GPU Programming

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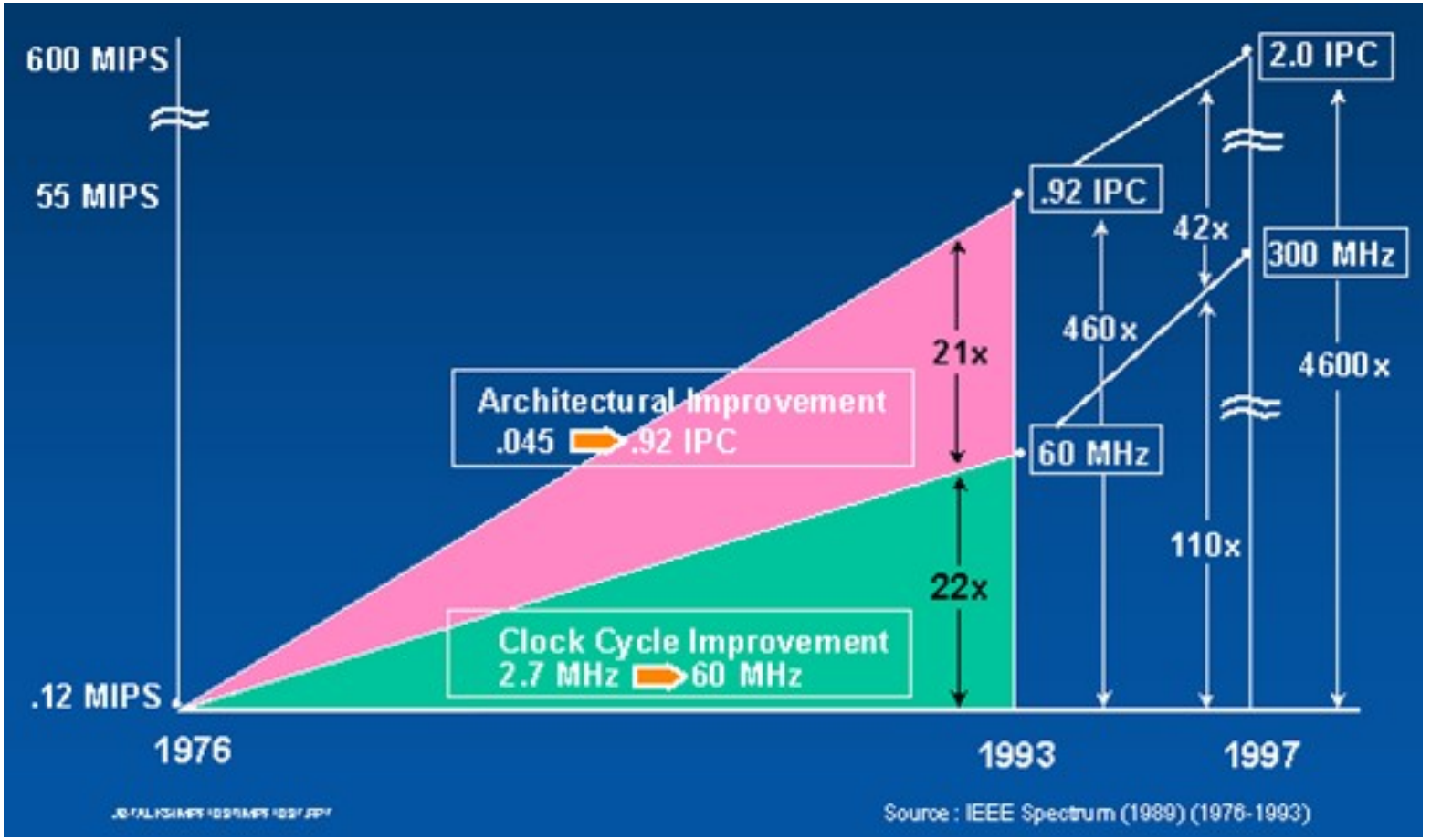
IIT Madras
January 2024

The Good Old Days for Software

Source: J. Birnbaum

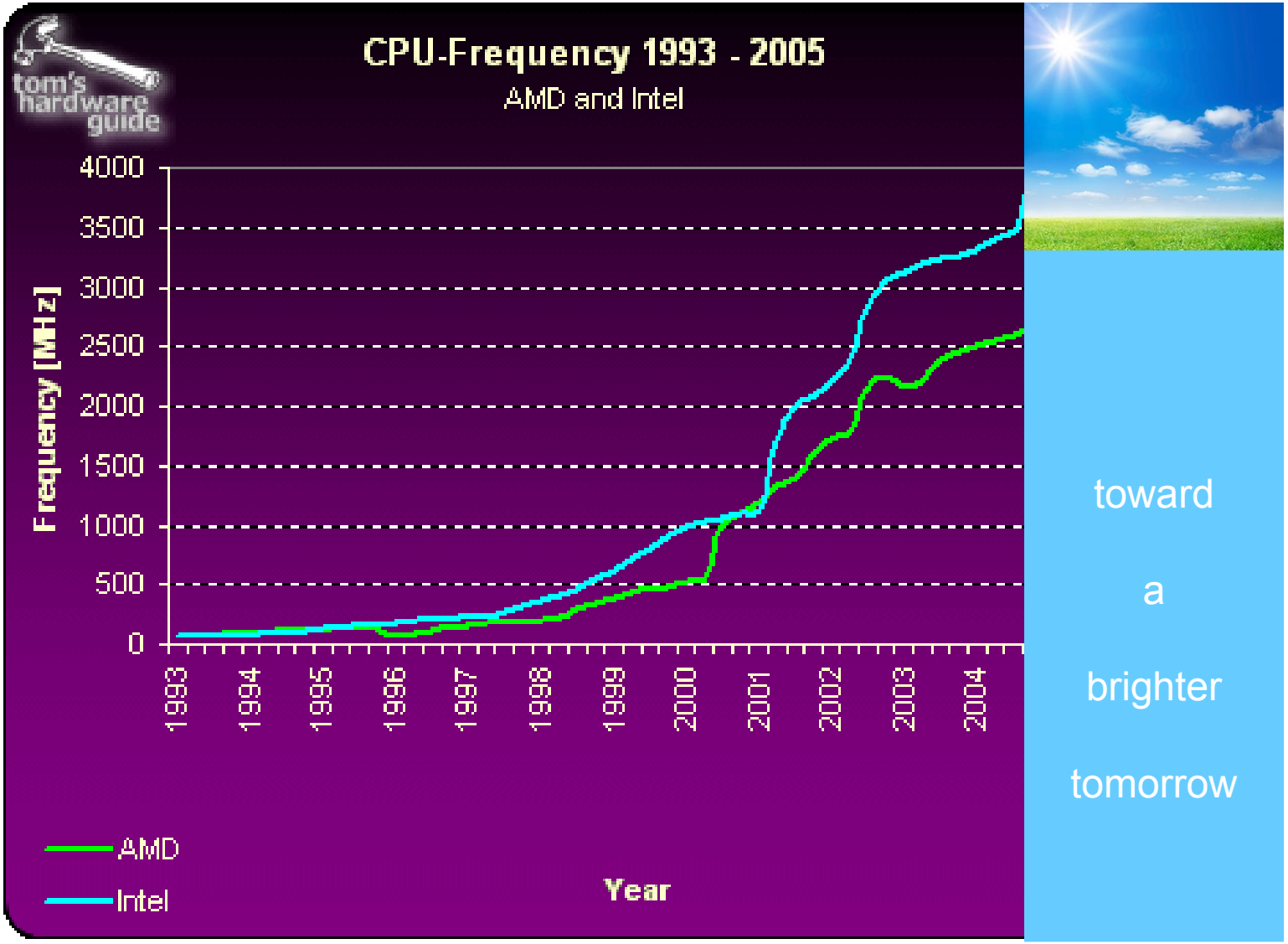


- Single-processor performance experienced dramatic improvements from **clock**, and **architectural** improvement (Pipelining, Instruction-Level-Parallelism).
- Applications experienced **automatic** performance improvement.

As the years pass by, the hardware improvements made the programs run faster without the need of coding optimizations. Then we reached

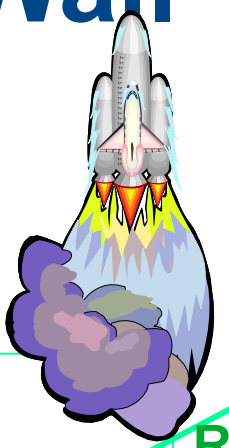
Hitting the Power Wall

a point where we can no longer increase the hardware (CPU freq) now we are left with coding optimizations rather than improving hardware.



http://img.tomshardware.com/us/2005/11/21/the_mother_of_all_cpu_charts_2005/cpu_frequency.gif

Hitting the Power Wall



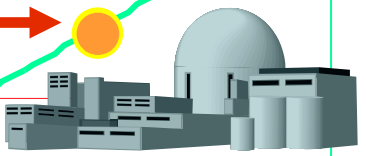
Sun's Surface

Rocket Nozzle

Power doubles every 4 years

5-year projection: 200W total, 125 W/cm²

Nuclear Reactor



Hot plate

Watts / cm²

1000

100

10

1

Pentium® 4

Pentium® III

Pentium® II

Pentium® Pro

Pentium®

i486

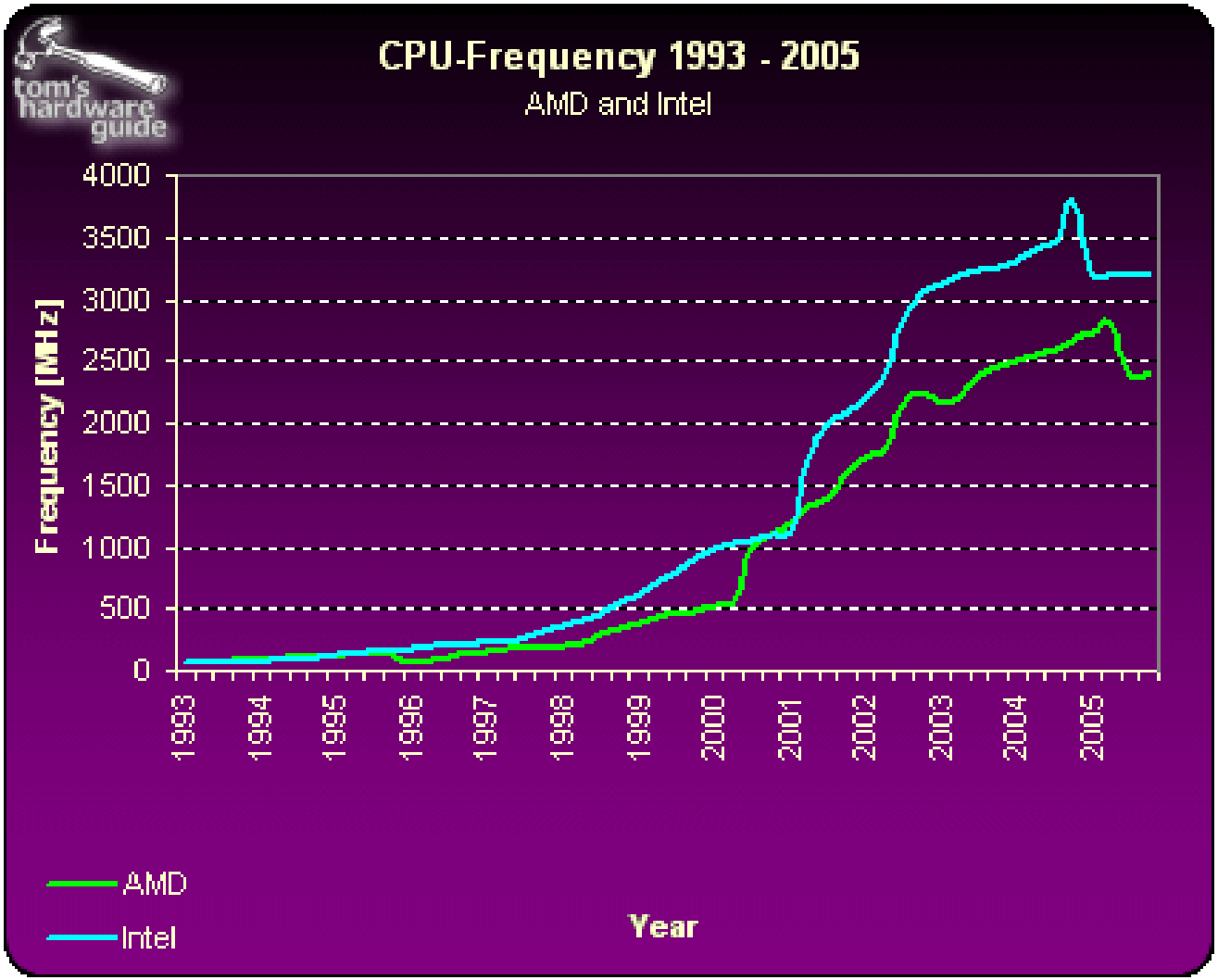
i386

P=VI: 75W @ 1.5V = 50 A

1.5µ 1µ 0.7µ 0.5µ 0.35µ 0.25µ 0.18µ 0.13µ 0.1µ 0.07µ

"New Microarchitecture Challenges in the Coming Generations of CMOS Process Technologies" – Fred Pollack, Intel Corp. Micro32 conference key note - 1999. Courtesy Avi Mendelson, Intel.

Hitting the Power Wall



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2004 – Intel cancels Tejas and Jayhawk due to *heat problems due to the extreme power consumption of the core.*

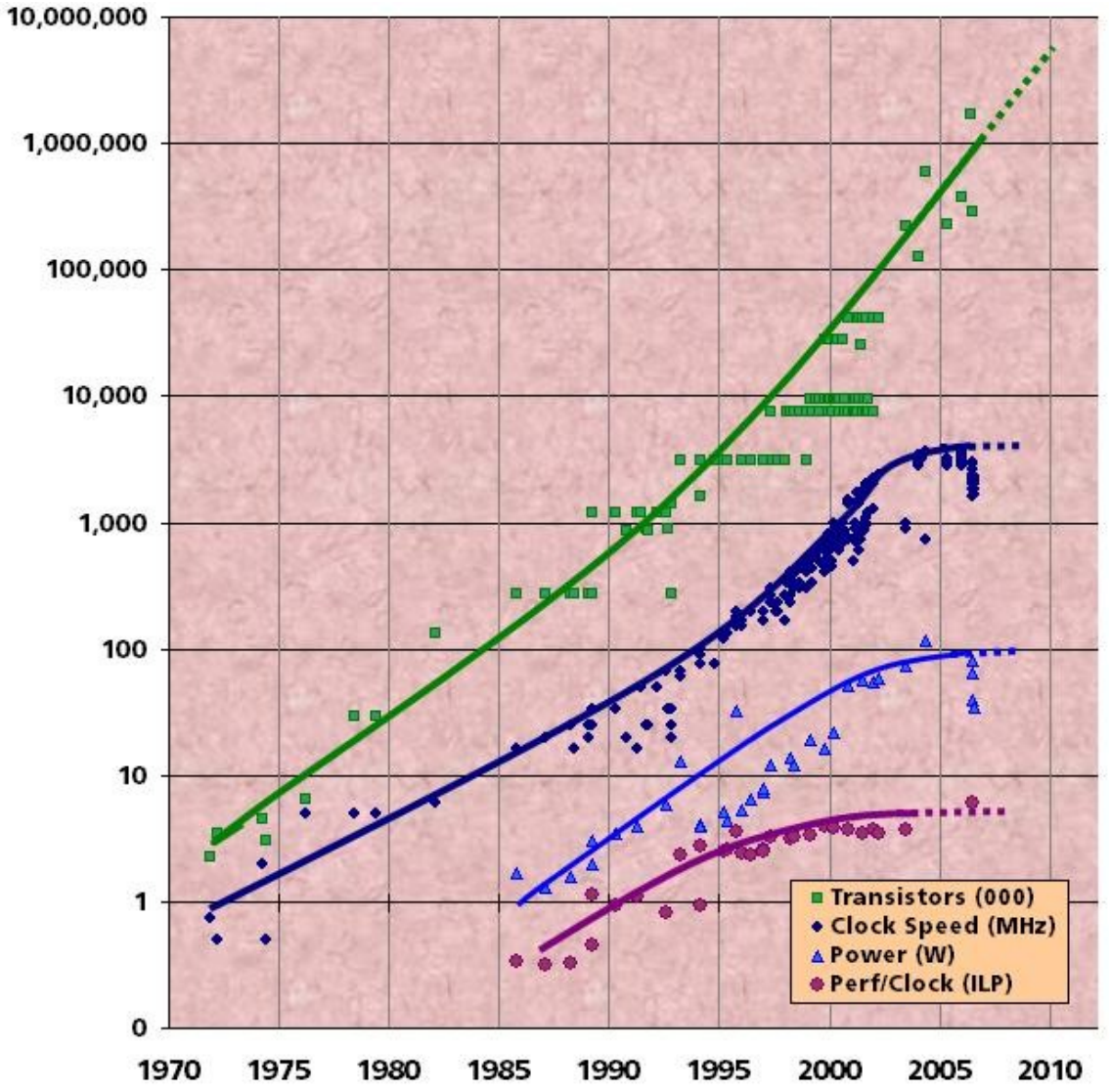
The Only Option: Use Many Cores

Chip density is increasing by ~2x every 2 years

- Clock speed is not
- Number of processor cores may double

There is little or no more hidden parallelism (ILP) to be found

Parallelism must be exposed to and managed by software



Source: Intel, Microsoft (Sutter) and Stanford (Olukotun, Hammond)

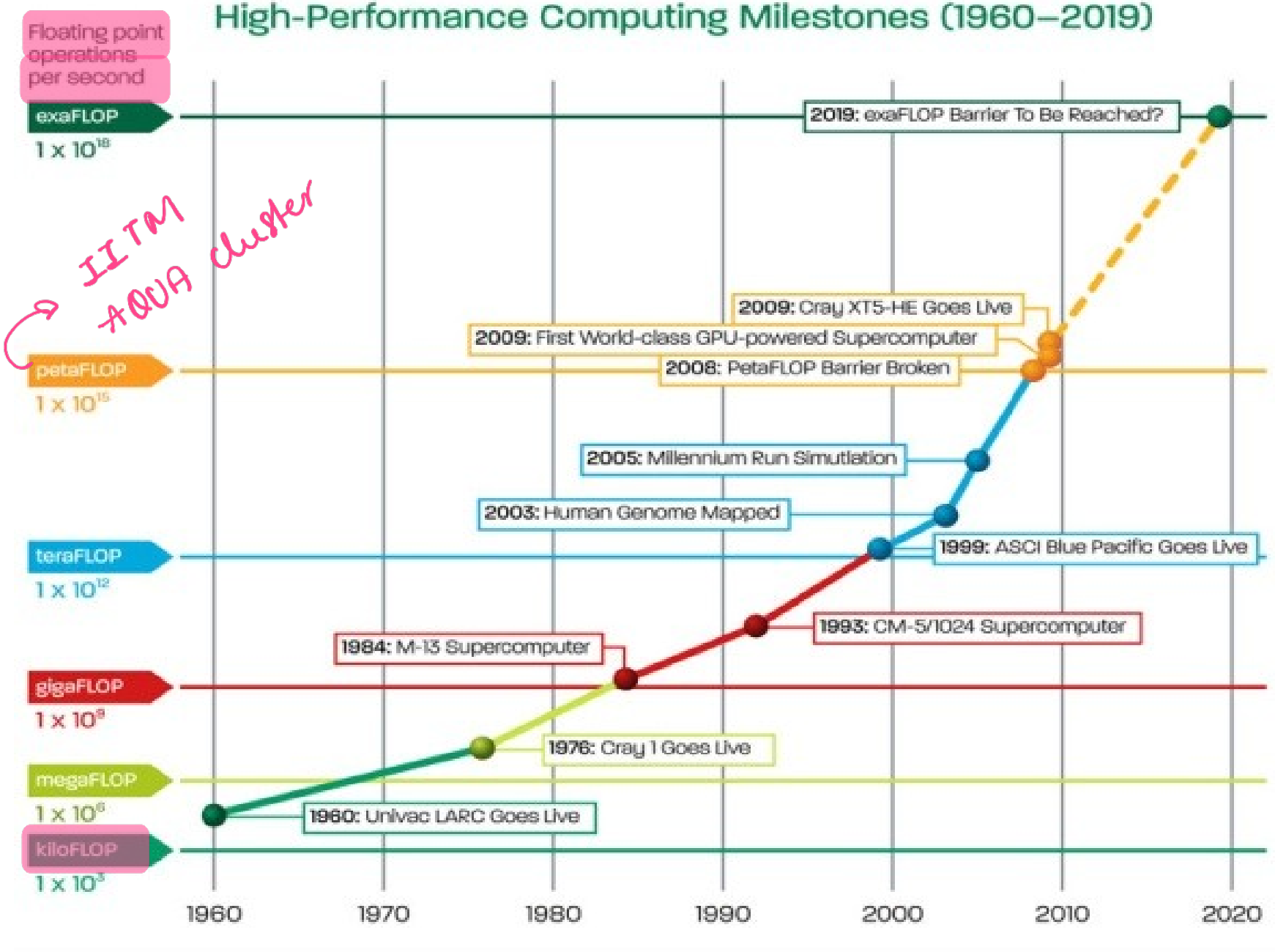
GPU's are also called accelerators.

→ Nvidia has 5120 CUDA cores

GPU's are also called accelerators
GPU's will have thousands of cores.

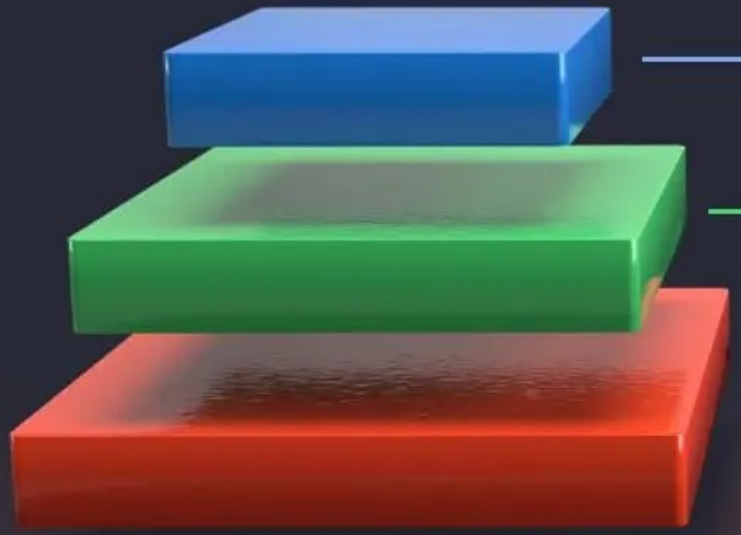
→ Intel CPU has 48 cores.

AMD



IITM AQUA cluster

Typical Deep Learning Pipeline With GPU

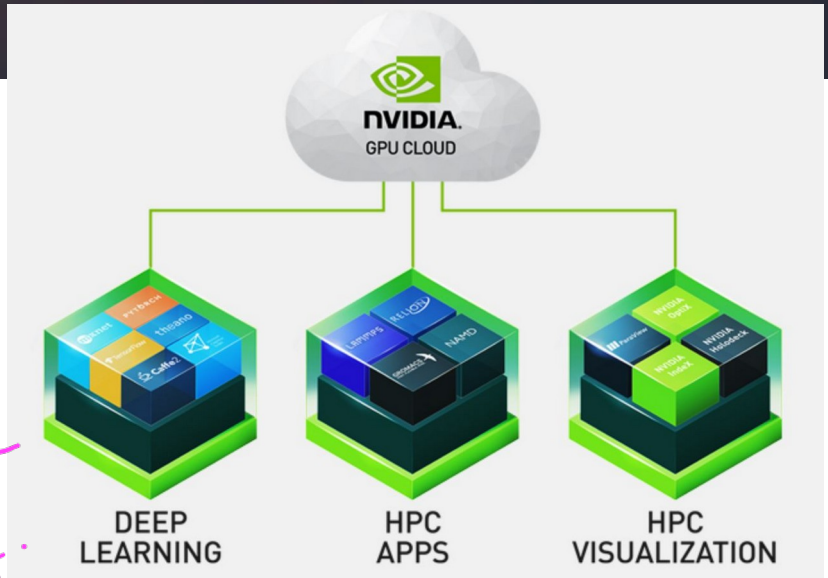


Data Preprocessing (CPU)

DNN Execution:
Training or Inference (GPU)

Data Post-Processing (CPU)

mobidev



Super Computers are distributed systems.

Creator: Patrick Kennedy

note: GPUs
Sole processing
it acts as a coprocessor
it works alongside the main
processor unit
i.e. CPU
&: intel + nvidia

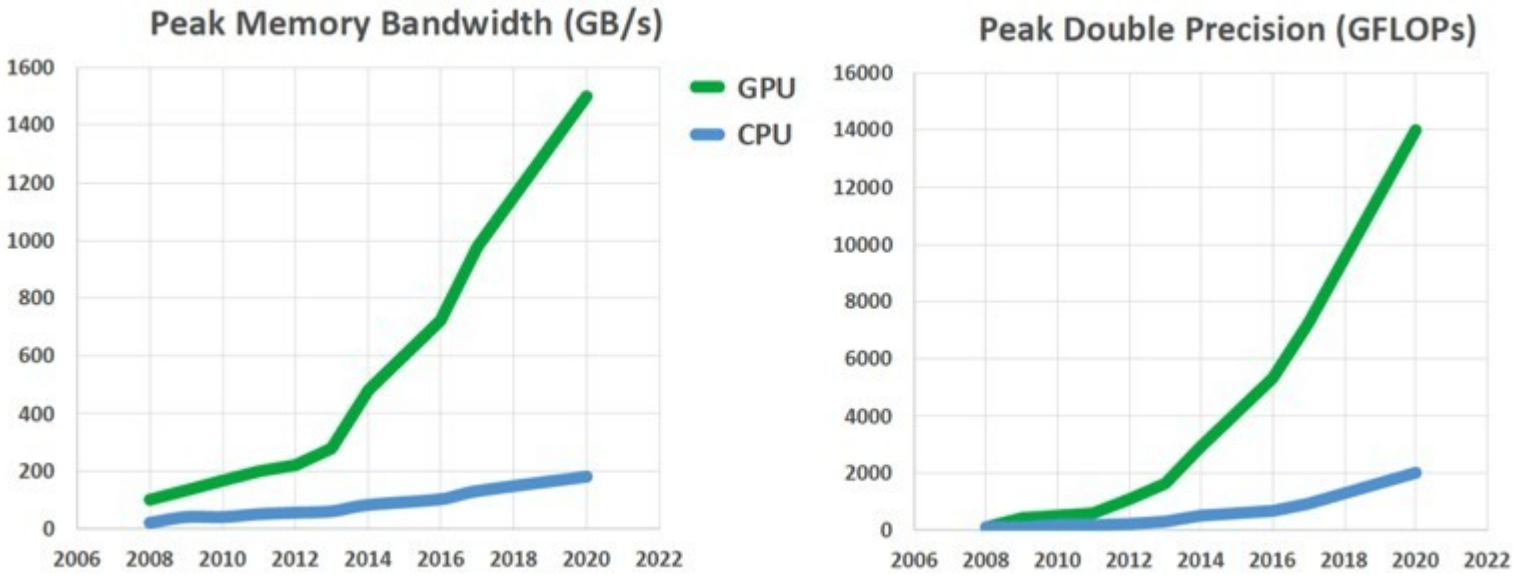
Parallel Platforms

- Shared memory systems (multi-core) → our laptops
- Distributed systems (cluster) → each node (or) system will have its own memory. if a node needs to access another nodes data, it makes a request
- Graphics Processing Units (many-core)
- Field-Programmable Gate Arrays (configurable after manufacturing)
- Application-Specific Integrated Circuits
- Heterogeneous Systems

A system with GPU and CPU is in a sense acts like a distributed system becoz CPU & GPU has its own memory

and also a single GPU processing resembles shared memory systems.

GPU-CPU Performance Comparison



CPUs and GPUs should be used together to suit different parts of your application.

Source: The Next Platform

In this course...

- Basic GPU Programming
  - Computation, Memory, Synchronization, Debugging
- Advanced GPU Programming
  - Streams, Heterogeneous computing, Case studies
- Topics in GPU Programming
  - Unified virtual memory, multi-GPU, peer access

Logistics

- Tutorials and lectures would be intermixed.
  - In-class problem solving sessions
- You need to arrange for your GPU.
  - Your laptop may have one.
  - With gmail account, you get some GPU time on Google cloud or kaggle (preferred by many in the past).
  - You can use the central computing facilities at the institute.

Logistics

- **Evaluation**
  - Four assignments (10 + 15 + 15 + **20**)
  - MidSem (20) + EndSem (20)
  - Dates are on the course webpage.
  - You have this week to suggest changes to dates.
- **Moodle**
  - Your responsibility to subscribe to it.
  - Exams would be pen-paper based, open-book.
  - Assignments are to be submitted on moodle.

Reasons for Dropping the Course

- The instructor is strict about attendance. Does not shy giving W grades.
- The course-load is high compared to many other courses in the insti.
- There will be plagiarism checks on the submitted codes. Your grades will be reduced by two grades (S to B, D to U) for copying or for sharing your code or referred to DisCo.
- The assignment deadlines are not extended even when your real brother is getting married (except for specific certified health issues or if you represent IITM in an approved competition).
- The instructor does not cancel the 8 o'clock class.