

The Potential of Cloud Computing: Challenges, Opportunities, Impact

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Adapted from NAE Gilbreth Lecture, October 2011

Image: John Curley http://flickr.com/photos/jay_que/1834540/

Get Your Own Supercomputer

41.8 Teraflops on LINPACK benchmark

RAD

- #451 on current Top500 list of supercomputers
- No batch queues—start your job in minutes
- No grantwriting—just a credit card (from \$1300/hour, 1 hour minimum purchase)
- No need to predict usage—pay for what you use, add capacity on demand
- Lease several simultaneously, to run multiple experiments in parallel
- Matlab, Mathematica, other packages available

Warehouse Scale Computers

Built to support consumer demand of Web services (email, social networking, etc.)

RAD Lab

- "Private clouds" of Google, Microsoft, Amazon,
- "Warehouse scale" buying power = 5-7x cheaper hardware, networking, administration cost



photos: Cnet News, Sun Microsystems (Oracle), datacenterknowledge.com



- The first demonstration of how to build really large Internet sites out of *clusters* of *commodity* computers was done by:
- (a) Stanford
- (b) Berkeley
- (c) Yahoo!
- (d) Google
- (e) IBM



2008: Public Cloud Computing Arrives

Type & Price/Hour	1GHz core eqv.	RAM	Disk and/or I/O
Small - \$0.085	1	1.7 GB	160 GB
Large - \$0.34	4	7.5 GB	850 GB, 2 spindles
XLarge - \$0.68	8	15 GB	1690 GB, 3 spindles
- Cluster ("HPC") \$1.60	32*	23 GB	1690 GB + 10Gig Ethernet + optional 2x NVidia GPU

- Virtual machines from \$0.085/hr to \$2.10/hr
 - Pay as you go with credit card, 1 hr. minimum
 - Cheaper if willing to share or risk getting kicked off
 - Machines provisioned & booted in a few minutes

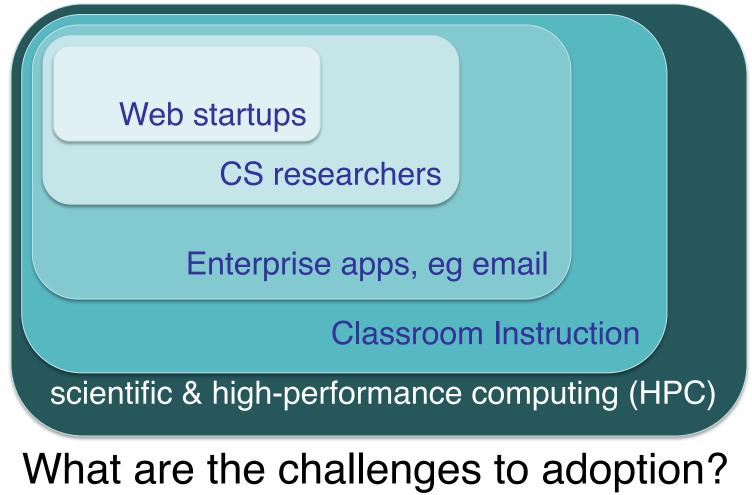
1,000 machines for 1 hr = 1 machine × 1,000 hrs

* 2x quad-core Intel Xeon (Nehalem)



What's In It For You?

Cloud Computing progress 2008-2011







• The first full Web browser running on a mobile device was developed by:

(a) Apple

- (b) Stanford
- (c) Berkeley
- (d) Nokia
- (e) Motorola

Hiding the Cloud's Complexity

- Sophisticated software can *hide complexity & mask unreliability* of cloud hardware
- Example: MapReduce (2004)
 - e.g.: "Apply f(x) over all these x, keep K max values"
 - Google's MapReduce software automatically masks failures and stewards cloud resources
 - Hadoop (open source version) followed soon after

"Warehouse scale" software engineering issues hidden from application programmer



MapReduce in Practice

- Example: classifying Twitter spam
 - training: 10^7 samples x 64KB data each = 640GB data
 - One heavy-duty server: ~270 hours
 - 100 servers in cloud: ~3 hours (~\$250)
- Rapid uptake in other scientific research
 - "top 5 pharma" molecular modeling: 3809 machines on Amazon cloud, **30K** cores, \$1279/hr* (Sep 2011)
 - Large-population genetic risk analysis & simulation (Harvard Medical School)
 - Genome sequencing (UNC Chapel Hill Cancer Ctr)
 - Compact Muon Solenoid Expt. (U. Nebraska Lincoln)
- What's the downside?



- Programmers must (re)express problems to expose parallelism
- ▲ parallel software hard to debug & operate, so build on existing successes
 - Pig (Yahoo! Research) & Hive (Apache Foundation) transform database queries to MapReduce
 - Rhipe—include MapReduce operations in R programs
- △ one abstraction doesn't fit all
 - e.g., clustering algorithms work poorly on MapReduce
 - Opportunity: common front-end to cloud & parallel programming tools (sejits.eecs.berkeley.edu)



Challenge: "non-cloudy" scientific codes

▲ Existing scientific codes "supercomputer-centric"

- reliability, static configuration, exclusive resource use...
- Time-to-answer may still be faster, since no wait!
- **Opportunity**: software that shares cloud among multiple frameworks (mesos.berkeley.edu)
- Opportunity: Vendors listening to HPC customers
 - Hardware: cloud-based "supercomputer" makes Top500 list (July 2010)
 - Software: MathWorks, Mathematica now support sending (parallel) computations to Amazon cloud



Challenge: Big Data

Application	Data generated per day* (1 TB = 10 ¹² bytes)
Genome Sequencing	1 TB (Illumina HiSeq machine) Cancer Genome Atlas: 5PB online by end of 2011
Large Synoptic Survey Telescope	30 TB 400 Mbps sustained xfer between Chile & NCSA
Large Hadron Collider	60 TB

▲ How to copy 8 TB (8×10¹² bytes) from cloud?

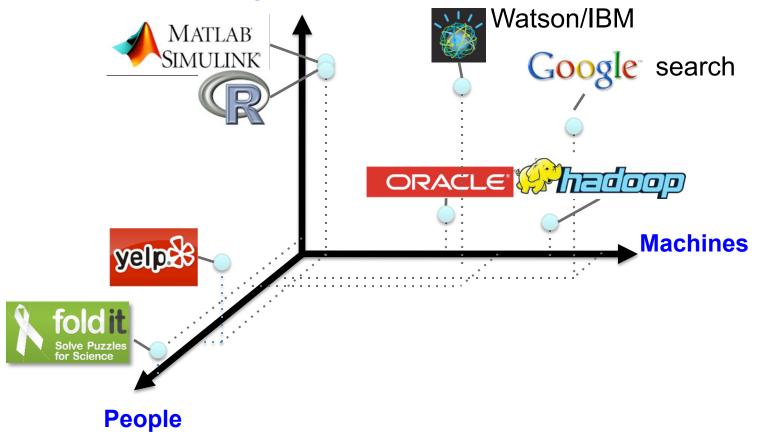
- 2009: Download at ~20 Mbps → 35 days, \$800
- 2010: Ship drive to Amazon → 1 day, \$150
- 2011: Pay-as-you-go fast network → <1 day, \$165
 - (~18 hours at 1 Gbps, 0.30/hr. + 0.02/GByte)

* Source: Ed Lazowska, eScience 2010, Microsoft Cloud Futures Workshop, lazowska.cs.washington.edu/cloud2010.pdf

Algorithms, Machines, People

Algorithms

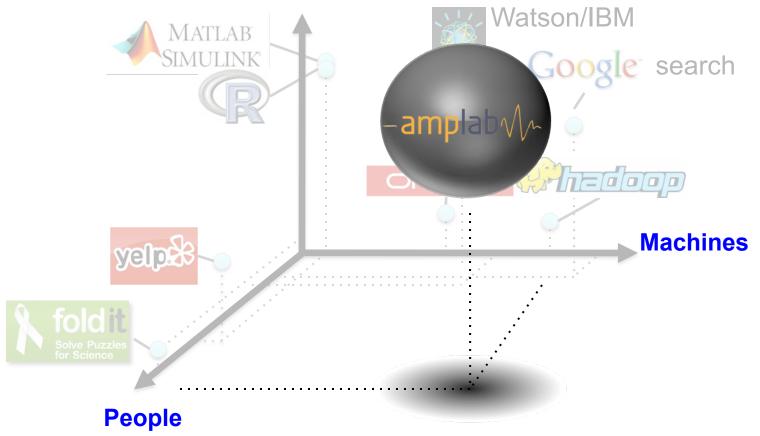
RAD Lab



RAD

The Berkeley AMP Lab

Algorithms





Trivia fact

• The percentage of Americans who will face cancer in their lifetimes is approximately:

(a) 1%
(b) 5%
(c) 10%
(d) 20%
(e) 30%



Trivia fact

• By next year, the "wet lab" cost of sequencing a human genome is expected to be about:

(a) \$1,000,000
(b) \$100,000
(c) \$10,000
(d) \$1,000
(e) None of the above

Opportunity: Application-Driven CS research

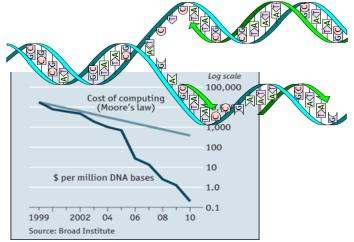


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RAD







By working with domain experts, we will create better tools to support big-data applications on cloud computing



Cloud & UCB EECS

- 1. Berkeley research culture: integrate leading research into teaching at all levels
- 2. RAD Lab need for "killer apps" to show off infrastructure

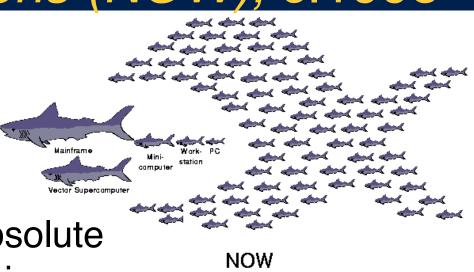
Current efforts (student counts approximate):

- Great Ideas in Computer Architecture (reinvented Fall 2010): 190 students
- Software Engineering for SaaS (Spr' 12 = 5th iteration): 50+50+50+70+100 students
- Operating Systems: 70 students
- Intro. Data Science: 30
- Adv. topics in HCI: 20 students
- Natural language processing: 20 students
- Cancer Genomics: 10 students



An Analogy: *Networks of Workstations (NOW),* c.1995

- Clusters of Commodity PC's vs. symmetric multiprocessors
- Potential advantages:
 incremental scaling, absolute capacity, commodity price



- 1995: Web software architecture was SMP-centric
- 2010: Berkeley undergrads prototype Web apps in 6–8 weeks and deploy on cloud computing
- 2015: scientists routinely do 1000-machine escience experiments using cloud computing



Conclusion

- Democratization of supercomputing capability
 - Time to answer may be faster even if hardware isn't
 - Writing a grant proposal around a supercomputer?
- Software & hardware for science-on-cloud improving at "commodity speed"
- Part of Computer Science "coming of age" with increasingly outward-looking research

Potential democratizing impact comparable to the microprocessor



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Thank you!