

Programming Techniques for Supercomputers



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FAU Erlangen-Nürnberg
Sommersemester 2025



Audience & Contact

- Audience
 - **Computational Engineering**
 - **Computer Science**
 - **Computational & Applied Mathematics (CAM)**
 - Physics, Engineering, Materials Science, Chemistry,...
- Contact:
 - Gerhard Wellein: gerhard.wellein@fau.de (Lecture&Tutorial)
 - Georg Hager: georg.hager@fau.de (Lecture&Tutorial)
 - A. Afzal (ayesha.afzal@fau.de): Tutorial
 - Dane Lacey and Jan Laukemann: Tutorial (**CAM**)
- For questions first use moodle – forum (see next slide)

How to **register** for the **lecture & tutorials**

- Sign up for lecture & tutorials at moodle:

<https://go-nhr.de/PTfS>

Enroll in the course and fill the poll:

<https://moodle.nhr.fau.de/mod/choice/view.php?id=2834>

- Registration for exam (starts later): campo.fau.de

Format of lecture / exams

- **PTfS: Lecture & Exercises:** 7.5 ECTS
 - Written exam (90 Minutes)
 - Material covered in lecture AND tutorial
 - Register in campo for: **278169**
- **PTFS-CAM: Lecture & Exercises & Additional programming project:** 10 ECTS
 - Oral exam (30 minutes)
 - Material covered in lecture AND tutorial AND Programming Project
 - Register in campo for **58751**
- **Both exams:**
 - No additional materials allowed
 - **Bonus system based on total credits of returned exercise sheets:**
 - 60% - 79% an upgrade in the final mark of 1 stage, e.g. 2.7 → 2.3
 - 80% and higher upgrade in the final mark of 2 stage, e.g. 2.7 → 2.0
 - **You must pass the exam before “boost” is applied! 1.0 is still best marks**

Organization & Format

- 4 hrs of lecture (2 x 2 hrs) / week : !!! In person !!!
 - Tuesday (12:15 – 13:45): H20
 - Thursday (10:15 – 11:45): H20
 - Friday (8:30 – 10:00): 02.134-113 (**backup slot** – see moodle for lecture dates)
- 2 hrs of tutorial per week – **choose one**
 - **Thursday (14:15 – 15:45) 02.133-113**
- OR**
- **Friday (10:15 – 11:45) 02.134-113**
- CAM office hours: Friday 13:00 – 14:00 in the office 04.139-113
starting **after** first project intro (will be announced on Moodle)

GW needs to travel several times during the semester → **backup slot**

During lectures / tutorial: DON'T BE SHY AND ASK QUESTIONS!

Organization & Format: Lecture

- Lecture/Tutorial is completely documented in moodle LMS:
<https://go-nhr.de/PTfS> (see also StudOn entry)
- Please enroll into the lecture and specify your matriculation number!
 - Homework assignments, announcements etc. all handled via moodle
 - Use forum for questions or discussion with other students
- Recordings of 2020 and 2021 PTfS lectures are available at <https://www.fau.tv>
 - <https://www.fau.tv/course/id/2351> (2021 - Zoom lecture)
 - <https://www.fau.tv/course/id/1233> (2020 – CAMTASIA recording)

Material has changed
since then!!!!

Organization & Format: Tutorials and Homework

- New homework assignments are released every Wednesday around 10:00 a.m.
- Report submission
 - Deadline: one week later, i.e., Thursday 10:00 a.m. **No extensions!**
 - Deadline for Assignment 0: to be announced → Moodle
 - Upload a single file in Moodle
 - PDF report or
 - compressed archive including a PDF report and supporting material
 - Grading will be done based on PDF report
- Problems? Questions?
 - Ask during tutorial Q&A
 - Use Moodle forum

Thursday / Friday Tutorial Sessions: Content

- Presentation of solution to previous assignment
- Presentation of current (new) assignment
- !!! Opportunity to ask questions !!!
- Strongly recommended to attend the tutorial weekly

Organization & Format: **PTfS-CAM**

- CAM students have to do a programming and performance modeling project:
- Shared memory parallel Preconditioned Conjugate Gradient (PCG) solver
- **Extra events for PTfS-CAM students:**
 - Basic shell introduction: May 2nd , **after** the tutorial
 - Introduction to C: April 29th, **instead** of lecture
 - Introduction to project work (OpenMP parallelization)
 - Introduction to project work (performance modelling)
 - PTfS-CAM-Consultation hour every week (Jan / Dane)
 - **Dates & times will be announced in moodle → SEE MOODLE**

Can also be attended
by other students

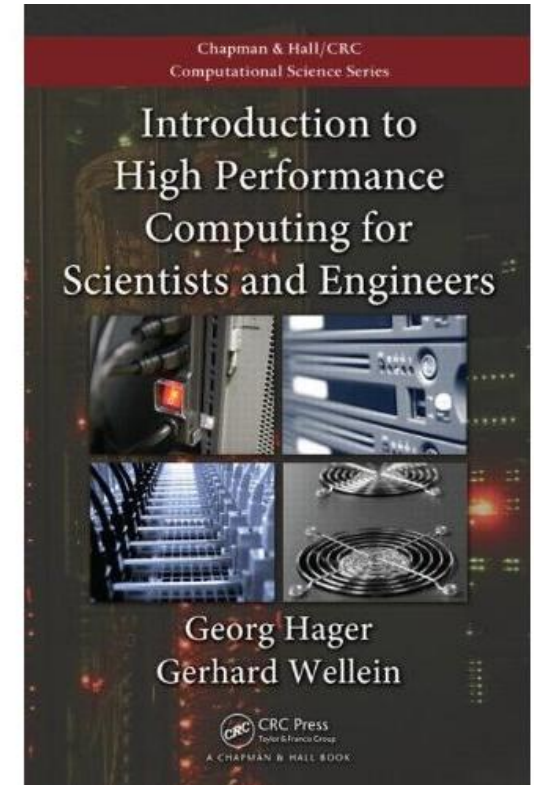
Format of the course

- Prerequisite (for exercises):
 - Basic programming knowledge in C/C++ or FORTRAN
 - Using LINUX / UNIX OS environments (including ssh)
- Recommended
 - First experiences with parallel programming – though we will introduce necessary basics
- Tutorials:
 - You **must** submit your homework assignments for inspection to qualify for bonus!
 - Do the exams and programming exercises even if you do not submit!
 - Some topics will be covered (in more detail) in the tutorials
 - Topics additionally covered in the tutorials are part of the 7.5 ECTS exam
 - Practical parallelization skills will be tested in the 7.5 ECTS exam!

Supporting material

- Books:

- G. Hager and G. Wellein:
Introduction to High Performance Computing for Scientists and Engineers.
CRC Computational Science Series, 2010.
ISBN 978-1439811924
 - 10 copies are available in the library
 - discounted copies – ask us
- J. Hennessy and D. Patterson: *Computer Architecture. A Quantitative Approach.* Morgan Kaufmann Publishers, 2017. ISBN 978-0128119051
- W. Schönauer: *Scientific Supercomputing.*
(cf. <http://www.rz.uni-karlsruhe.de/~rx03/book/>)



Supporting material

- Documentation:
 - <http://www.openmp.org>
 - <http://www.mpi-forum.org>
 - <http://developer.intel.com/products/processor/manuals>
 - <http://developer.amd.com/documentation/guides>
- The big ones and more useful HPC related information:
 - <http://www.top500.org>

Related teaching activities

- Regular seminar on

“Efficient numerical simulation on multicore processors” (**MuCoSim**)

- 5 ECTS
- 2 hrs per week
- 2 talks + written summary
- Topics from code optimization, code parallelization and code benchmarking on latest multicore / manycore CPUs and GPUs
- This semester: Wednesday 16:00 – 17:30
- See moodle: <http://go-nhr.de/MuCoSim>
- Also offered during winter term

Related teaching activities

- Lecture on

Practical parallel algorithms with MPI (**PAMPI**)

- Winter term
- 5 ECTS
- 2 hrs of lecture
- 2 hrs of tutorials

- Lecturer: Dr. Jan Eitzinger

Scope of the lecture



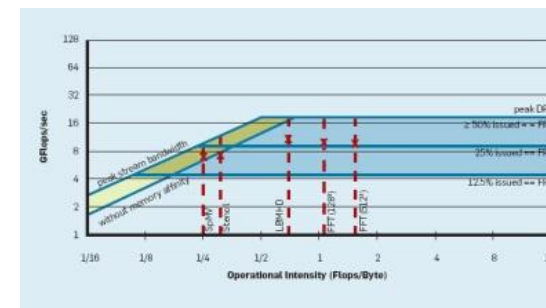
Scope of the lecture

Understand relevant hardware features/concepts of modern HPC systems and derive efficient parallelization & implementation strategies

- Identify **basic hardware concepts** (CPU & GPU)
single core, chip/device, node-level
- Learn strategies how to **efficiently use (program) the hardware**
(code transformations/optimizations, OpenMP/CUDA)
- Establish appropriate **performance expectations/models** to
 - assess the **attainable performance** and
 - identify the “hardware **bottleneck**”

Scope of the lecture

- Hardware coverage:
 - Single-core + Multi-Core Intel Xeon & AMD EPYC & ARM-based
 - Many-core / GPU: NVIDIA A100
 - Shared memory nodes (multiple multi-/many-core & GPUs)
 - Distributed memory computers (multiple/many nodes)
- Programming models (mostly basic introduction; performance issues):
 - OpenMP (shared memory nodes)
 - CUDA (GPUs)
 - MPI (distributed memory) → **PAMPI lecture**
- Performance Modelling
 - Expectations
 - Roofline Model [Williams&Patterson, 2009]
 - (ECM Model)



Structure of the lecture

- Introduction
 - Performance: Basics, Measuring & Reporting, Benchmarks
- Modern (multicore) processors
 - Single core: Basics, Pipelining, Superscalarity, SIMD
 - Memory Hierarchy: Caches & Main Memory
 - Multicore: Technology & Basics
 - GPU
- Parallel computers: Shared Memory
 - Shared-memory system architectures: UMA, ccNUMA
 - OpenMP basics
- Performance Modelling / Engineering:
 - Roofline Model
 - Case Studies: Dense&Sparse Matrix-Vector-Multiplication / Stencils / ...
- Shared Memory in depth
 - Advanced OpenMP, Pitfalls, Data Placement
- Hardware performance monitoring and model validation → LIKWID

Performance Analysis and Modeling

Scope of the lecture – a typical example

```
!$OMP PARALLEL DO
```

```
do k = 1 , 400
```

```
do j = 1 , 400; do i = 1 , 400
```

```
  y(i,j,k) = b*( x(i-1,j,k)+ x(i+1,j,k)+ x(i,j-1,k)+  
                x(i,j+1,k)+ x(i,j,k-1)+ x(i,j,k+1) )
```

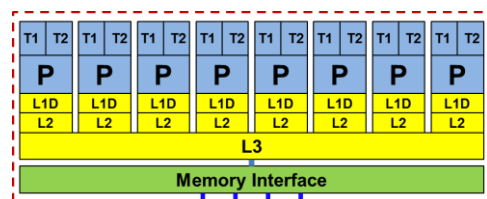
```
  enddo; enddo
```

```
enddo
```

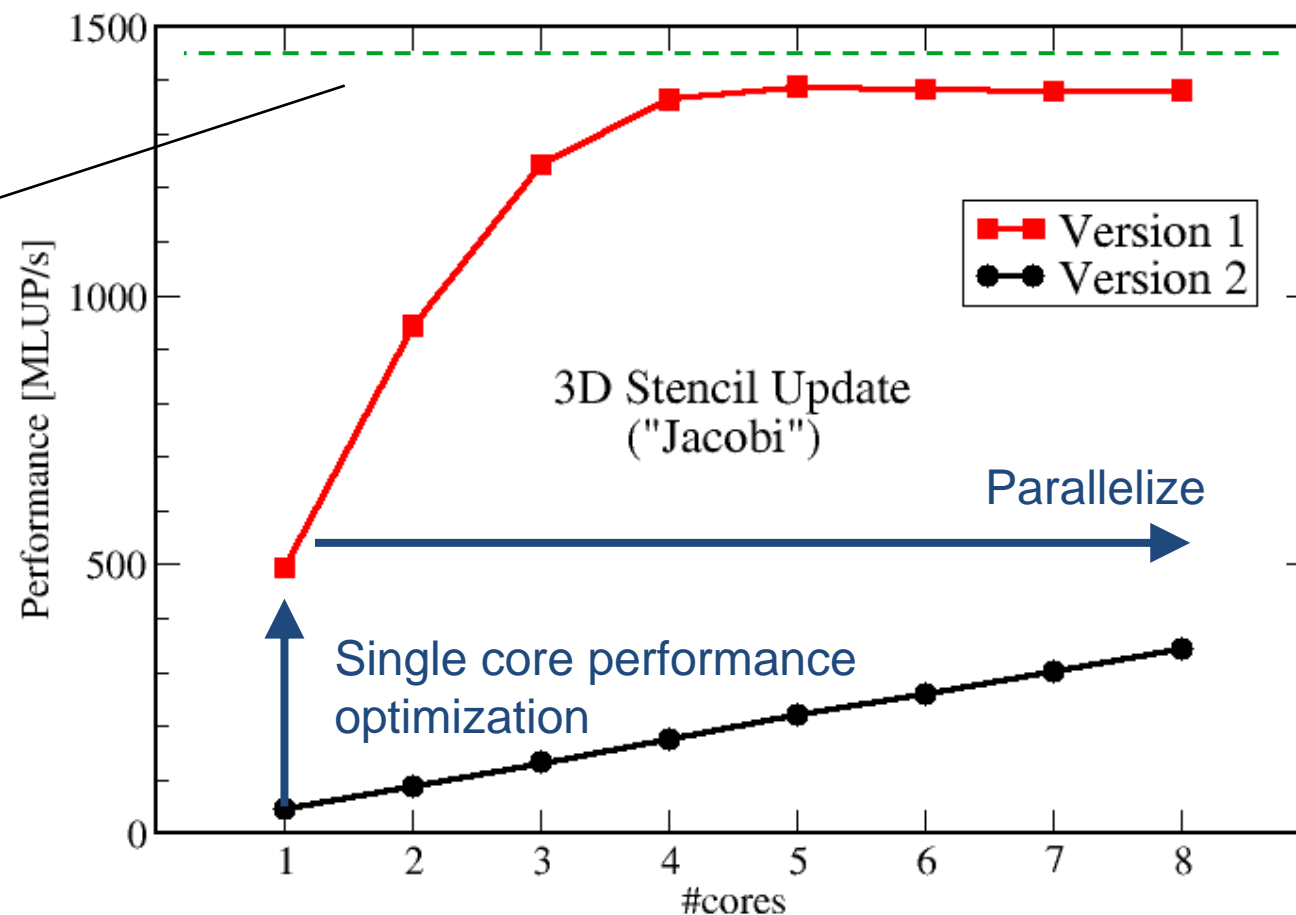
```
!$OMP END PARALLEL DO
```

Parallelize

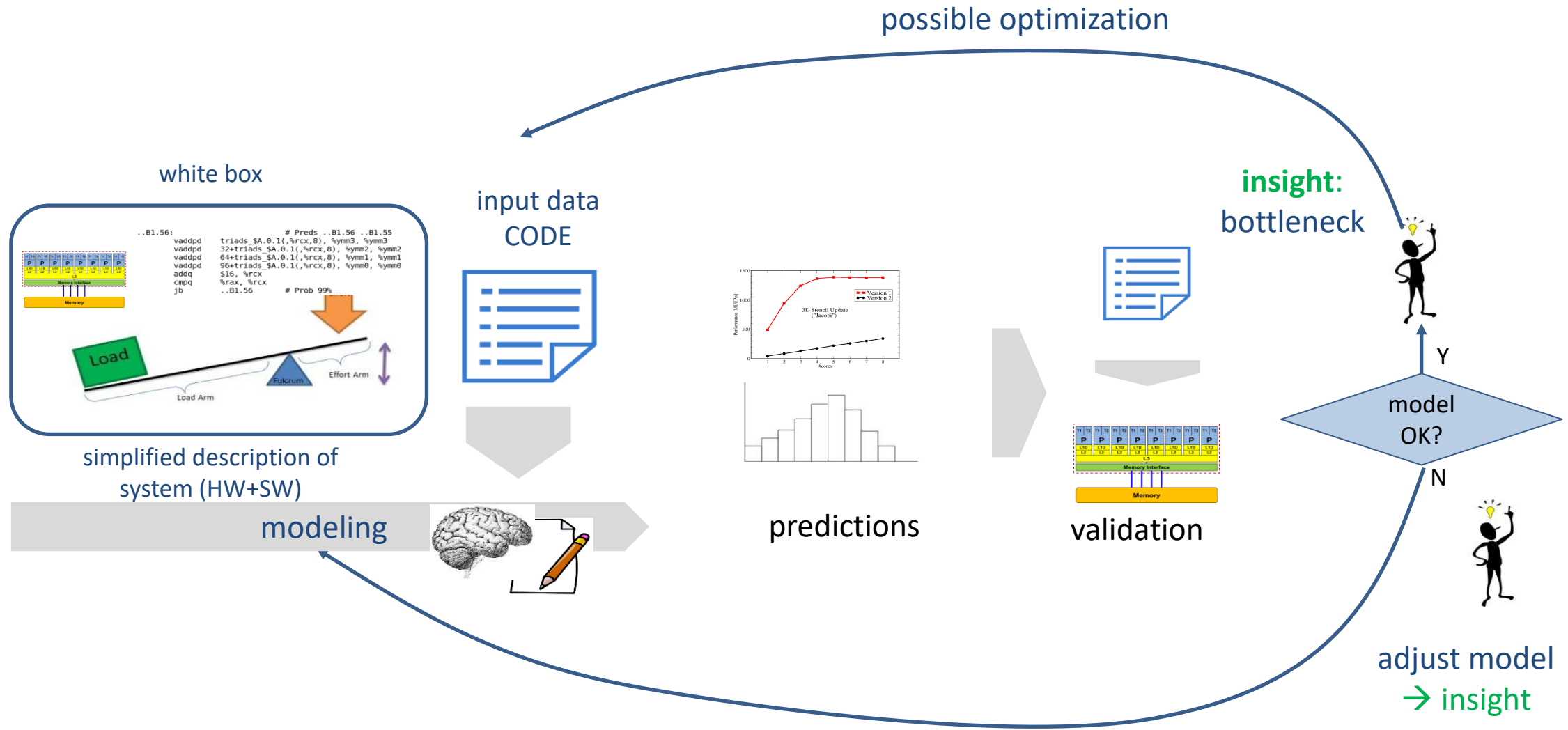
Establish limit simple
performance model
(Here: Roofline)



Intel® Xeon® Prozessor E5-2670



Code optimization/parallelization – no black boxes!



Introduction

Supercomputers:
The Big Ones and the working horses



Most powerful computers in the world: TOP500

- Top 500: Survey of the 500 most powerful supercomputers
 - <http://www.top500.org>
 - How to rate the performance?
→ Solve large dense system of equations: $\mathbf{A} \mathbf{x} = \mathbf{b}$ („LINPACK“)
 - Max. performance achieved with 64-Bit Floating Point Numbers: R_{\max}
 - Published twice a year (ISC in Germany, SC in USA)
 - First: **1993** (CM5/1,024 procs.): 60 GFlop/s (TOP1)
 - **Nov. 2024** (HPE – AMD MI300A GPUs): 1,742,000,000 GFlop/s (TOP1)
 - Performance increase: 74% p.a. from 1993 – 2024

Most powerful computers in the world: TOP500

- Performance measures: MFlop/s, GFlop/s, TFlop/s, PFlop/s, EFlop/s
 - Number of FLOATING POINT operations per second
 - FLOATING POINT operations: Typically **Add** & **Multiply** operations (→Chapter 3 of the lecture)
 - Performance may depend on accuracy (of input operands):
 - double precision, double: 64 Bit
 - single precision, float: 32 Bit
 - half precision: 16 Bit
 - **default:** **64 Bit**
 - See Chapter 3 for details

10^6 : MFlop/s	10^{12} : TFlop/s	← Single node or GPU
10^9 : GFlop/s	10^{15} : PFlop/s	← TOP500 systems
	10^{18} : EFlop/s	← TOP1 in 2023

TOP3 as of November 2024

Number of processors		LINPACK Performance	Peak Performance		Power@ LINPACK
Rank	System	Cores	Rmax (PFlop/s)	Rpeak (PFlop/s)	Power (kW)
1	El Capitan - HPE Cray EX255a, AMD 4th Gen EPYC 24C 1.8GHz, AMD Instinct MI300A, Slingshot-11, TOSS, HPE DOE/NNSA/LLNL United States	11,039,616	1,742.00	2,746.38	29,581
2	Frontier - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, HPE Cray OS, HPE DOE/SC/Oak Ridge National Laboratory United States	9,066,176	1,353.00	2,055.72	24,607
3	Aurora - HPE Cray EX - Intel Exascale Compute Blade, Xeon CPU Max 9470 52C 2.4GHz, Intel Data Center GPU Max, Slingshot-11, Intel DOE/SC/Argonne National Laboratory United States	9,264,128	1,012.00	1,980.01	38,698

Investment for such systems: > 200 M€

Power bill @ 30ct/kW hr: 1 MW \leftrightarrow € 2,500,000 p.a.

Source: www.top500.org

TOP10 as of November 2024

Leading systems: US (5 entries) –
National Labs and Industry

Four systems from Europe in Top 10: 5, 7, 8, 9

Germany:

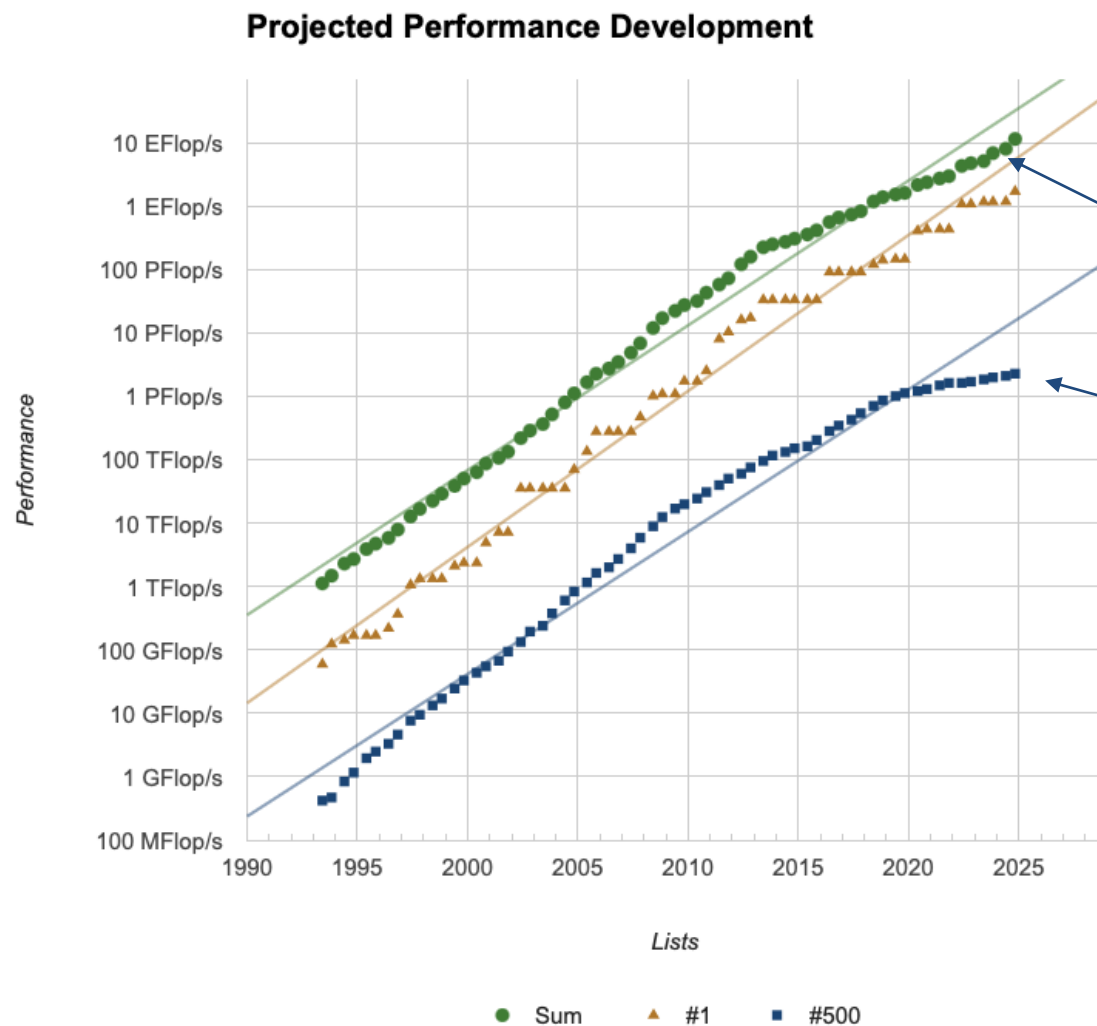
JETI - JUPITER Exascale Transition Instrument @FZJ Jülich:
#18 → Transition system to first EFlop/s system in Europe

Only a single CPU based system left

Source: www.top500.org

Rank	System	Cores	Rmax (PFlop/s)	Rpeak (PFlop/s)	Power (kW)
1	EL Capitan - HPE Cray EX255a, AMD 4th Gen EPYC 24C 1.8GHz, AMD Instinct MI300A, Slingshot-11, TOSS, HPE DOE/NNSA/LLNL United States	11,039,616	1,742.00	2,746.38	29,581
2	Frontier - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, HPE Cray OS, HPE DOE/SC/Oak Ridge National Laboratory United States	9,066,176	1,353.00	2,055.72	24,607
3	Aurora - HPE Cray EX - Intel Exascale Compute Blade, Xeon CPU Max 9470 52C 2.4GHz, Intel Data Center GPU Max, Slingshot-11, Intel DOE/SC/Argonne National Laboratory United States	9,264,128	1,012.00	1,980.01	38,698
4	Eagle - Microsoft NDv5, Xeon Platinum 8480C 48C 2GHz, NVIDIA H100, NVIDIA Infiniband NDR, Microsoft Azure Microsoft Azure United States	2,073,600	561.20	846.84	
5	HPC6 - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, RHEL 8.9, HPE Eni S.p.A. Italy	3,143,520	477.90	606.97	8,461
6	Supercomputer Fugaku - Supercomputer Fugaku, A64FX 48C 2.2GHz, Tofu interconnect D, Fujitsu RIKEN Center for Computational Science Japan	7,630,848	442.01	537.21	29,899
7	Alps - HPE Cray EX254n, NVIDIA Grace 72C 3.1GHz, NVIDIA GH200 Superchip, Slingshot-11, HPE Cray OS, HPE Swiss National Supercomputing Centre (CSCS) Switzerland	2,121,600	434.90	574.84	7,124
8	LUMI - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, HPE EuroHPC/CSC Finland	2,752,704	379.70	531.51	7,107
9	Leonardo - BullSequana XH2000, Xeon Platinum 8358 32C 2.6GHz, NVIDIA A100 SXM4 64 GB, Quad-rail NVIDIA HDR100 Infiniband, EVIDEN EuroHPC/CINECA Italy	1,824,768	241.20	306.31	7,494
10	Tuolumne - HPE Cray EX255a, AMD 4th Gen EPYC 24C 1.8GHz, AMD Instinct MI300A, Slingshot-11, TOSS, HPE DOE/NNSA/LLNL United States	1,161,216	208.10	288.88	3,387

Performance Trend & Projection (2024)



Basic trend: Slope changes
→ performance increase slows down

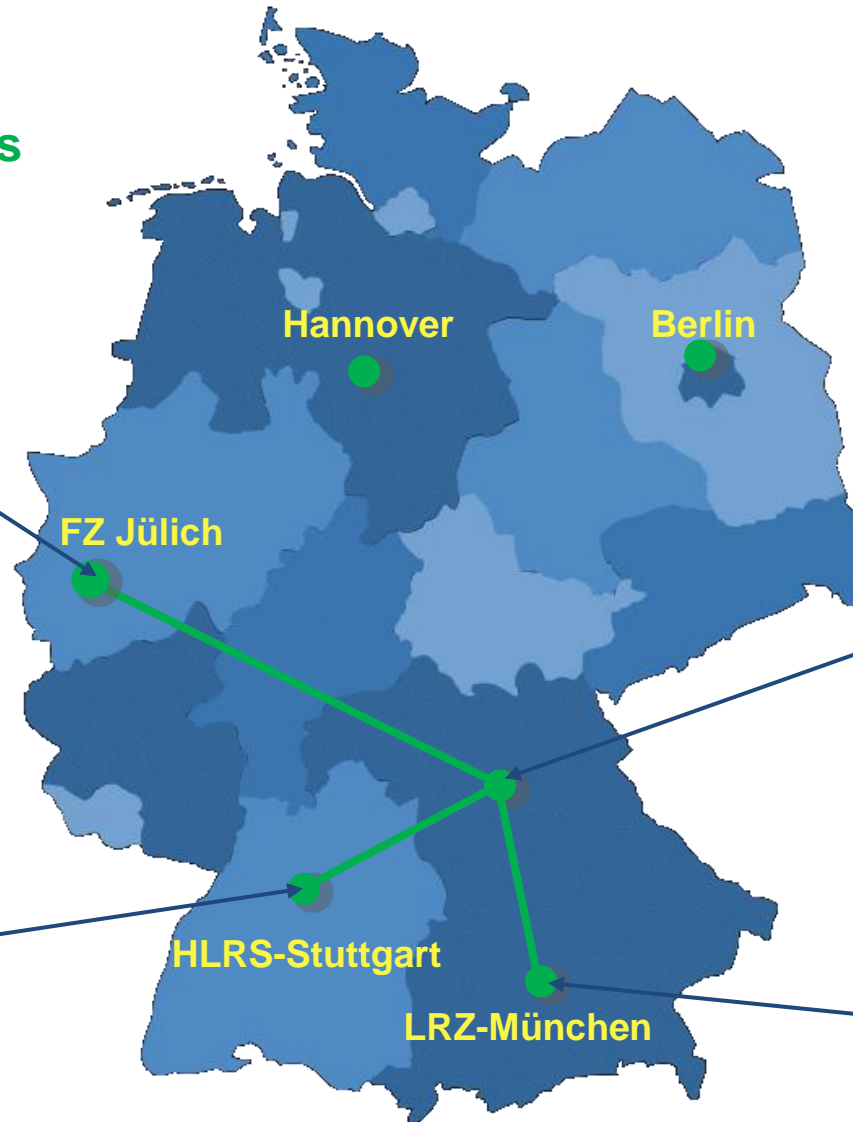
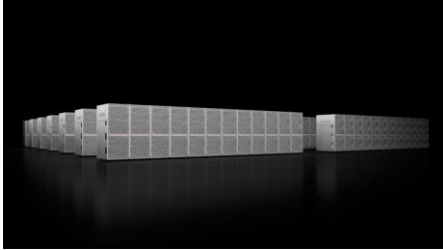
Source: www.top500.org

HPC Centers in Germany: A view from Erlangen

Forschungszentrum Jülich
in der Helmholtz-Gemeinschaft



Expecting JUPITER – 1,000 PF/s



NHR FAU

FAU Erlangen/-Nürnberg
Helma (50 PF/s)
Fritz (5 PF/s) & Alex (5 PF/s)



HLR Stuttgart
Hawk: 26 PF/s
New system 25/26



SuperMUC-NG: 26.8 PF/s
New System 2027

Erlangen National Center for High Performance Computing

www.nhr.fau.de

One out of nine national HPC centers at German universities

Ongoing:

- New system installed (**Helma-GPU**)
- New HPC center - 2030

Focus topics:

- Node-level Performance engineering
- Atomistics simulations
- AI/ML

Student positions, master theses, doctoral positions available

The screenshot shows the homepage of the NHR@FAU website. At the top, there is a navigation bar with links to FAU, RRZE, NHR-Geschäftsstelle, and Gauß-Allianz, along with a search bar. Below the navigation bar is a large banner featuring the NHR@FAU logo and a molecular structure. The main content area is divided into several sections. On the left, there is a text block about the joint home page of the Erlangen National High Performance Computing Center (NHR@FAU) and the Tier3 HPC services (HPC4FAU) offered by the Erlangen Regional Computing Center (RRZE) at the Friedrich-Alexander-Universität Erlangen-Nürnberg (FAU). It mentions an interdisciplinary team of staff, Pls, and liaison scientists, and lists activities such as conducting research, providing lectures, tutorials, and trainings, supporting scientists at FAU or through NHR with code porting and optimizations, and operating the supercomputers within the system infrastructure at NHR and RRZE. On the right, there is a section titled 'How to reach us' which provides contact information for NHR@FAU and HPC4FAU, including the address (Martensstr. 1, 91058 Erlangen), email (hpc-support@fau.de), and website (https://hpc.fau.de). Below this, there is a note about the current work from home situation and contact options. At the bottom, there is a section titled 'HPC-Café – chat, get advice, and have some coffee' which describes the next HPC Café event on Tuesday, April 13, at 4 p.m., and mentions that it is a new offering to complement established contact channels and training events. The section includes a small image of a coffee cup and a plate of pastries.

↑ FAU RRZE NHR-Geschäftsstelle Gauß-Allianz

Search for... Find

NHR@FAU

News People Research Teaching & Training Systems & Services

NHR@FAU

This is the joint home page of the **Erlangen National High Performance Computing Center (NHR@FAU)** and the **Tier3 HPC services (HPC4FAU)** offered by the Erlangen Regional Computing Center (RRZE) at the Friedrich-Alexander-Universität Erlangen-Nürnberg (FAU).

Our interdisciplinary team of staff, Pls, and liaison scientists

- conducts research in several HPC areas,
- provides lectures, tutorials and trainings,
- but also supports scientists at FAU or through NHR with code porting and optimizations, or in the area of atomistic simulations,
- and, of course, operates the supercomputers within the system infrastructure at NHR and RRZE.

How to reach us

NHR@FAU and HPC4FAU
Regionales Rechenzentrum Erlangen (RRZE)

Martensstr. 1
91058 Erlangen

✉ hpc-support@fau.de
🏠 <https://hpc.fau.de>

📺 📢

Note: Currently we mostly work from home and thus cannot be reached via our office phone numbers. We can arrange virtual appointments by Zoom, MS Teams, or BigBlueButton. You may also call RRZE's HelpDesk (+49-9131-85-29955) and leave a message for us - but you probably get a faster response by sending us an e-mail (hpc-support@fau.de).

Erlangen Regional Computing Center

Professorship for High Performance Computing

HPC High Performance Computing

HPC-Café – chat, get advice, and have some coffee

The next HPC Café takes place VIRTUALLY on Tuesday, April 13, at 4 p.m. The HPC Café is a new offering to complement our established contact channels and training events. Every second Tuesday of the month this is an opportunity to get to know each other. On demand we will offer short talks about ... >

Fritz & Alex: Fact Sheet

	#nodes	Node conf.	Storage	Typical job sizes	Peak (FP64)
Fritz	992 Intel ICL (71,424 cores)	2 * 36 c (8360Y) 256 GB 1 x HDR100	Shared PFS • 3 PB • >20 GB/s	1 – 64 nodes	5.9 PF/s (4.1 PF/s)
	64 Intel SPR (6,656 cores)	2 * 52 c (8470) 1 TB / 2 TB 1 x HDR100		1 – 4 nodes	n.y.a.



178 **Fritz** - Megware D50TNP, Xeon Platinum 8360Y 36C
2.4GHz, InfiniBand HDR100, MEGWARE
Universitaet Erlangen - Regionales Rechenzentrum
Erlangen
Germany

71,424

3.58

5.45 **672**

Power consumption (kW)
for LINPACK

Fritz: <https://doc.nhr.fau.de/clusters/fritz/>

Fritz & Alex: Fact Sheet

	#nodes	Node conf.	Storage	Typical job sizes	Peak (FP64)
Alex	38 AI/ML (304 NVIDIA A100) (+320 H100 in 2024)	8 * NVIDIA A100 2 * 64 c (AMD) 1 TB 2 x HDR200	Node local 14 TB NVMe	1 – 8 GPUs	6.1 PF/s
	44 MD (352 NVIDIA A40)	8 * NVIDIA A40 2 * 64 c (AMD) 0.5 TB	Node local 7 TB NVMe	1 – 8 GPUs	---



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Alex - MEGWARE NF5488A5, AMD EPYC 7713 64C 2GHz,
NVIDIA A100 SXM4 80 GB, Infiniband HDR, MEGWARE
Universitaet Erlangen - Regionales Rechenzentrum
Erlangen
Germany

37,696

4.03

6.08

179

Power consumption (KW) for
LINPACK (A100)

Alex: <https://doc.nhr.fau.de/clusters/alex/>

HPC compute infrastructure – TOP500



RRZE-Serverraum


Alex	List	Fritz
#184 2.9 PF/s	06/22	#323 2.2 PF/s
#174 3.2 PF/s	11/22	#151 3.6 PF/s
#157 4.0 PF/s	06/23	#178 3.6 PF/s
#187 4.0 PF/s	11/23	#213 3.6 PF/s
#250 4.0 PF/s	11/24	#281 3.6 PF/s



NatFak Kältezentrale

Helma+: Fact Sheet

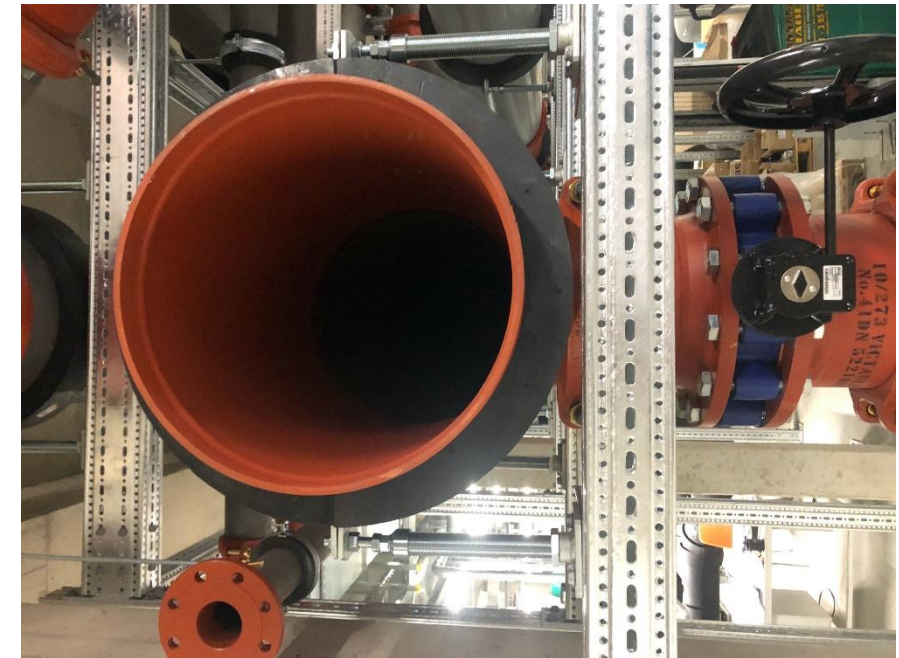
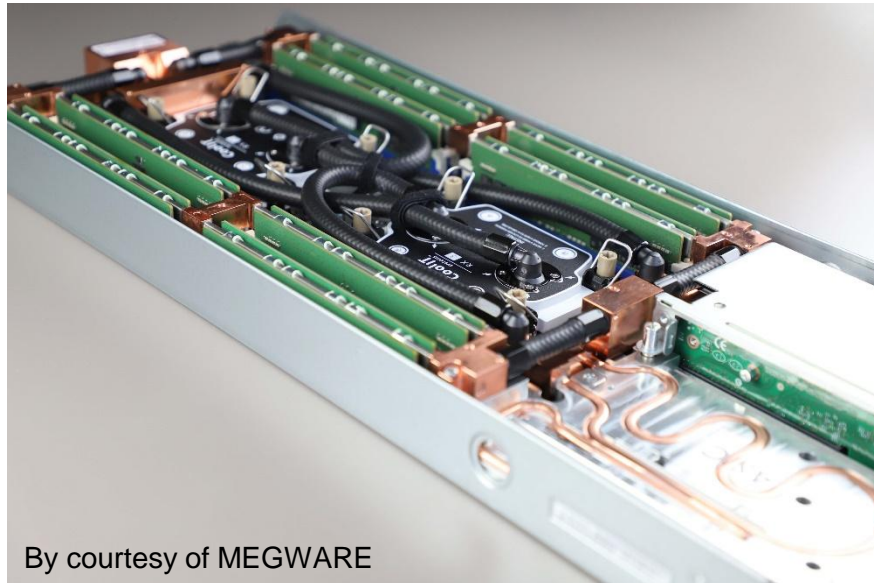
Helma: **Wilhelmine von Brandenburg-Bayreuth**
(* [3. Juli 1709](#) in [Berlin](#); † [14. Oktober 1758](#) in [Bayreuth](#))

	#nodes	node configuration			job sizes	peak (FP64)
Helma	Q3/24 96 AI/ML (384 NVIDIA H100)	4 * H100 94 GB 2 * 64 c (AMD) 4 x NDR200	0.7 TB DDR 15 TB NVMe	NDR Infiniband 5PB NVME Storage	1–96 GPUs	26 PF/s
	Q1/25 96 AI/ML (384 NVIDIA H200)	4 * H200 141 GB 2 * 64 c (AMD) 4 x NDR200	0.7 TB DDR 15 TB NVMe		1–96 GPUs	26 PF/s
	Q3/25 312 CPU (119,808 cores)	2 * 192 c (AMD) 0.7 – 2.1 TB DDR 1 x NDR200	---		1–96 nodes	
	79	Helma - Lenovo ThinkSystem SD665-N V3, AMD EPYC 9554 64C 3.1GHz, Nvidia H100 SXM5 94Gb, Infiniband NDR200, AlmaLinux 9.4, MEGWARE		62,976	16.94	25.96
						TOP500 11/24

NHR@FAU: Infrastructure requirements



NF-Technikzentrale: “data center” for Fritz & Helma



Lecture plan until end of May (1)

- **24.04.2025: Lecture**
- **25.04.2025: Lecture + tour to Helma (backup slot)**
- **29.04.2025: JE: Introduction to C**
- **01.05.2025: PUBLIC HOLIDAY**
- **02.05.2025: 8:15-9:45 and 10:15-11:45 Tutorial + intro to Linux Shell**
- **06.05.2025: Lecture**
- **08.05.2025: Lecture**
- **09.05.2025: backup slot**