

LECTURE 3: LEVELS OF PARALLELISM AND HIGH PERFORMANCE COMPUTING

End-to-End Machine Learning with High Performance and Cloud Computing – Tutorial IGARSS 2022 – 17 July, 2022

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ADJUNCT ASSOCIATE PROFESSOR, SCHOOL OF ENGINEERING AND NATURAL SCIENCES, UNIVERSITY OF ICELAND

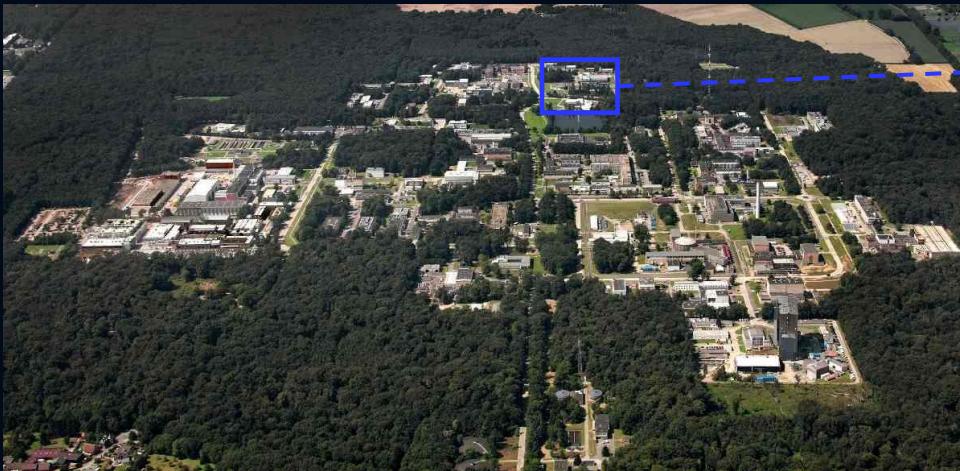
FORSCHUNGSZENTRUM JÜLICH

Helmholtz Association (Germany)



JÜLICH SUPERCOMPUTING CENTRE

Tier-0 Supercomputing Institution

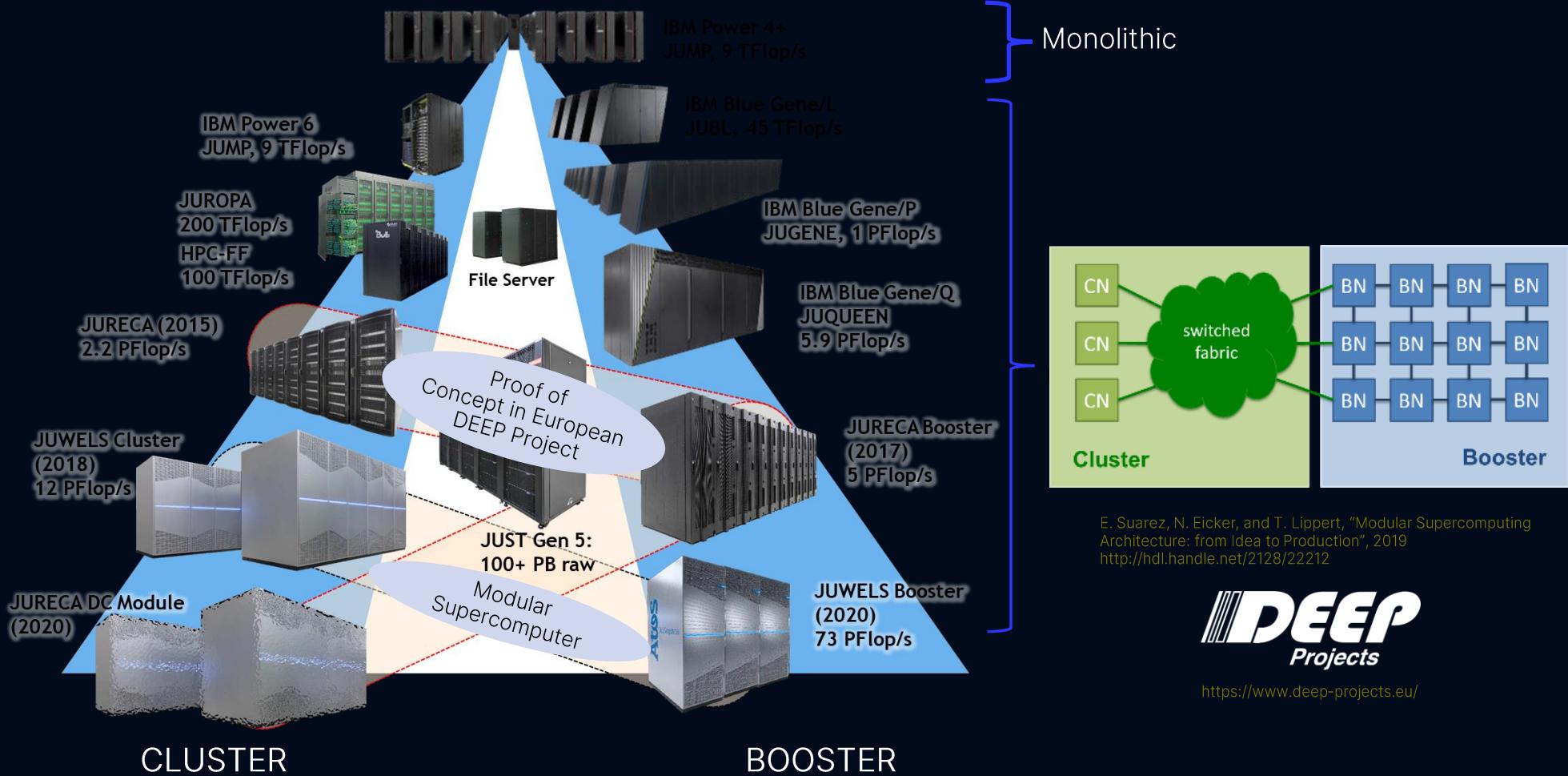


https://www.fz-juelich.de/ias/jsc/EN/Home/home_node.html

GCS
Gauss Centre for Supercomputing

<https://www.gauss-centre.eu/>

SUPERCOMPUTERS



JUWELS

Exascale Pathfinder

- Ranking in November 2020
 - TOP500 (7 World, 1 Europe)
 - Green500 (1 in TOP100)
 - TOP10 AI (4)



Julich Supercomputing Centre, "JUWELS Cluster and Booster: Exascale Pathfinder with Modular Supercomputing Architecture at Julich Supercomputing Centre," Journal of large-scale research facilities, vol. 7, no. A138, 2021.

Designed for simulation and large-scale machine learning

Funded through SiVeGCS (BMBF, MWK-NRW)

JUWELS BOOSTER – A “DUAL USE” SYSTEM

Benchmark result

- Benchmark: NVIDIA's submission to MLPerf training v0.7
- Metrics: Throughput in Samples/sec
- 5 Benchmarks on up to 1536 GPUs
- Reference: NVIDIA's results on specific AI system Selene

Example

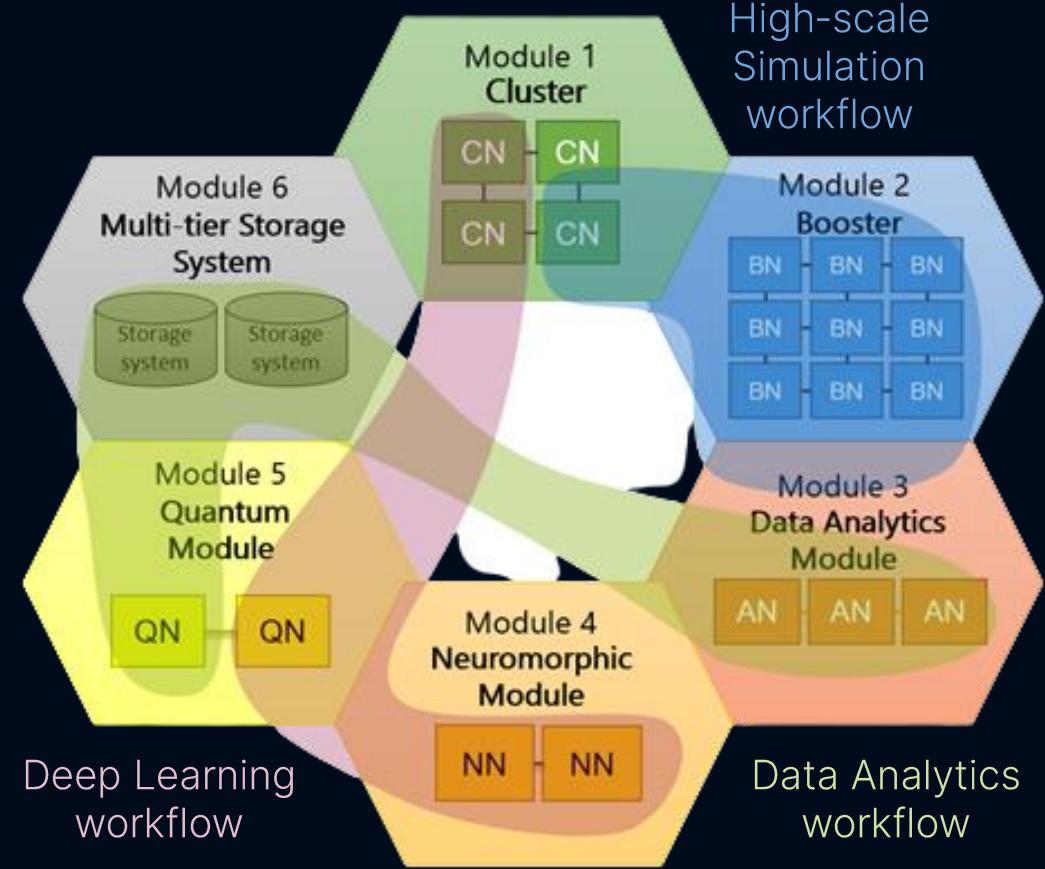
- Task: Train Resnet50 on ImageNet
- GPUs: 1536
- Throughput: 1.7 Million Images / Sec
- Training complete after 43 seconds!
- Parallelization efficiency: 40%



S. Kesselheim, A. Herten, K. Krajsek, J. Ebert, J. Jitsev, M. Cherti, M. Langguth, B. Gong, S. Stadtler, A. Mozaffari, G. Cavallaro, R. Sedona, A. Schug, A. Strube, R. Kamath, M. G. Schultz, M. Riedel, and T. Lippert, “JUWELS Booster – A Supercomputer for Large-Scale AI Research,” in High Performance Computing (H. Jagode, H. Anzt, H. Ltaief, and P. Luszczek, eds.), (Cham), pp. 453–468, Springer International Publishing, 2021.

MODULAR SUPERCOMPUTING

- Cost-effective scaling
- Effective resource-sharing
- Fit application diversity
 - Large-scale simulations
 - Data analytics
 - Machine- and Deep Learning
- Composability of heterogeneous resources



Modular Supercomputing Architecture (MSA)

MISSION OF JSC

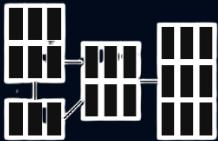


Develop supercomputing towards Exascale



Introduce future computing technologies

- Quantum Computing, Neuromorphic Computing



**Create exemplary federated infrastructures
for data analytics and AI**



Provide innovative support structures and tools



**Educate a new generation of simulation
and data science specialists**

IT ENVIRONMENTS

Key Priorities

Embedded system



⚡ Power consumption and price

Desktop Computing



⚡ Performance / price ratio

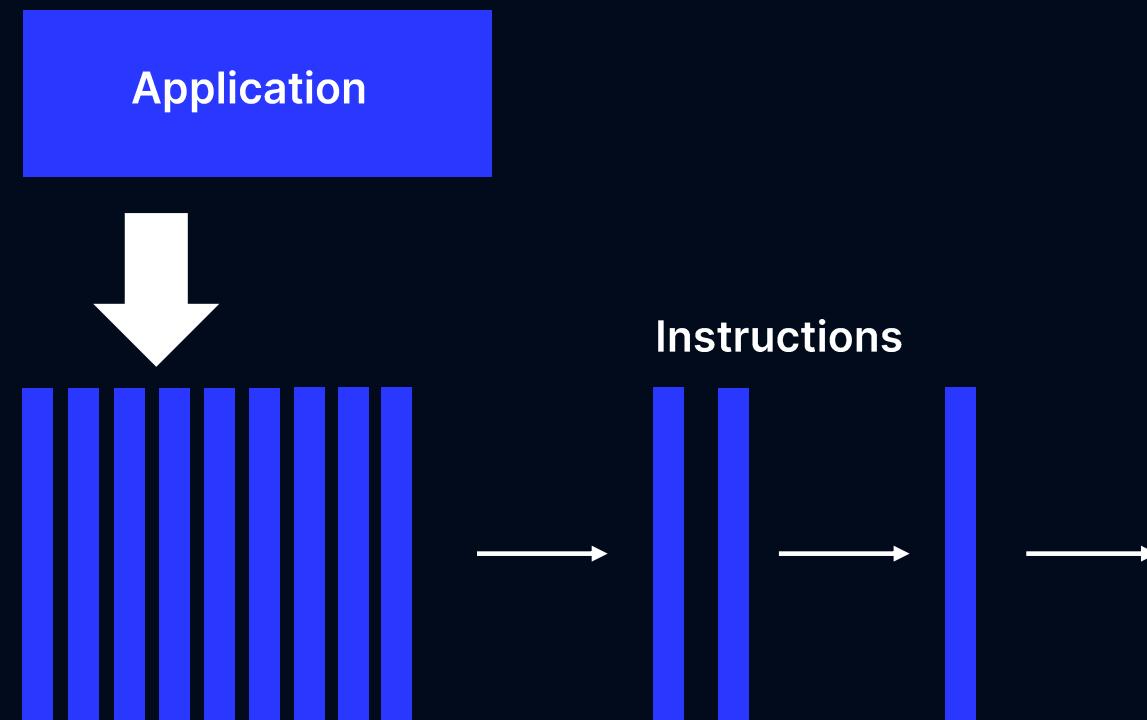
Servers



⚡ Maximum performance and maintainability reliability

HOW TO BECOME FASTER?

Split into instructions



HOW TO BECOME FASTER?

Three Alternative Ways

Work Harder



Clock Speed

Work Smarter



Optimization, Caching

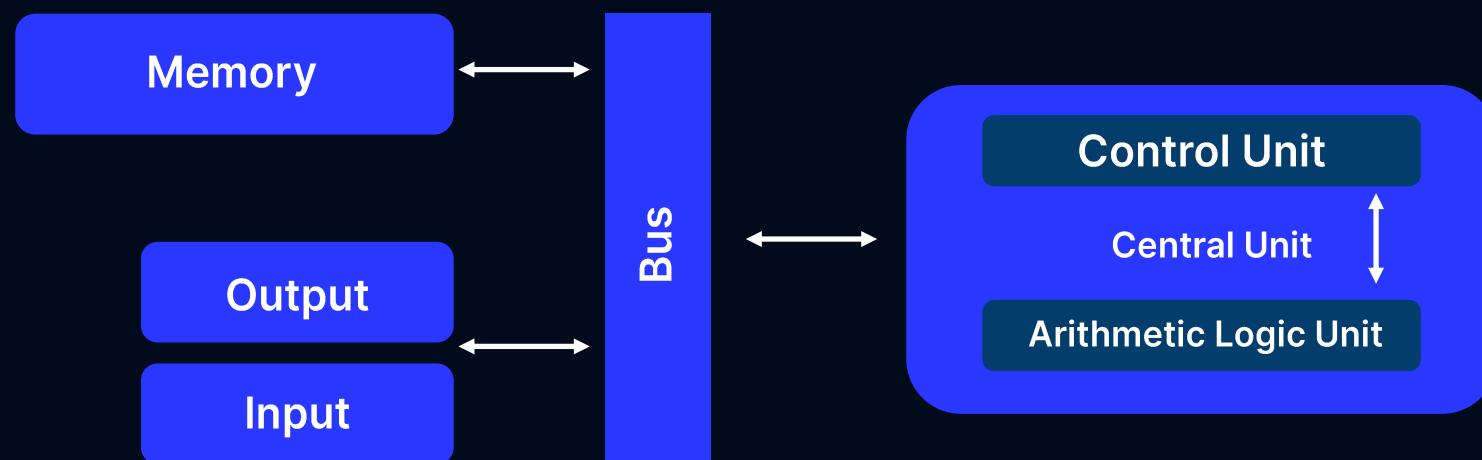
Get Help



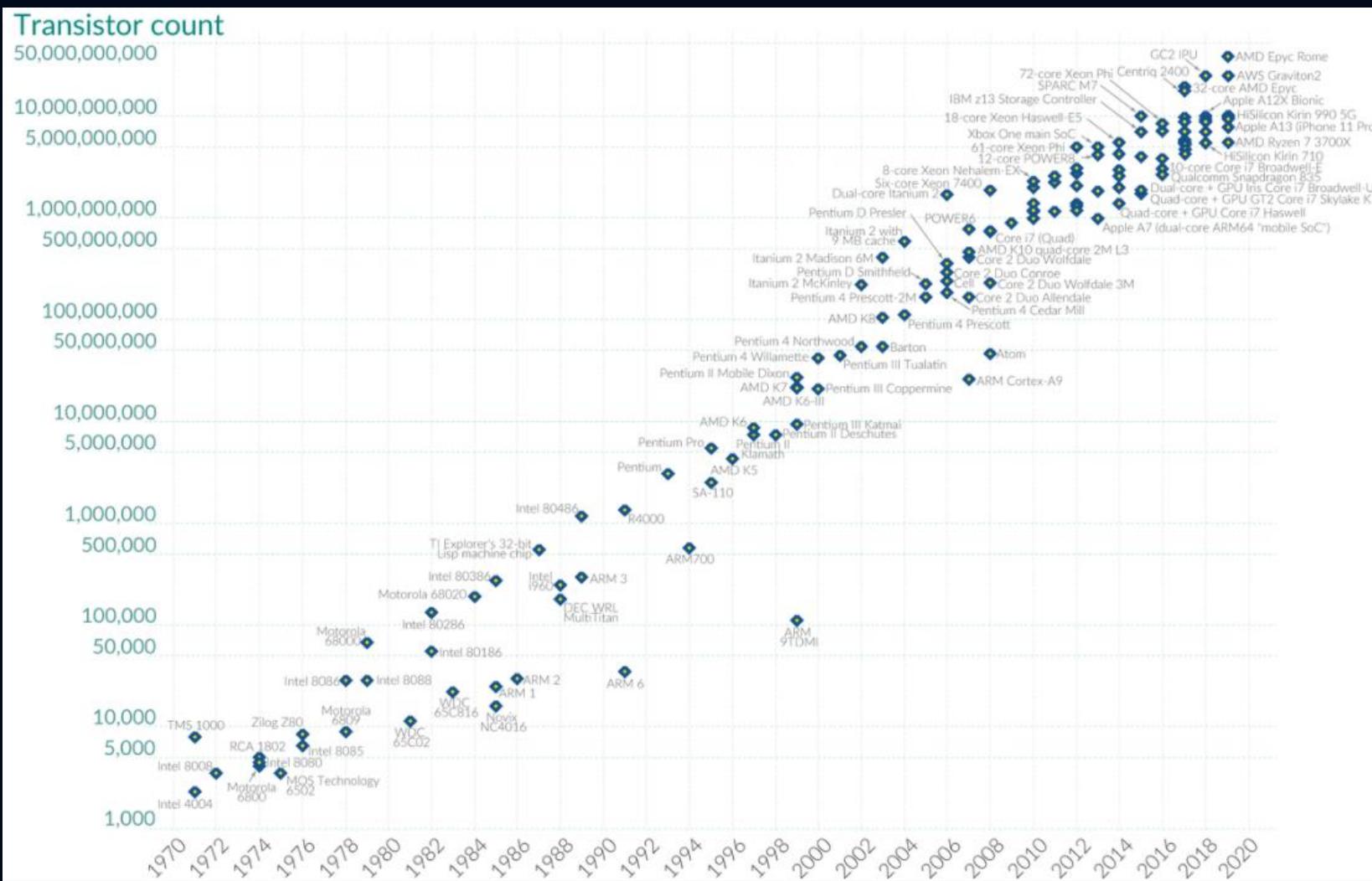
Parallelization

VON NEUMANN ARCHITECTURE

Machine Model

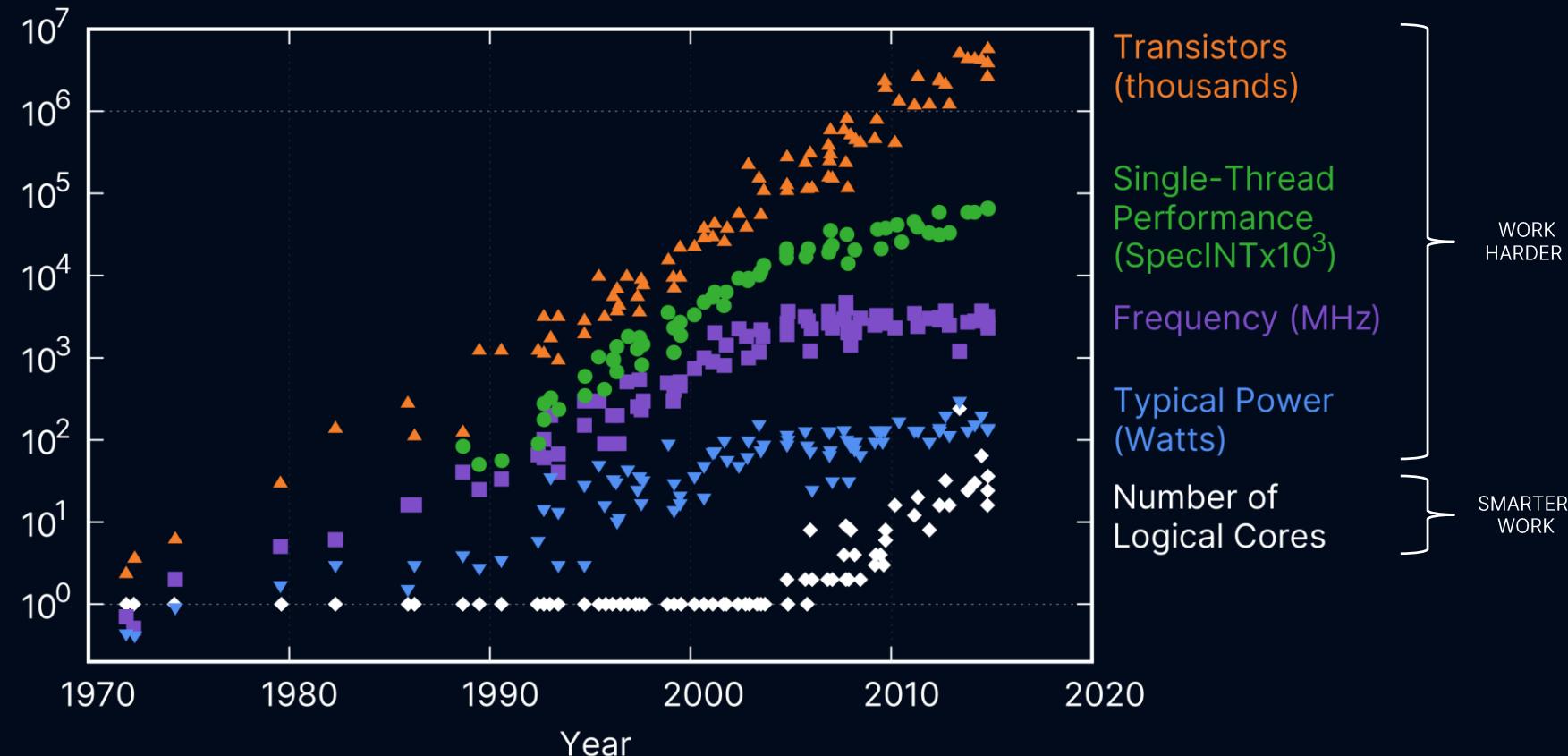


MOORE'S LAW



THE END OF DENNARD SCALING

Why haven't clock speeds increased, even though transistors have continued to shrink?



WILL MOORE'S LAW END?

Paradigm Shift

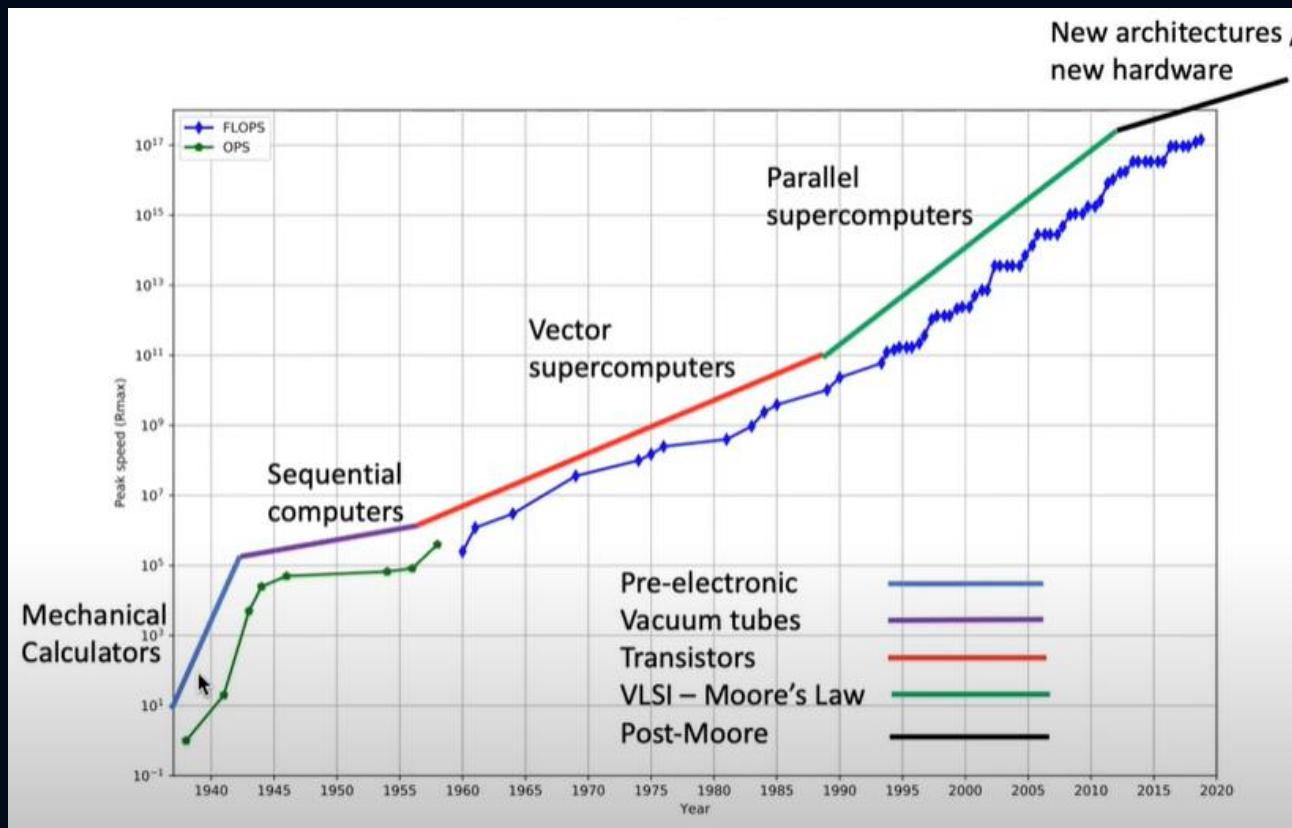
**“There’s no getting around the fact that
we build these things out of atoms”**



Gordon Moore

WHY SUPERCOMPUTER PERFORMANCE KEEP INCREASING?

Parallel computing is going mainstream

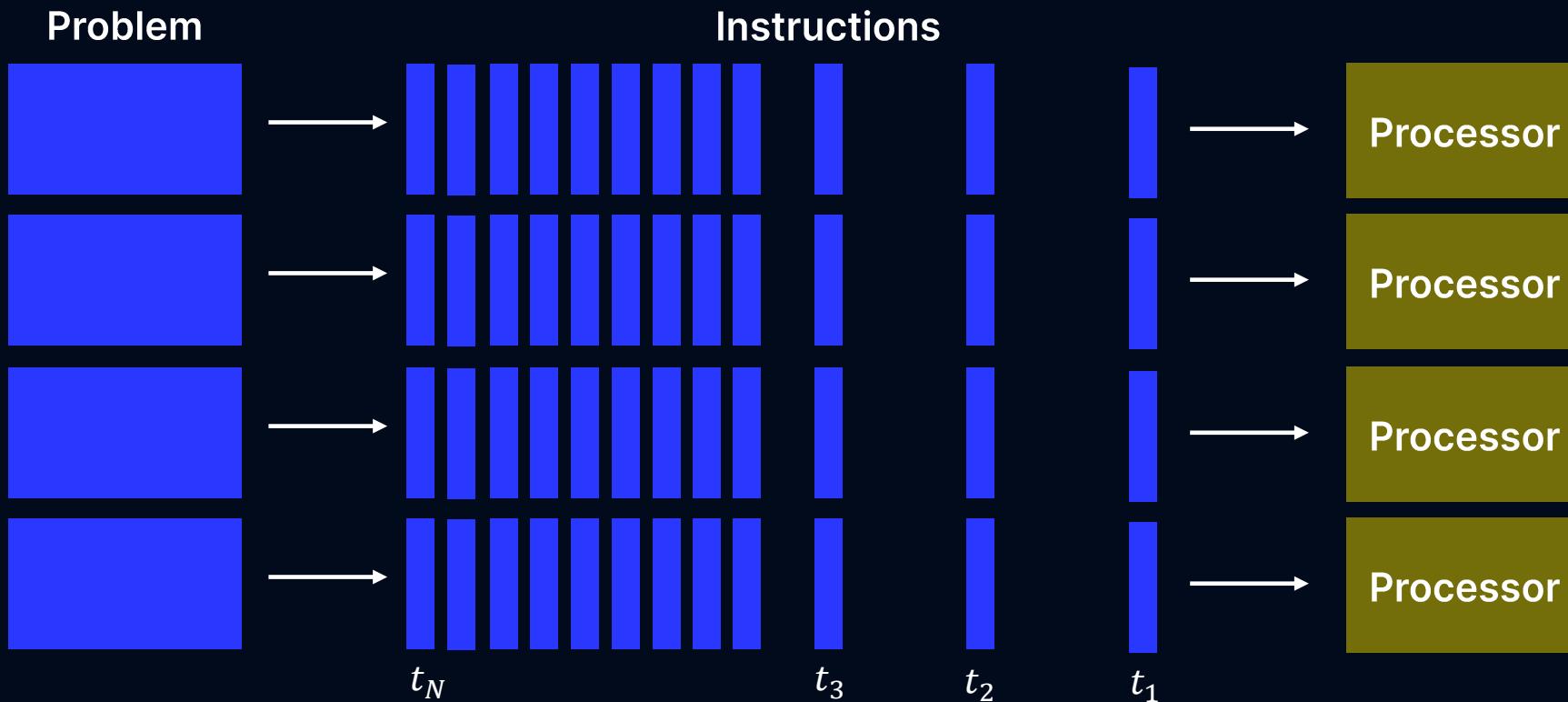


THE EASY TIMES HAVE GONE

Responsibility for better performance is on the software developers

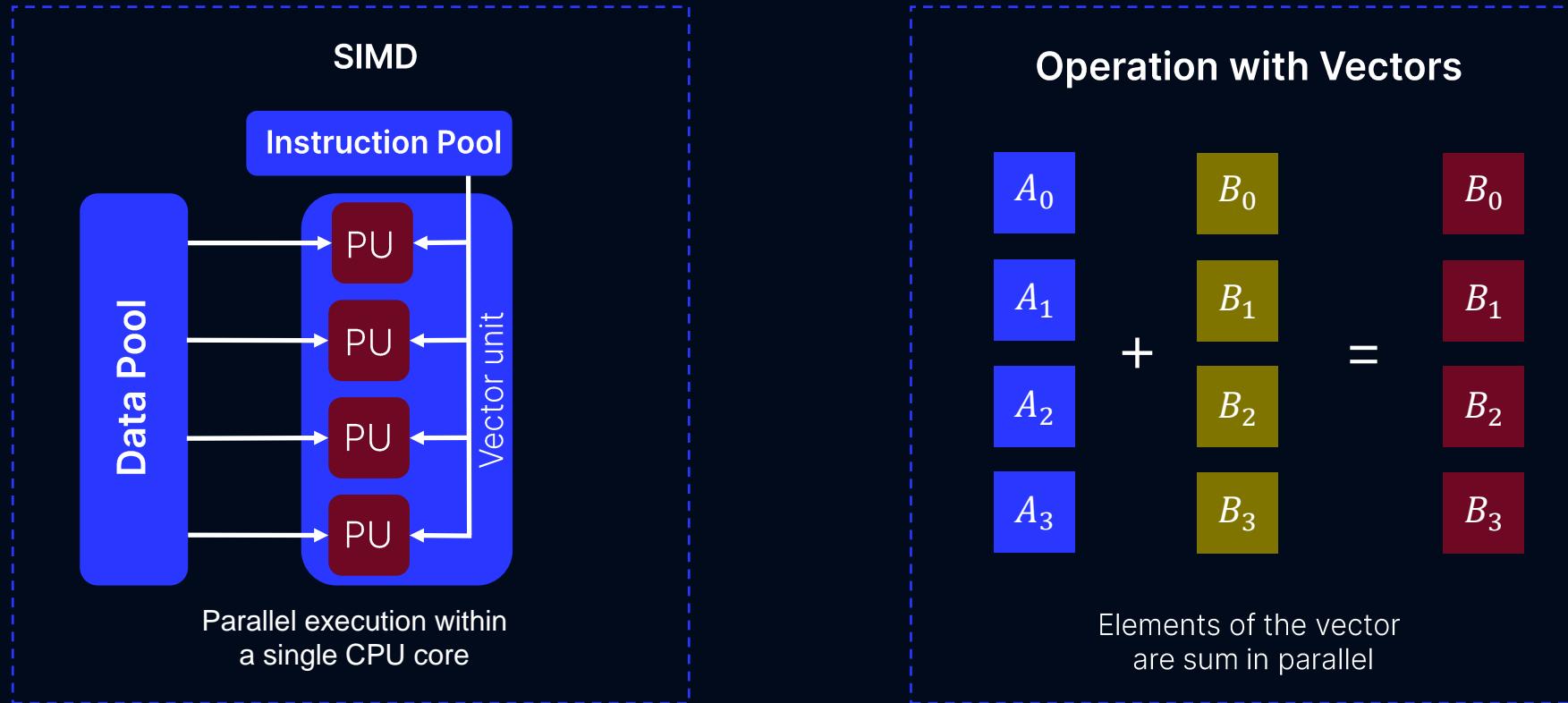


PARALLEL COMPUTING



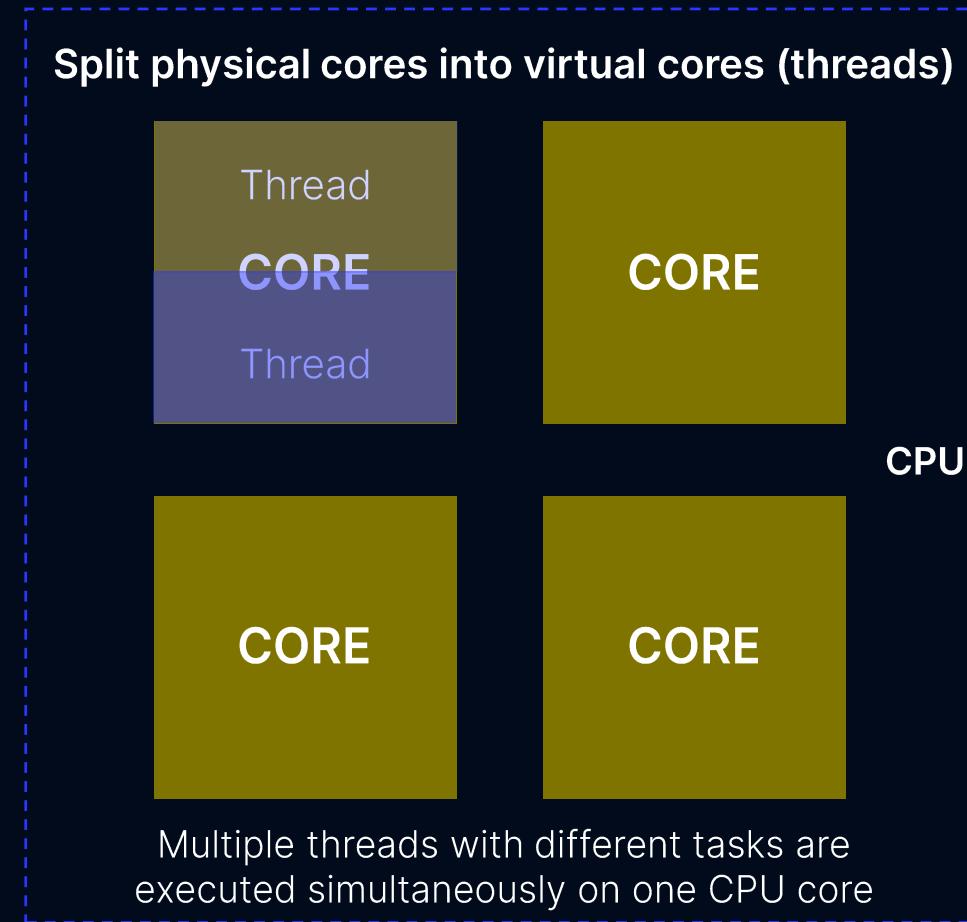
SINGLE INSTRUCTION MULTIPLE DATA (SIMD)

In-core parallelism



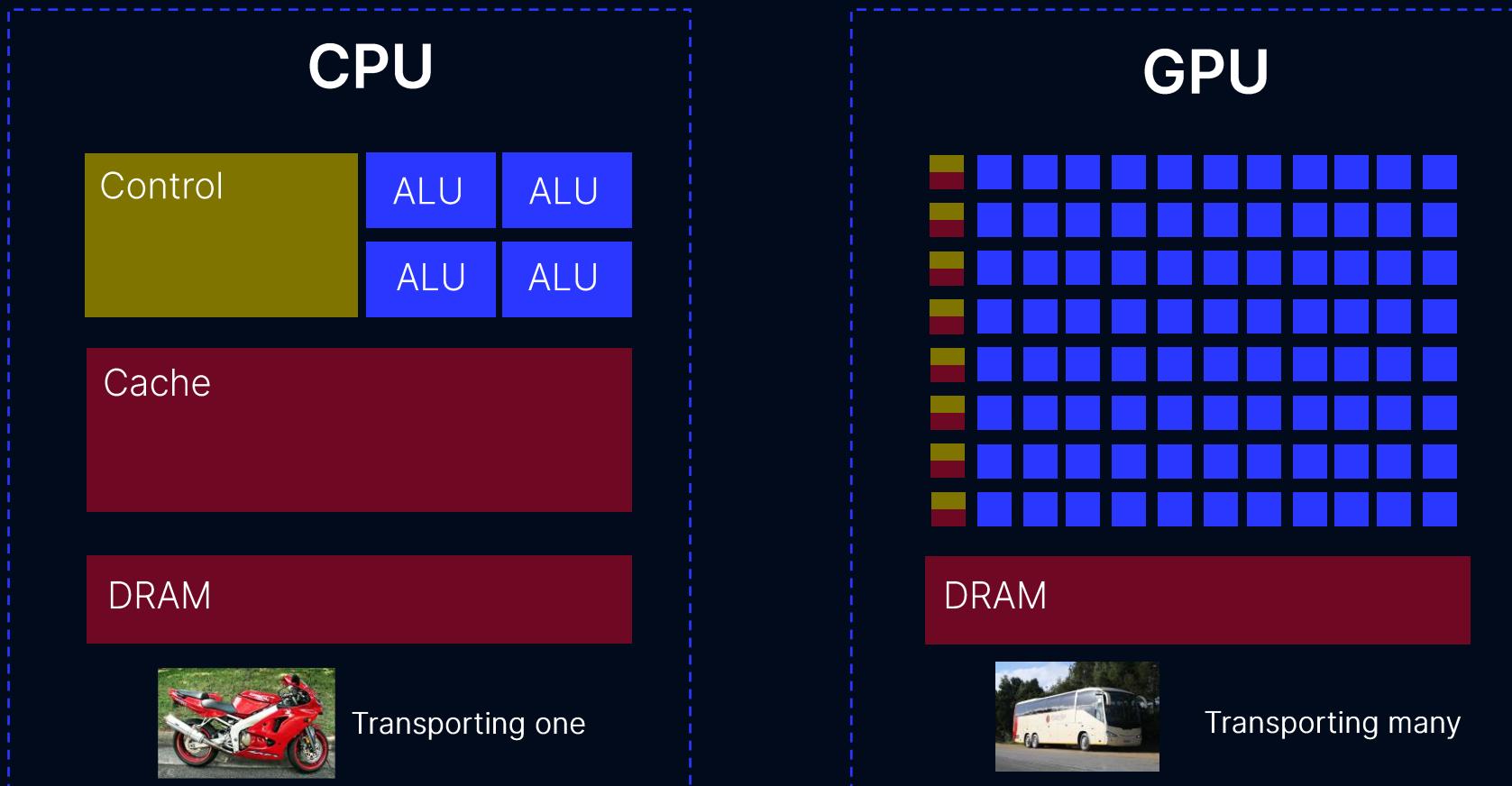
SIMULTANEOUS MULTITHREADING (SMT)

In-core parallelism



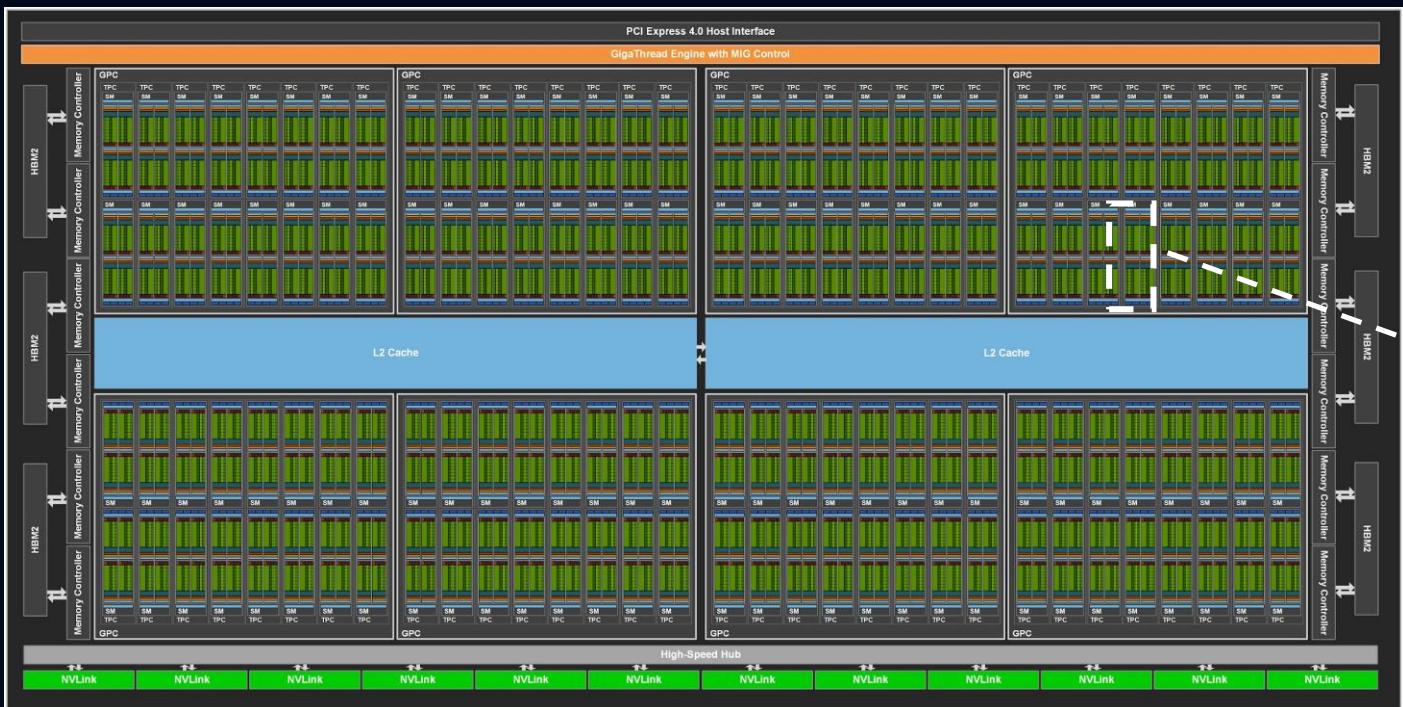
GRAPHICS PROCESSING UNIT (GPU) VS CPU

Made of many simple Cores



NVIDIA AMPERE GPU ARCHITECTURE

Streaming Multiprocessors (SMs)



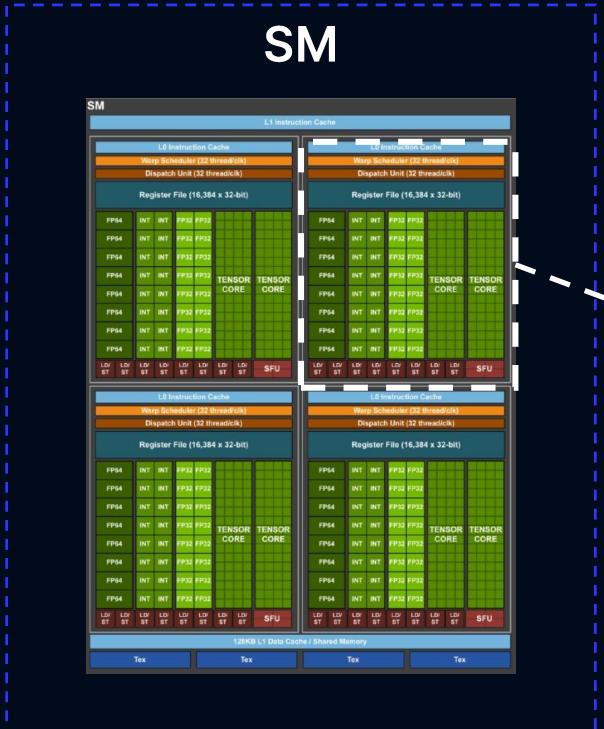
NVIDIA Ampere Architecture
(128 SMs)

$\text{SM} \cong \text{CPU core}$



NVIDIA AMPERE GPU ARCHITECTURE

Streaming Processors (SPs)

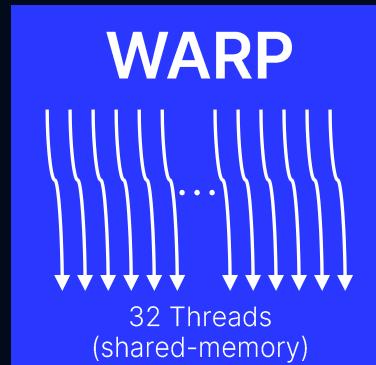
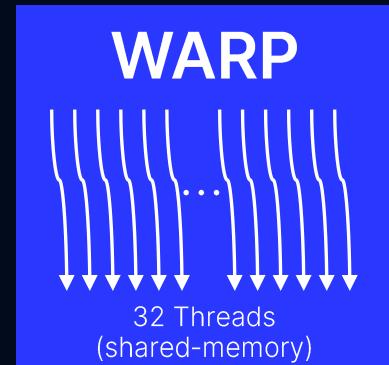
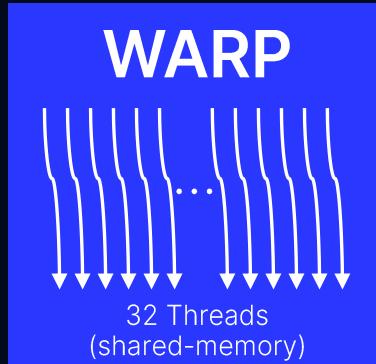
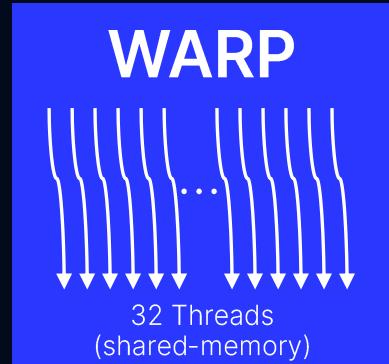


Compute elements:

- 16 32-bit integer point units
- 16 32-bit floating point units
- 8 64-bit floating point units

SINGLE INSTRUCTION MULTIPLE THREADS (SIMT)

In-processor parallelism - SIMT= SIMD + SMT

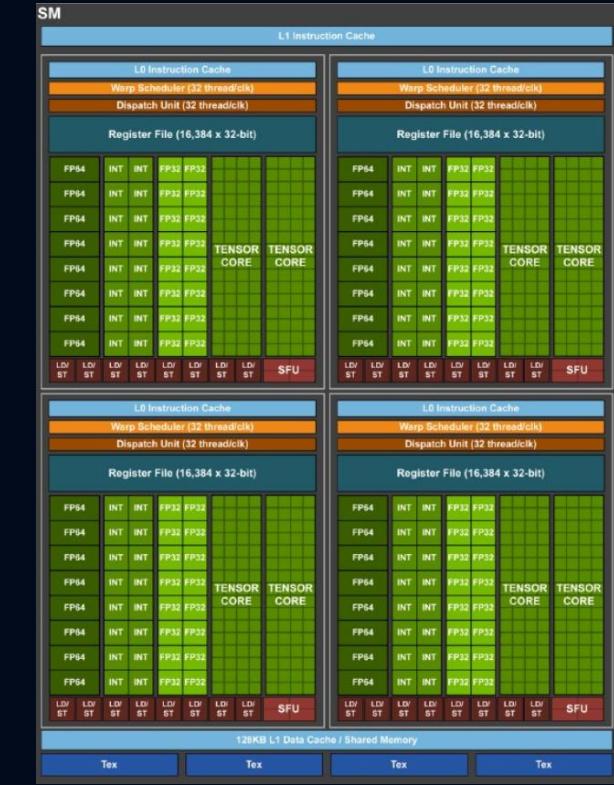


Thread block

The WARPS are executed simultaneously by a SM

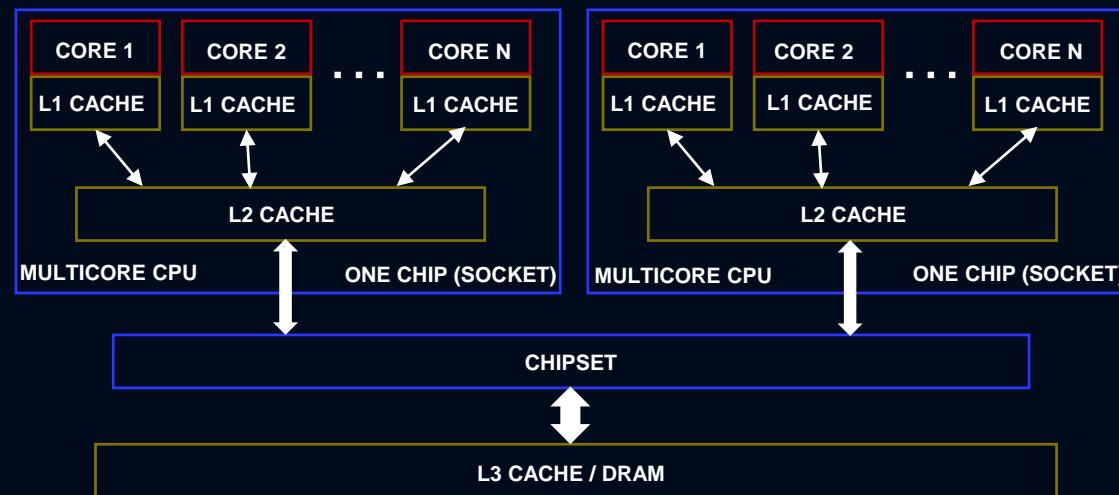
The threads of a WARP execute the same instruction (as SIMD)

Streaming Multiprocessor (SM)



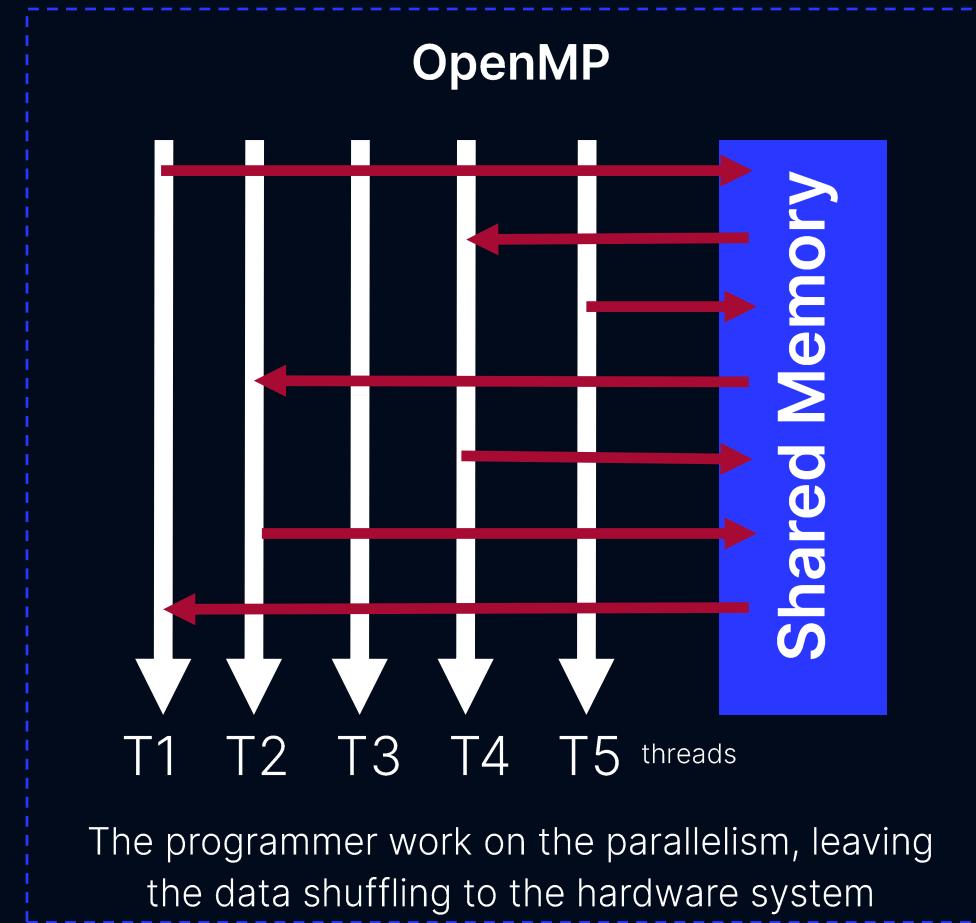
SHARED-MEMORY ARCHITECTURE

Single computer



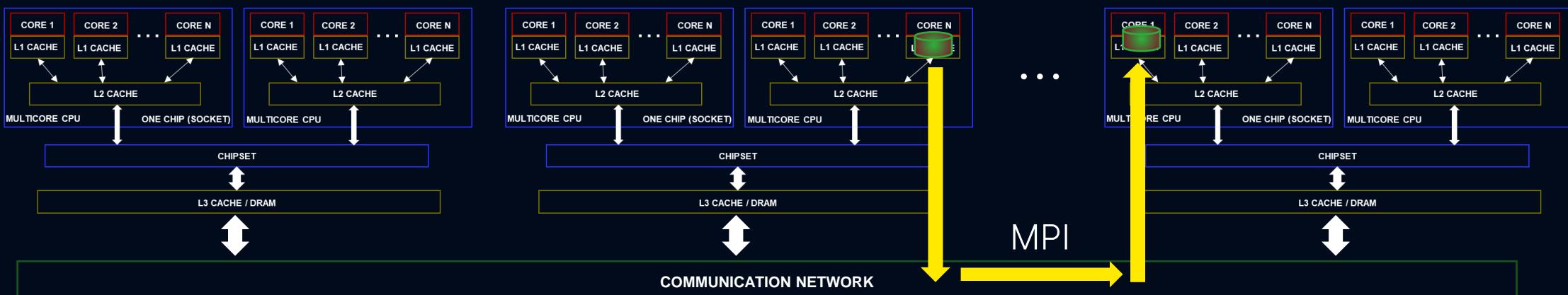
PARALLEL PROGRAMMING MODEL: OPENMP

Single Computer



DISTRIBUTED-MEMORY ARCHITECTURE

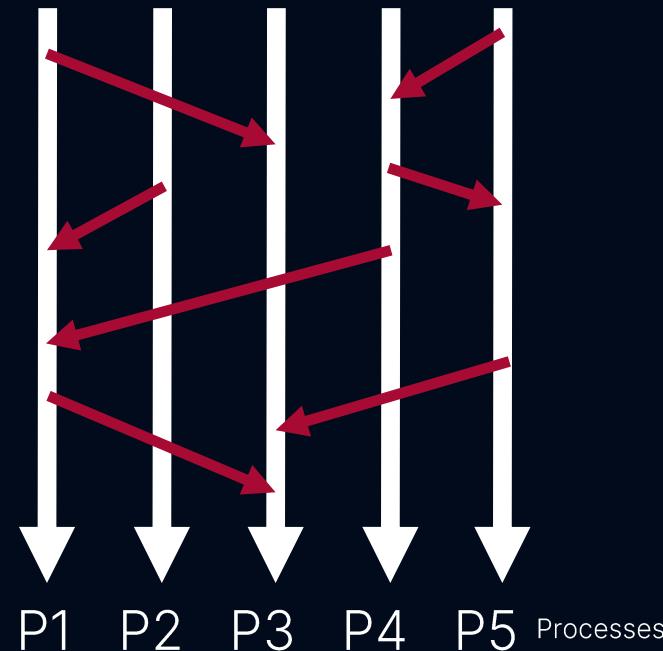
Multiple Computers



PARALLEL PROGRAMMING MODEL: MPI

Multiple Computers

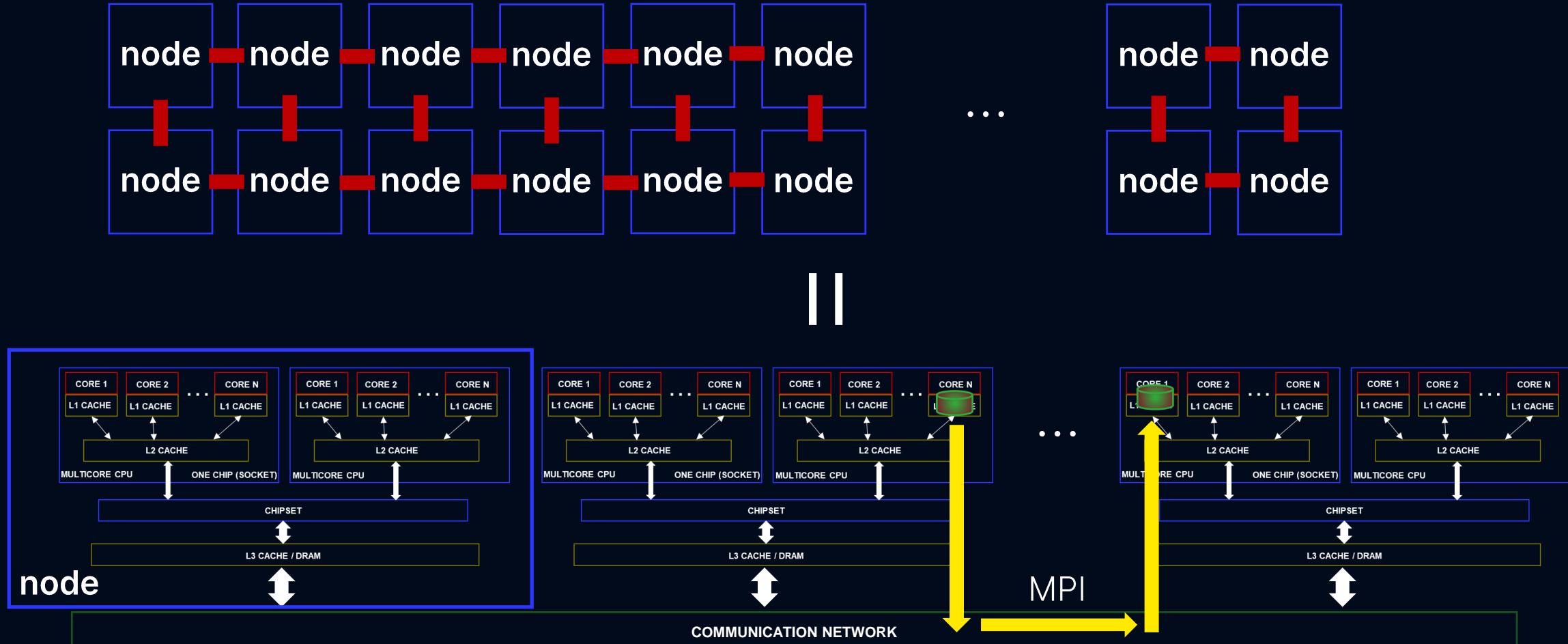
Message Passing Interface (MPI)



Forces the programmer to consider the distribution
of the data as a first-class concern

WHAT IS A SUPERCOMPUTER?

Mixture of shared-memory and distributed-memory architectures



REVIEW ON HARDWARE LEVELS OF PARALLELISM

Best performance is achieved with a combination of them!

SIMD

SIMT

SMT

MPI

MPI+MSA



In-core
parallelism

In-processor
parallelism

Many threads
on many cores

Single Computer

Simultaneous Multithreading
Cross-core, Cross-socket
OpenMP, pthreads

Multiple “Computers”

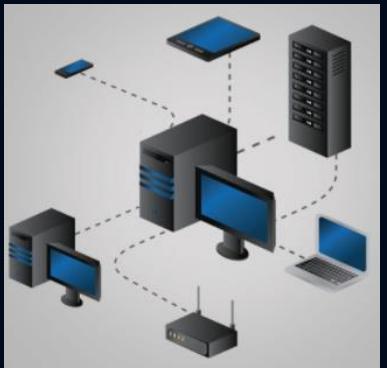
Tightly-coupled
Supercomputing

Multiple HPC Systems

Tightly-coupled
Heterogeneous Hardware

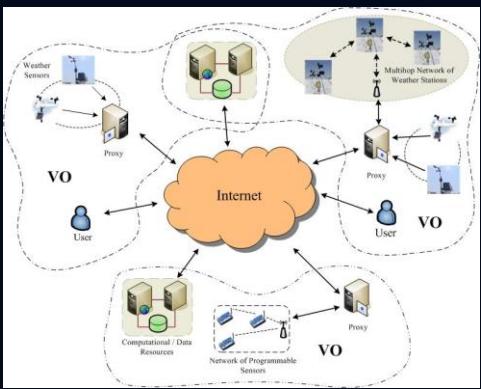
WHAT IS NOT A SUPERCOMPUTER?

Computer cluster



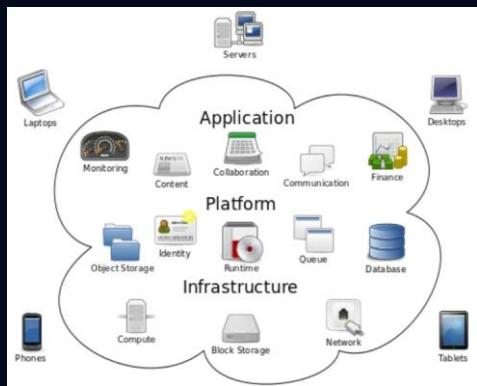
Many computers bound together locally

Grid computing



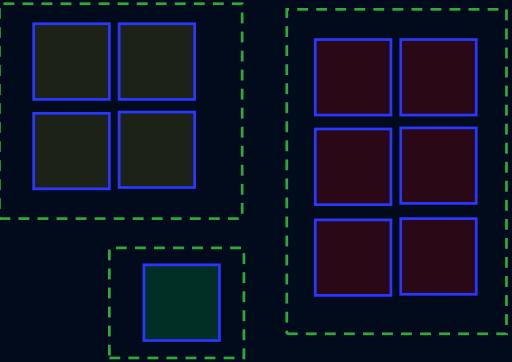
Many clusters working as some kind of supercomputer

Cloud computing



Virtual machines in compute center(s)

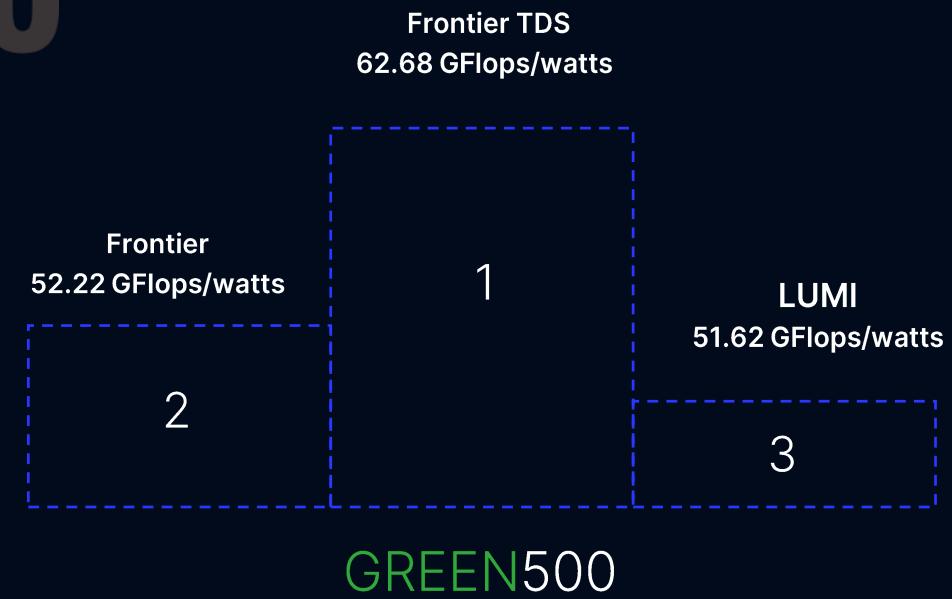
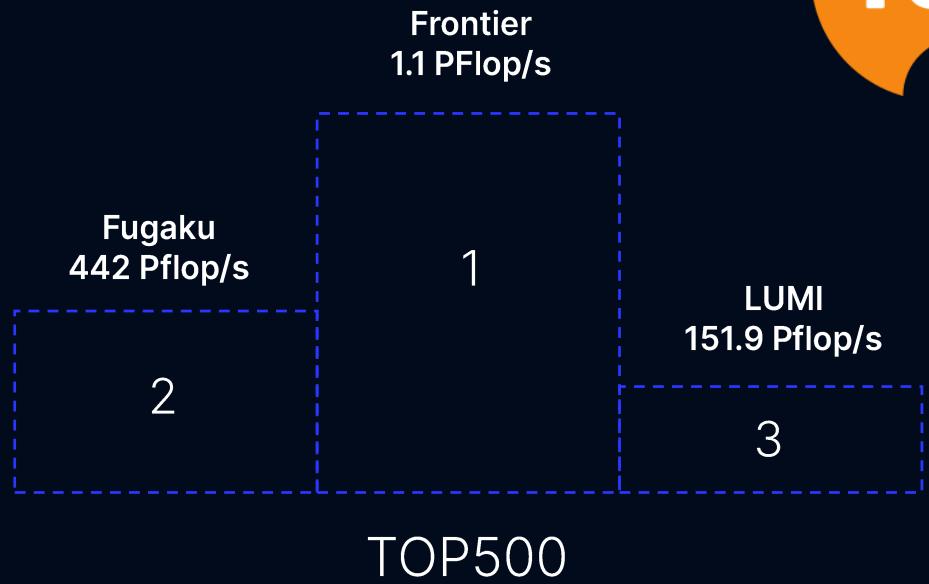
High Throughput Computing



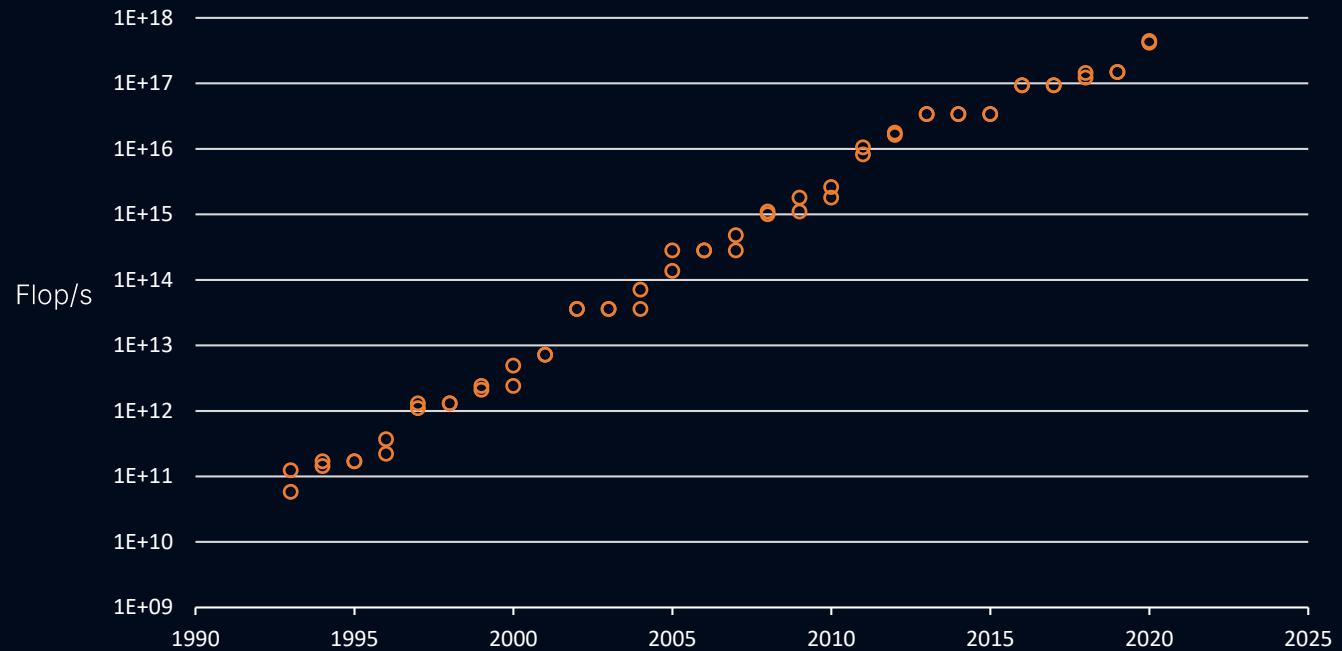
Many independent computations

TOP500 LIST

June 2022



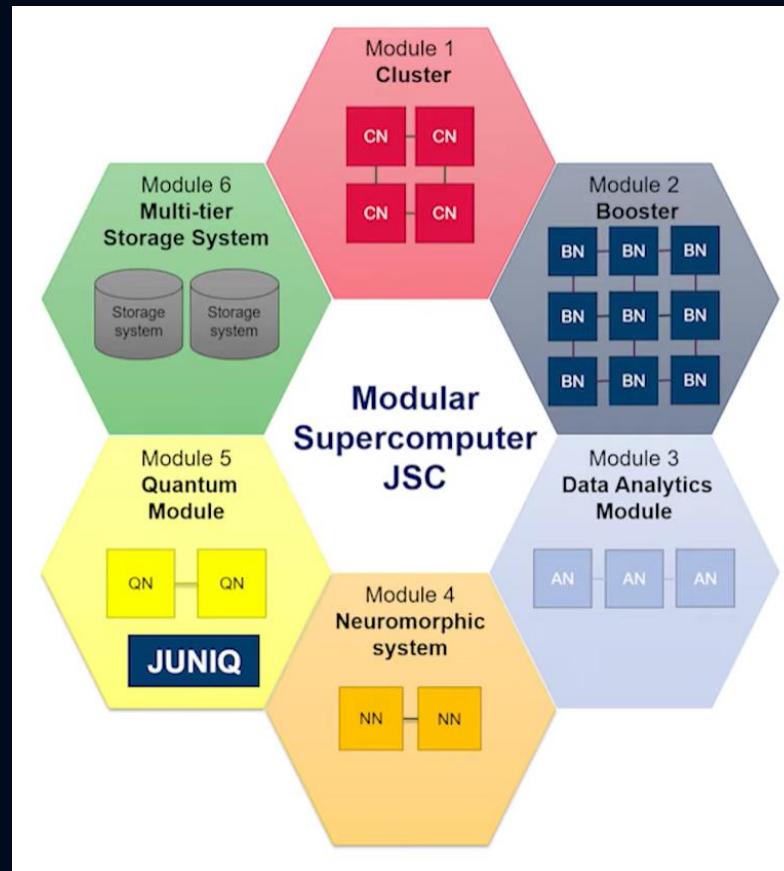
A RACE TOWARD EXASCALE COMPUTING



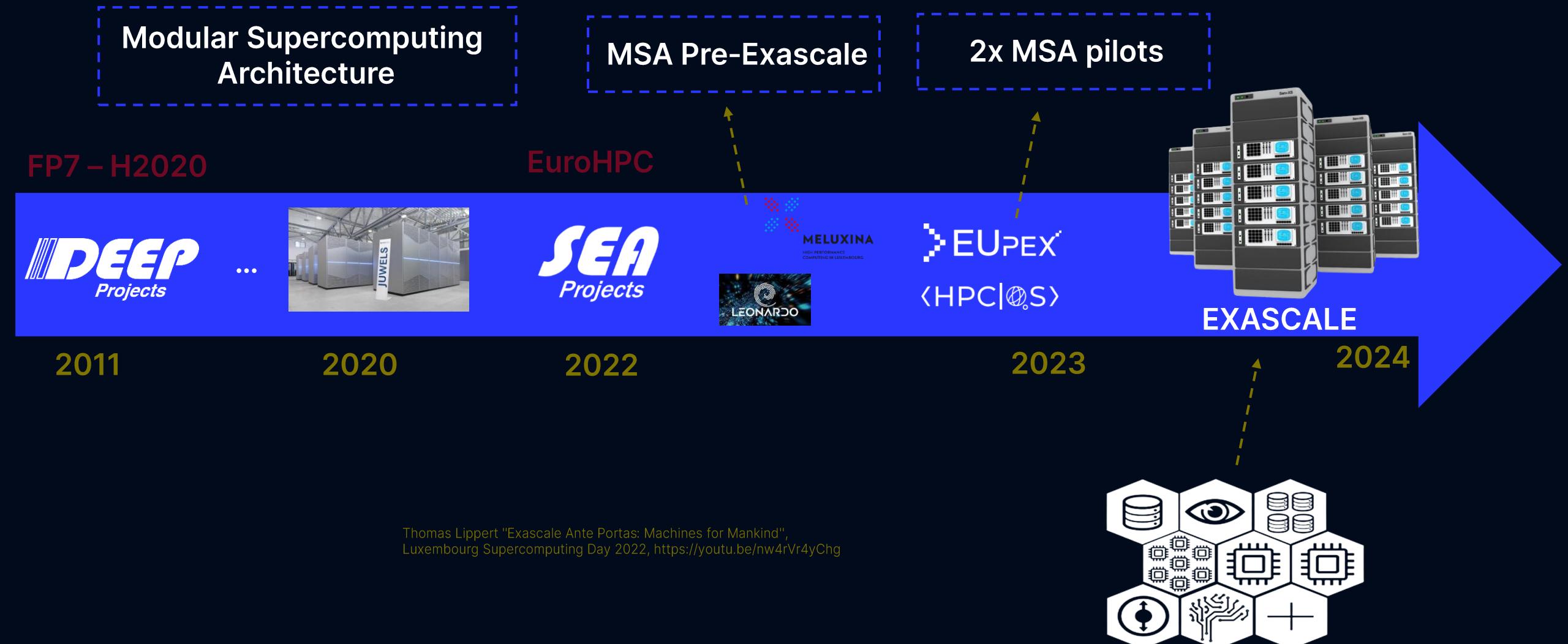
TOP500, Performance Development
<https://www.top500.org/statistics/perfdevel/>

MODULAR SUPERCOMPUTING ARCHITECTURE (MSA)

Heterogeneous HPC clusters (modules) within a single system



PERSPECTIVE AT JSC: THE ROAD TO EXASCALE



EuroHPC Joint Undertaking announces five sites to host new world-class supercomputers

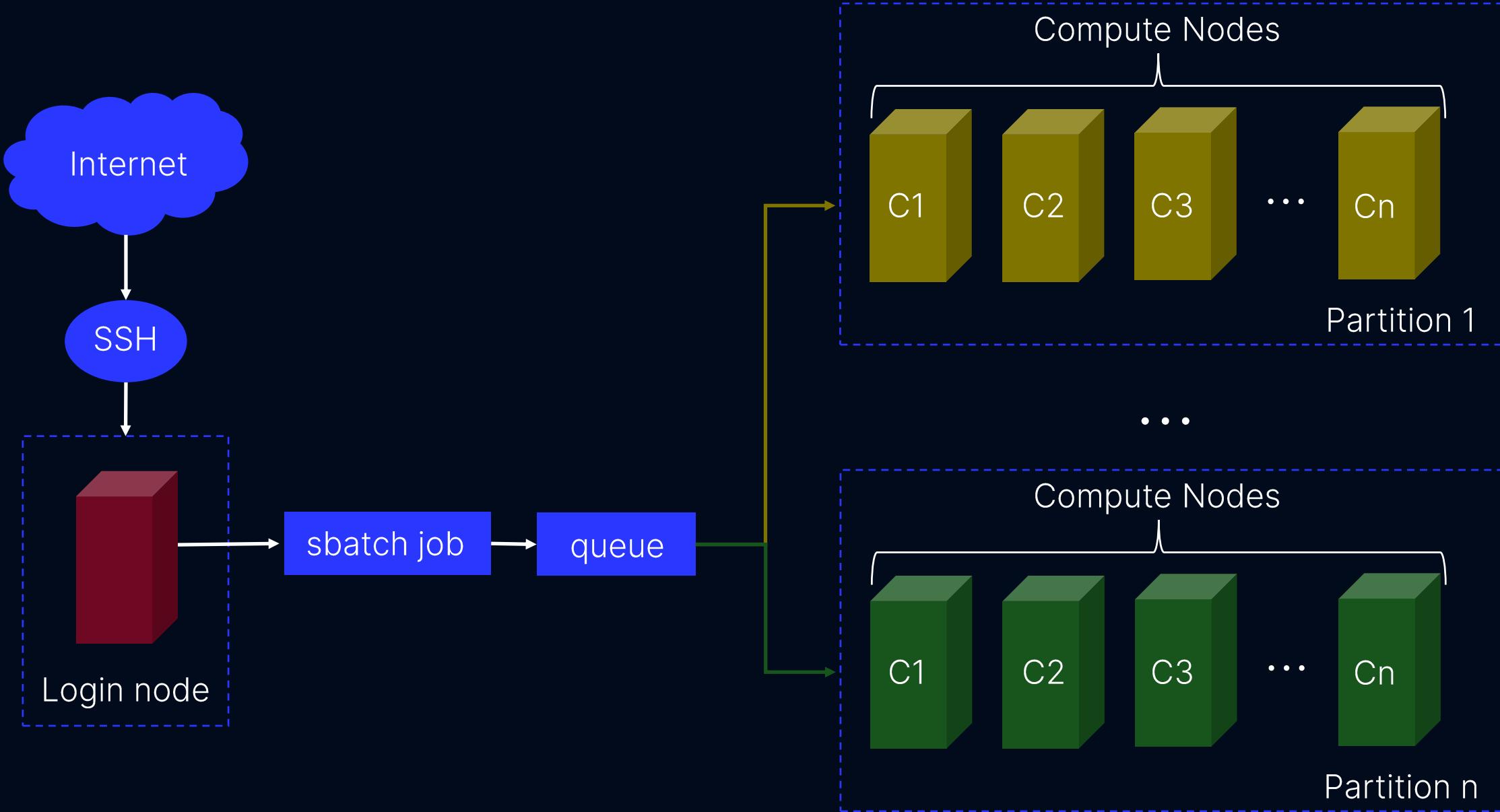
The European High Performance Computing Joint Undertaking (EuroHPC JU) has selected five new sites across the European Union (EU) to host and operate the next generation of EuroHPC supercomputers: Germany, Greece, Hungary, Ireland and Poland.



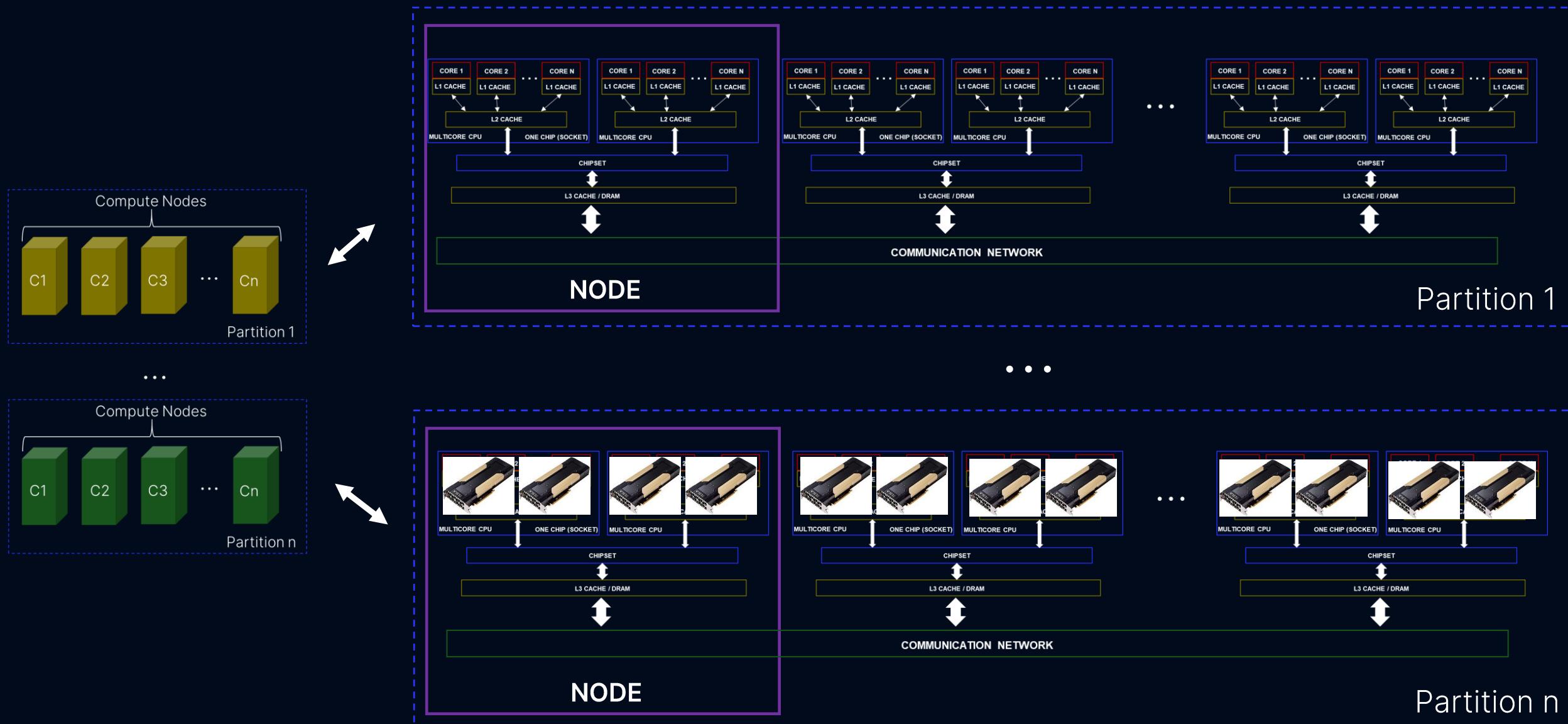
baranozdemir - iStock Getty Images Plus

JUPITER, the first European exascale supercomputer, will be hosted by the [Jülich Supercomputing Centre](#) in Germany. Exascale supercomputers are systems capable of performing more than a billion billion calculations per second and represent a significant milestone for Europe. By supporting the development of high-precision models of complex systems, they will have a major impact on European scientific excellence.

ANATOMY OF A SUPERCOMPUTER



PARTITIONS AND NODES



KEY INFORMATION ABOUT A SUPERCOMPUTER

TYPE OF PARTITIONS

NUMBER OF NODES

PERFORMANCE

ACCELERATORS

RAM

NETWORK:
BANDWIDTH, LATENCY

CPUs, NUMBER OF CORES

...

JÜLICH RESEARCH ON EXASCALE CLUSTER ARCHITECTURES - DATA CENTRIC (JURECA-DC)



- 98,304 CPU cores, 768 GPUs
- 3.54 (CPU) + 14.98 (GPU) Petaflops per second peak performance
- Mellanox InfiniBand HDR (HDR100/HDR) DragonFly+ network
 - Ca. 15 Tb/s connection to Booster via gateway nodes
- 350 GB/s network connection to JUST for storage access

JURECA-DC – CONFIGURATION



576 COMPUTE NODES

2× AMD EPYC 7742, 2× 64 cores, 2.25 GHz

Partition 1

192 ACCELERATED COMPUTE NODES

2× AMD EPYC 7742, 2× 64 cores, 2.25 GHz

4× NVIDIA A100 GPU, 4× 40 GB HBM2e

Partition 2

19 LOGIN NODES

2× AMD EPYC 7742, 2× 64 cores, 2.25 GHz

Partition 3

ACCESS SUPERCOMPUTERS AT JSC

Secure Shell (SSH)



Cryptographic protocol for operating services securely over an unsecured network

Jupyter-JSC



Supercomputing in your Browser

UNICORE



Uniform Interface to Computing Resources

SECURE SHELL (SSH)

Network protocol that gives users and system administrators a secure way to access a computer over an unsecured network



Private key

~/.ssh/id_rsa



Public key

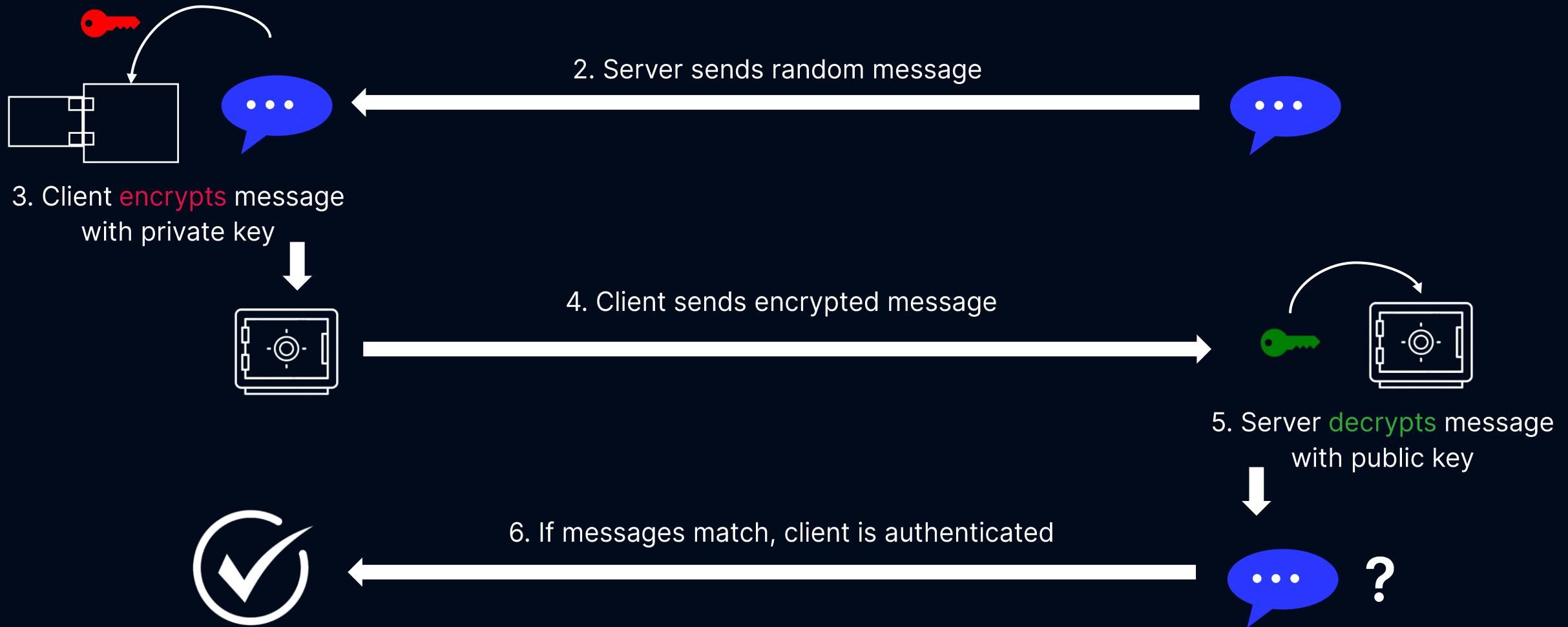
~/.ssh/id_rsa.pub



Public key



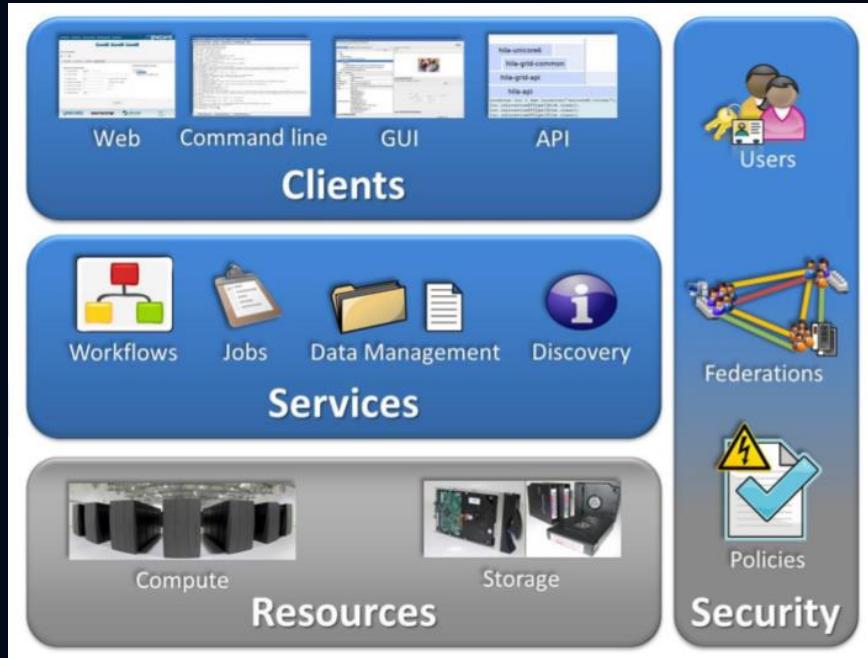
1. Client initiates SSH connection



Different supercomputers can have different resource management system



...



Open Source: <https://github.com/UNICORE-EU>

UNICORE

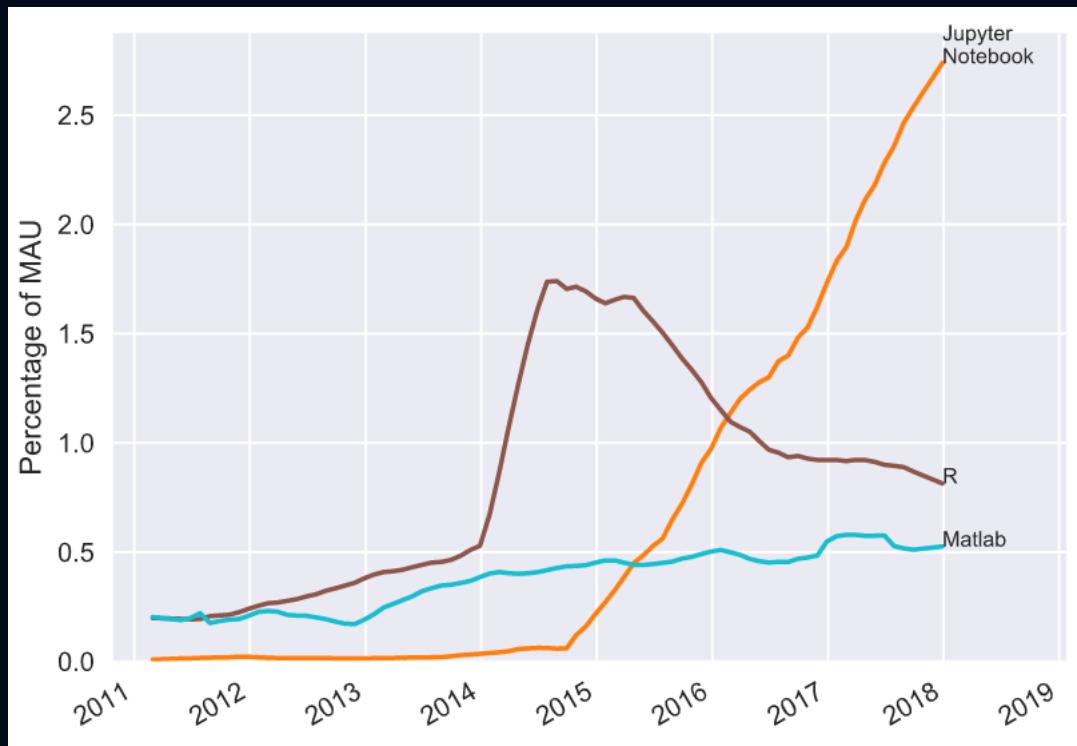
Unify and simplify supercomputer access

Hide system specific commands

Create, submit and monitor jobs access

RISE OF JUPYTER'S POPULARITY

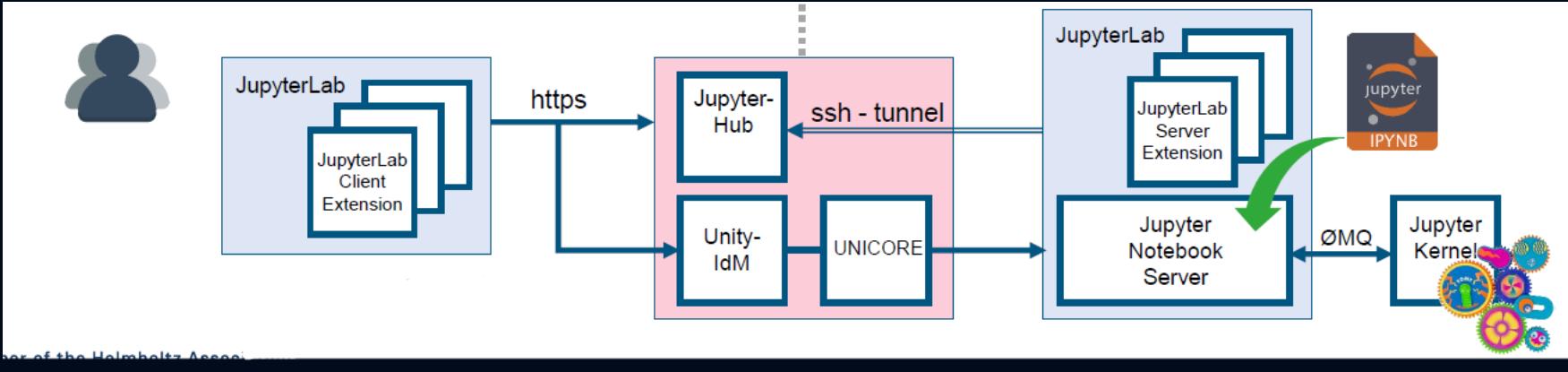
Monthly aggregated number of user interactions with GitHub repos (= Monthly Active Users (MAU))



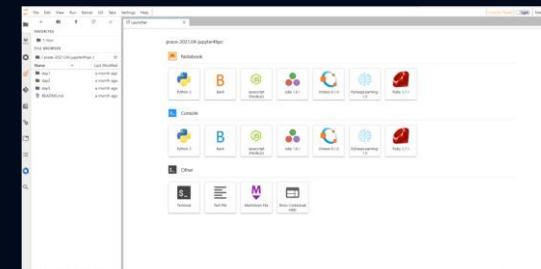
Jupyter Notebooks have seen significant and steady growth over the last years

Python is pushing this trend

JUPYTER-JSC WEB SERVICE



Browser

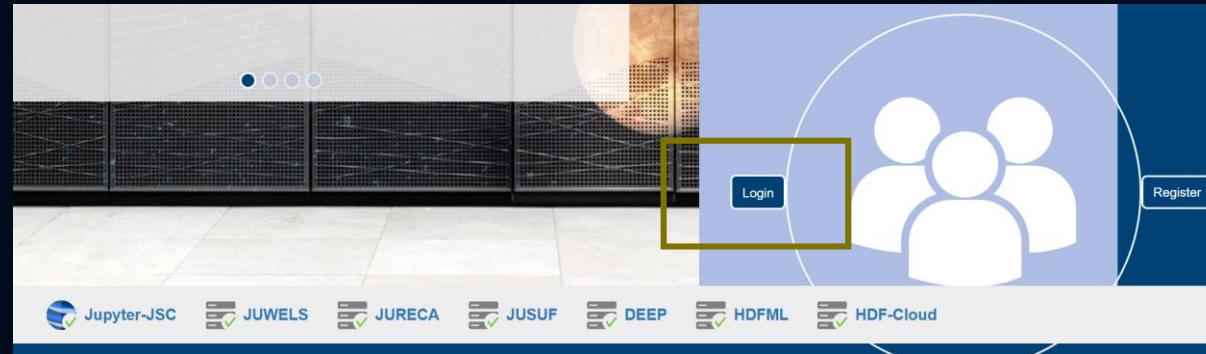


HPC system

ACCESS JUPYTER-JSC

Step 1

- Go to <https://jupyter-jsc.fz-juelich.de/>, login

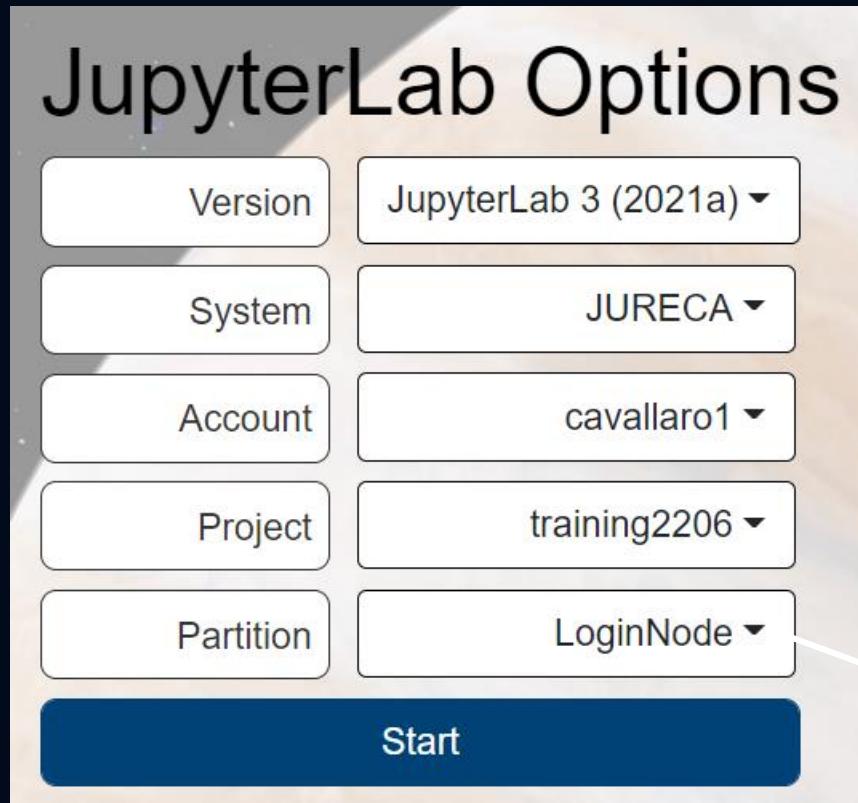


- Add a new JupyterLab

New JupyterLab							
Name	System	Account/Image	Project	Partition	Reservation	Resources	Actions
Test		Add new JupyterLab					

ACCESS LOGIN NODE

Step 2



576 COMPUTE NODES

2× AMD EPYC 7742, 2× 64 cores, 2.25 GHz

Partition 1

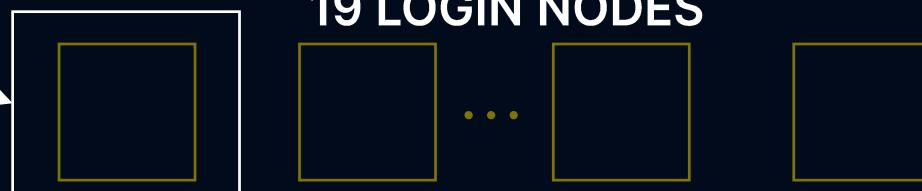
192 ACCELERATED COMPUTE NODES

2× AMD EPYC 7742, 2× 64 cores, 2.25 GHz

4× NVIDIA A100 GPU, 4× 40 GB HBM2e

Partition 2

19 LOGIN NODES

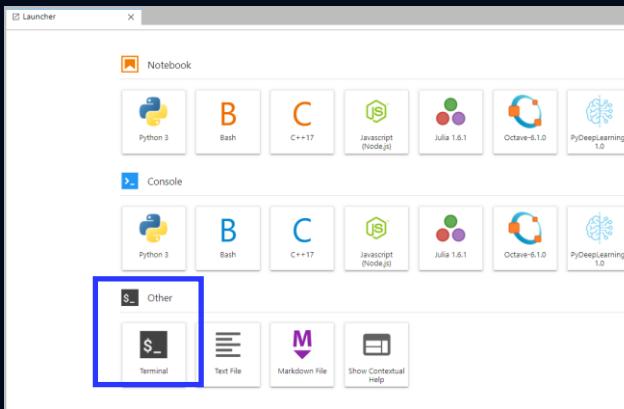


Partition 3

OBTAIN THE PROJECT FOLDER

Step 3

- Open terminal



- Run this command and the tutorial folder training2118 will appear in the navigator on the left

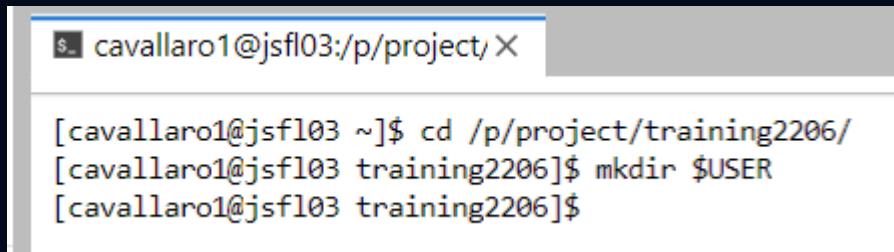
A screenshot of a terminal window. The prompt shows the user is on the desktop (~) of a machine named jsfl03. The command entered is "ln -s /p/project/training2206/".A screenshot of a file explorer window. The top navigation bar includes File, Edit, View, Run, Kernel, and Git. Below the bar is a toolbar with a plus sign, a folder icon, an up arrow, a refresh icon, and a search icon. A search bar says "Filter files by name". The main area shows a list of files and folders. One folder, "training2206", is highlighted with a blue box. The table below lists the contents of the folder:

Name	Last Modified
shared	2 years ago
training2206	3 months ago

CREATE YOUR OWN FOLDER / WORKSPACE

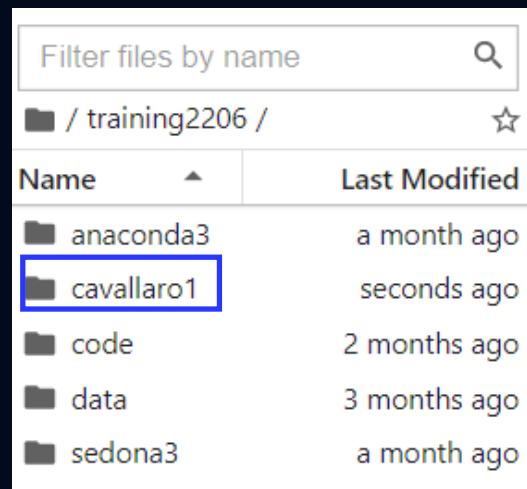
Step 4

- Run the following commands in the terminal to navigate to the tutorial folder “training2206” and create your own folder



```
cavallaro1@jsfl03:/p/project/ X
[cavallaro1@jsfl03 ~]$ cd /p/project/training2206/
[cavallaro1@jsfl03 training2206]$ mkdir $USER
[cavallaro1@jsfl03 training2206]$
```

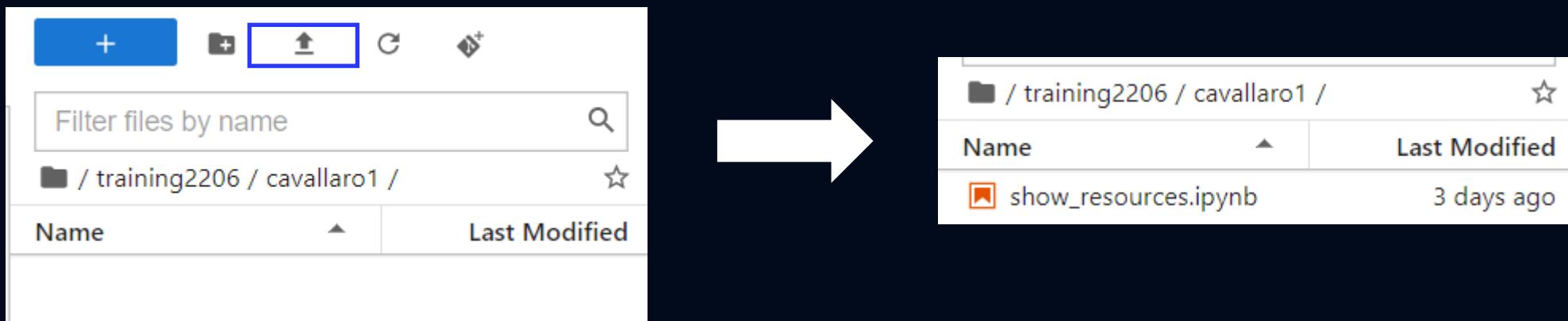
- You can check if the folder was created by looking at the navigator on the left



GET A JUPYTER NOTEBOOK

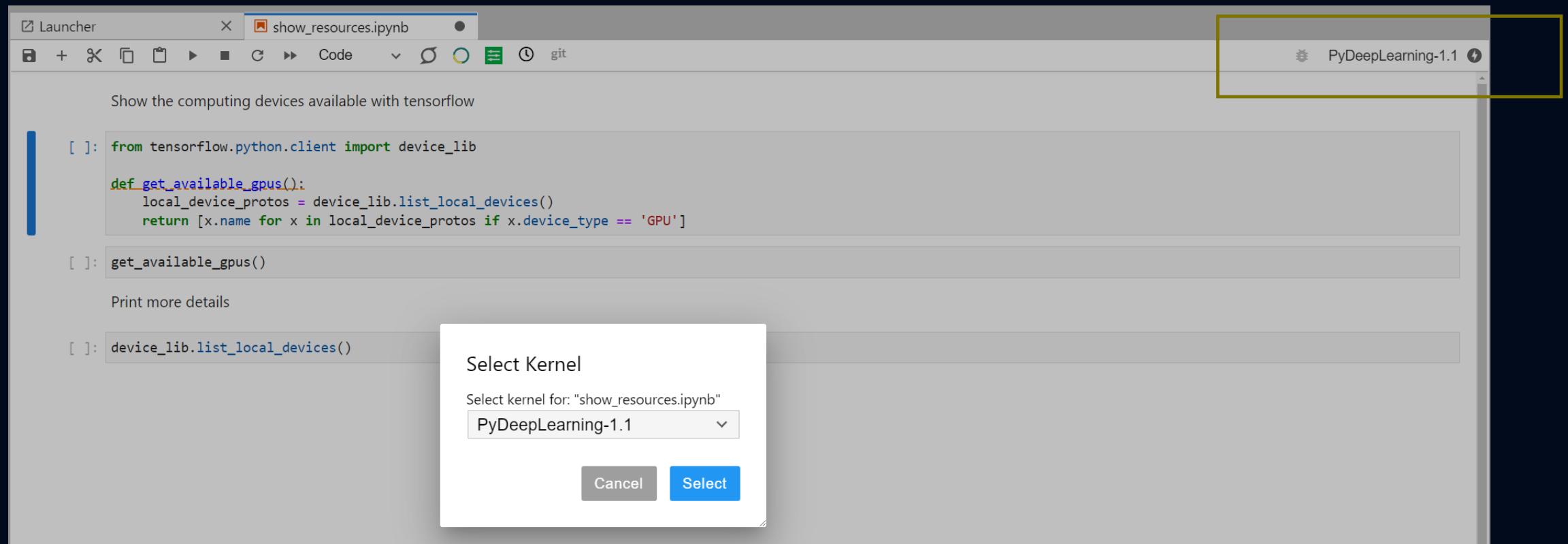
Step 5

- Get the Jupyter notebook “show_resources.ipynb” from the teaching material
 - <https://gitlab.jsc.fz-juelich.de/hedgedoc/s/E1Vtp0TS>
- Upload the Jupyter notebook in your own folder



SELECT THE KERNEL

Step 6



RUN AND CHECK THE COMPUTING RESOURCES

Step 7

Show the computing devices available with tensorflow

```
[1]: from tensorflow.python.client import device_lib

def get_available_gpus():
    local_device_protos = device_lib.list_local_devices()
    return [x.name for x in local_device_protos if x.device_type == 'GPU']

2022-07-09 11:41:25.102199: I tensorflow/stream_executor/platform/default/dso_loader.cc:53] Successfully opened dynamic library libcudart.so.11.0

[2]: get_available_gpus()

2022-07-09 11:41:27.416254: I tensorflow/stream_executor/platform/default/dso_loader.cc:53] Successfully opened dynamic library libcuda.so.1

[2]: []

2022-07-09 11:41:27.838104: E tensorflow/stream_executor/cuda/cuda_driver.cc:328] failed call to cuInit: CUDA_ERROR_NO_DEVICE: no CUDA-capable device is detected
2022-07-09 11:41:27.838170: I tensorflow/stream_executor/cuda/cuda_diagnostics.cc:156] kernel driver does not appear to be running on this host (jsf102.jusuf): /proc/driver/nvidia/version does not exist

Print more details

[3]: device_lib.list_local_devices()

[3]: [name: "/device:CPU:0"
  device_type: "CPU"
  memory_limit: 268435456
  locality {}
  incarnation: 1455075978003438405]
```

ACCESS COMPUTE NODE

Step 8

JupyterLab Options

Version	JupyterLab 3 (2021a) ▾
System	JURECA ▾
Account	cavallaro1 ▾
Project	training2206 ▾
Partition	dc-gpu ▾
Reservation	None ▾
Nodes [1, 24]	1
Runtime (min) [10, 1440]	30
GPUs [1, 4]	4
Show reservation info	
Start	

576 COMPUTE NODES

2× AMD EPYC 7742, 2× 64 cores, 2.25 GHz

Partition 1

192 ACCELERATED COMPUTE NODES



Partition 2

19 LOGIN NODES

2× AMD EPYC 7742, 2× 64 cores, 2.25 GHz

Partition 3

RUN AND CHECK THE COMPUTING RESOURCES

Step 9

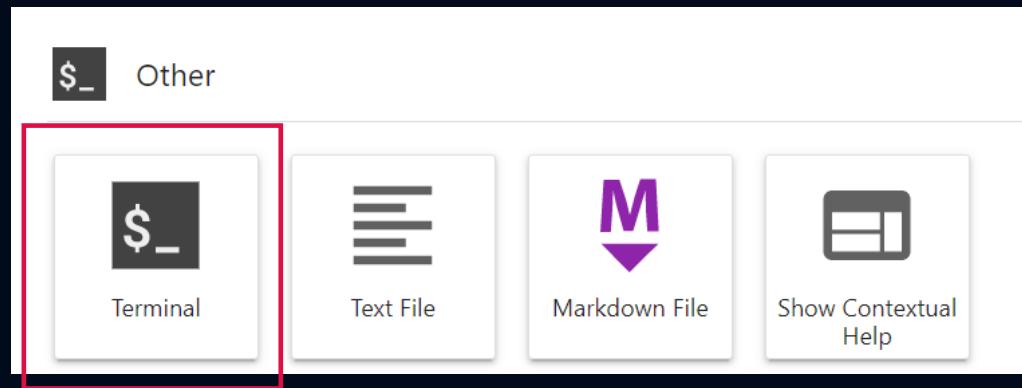
```
[2]: ['/device:GPU:0', '/device:GPU:1', '/device:GPU:2', '/device:GPU:3']
```

```
...
}
}
}
incarnation: 12690219694653453005
physical_device_desc: "device: 0, name: NVIDIA A100-SXM4-40GB, pci bus id: 0000:03:00.0, compute capability: 8.0",
name: "/device:GPU:1"
device_type: "GPU"
memory_limit: 40133197824
locality {
    bus_id: 2
    numa_node: 1
    links {
        link {
            type: "StreamExecutor"
            strength: 1
        }
        link {
            ...
        }
    }
}
```

...

CHECK COMPUTING RESOURCES IN THE TERMINAL

Step 9

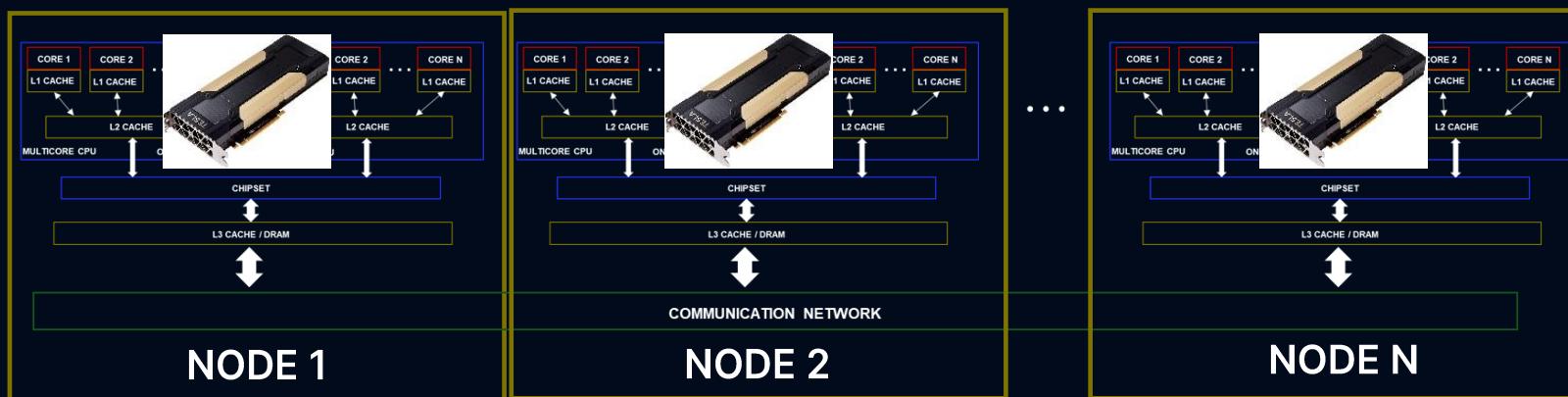


```
(base) [cavallaro1@jrc0197 ~]$ nvidia-smi
Sat Jul 16 14:18:00 2022
+
| NVIDIA-SMI 510.47.03     Driver Version: 510.47.03     CUDA Version: 11.6 |
+-----+-----+-----+-----+-----+-----+-----+-----+
| GPU  Name      Persistence-M | Bus-Id      Disp.A  | Volatile Uncorr. ECC | | |
| Fan  Temp  Perf  Pwr:Usage/Cap | Memory-Usage | GPU-Util  Compute M. |
|          |             |              |              | GPU-Mig M.           |
+-----+-----+-----+-----+-----+-----+-----+-----+
| 0  NVIDIA A100-SXM...  On   | 00000000:03:00.0 Off | 0%      Default      |
| N/A  48C    P0    68W / 400W | 544MiB / 40960MiB |          | Disabled        |
+-----+-----+-----+-----+-----+-----+-----+-----+
| 1  NVIDIA A100-SXM...  On   | 00000000:44:00.0 Off | 0%      Default      |
| N/A  48C    P0    63W / 400W | 544MiB / 40960MiB |          | Disabled        |
+-----+-----+-----+-----+-----+-----+-----+-----+
| 2  NVIDIA A100-SXM...  On   | 00000000:84:00.0 Off | 0%      Default      |
| N/A  46C    P0    62W / 400W | 544MiB / 40960MiB |          | Disabled        |
+-----+-----+-----+-----+-----+-----+-----+-----+
| 3  NVIDIA A100-SXM...  On   | 00000000:C4:00.0 Off | 0%      Default      |
| N/A  48C    P0    64W / 400W | 544MiB / 40960MiB |          | Disabled        |
+-----+-----+-----+-----+-----+-----+-----+-----+
+
Processes:
+-----+-----+-----+-----+-----+-----+-----+
| GPU  GI  CI      PID  Type  Process name        GPU Memory |
| ID   ID              |          |          |          | Usage          |
+-----+-----+-----+-----+-----+-----+-----+
| 0    N/A N/A    6188    C  python            541MiB |
| 1    N/A N/A    6188    C  python            541MiB |
| 2    N/A N/A    6188    C  python            541MiB |
| 3    N/A N/A    6188    C  python            541MiB |
+-----+-----+-----+-----+-----+-----+-----+
(base) [cavallaro1@jrc0197 ~]$ []
```

THIS AFTERNOON

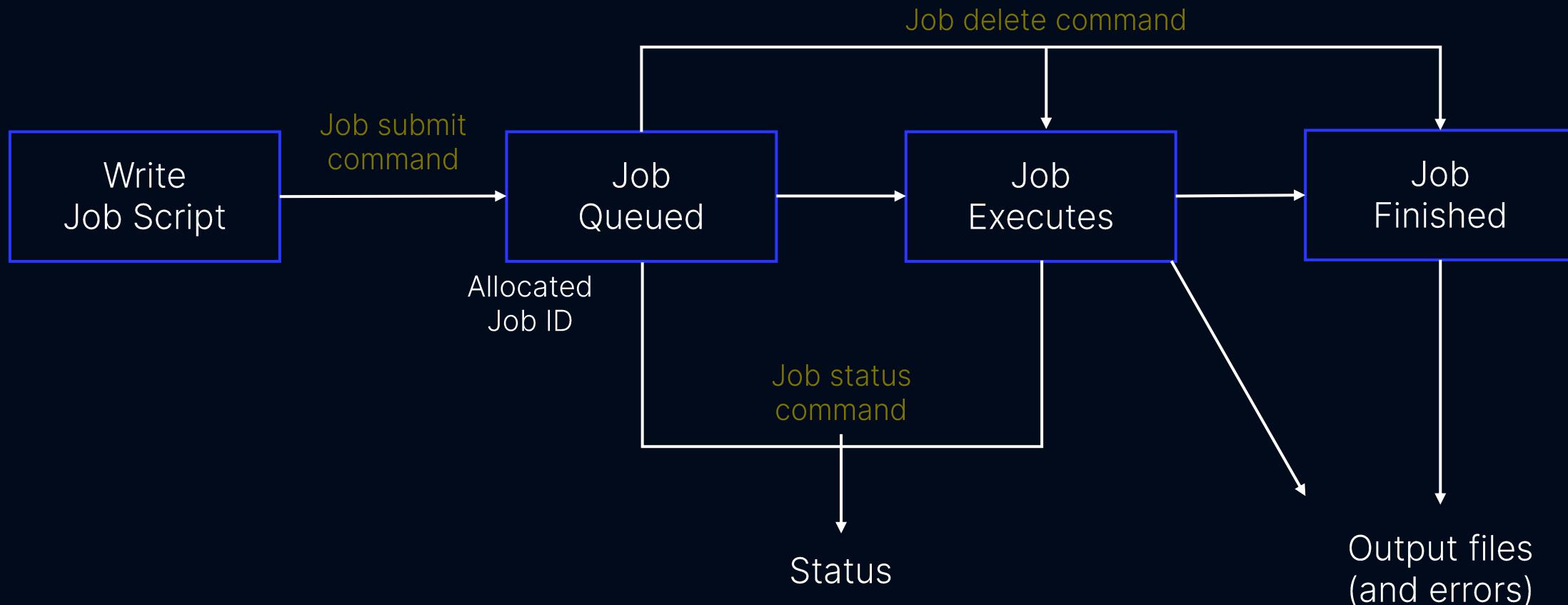
Hands-on - Distributed Deep Learning

- Workflow on the batch system
- Use job scripts to execute algorithms with more nodes (i.e., > 1 GPUs)

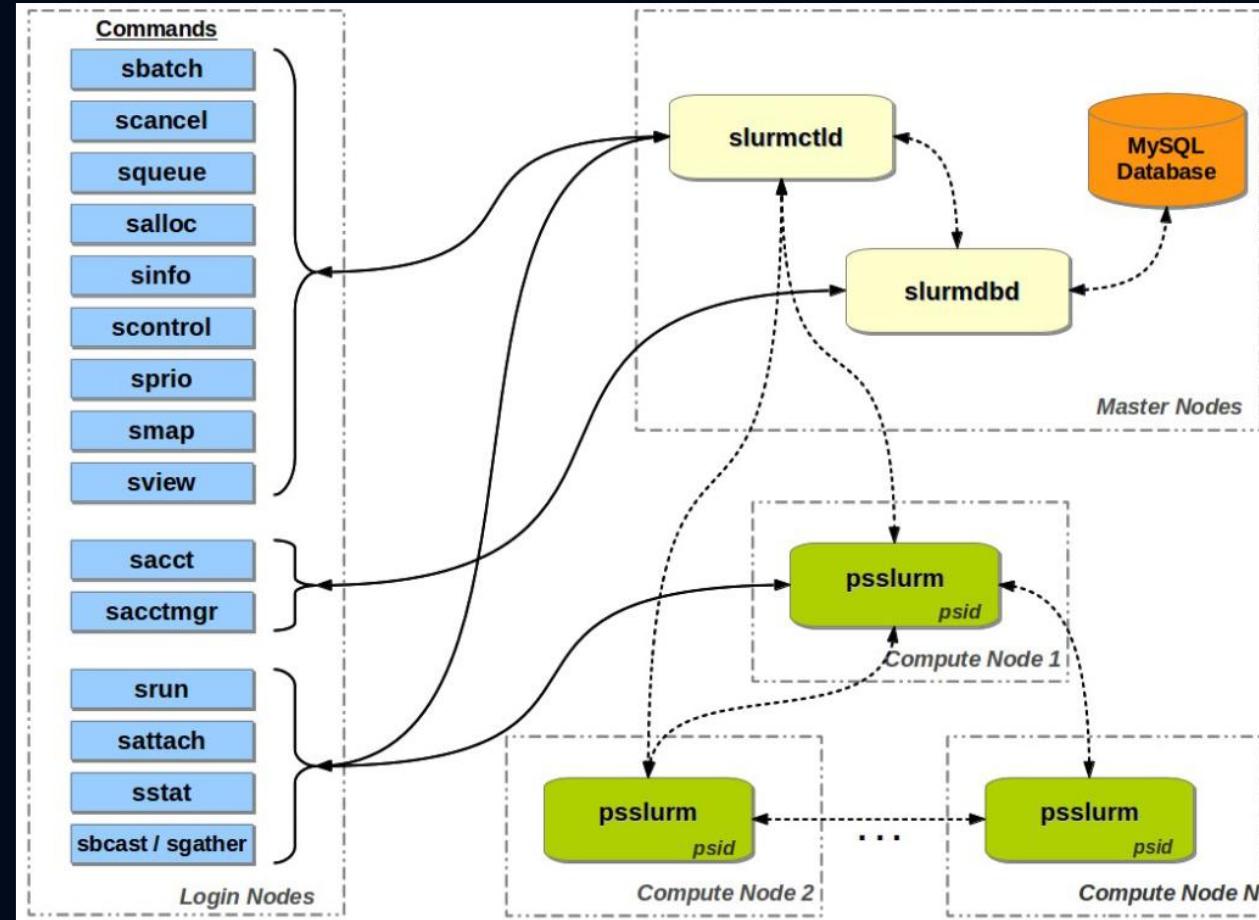


USING THE SUPERCOMPUTER MEANS SUBMITTING A JOB TO A BATCH SYSTEM

Job scheduling according to priorities. The jobs with the highest priorities will be scheduled next.



THE SLURM BATCH SYSTEM



NO NODE-SHARING



SUPERCOMPUTER USAGE MODEL AT JSC

Additional information

- Compute time allocation is based on compute projects. For every compute job, a compute project pays.
- Data projects allocate large amounts of storage, but no compute.
- To enable fair share, only relatively short job runs (24h) are allowed.
 - Please implement check pointing (or make your code fast enough).
- Solution for long-running tasks: Job arrays.

More information

<https://cstao-public.pages.jsc.fz-juelich.de/JSCHandsOn/>

MODULE SYSTEM: SOFTWARE

All kind of software is already installed in modules.

Compiler/GCCcore/9.3.0		
AOCC/2.3.0	JupyterKernel-Ruby/2.7.1-2020.2.6	git/2.28.0
Autotools/20200321	JupyterProxy-Matlab/0.1.0-2020.2.6	gnuplot/5.2.8
Bazel/3.4.1	JupyterProxy-XpraHTML5/0.3.0-	h5py/2.10.0-serial-Python-3.8.5
Bazel/3.6.0	2020.2.6	hwloc/2.2.0
Boost.Python/1.74.0-nompi	LLVM/10.0.1	jemalloc/5.2.1
Boost/1.74.0-nompi	METIS/5.1.0-IDX64	libvpx/1.9.0
CFITSIO/3.490	MPFR/4.1.0	likwid/5.0.2
CMake/3.18.0	Mercurial/5.5.2-Python-3.8.5	likwid/5.1.0
CVS/1.11.23	Meson/0.55.0-Python-3.8.5	magma/2.5.4
Cirq/0.9.1-Python-3.8.5	NCCL/2.8.3-1-CUDA-11.0	meld/3.21.0-Python-3.8.5
Clang/11.0.0	NSPR/4.25	memkind/1.10.1
Cling/0.7	NSS/3.51	nano/5.5
Cling/0.9	Ninja/1.10.0	netCDF-C++4/4.3.1-serial
CubeGUI/4.5	Nsight-Compute/2020.1.2	netCDF-Fortran/4.5.3-serial
CubeGUI/4.6	Nsight-Compute/2020.2.0	netCDF/4.7.4-serial
CubeLib/4.5	Nsight-Compute/2020.3.0	netcdf4-python/1.5.4-serial-Python-3.8.5
CubeLib/4.6	Nsight-Systems/2020.3.1	numba/0.51.1-Python-3.8.5
DWave/3.2.0-Python-3.8.5	Nsight-Systems/2020.4.1	parallel/20201122
Doxygen/1.8.18	Nsight-Systems/2020.5.1	pyproj/2.6.1.post1-Python-3.8.5
Eigen/3.3.7	Nsight-Systems/2021.1.1	qccint/3.0.19
Emacs/27.1	Octave/6.1.0-nompi	re2c/1.3
FriBidi/1.0.9	OpenAI-Gym/0.18.0-Python-3.8.5	
GDB/10.1	OpenCV/4.5.0-Python-3.8.5	
GEOS/3.8.1-Python-3.8.5	OpenEXR/2.5.2	

MODULE SYSTEM: COMMANDS

module avail

module purge # unload everything

module load

module spider

module spider nano

```
[kesselheim1@jwlogin07 ~]$ module spider nano
```

nano: nano/5.5

Description:

GNU nano is a small and friendly text editor. Besides basic text editing, nano offers features like undo/redo, syntax coloring, interactive search-and-replace, auto-indentation, line numbers, word completion, file locking, backup files, and internationalization support.

module load nano

module avail

```
Advisor/2020_update3
Autotools/20200321
Autotools/20200321
Bazel/3.6.0
Blender/2.90.1-binary
CFITSIO/3.490
CMake/3.18.0
CUDA/11.0
CVS/1.11.23
Cling/0.7
CubeGUI/4.5
Doxygen/1.8.18
EasyBuild/4.2.1
EasyBuild/4.2.2
EasyBuild/4.3.0
Eigen/3.3.7
Emacs/27.1
FriBidi/1.0.9
GDB/10.1
```

```
- Core packages
  Python/3.8.5
  R/4.0.2-nompi
  Ruby/2.7.1
  Rust/1.47.0
  SciPy-Stack/2020-Python-3.8.5
  Shapely/1.7.1-Python-3.8.5
  Singularity-Tools/2020-Python-3.8.5
  StdEnv/2020
  Subversion/1.14.0
  Tcl/8.6.10
  TensorFlow/2.3.1-Python-3.8.5
  TotalView/2020.1.13
  UCX/1.8.1
  UCX/1.9.0
  VTune/2019_update8
  Vampir/9.9.0
  VirtualGL/2.6.4
  Voro++/0.4.6
  X11/20200222
```

(L)

JUST - JÜLICH STORAGE CLUSTER



- 52 PB total storage
- \$HOME: Minimal, only small files
- \$SCRATCH: 9 PB, Working storage, deleted after 90 days
- \$DATA: 14 PB, Large scale file storage, not available from compute nodes
- \$FASTDATA: 9 PB, Large scale file storage that must be continuously accessed
- \$PROJECT: 2.3 PB, Project data
- Peak bandwidth up to 400 GB/sec
- Data is shared among all supercomputers

Thank you for your attention