

# The Future of Data-Centric Computing

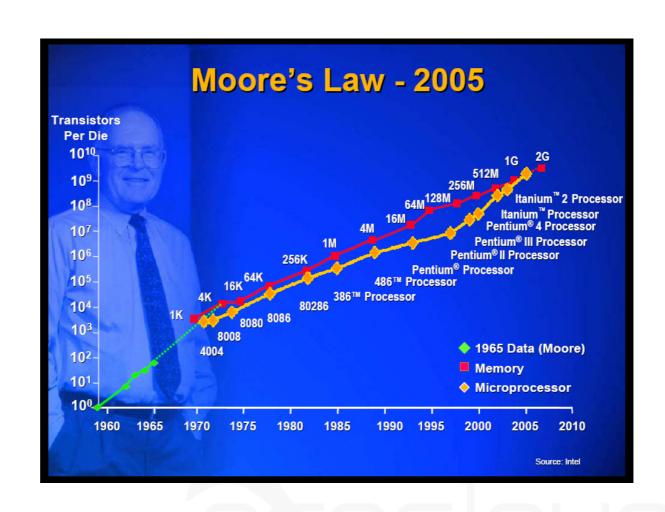
Babak Falsafi ecocloud.ch



#### Information Technology (IT): Five Decades of Exponential Growth







IT is at the core everything we do & has become an indispensable pillar for a modern day society!

### A Brief History of IT





Mobile Era



Consumer Era

Mainframes
PC Era

- From computing-centric to data-centric
- Consumer Era: Internet-of-Things in the Cloud

### Two Inflection Points for IT ec



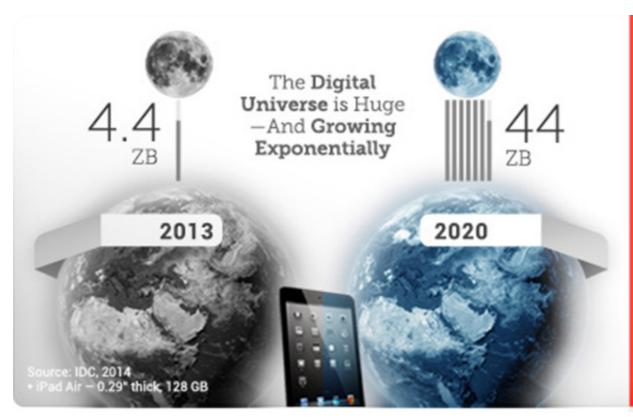
- I. Big Data
  - Data growth at 1.5x/year
  - Huge demand on scaling platforms

#### 2. Platforms

- Efficiency scaling stopped ten years ago
- Silicon density scaling has slowed down
- IT growth not sustainable

## Data is Shaping Future of IT ecoc.





If the Digital
Universe were
represented by the
memory in a stack
of tablets, in 2013
it would have
stretched
two-thirds the
way to the Moon\*

By 2020, there would be 6.6 stacks from the Earth to the Moon\*

- Data growth (by 2015) = 100x in ten years [IDC 2012]
  - Population growth = 10% in ten years
- Monetizing data for commerce, health, science, services, . . . .
- Big Data is shaping IT & pretty much whatever we do!

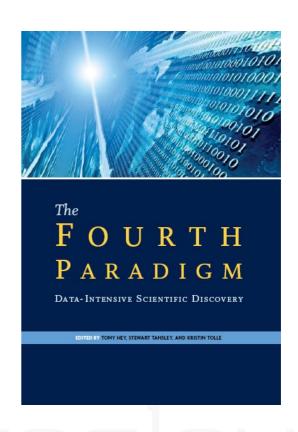
# Data Shaping All Science & Technology



Science entering 4<sup>th</sup> paradigm

- Analytics using IT on
  - Instrument data
  - Simulation data
  - Sensor data
  - Human data
  - •

Complements theory, empirical science & simulation



Data-centric science key for innovation-based economies!

## Datacenters Growing Fast



Source: James Hamilton, 2012



# Warning! Datacenters are not Supercomputers



- Run heterogeneous data services at massive scale
- Driven for commercial use
- Fundamentally different design, operation, reliability, TCO
  - Density 10-25KW/rack as compared to 25-90KW/rack
  - Tier 3 (~2 hrs/downtime) vs. Tier I (upto one day/downtime)
  - .....and lots more

#### Datacenters are the IT utility plants of the future



Supercomputing





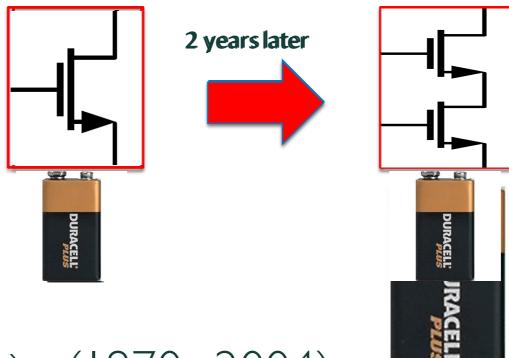
Cloud Computing

### But, platforms are not scaling



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2 thansistons ≥1 wenengy

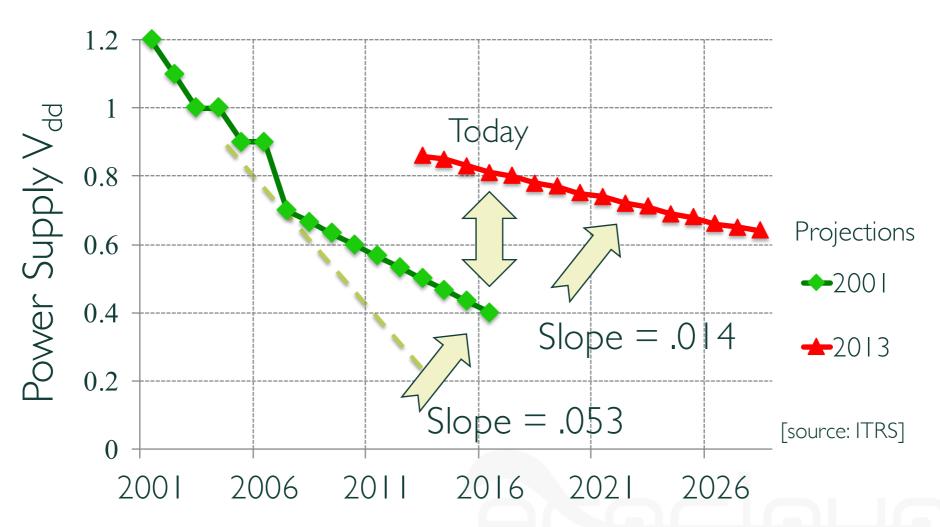


Qood(2004a) (1970~2004):

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- Bortathey rassistion by the seteration to be presented to be a set of the s
- Chip energy consumption is shaintidg upame

## Operating voltages leveling





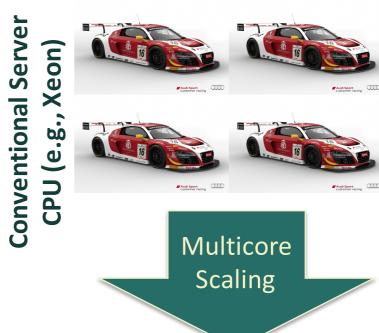
The fundamental energy silver bullet is gone!

# The Rise of Parallelism to Save the Day

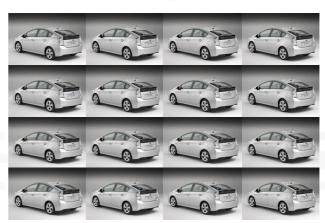


#### With voltages leveling:

- Parallelism has emerged as the only silver bullet
- Use simpler cores
  - Prius instead of Audi R8
  - GPU's instead of CPU's
- Restructure software
- Each core →fewer joules/op



Modern Multicore CPU (e.g., Tilera)



# The Rise of Dark Silicon: End of Multicore/GPU Scaling

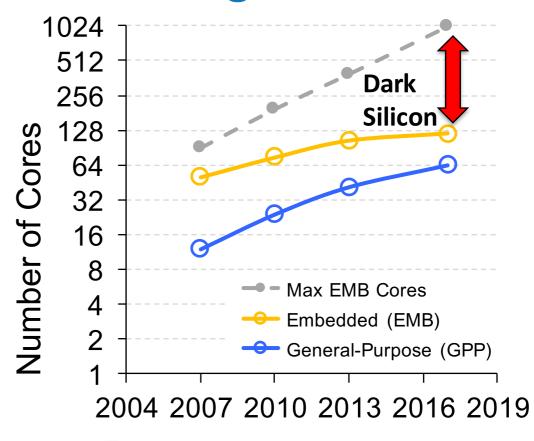


But parallelism can not offset leveling voltages

Even in servers with abundant parallelism

Core complexity has leveled off too!

Need a holistic approach



Year of Technology

Hardavellas et. al.

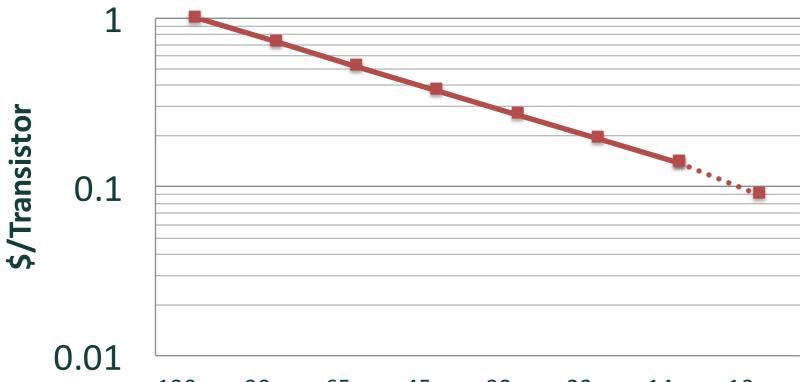
**Toward Dark Silicon in Servers** 

IEEE Micro, 2011

### Silicon not getting much denser....



Mark Bohr's (Intel) Keynote [ISSCC'15]

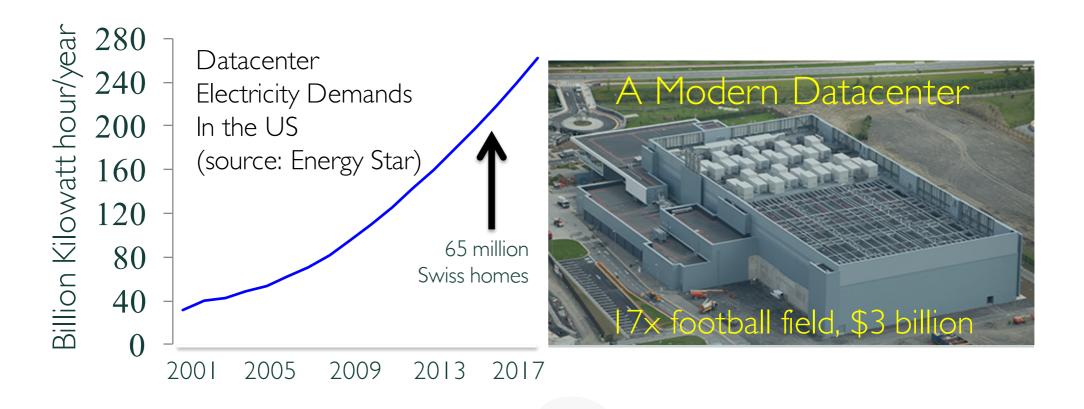


130 nm 90 nm 65 nm 45 nm 32 nm 22 nm 14 nm 10 nm

Moore's Law: \$/transistor dropping for fifty years

- Intel is pushing for a bit more
- TSMC hinted at prices going up for the first time in 2014

# Higher Demand + Lower Efficiency: Datacenter Growth not Sustainable!



- Modern datacenters → 20 MW!
- In modern world, 6% of all electricity and growing fast!



### Big Data



### IT's Future



Bridging Technologies

### Big Energy





#### Center to bring efficiency to data

- I 6 faculty, 50 researchers
- 6M CHF/year external funds

#### Mission:

- Energy-efficient data-centric IT
- From algorithms to infrastructure
- Maximizing value for data

















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# Our Vision: Holistic Optimization of Datacenters

### Holistic optimization

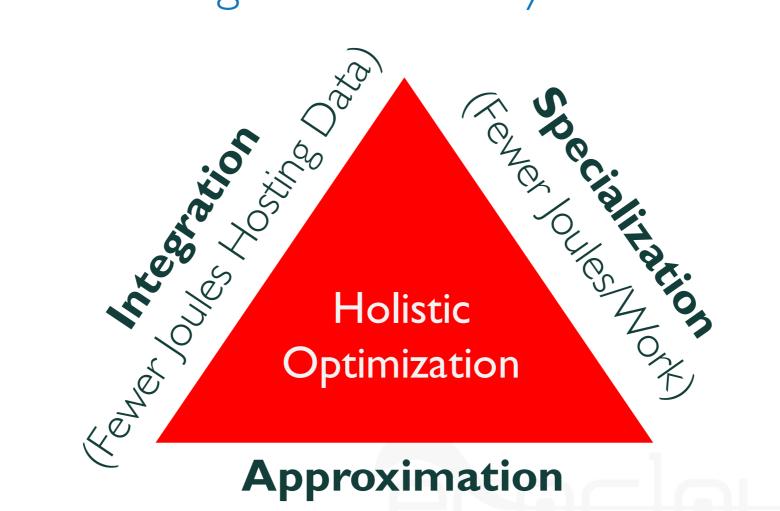
- Algorithms to infrastructure
- Cross-layer
- Paradigms to monitor, manage & reduce energy

Open technologies!



## Our Vision: The ISA Triangle of Efficiency





(Tailor Precision for Fewer Joules)

### Integrated Cooling: CMOSAIC

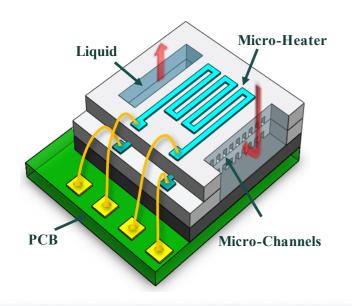


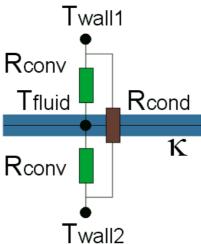
#### 3D server chip

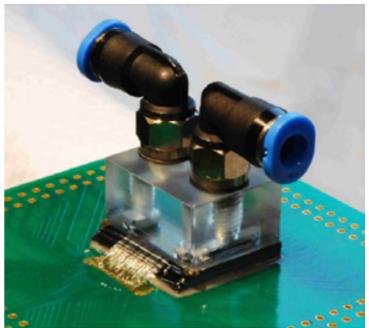
#### Two-phase liquid cooling

- Enables higher thermals
- Dramatically better heat removal

#### Prototyped by IBM









### Integrated Compute in Memory

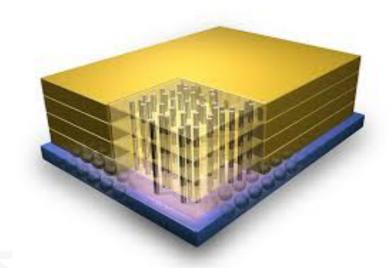


#### Why in-memory?

- Minimize data movement & energy
- Leverage DRAM's massive internal BW

#### Basic data services:

- Scan, Join, GroupBy, Filter
- Best for sequential access
- Accelerators must co-exist with conventional memory semantics



10x better efficiency for a database join operation!

# Integrated Thermal Management @ Credit Suisse



- Designed fine-grain power/thermal sensors
- Deployed with real-time monitoring of 5K servers
- Software for synergistic load/thermal provisioning

50% better efficiency!





### Cloud Benchmarking with CloudSuite 3.0 (parsa.epfl.ch/cloudsuite)

Data Analytics Machine learning





Data Caching Memcached





Data Serving Cassandra NoSQL





Graph Analytics GraphX





Media Streaming Nginx, HTTP Server





Web Serving Nginx, PHP server





Web Search Apache Solr & Nutch





In-Memory Analytics Recommendation System





Building block for Google PerfKit, EEMBC Big Data!

# Specialized Servers: Cavium ThunderX



BREAKING NEWS

SLIDESHOW: CES: Bosch Aims to Connect Whole World

#### MICROPROCESSOR <u>report</u>

· Insightful Analysis of Processor Technology

#### THUNDERX RATTLES SERVER MARKET

Cavium Develops 48-Core ARM Processor to Challenge Xeon

By Linley Gwennap (June 9, 2014)

#### 48-core 64-bit ARM SoC

#### [blueprinted at EPFL]:

- Designed to serve data
- Custom organization
- Runs off-the-shelf software stack
- I0x better faster than Xeon

designlines wireless & Networking |

#### News & Analysis

#### **Big-Data Benchmark Brewing**

**EEMBC** works on SoC-agnostic spec

#### **Rick Merritt**

10/15/2014 08:00 AM EDT

SAN JOSE, Calif. — A new benchmark suite for scaled-out servers is in the works with the first piece of it expected early next year. The processor-agnostic metrics aim to set standards for measuring today's data center workloads.

A new cloud and big-data server working group of the Embedded Microprocessor Benchmark Consortium (EEMBC) hopes to deliver a suite of seven benchmarks. It aims to complete before April three of them -- memory caching, media serving, and graph analysis.

"Typically when we go to a server customer they ask for SpecInt numbers, that's been the traditional benchmarks for servers for a long time, but SpecInt is not a very good metric for distributed data loads or available instruction and memory parallelism," said Bryan Chin, a distinguished engineer from Cavium.



# Spatial Computing: An idea whose time has come

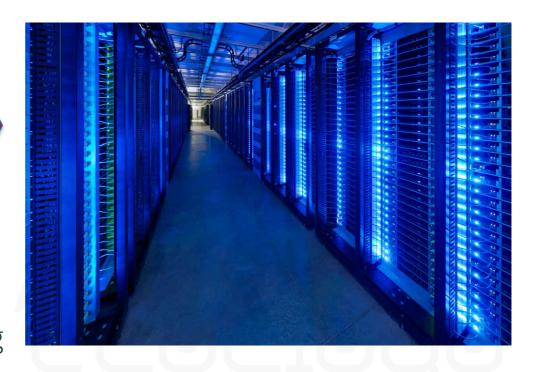




- One Stratix V FPGA per blade
- DSL's (e.g., Scala, TensorFlow)
- Analytics with spatial computing

# Microsoft Unveils Catapult to Accelerate Bing!

[EcoCloud Annual Event, June 5th, 2014]



# Specialized Databases: Breaking Up Data Jams





Compilation of offline analytics into online/incremental engines

Aggressive code specialization

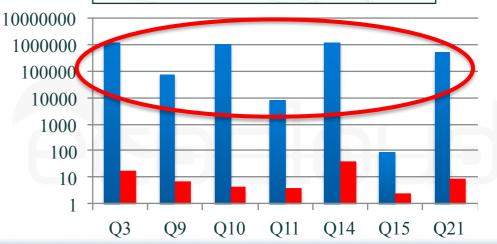


#### Data Stream

Low-latency stream processing
Up to 6 OOM faster than
commercial systems

dbtoaster.org



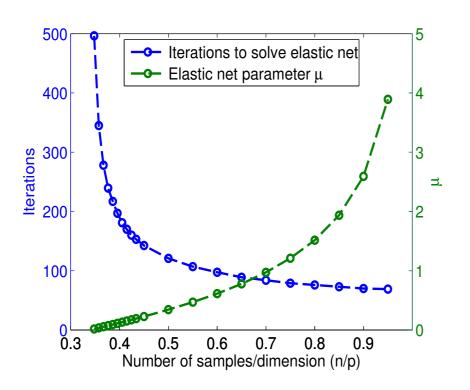


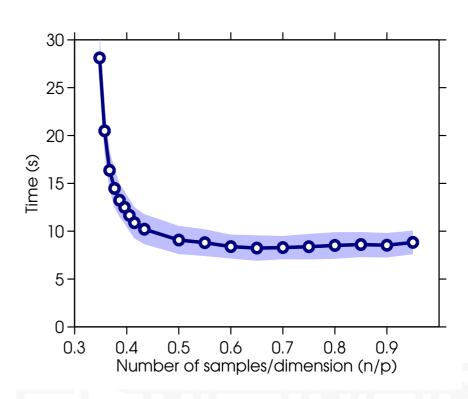
## Big Data Analytics



#### Convex machine learning models

- Broad set of applications: sparse SVM's, low-rank matrix completions...
- Bigger data → faster algorithms for the same statistical risk!





Algorithms to simplify problem as data size gets larger!

## Bringing it All Together



### Two inflection points for IT

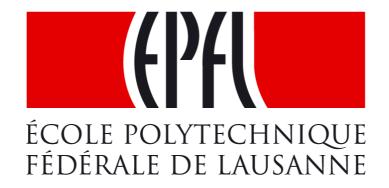
- Data growing at an exponential rate
- Platform scaling is a grand challenge
- Future IT platforms designed around data

Holistic approaches to datacenter design Integrate + Specialize + Approximate (ISA)





# For more information please visit us at ecocloud.ch





# 7 Giants of Analytics

[National Academies, 2013]



- Basic statistics
- N-body problem
- •Graph theory
- Linear algebra
- Generalized Optimization
- Computing integrals
- Alignment problems