Quantitative Productivity Measurements in an HPC Environment

May 26, 2007

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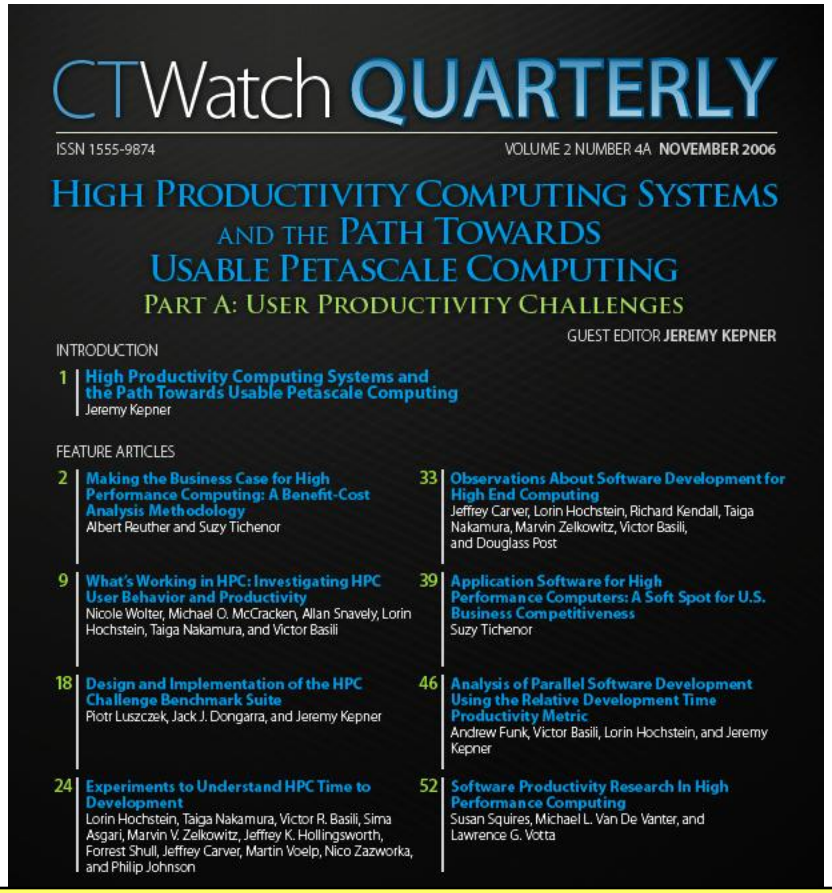
Outline

- **Introduction**
  - ***Background***
  - ***Notional Productivity***
  - ***Formal Productivity***
- LLGrid Environment
- Results
- Summary

Background



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HIGH PRODUCTIVITY COMPUTING SYSTEMS AND THE PATH TOWARDS USABLE PETASCALE COMPUTING

PART A: USER PRODUCTIVITY CHALLENGES

GUEST EDITOR JEREMY KEPNER

INTRODUCTION

1 | High Productivity Computing Systems and the Path Towards Usable Petascale Computing
Jeremy Kepner

FEATURE ARTICLES

2 | Making the Business Case for High Performance Computing: A Benefit-Cost Analysis Methodology
Albert Reuther and Suzy Tichenor

9 | What's Working in HPC: Investigating HPC User Behavior and Productivity
Nicole Wolter, Michael O. McCracken, Allan Snavely, Lorin Hochstein, Taiga Nakamura, and Victor Basili

18 | Design and Implementation of the HPC Challenge Benchmark Suite
Piotr Luszczek, Jack J. Dongarra, and Jeremy Kepner

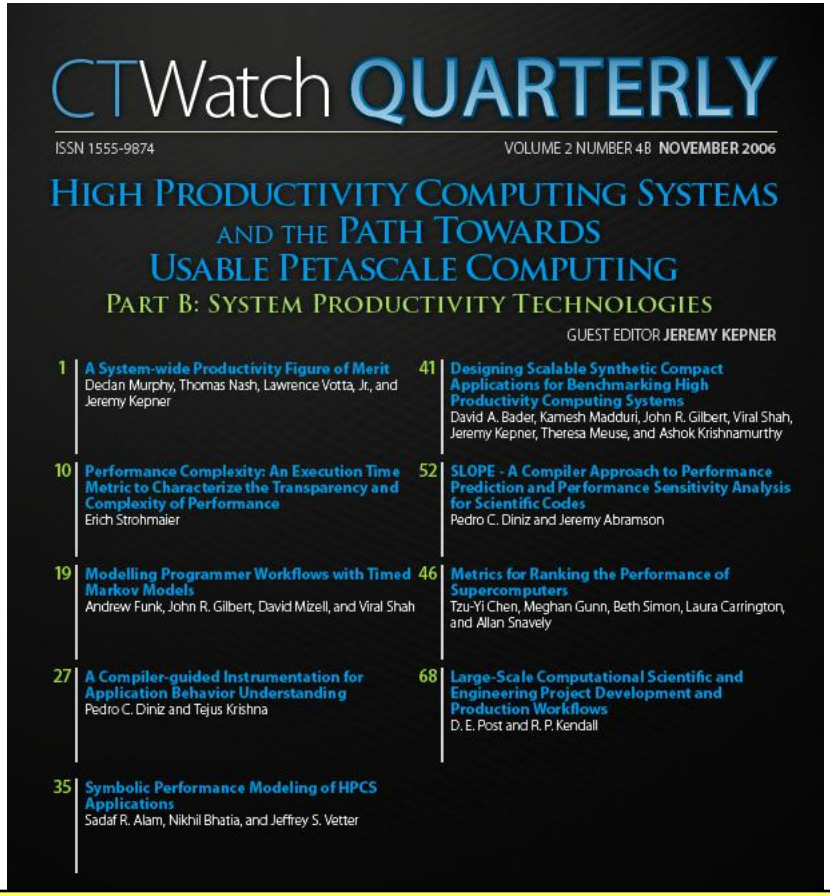
24 | Experiments to Understand HPC Time to Development
Lorin Hochstein, Taiga Nakamura, Victor R. Basili, Sima Asgari, Marvin V. Zelkowitz, Jeffrey K. Hollingsworth, Forrest Shull, Jeffrey Carver, Martin Voelp, Nico Zazworka, and Philip Johnson

33 | Observations About Software Development for High End Computing
Jeffrey Carver, Lorin Hochstein, Richard Kendall, Taiga Nakamura, Marvin Zelkowitz, Victor Basili, and Douglass Post

39 | Application Software for High Performance Computers: A Soft Spot for U.S. Business Competitiveness
Suzy Tichenor

46 | Analysis of Parallel Software Development Using the Relative Development Time Productivity Metric
Andrew Funk, Victor Basili, Lorin Hochstein, and Jeremy Kepner

52 | Software Productivity Research In High Performance Computing
Susan Squires, Michael L. Van De Vanter, and Lawrence G. Votta



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HIGH PRODUCTIVITY COMPUTING SYSTEMS AND THE PATH TOWARDS USABLE PETASCALE COMPUTING

PART B: SYSTEM PRODUCTIVITY TECHNOLOGIES

GUEST EDITOR JEREMY KEPNER

1 | A System-wide Productivity Figure of Merit
Declan Murphy, Thomas Nash, Lawrence Votta, Jr., and Jeremy Kepner

10 | Performance Complexity: An Execution Time Metric to Characterize the Transparency and Complexity of Performance
Erich Strohmaier

19 | Modelling Programmer Workflows with Timed Markov Models
Andrew Funk, John R. Gilbert, David Mizell, and Viral Shah

27 | A Compiler-guided Instrumentation for Application Behavior Understanding
Pedro C. Diniz and Tejus Krishna

35 | Symbolic Performance Modeling of HPCS Applications
Sadaf R. Alam, Nikhil Bhatia, and Jeffrey S. Vetter

41 | Designing Scalable Synthetic Compact Applications for Benchmarking High Productivity Computing Systems
David A. Bader, Kamesh Madduri, John R. Gilbert, Viral Shah, Jeremy Kepner, Theresa Meuse, and Ashok Krishnamurthy

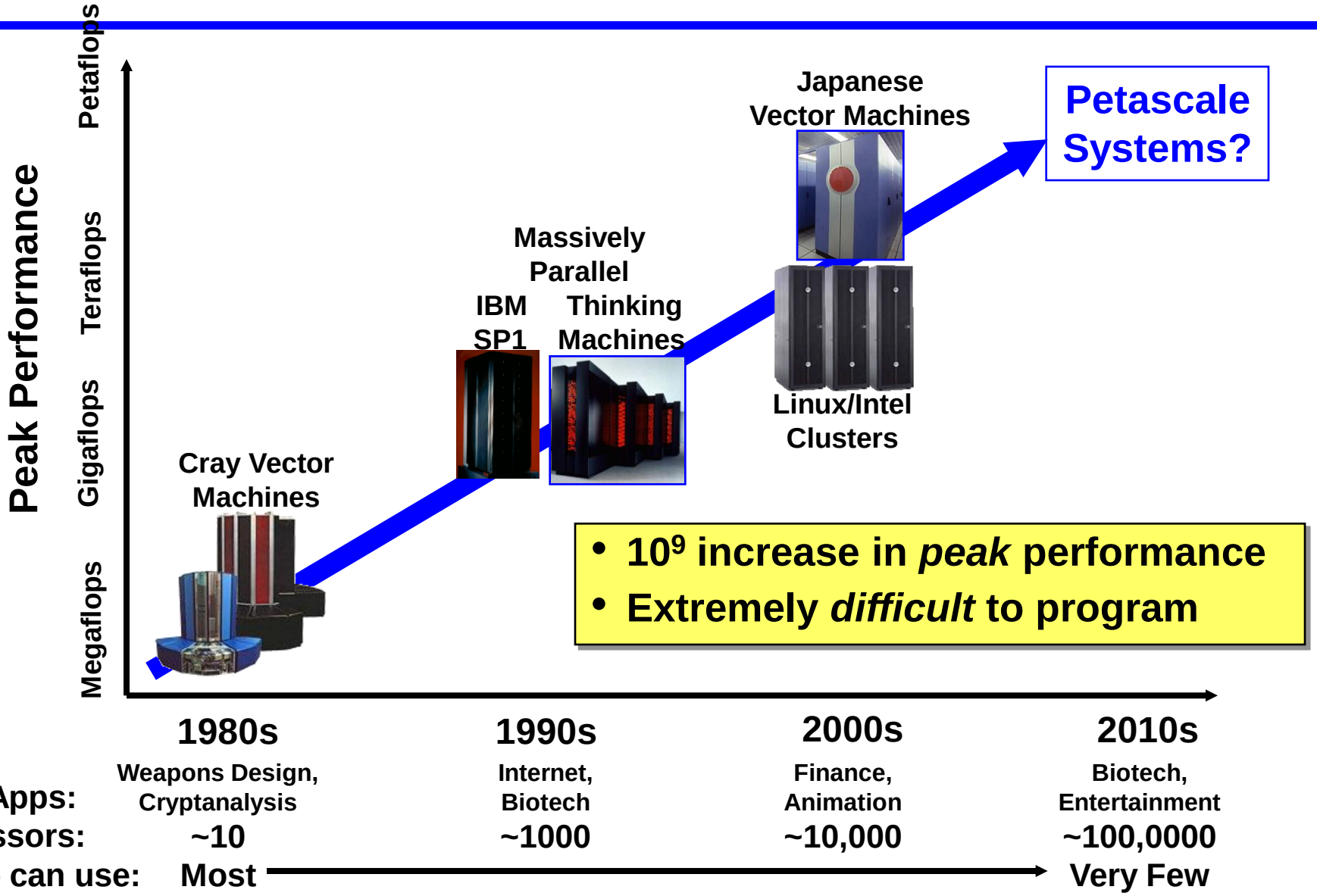
52 | SLOPE - A Compiler Approach to Performance Prediction and Performance Sensitivity Analysis for Scientific Codes
Pedro C. Diniz and Jeremy Abramson

46 | Metrics for Ranking the Performance of Supercomputers
Tzu-Yi Chen, Meghan Gunn, Beth Simon, Laura Carrington, and Allan Snavely

68 | Large-Scale Computational Scientific and Engineering Project Development and Production Workflows
D. E. Post and R. P. Kendall

"The productivity of HPC users intrinsically deals with some of the brightest people on the planet, solving very complex problems, using the most complex computers in the world. Anyone who truly wants to get insight into such a complex situation must be prepared to invest some time in the endeavor."

Evolution of Supercomputing



Notional Concept of Productivity (~2000)

- Not sure what it is but know we want it to be better
- "Big Tent" Philosophy
  - Lots of good things to do, pursue them all?
- Focus on:
  - Real (not peak) performance of critical national security applications
  - Programmability: reduce cost and time of developing applications
  - Software portability and system robustness

Formal Definition of Productivity (~2007)

- **Productivity is a *very* well defined concept in economics**

Productivity = Utility/Cost

- **In an HPC Context**

$$\Psi \equiv \frac{U}{C} = \frac{U(T)}{C_S + C_O + C_M}$$

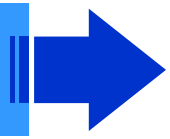
ψ = productivity [utility/$]
U = utility [user specified]
T = time to solution [time]
C = total cost [$]

C_S = software cost [$]
C_O = operation cost [$]
C_M = machine cost [$]

- **Software costs include time spent by users making codes parallel**
- **Operating costs include admin time, electric and building costs**
- **Utility is the stakeholder specific benefit of getting a result**
  - **Decision Makers**
  - **Project Managers**
  - **Users**
  - **Administrators**
  - **Service Engineers**
  - **Operators**
  - **Vendors/Designers**
  - **Technology Researchers**

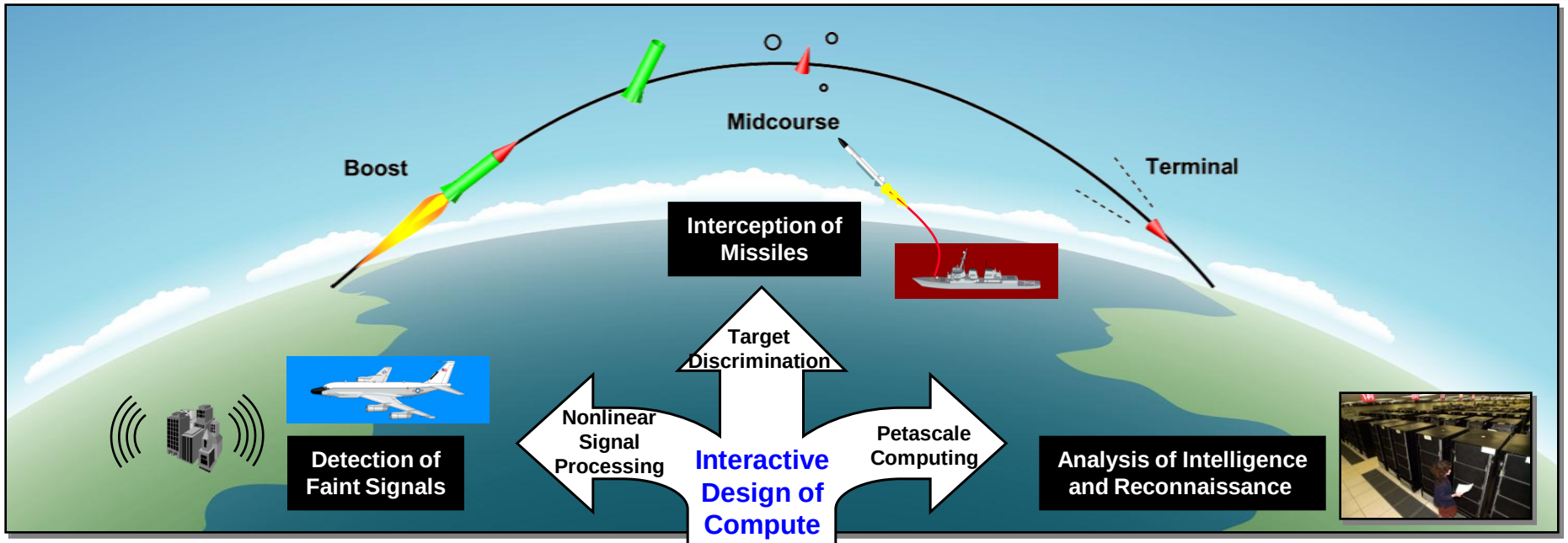
Outline

- Introduction
- **LLGrid Environment**
- User Impact
- Summary



- ***Lincoln Mission***
- ***User Requirements***
- ***ROI Model***
- ***LLGrid Implementation***

Lincoln Mission: Rapid Algorithm Development for National Security



Requires
Iterative, Interactive Development

Requires
~10 Teraflops Computation
~1 Petabyte Virtual Memory

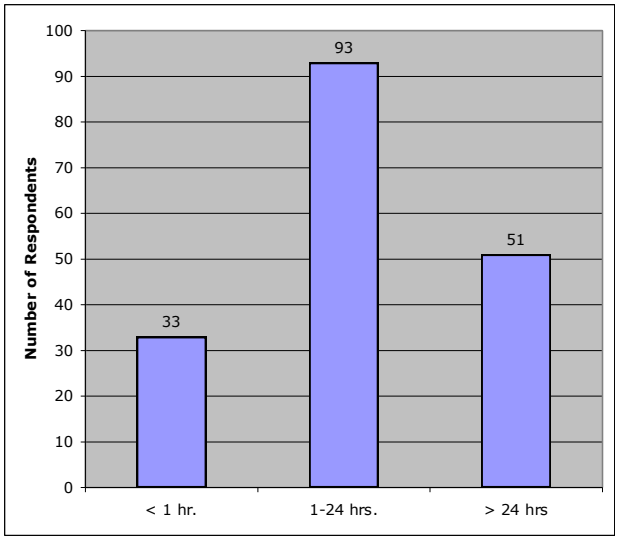
Java MATLAB MatlabMPI pMatlab LLGrid

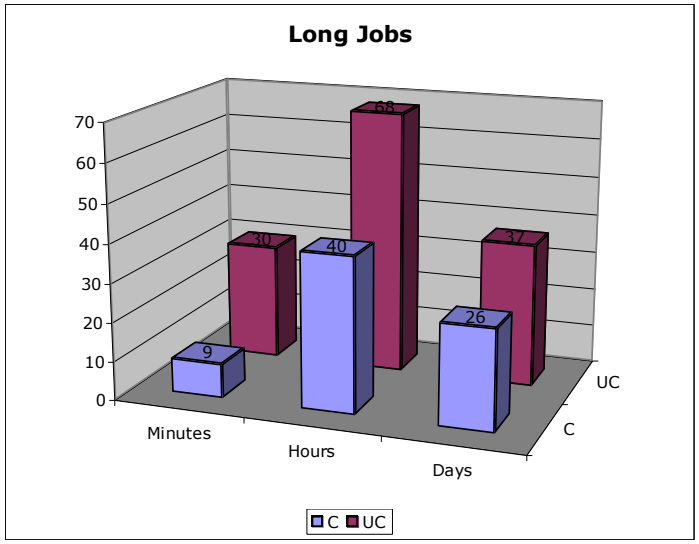
Solution
High Level Interactive Programming Environments

Solution
HPCMP Distributed HPC Project Hardware

- **HPC can significantly accelerate the interactive development and testing of algorithms critical to National Security**

User Requirements Survey





- **Conducted survey (03-Nov-03) of Lab staff**
  - **Do you run long MATLAB jobs?**
  - **How long do those jobs run (minutes, hours, or days)?**
  - **Are these jobs unclassified, classified, or both?**
- **Survey results:**
  - **464 respondents**
  - **177 answered "Yes" to question on whether they run long jobs**
- **Lincoln MATLAB users:**
  - **Engineers and scientists, generally not computer scientists**
  - **Little experience with batch queues, clusters, or mainframes**
  - **Solution must be easy to use**

Measuring Return On Investment

$$\text{productivity (ROI)} = \frac{\left[\ \text{Utility}\ \right]}{\left[\ \text{Software Cost}\ \right] + \left[\ \text{Maintenance Cost}\ \right] + \left[\ \text{System Cost}\ \right]}$$

Measuring Return On Investment

$$\text{productivity (ROI)} = \frac{\left(\text{time saved by users on system}\right)}{\left(\text{time to parallelize}\right) + \left(\text{time to train}\right) + \left(\text{time to launch}\right) + \left(\text{time to admin.}\right) + \left(\text{system cost}\right)}$$

Measuring Return On Investment

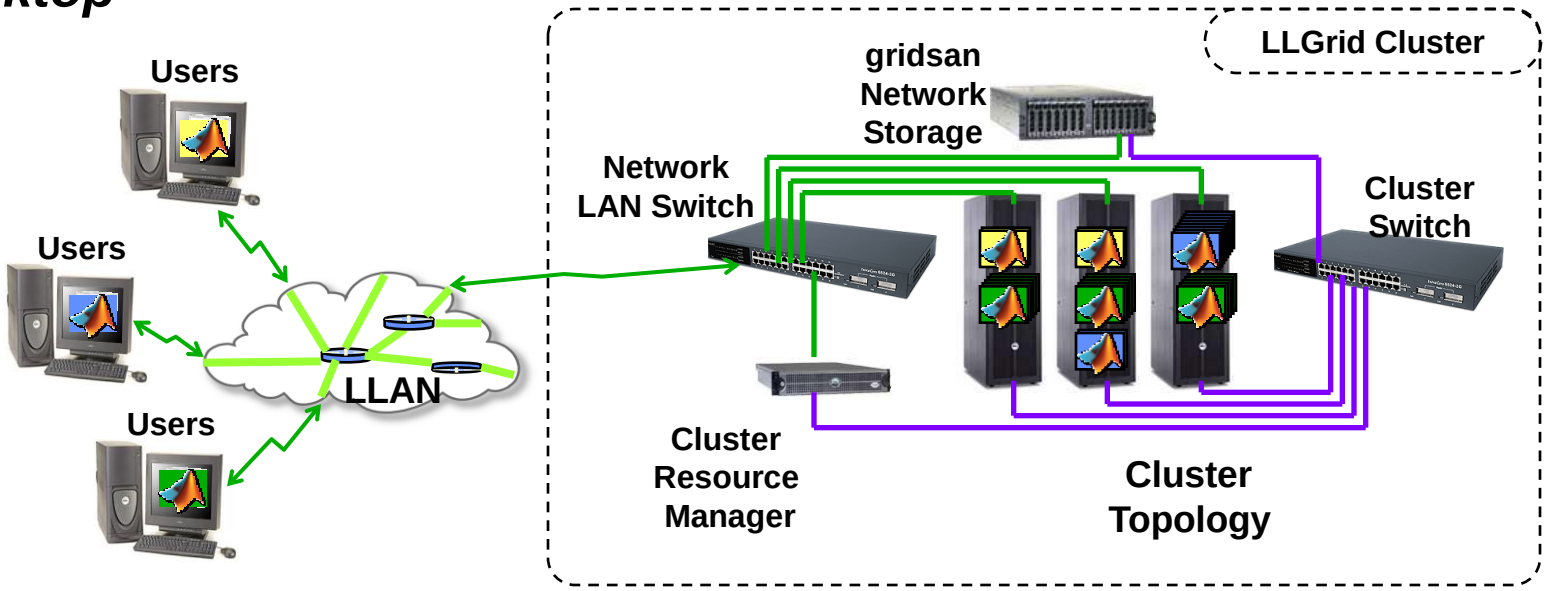
$$\text{productivity (ROI)} = \frac{\text{time saved by users on system}}{\text{time to parallelize} + \text{time to train} + \text{time to launch} + \text{time to admin.} + \text{system cost}}$$

LLGrid Implementation Approach

- Focus on accelerating user apps; test tools on benchmarks
- Focus on broad user base
- Keep code changes to a few lines (PGAS)
- Use familiar environment (pMatlab)
- Use hands on expert consulting model
- 100% Interactive (no waiting)
- Build/train admin team first, then scale hardware
- Co-design system and facility

LLGrid Scalable System Architecture

Goal: ***To make enterprise wide access to high throughput Grid computing and distributed storage as easy as running on the desktop***

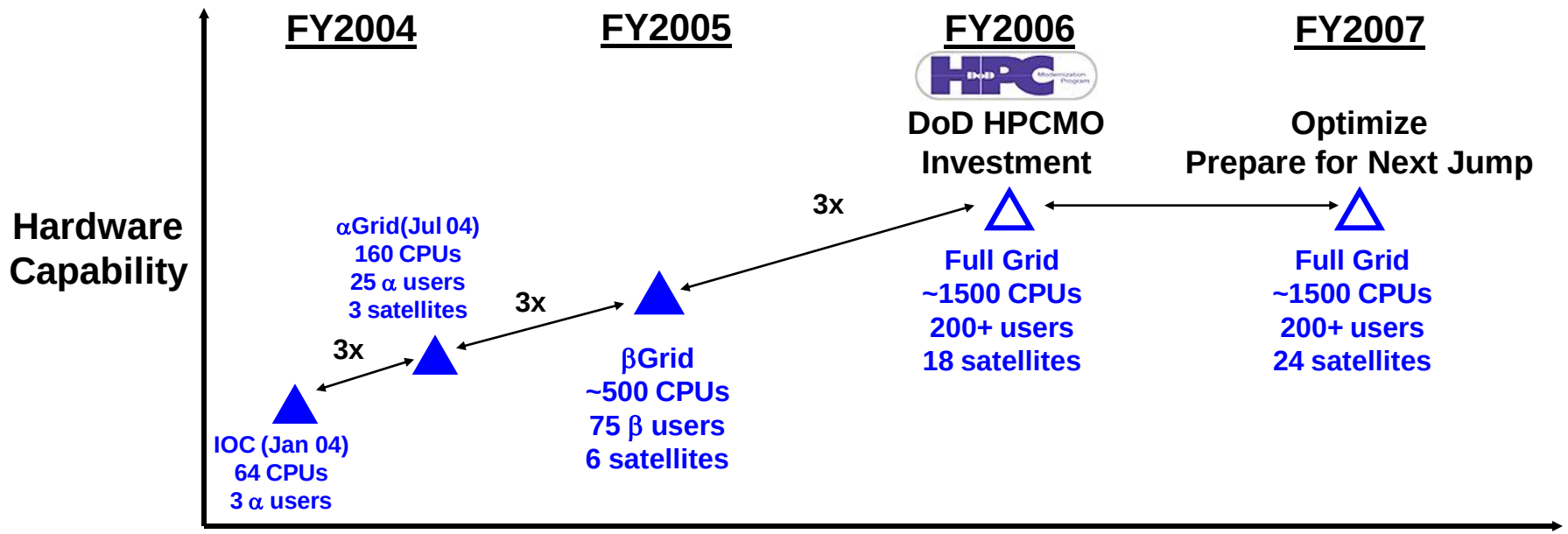


Scalable
-Processing
-Data
-Users

Lab Grid Computing Components

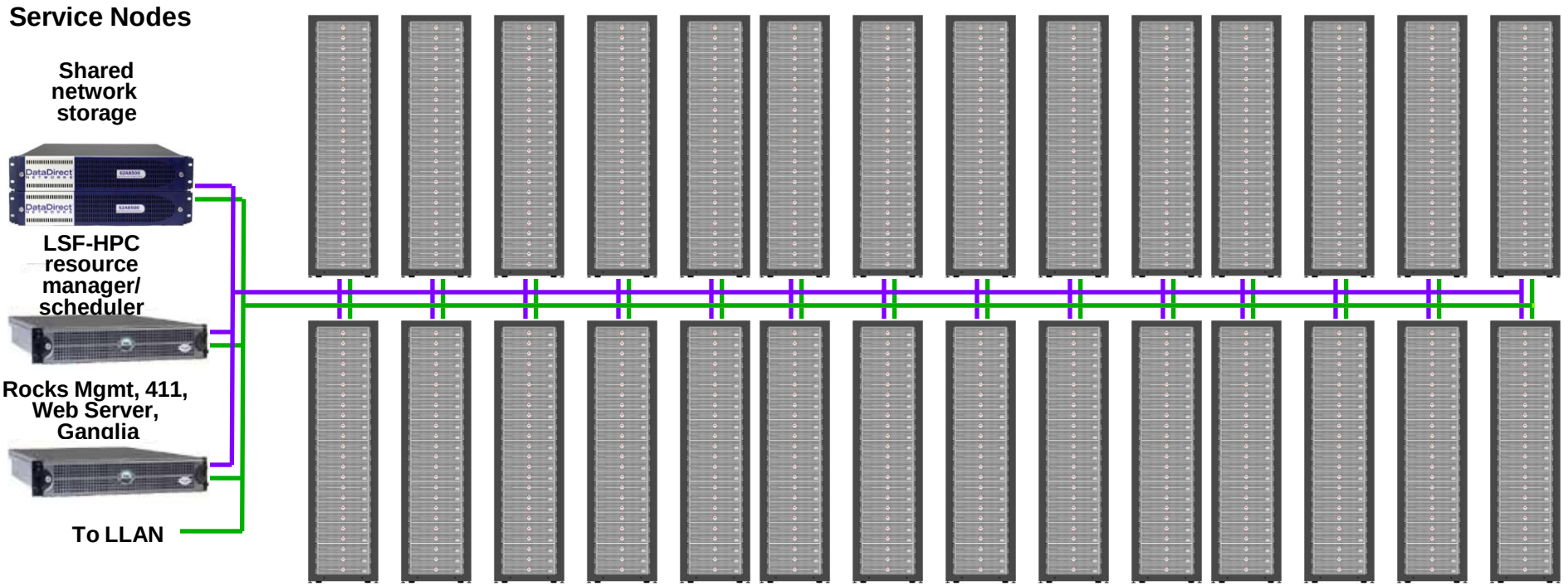
- High Performance Computers
- High Throughput Storage
- Parallel Processing Libraries

LLGrid Hardware Growth



- Goal: increase hardware while keep staff costs constant
- Approach: built team first, hardware second
- Growing 3X every year for 4 years.
- Current capability is
  - LLGrid ~1500 CPUs ~750 nodes ~40 racks
  - Satellites ~18 x 2 racks ~40 racks
  - Total ~80 racks

TX-2500: Hardware/Facility Co-Design

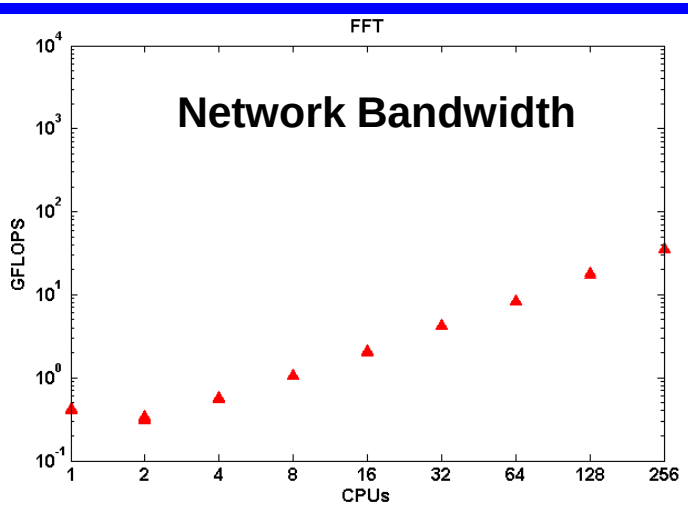


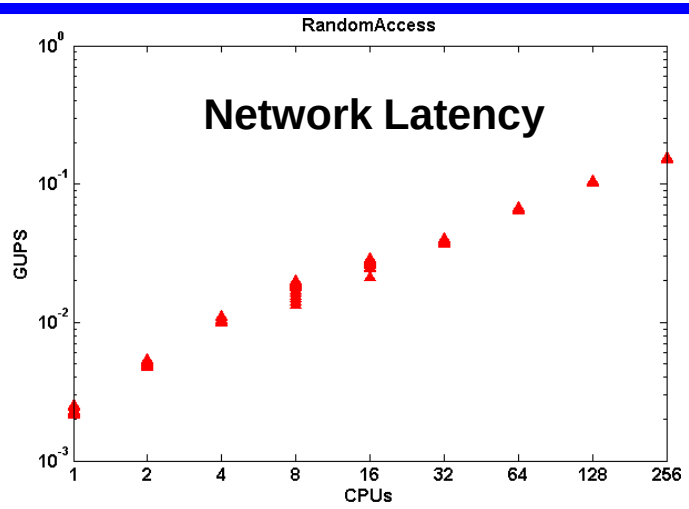
432 DELL PowerEdge 2850

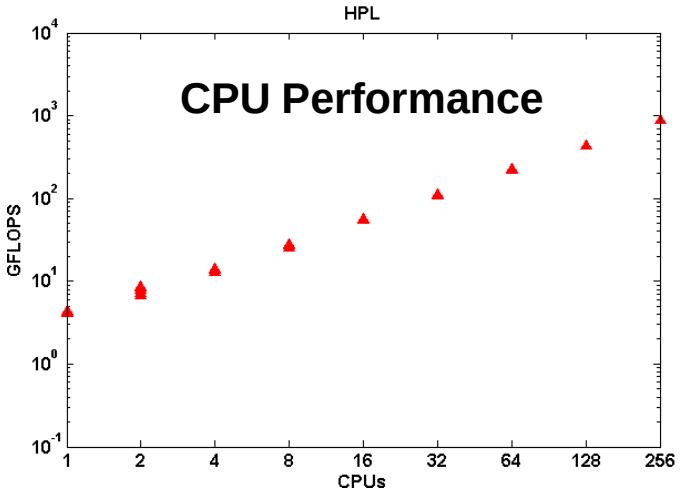
Dual 3.2 GHz EM64-T Xeon (P4)
8 GB RAM memory
Two Gig-E Intel interfaces
Infiniband interface
Six 300-GB disk drives

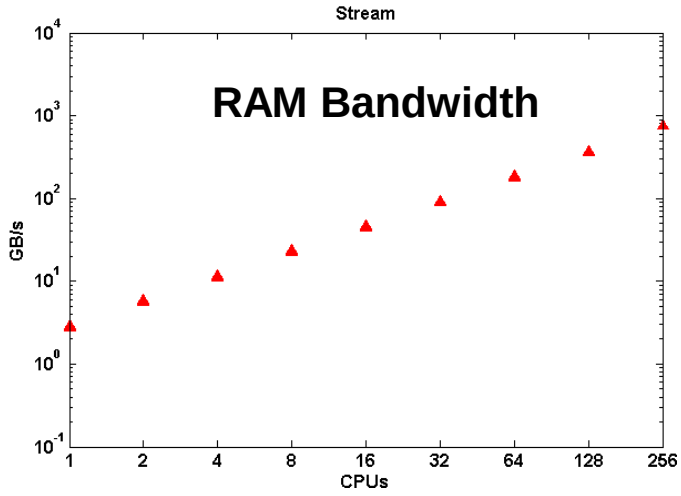
- 432+5 Nodes
- 864+10 CPUs
- 3.4 TB RAM
- 0.78 PB of Disk
- 28 Racks

Effectiveness Testing: HPC Challenge









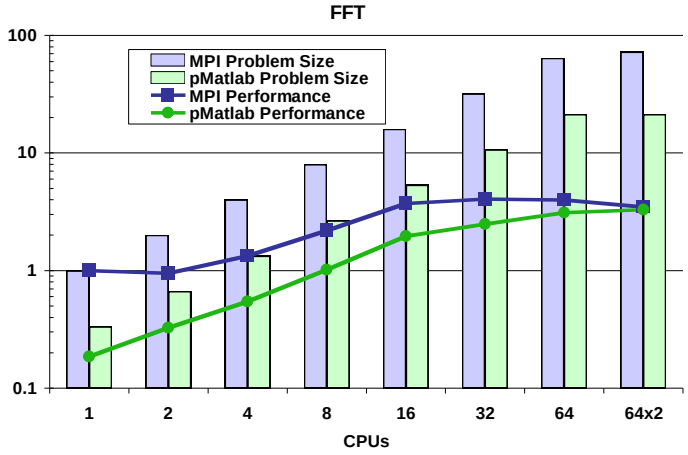
- **Rigorously test with actionable benchmarks**

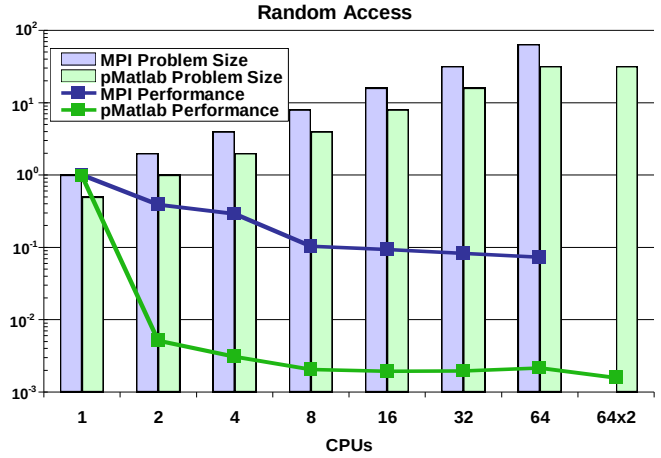
Exploit Benefits of High Level Language + PGAS

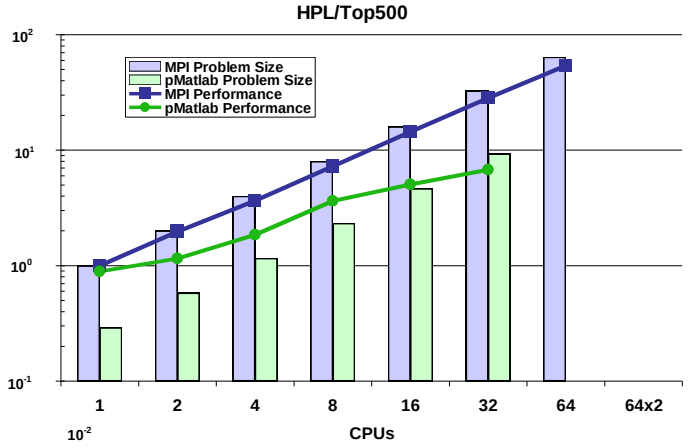
Technology	UPC	F2008	GA++	PVL	VSIPL	PVTOL	Titanium	StarP	pMatlab	DCT	Chapel	X10	Fortress
Organization	Std Body	Std Body	DOE PNNL	Lincoln	Std Body	Lincoln	UC Berkeley	ISC	Lincoln	Math-works	Cray	IBM	Sun
Sponsor	DoD	DOE SC	DOE	Navy	DoD HPCMP		DOE, NSF	DoD	DARPA		DARPA	DARPA	DARPA
Type	Lang Ext	Lang Ext	Library	Library	Library	Library	New Lang	Library	Library	Library	New Lang	New Lang	New Lang
Base Lang	C	Fortran	C++	C++	C++	C++	Java	Matlab	Matlab	Matlab	ZPL	Java	HPF
Precursors		CAF		STAPL, POOMA	PVL, POOMA	VSIPL++, pMatlab		pMatlab	PVL, StarP	pMatlab, StarP			
Real Apps	2001	2001	1998	2000	2004	~2007		2002	2003	2005			
Data Parallel	Y	Y	Y	Y	Y	Y	Y	Y	Y	Y	Y	Y	Y
Block-cyclic	1D		ND blk	2D	2D	Y	ND	2D	4D	1D	ND	ND	
Atomic			Y									Y	Y
Threads	Y		Y								Y	Y	Y
Task Parallel			Y	Y	Y	Y	Y		Y		Y	Y	
Pipelines			Y	Y		Y			Y				
Hier. arrays						Y	Y		Y		Y	Y	Y
Automap				Y		Y			Y				
Sparse							?	Y	Y	Y	Y	?	?
FPGA IO					Y	Y							

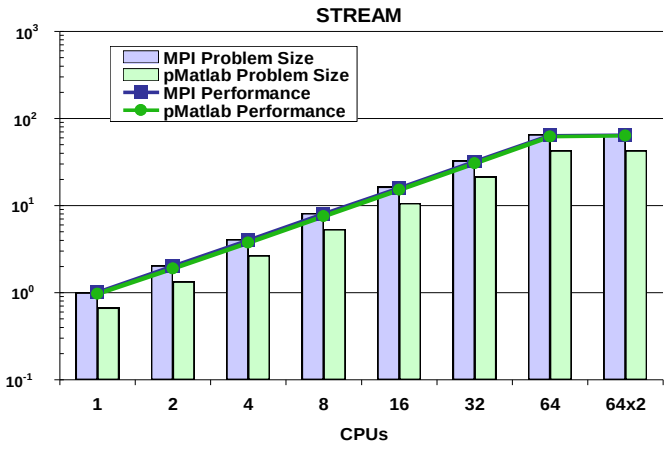
- **PGAS + high level environments is a "no brainer"; widely implemented; enables complex programs; makes simple programs trivial (even on clusters); community has settled on a common set of features**
  - **Data parallelism, block cyclic data distributions, atomic sections, threads, task parallelism, pipeline constructs, hierarchical arrays, and sparse arrays**

pMatlab HPC Challenge on LLGrid









- **Tested pMatlab against HPC Challenge benchmarks to verify performance and properly manage user expectations**

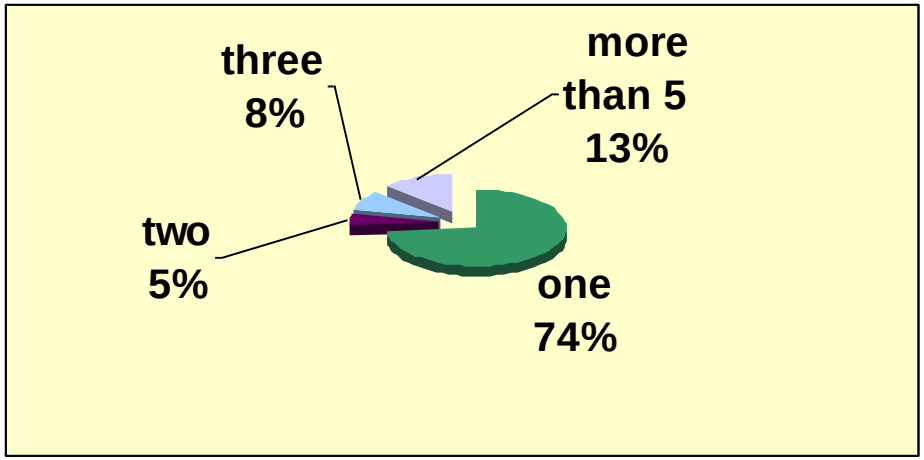
Outline

- Introduction
- LLGrid Environment
- **Results**
  - ***User Response***
  - ***Usage Statistics***
  - ***ROI Calculation***
- Summary

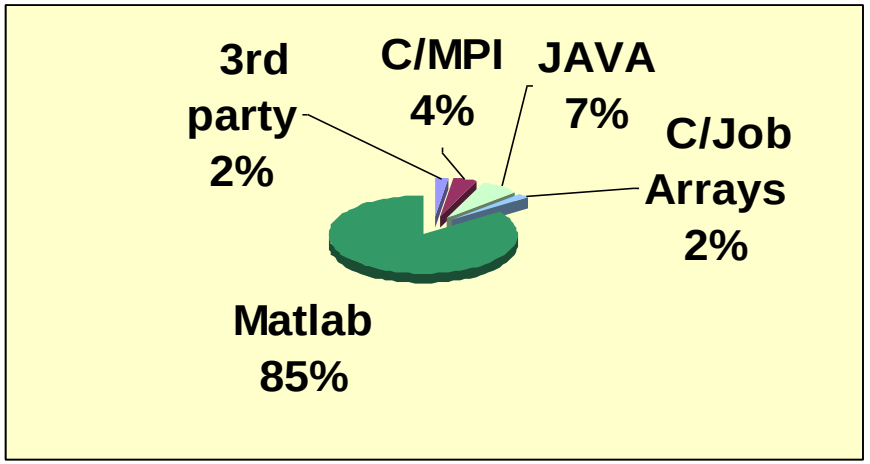
User Time to Parallelize

Project	Serial Code Dev Time	Time to Parallelize
1	2000 hours	8 hours
2	1300 hours	1 hour
3	40 hours	0.4 hours
4	900 hours	0.75 hours
5	40 hours	1 hour
6	700 hours	8 hours
7	600 hours	3 hours
8	650 hours	40 hours
0	960 hours	6 hours

Results from LLGrid Feedback Interviews

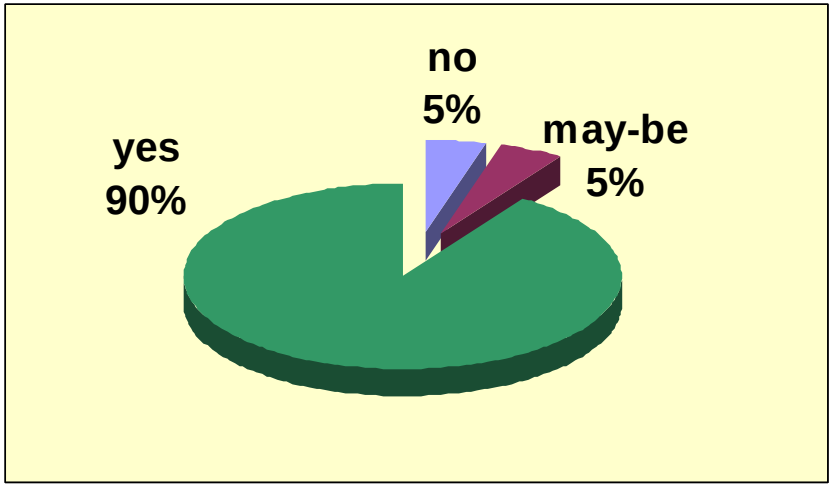


Number of Projects on LLGrid



Languages Used on LLGrid

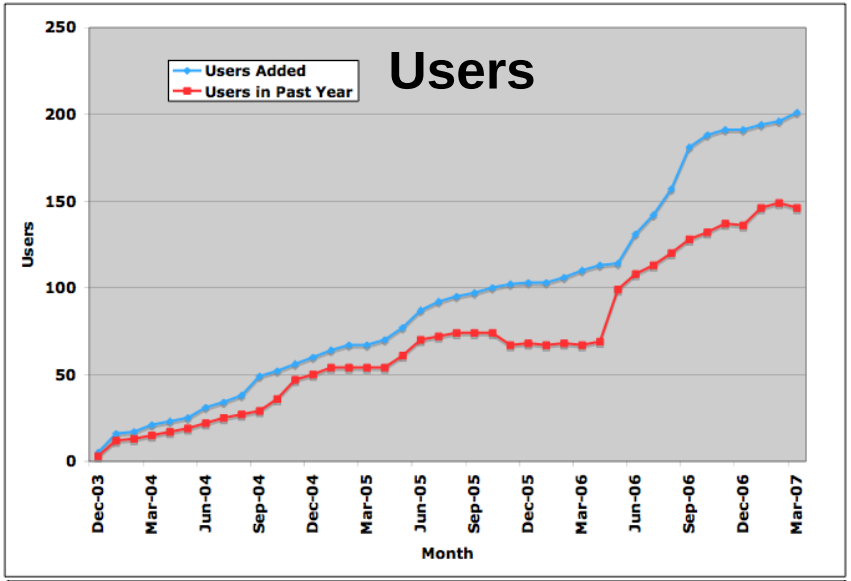
- Used meeting as a chance to probe any problems or issues users might have encountered
- 54 of 70 active unclassified users responded (~81%)
- 13 have not used LLGrid – 100% of these have not used it because of changes in their project or project goals
- Results are from 46 users across the Laboratory

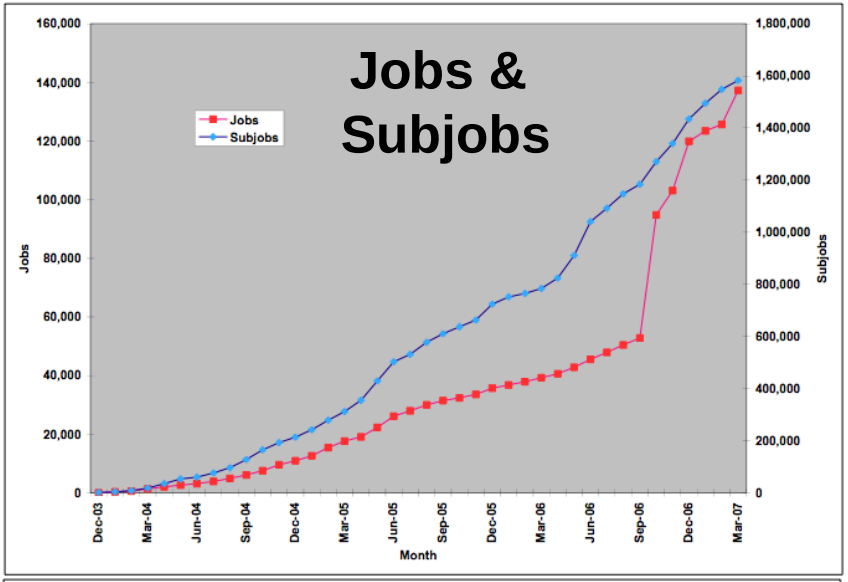


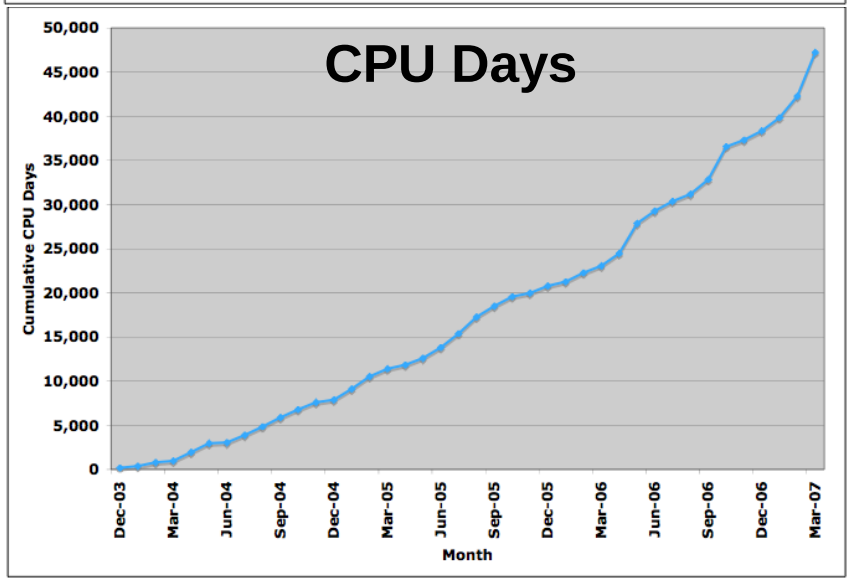
Recommend LLGrid

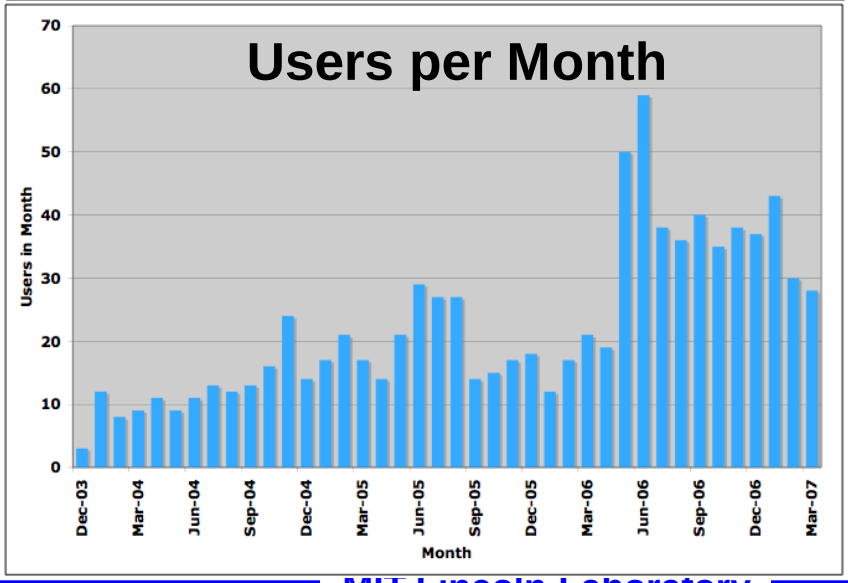
Cumulative Statistics per Month

December-03 to March-07

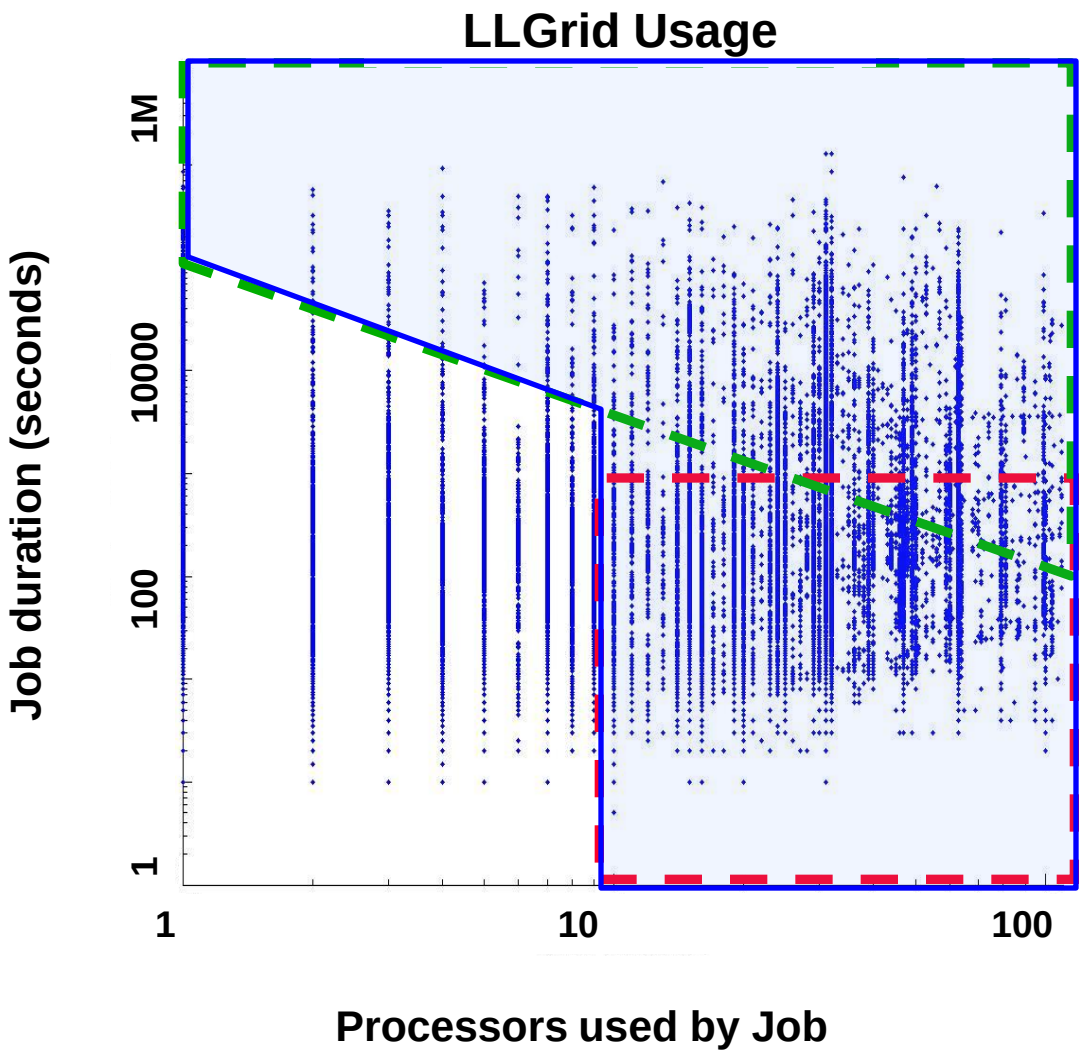








LLgrid Usage
December 2003 – March 2007



Statistics

- 186-280 CPUs
- 204 Users
- 29 Groups + campus
- 137,600 Jobs
- 47,700 CPU Days

>8 CPU hours - Infeasible on Desktop

>8 CPUs - Requires On-Demand Parallel Computing

Measuring Return On Investment

$$\text{productivity (ROI)} = \frac{\text{time saved by users on system}}{\text{time to parallelize} + \text{time to train} + \text{time to launch} + \text{time to admin.} + \text{system cost}}$$

Production LLgrid model assumptions

- <VARIABLE> users Lab-wide
- <VARIABLE> simultaneous jobs
- Average <VARIABLE> CPUs per job
- 2 SLOCs per hou
- 1000 SLOCs perr simulation * Lab-wide users
- 1.0% time-to-parallelize overhead
- Training time - 4 hours * Lab-wide users
- <VARIABLE> parallel job launches
- 10 seconds to launch
- <VARIABLE> sys-admins
- <VARIABLE> CPUs @ $<VARIABLE> per node

$$\text{time saved by users on system} = \text{User labor rate} * \text{Total time system is in use} * \text{Average number of users} * \left(1 - \frac{1}{\text{Average \# of CPUs per job}}\right)$$

or $* \text{Average \# of CPUs per job}$

or $* \log_2(\text{Average \# of CPUs per job})$

$$\text{time to parallelize} = \text{User labor rate} * \text{Total \# of users} * \text{Prog rate} * \text{Average lines of code} * \left(\frac{1}{\text{Cost for parallel}} - 1\right)$$

$$\text{time to train} = \text{User labor rate} * \text{Total \# of users} * \text{Time to train a user}$$

$$\text{time to launch} = \text{User labor rate} * \text{Number of launches} * \text{Time to launch}$$

$$\text{time to admin.} = \text{Admin. labor rate} * \text{Number of admins} * \text{Admin time}$$

$$\text{system cost} = \text{User labor rate} * \text{Time-value of system}$$

Measuring Return On Investment

$$\text{productivity (ROI)} = \frac{\text{time saved by users on system}}{\text{time to parallelize} + \text{time to train} + \text{time to launch} + \text{time to admin.} + \text{system cost}}$$

Production LLgrid model comparisons

Parameters	*Past 3.1 Years*	*Past Year*	*Next Year*
Lab-wide Users	201	201	251
New Users in Latest Year	81	81	50
Active Users in Latest Year	146	146	175
Simultaneous Jobs	10	16	25
Avg. CPUs per Job	16	32	64
Total Job Launches	137,588	95,525	125,000
Number of System Administrators	4	4	4
Nodes in System	592	592	852
New Nodes in System (Latest Year)	442	442	280
Benefit/Cost (Linear: CPUs)	24.10	43.05	144.62
Benefit/Cost (Logarithmic: $\log_2$(CPUs))	4.17	4.66	9.40

Summary

	Total CPUs	Interactive CPUs	RAM	Virtual Memory
LLGrid	1500	1500	6 TB	1 PB
Top500 Rank	~75	~1	~75	~1

- LLGrid would be ~75 on worldwide Top500 rank
- LLGrid is the worlds largest interactive system
- LLGrid is the worlds largest parallel Matlab system
- LLGrid is the worlds largest virtual memory system
- Lincoln has a higher fraction of its workforce using parallel computing than any organization in the world
  - 20% of staff have accounts (<5% is typical across the country)
  - Active accounts are 60% of total (~10% is typical)

- By taking a ROI focused approach Lincoln has quickly developed a leadership capability in its area