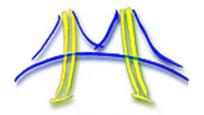
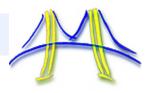
## PARLab Parallel Boot Camp



Short Course on Parallel Computing
August 16-18, 2010
parlab.eecs.berkeley.edu/2010bootcamp

Jim Demmel
EECS and Mathematics
University of California, Berkeley

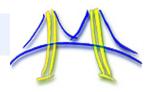




- Motivation and Goals
- Background
  - ParLab, a research center in Parallel Computing
  - The Designated Emphasis (DE) in Computational Science and Engineering (CSE)
  - CSE at Lawrence Berkeley National Lab
- Schedule and Instructors
- Logistics
- · The Audience



## Motivation (1/2)



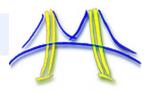
- Parallel Computing is becoming ubiquitous
  - Only way forward for computing industry (unless you don't care if your programs never run faster than in 2008)
  - Unfortunately, parallel programming is (still) harder than sequential programming
  - Until better (easier) programming tools come along, we need to train everyone in parallel programming
- · So welcome!

# Motivation (2/2)

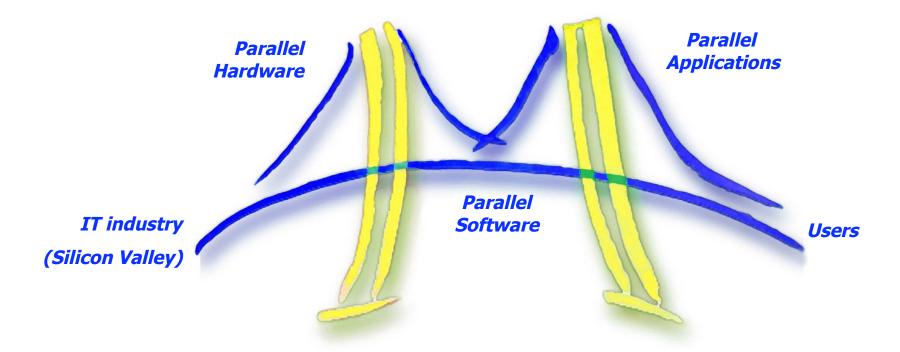
- Recent events at UCB will provide support for many new activities to develop and use parallel computing
  - ParLab established parlab.eecs.berkeley.edu
     » Research center about "Multicore Revolution"
  - Designated Emphasis in Computational Science and Engineering (CSE) established cse.berkeley.edu
    - » New graduate program with 117 faculty from 22 departments



### Short Course Goals



- Teach the basics about parallelism
  - How to program, including hands-on lab
- Tools you can use now (simple and advanced)
- · Tools we hope to build, and ongoing research

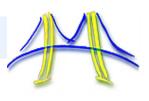


## Berkeley ParLab Project

Krste Asanovic, Ras Bodik, Jim Demmel, Tony Keaveny, Kurt Keutzer, John Kubiatowicz, Edward Lee, Nelson Morgan, Dave Patterson, Koushik Sen, John Wawrzynek, David Wessel, and Kathy Yelick



## 7 Dwarfs of High Performance Computing (HPC)



**Structured Grid** 

**Dense Matrix** 

**Sparse Matrix** 

Spectral (FFT)

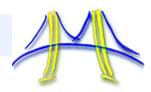
**Particle Methods** 

**Unstructured Grid** 

**Monte Carlo** 



## 7 Dwarfs – Are they enough?



Embed SPEC DB Games ML CAD

Structured Grid

**Dense Matrix** 

**Sparse Matrix** 

Spectral (FFT)

**Particle Methods** 

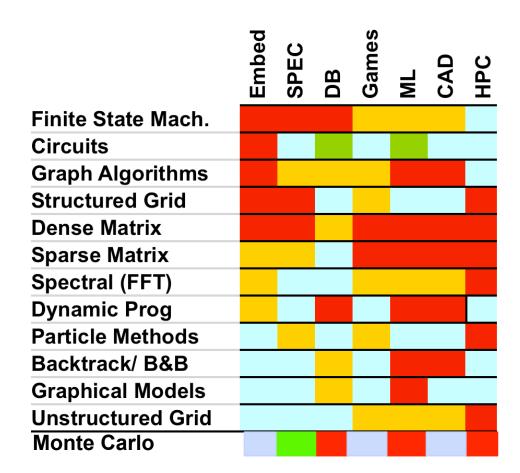
Unstructured Grid
Monte Carlo



# 13 Motifs (nee "Dwarf") of Parallel Computing



### **Popularity: (Red Hot / Blue Cool)**





# Motifs in ParLab Applications (Red Hot / Blue Cool)



|    |                         | Embed | SPEC | DB | Games | ML | CAD | НРС | Health | Image | Speech | Music | Browser |
|----|-------------------------|-------|------|----|-------|----|-----|-----|--------|-------|--------|-------|---------|
| 1  | Finite State Mach.      |       |      |    |       |    |     |     |        |       | -      |       |         |
| 2  | Circuits                |       |      |    |       |    |     |     |        |       |        |       |         |
| 3  | <b>Graph Algorithms</b> |       |      |    |       |    |     |     |        |       |        |       |         |
| 4  | Structured Grid         |       |      |    |       |    |     |     |        |       |        |       |         |
| 5  | <b>Dense Matrix</b>     |       |      |    |       |    |     |     |        |       |        |       |         |
| 6  | Sparse Matrix           |       |      |    |       |    |     |     |        |       |        |       |         |
| 7  | Spectral (FFT)          |       |      |    |       |    |     |     |        |       |        |       |         |
| 8  | Dynamic Prog            |       |      |    |       |    |     |     |        |       |        |       |         |
| 9  | Particle Methods        |       |      |    |       |    |     |     |        |       |        |       |         |
| 10 | Backtrack/ B&B          |       |      |    |       |    |     |     |        |       |        |       |         |
| 11 | <b>Graphical Models</b> |       |      |    |       |    |     |     |        |       |        |       |         |
| 12 | Unstructured Grid       |       |      |    |       |    |     |     |        |       |        |       |         |

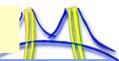
What happened to Monte Carlo?



**Productivity Layer** 

Efficiency Layer

#### Programming Pattern Language 1.0 Keutzer & Mattson



#### **Applications**

Choose your high level structure – what is the structure of my application? Guided expansion

Pipe-and-filter

**Agent and Repository** 

**Process Control** 

Event based, implicit invocation

Choose your high level architecture - Guided decomposition

Task Decomposition ← Data Decomposition

Group Tasks Order groups data sharing data access

Identify the key computational patterns – what are my key computations?

Model-view controller

Iterator

Map reduce

**Layered systems** 

**Arbitrary Static Task Graph** 

Graph Algorithms

Dynamic Programming

Dense Linear Algebra

**Sparse Linear Algebra** 

**Unstructured Grids** 

Structured Grids

**Graphical models** 

Finite state machines

**Backtrack Branch and Bound** 

**N-Body methods** 

**Circuits** 

**Spectral Methods** 

Refine the structure - what concurrent approach do I use? Guided re-organization

**Event Based** 

Data Parallelism

Pipeline

**Task Parallelism** 

**Digital Circuits** 

**Divide and Conquer** 

**Geometric Decomposition** 

**Discrete Event** 

**Graph algorithms** 

Utilize Supporting Structures – how do I implement my concurrency? Guided mapping

Fork/Join CSP Distributed
Array SharedData

**Shared Queue** 

Shared Hash Table

Master/worker

**Loop Parallelism** 

BSP

Implementation methods – what are the building blocks of parallel programming? Guided implementation

Thread Creation/destruction

Message passing

Speculation

**Barriers** 

**Semaphores** 

**James Demmel** 

**Process/Creation/destruction** 

**Collective communication** 

**Transactional memory** 

Mutex



#### Our Pattern Language 2.0



#### Applications

Choose your high level structure – what is the structure of my application?

Guided expansion

Pipe-and-filter

Agent and Repository

Process Control

Event based, implicit invocation

Choose you high level architecture? Guided decomposition

Task Decomposition  $\leftrightarrow$  Data Decomposition

Group Tasks Order groups data sharing data access

Identify the key computational patterns – what are my key

computations?

Guided instantiation

Model-view controller

Iteration

Map reduce

Layered systems

Arbitrary Static Task Graph

Graph Algorithms Graphical models

Dynamic Programming Finite state machines

Dense Linear Algebra Backtrack Branch and Bound

Sparse Linear Algebra N-Body methods

Unstructured Grids Circuits

Structured Grids Spectral Methods

Refine the structure - what concurrent approach do I use? Guided re-organization

Event Based Data Parallelism Pipeline Task Parallelism Digital Circuits

Divide and Conquer Geometric Decomposition Discrete Event Graph algorithms

Utilize Supporting Structures - how do I implement my concurrency? Guided mapping

Shared Queue

Master/worker

Fork/Join Distributed Array Shared Hash Table Loop Parallelism

CSP Shared Data SPMD BSP

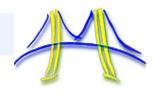
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Thread Creation/destruction Message passing Speculation Barriers Semaphores

Process Creation/destruction Collective communication Transactional memory Mutex



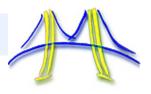
### Designated Emphasis (DE) in Computational Science and Engineering (CSE)



- · Goals
- Participants (117 faculty from 22 departments so far)
  - How the DE works
  - Resources and Opportunities
    - · Details at cse.berkeley.edu



## Designated Emphasis (DE) in CSE



- · New "graduate minor" approved, starting 2008
- Motivation
  - Widespread need to train PhD students in large scale simulation, or analysis of large data sets
  - Opportunities for collaboration, across campus and at LBNL
- Graduate students participate by
  - Getting accepted into existing department/program
  - Taking CSE course requirements
  - Qualifying examination with CSE component
  - Thesis with CSE component
  - Receive "PhD in X with a DE in CSE"
  - Details at cse.berkeley.edu



## Participating Departments (1/2)

(# faculty by "primary affiliation", # courses)

- Astronomy (7,3)
- •Bioengineering (3,1)
- •Biostatistics (2,0)
- •Chemical Engineering (6,0)
- •Chemistry (8,1)
- Civil and Environmental Engineering (7,8)
- •Earth and Planetary Science (6,3)
- •EECS (19,14)
- •IEOR (5,5)
- •School of Information (1,0)

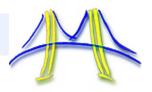
## Participating Departments (2/2)

( # faculty by "primary affiliation", # courses

- Integrative Biology (1,0)
- •Materials Science and Engineering (2,1)
- Mathematics (15, 4)
- Mechanical Engineering (9, 6)
- •Neuroscience (7,1)
- Nuclear Engineering (2,1)
- •Physics (1,1)
- Political Science (2,0)
- •Statistics (5, 11)
- ·New: Biostatistics, Public Health



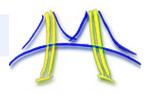
### Course Structure



- · 3 kinds of students, course requirements
  - CS , Math, "Applications"
- Each kind of student has 3 course requirements in other two fields
  - Goal: enforce cross-disciplinary training
  - Non-C5 & Non-Math students:
    - » 1 or 2 Math courses from list
    - » 1 or 2 EECS courses from list
    - » Other classes from Stat, IEOR
  - Math & CS students: substitute 1 or 2 courses from "applied" department for 1 or 2 inside



## Example Course - C5267



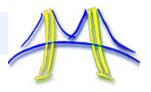
- · "Applications of Parallel Computing"
  - Long version of this short course!
  - see www.cs.berkeley.edu/~demmel/cs267\_Spr10
- Taught every Spring, during Spr09 semester to:
  - UC Berkeley, UC Merced, UC Santa Cruz, UC Davis
  - All lectures on web (slides + video), freely available
- Google "parallel computing course" to get older version, with detailed text-book like notes on algorithms

# A few sample CS267 Class Projects (all posters and video on web page)

- Content based image recognition
  - "Find me other pictures of the person in this picture"
- · Faster molecular dynamics, applied to Alzheimer's Disease
- Better speech recognition through a faster "inference engine"
- Faster algorithms to tolerate errors in new genome sequencers
- Faster simulation of marine zooplankton population
- Sharing cell-phone bandwidth for faster transfers

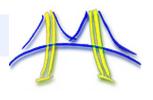


### Some CSE Resources



- Executive Director Masoud Nikravesh
  - nikravesh@cs.berkeley.edu
- Student Affairs Officer Pat Berumen
  - patbcoe@berkeley.edu
- · Head Graduate Adviser Andy Packard
  - pack@me.berkeley.edu
- · New courses ...
- Computing resources
  - Cloud computing, start up allocations from LBNL/NERSC, clusters
- · LBNL ...

# New CSE Courses Being Developed (campus and industrial support)



- Python for science
  - Josh Bloom (Astronomy)
  - 3 day summer short course (Aug 23-25) + seminar
- Understanding Molecular Simulation
  - Phil Geissler (Chem) and Berend Smit (ChemE)
  - Matlab based, students from Chem, ChemE, MSE, ME, BioPhys
- MatLab Applications in the Earth Sciences
  - Burkhard Militzer (Earth & Planetary Science)
  - Machine learning for understanding simulations/data sets
- Optimization Methods in Engineering
  - Laurent El Ghaoui (EECS)
  - Matlab (CVX) based, models not algorithms
- Other courses proposed



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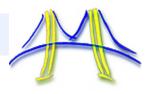
## NERSC National Energy Research Scientific Computing Center

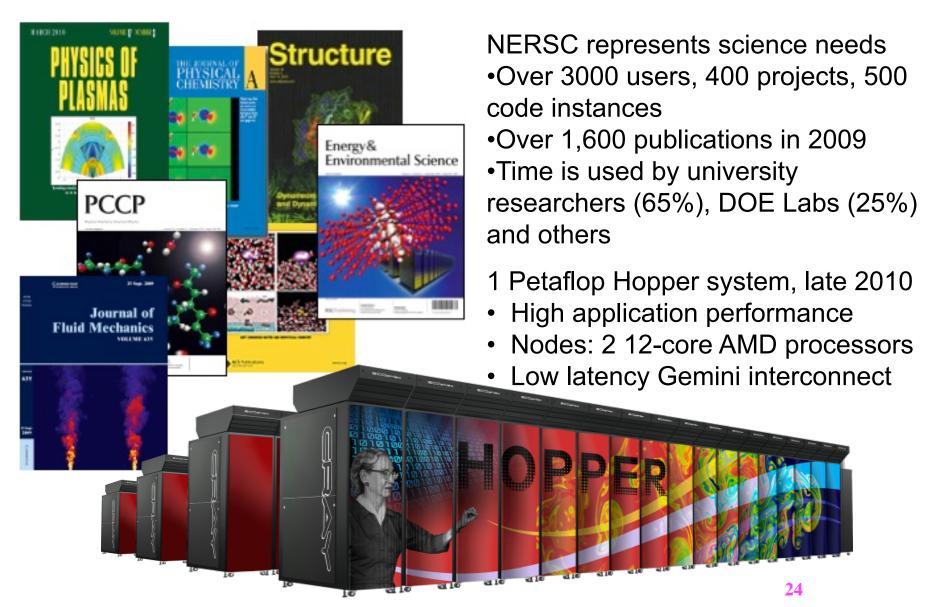


www.nersc.gov



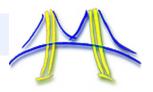
#### NERSC Overview







## NERSC Systems



#### **Large-Scale Computing Systems**

#### Franklin (NERSC-5): Cray XT4

- 9,532 compute nodes; 38,128 cores
- Each node has an AMD guad core processor and 8 GB of memory
- ~25 Tflop/s on applications; 352 Tflop/s peak

#### Hopper (NERSC-6): Cray XE6

- Phase 1: Cray XT5, 668 nodes, 5344 cores
- Phase 2: > 1 Pflop/s peak (2 sockets / node, 12 cores / socket)

#### **Clusters**

105 Tflops total

#### Carver

IBM iDataplex cluster

#### PDSF (HEP/NP)

Linux cluster (~1K cores)

#### Magellan Cloud testbed

IBM iDataplex cluster

#### **NERSC Global** Filesystem (NGF) Uses IBM's GPFS

1.5 PB; 5.5 GB/s

#### **HPSS Archival Storage**

- 40 PB capacity
- 4 Tape libraries







#### **Analytics**



Euclid (512 GB shared memory) **Dirac** GPU testbed

(48 nodes)





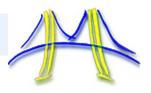
## Computational Research Division

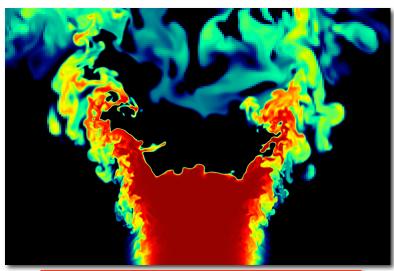


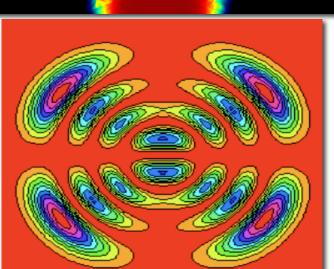
crd.lbl.gov



## Computational Research Division







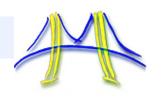
The Computational Research Division (CRD) creates computational tools and techniques that enable scientific breakthroughs, by conducting applied research and development in computer science, computational science, and applied mathematics.

#### CRD consists of three departments:

- 1. High Performance Computing Research (HPCRD) Juan Meza
- 2. Advanced Computing for Science (ACS) Deb Agarwal
- 3. Biological Data Management and Technology Center (BDMTC) -Victor Markowitz



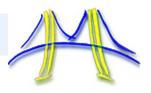
## Parallel Computing Short Courses offered by LBNL



- 11<sup>th</sup> Workshop on DOE Advanced Computational Software (ACTS) Collection
  - Aug 17-20 this week!
  - acts.nersc.gov/events/Workshop2010/
  - How to use selected computational tools developed for high performance computing
  - ScaLAPACK, PETSc, Hypre, Zoltan, GlobalArrays, ...
  - Feel free to visit (their web site)
- Computational Science Summer School on Proven Algorithmic Techniques for Many-Core Processors
  - Aug 2-6, 2010
  - iccs.lbl.gov/news-summer-2010.html
  - GPU programming

## М

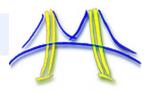
## Schedule and Instructors (1/3)



- Monday, Aug 16
  - 9-9:30 am Introduction and Welcome
    - » Jim Demmel (UCB)
  - 9:30-12pm Introduction to Parallel Architectures and Pthreads
    - » John Kubiatowicz (UCB)
  - 12-1:15pm Lunch (see web page for suggested venues)
  - 1:15-2:15pm Shared Memory Programming with OpenMP
    - » Barbara Chapman (U. Houston)
  - 2:15-3:00pm Shared Memory programming with TBB
    - » Michael Wrinn (Intel)
  - 3:00-3:30pm Break
  - 3:30-4:30pm Parallel Advisor
    - » Mark Davis (Intel)
  - 4:30-5:00pm Break/Transition to HP Auditorium, 306 Soda Hall
  - 5:00-6:00pm Hands-on Lab (rooms announced in HP Auditorium)
  - 6:00pm -Reception in Wozniak Lounge!

# W

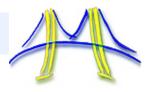
## Schedule and Instructors (2/3)



- Tuesday, Aug 17
  - 8:45-9:45am Sources of Parallelism and Locality in Simulation
     » Jim Demmel (UCB)
  - 9:45-10:45am Distributed Memory Programming in MPI and UPC
     \* Kathy Yelick (UCB and LBNL)
  - 10:45-11:15am Break
  - 11:15-12:15pm Debugging Parallel Code» Jacob Burnim (UCB)
  - 12:15-1:30pm Lunch
  - 1:30-2:30pm Architecting parallel software with design patterns
     » Kurt Keutzer (UCB)
  - 2:30-3:00pm Break / Transition to Wozniak Lounge, 4th floor Soda Hall
  - 3-6pm Hands-on Lab

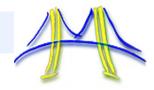
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## Schedule and Instructors (3/3)



- Wednesday, Aug 18
  - 8:45-10:45am Autotuning of Common Computational Patterns
    - » Jim Demmel (UCB)
  - 10:45-11:15am Break
  - 11:15-12:15pm Building Parallel Applications
    - » Nelson Morgan, David Wessel, Tony Keaveny, Leo Meyerovich (UCB)
  - 12:15-1:30pm Lunch
  - 1:30-2:30pm Cloud Computing
    - » Matei Zaharia (UCB)
  - 2:30-3:30pm Performance Analysis Tools
    - » Karl Fuerlinger (UCB)
  - 3:30-4:00pm Break
  - 4:00-5:00pm GPU, CUDA, OpenCL Programming
    - » Mark Murphy (UCB)

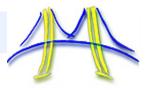




- · Coffee
  - Available outside CITRIS Auditorium, not allowed in lecture hall!
- Live webcast of lectures
  - mms://media.citris.berkeley.edu/parlab2010
  - Email questions to parlabbootcamp2010@gmail.com
- Lecture Materials
  - Slides and archived video will be posted on bootcamp website
- · Labs
  - Bring your own laptop
  - We supply wireless access, accounts on Franklin and Hopper
    - » Account problems: ask your TA
      - Razvan Carbunescu (Head TA), Michael Anderson, Erin Carson, Nick Knight
  - Lab assignment(s) posted at www.eecs.berkeley.edu/~carazvan/ 2010bootcamp/index.html



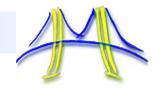
## The Audience - you



- There are 335 registrants
  - 152 on-site, 183 off-site registrants
- As of last Wednesday (303 registrants)
  - 86 from 36 companies
  - 217 from 52 universities and research organizations, from 12 countries

8/19/10 **Jim Demmel** 





## LET'S GET STARTED!