



02614

# High-Performance Computing

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## Course curriculum

Three modules:

- ❑ Serial tuning (week 1)
- ❑ Parallel computing with OpenMP (week 2)
- ❑ GPU computing with CUDA (week 3)
  
- ❑ Three projects – one per week

Bernd Dammann

HPC Architect & Consultant

HPC Competence Center  
DTU Computing Center

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# Course Overview – Topics

- ❑ Hardware basics: CPU, caches, memory
- ❑ Tuning of sequential programs
- ❑ Compilers, Debuggers, Analysis Tools
- ❑ Libraries
- ❑ Parallel computers – multi-core, SMP, clusters  
GPGPUs, etc
- ❑ Parallel Programming with OpenMP
- ❑ GPU computing with CUDA (and OpenCL)

# Practicalities – I

- ❑ Lectures, exercises, project work, etc:
  - ❑ “*Every day*”, 9 – 17
  - ❑ lecture room 49, building 303B
- ❑ Teachers (week 1 + 2):
  - ❑ Bernd Dammann <[beda@dtu.dk](mailto:beda@dtu.dk)>
  - ❑ Andreas Falkenstrøm Mieritz
  - ❑ members of the HPC team (Simon, Sebastian, Andrea, Hans-Henrik)

# Practicalities – I (cont'd)

- ❑ more students (week 2):
  - ❑ students from course 41391 will join us for week 2
- ❑ more teachers (week 3):
  - ❑ Hans-Henrik Sørensen <[hhbs@dtu.dk](mailto:hhbs@dtu.dk)>
  - ❑ Andreas Falkenstrøm Mieritz
  - ❑ members of the HPC team (Simon, Sebastian, Andrea, Bernd)

# Practicalities – II

- ❑ Lecture notes:
  - ❑ will be made available on CampusNet
- ❑ Exercises:
  - ❑ material on Campusnet
  - ❑ access to DTU Linux computers via SSH or ThinLinc
- ❑ On-line updates:
  - ❑ last minutes info will be published on Piazza (or CampusNet)
  - ❑ discussions on Piazza

# Practicalities – III (cont'd)

## Literature:

### ❑ Part II – OpenMP:

- ❑ on-line references and articles
- ❑ “Using OpenMP – portable shared memory parallel programming” by B. Chapman, G. Jost and R. van der Pas, MIT Press (2008)
- ❑ Hager & Wellein (see week 1)

# Practicalities – III

## Literature:

### ❑ Part I – Serial Tuning:

- ❑ list of relevant articles, books and on-line references will be made available during the course, e.g.
- ❑ “Introduction to High-Performance Scientific Computing” by Victor Eijkhout, U of Texas and TACC – on-line available as PDF  
<http://tinyurl.com/EijkhoutHPC>
- ❑ “Introduction to High Performance Computing for Scientists and Engineers”, by G. Hager & G. Wellein, CRC Press (on-line [via DTU Library](#))

# Practicalities – III (cont'd)

## Literature:

### ❑ Part III – CUDA:

- ❑ on-line references and articles
- ❑ “CUDA by example”, by J. Sanders & E. Kandrot, Addison-Wesley (2011)
- ❑ “Programming Massively Parallel Processors”, by David B. Kirk & Wen-mei W. Hwu, Morgan Kaufmann (2010)

# Practicalities – IV

### ❑ Three assignments:

- ❑ Groupwork: 3 students/group
- ❑ Assignment I: Serial tuning
  - ❑ deadline: Friday, Jan 6, 16:00 (!!!)
- ❑ Assignment II: OpenMP
  - ❑ deadline: Friday, Jan 13, midnight
- ❑ Assignment III: GPU computing
  - ❑ deadline: Friday, Jan 20, midnight

❑ The last assignment report is individual!!!

# Practicalities – V

Requirements for this course:

- ❑ Knowledge of at least one programming language: C, C++ (or Fortran)
- ❑ Basic understanding of numerical computations
- ❑ The will to “play” with new tools and to explore new fields on your own.
- ❑ To be able to document what you have done.

# Practicalities – VI

Computer usage:

- ❑ You are encouraged to use the DTU computer systems – at least for your “production runs”
- ❑ Well defined environment – that is known to work
- ❑ Same environment for everybody
- ❑ Don't waste time to “roll your own”

# Practicalities – VII

Lab exercises & projects:

- ❑ Please do the labs! They are the foundations for the projects/assignments
- ❑ Read the assignments carefully – and follow the instructions
- ❑ Describe your findings in a well written report – see the 'Assignment Guide' on CampusNet

# Where to go from here?

❑ Advanced courses:

- ❑ 02616 – Large Scale Modelling

❑ MSc (or BSc) projects:

- ❑ Scientific Computing Section at DTU Compute
- ❑ HPC Competence Center
- ❑ Collaboration with other DTU departments, e.g.
  - ❑ DTU Physics
  - ❑ DTU Electrical Engineering
  - ❑ DTU Mechanical Engineering
  - ❑ DTU Management Engineering

## What is HPC?

Do you want to be in low performance computing?



# How do I get from A to B as fast as possible?

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## Vehicle A:



## Vehicle B:



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## Vehicle C:



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# Your choice:

A, B or C?



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# Road X:



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## Road Y:

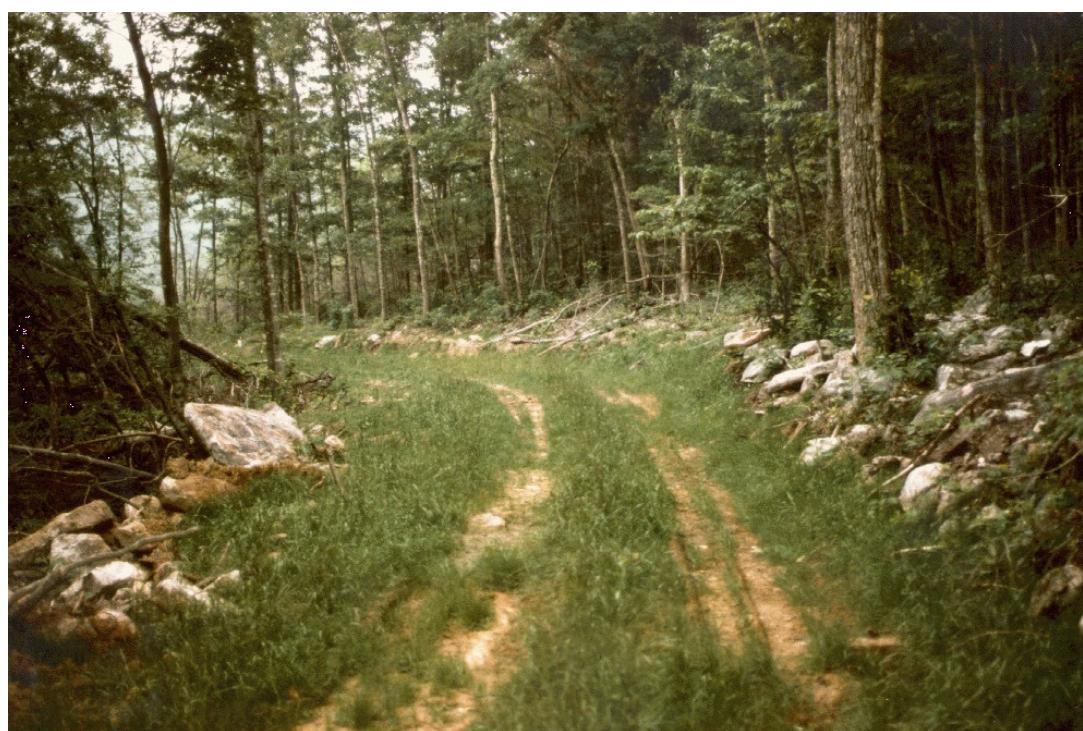


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## Road Z:



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# Your choice:

What now?

## Payload 1:



## Payload 2:



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## Payload 3:

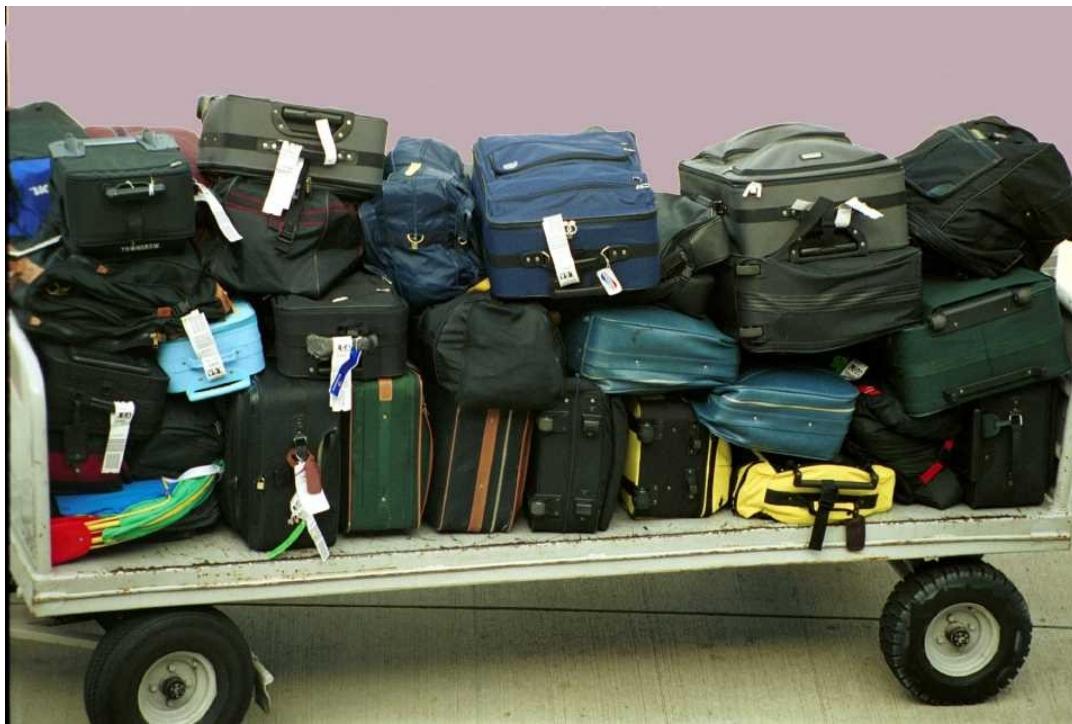


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## Payload 4:



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## Your choice:

Help – there are (too) many choices ...

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How do I get from A to B as fast as possible?

... or:

How do I get from my problem (A) to a solution (B) as fast as possible?

... and what has this to do with High-Performance Computing?

# Large Scale Computations

❑ Computers



❑ Algorithms/  
Codes



❑ Data



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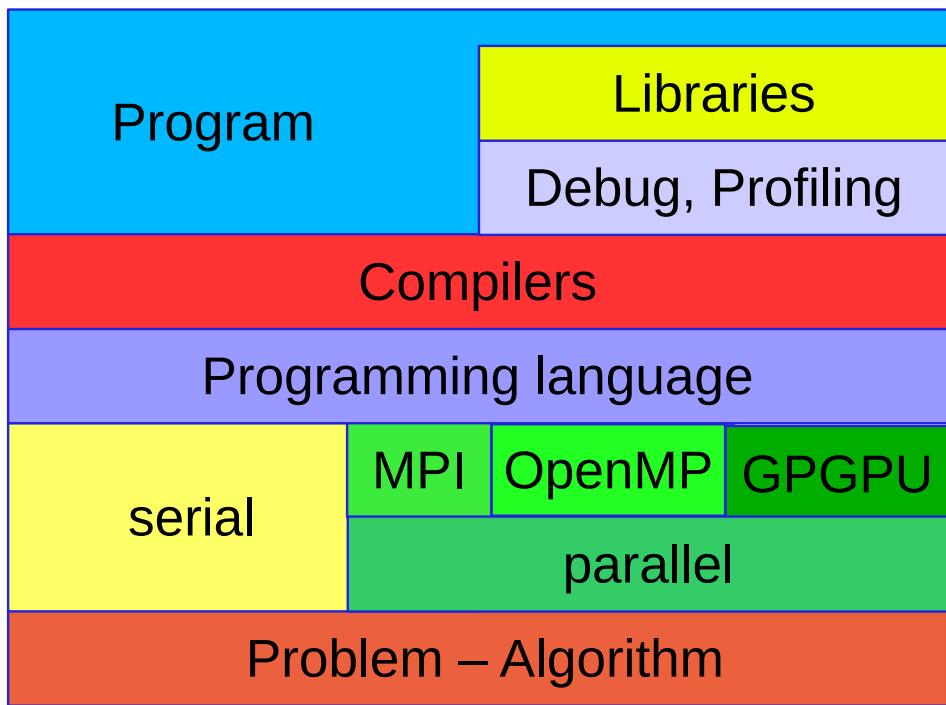
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# Large Scale Computations



# Scientific Computing's Caterpillar



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... and not to forget:



# The PITAC report - 2005

President's Information Technology Advisory Committee, US

- ❑ “Computational science now constitutes what many call the third pillar of the scientific enterprise, a peer alongside theory and physical experimentation.”
  
- ❑ “Computational science is a rapidly growing multidisciplinary field that uses advanced computing capabilities to understand and solve complex problems.”

# The US Exascale Initiative

- ❑ In the US, HPC is a matter of national importance:
  - ❑ on Jul 29, 2015, the US President issued an “Executive Order” for the “National Strategic Computing Initiative (NSCI)”
  - ❑ in popular words called the 'Exascale Initiative'
  - ❑ for more information, see the announcement on the '[Whitehouse Blog](#)'

# Computational Science

Computational science fuses 3 distinct elements:

- ❑ Algorithms (numerical and non-numerical) and modeling and simulation software developed to solve science (e.g., biological, physical, and social), engineering, and humanities problems
- ❑ Computer and information science that develops and optimizes the advanced system hardware, software, networking, and data management components needed to solve computationally demanding problems
- ❑ The computing infrastructure that supports both the science and engineering problem solving and the developmental computer and information science

# Computer Simulations

- ❑ Alternative to scale models and lab experiments
  - ❑ faster and cheaper – more flexible
- ❑ Allows a variety of studies
  - ❑ isolated phenomena
  - ❑ change of one parameter at a time
- ❑ Realistic models are large
  - ❑ many model parameters
  - ❑ capture fine details – fine discretization
  - ❑ simulation over a long period of time

# Scientific Computing – Examples

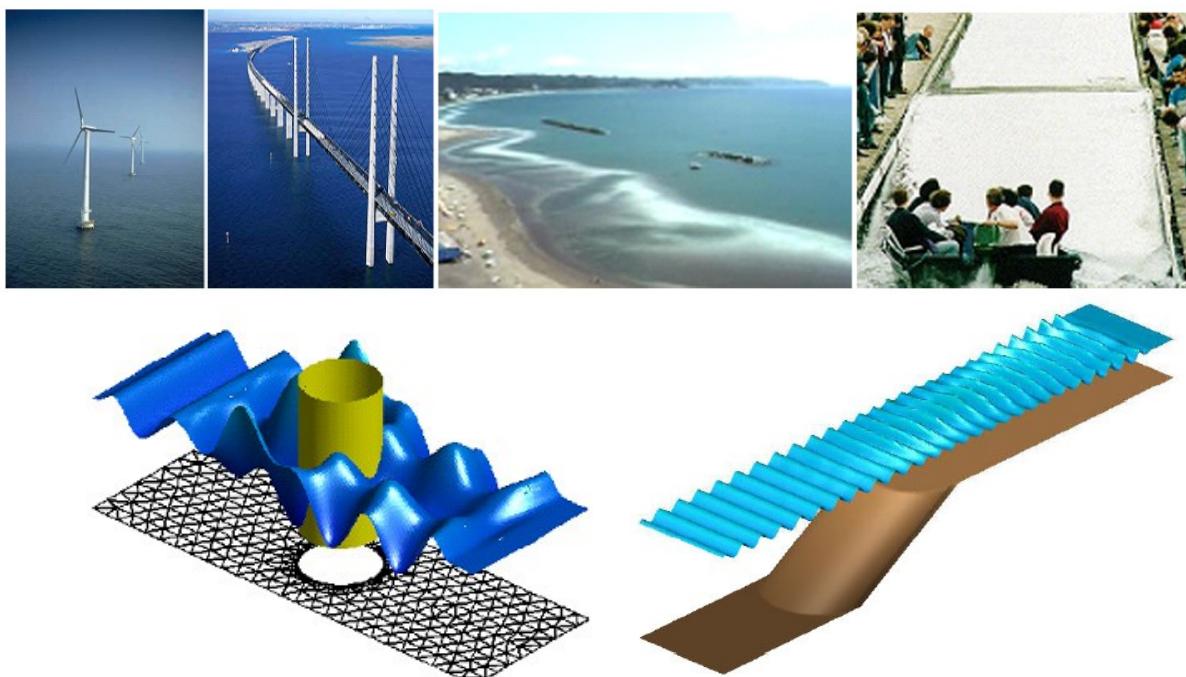
- **Astrophysics**
  - stellar physics
  - galaxy evolution
- **Cryptography**
  - prime numbers
- **Experimental mathematics**
  - fast convergent series
- **Data mining**
  - Google's Page rank
  - BIG DATA
- **Planetary science**
  - geophysics
  - weather forecasts
  - air pollution
  - climate modeling
- **Quantum Physics & Chemistry**
  - superconductivity
  - material science
  - enzymes
- **Bio-informatics**
  - genome research
  - neuroscience
  - heart simulation
- **Engineering design**
  - fluid mechanics, turbulence
  - hydro dynamics
  - structural design
- **Finance**

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## Breaking The Waves



Allan Engsig-Karup – DTU Compute

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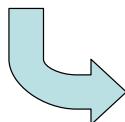
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# Inverse Geomagnetic Problems



$$\int_{\Omega} K(\mathbf{s}, \mathbf{t}) f(\mathbf{t}) d\Omega = g(\mathbf{s})$$

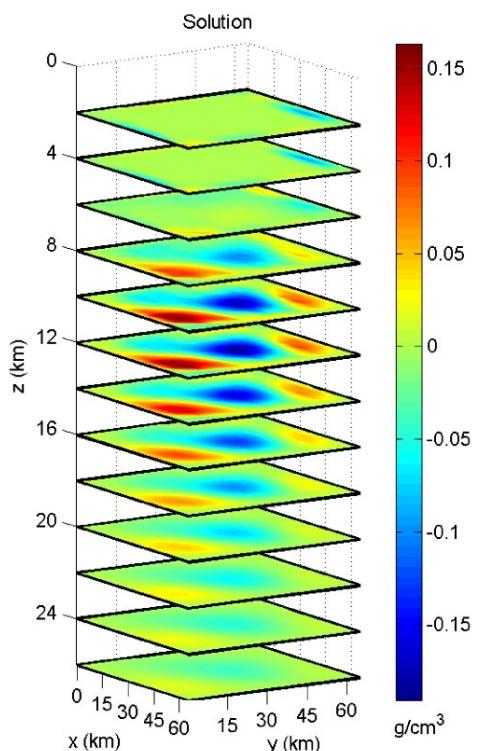


- $f(\mathbf{t})$  = magnetization  
 $g(\mathbf{s})$  = data (anomaly)  
 $K(\mathbf{s}, \mathbf{t})$  = magnetic dipole field



Per Chr. Hansen – DTU Compute

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# Wind turbine design - CFD



DTU Wind Energy



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# Topology Optimization

... and Materials:  
safe and minimum weight structures



DTU Mechanical  
Engineering

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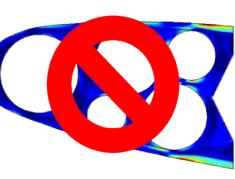
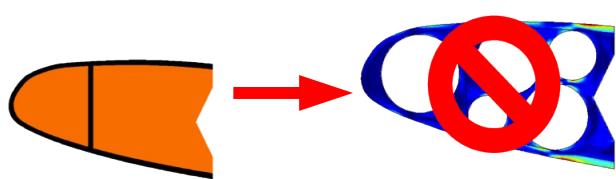
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# Topology Optimization



Design domain



FE-Discretization



courtesy: Ole Sigmund  
[www.topopt.dtu.dk](http://www.topopt.dtu.dk)



Interpretation



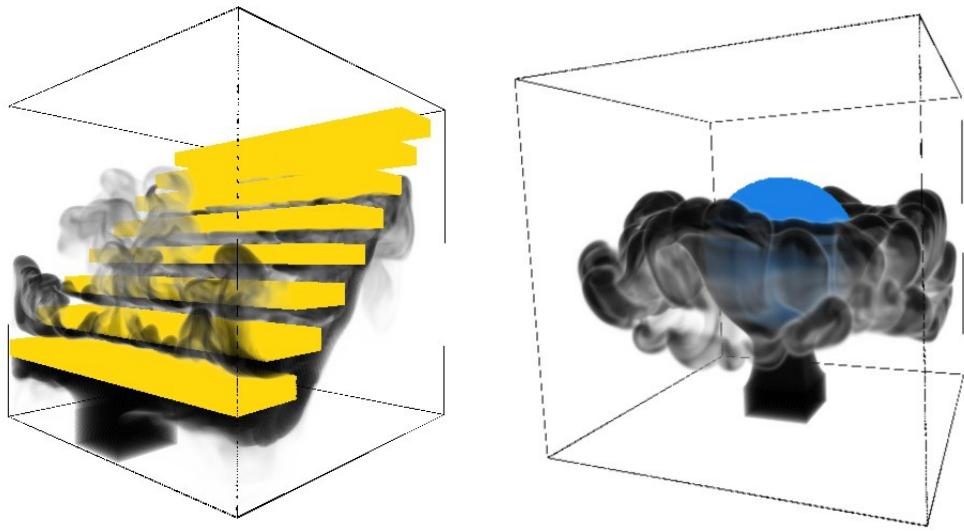
Simulation  
result

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# Smoke Simulations



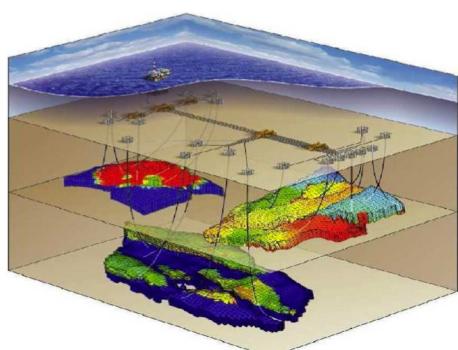
Stefan Glimberg – GPUlab, DTU Compute

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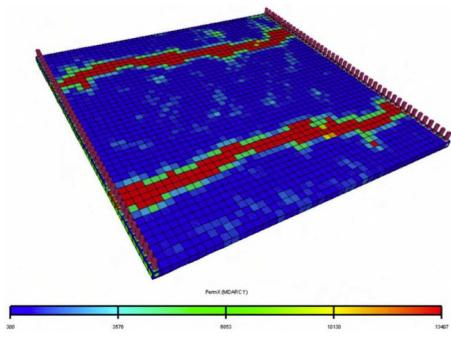
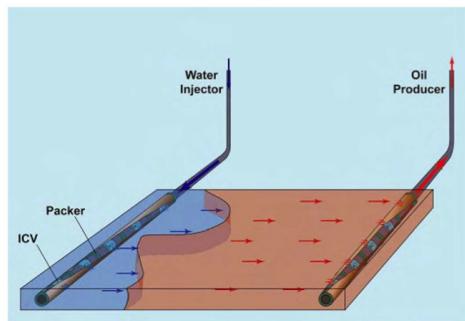
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# Reservoir Production Optimization



Carsten Völcker,  
John Bagterp Jørgensen –  
DTU Compute



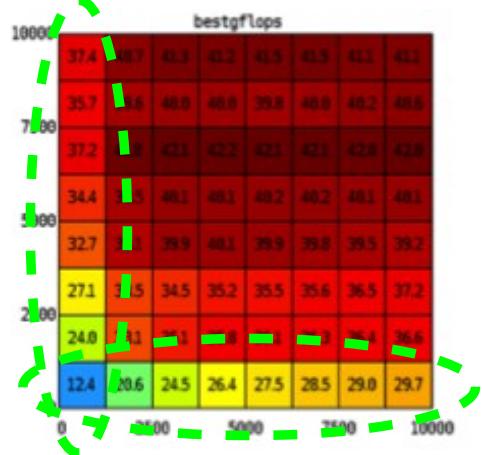
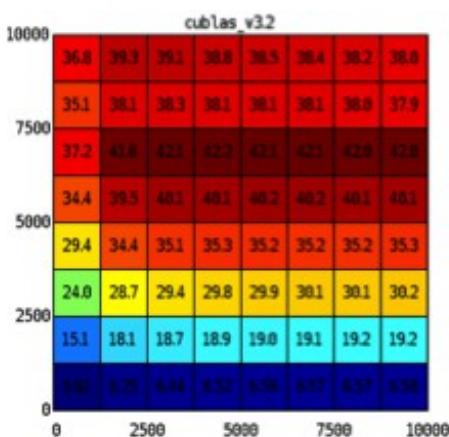
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# Performance Tuning – GPU

Auto-tuning Ax=y (Sgemv) on Nvidia Tesla C2050(blue = slow, red = fast)



Hans-Henrik Sørensen – GPULab, DTU Compute

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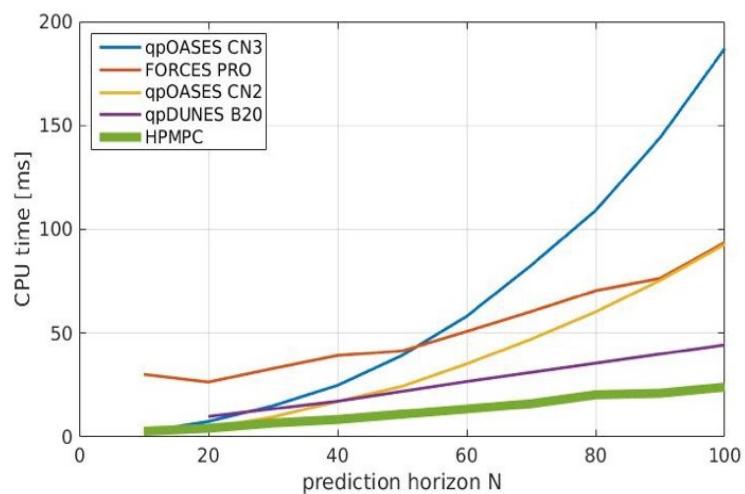
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# Model Predictive Control (MPC)

HPMPC:

- ❑ optimized for small datasets
- ❑ “applied HPC”
- ❑ close to CPU peak performance



Gianluca Frison, et al – Scientific Computing, DTU Compute

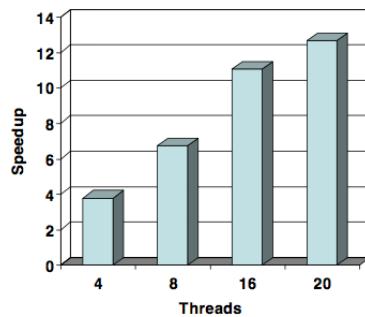
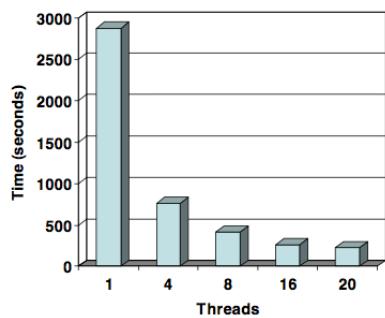
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# Tuning & Parallelization

- ❑ Tuning and parallelization of an existing code from DTU Chemistry: Helium Scattering
- ❑ ~3000 lines of Fortran77 code
- ❑ parallelized with OpenMP



Bernd Dammann – DTU Compute

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## Other examples from DTU

- ❑ Bioinformatics
- ❑ Theoretical Atomic-scale Physics
- ❑ Computational Chemistry
- ❑ Photonics
- ❑ Nanotechnology
- ❑ ... and ... “Big Data”

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# What is Performance?

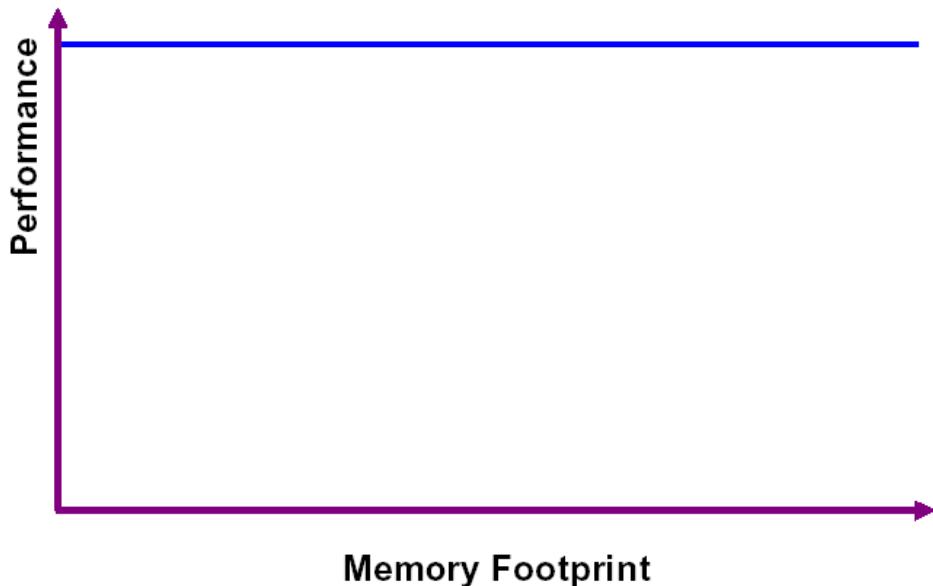
## Performance of a Computer

- ❑ The performance of a computer is often expressed in Flop/s (floating point operations per second)
- ❑ How does this relate to the clock frequency of the CPU?
- ❑ Example:
  - ❑ US-IV+ CPU @ 1800 MHz
  - ❑ superscalar chip: 2 Floating Point Ops per tick
  - ❑ Performance: 3600 MFlop/s

Theoretical Peak  
Performance!!!

# Performance of a Computer

Intuitive Performance Graph for a given problem:



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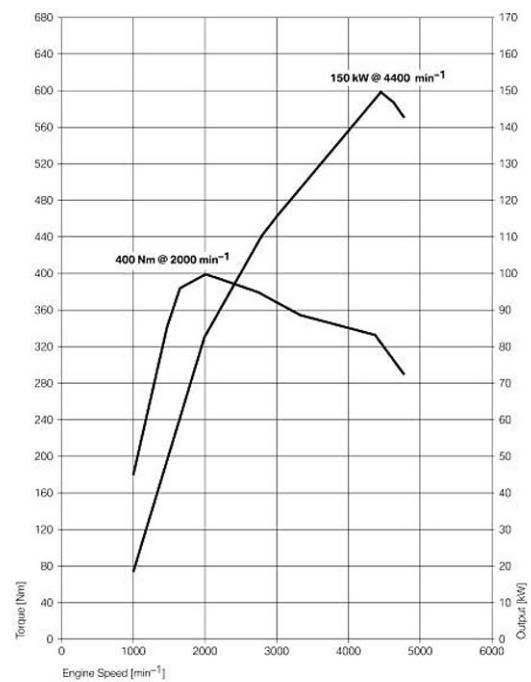
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# Performance of a Car

- ❑ Two ways to measure the performance of a car:
  - ❑ horsepower [kW]
  - ❑ torque [Nm]

"Horsepower sells cars,  
torque wins races."  
*Carroll Shelby*  
(Formula 1 driver 1958/9)



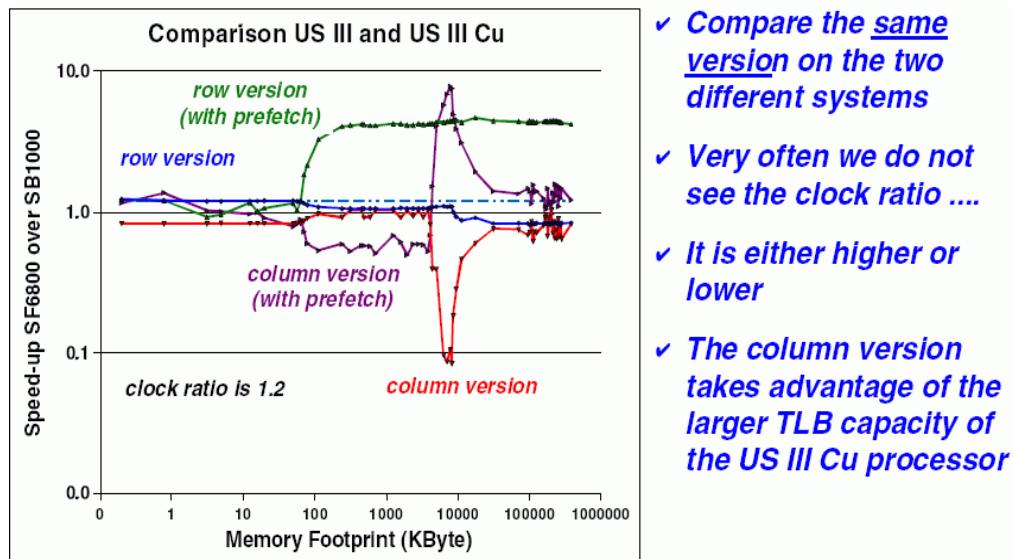
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# What is computer performance?

- ❑ Matrix summation in two ways
- ❑ Compare two generations of the US-III chip:



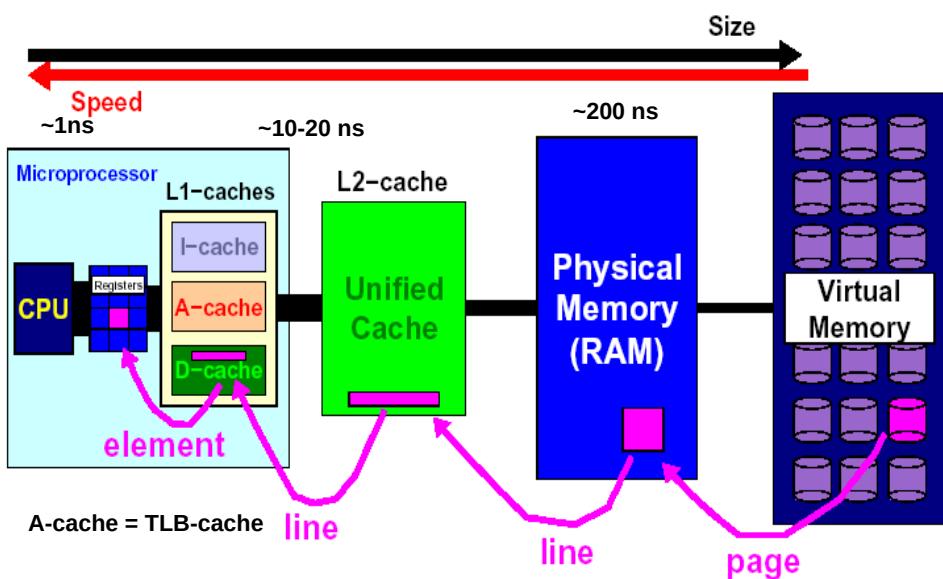
- ✓ *Compare the same version on the two different systems*
- ✓ *Very often we do not see the clock ratio ....*
- ✓ *It is either higher or lower*
- ✓ *The column version takes advantage of the larger TLB capacity of the US III Cu processor*

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# The Memory Hierarchy



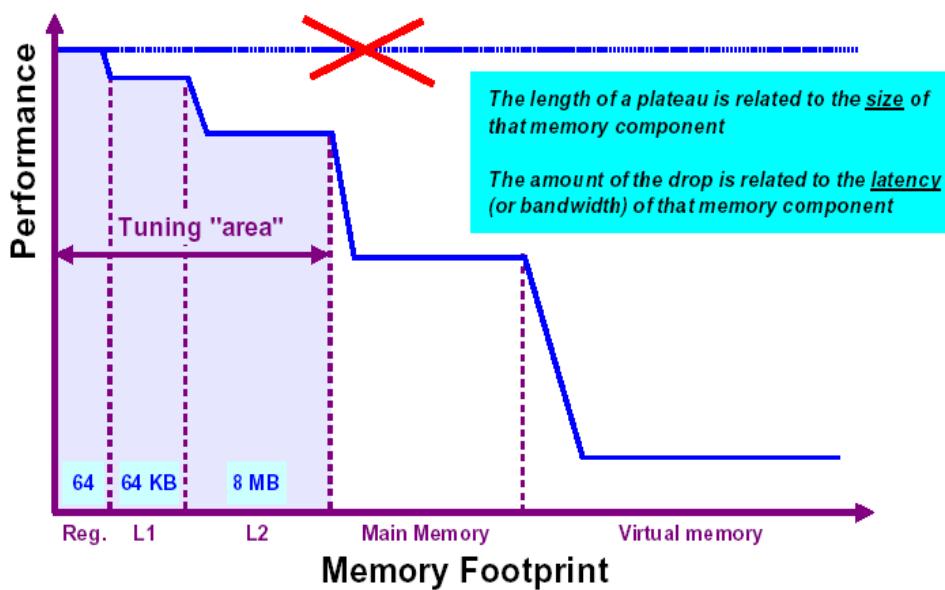
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# Performance of a Computer

Performance is not uniform:



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## TOP500 – HPC's Formula 1

- ❑ The “fastest” computers of the world are ranked on the TOP500 list  
<http://www.top500.org/> 
- ❑ Ranking is based on the High-Performance LINPACK (HPL) benchmark, i.e. a collection of linear algebra routines.
- ❑ Most of the top sites make use of special hardware, e.g. GPUs, i.e. hardware that is optimized to work with (dense) matrix data.

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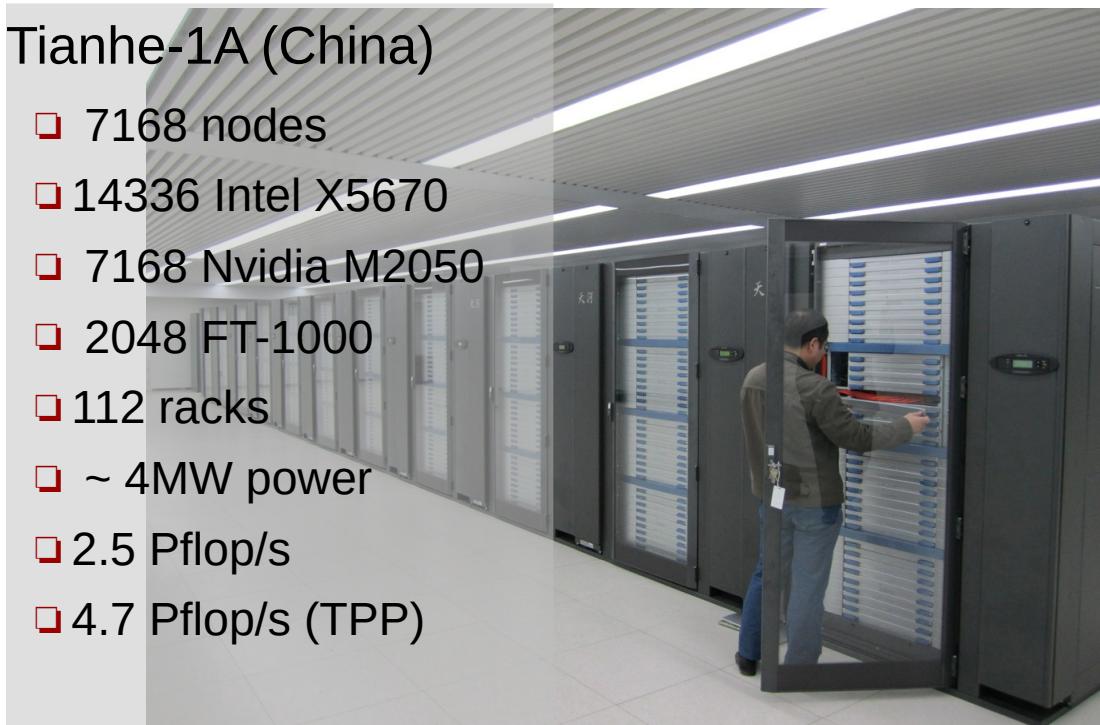
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# TOP 500 No. 1 – Nov 2010

## Tianhe-1A (China)

- ❑ 7168 nodes
- ❑ 14336 Intel X5670
- ❑ 7168 Nvidia M2050
- ❑ 2048 FT-1000
- ❑ 112 racks
- ❑ ~ 4MW power
- ❑ 2.5 Pflop/s
- ❑ 4.7 Pflop/s (TPP)



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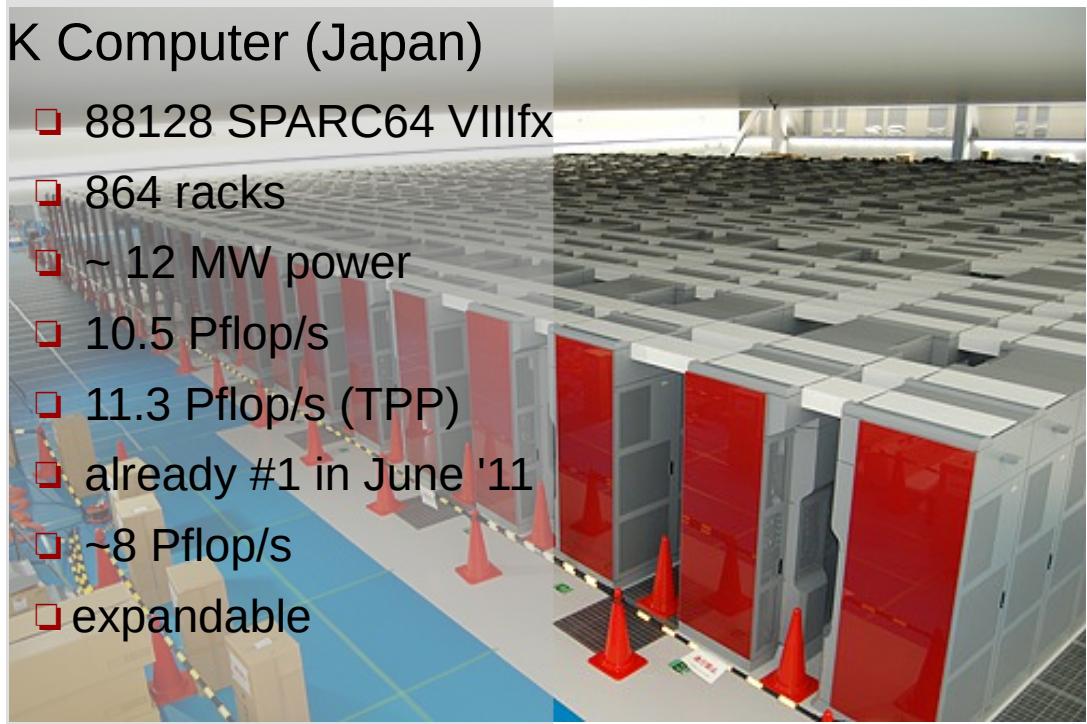
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# TOP 500 No. 1 – Nov 2011

## K Computer (Japan)

- ❑ 88128 SPARC64 VIIIfx
- ❑ 864 racks
- ❑ ~ 12 MW power
- ❑ 10.5 Pflop/s
- ❑ 11.3 Pflop/s (TPP)
- ❑ already #1 in June '11
- ❑ ~8 Pflop/s
- ❑ expandable



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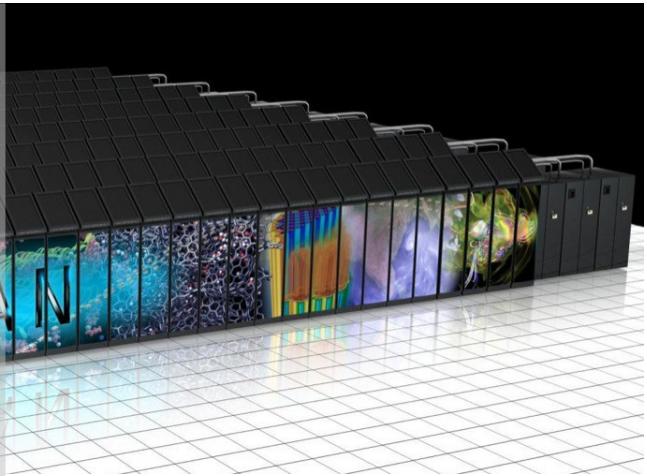
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# TOP 500 No. 1 – Nov 2012

## Titan – Oak Ridge

- ❑ Cray XK7
- ❑ Opteron + Nvidia K20
- ❑ 560640 cores
- ❑ 17.59 Pflop/s
- ❑ 27.11 Pflop/s (TPP)
- ❑ ~ 8.2 MW power



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# TOP 500 No. 1 – Jun 2016

## Sunway TaihuLight (China)

- ❑ Sunway SW26010 260C 1.45GHz
- ❑ 10,649,600 cores
- ❑ 93 Pflop/s
- ❑ 125 Pflop/s (TPP)
- ❑ ~ 15.4 MW power



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# TOP 500 – June 2016

Rank	Site	System	Cores	Rmax (TFlop/s)	Rpeak (TFlop/s)	Power (kW)
1	National Supercomputing Center in Wuxi China	Sunway TaihuLight - Sunway MPP, Sunway SW26010 260C 1.45GHz, Sunway NRPCC	10,649,600	93,014.6	125,435.9	15,371
2	National Super Computer Center in Guangzhou China	Tianhe-2 (MilkyWay-2) - TH-IVB-FEP Cluster, Intel Xeon E5-2692 12C 2.200GHz, TH Express-2, Intel Xeon Phi 31S1P NUDT	3,120,000	33,862.7	54,902.4	17,808
3	DOE/SC/Oak Ridge National Laboratory United States	Titan - Cray XK7 , Opteron 6274 16C 2.200GHz, Cray Gemini interconnect, NVIDIA K20x Cray Inc.	560,640	17,590.0	27,112.5	8,209
4	DOE/NNSA/LLNL United States	Sequoia - BlueGene/Q, Power BQC 16C 1.60 GHz, Custom IBM	1,572,864	17,173.2	20,132.7	7,890
5	RIKEN Advanced Institute for Computational Science (AICS) Japan	K computer, SPARC64 VIIIfx 2.0GHz, Tofu interconnect Fujitsu	705,024	10,510.0	11,280.4	12,660

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# TOP500 – and where is Denmark?

- ❑ two entries on the TOP500 list as of June 2016:

Rank	Site	System	Cores	Rmax (TFlop/s)	Rpeak (TFlop/s)	Power (kW)
258	University of Southern Denmark	Abacus 2.0 - Lenovo NeXtScale nx360M5, Xeon E5-2680v3 12C 2.5GHz, Infiniband FDR, NVIDIA Tesla K40	17,928	462.4	836.6	187.5
		Lenovo				
315	Center for Biological Sequence Analysis - DTU Denmark	Computerome - Apollo 6000 XL230a, Xeon E5-2683v3 14C 2GHz, Infiniband FDR Hewlett-Packard	15,120	410.8	483.8	

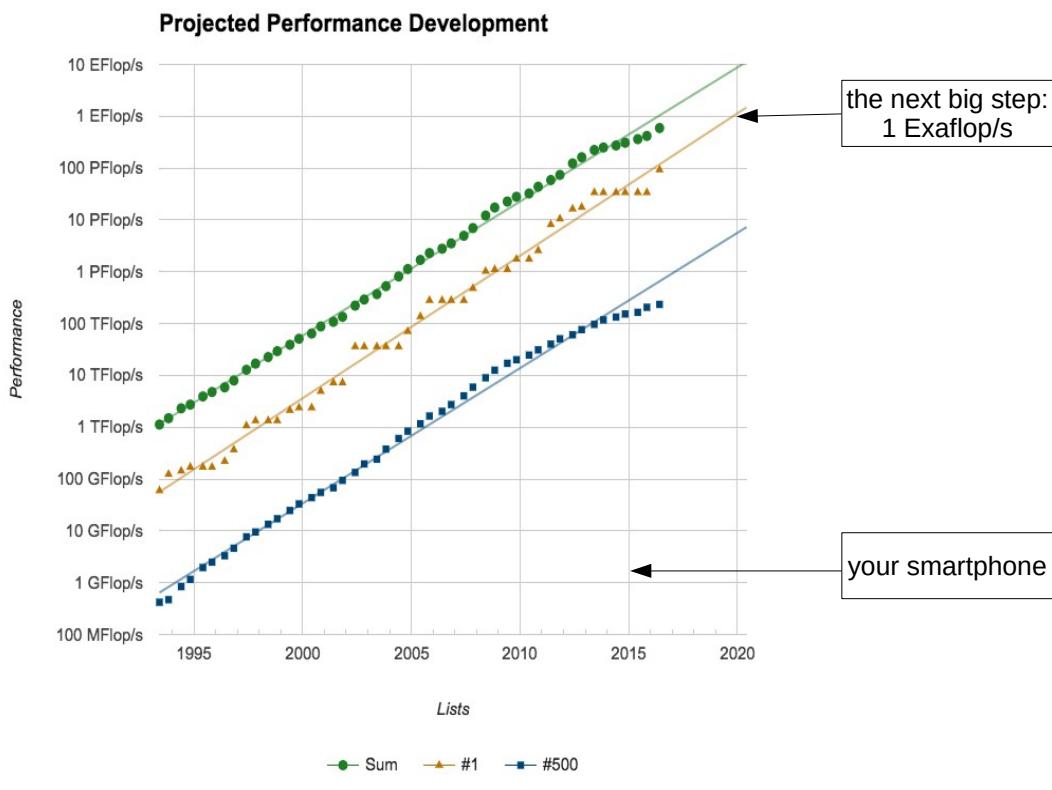
- ❑ there are probably more powerful installations in DK, but they did not “want” to be on the list

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# TOP500 – history and outlook



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# TOP500 – HPC's Formula 1

- Some remarks:
  - not always applicable to 'real world' problems
  - (sometimes) difficult to program
  - huge installations → power issues
    - The TOP500 no. 1 (Tianhe-2) uses about 17-18 MW
- An alternative list – Green500:
  - <http://www.green500.org/>
  - measures the power efficiency: Mflop/s / W
  - number 1 on the Green500 list is number 253 on the TOP500 (TOP500 no. 1 → Green500 no. 168)

# GREEN 500 No. 1 – Nov 20XX



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## TOP500 – the Exaflop/s challenge

- ❑ first projections said, that the world will see the first Exaflop/s machine around 2018
- ❑ since then, it has been postponed several times – the current prediction says ~2023
- ❑ Challenges:
  - ❑ power consumption (goal: max 20MW!)
  - ❑ memory technologies
  - ❑ ...
- ❑ but there are always surprises, e.g. the current no. 1

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# The HPC landscape is changing ...

HPC methods are penetrating all areas of computing

- ❑ embedded systems based on multi-core
- ❑ use of GPUs as accelerators on desktop and laptop systems
- ❑ “Big Data” - HPC methods for high-performance data analytics and visualization
- ❑ and not to forget ...

# The HPC landscape is changing ...



NSA data center in Bluffdale, Utah (65 MW or more)

# The HPC landscape is changing ...

There are currently discussions about a new and updated benchmark for the TOP500 list

- ❑ the current HPC Linpack is not very realistic (dense matrices)
- ❑ add more realistic scenarios, e.g. sparse matrix calculations
- ❑ add power consumption or a power envelope
- ❑ more ...

# High-Performance Computing

