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# CS61C

Great Ideas  
in  
Computer Architecture  
(a.k.a. Machine Structures)



UC Berkeley  
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## Datacenters & Cloud Computing

# Eras of Computer Hardware

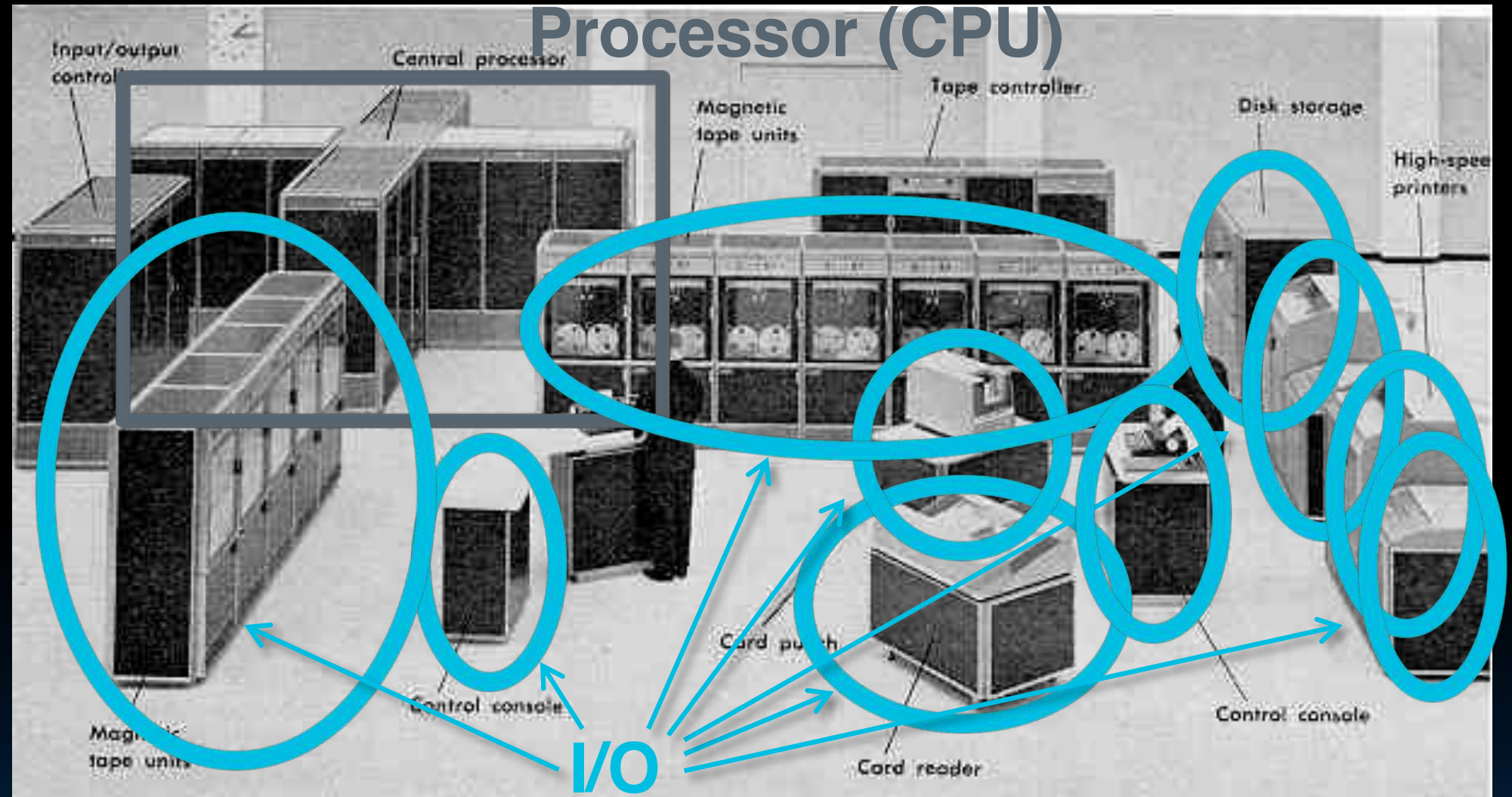


# Review ... where are we?

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- Great Ideas in Computer Architecture
  - ✓ □ Layers of Representation/Interpretation
  - ✓ □ Moore's Law
  - ✓ □ Principle of Locality/Memory Hierarchy
  - Parallelism
  - Performance Measurement and Improvement
  - Dependability via Redundancy

# Computer Eras: Mainframe 1950s-60s



“Big Iron”: IBM, UNIVAC, ... build \$1M computers for businesses → COBOL, Fortran, timesharing OS



# Minicomputer Eras: 1970s



Using integrated circuits, Digital, HP... build \$10k computers for labs, universities → C, UNIX OS



# PC Era: Mid 1980s - Mid 2000s



Using microprocessors, Apple, IBM, ... build \$1k computer for 1 person → Basic, Java, Windows OS



# PostPC Era: Late 2000s - ??



**Personal Mobile Devices (PMD):** Relying on wireless networking, Apple, Nokia, ... build \$500 smartphone and tablet computers for individuals

→ Objective C, Swift, Java, Android OS + iOS

**Cloud Computing:** Using Local Area Networks, Amazon, Google, ... build \$200M **Warehouse Scale Computers** with 100,000 servers for Internet Services for PMDs  
→ MapReduce, Ruby on Rails



Warehouse  
Scale  
Computers





# Why Cloud Computing Now?

- **“The Web Space Race”**: Build-out of extremely large datacenters (10,000's of commodity PCs)
  - Build-out driven by growth in demand (more users)
  - Infrastructure software and Operational expertise
- **Discovered economy of scale: 5-7x cheaper than provisioning a medium-sized (1000 servers) facility**
- More pervasive broadband Internet so can access remote computers efficiently
- Commoditization of HW & SW
  - Standardized software stacks

# November 2020 AWS Instances & Prices



Instance	Per Hour	\$ Ratio to Small	EC2 Compute Unit (integer)	Virtual Cores (vCPU)	Memory (GiB)	Disk (GiB)
Standard Small (t3.small)	\$0.021	1	Variable	2	2	EBS
Standard Large (t3.large)	\$0.083	4	Variable	2	8	EBS
Standard 2x Extra Large (t3.2xlarge)	\$0.333	16	Variable	8	32	EBS
High-Mem Large (r5.large)	\$0.126	6	10	2	16	EBS
High-Mem Double Xlarge (r5.2xlarge)	\$0.504	24	37	8	64	EBS
High-Mem 24x Large (r5.24xlarge)	\$6.048	288	337	96	768	EBS
High-CPU Large (c5.large)	\$0.085	4	10	2	4	EBS
High-CPU 18x Large (c5.18xlarge)	\$3.060	146	281	72	144	EBS

- Closest computer in WSC example is **Standard 2X Extra Large**
- At these low rates, Amazon EC2 can make money! (even utilized 50% time)
- EBS = Elastic Block Store (SSD=\$0.10/ GB-month, HDD=\$0.045/ GB-month)
- Each also comes with dedicated attached SSD if you choose & pay for that



# Warehouse Scale Computers

- Massive scale datacenters: 10,000 to 100,000 servers + networks to connect them together
  - Emphasize cost-efficiency
  - Attention to power: distribution and cooling
- (relatively) homogeneous hardware/ software
- Offer very large applications (Internet services): search, social networking, video sharing
- Very highly available: < 1 hour down/year
  - Must cope with failures common at scale
- “...WSCs are no less worthy of the expertise of computer systems architects than any other class of machines”
  - Barroso and Hoelzle 2009





# Design Goals of a WSC

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- Unique to Warehouse-scale
  - Ample parallelism:
    - Batch apps: large number independent data sets with independent processing.
    - Also known as **Data-Level Parallelism**
  - Scale and its Opportunities/Problems
    - Relatively small number of these make design cost expensive and difficult to amortize
    - But price breaks are possible from purchases of very large numbers of commodity servers
    - Must also prepare for high # of component failures
  - Operational Costs Count:
    - **Cost of equipment purchases << cost of ownership**

# Eg., Google's Oregon WSC





# Containers in WSCs

Inside WSC

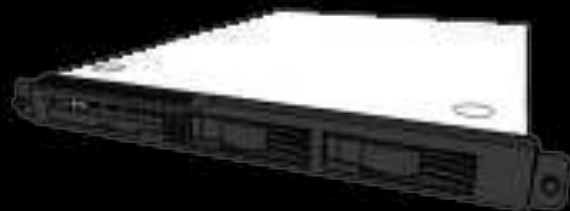


Inside Container

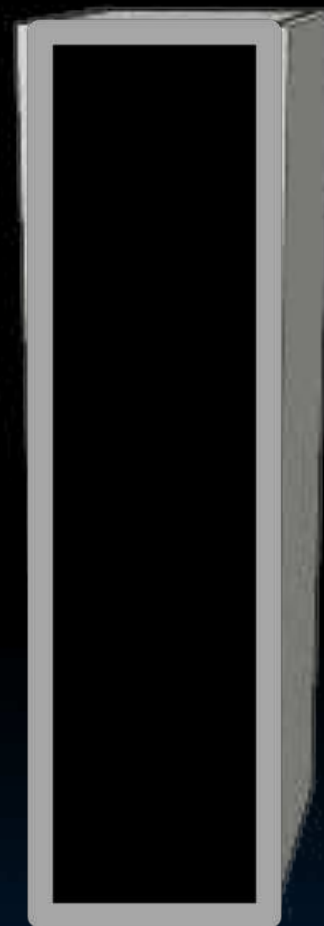




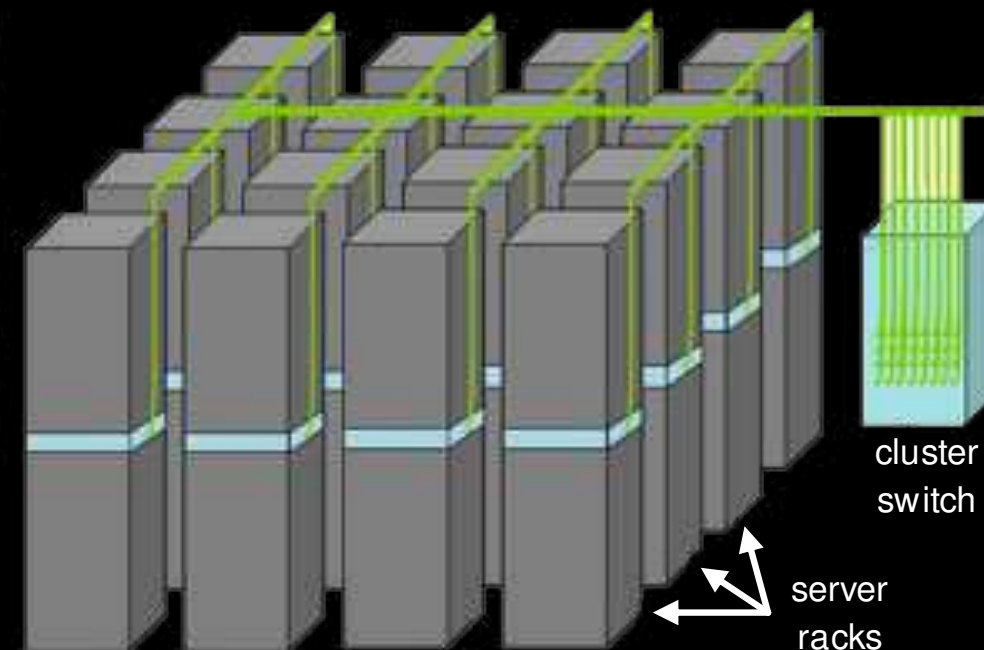
# Equipment Inside a WSC



**Server** (in rack format):  
 1 ¾ inches high “1U”,  
 x 19 inches x 16-20  
 inches: 8 cores, 16 GB  
 DRAM, 4x1 TB disk



7 foot **Rack**: 40-80 servers + Ethernet  
 local area network (1-10 Gbps) switch  
 in middle (“rack switch”)



**Array** (aka cluster):  
 16-32 server racks + larger  
 local area network switch  
 (“array switch”) 10X faster →  
 cost 100X: cost  $f(N^2)$



# Server, Rack, Array



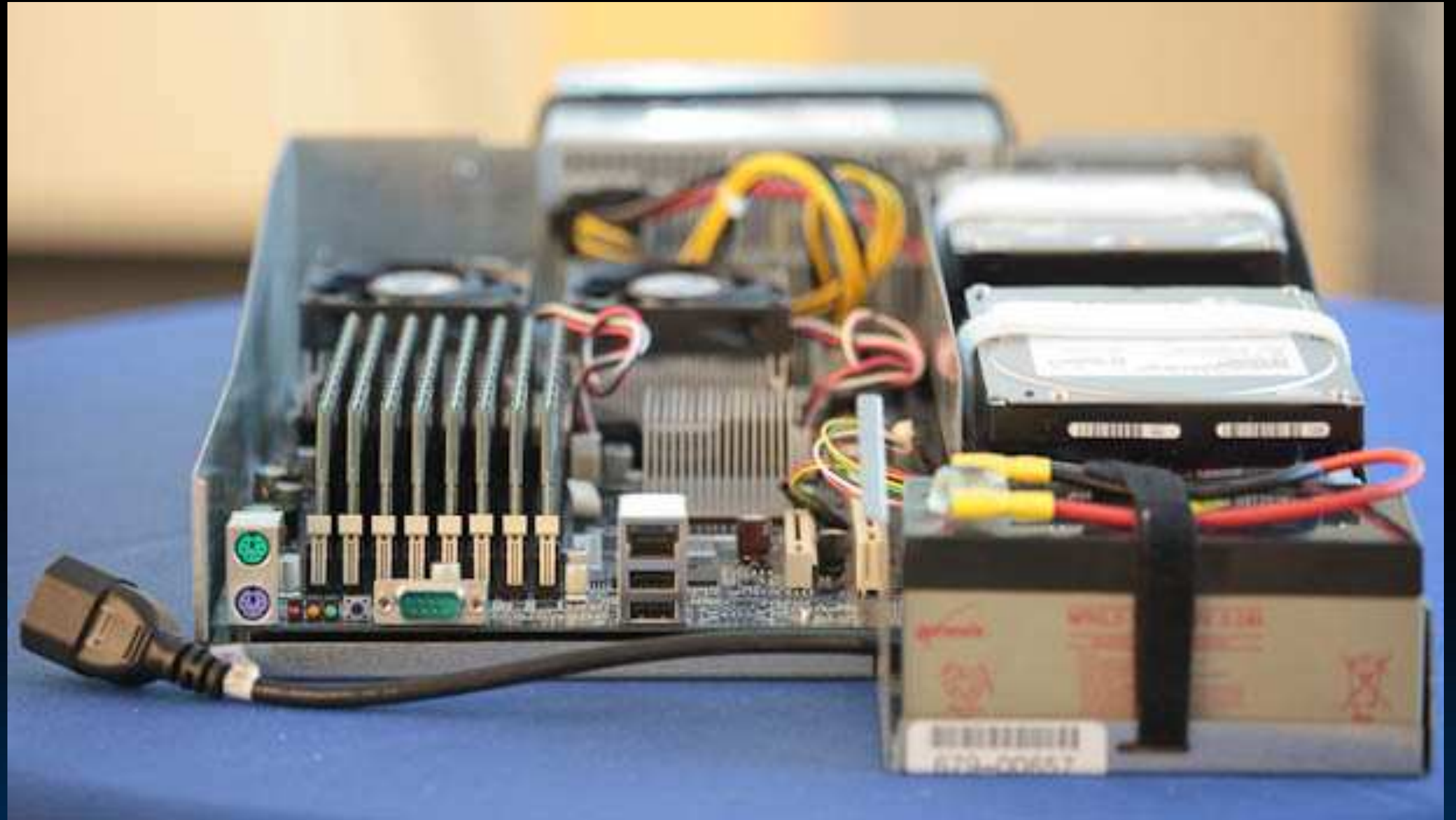


# Google Server Internals





# Google Server Internals



# Defining Performance

- What does it mean to say X is faster than Y?
- 2009 Ferrari 599 GTB
  - 2 passengers, 11.1 secs for quarter mile (call it 10sec)
- 2009 Type D school bus
  - 54 passengers, quarter mile time? (let's guess 1 min)
- **Response Time** or **Latency**
  - time between start and completion of a task
  - E.g., time to move vehicle  $\frac{1}{4}$  mile
- **Throughput** or **Bandwidth**
  - total amount of work in a given time
  - E.g., passenger-miles in 1 hour





# Coping with Performance in Array

Lower latency to DRAM in another server than local disk  
Higher bandwidth to local disk than to DRAM in another server

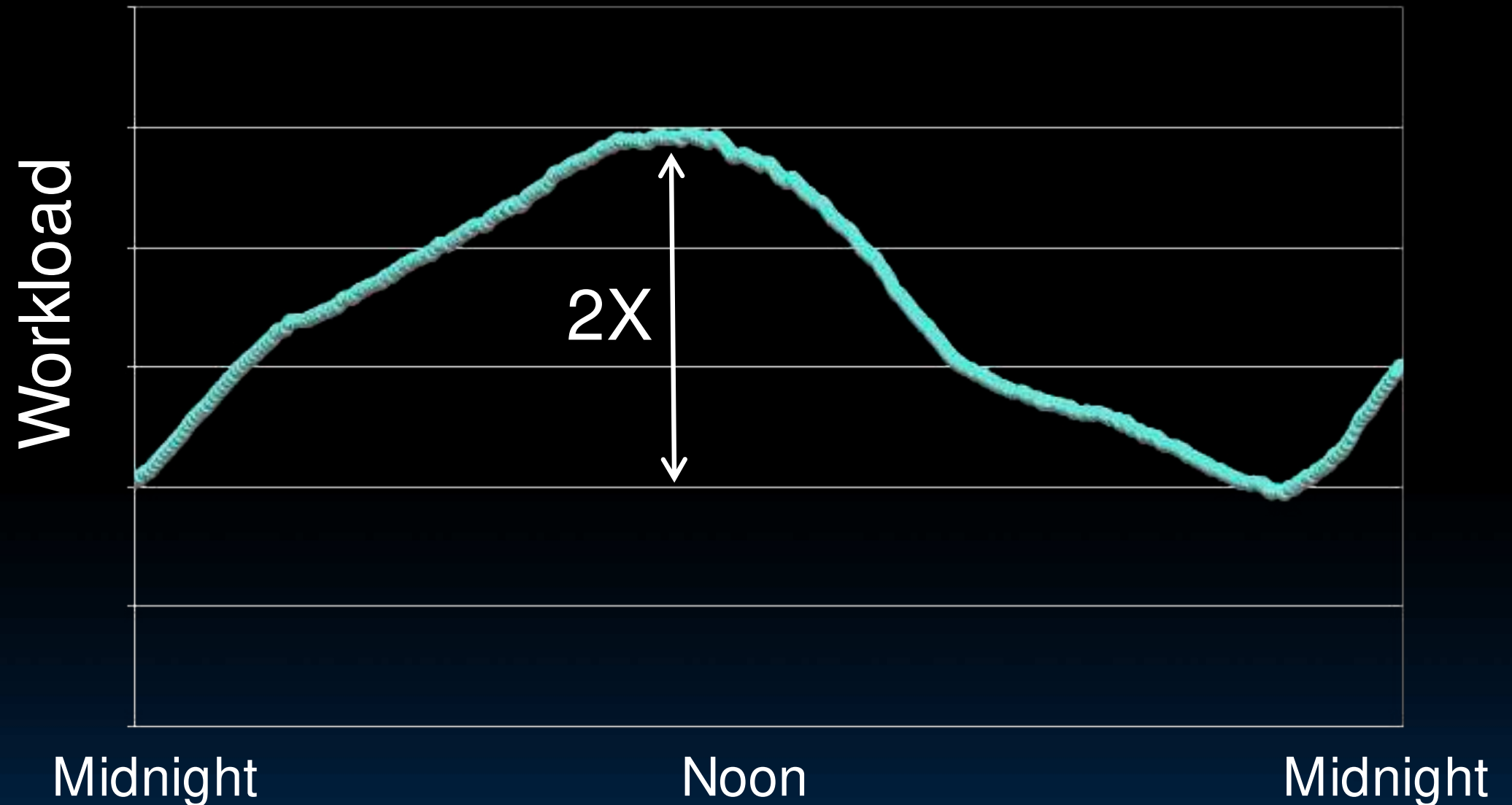
	Local	Rack	Array
Racks	--	1	30
Servers	1	80	2400
Cores (Processors)	8	640	19,200
DRAM Capacity (GB)	16	1,280	38,400
Disk Capacity (TB)	4	320	9,600
DRAM Latency (microseconds)	0.1	100	300
Disk Latency (microseconds)	10,000	11,000	12,000
DRAM Bandwidth (MB/sec)	20,000	100	10
Disk Bandwidth (MB/sec)	200	100	10





# Power Usage Effectiveness (PUE)

# Coping with Workload Variation



- Online service: Peak usage 2X off-peak

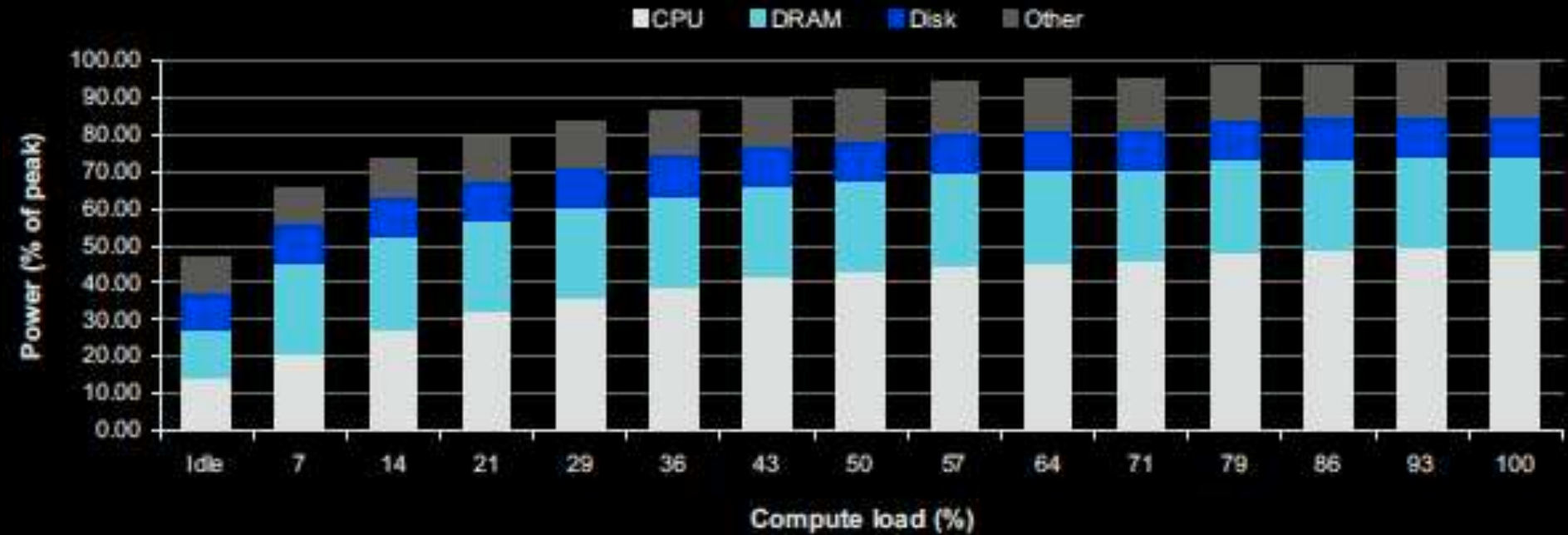


## Impact of latency, bandwidth, failure, varying workload on WSC software?

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- WSC Software must take care where it places data within an array to get good performance
- WSC Software must cope with failures gracefully
- WSC Software must scale up and down gracefully in response to varying demand
- More elaborate hierarchy of memories, failure tolerance, workload accommodation makes WSC software development more challenging than software for single computer

# Power vs. Server Utilization



- Server power usage as load varies idle to 100%
- Uses  $\frac{1}{2}$  peak power when idle!
- Uses  $\frac{2}{3}$  peak power when 10% utilized! 90% @ 50%!
- Most servers in WSC utilized 10% to 50%
- Goal should be Energy-Proportionality:  
 $\% \text{ peak load} = \% \text{ peak energy}$





# Power Usage Effectiveness

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- Overall WSC Energy Efficiency: amount of computational work performed divided by the total energy used in the process
- Power Usage Effectiveness (PUE):  
Total building power / IT equipment power
  - A power efficiency measure for WSC, not including efficiency of servers, networking gear
  - 1.0 = perfection

# PUE in the Wild (2007)

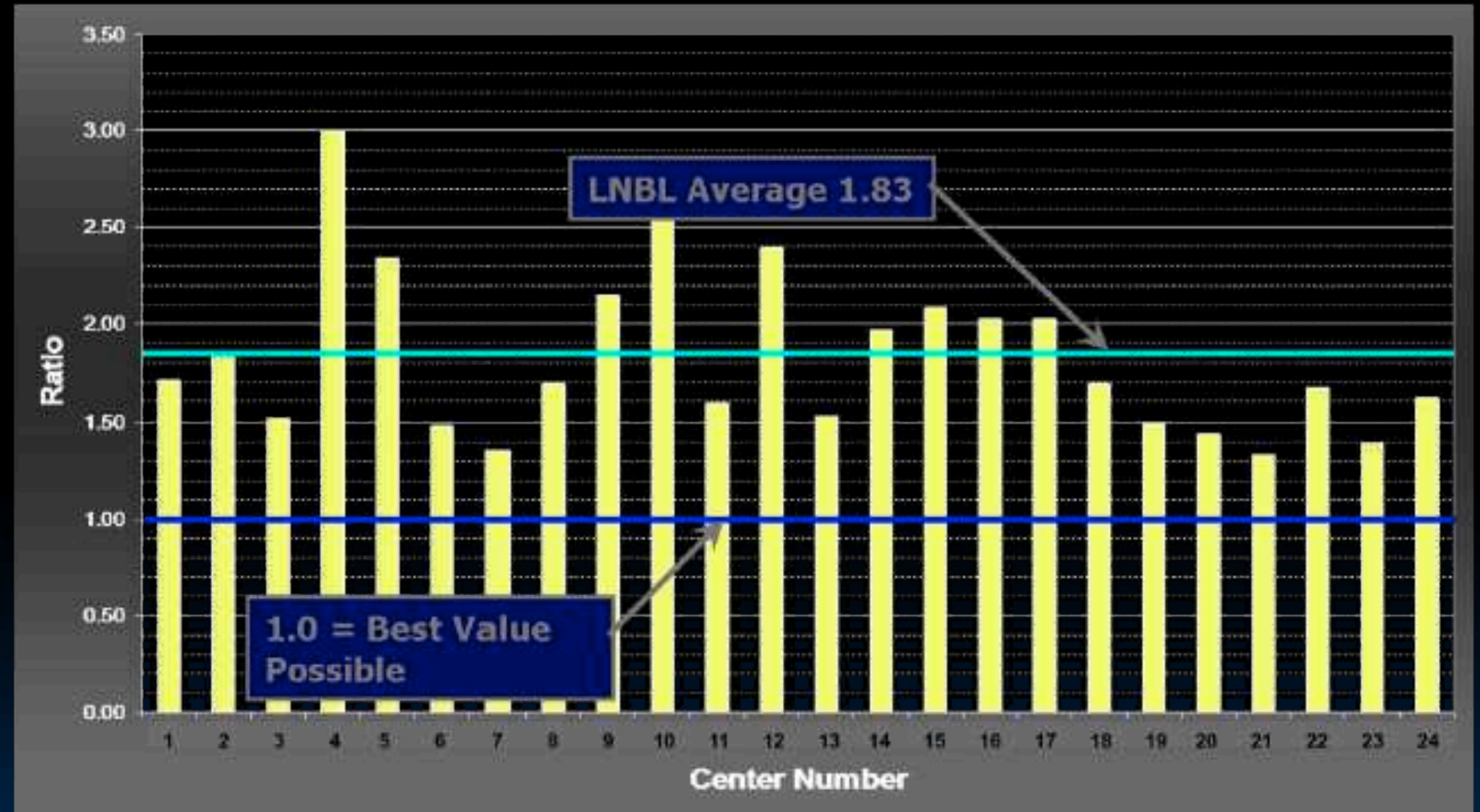
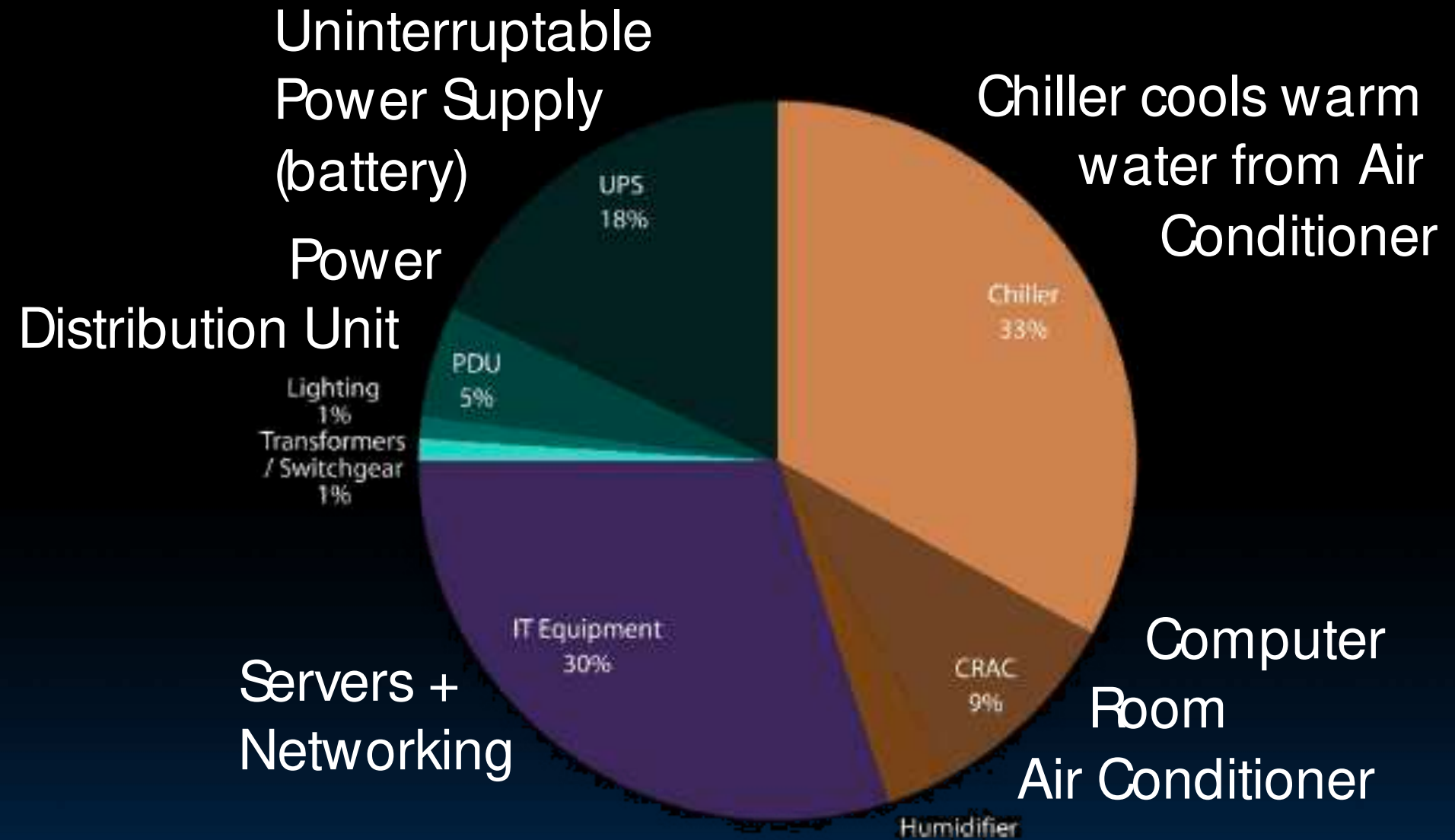


FIGURE 5.1: LBNL survey of the power usage efficiency of 24 datacenters, 2007 (Greenberg et al.)

# High PUE Where Does Power Go?







# Google WSC A PUE 1.24

- Careful air flow handling
  - Don't mix server hot air exhaust with cold air (separate warm aisle from cold aisle)
  - Short path to cooling so little energy spent moving cold or hot air long distances
  - Keeping servers inside containers helps control air flow
- Elevated cold aisle temperatures
  - 81° F instead of traditional 65° - 68° F
  - Found reliability OK if run servers hotter
- Use of free cooling
  - Cool warm water outside by evaporation in cooling towers
  - Locate WSC in moderate climate so not too hot or too cold
- Per-server 12-V DC UPS
  - Rather than WSC wide UPS, place single battery per server board
  - Increases WSC efficiency from 90% to 99%
- Measure vs. estimate PUE, publish PUE, and improve operation

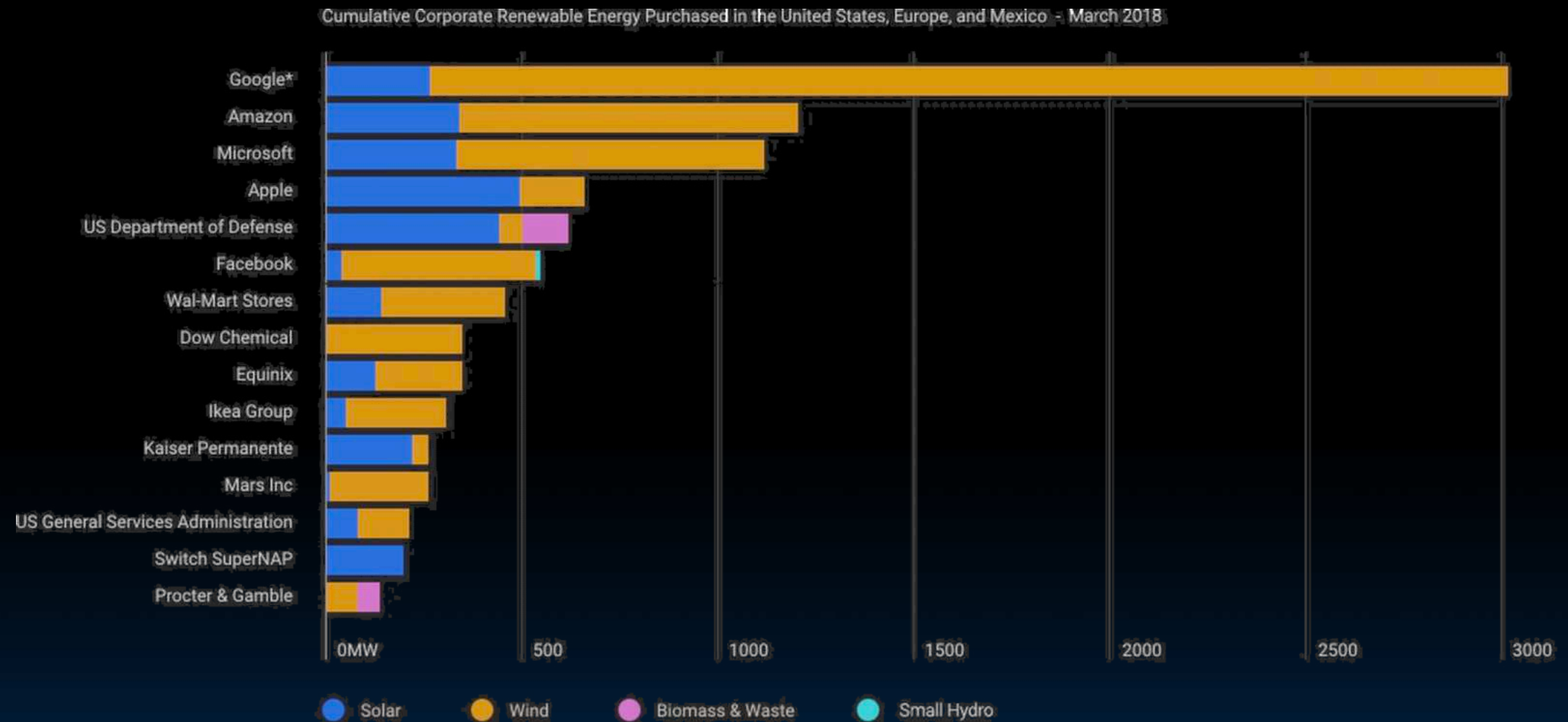


# Computing in the News

Urs Hölzle, Google SVP  
Co-author of today's reading



- **2011** [www.nytimes.com/2011/09/09/technology/google-details-and-defends-its-use-of-electricity.html](http://www.nytimes.com/2011/09/09/technology/google-details-and-defends-its-use-of-electricity.html)
  - Google disclosed that it continuously uses enough electricity to power 200,000 homes, but it says that in doing so, it also makes the planet greener.
  - Search cost per day (per person) same as running a 60-watt bulb for 3 hours
- **2018** [techcrunch.com/2018/04/04/google-matches-100-percent-of-its-power-consumption-with-renewables/](http://techcrunch.com/2018/04/04/google-matches-100-percent-of-its-power-consumption-with-renewables/)
  - Google: "Over the course of 2017, across the globe, for every kilowatt-hour of electricity we consumed, we purchased a kilowatt-hour of renewable energy from a wind or solar farm that was built specifically for Google. This makes us the first public Cloud, and company of our size, to have achieved this feat"



Source: Bloomberg New Energy Finance

\*Google total also includes one 80 MW project in Chile





# Summary

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- Parallelism is one of the Great Ideas
  - Applies at many levels of the system – from instructions to warehouse scale computers
- Post PC Era: Parallel processing, smart phone to WSC
- WSC SW must cope with failures, varying load, varying HW latency bandwidth
- WSC HW sensitive to cost, energy efficiency
- WSCs support many of the applications we have come to depend on

