



Introduction to GPU Accelerated Computing

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中国科学院国家天文台

National Astronomical Observatories, CAS

Picture: Xishuangbanna,
Yunnan, China by R.Sp.



北京大学
PEKING UNIVERSITY



Introduction to GPU Accelerated Computing

Feb. 12-16, 2024

Table of Contents (subject to adjustment/change):

1. Monday morning: General Introduction Computer Architecture, Many-Core, GPU and others..., Access...
2. Monday afternoon: Access to kepler, CUDA Hello, GPU Properties, Simple Add, Vector Add
3. Tuesday morning: More on GPU Software and Hardware
4. Tuesday afternoon: CUDA More Vector Add, Scalar Products, Using Blocks and Threads
5. Wednesday morning: Parallelization and Amdahl's Law, GPU Acceleration, Future Architecture
6. Wednesday Afternoon: Events, Histograms, Matrix Multiplication
7. Thursday Morning: Astrophysical N-Body Code
8. Thursday Afternoon: Astrophysical Parallel N-Body Code Using MPI and GPU
9. Friday Morning: Continue Histograms, Wrap-Up, Q+A, Other Lectures (Wen-Mei Hwu)



Observations (Experiment)



Theory



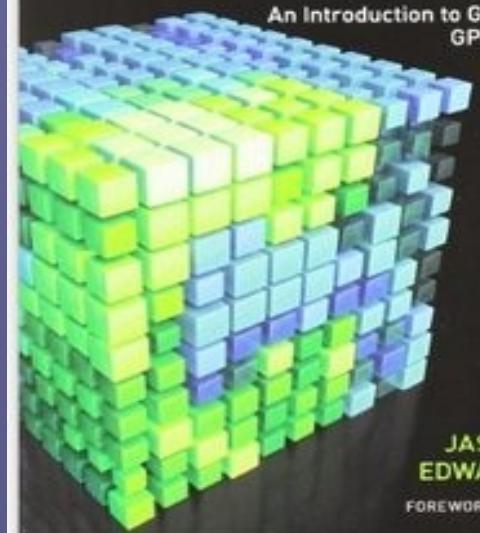
Computational Physics





CUDA BY EXAMPLE

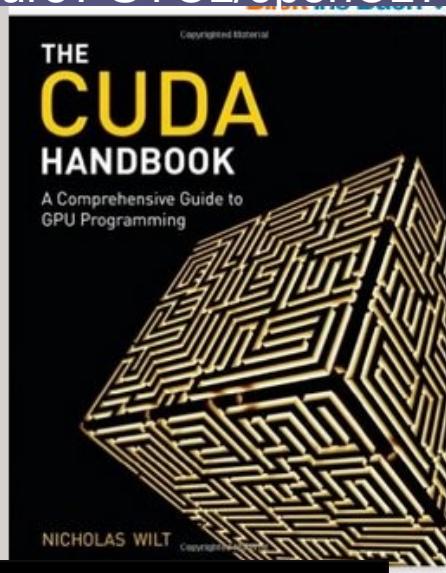
An Introduction to General-Purpose GPU Programming



JASON SANDERS
EDWARD KANDROT

FOREWORD BY JACK DONGARRA

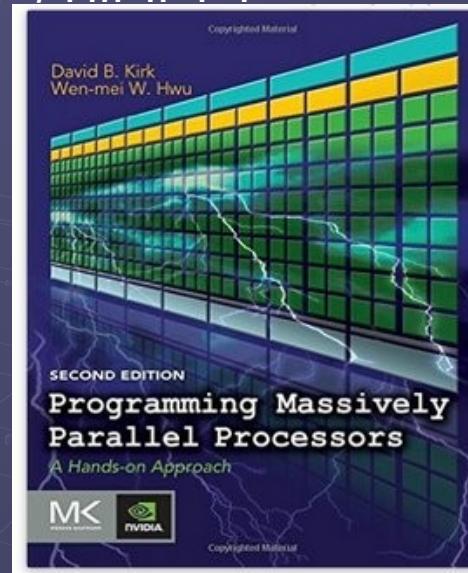
Literature: why NVIDIA? CUDA ... ?
easy to learn!! runs on our training system kepler
future? SYCL/openCL? HIP / HIPIFY ?



THE CUDA HANDBOOK

A Comprehensive Guide to
GPU Programming

NICHOLAS WILT



David B. Kirk
Wen-mei W. Hwu

SECOND EDITION Programming Massively Parallel Processors

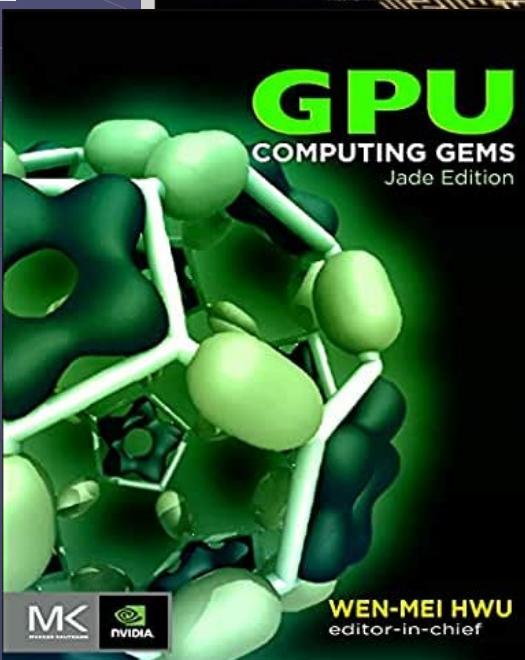
A Hands-on Approach



GPU Gems 3



Edited by Hubert Nguyen
Foreword by Kurt Akeley, Microsoft Research

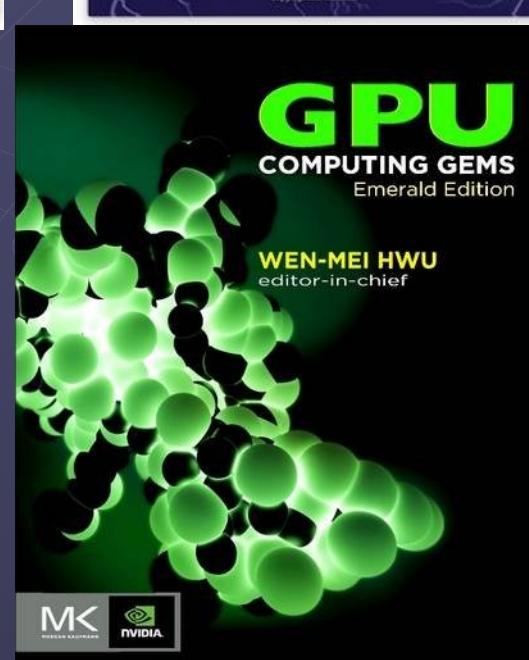


GPU COMPUTING GEMS

Jade Edition



WEN-MEI HWU
editor-in-chief



GPU COMPUTING GEMS

Emerald Edition

WEN-MEI HWU
editor-in-chief



GPU Computing

History

History

Erik Holmberg (1908-2000)

Dissertation Univ. Lund (Schweden) (1937):

“A study of double and multiple galaxies”

Galaxies often in Groups and Pairs

Irregular Distribution of Satellite Galaxies
(Holmberg-Effect)

Father of numerical astrophysics?

» ...with 200 light bulbs





History

<http://cdsads.u-strasbg.fr/abs/1941ApJ....94..385H>

The Astrophysical Journal, Nov. 1941

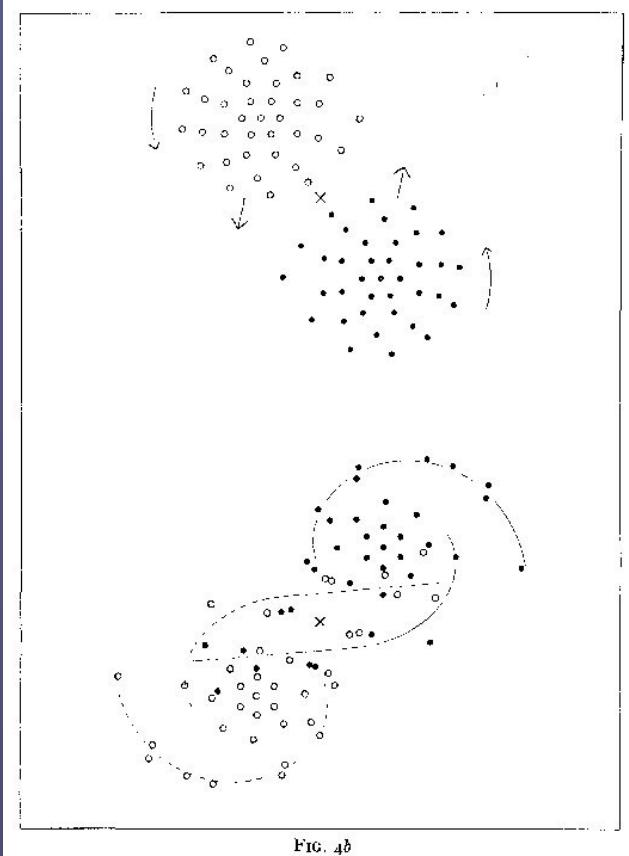


FIG. 4b

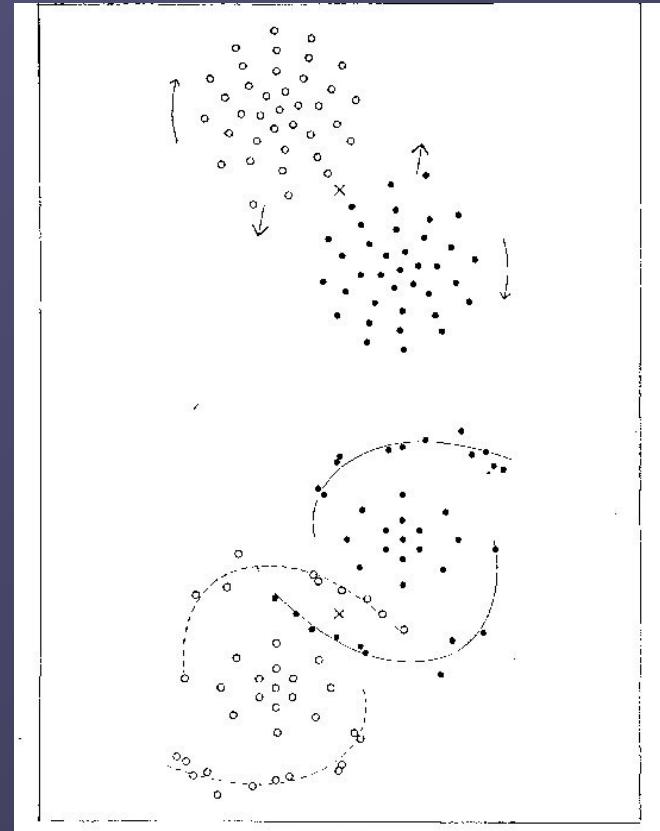


FIG. 4d

HARDWARE

...before von Neumann...

● Konrad Zuse (1910-1995) Berlin



Invented freely programmable Computer



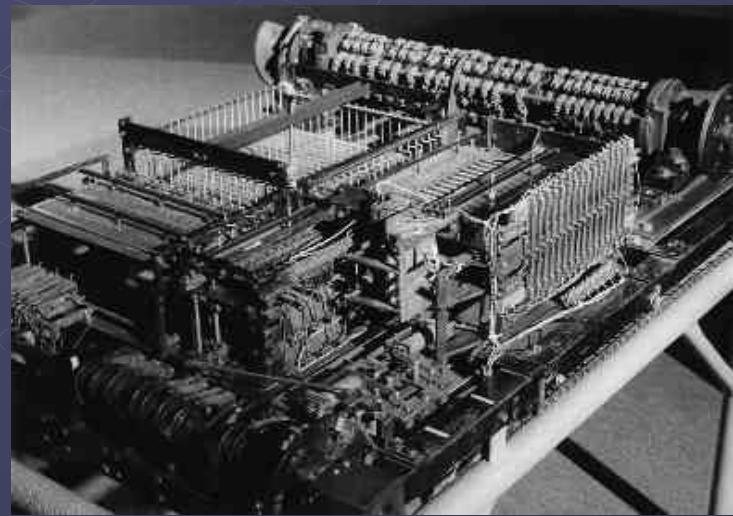
Z1 in parental flat 1936

History

Zuse Z4: 1944 Berlin, 1950 Zürich, 1954 Frankreich
1959 Deutsches Museum München



Computing Speed 0.03 MHz



Memory 256 byte

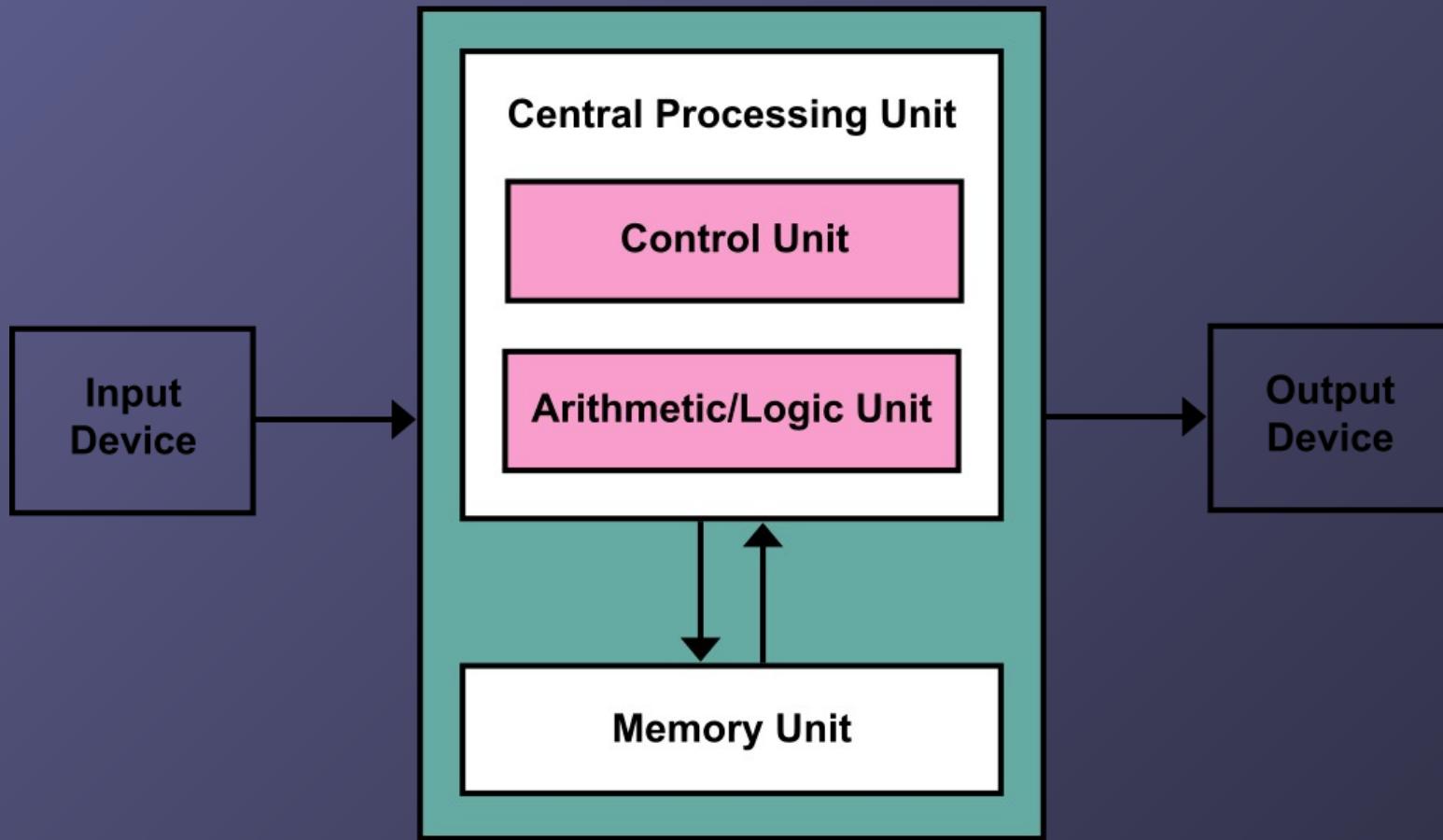


HARDWARE

- John von Neumann (1903-1957)

Born Budapest, Lecturer Berlin, since 1930 Princeton Univ.
Fundamental Architecture of an electronic computing device(1946)

Source: https://en.wikipedia.org/wiki/Von_Neumann_architecture#/media/File:Von_Neumann_Architecture.svg

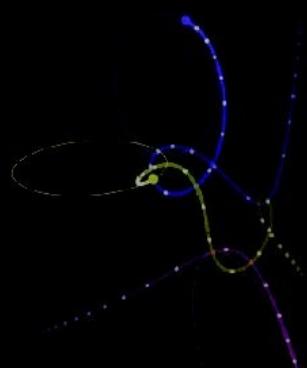




Astronomisches
Rechen-Institut (ARI)
at Univ. of
Heidelberg, Germany



**Siemens 2002
Computer in 1964
At ARI**



Sourcen/Klassen: Computer Physics (22.04.2016)

History

<http://cdsads.u-strasbg.fr/abs/1960ZA.....50..184V>

Astronomisches Rechen-Institut in Heidelberg
Mitteilungen Serie A Nr. 14

Die numerische Integration des *n*-Körper-Problemes für Sternhaufen I

Von

SEBASTIAN VON HOERNER

Mit 3 Textabbildungen

(*Eingegangen am 10. Mai 1960*)

Tabelle 5. Zahl der gegenseitigen Umläufe,
Häufigkeit des Auftretens und kleinster
gegenseitiger Abstand D_m der engsten Paare.
(Alle engsten Paare mit mehr als zwei
vollen Umläufen wurden notiert)

Umläufe	Häufigkeit	D_m
2—3	11	0.0102
3—5	9	0.0177
5—10	5	0.0070
10—20	2	0.0141
20—50	1	0.0007
50—100	1	0.0035
100—200	1	0.0039

Astronomisches Rechen-Institut in Heidelberg
Mitteilungen Serie A Nr. 19

Die numerische Integration des *n*-Körper-Problems für Sternhaufen, II.

Von

SEBASTIAN VON HOERNER

Mit 10 Textabbildungen

(*Eingegangen am 19. November 1962*)

S.v. Hoerner,
Z.f.Astroph. 1960, 63

Siemens 2002
N=4,8,12,16 (4 Trx)

N=16,25 (40 Trx)

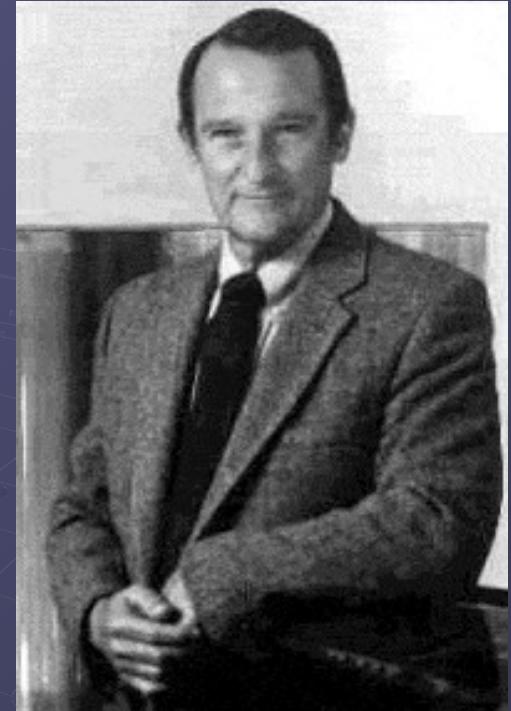
<http://cdsads.u-strasbg.fr/abs/1963ZA.....57...47V>

History

● Seymour Cray (1925-1996)

“father of supercomputing”

https://en.wikipedia.org/wiki/Women_in_computing



CRAY1: Vectorregisters (1976)

160 Mflop, 80 MHz, 8 MByte RAM

CRAY2: (1984)

1Gflop, 120MHz, 2GByte RAM

History

*Supercomputer
JUGENE
IBM Blue Gene
At FZ Jülich,
Germany*



Opening Ceremony June 2008



Computational Science...

Exaflop/s

...after von Neumann...

Petaflop/s

Teraflop/s

GigaFlop/s

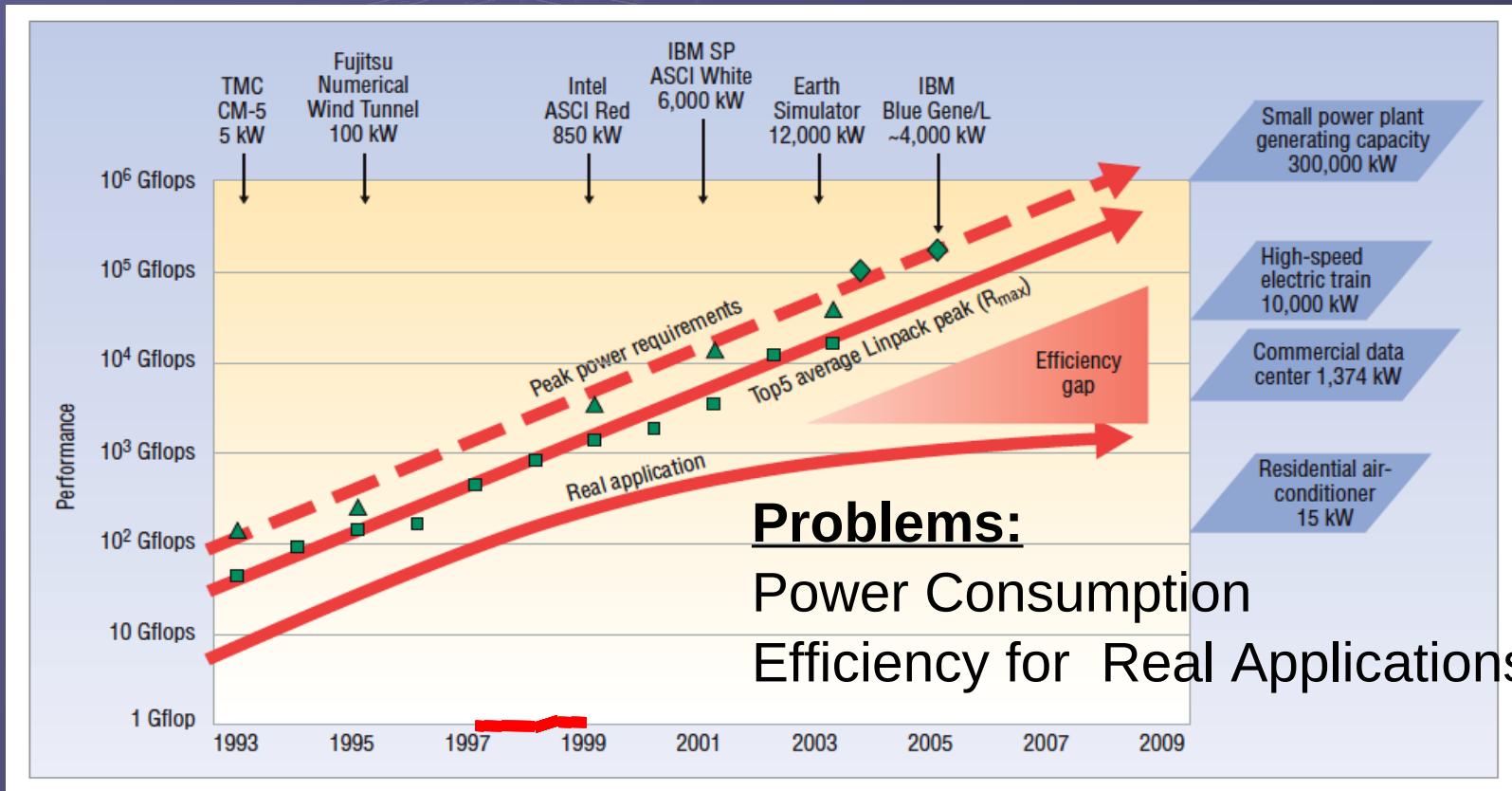


Figure 1. Rising power requirements. Peak power consumption of the top supercomputers has steadily increased over the past 15 years.

Thanks to Horst Simon, LBNL/NERSC for this diagram.

GPU Computing

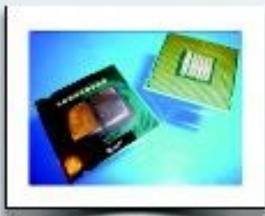
Special Hardware

Accelerators

SPECIAL HARDWARE

CPUs

Central Processing Units



General Purpose oriented

1-12 Cores

Up to 4 pipes per core using Vector Units

Fully Programmable, many languages available

Very well studied

Max. 125W per processor

GPUs

Graphic Processing Units



Graphics oriented

16-512 Cores

Massively Parallel Architecture, specialized instructions for parallel processing

Fully programmable, but limited languages

Algorithms not fully explored

Max. 400W per card

FPGAs

Field Programmable Gate Arrays



Custom designs, best for processing streaming data

Programmable Logic, Architecture is custom-built for the required application

Requires extensive knowledge to program, development time is longer than CPUs and GPUs

Application interface is custom built on each case

Max. 60W per FPGA

ASICs

Application Specific Integrated Circuits



Fully custom designs, built for a specific application

Not flexible, cannot be changed once it is built

Development is even more specialized than FPGAs

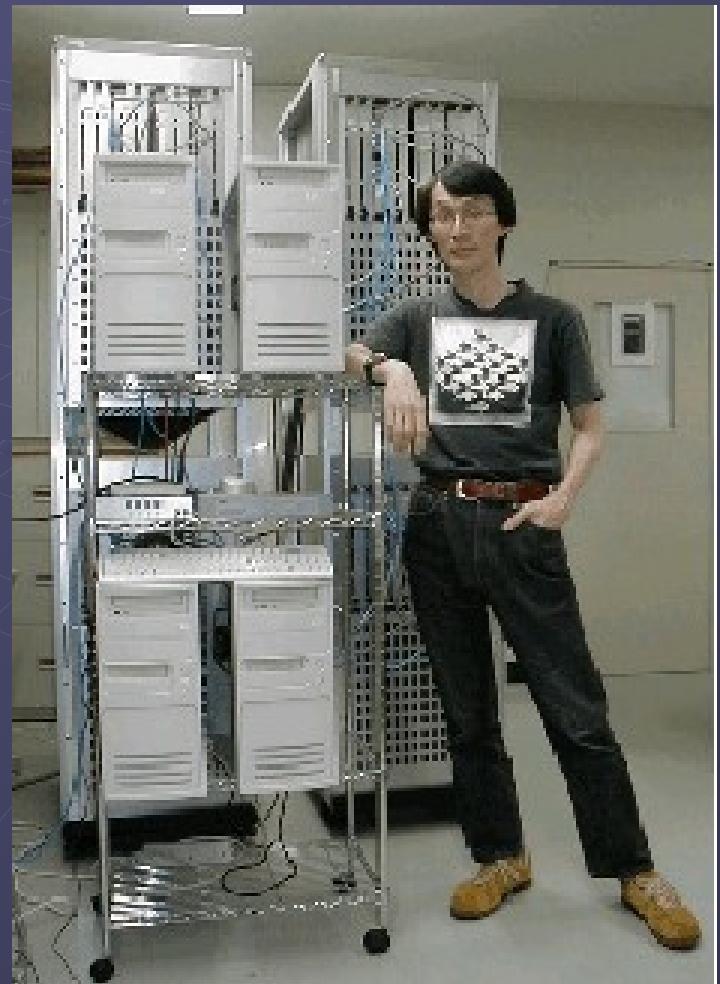
Power consumption varies with the application, usually best performance per Watt

Slide: Guillermo Marcus

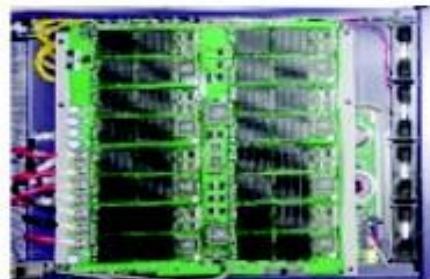
HARDWARE

GRAPE-6 Gravity/Coulomb Part

- G6 Chip: 0.25μ 2MGate ASIC, 6 Pipelines
- at 90MHz, 31Gflops/chip
- 48Tflops full system (March 2002)
- Plan up to 72Tflops full system (in 2002)
- Installed in Cambridge, Marseille, Drexel, Amsterdam, New York (AMNH), Mitaka (NAO), Tokyo, etc.. New Jersey, Indiana, Heidelberg



GRAPE-6



1998, 120 Gflops

Developers: Junichiro Makino, Toshiyuki Fukushige, Hiroshi Daisaka, Eiichiro Kokubo, Masaki Koga, Makoto Taiji, Ken Namura

[GRAPE-6: Massively-Parallel Special-Purpose Computer for Astrophysical Particle Simulations](#)

[Sales information](#)

The Green500 List - November 2010

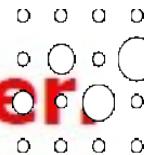
Listed below are the November 2010 The Green500's energy-efficient supercomputers ranked from 1 to 100.

<http://www.green500.org>

Green500 Rank	MFLOPS/W	Site*	Computer*	Total Power (kW)
1	1684.20	IBM Thomas J. Watson Research Center	NNSA/SC Blue Gene/Q Prototype	38.80
2+	1448.03	National Astronomical Observatory of Japan	GRAPE-DR accelerator Cluster, Infiniband	24.59
2	958.35	GSIC Center, Tokyo Institute of Technology	HP ProLiant SL390s G7 Xeon 6C X5670, Nvidia GPU, Linux/Windows	1243.80
3	933.06	NCSA	Hybrid Cluster Core i3 2.93Ghz Dual Core, NVIDIA C2050, Infiniband	36.00

GPU: NAOC laohu cluster Beijing, China



**Kepler GPU cluster**

12 nodes = 12 x 16 = 192 CPU cores (@ 2 GHz)

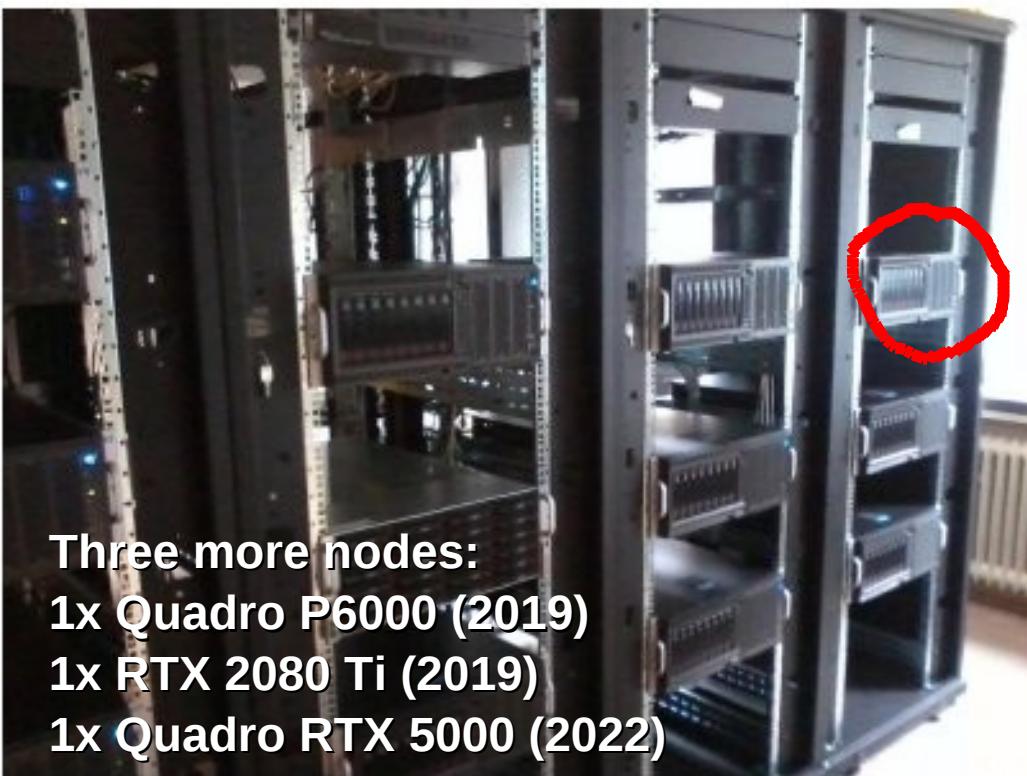
12 x 64 GB = 768 GB RAM CPU memory

12 GPUs K20m = 12 x 2496 ~ 30k GPU threads

12 x 4.8 GB ~ 57 GB GPU device memory

4 x Xilinx Virtex-6 FPGA (ML 605)

since beg. 2013 operated.



Three more nodes:

1x Quadro P6000 (2019)

1x RTX 2080 Ti (2019)

1x Quadro RTX 5000 (2022)



NVIDIA Ampere A100 GPU, 54 billion transistors, 6920 cores (Hopper H100, ...)



With NVLINK
Without NVLINK



	A100 80GB PCIe	A100 80GB SXM
FP64	9.7 TFLOPS	
FP64 Tensor Core	19.5 TFLOPS	
FP32	19.5 TFLOPS	
Tensor Float 32 (TF32)	156 TFLOPS 312 TFLOPS*	
BFLOAT16 Tensor Core	312 TFLOPS 624 TFLOPS*	
FP16 Tensor Core	312 TFLOPS 624 TFLOPS*	
INT8 Tensor Core	624 TOPS 1248 TOPS*	
GPU Memory	80GB HBM2e	80GB HBM2e
GPU Memory Bandwidth	1,935 GB/s	2,039 GB/s
Max Thermal Design Power (TDP)	300W	400W ***

NVIDIA Volta V100 GPU, 21 billion transistors, 5120 cores

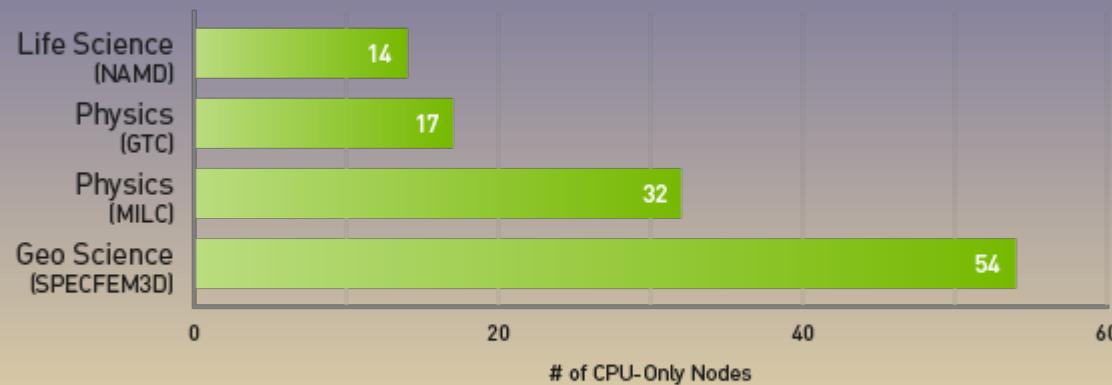
47X Higher Throughput Than CPU Server on Deep Learning Inference



Workload: ResNet-50 | CPU: 1X Xeon E5-2690v4 @ 2.6 GHz | GPU: Add 1X Tesla P100 or V100

1 GPU Node Replaces Up To 54 CPU Nodes

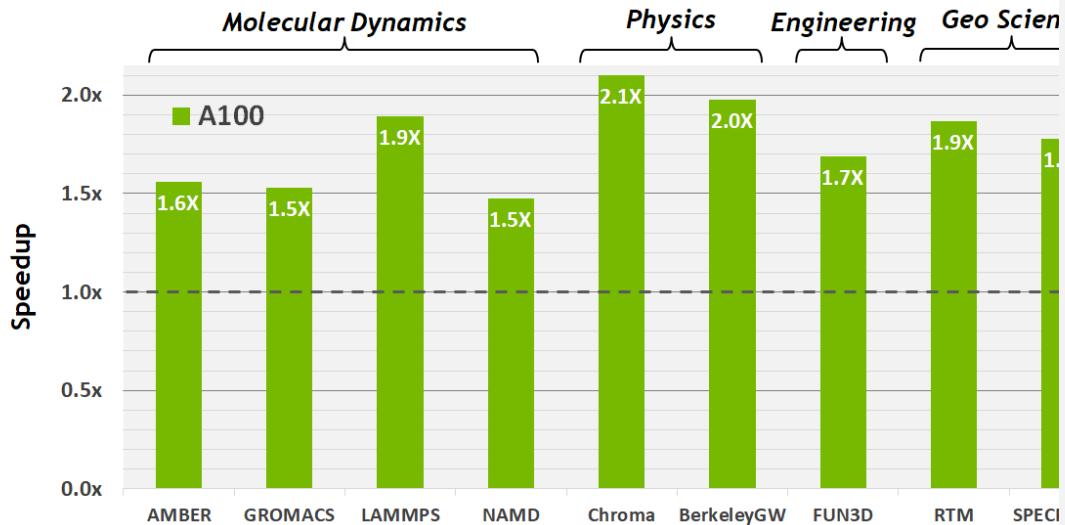
Node Replacement: HPC Mixed Workload



CPU Server: Dual Xeon Gold 6140@2.30GHz, GPU Servers: same CPU server w/ 4x V100 PCIe | CUDA Version: CUDA 9.x | Dataset: NAMD (STMV), GTC (mpi#proc.in), MILC (APEX Medium), SPECFEM3D (four_material_simple_model) | To arrive at CPU node equivalence, we use measured benchmark with up to 8 CPU nodes. Then we use linear scaling to scale beyond 8 nodes.

NVIDIA Ampere A100 GPU, 54 billion transistors, 6920 cores

ACCELERATING HPC



All results are measured
Except BerkeleyGW, V100 used is single V100 SXM2, A100 used is single A100 SXM4
More apps detail: AMBER based on PME-Cellulose, GROMACS with STMV (h-bond), LAMMPS with Atomic Fluid LJ-2.5, NAMD with v3.0a1 STMV_NVE
Chroma with szsc21_24_128, FUN3D with dpw, RTM with Isotropic Radius 4 1024³, SPECFEM3D with Cartesian four material model
BerkeleyGW based on Chi Sum and uses 8xV100 in DGX-1, vs 8xA100 in DGX A100

11X More HPC Performance in Four Years

Top HPC Apps

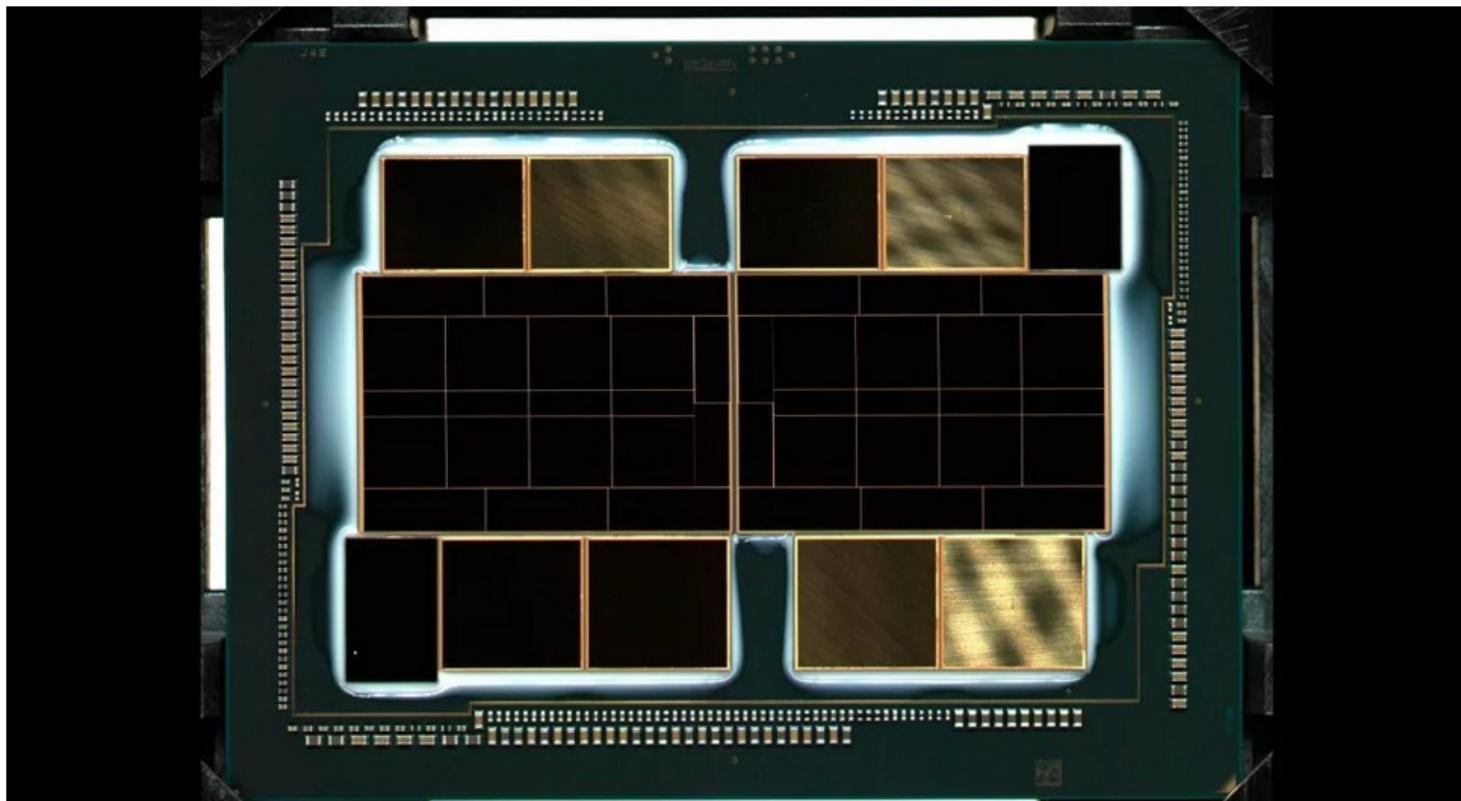


New Intel Ponte Vecchio hardware / Recent Processors

Intel Ponte Vecchio Seemingly Offers 2.5x Higher Performance Than Nvidia's A100

By Zhiye Liu published August 22, 2022

The battle of juggernauts



Intel has detailed the company's Ponte Vecchio Xe-HPC GPU at Hot Chips 34. In the provided benchmarks, the chipmaker claims that Ponte Vecchio delivers up to 2.5x more performance than the [Nvidia A100](#). But, as customary, take vendor-provided benchmarks with a pinch of salt.
From: <https://www.tomshardware.com/news/intel-ponte-vecchio-seemingly-offers-25x-higher-performance-than-nvidias-a100>

AMD Instinct™ MI250X

AMD Instinct
MI250X GPU

Nov.2023 Lists:
Used in:

Frontier (#1 US)
And LUMI (#5 FIN)

GPU Specifications

GPU Architecture: CDNA2

Stream Processors: 14,080

Lithography: TSMC 6nm FinFET

Compute Units: 220

Peak Half Precision (FP16) Performance:
383 TFLOPs

Peak Engine Clock: 1700 MHz

Peak Single Precision Matrix (FP32)
Performance:
95.7 TFLOPs

Peak Double Precision Matrix (FP64)
Performance:
95.7 TFLOPs

Peak Single Precision (FP32)
Performance:
47.9 TFLOPs

Peak Double Precision (FP64)
Performance:
47.9 TFLOPs

Peak INT4 Performance: 383 TOPs

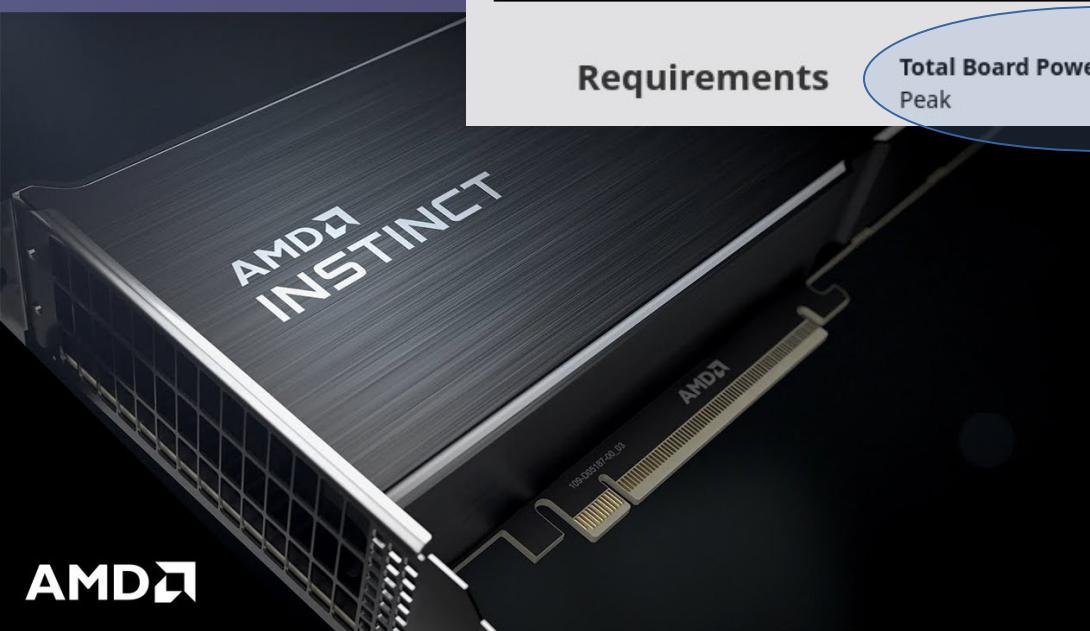
Peak INT8 Performance: 383 TOPs

Peak bfloat16: 383 TFLOPs

OS Support: Linux x86_64

Requirements

Total Board Power (TBP): 500W | 560W
Peak





From <https://www.top500.org/>

Nov. 2023 List



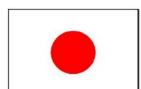
USA



USA



USA



Japan



**Finland
(EUR)**

Rank	System	Cores	Rmax (PFlop/s)	Rpeak (PFlop/s)	Power (kW)
1	Frontier - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, HPE DOE/SC/Oak Ridge National Laboratory United States	8,699,904	1,194.00	1,679.82	22,703
2	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	4,742,808	585.34	1,059.33	24,687
3	Eagle - Microsoft NDv5, Xeon Platinum 8480C 48C 2GHz, NVIDIA H100, NVIDIA Infiniband NDR, Microsoft Microsoft Azure United States	1,123,200	561.20	846.84	
4	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
5	LUMI - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, HPE	2,752,704	379.70	531.51	7,107

GPU AMD Instinct

Intel Data Center GPU

GPU NVIDIA Hopper

Fujitsu Arm

GPU AMD Instinct



From <https://www.top500.org/>
Nov. 2023 List



USA

Rank	System	Cores	Rmax (PFlop/s)	Rpeak (PFlop/s)	Power (kW)
6	Sierra - IBM Power System AC922, IBM POWER9 22C 3.1GHz, NVIDIA Volta GV100, Dual-rail Mellanox EDR Infiniband, IBM / NVIDIA / Mellanox DOE/NNSA/LLNL United States	1,572,480	94.64	125.71	7,438

GPU NVIDIA Volta



China

7	Sunway TaihuLight - Sunway MPP, Sunway SW26010 260C 1.45GHz, Sunway, NRCPC National Supercomputing Center in Wuxi China	10,649,600	93.01	125.44	15,371
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Chinese 26010 Processor
(260 cores, 10nm)



USA

8	Perlmutter - HPE Cray EX235n, AMD EPYC 7763 64C 2.45GHz, NVIDIA A100 SXM4 40 GB, Slingshot-10, HPE DOE/SC/LBNL/NERSC United States	761,856	70.87	93.75	2,589
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GPU NVIDIA Ampere



USA

9	Selene - NVIDIA DGX A100, AMD EPYC 7742 64C 2.25GHz, NVIDIA A100, Mellanox HDR Infiniband, Nvidia NVIDIA Corporation United States	555,520	63.46	79.22	2,646
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GPU NVIDIA Ampere

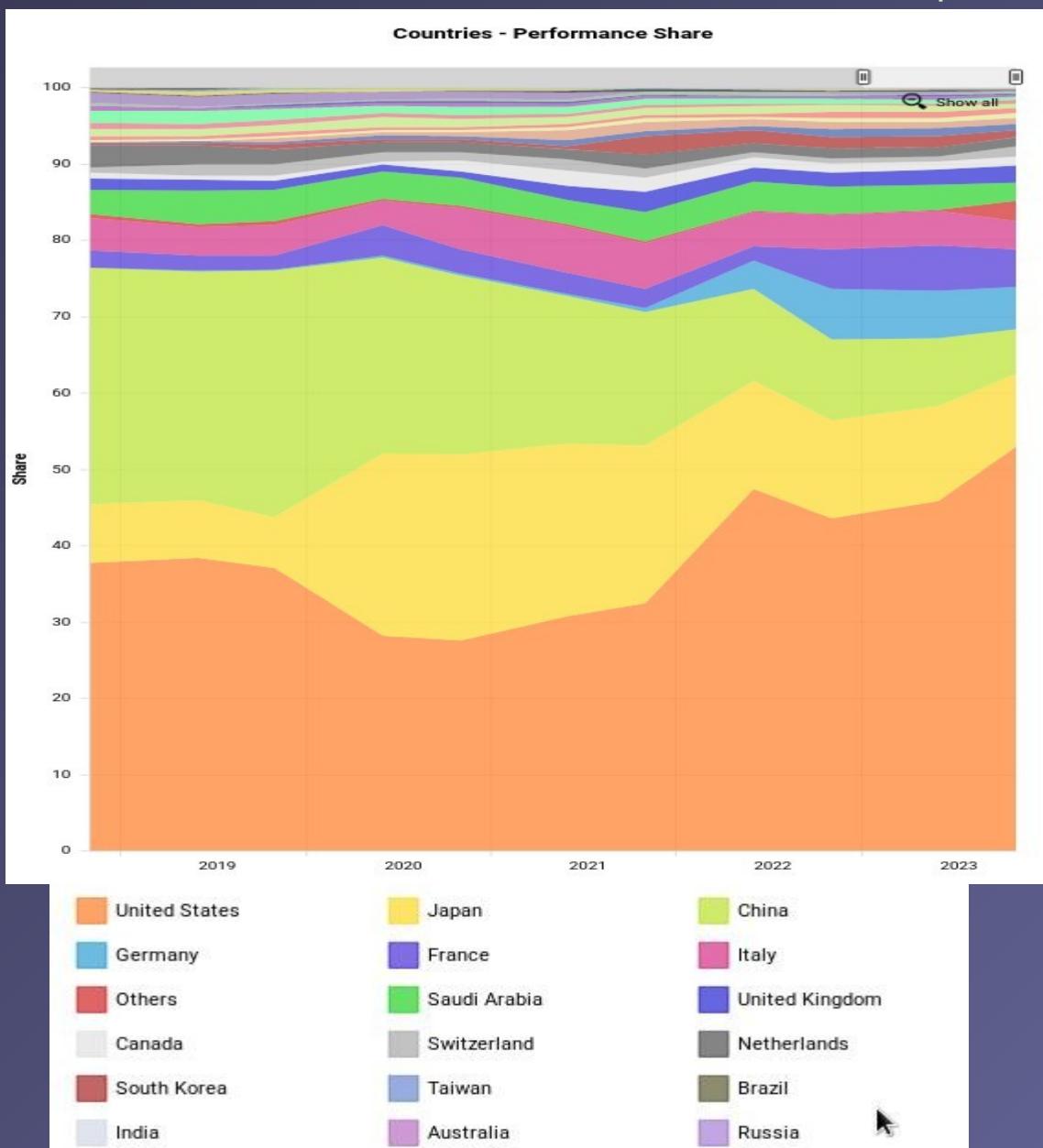


China

10	Tianhe-2A - TH-IVB-FEP Cluster, Intel Xeon E5-2692v2 12C 2.2GHz, TH Express-2, Matrix-2000, NUDT National Super Computer Center in Guangzhou China	4,981,760	61.44	100.68	18,482
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Chinese Matrix-2000 Processor

Top 500 List November 2023 – Performance Share of Countries From <https://www.top500.org>



LUMI

Supercomputer, Kajaani, Finland

Using only
Hydroelectric
Power and its
Heat used for
heating buildings.

No. 5 in top500
No. 7 in green500

2.2 million cores
~12.000 AMD GPUs



EuroHPC and LUMI consortium:
Finland, Belgium, Czech Republic, Denmark, Estonia,
Iceland, Norway, Poland, Sweden, and Switzerland.

RIKEN, Kobe, JAPAN

富岳

FUGAKU



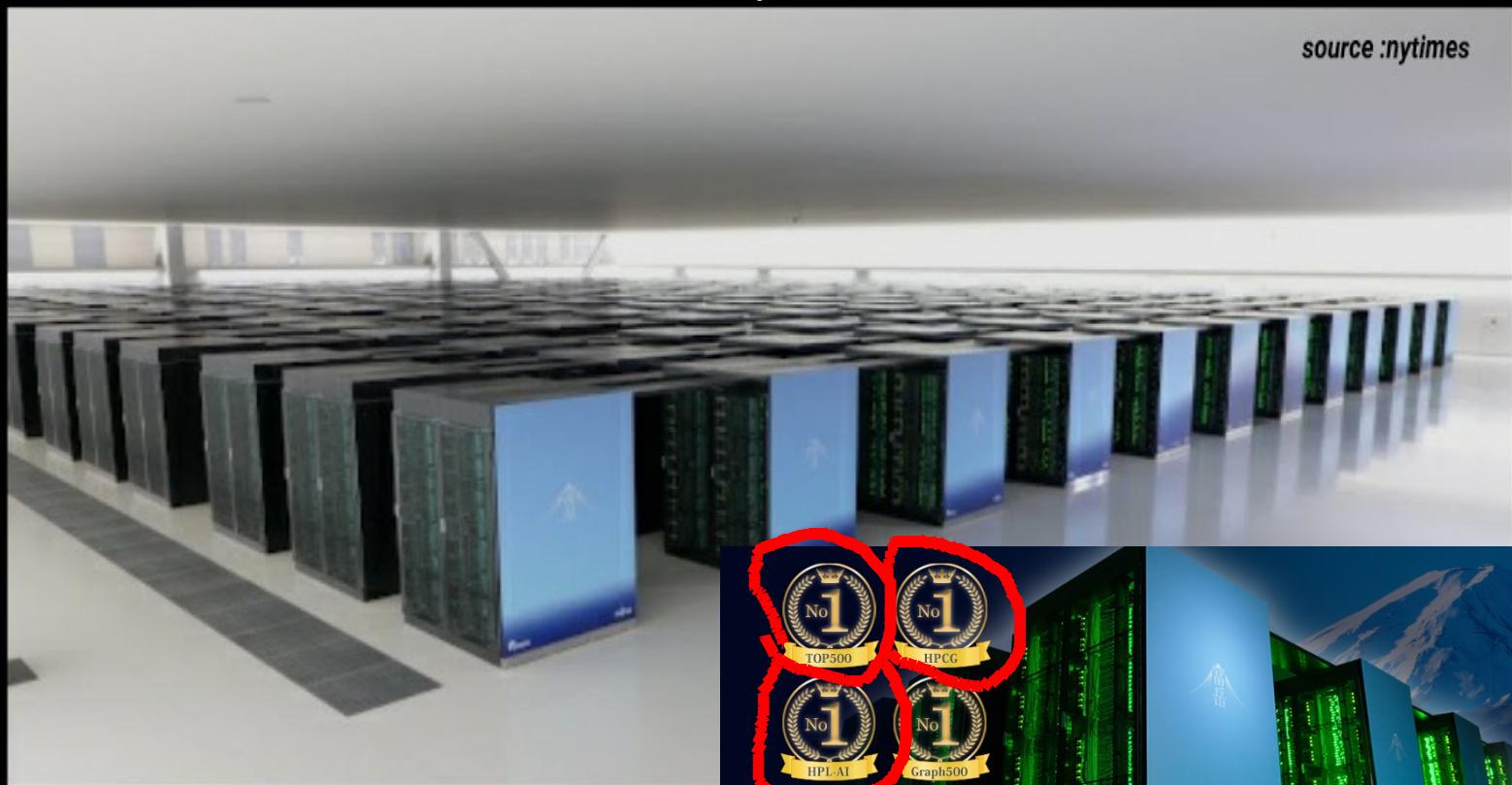
Nature's Secrets

Mt. Fuji

The world's fastest Super Computer 2020 /2021

7.6 million cores, 442 Pflop/s

source :nytimes



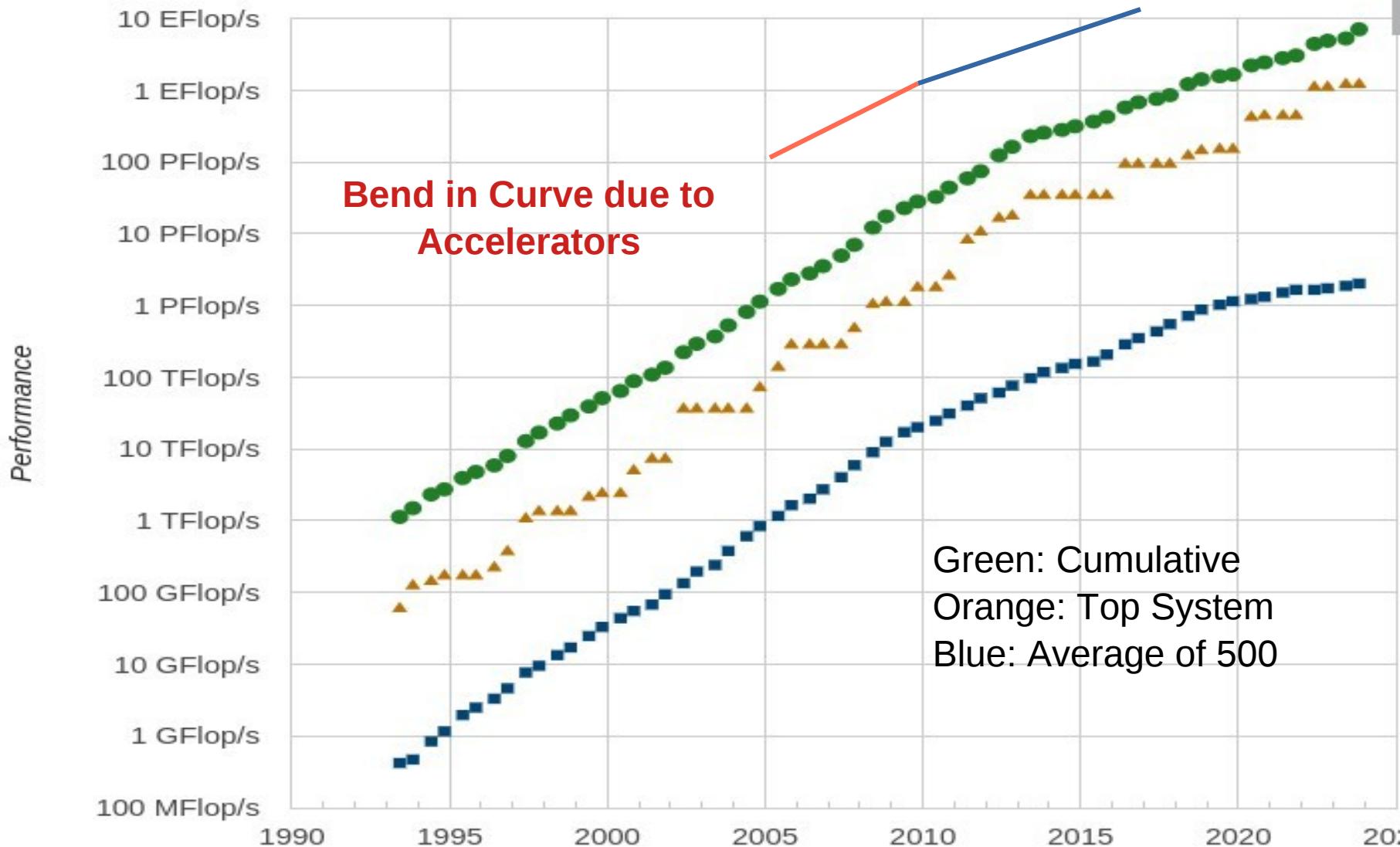
Fugaku extends its reign as champion of supercomputers

JUWELS Booster 936 nodes (AMD CPU, 4x Ampere GPU)
~450.000 AMD cores, 25 million NVIDIA Ampere GPU cores
~ 70 Pflop/s SP ~ 44 Pflop/s DP
No. 18 in top500 list, No. 3 in green500 list

Jülich Wizard for European Leadership Science



Performance Development



Lists

● Sum

▲ #1

■ #500

GREEN 500 list Nov. 2023

Power Efficiency
(Gflops/Watts),
see also top500 webpage
right: 1-5
below: 6-10

TOP500							Rmax (PFlop/s)	Power (kW)	Energy Efficiency (GFlops/watts)	
Rank	Rank	System			Cores					
1	293	Henri - ThinkSystem SR670 V2, Intel Xeon Platinum 8362 32C 2.8GHz, NVIDIA H100 80GB PCIe, Infiniband HDR, Lenovo Flatiron Institute United States			8,288	2.88	44	65.396	<u>GPU NVIDIA Hopper</u>	
2	44	Frontier TDS - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, HPE DOE/SC/Oak Ridge National Laboratory United States			120,832	19.20	309	62.684	<u>GPU AMD Instinct</u>	
6	8	MareNostrum 5 ACC - BullSequana XH3000, Xeon Platinum 8460Y+ 40C 2.3GHz, NVIDIA H100 64GB, Infiniband NDR200, EVIDEN EuroHPC/BSC Spain	680,960	138.20	2,560	53.984				<u>GPU NVIDIA Hopper</u>
7	5	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	7,107	53.428				<u>GPU AMD Instinct</u>
8	1	Frontier - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, HPE DOE/SC/Oak Ridge National Laboratory United States	8,699,904	1,194.00	22,703	52.592				<u>GPU AMD Instinct</u>
9	84	Goethe-NHR - Supermicro AS-4124GS-TNR, AMD EPYC 7452 32C 2.35GHz, AMD Instinct MI210 64 GB, Mellanox InfiniBand EDR, MEGWARE / Supermicro Universitaet Frankfurt Germany	96,768	9.09	195	46.543				<u>GPU AMD Instinct</u>
10	496	Olaf - Lenovo ThinkSystem SR675 V3, AMD EPYC 9334 32C 2.76Hz, NVIDIA H100, Infiniband NDR 400, Lenovo Science Institute South Korea	3,936	2.03	45	45.117				<u>GPU NVIDIA Hopper</u>
										<u>GPU AMD Instinct</u>
										<u>GPU AMD Instinct</u>
										<u>GPU AMD Instinct</u>