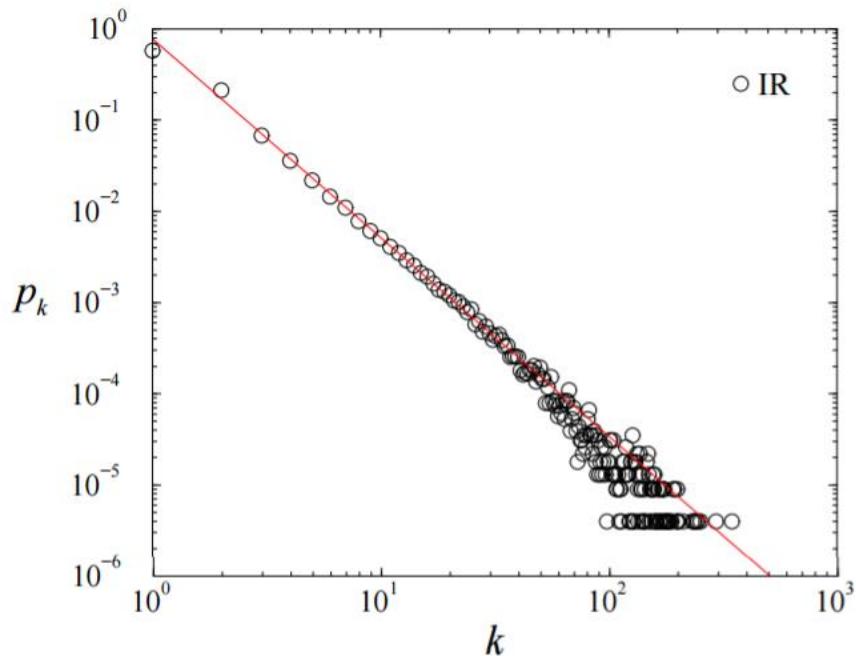


# Computer system: network level

- Internet 2015
- 2015: IPv4 used all addresses
  - $2^{32} = 4 \times 2^{30} \approx 4 \times 10^9$
- IPv6
  - $2^{128} \approx 4.3 \times 10^{38}$
- Scale:  
12,742 km  
(Earth diameter)



# Computer system: network level



- Power law de *degree* and *betweenness* distributions
- $p(x) = x^{-\gamma}$ 
  - $\gamma = 2.1$  (degree)
  - $\gamma = 1.9$  (betweenness)

Sursa: A. Vazquez et al. Internet topology at the router and autonomous system level . ArXiv 2002

# Computer system: global network

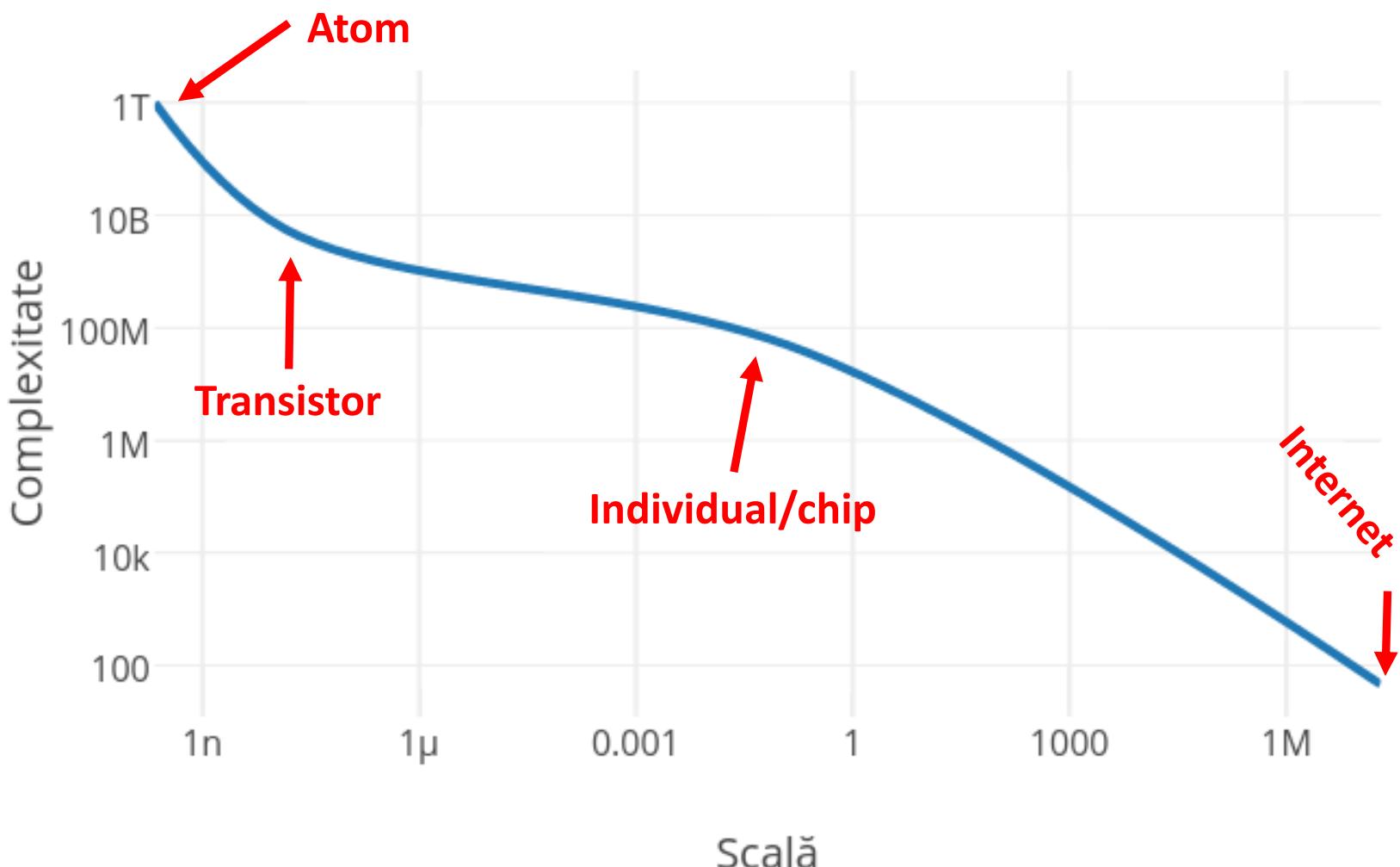
- “Temperature” of the Internet
  - Internet bandwidth

Cisco Visual Networking Index

$$\frac{\text{Data sent in 1 year}}{\text{Seconds in 1 year}} = \frac{1.1 \times 2^{70} \text{ [bytes/year]}}{0.03154 \times 2^{30} \text{ [seconds]}}$$
$$= 34.8 \times 2^{40} \text{ bytes/second} = 34.8 \text{ Tbytes/second}$$

- M. Hilbert, P. Lopez. The World's Technological Capacity to Store, Communicate, and Compute Information, Science, 2011

# Complexity profile for computer systems



**Computers are complex  
systems**

# Textbooks

