



# Forget about the Clouds, Shoot for the MOON

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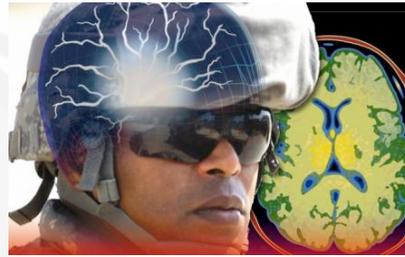
Dept. of Computer Science

Dept. of Electrical & Computer Engineering

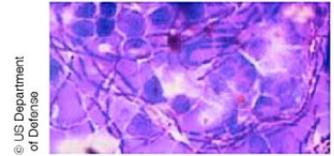
Virginia Bioinformatics Institute

# Motivation

- Data Deluge
  - New scientific instruments generate data rapidly
  - High-performance simulations generate a flood of data
  - Internet data sharing allows data caching and replication
- Need for Rapid Scientific Discovery



Cognitive Neuroscience

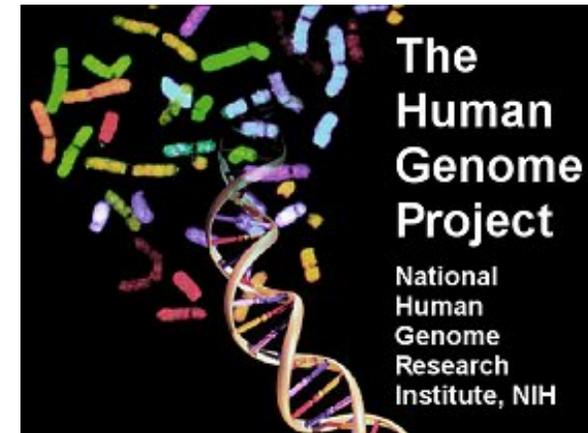


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Bioterrorism



Video Surveillance



Genomics

- Solution: Ubiquity of Parallel Computing

Images: Courtesy of <http://images.google.com/>

# Traditional Parallel Computing Resources

- Government-Funded Supercomputers
  - Not easily accessible to majority of scientists
  - Long queuing time
- Institutional Clusters
  - Expensive to acquire
    - Japan K Computer: \$1250M
    - DOE/Cray Jaguar: \$104M
    - Microsoft Datacenter: ????
  - Expensive to own
    - Facilities: O(\$10M - \$100M)
    - Operations: Power and cooling
    - Personnel: Experienced system administrators

## NSA Maxes Out Baltimore Power Grid

August 6th, 2006 : Rich Miller

The National Security Agency's technology infrastructure at Fort Meade, Md. has maxed out the electric capacity of the Baltimore area power grid, creating major challenge for the agency, sources told the Baltimore Sun. An excerpt:

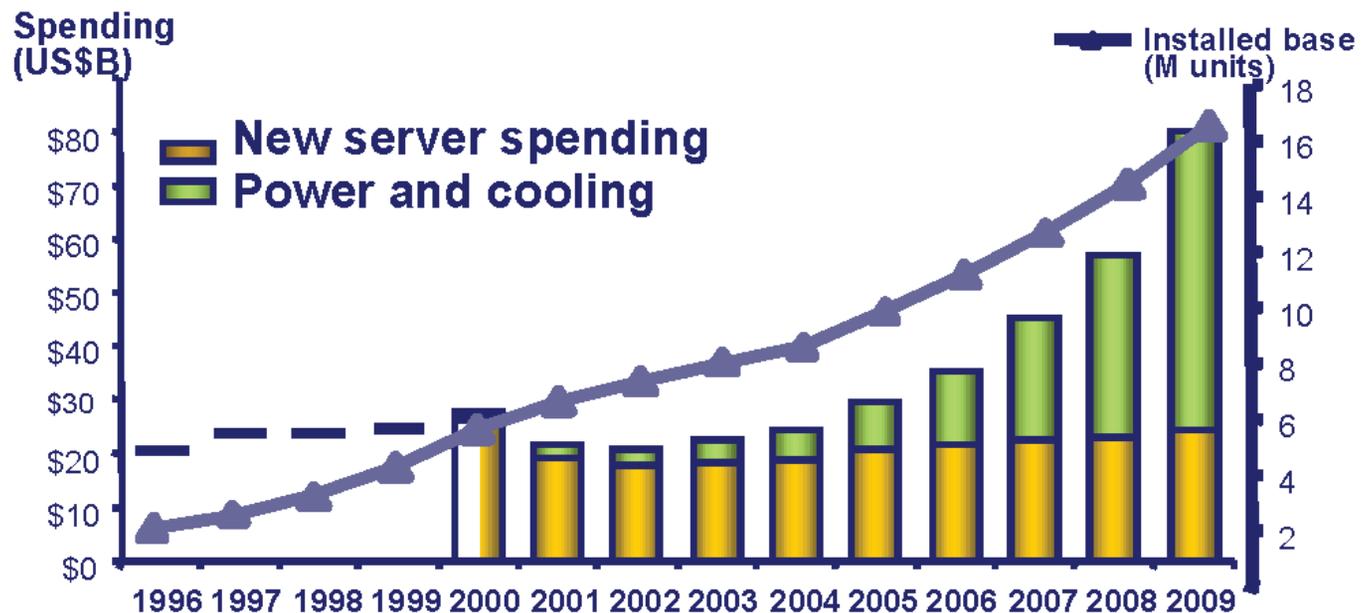
THE BUSINESS OF HOMELAND SECURITY

## NSA to build \$2 billion data center

Published 6 July 2009

# The Cost of Parallel Computing

- **Electrical power costs \$\$\$\$.**



Source: IDC & IBM, 2006.

# The Cost of Parallel Computing

## Examples: Power, Cooling, and Infrastructure \$\$\$

- Japanese K Computer
  - Power & Cooling: 9.89 MW → \$10M/year



# Cloud Computing Taxonomy

Public Clouds



Private Dedicated Clouds



Private Opportunistic Clouds



# Solution: Cloud Computing

Public Clouds



Private  
Dedicated  
Clouds



Private  
Opportunistic  
Clouds

Example: Our MOON Project



# Public Clouds

- Computing as Utility
- Commercial Clouds
  - Software as a Service
    - Gmail
  - Platform as a Service
    - Google AppEngine, Microsoft Azure
  - Infrastructure as a Service
    - Amazon EC2
- Academic Cloud
  - DOE Magellan



# Cloud Computing Taxonomy

Public Clouds



Private  
Dedicated  
Clouds



Private  
Opportunistic  
Clouds

Example: Our MOON Project

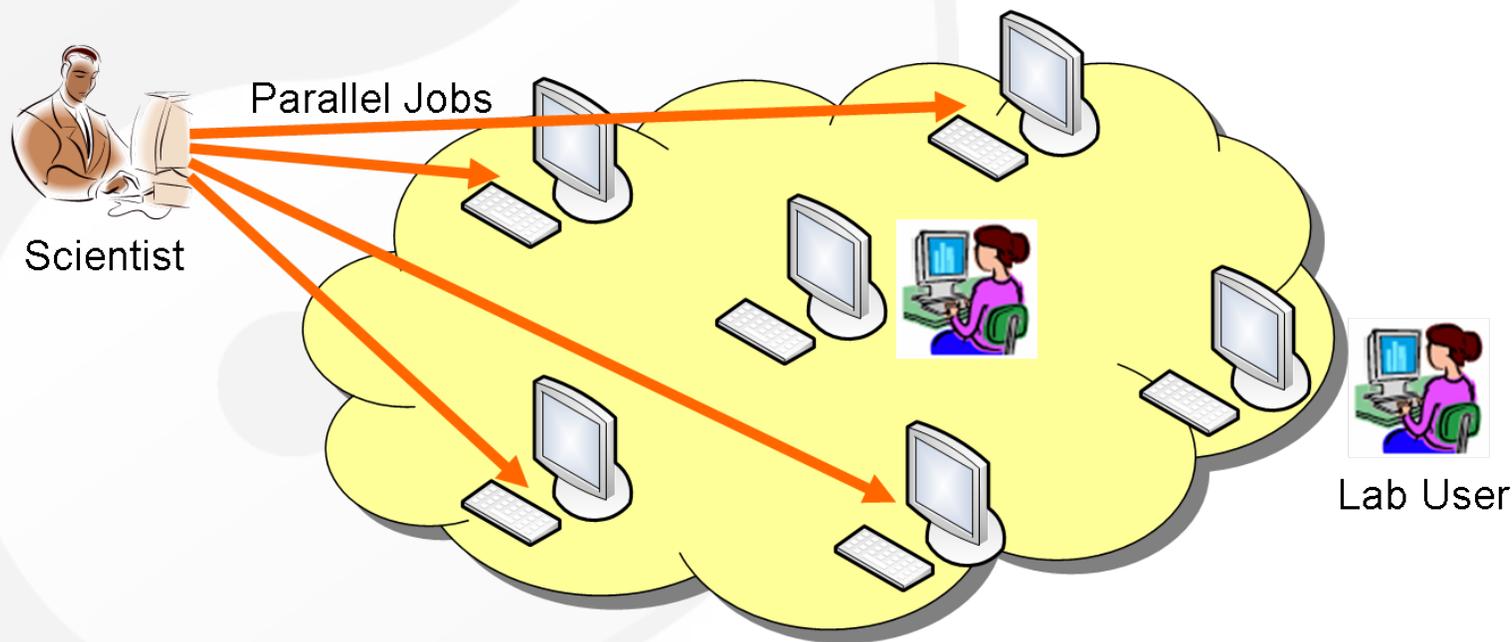


# Private Dedicated Clouds

- Pros
  - Currently Built on Dedicated Resources
    - Eucalyptus
    - Virtual Computing Lab
  - Better Security & Privacy
    - Behind the firewall
    - Owners have complete control of infrastructure
    - No data transfer to/from public networks
- Cons
  - Inflexible for handle load variance
  - Not that different from datacenter
    - \$\$\$ for infrastructure, power, and cooling

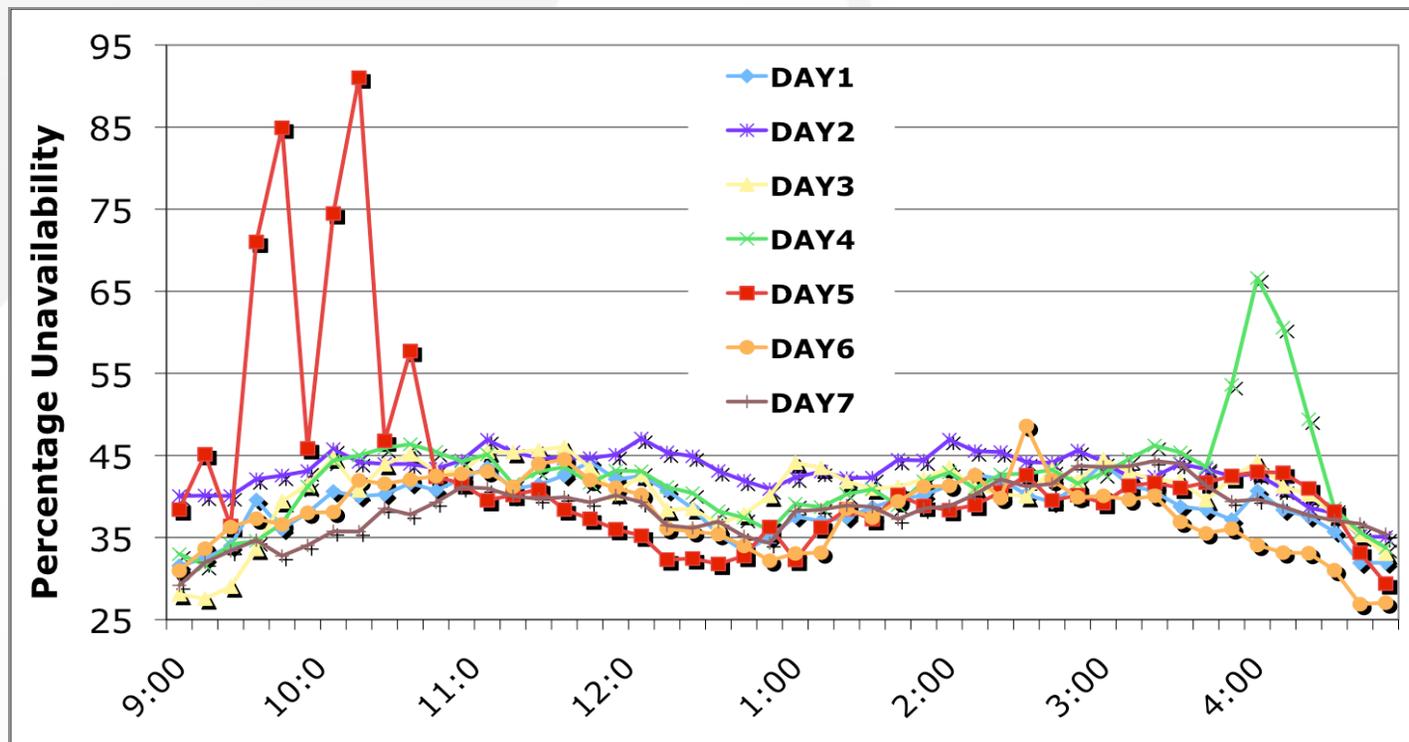
# Alternative Resources for Private Clouds?

- “Free” Computing Resources within Institutions:  
Idle Personal Computers
  - E.g. Math Emporium at VT: 550 dual-core Intel Mac
    - Collective compute power equivalent to a modest supercomputer



# Challenges

- Resource Volatility
  - Example opportunistic environment (Entropia @ SDSC)
    - Average unavailability 0.4 and as high as 0.9



# Cloud Computing Taxonomy

Public Clouds



Private  
Dedicated  
Clouds



Private  
Opportunistic  
Clouds

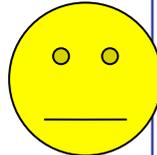
Example: Our MOON Project



# Private Opportunistic Clouds

- Private Cloud Computing on Opportunistic Resources
- Our Approach
  - MOON: MapReduce On Opportunistic eNvironments
    - Platform as a Service
      - Reliable and efficient MapReduce service
- Minimize performance impact to desktop users
  - ... *while*  
delivering compute cycles to cloud end users

# Comparison

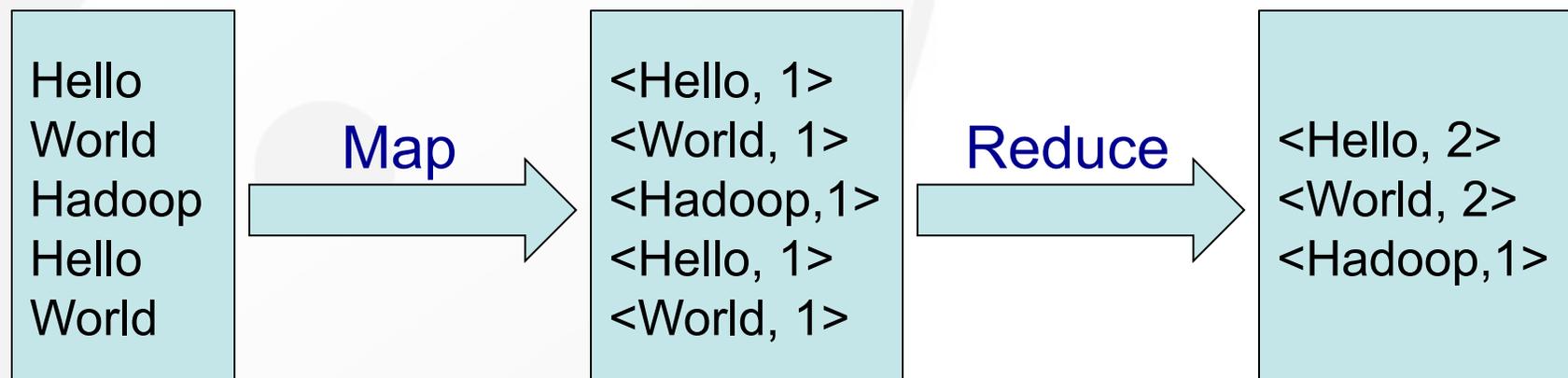
	Public Clouds	Private Dedicated Clouds	Private Opportunistic Clouds
Cost Efficiency			
Security & Privacy			
Accessibility			
Performance			 → 

# Roadmap

- Introduction
- MOON: MapReduce On Opportunistic eNvironments
  - What is MapReduce?
  - What is an Opportunistic Environment?
  - Overview of MOON
  - Data Management
  - Task Scheduling
- Results
- Conclusion

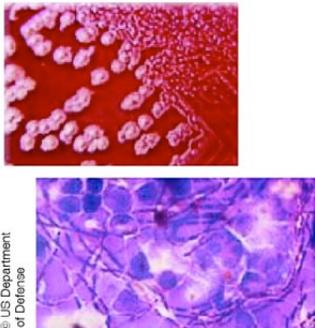
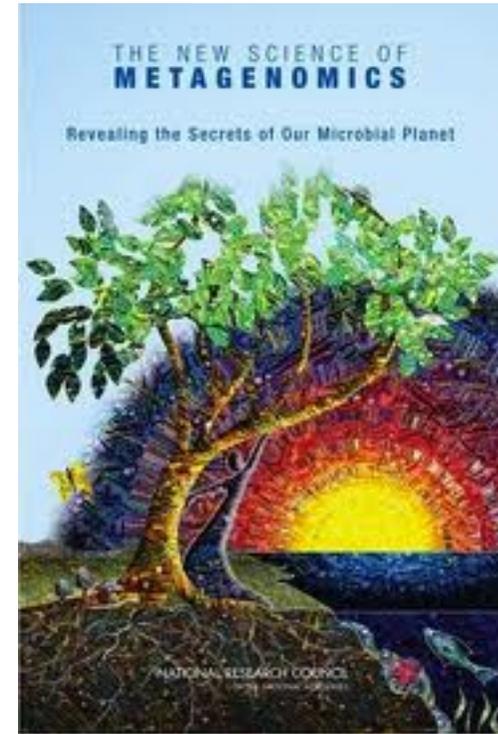
# What is MapReduce?

- Ease of Use
  - Primitives from Lisp: Map and Reduce
  - Automatic parallel execution, fault-tolerance by runtime
- Efficient for Large-Scale Data Processing
  - Deliver computation to data
- Example: Word Count

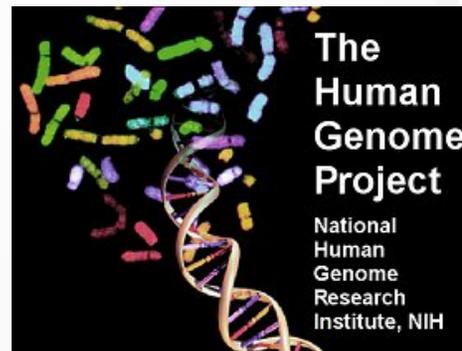


# Many Applications to Bio

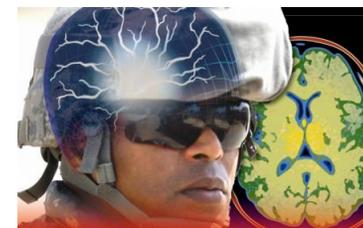
- Computational Biology
  - Sequence alignment
  - Short-read sequence mapping
- Data Mining
  - Temporal data mining
  - K-means clustering
  - Genetic Algorithms



*Bioterrorism*



*Genomics*

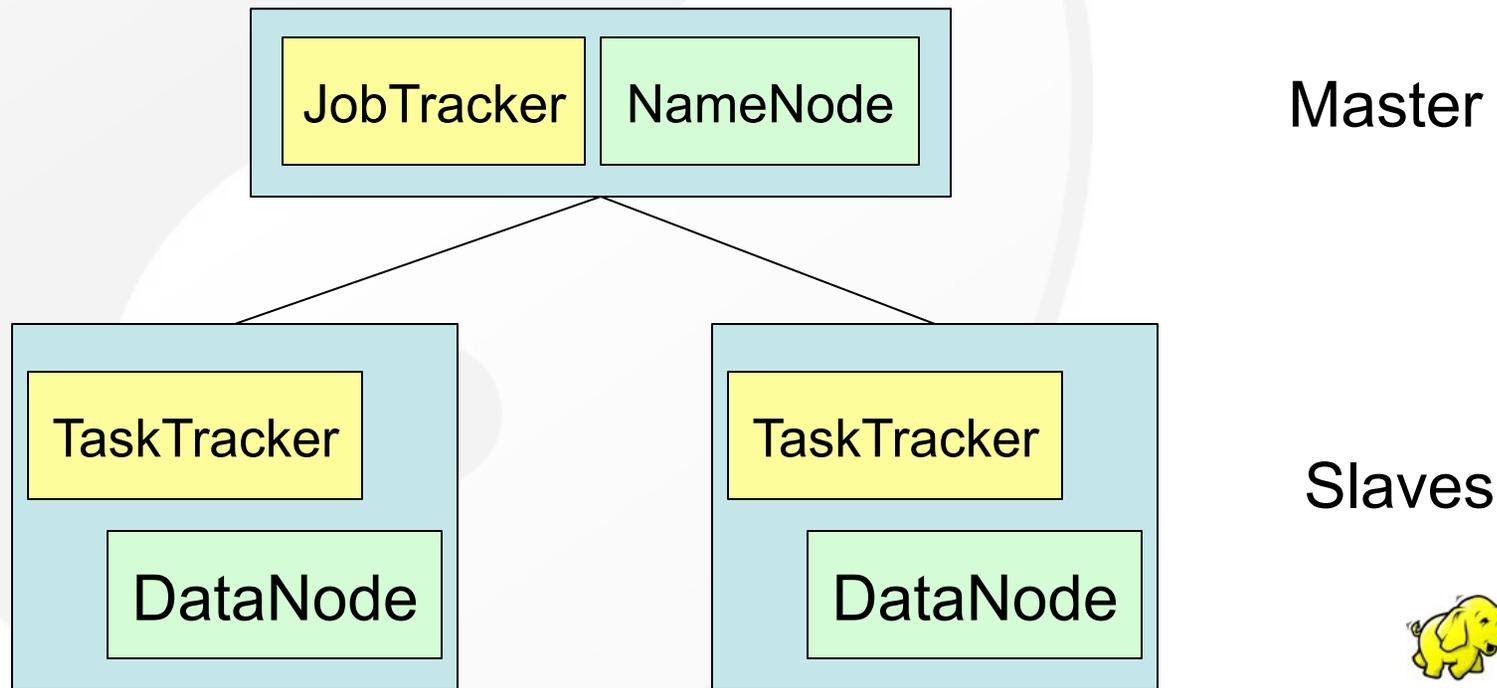


*Cognitive Neuroscience*

Images: Courtesy of  
<http://images.google.com/>

# Hadoop

- Open-Source MapReduce Implementation
  - Widely used: Yahoo!, Facebook, Amazon and many others
- Master-Slave Architecture
  - Coupled with Hadoop Distributed File System (HDFS)



# What is an Opportunistic Environment?

- Resources come and go without notice
  - E.g., Condor yield for 15 minutes after keyboard/mouse events
- Examples: BOINC and Condor
- Limitations
  - Limited programming models
    - Embarrassingly parallel
    - Master-worker programming model
  - Inefficient support for data-intensive applications

# Our Solution: MOON

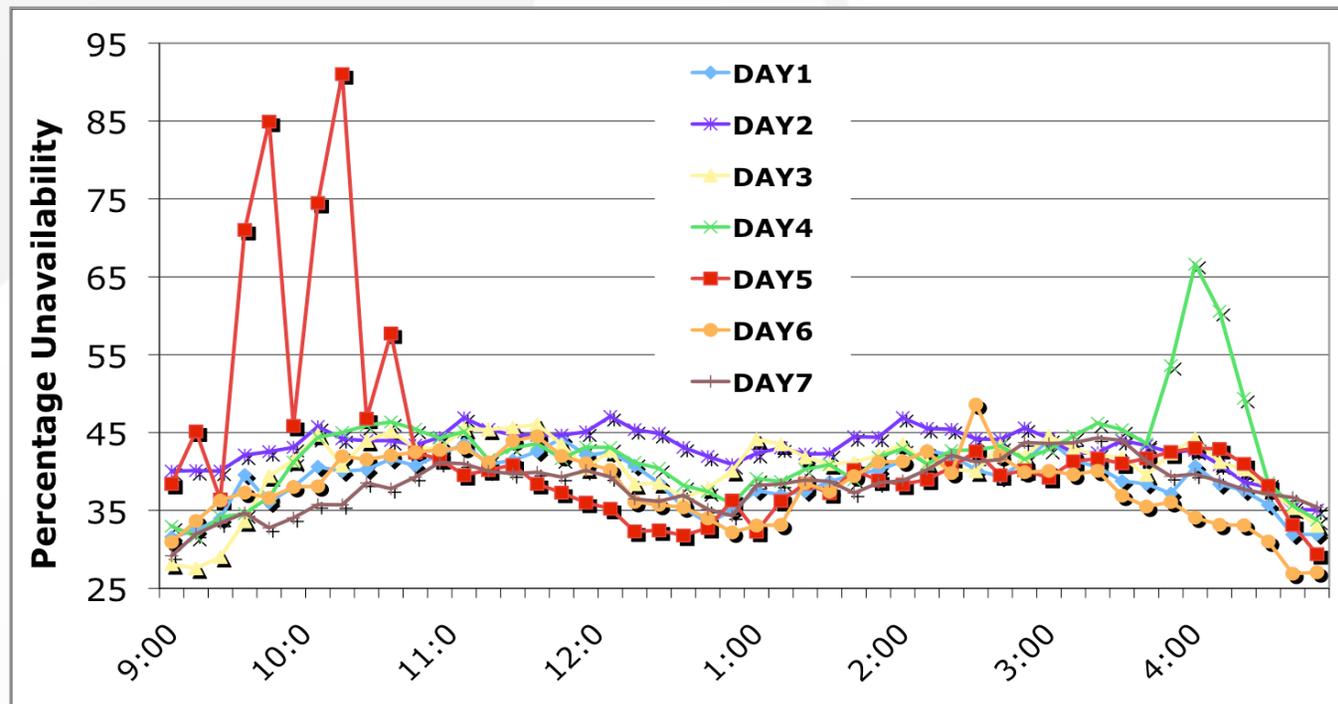
- Combining the expressiveness of MapReduce with the latent computing capability of idle compute resources, i.e., opportunistic environments
- MapReduce + Opportunistic Environments

or

- MapReduce On Opportunistic eNvironments

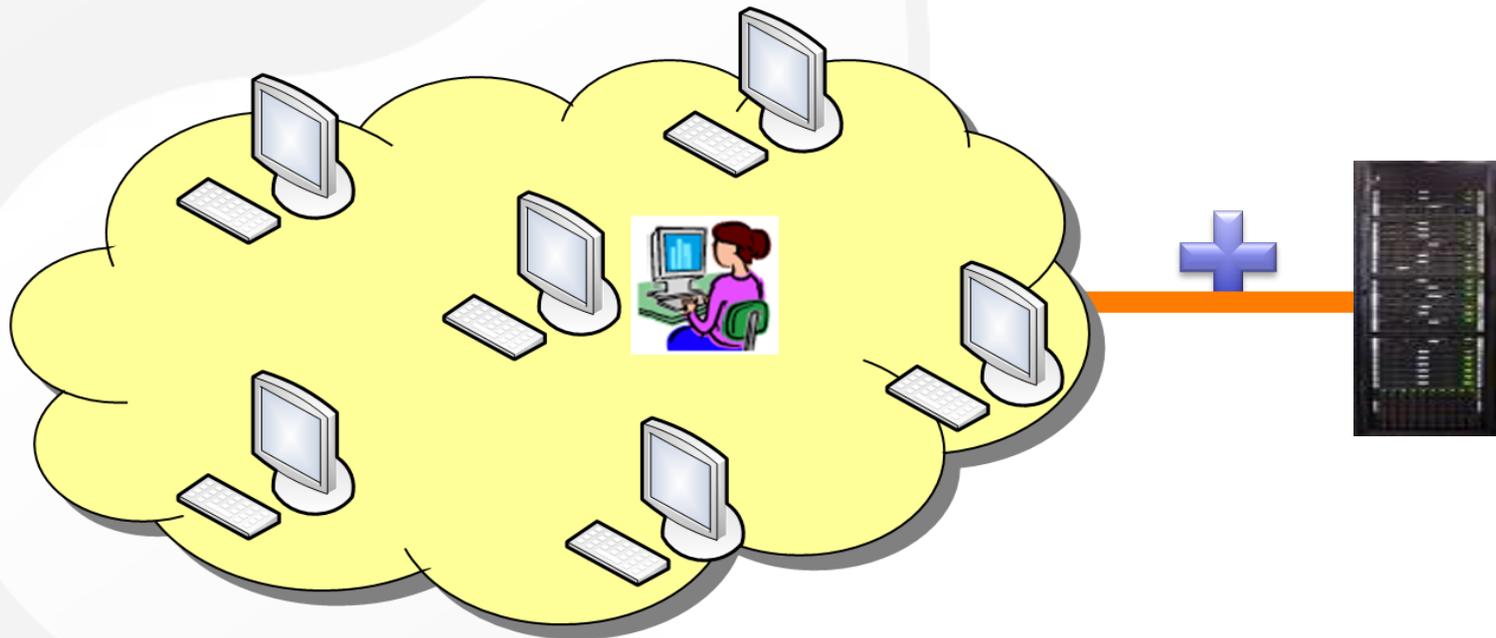
# MOON Overview

- Observation
  - Opportunistic resources not dependable enough to provide reliable service



# MOON Overview (Cont.)

- Hybrid Resource Provisioning
  - Supplement volatile PCs with **a small #** of dedicated computers
- Extend Hadoop Task Scheduling & Data Management

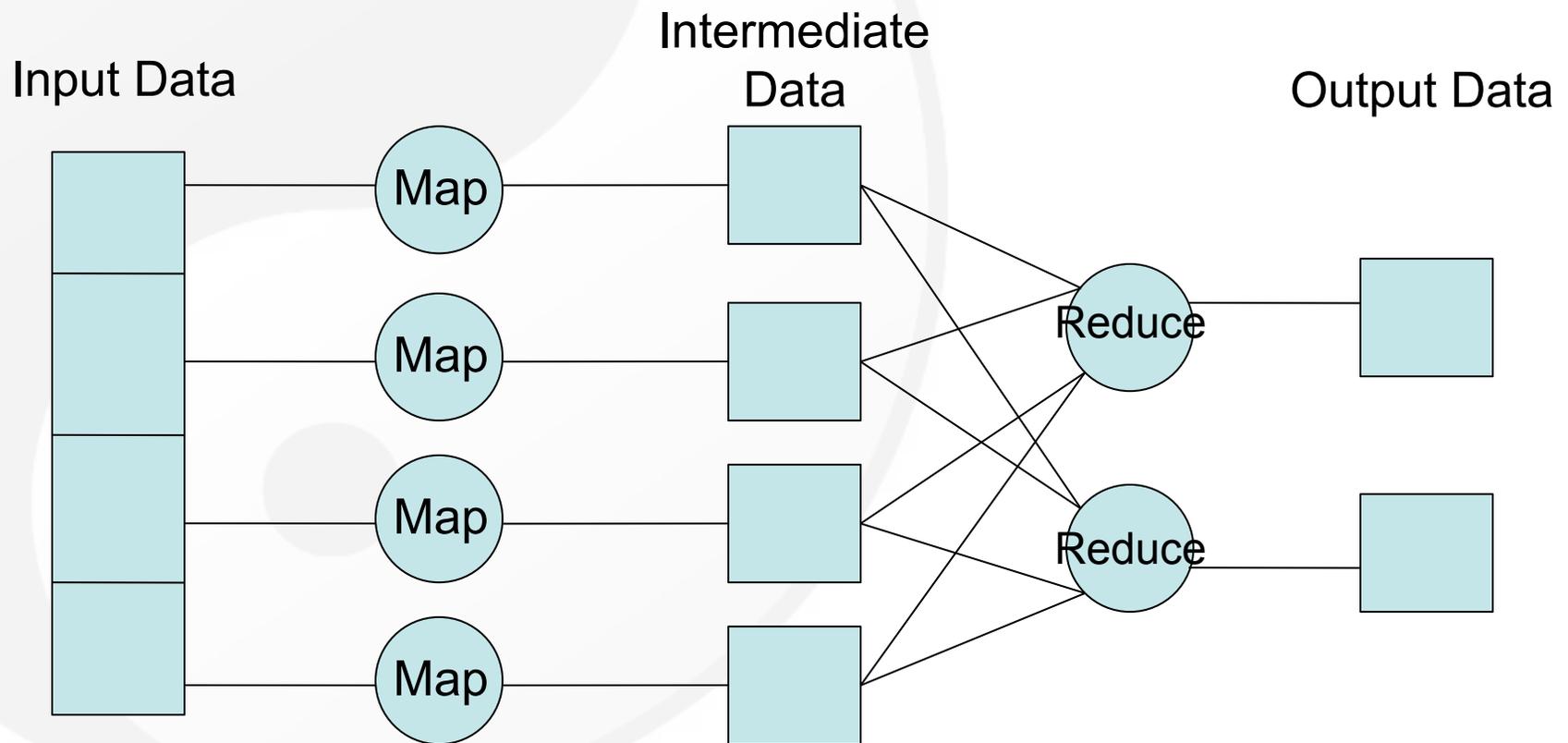


# Roadmap

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- **MOON: MapReduce On Opportunistic eNvironments**
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# MapReduce Data Model

- Data Dependencies
  - A Map task depends on its corresponding input data
  - A Reduce task depends on intermediate data of ALL map tasks



# Hadoop Data Management

- Design Summary
  - Uniform replication of input/output data
  - No replication for intermediate data
- Limitations on Opportunistic Environments
  - Prohibitively high replication cost for reliable data service
    - E.g., 11 replicas to achieve 99.99% availability on resources with 0.4 unavailability rate:  $1 - 0.4^{11} = 0.99996$
  - Frequent Map task re-execution caused by loss of intermediate data
    - Too many re-execution could cause **job failure**

# MOON Data Management Enhancement

- Reduce Replication Cost with Hybrid Replication
  - Two dimensional replication factor  $\langle d, v \rangle$
  - E.g., 1 dedicated and 3 volatile copies to achieve 99.99% availability (0.001 unavailability rate on dedicated node)
    - $1 - 0.001 * 0.4^3 = 0.99994$
- Design Challenges
  - # dedicated nodes  $\ll$  # volatile nodes
  - Dedicated nodes can be overloaded with incautious I/O

# Cost-Efficient Replication

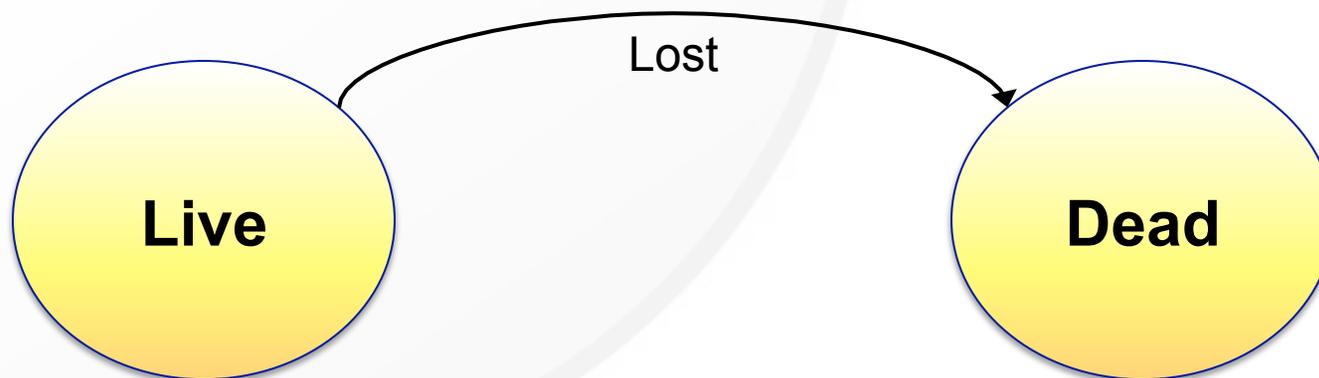
- Reserve Dedicated Resources for Important Data
- Differentiate Data in the File System
  - **Reliable Files:** Cannot afford loss
    - System data, input data
  - **Opportunistic Files:** Can be regenerated
    - Intermediate data – rerun map tasks
    - Output data – rerun reduce tasks
- Avoid Overloading Dedicated Nodes by Prioritizing I/O
  - Write access: Opportunistic files yield to reliable files on dedicated nodes
  - Read access: Data supplied by the volatile nodes first

# Hadoop Task Scheduling

- Speculative Task Dispatching for **Stragglers**
  - Task progress score proportional to processed data
  - Straggler: progress score 20% slower than average
  - Uniform replication: each task replicated at most once
- Issue: Design Assumption Broken
  - Original assumption: Tasks run smoothly till completion
  - Opportunistic environment: Frequent task suspension/resume
- Result: Misidentification of Stragglers

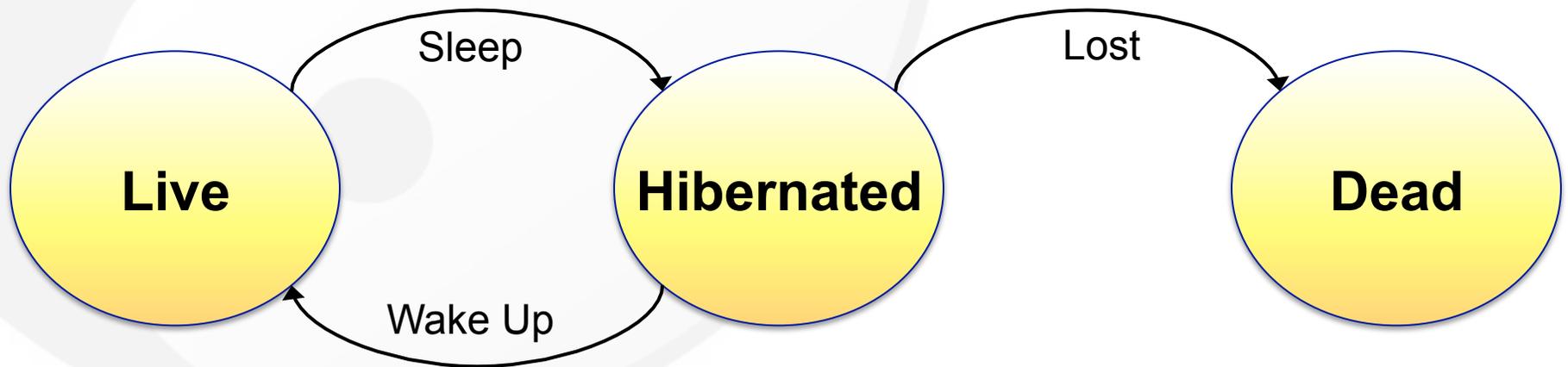
# Hadoop Task Suspension Handling

- Heartbeat Mechanism
  - Mark a TaskTracker dead when no heartbeat in expiring interval
  - All tasks on a dead node killed and rescheduled
- Inflexible
  - If expiring interval too long, speculative copy too slow
  - If expiring interval too short, tasks killed prematurely



# MOON Task Suspension Handling

- Introduce **hibernated** state for TaskTracker
  - Give replication priority to **frozen** tasks, i.e., all copies on hibernated nodes
  - Configure hibernating interval much shorter than expiring interval
- Advantages
  - Fast response to task suspension
  - Prevent killing tasks prematurely



# Leverage Dedicated Resources

- Assign Tasks to Dedicated Nodes when Possible
- Advantages
  - Save replication cost
    - Tasks with dedicated copy do not participate homestretch phase
  - Improve efficiency of long-running tasks
    - No suspension/interruption
    - Guarantee completion

# Roadmap

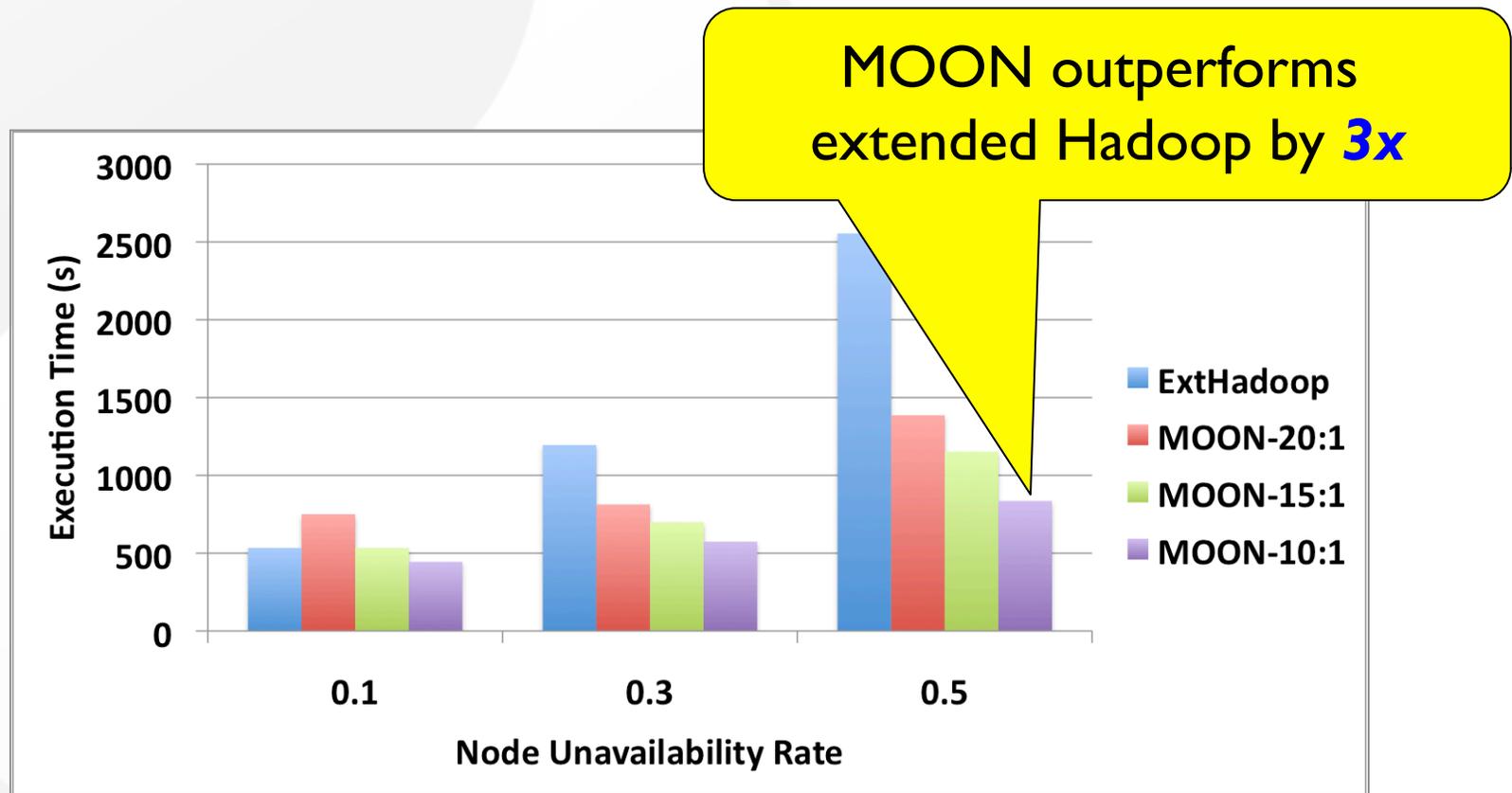
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# Experiment Setup

- Methodology
  - Emulate opportunistic environments on clusters with configuration similar to student labs
  - Control degree of volatility with randomly generated machine unavailability traces
- Platform
  - System X at Virginia Tech
  - Dual 2.3GHz PowerPC 970FX processors
    - 4GB of RAM
    - Gigabit Ethernet

# Overall Performance

- Extended Hadoop with intermediate data replication
- MOON hybrid setting: 20:1, 15:1, 10:1



# Acknowledgements

- Seed funding was provided in part by the Virginia Tech Foundation (VTF).
- We actively seek additional collaborations, partnerships, funding, and customers to extend and harden MOON.

# Conclusion

- Ubiquity of parallel computing and the importance of high-end computing for scientific discovery
- MOON provides cost-efficient parallel computing solutions on private clouds
  - High-quality MapReduce services
  - Reliable data storage
- *Forget about the clouds, shoot for the MOON!*