

# The Future of Advanced Computing: It's Uncertain



Dan Reed

Vice President for Research and Economic Development

University Computational Science and Bioinformatics Chair

Computer Science, Electrical Engineering & Computer Engineering, and Medicine

[dan-reed@uiowa.edu](mailto:dan-reed@uiowa.edu)

[www.hpcdan.org](http://www.hpcdan.org)



THE UNIVERSITY  
OF IOWA

# Discussion roadmap

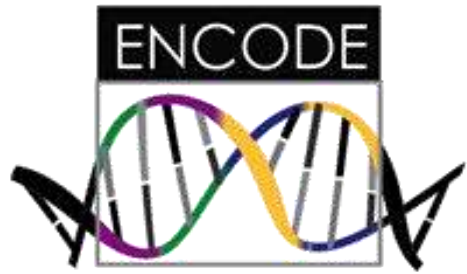
Changing nature of science

Technology lessons and exponentials

Re-conceptualizing advanced computing

Thoughts on the future





Human Genome Functional Elements

$$W = \int_{k < \Lambda} [Dg][DA][D\psi][D\Phi] \exp \left\{ i \int d^4x \sqrt{-g} \left[ \frac{m_p^2}{2} R - \frac{1}{4} F_{\mu\nu}^a F^{a\mu\nu} + i \bar{\psi}^i \gamma^\mu D_\mu \psi^i + (\bar{\psi}_L^i V_{ij} \Phi \psi_R^j + \text{h.c.}) - |D_\mu \Phi|^2 - V(\Phi) \right] \right\}$$

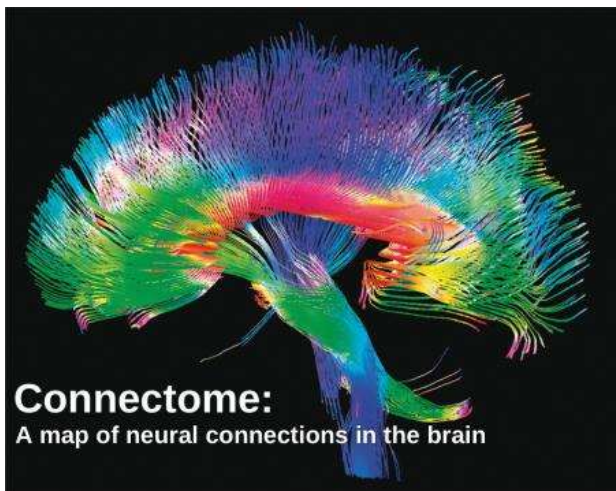
Quantum mechanics
spacetime gravity

Other forces
matter
Higgs

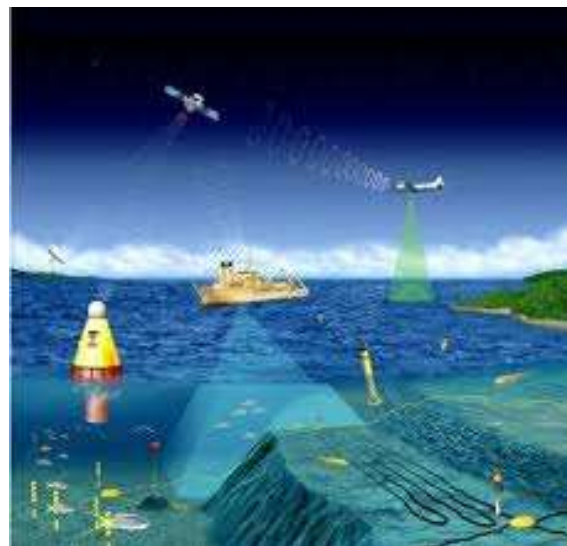
<http://www.preposterousuniverse.com>



Large Synoptic Survey Telescope



Brain Connectome



Ocean Observing System



Square Kilometer Array



# Square Kilometer Array (SKA)

BIG, Big, big data

## Structure

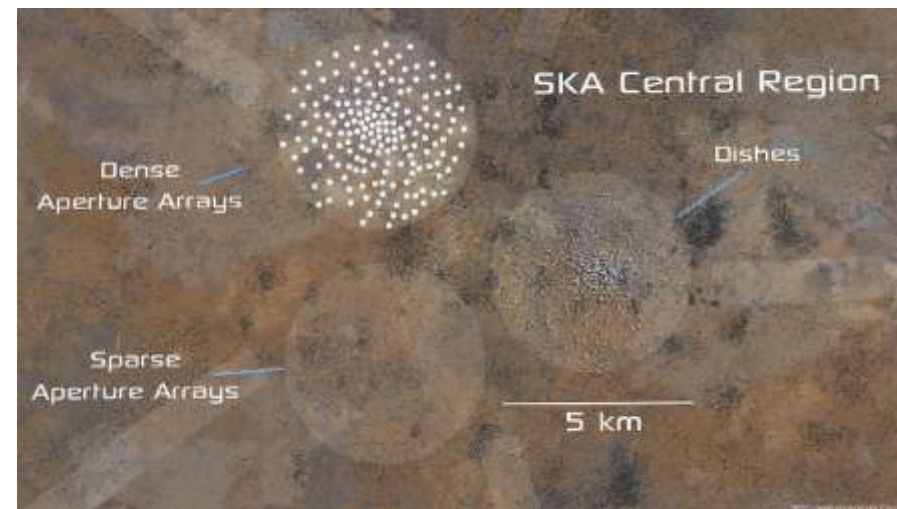
- SKA-MID (South Africa) with ~2000 15m dishes
- SKA LOW (Australia) with ~1 million dipole antennas
- Spread over 3000 km with construction in 2018 ...
- 50 MHz – 14 GHz coverage; 100X sensitivity;  $10^6$  faster

## Science

- Galaxy evolution and dark energy
- Gravitational waves
- Dark Ages look back

## Data and processing

- From 100 PB/day to 10,000 PB/day
- Real-time reduction at exascale levels
  - World's biggest FFTs



# Ocean Observing Initiative (OOI)

## Heterogeneous data



### Structure

- Coastal and Global Scale Nodes (CGSNs)
  - Buoys, moorings, cables and AUVs
- Regional Scale Nodes (RSNs)
  - 900 km of cabled sensor arrays

### Science

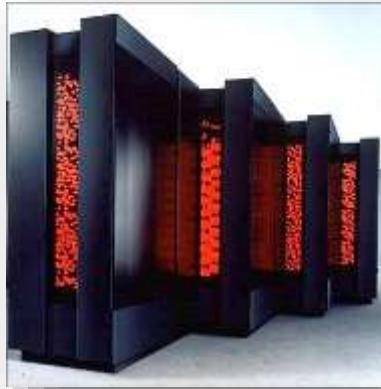
- Ocean-atmosphere exchange
- Climate variability
- Turbulent mixing and biophysical interactions
- Coastal ocean dynamics
- Geophysics and geodynamics

### Data and processing

- Extremely heterogeneous data
- Complex software and data products



# Computing transitions: Riding the economic wave



**Mainframes**

**Vectors**  
(1980s)

**MPPs**  
(1990s)

**Clusters & Grids**  
(2000s)

Clouds, Big Data  
and Devices

Relational  
DBMS

Object-oriented  
DBMS

"No SQL"  
DBMS

Map-Reduce



The talent in data analytics have shifted from science to companies. We can't compete.

*Astronomy researcher*



# Quantitative begets qualitative

## Four computing capabilities

- Networking – delivering questions and answers
- Computation – transforming data into insights
- Data access – timely access to data by computations
- Storage – long-term data retention

## Three defining attributes ...

- Speed, capacity and cost

... and their ratios determine viability

## Exponentials are very deceptive

- Early, the future looks like the past
- *Suddenly, everything is different*



Seagate 2 TB Disk



200 MB disk pack  
(Wikipedia)



# Generation after generation

Disrupted from below by 10X



Volume  
Unit price  
Market size



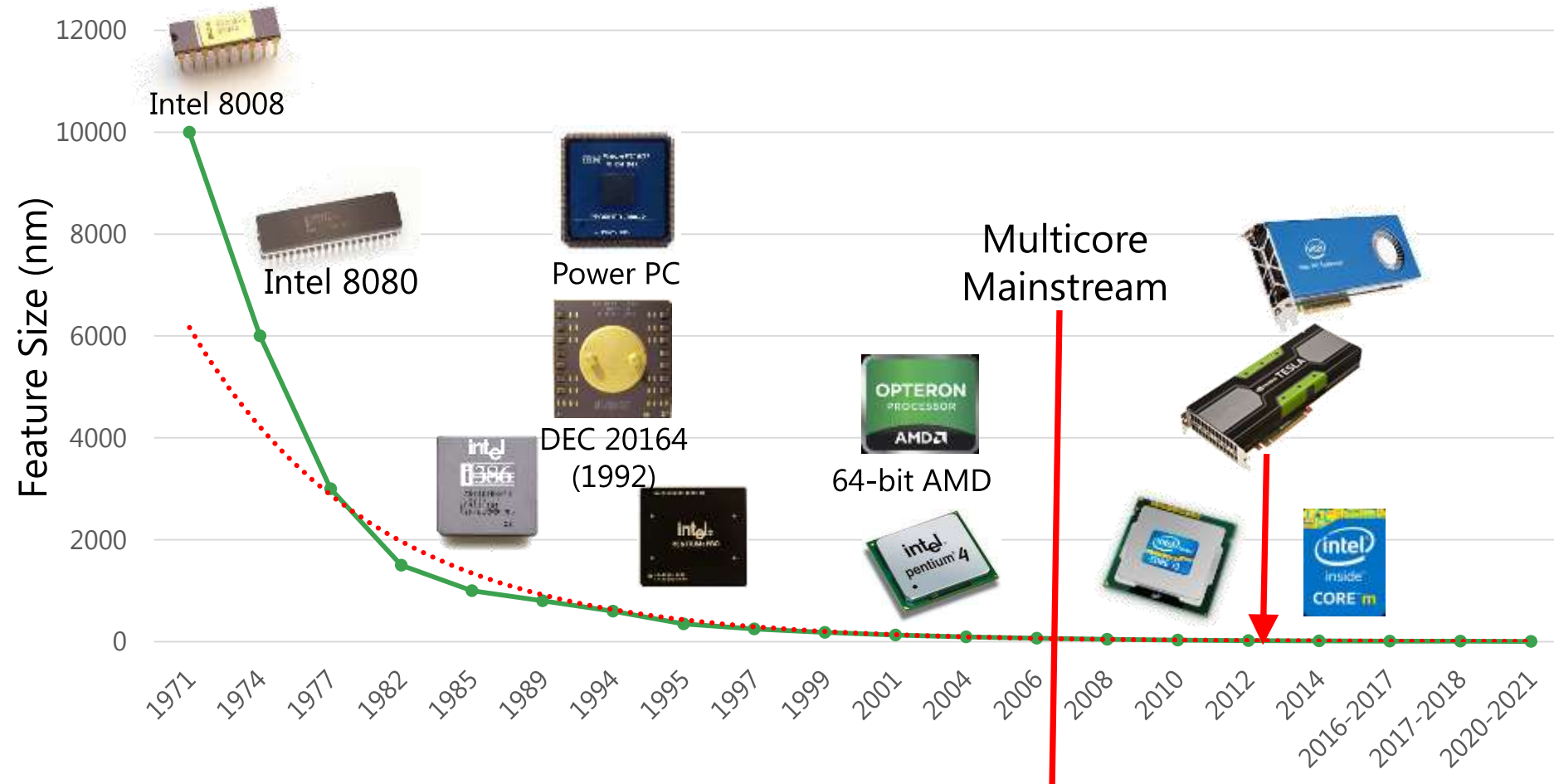
Frozen here?

Market disruption  
Performance/\$  
Societal impact



# Chip feature sizes

No exponential is forever (except in the textbooks)

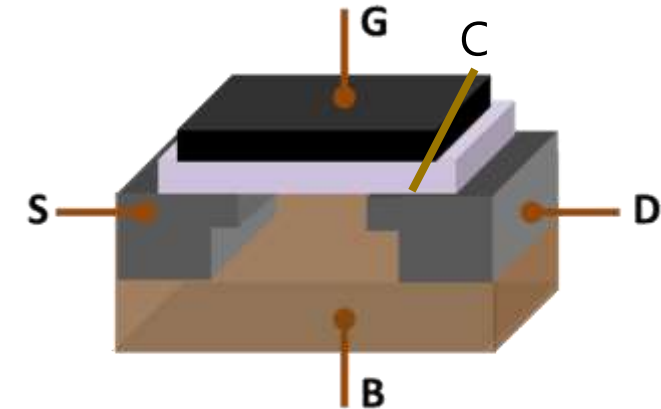


# Room at the bottom: less and less

Yeah, we did that – Dennard scaling has come and gone

Why can't we make them [computers] very small, make them of little wires, little elements – and by little, I mean *little*. For instance, the wires should be 10 or 100 atoms in diameter, and the circuits should be a few thousand angstroms across. Everybody who has analyzed the logical theory of computers has come to the conclusion that the possibilities of computers are very interesting – if they could be made to be more complicated by several orders of magnitude.

Richard Feynman  
December 29, 1959



MOSFET (Wikipedia)  
G (gate), S (source)  
D (drain) and C (channel)

$$CV^2F + S$$

The experts look ahead

## Cramming more components onto integrated circuits

With unit cost falling as the number of components per circuit rises, by 1975 economics may dictate squeezing as many as 65,000 components on a single silicon chip

By Gordon E. Moore

Director, Research and Development Laboratories, Fairchild Semiconductor Division of Fairchild Camera and Instrument Corp.

The future of integrated electronics is the future of electronics itself. The advantages of integration will bring about a proliferation of electronics, pushing this science into many new areas.

Integrated circuits will lead to such wonders as home computers—or at least terminals connected to a central computer—automatic controls for automobiles, and portable communications equipment. The electronic watch needs only a display to be feasible today.

But the biggest potential lies in the production of large systems. In telephone communications, integrated circuits in digital filters will separate channels on multiplex equipment. Integrated circuits will also switch telephone circuits and perform data processing.

Computers will be more powerful, and will be organized in completely different ways. For example, memories built of integrated electronics may be distributed throughout the

machine instead of being concentrated in a central unit. In addition, the improved reliability made possible by integrated circuits will allow the construction of larger processing units. Machines similar to those in existence today will be built at lower costs and with faster turn-around.

### Present and future

By integrated electronics, I mean all the various technologies which are referred to as microelectronics today as well as any additional ones that result in electronics functions supplied to the user as productive units. These technologies were first inaugurated in the late 1950's. The subject was to miniaturize electronics equipment to include increasingly complex electronic functions in limited space with minimum weight. Several approaches evolved, including monolithic techniques for individual components, thin-film structures and semiconductor integrated circuits.

Each approach evolved rapidly and converged so that each borrowed techniques from another. Many researchers believe the way of the future to be a combination of the various approaches.

The advantages of semiconductor integrated circuitry are already being realized. The improved characteristics of thin-film structures by applying such films directly to an active semiconductor substrate. These advantages are technology based upon films are developing sophisticated techniques for the attachment of active semiconductor devices to the passive film-structure.

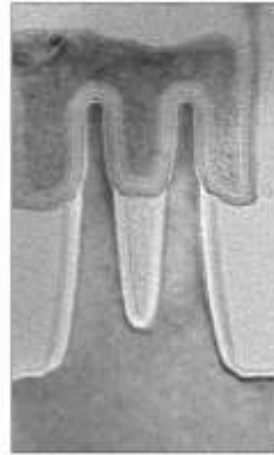
Both approaches have worked well and are being used in equipment today.

### The author

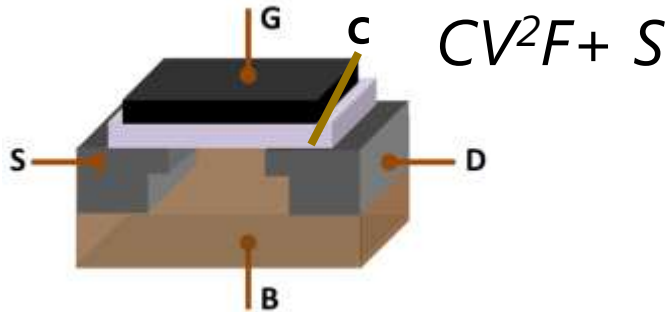


Dr. Gordon E. Moore is one of the new breed of electronic engineers, schooled in the physical sciences rather than in electronics. He earned a B.S. degree in chemistry from the University of California and a Ph.D. degree in physical chemistry from the California Institute of Technology. He was one of the founders of Fairchild Semiconductor and has been director of the research and development laboratories since 1955.

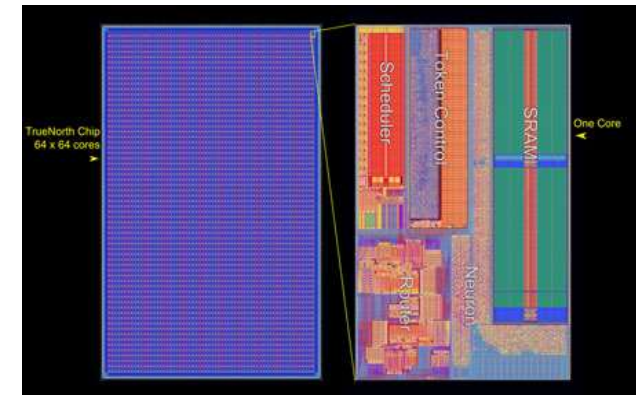
Electronics, Volume 28, Number 4, April 15, 1962



14 nm 2<sup>nd</sup> Generation Tri-gate Transistor



$$CV^2F + S$$



IBM True North chip  
4096 cores x 256 neurons



Cryofab

# Inflection points nearby



# A bit of inflection point history

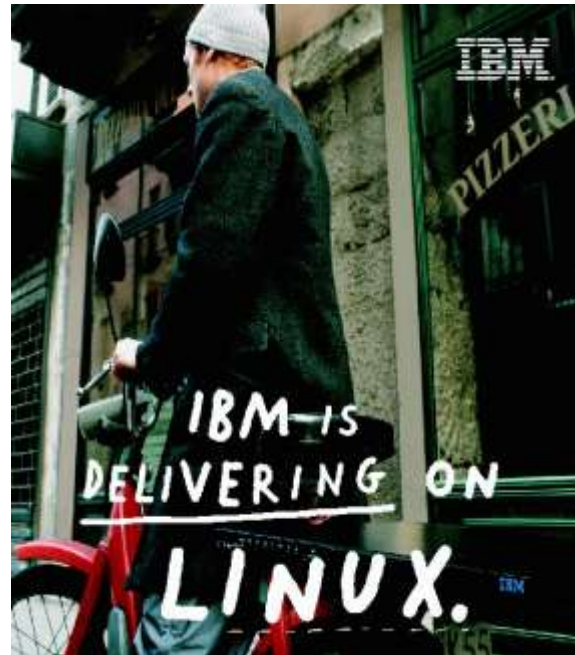
## NCSA terascale and PlayStation2 clusters (~2001)

### 1 TF IA-32 Pentium III cluster (Platinum)

- 512 1 GHz dual processor nodes
- Myrinet 2000 interconnect and 5 TB of RAID storage
- 30th on Top500 list (world's fastest Linux cluster)

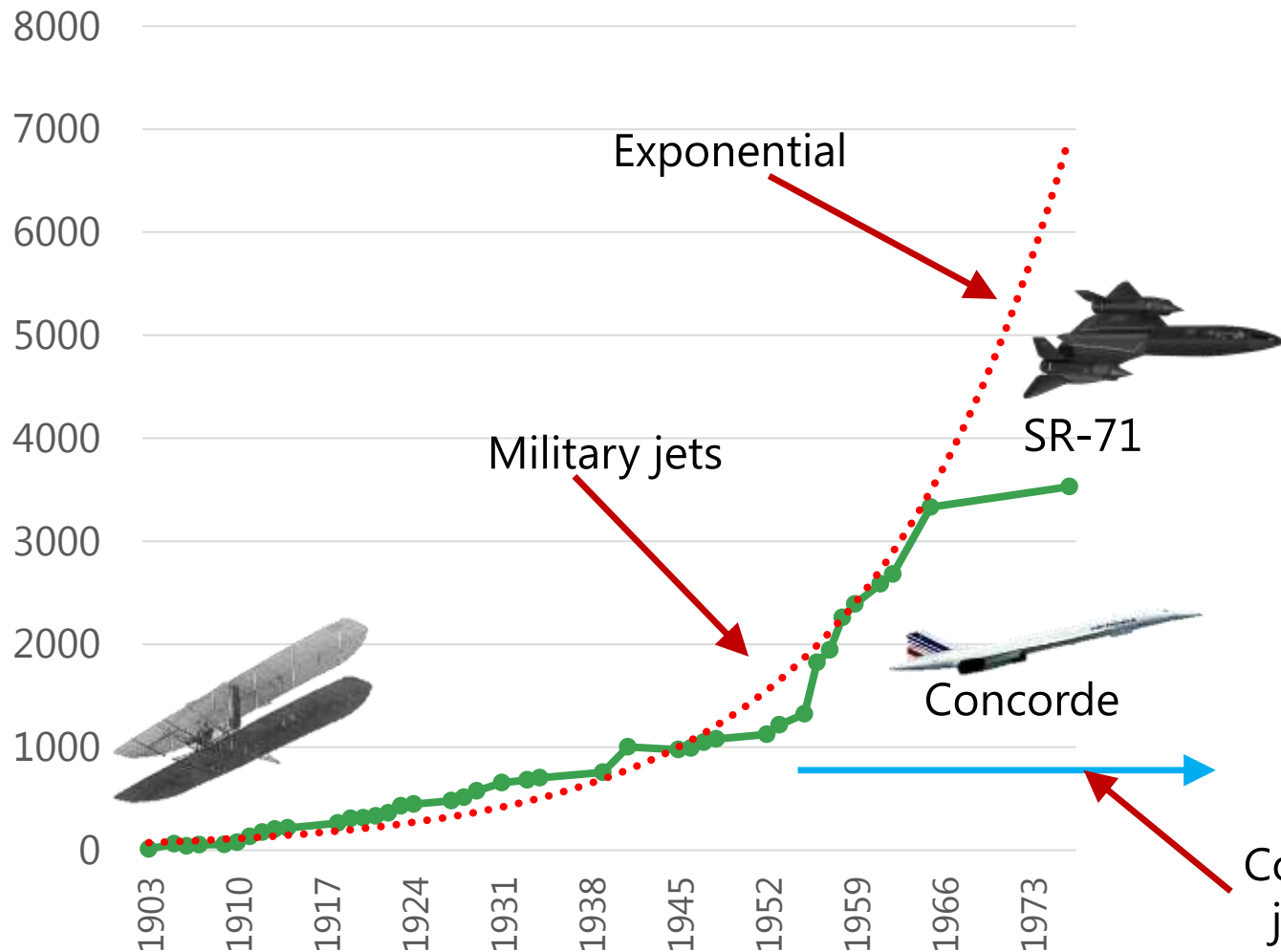
### 1 TF IA-64 Itanium cluster (Titan)

- 164 800 MHz dual processor nodes
- Myrinet 2000 interconnect



# A lesson from another domain

## Airspeed records (kilometers/hour)



Loci of airplane innovation shifted

- Capacity
- Range
- Safety
- Yield management
- Avionics
- Fuel efficiency
- Carbon composites

... but it has never stopped

Computing loci are also shifting

Commercial jet speed



# Diverging cultures

Technical application complexity is rising

- Multidisciplinary fusion
- Temporal and spatial adaptation
- Data assimilation and processing

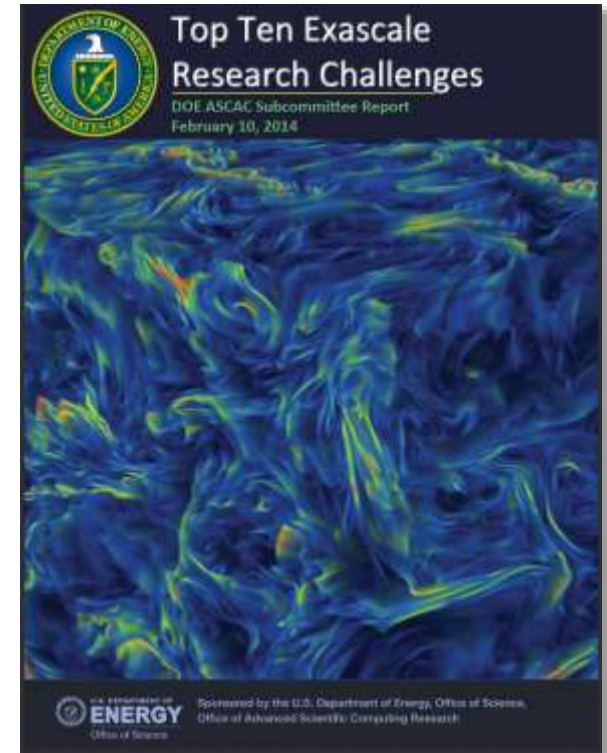
... along with multiple optimization axes

- Massive parallelism with heterogeneous cores
- Resilience/reliability at large scale
- Energy optimization for utility

C, Fortran,  
C++, MPI,  
OpenMP

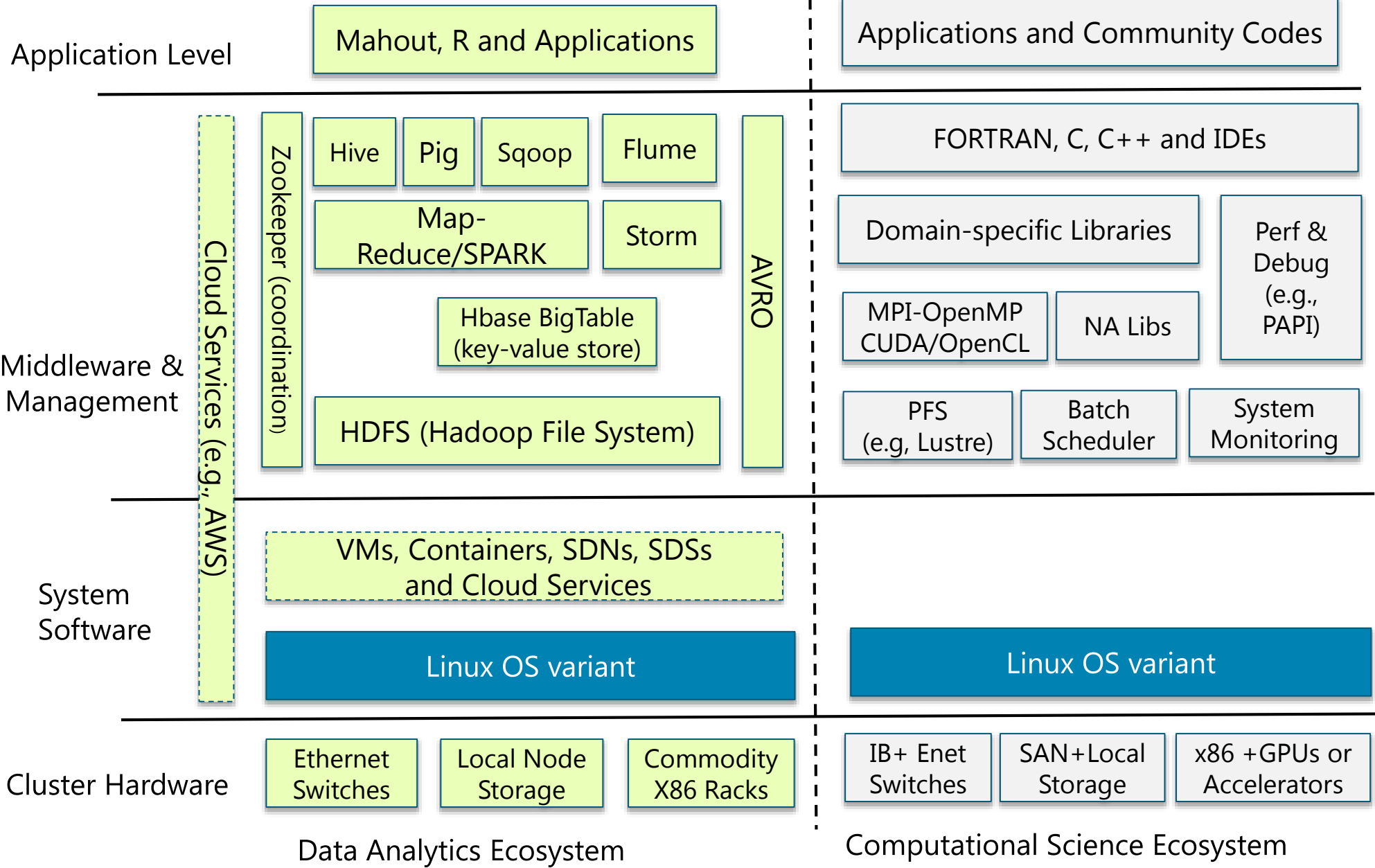
Python, Ruby, R  
Cloud/Web  
Services

***Technical and mainstream software development have diverged***





# Divergent ecosystems



# Recommender techniques

## Item hierarchy (Amazon)

- You bought a Kindle™, you'll want a cover

## Attributes (Pandora)

- You like 70's pop, you'll like *Simon and Garfunkel*

## Item similarity (Netflix)

- You liked *Batman*, you'll like *Spiderman*

## User similarity (Walmart)

- People who buy beer generally buy chips

## Social network (Linkedin)

- Your connections liked this job posting, so will you

## **Model based (HPC challenges and needs)**

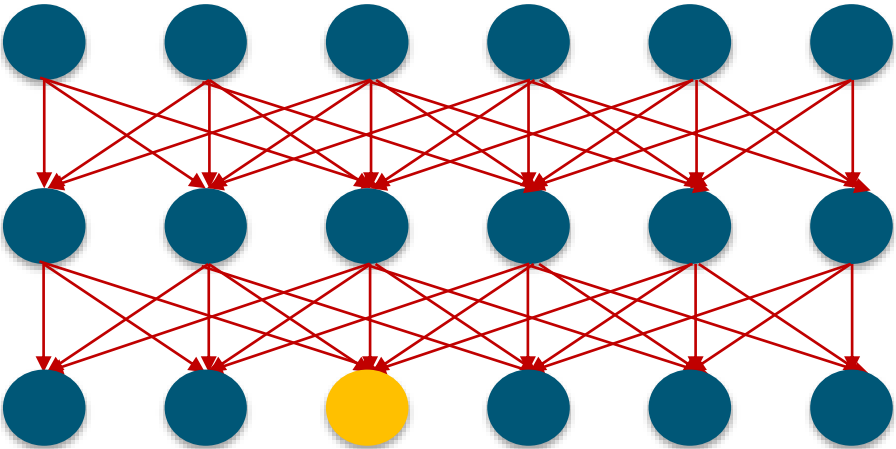
- **Training, singular value decomposition (SVD), support vector machines (SVM)**
- **Supervised and unsupervised learning ...**

The screenshot shows the Amazon.com product page for 'Molecular Biology of the Cell, Fifth Edition: The Problems Book' by John Wilson. The page features a 'Frequently Bought Together' section with three items: 'Molecular Biology of the Cell' (hardcover, \$134.37), 'Molecular Biology of the Cell, Fifth Edition: The Problems Book' (paperback, \$40.32), and 'Textbook of Biochemistry with Clinical Correlations' (hardcover, \$203.11). Below this is a 'Customers Who Bought This Item Also Bought' section with four items: 'Molecular Biology of the Cell, Fifth Edition: ...' (paperback, \$40.32), 'Textbook of Biochemistry with Clinical ...' (hardcover, \$203.11), 'Thompson & Thompson Genetics in Medicine: ...' (paperback, \$66.48), and 'Lehninger Principles of Biochemistry' (hardcover, \$214.42). The page also includes a 'NETFLIX' logo at the top and a 'Connect other address books' button at the bottom.

# A machine learning revolution is underway – if we let it

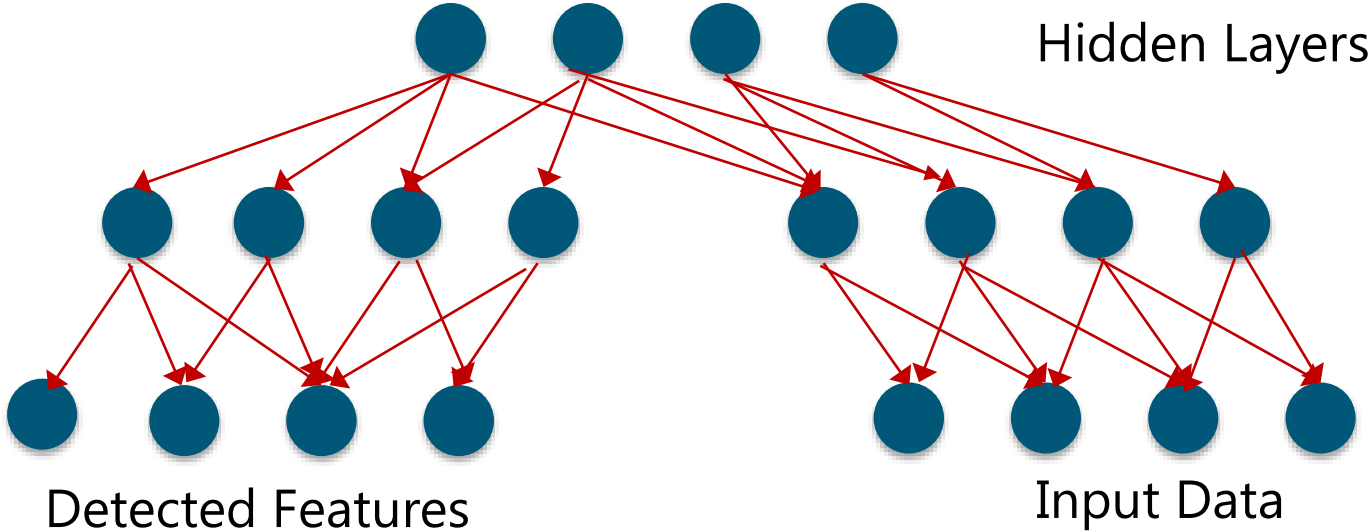
## Big data and massive parallelism

- Supervised machine learning – inference from labeled training sets
- Unsupervised machine learning – finding structure in data without labels



*Spiral  
Galaxy*

Labels





# Have you ever ...

Requested compute and storage for *ten years*?

Logged onto a node and killed processes just to see what would happen?

Wished you could load containers rather than just applications?

Found your code performance limited by the I/O bandwidth of a Raspberry Pi?

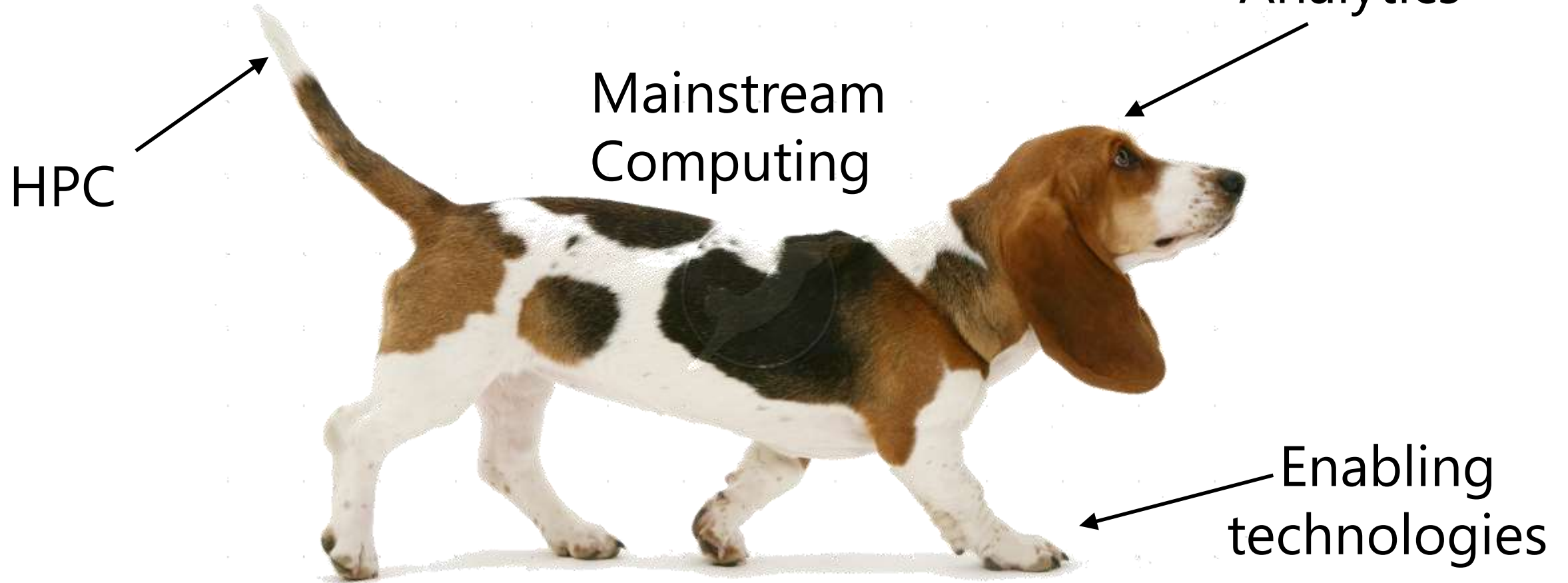
Thought SAN was just a typo in a message meant for Sam?

Asked your system for recommendations?

Wondered why R came after S and C doesn't matter?



Follow the money and the users ...



... or the money and the users may not follow you

# Dot.com boom 2.0

Dominated by three areas

- Social networks
- Mobile apps
- Cloud services

Enabled by technology changes

- Higher speed broadband
- Smartphones and apps
- ***Machine learning and data analytics***





# Clouds 101

It's a bird, it's a plane ...

Some of us are old enough to remember public timesharing ...

Data centers built for Internet services

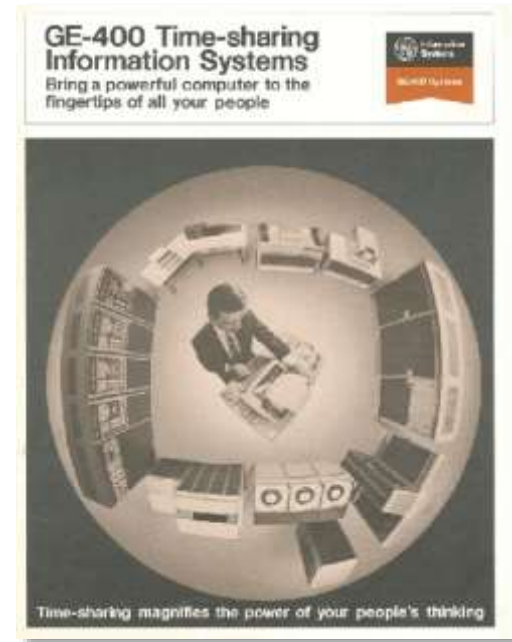
- Search, email, e-commerce ...

Infrastructure optimization at scale

- Cloud software stacks, data centers, CDNs
- Virtualization, containers, SDNs, IaaS/PaaS/SaaS

Rise of deep learning

- Big data and analytics



# Cloud data centers: The iceberg view



It's all about ratios ...

- Cost, performance, capacity

Jim Gray's four axes

- Networking
- Computation
- Storage
- Access

... and that is still driving change

- Modular building blocks
- Component integration
- Systemic resilience
- Cooling and power
- SDN and SDS, containers





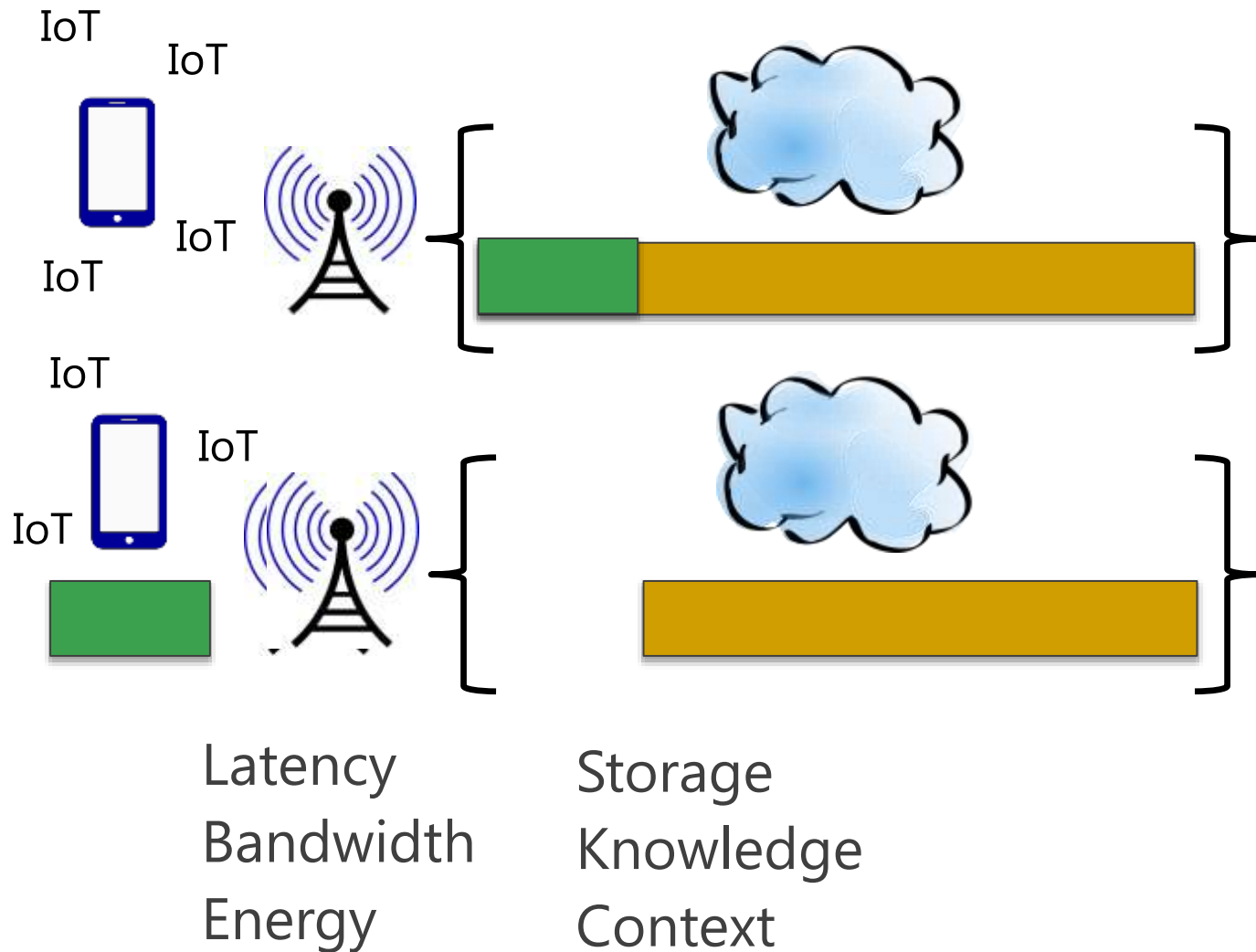
Google translate



# Natural Interfaces and Intelligent Assistants

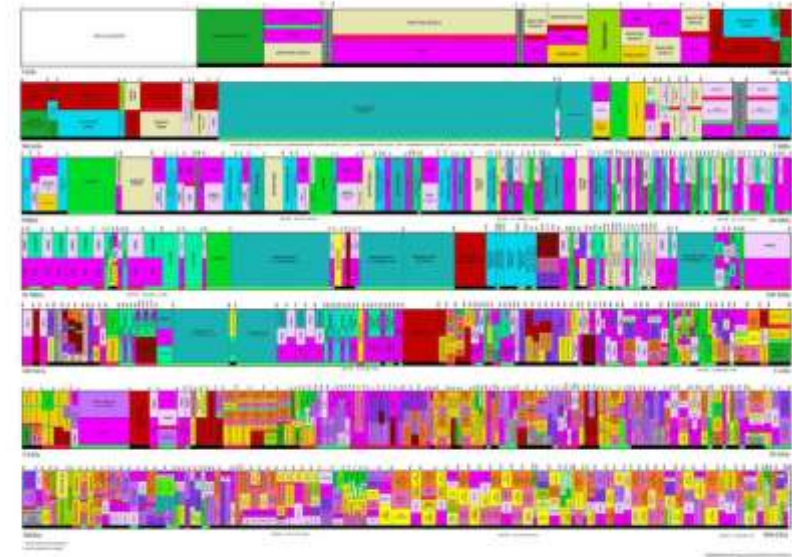


# Optimizing the continuum

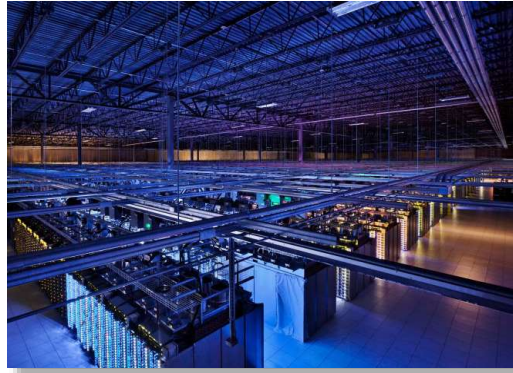


Think about augmented reality

UNITED STATES FREQUENCY ALLOCATIONS THE RADIO SPECTRUM

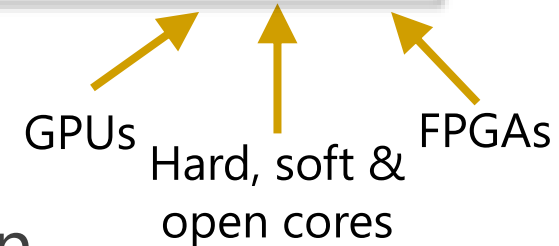
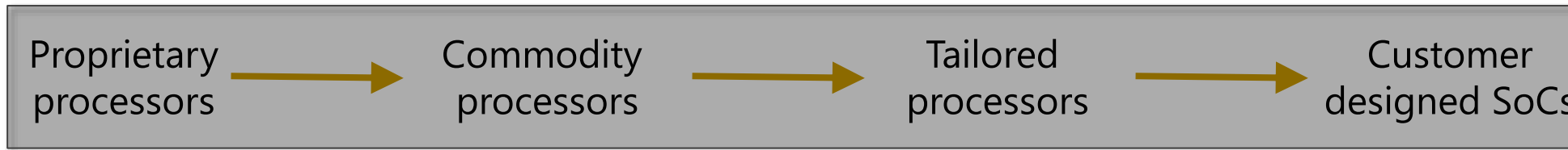
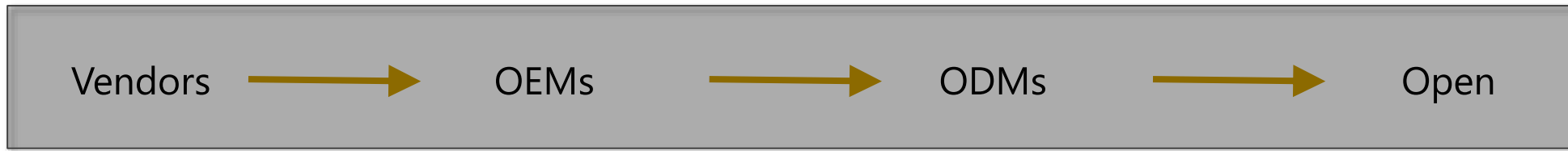
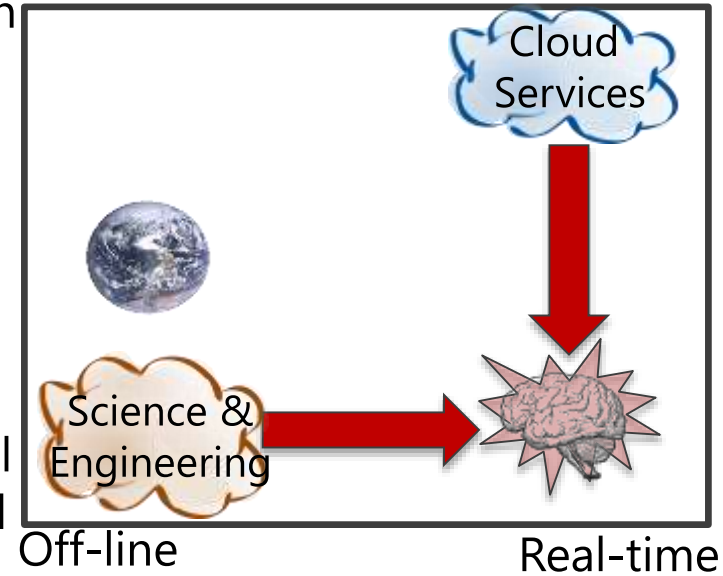


# Turtles (almost) all the way down



Transaction Based

Model Based



Software is eating the world – Marc Andreessen

# Software is eating the world

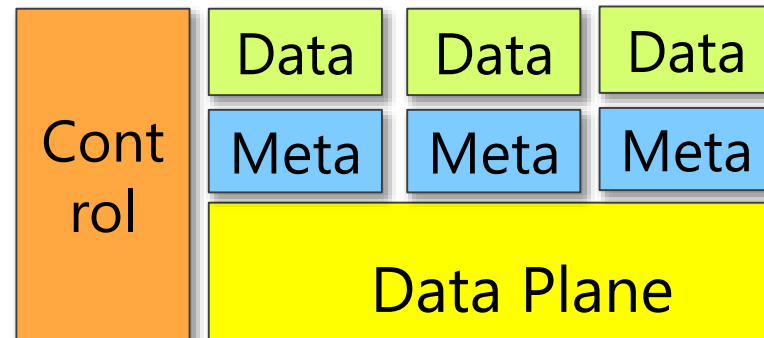
## Containerization (OS virtualization)

## Software defined networks (SDNs)

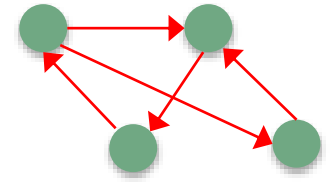
- Merchant silicon revolution
- Network control
  - Uniform abstractions and separation of concerns
  - Control functions in OS not network switches

## Software defined storage

- Abstraction and separation
- Storage virtualization
- Policy management



Control program



Abstract virtual network

SDN abstract to global "compiler"

Global network view

SDN "network OS"

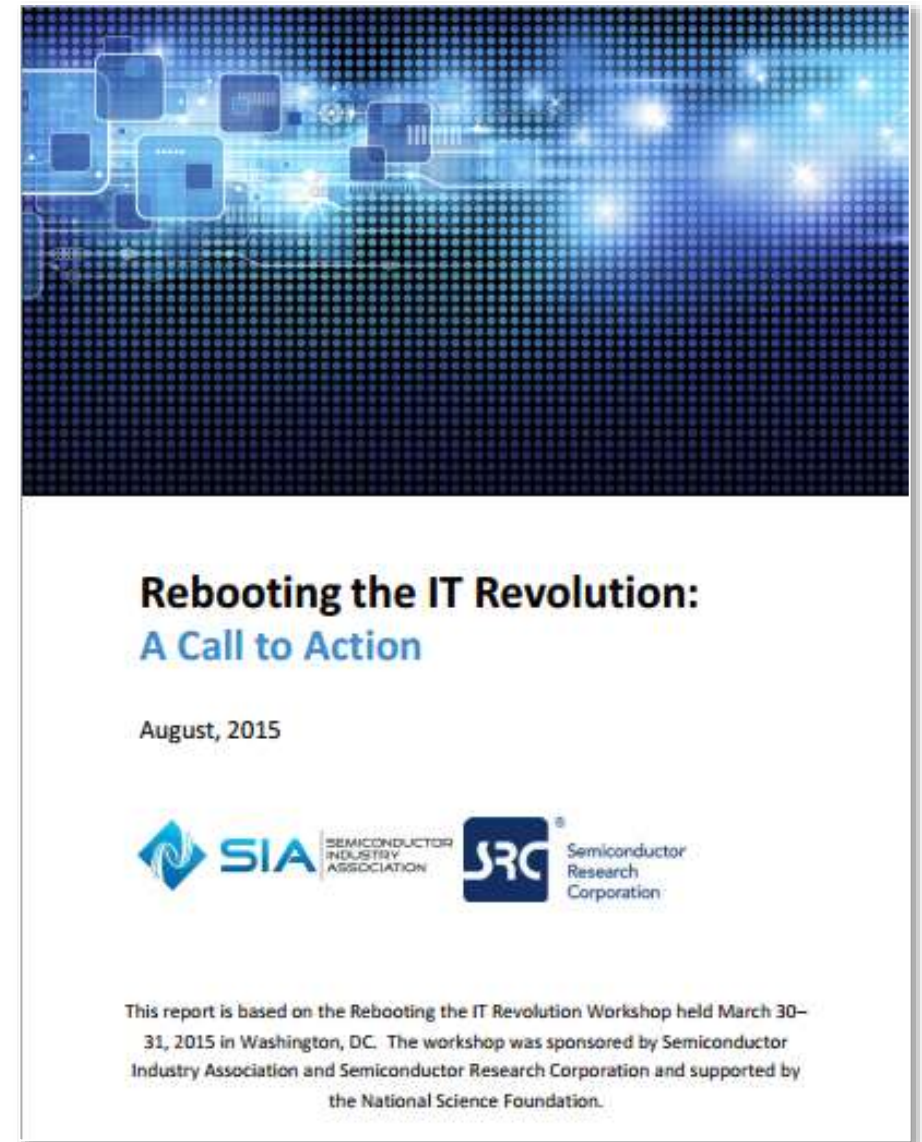
Host-based tables and packet filters

Acknowledgment: Dennis Gannon



# Rebooting the IT Revolution

Energy efficient sensing and computing  
Cyber-physical systems  
Intelligent storage  
Real-time communication ecosystem  
Multilevel and scalable security  
Next-generation manufacturing paradigm  
Insight computing



# Computing energy efficiency

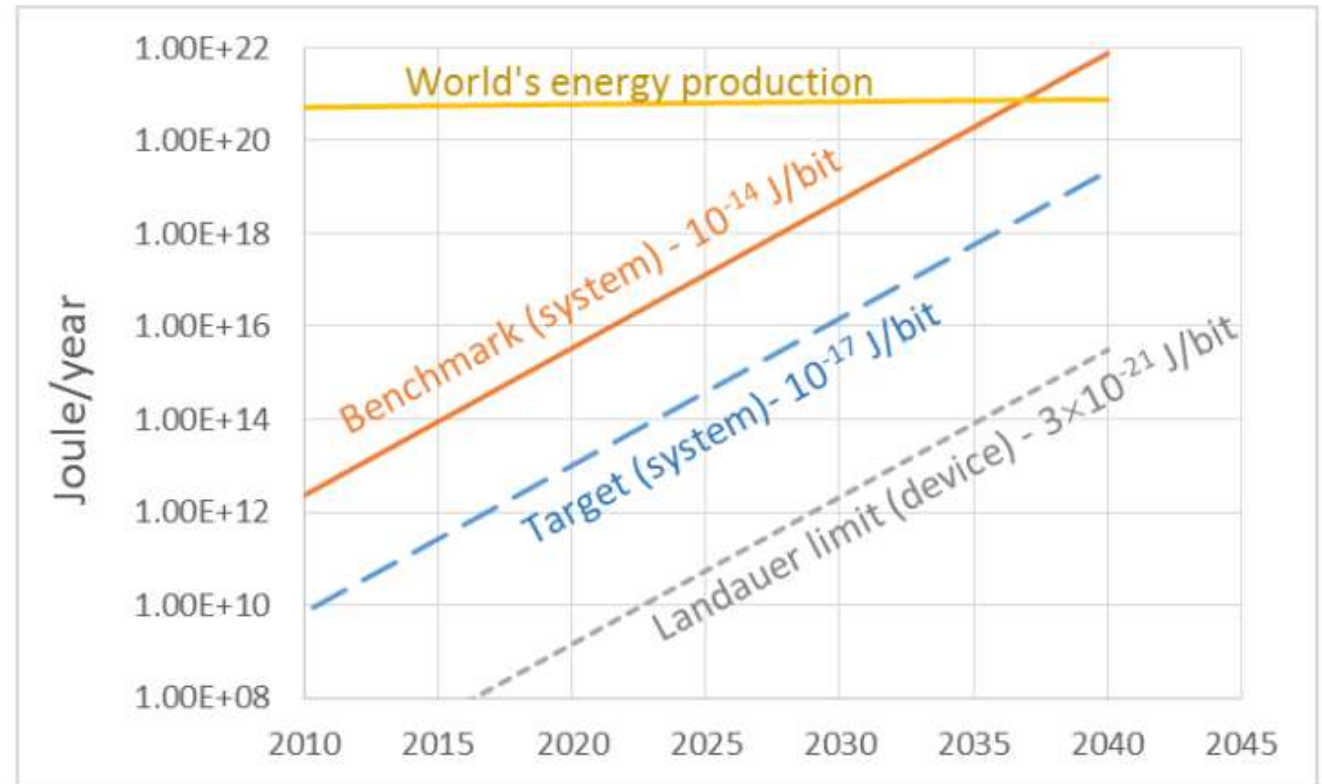
100 picojoules can

- Run a Cortex M0 for 10 cycles
- Write 1 bit of FLASH
- Write 300 bits of SRAM or DRAM
- Send 5 bits across LPDDR4
- Transmit 2 bits of UWB data
- Transmit 0.02 bits over Bluetooth LE

Remember

- 1 KW is 3.6 *megajoules*

We have to be more efficient



# Analog brains and digital computers

Parallel distributed architecture

Low power (25W)

Small volume (1 liter)

Asynchronous

Analog computing

Integrated memory/computation

Intelligence via learning

Noisy components

Low speed operation

Spontaneously active

Mostly serial architecture

High power (100 MW)

Large footprint (40M liters)

Synchronous

Digital computing

Separated memory/computation

Intelligence via programmed rules

Precise components

High speed operation

Passive unless instructed





# Shifting computing perspectives

## An error prone experiment

Accept inaccuracy/errors as the norm

- Verification and validation (V&V)

Computation as an {un}biased sample

- “An” approximate answer rather than “the” answer

Many axes

- Variable precision arithmetic
- Bit error tolerance
- Software correctness
- Energy adaptivity



Analog, noisy inputs

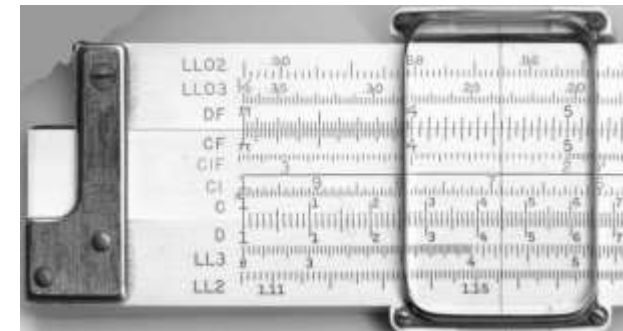
- Sensors

Analog, error tolerant outputs

- Multimedia, data classification

Multiple acceptable answers

- Web search, climate models



THE UNIVERSITY OF IOWA  
OFFICE OF THE VICE PRESIDENT  
FOR RESEARCH & ECONOMIC DEVELOPMENT

# Dare to Discover

RESEARCH.UIOWA.EDU

RESEARCH  
DISCOVERY  
INNOVATION

# Thank You