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#### Workshop on High Performance Computing (HPC) Architecture and Applications in the ICTP

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Introduction to High-Performance Computing

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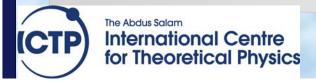
# Introduction to High-Performance Computing

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# Why use Computers in Science?

- Use complex theories without a closed solution: solve equations or problems that can only be solved numerically, i.e. by inserting numbers into expressions and analyzing the results
- <u>Do "impossible" experiments:</u>
   study (virtual) experiments, where the boundary conditions are inaccessible or not controllable
- Benchmark correctness of models and theories: the better a model/theory reproduces known experimental results, the better its predictions



# What is High-Performance Computing (HPC)?

- Definition depends on individual person
   > HPC is when I care how fast I get an answer
- Thus HPC can happen on:
  - A workstation, desktop, laptop, smartphone!
  - A supercomputer
  - A (Linux) cluster



- A grid or a cloud
- Cyberinfrastructure = any combination of the above
- HPC also means High-Productivity Computing



#### Parallel Workstation

- Most desktops today are parallel workstations
   => multi-core processors
- Running Linux OS allows running programming like on a traditional Unix workstation
- All processor cores have access to all memory
  - Uniform memory access (UMA):
     1 memory pool for cores, same access speed for any memory address, but bandwidth is shared
  - Non-uniform memory access (NUMA): multiple pools, access speed depends on "distance"



#### An HPC Cluster is...

- A cluster needs:
  - Several computers, <u>nodes</u>, hardware similar to a workstation, but in special cases for rack mounting
  - One or more networks (<u>interconnects</u>) for inter-node communication and accessing common resources
  - Software that allows the nodes to communicate with each other (usually via calls to an MPI library)
  - Software that reserves resources to individual users
- A cluster <u>is</u>: all of those components <u>working</u> together to form one parallel computing device



# What is Grid Computing?

- Loosely coupled network of compute resources
- Needs a "middleware" for transparent access for inhomogeneous resources
- Modeled after power grid
   => share resources not needed right now
- Run a global authentication framework
   => Globus, Unicore, Condor, Boinc
- Run an application specific client
   => SETI@home, Folding@home



# What is Cloud Computing?

- Simplified: "Grid computing made easy"
- Grid: use "job description" to match calculation request to a suitable available host, use "distinguished name" to uniquely identify users, opportunistic resource management
- Cloud: provide virtual server instance on shared resource as needed with custom OS image, commercialization (cloud service providers, dedicated or spare server resources), physical location flexible, distributed/replicated storage



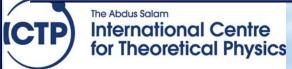
# What is Supercomputing (SC)?

- The most visible manifestation of HPC
- Programs run on the fastest and largest computers in the world (=> Top500 List)
- Desktop vs. Supercomputer in 2013 (peak):
  - Desktop/Workstation: 10s of GigaFLOP/s
  - High-end GPU: >1 TeraFLOP/s
  - Top 10 Supercomputer: 10s of PetaFLOP/s
- Sustained vs. Peak: x86 CPUs -> 90-95%,
   BlueGene -> ~85%, CPU+Accelerator -> ~65%



# TOP 500 Linux Cluster / 2002

🗙 TOP500 Supercomputer sites: TOP500 List 11/2002 - Mozilla {Build ID: 2002101717}							
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2	299	NEC SX-5/32M2/ 32	<b>241.40</b> 256.00	Meteorological Service of Canada (MSC) Canada/1999	<b>Research</b> Weather and Climate Research		NEC Vector SX5
3	300	NEC SX-5/32H2/ 32	241.40 256.00	National Research Institute for Metals Japan/2000	Research		NEC Vector SX5
3	301	IBM LosLobos/ 512	<b>237.00</b> 375.00	University of New Mexico USA/2000	Academic	150000 20000	NOW - Intel NOW Cluster - Intel
(3)	302	Megware AMD AthlonMP1600+ - SCI 2D-Torus/ 128	<b>235.80</b> 358.40	Theoretical Chemistry, Ruhr-University Bochum Germany/2002	Academic	103200 17910	NOW - AMD NOW Cluster - AMD
3	303	Cray Inc. T3E1200/ 284	<b>235.00</b> 340.80	Government USA/1999	Classified		T3E/T3D T3E1200
3	304	<b>Megware</b> HELICS AMD 1.7 GHz - Myrinet√ 132	<b>234.80</b> 448.80	Massey University Albany, IIMS  & The Allan Wilson Centre  New Zealand/2002	Academic	<b>82080</b> 25000	NOW - AMD NOW Cluster - AMD
3	805	IBM pSeries 690 Turbo 1.3GHz GigEth/ 96	<b>234.00</b> 499.20	Ahold USA/2002	<b>Industry</b> Database		IBM SP pSeries 690 Turbo 1.3 GHz GigE
3	306	IBM pSeries 690 Turbo 1.3GHz GigEth/ 96	<b>234.00</b> 499.20	BOUYGTEL France/2002	<b>Industry</b> Telecomm		IBM SP pSeries 690 Turbo 1.3 GHz GigE
3	807	IBM pSeries 690 Turbo 1.3GHz GigEth/ 96	<b>234.00</b> 499.20	Boeing USA/2002	<b>Industry</b> Aerospace		IBM SP pSeries 690 Turbo 1.3 GHz GigE



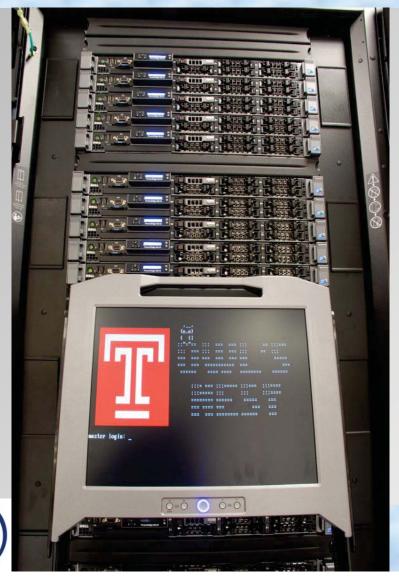
#### HPC Cluster 2002 / The Good

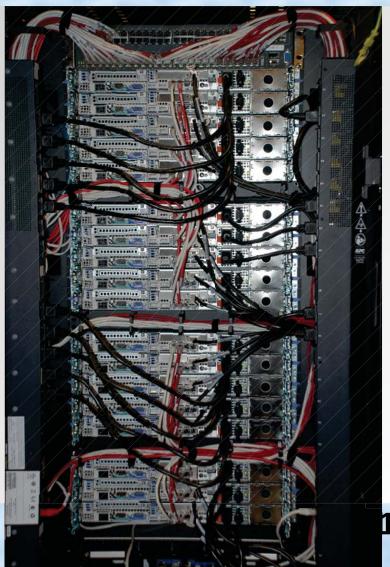


# HPC Cluster in 2002 / The Ugly



# HPC Cluster in 2012

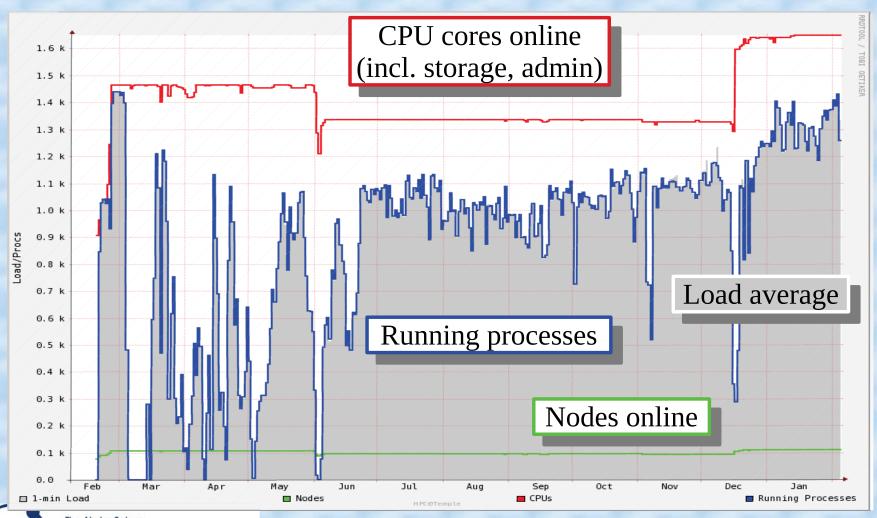






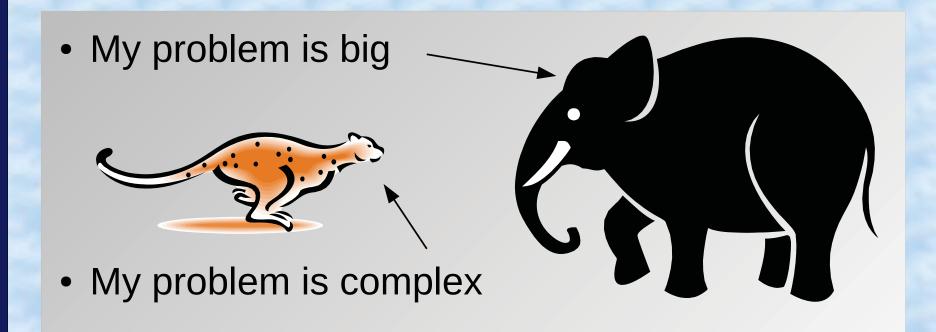


# Cluster Deployment and Usage





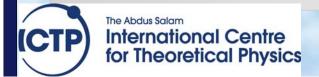
#### Who needs HPC?



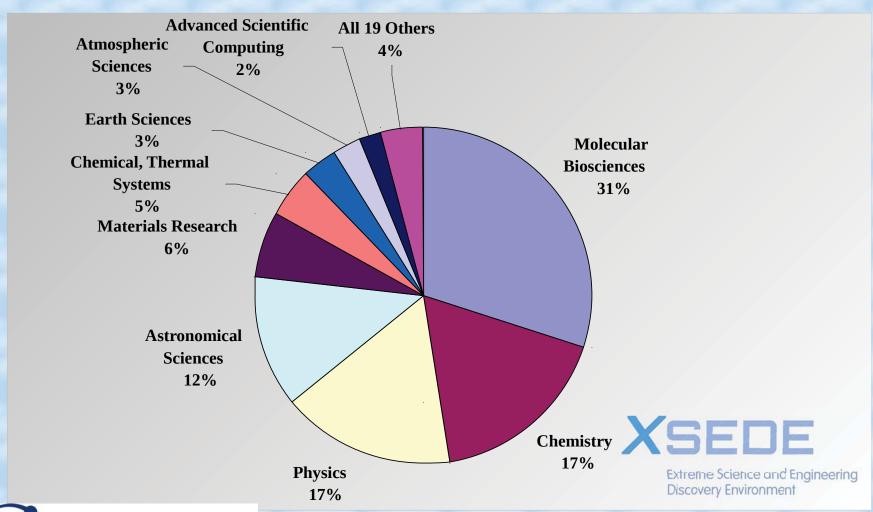
My computer is too small and too slow



My software is not efficient and/or not parallel



## Research Disciplines in HPC





# Why would HPC matter to you?

- Scientific computing is becoming more important in many research disciplines
- Problems become more complex, needs complex software and thus teams of researchers with diverse expertise (including expertise in deploying and operating clusters)
- HPC hardware is more complex, application performance depends on many factors
- Scientific (HPC) application development limited often limited by lack of training

International Centre for Theoretical Physics



## HPC vs. Computer Science

- Most people in HPC are not computer scientists
- Software has to be correct (first) and (then) efficient; packages can be over 30 years "old"
- Technology is a mix of "high-end" & "stone age" (Extreme hardware, MPI, Fortran, C/C++)
- So what skills do I need to for HPC:
  - Common sense, cross-discipline perspective
  - Good understanding of calculus and (some) physics
  - Patience and creativity, ability to deal with "jargon"



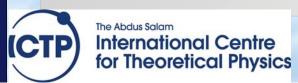
## HPC is a Pragmatic Discipline

- Raw performance is not always what matters: how long does it take me to get an answer?
- HPC is more like a craft than a science:
  - => <u>practical experience</u> is most important
  - => leveraging existing solutions is preferred over inventing new ones requiring rewrites
  - => a good solution <u>today</u> is worth more than a better solution <u>tomorrow</u>
  - => **but** a readable and <u>maintainable</u> solution is better than a complicated one



#### How to Get My Answers Faster?

- Work harder
  - => get faster hardware (get more funding)
- Work smarter
  - => use optimized algorithms (libraries!)
  - => write faster code (adapt to match hardware)
  - => trade convenience for performance (e.g. compiled program vs. script program)
- Delegate parts of the work
  - => parallelize code, (grid/batch computing)
  - => use accelerators (GPU/MIC CUDA/OpenCL)



#### What Determines Performance?

- How fast is my CPU?
- How fast can I move data around?
- How well can I split work into pieces?
   Very application specific:
  - => never assume that a good solution for one problem is as good a solution for another
  - => always run benchmarks to understand requirements of your applications and properties of your hardware
  - => respect Amdahl's law



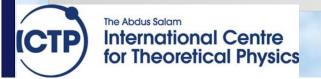
#### How Do We Measure Performance?

- For numerical operations: FLOP/s (or FLOPS)
   = Floating-Point Operations per second
- Theoretical maximum (<u>peak</u>) performance: clock rate x number of double precision addition and/or multiplications completed per clock
  - => 2.5 Ghz x 4 FLOP/clock = 10 GigaFLOP/s
  - => can never be reached (data load/store)
- Real (<u>sustained</u>) performance:
  - => very application dependent
  - => Top500 uses Linpack (linear algebra)



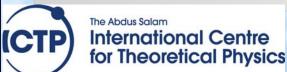
# Fast and Slow Operations

- Fast (6): add, multiply (0.5 with pipelining)
- Medium (40): divide, modulus, sqrt()
- Slow (300): most transcendental functions
- Very slow (1000): power ( $x^y$  for real x and y)
  - Often only the fastest operations are pipelined, so code will be the fastest when using only add and multiply => linear algebra, tabulation
  - => BLAS (= Basic Linear Algebra Subroutines)
    plus LAPACK (Linear Algebra Package)



## Software Optimization

- Writing <u>maximally</u> efficient code is <u>hard</u>:
   => most of the time it will not be executed exactly as programmed, not even for assembly
- Maximally efficient code is not very <u>portable</u>:
   => cache sizes, pipeline depth, registers, instruction set will be different between CPUs
- Compilers are smart (but not too smart!) and can do the dirty work for us, <u>but</u> can get fooled
  - => modular programming: generic code for most of the work plus well optimized kernels



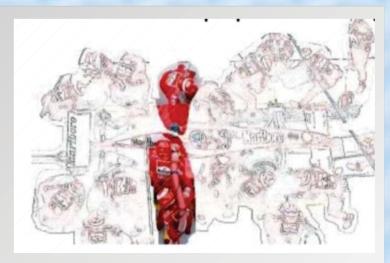
# A High-Performance Problem

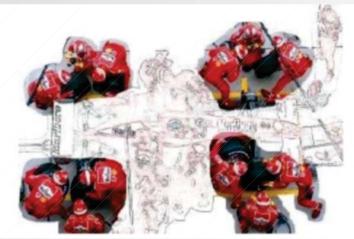


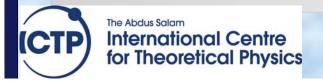


## Two Types of Parallelism

- Functional parallelism: different people are performing different tasks at the same time
- Data parallelism:
   different people are
   performing the same
   task, but on different
   equivalent and
   independent objects



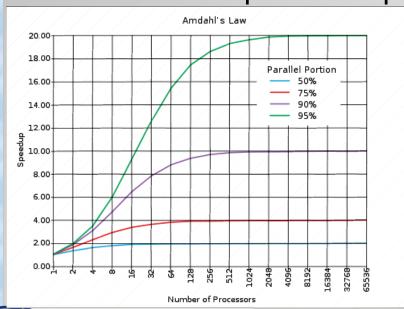


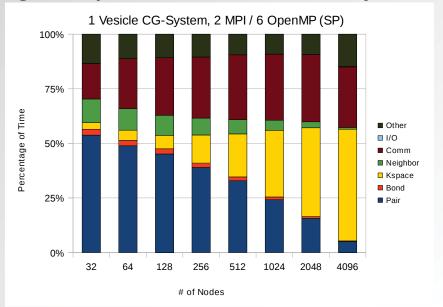


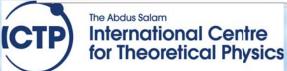
#### Amdahl's Law vs. Real Life

- The speedup of a parallel program is limited by the sequential fraction of the program.
- This assumes perfect parallel scaling without overhead

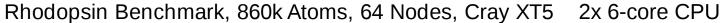
• But: different parts of a program parallelize differently well

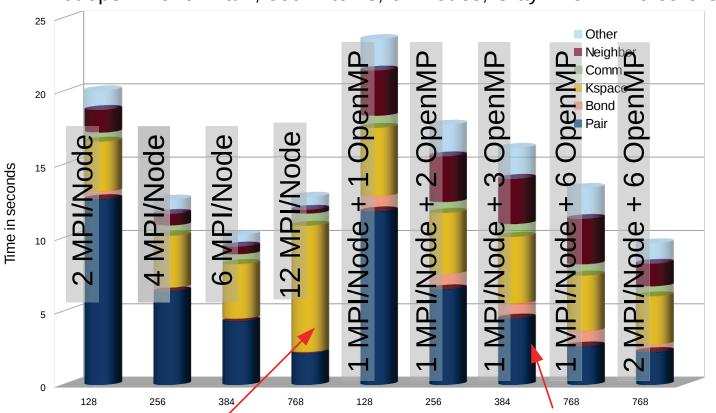






## Performance within an Application



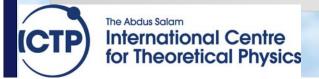


Does not parallelize anymore Oply part with OpenMP parallelization

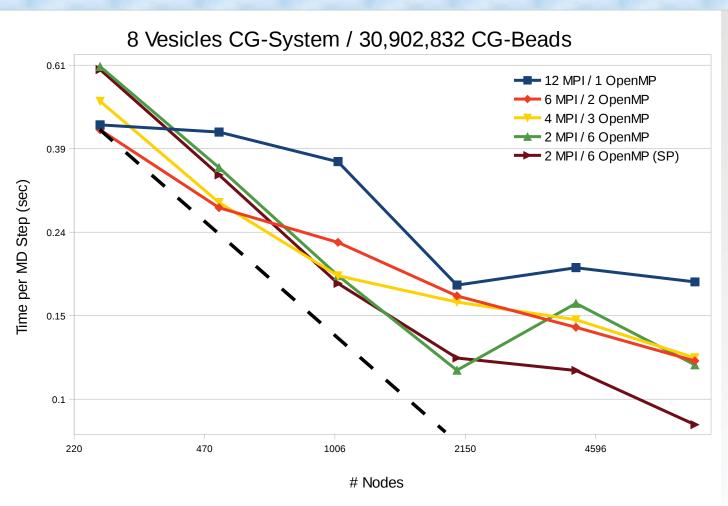


# Performance of SC Applications

- Strong scaling: fixed data/problem set; measure speedup with more processors
- Weak scaling: data/problem set increases with more processors; measure if speed is same
- Linpack benchmark: weak scaling test, more efficient with more memory => 60-95% peak
- Climate modeling (WRF): strong scaling test, work distribution limited, needs high I/O and memory bandwidth, serial overhead: < 5% peak</li>

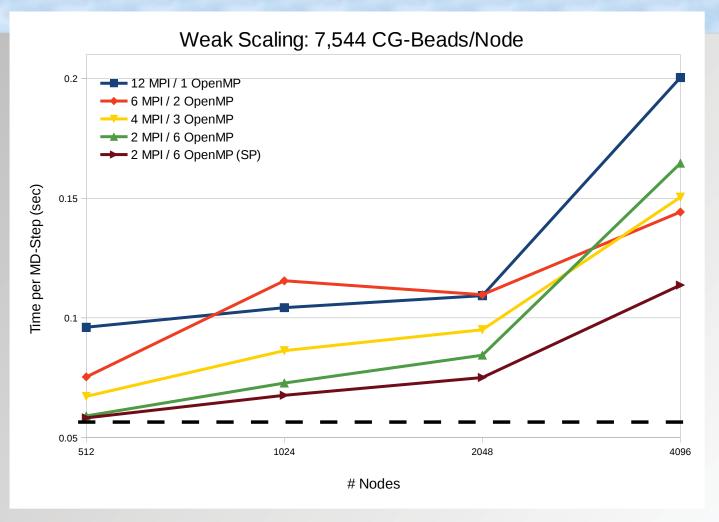


# Strong Scaling Graph





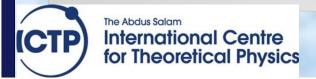
# Weak Scaling Graph





#### How to Choose Hardware

- Benchmarks, benchmarks, benchmarks
- Performance is application specific:
   => learn how important applications behave
- Resource usage differs between applications:
  - => learn which are the dominant users
- Extreme choices are high risk, look for balance
   optimize common case, avoid bottlenecks
- Most clusters run a mix of job sizes
   no need to have a homogeneous cluster



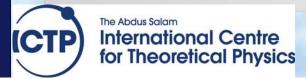
## Interacting with Vendors

- Typically you interact with sales staff
  - => they are selected for being good at selling
  - => they do not run jobs or operate clusters
  - => they don't know specifics of applications
  - => their primary task is to make a sale
  - => IT thrives on the promise of new hardware
  - => most products are designed for businesses
  - => service contracts are tailored for businesses
- You have to be specific about your needs; the better your knowledge, the better your position



#### Interacting with Scientists

- Scientists often do not (want to) know hardware
   => provide examples how to use applications
- Scientists get confused about technical jargon
  - => offer simple choices, do not overconfigure
  - => take care of common cases, not exceptions
- Scientists often struggle to describe problems
  - => do not take everything literally
  - => difficult to tell software from hardware issues
  - => many HPC applications do not handle bad input gracefully for performance reasons



## MPI versus OpenMP

- Which is "better"?
  - => most parallel applications are written for MPI which has been around for longer
  - => OpenMP is often added later to add fine grained parallelism to coarse MPI parallelism
  - => MPI works best on distributed data and adapts to NUMA architectures (share nothing)
  - => OpenMP avoids data replication and can thus improve cache utilization vs. MPI
  - => on modern multi-socket, multi-core hardware you need to use both in concert



#### Accelerators / GPUs

- The sales pitch: accelerators are >100x faster
- The reality:
  - Typical comparison against a single CPU core
  - Accelerators require many work units
     => acceleration becomes more difficult on a cluster
  - Accelerators require significant code changes
     not many scientific applications support them yet
  - Accelerators are subject to Amdahl's law
     => speedup is limited by the non-accelerated part
  - Accelerators benefit from small/simple kernels

