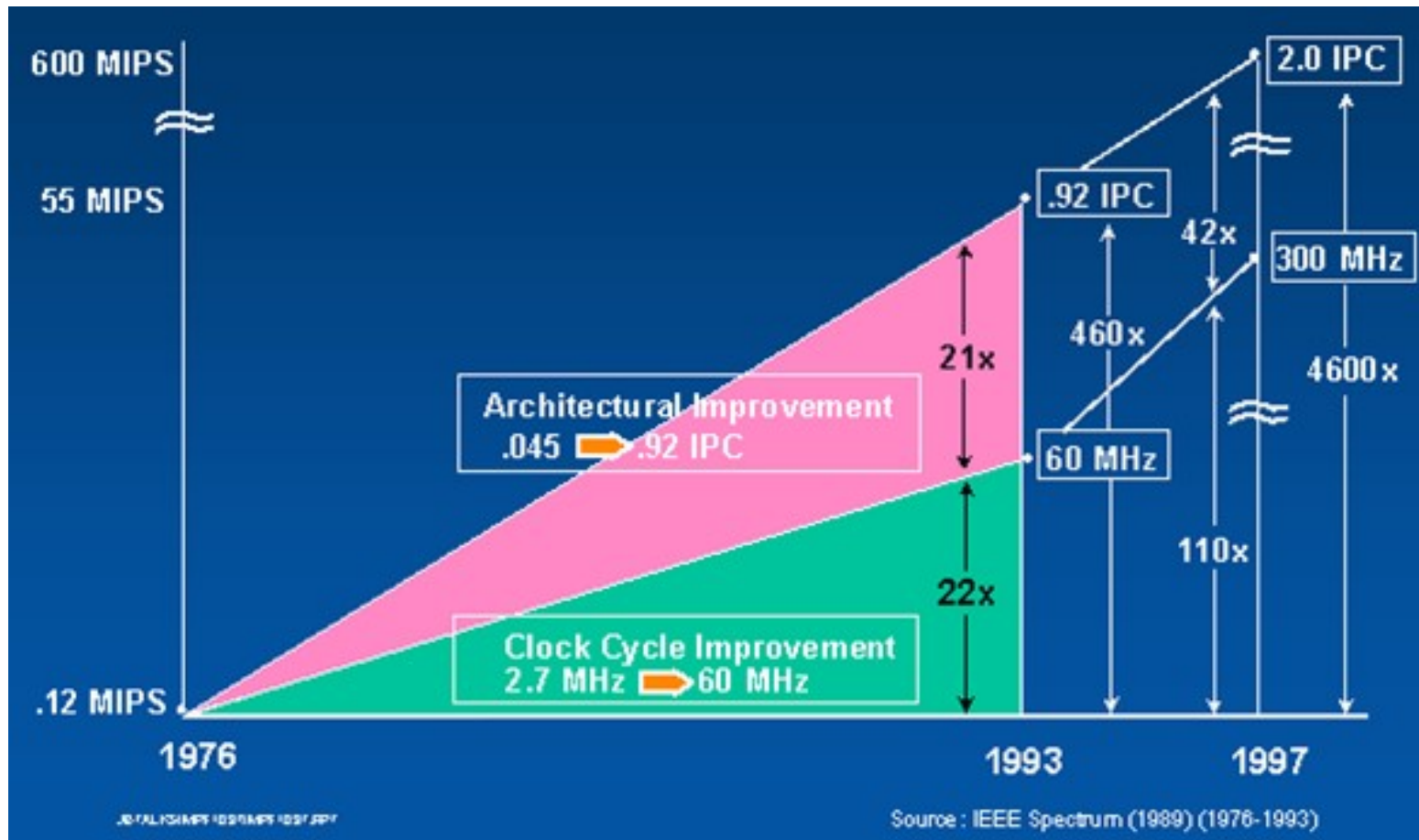


# CUDA Programming

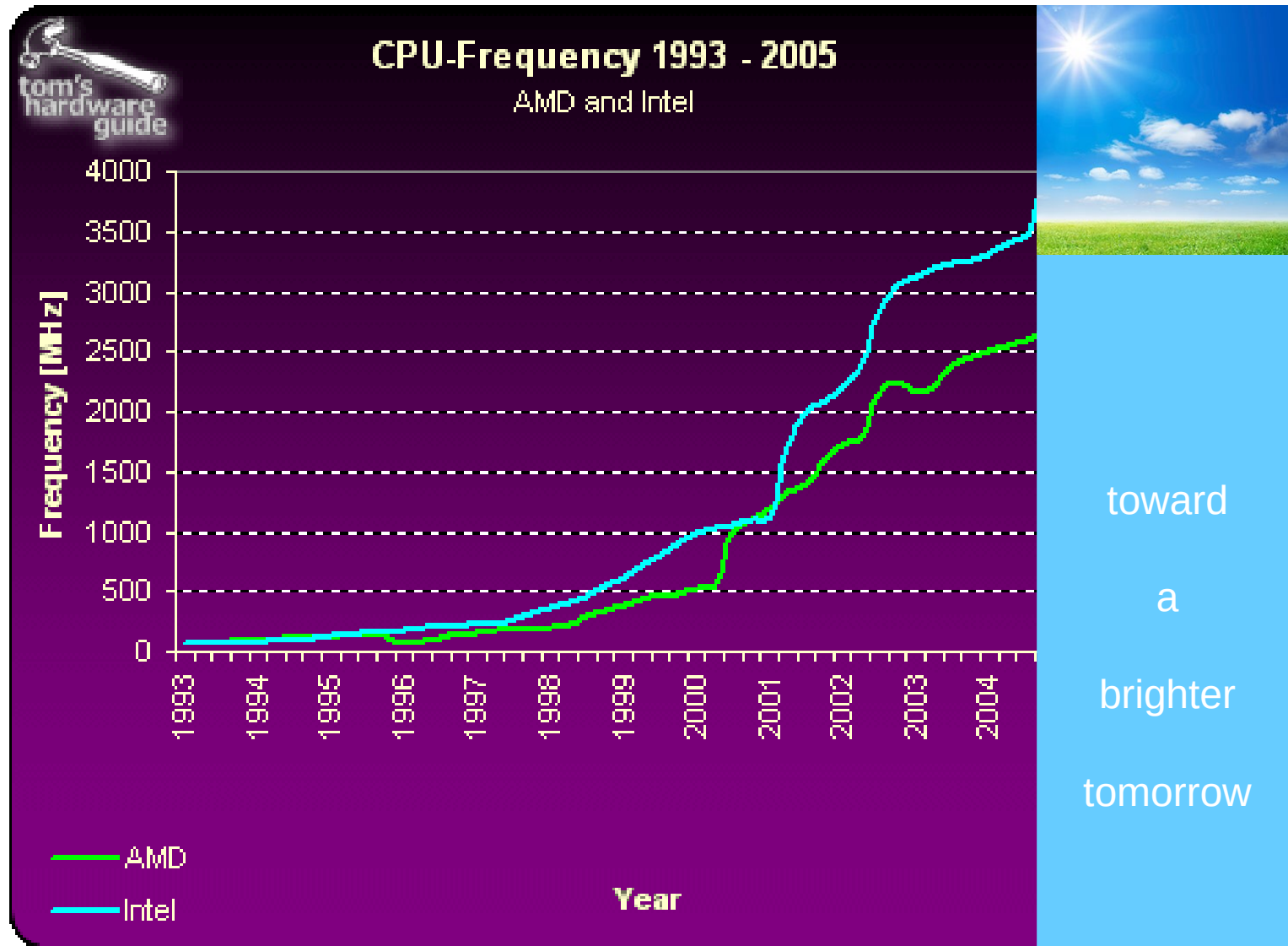
# The Good Old Days for Software

Source: J. Birnbaum



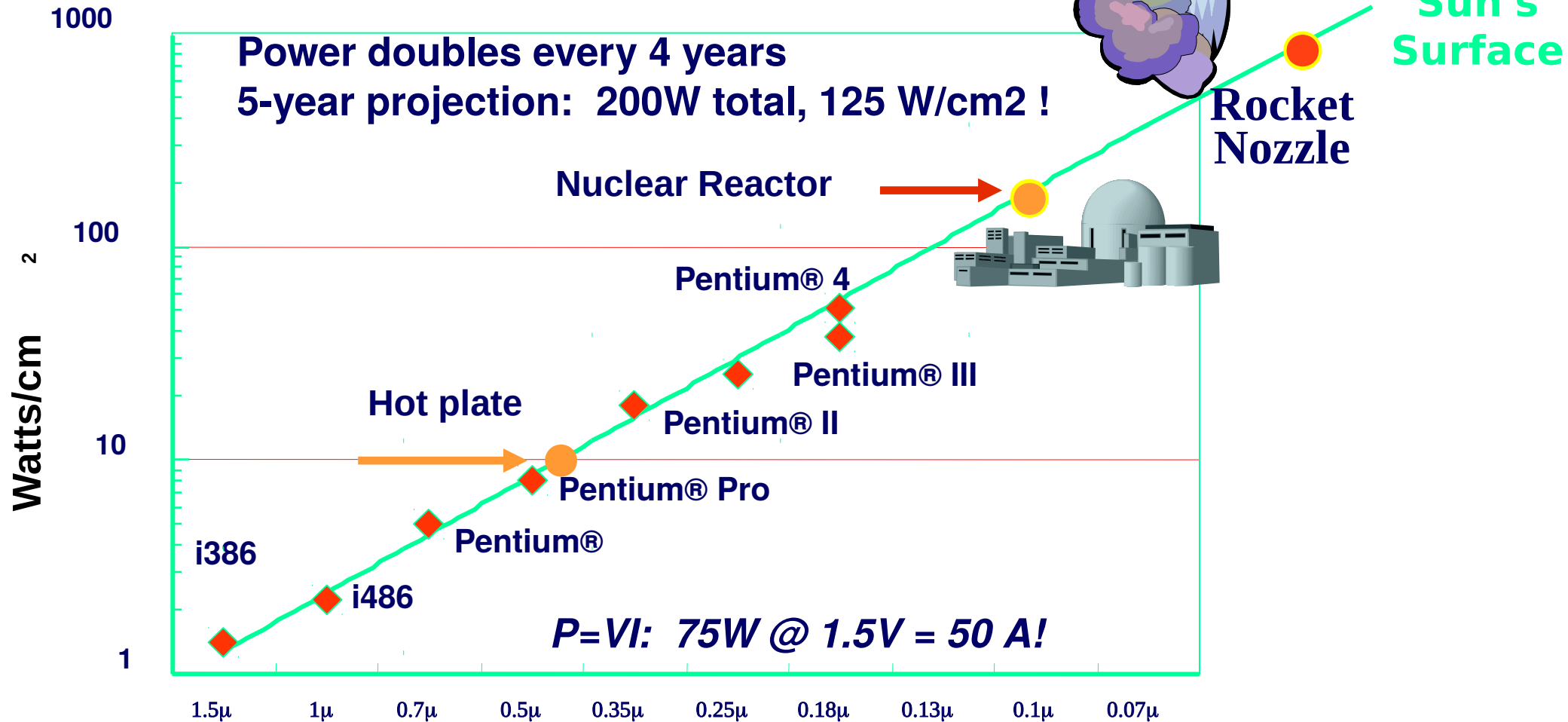
- Single-processor performance experienced dramatic improvements from **clock**, and **architectural** improvement (Pipelining, Instruction-Level-Parallelism).
- Applications experienced **automatic** performance improvement.

# Hitting the Power Wall



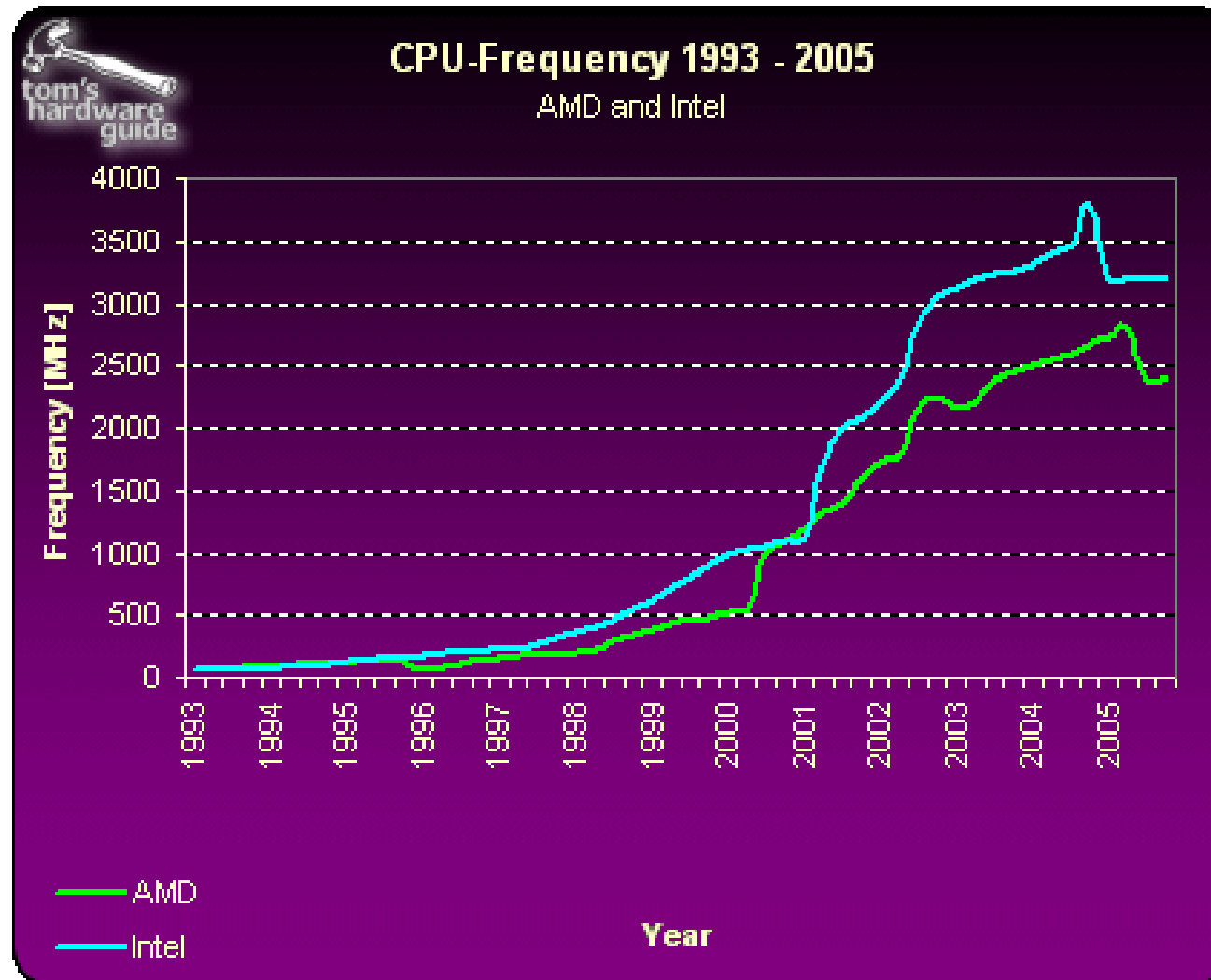
[http://img.tomshardware.com/us/2005/11/21/the\\_mother\\_of\\_all\\_cpu\\_charts\\_2005/cpu\\_frequency.gif](http://img.tomshardware.com/us/2005/11/21/the_mother_of_all_cpu_charts_2005/cpu_frequency.gif)

# Hitting the Power Wall



“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



[http://img.tomshardware.com/us/2005/11/21/the\\_mother\\_of\\_all\\_cpu\\_charts\\_2005/cpu\\_frequency.gif](http://img.tomshardware.com/us/2005/11/21/the_mother_of_all_cpu_charts_2005/cpu_frequency.gif)

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

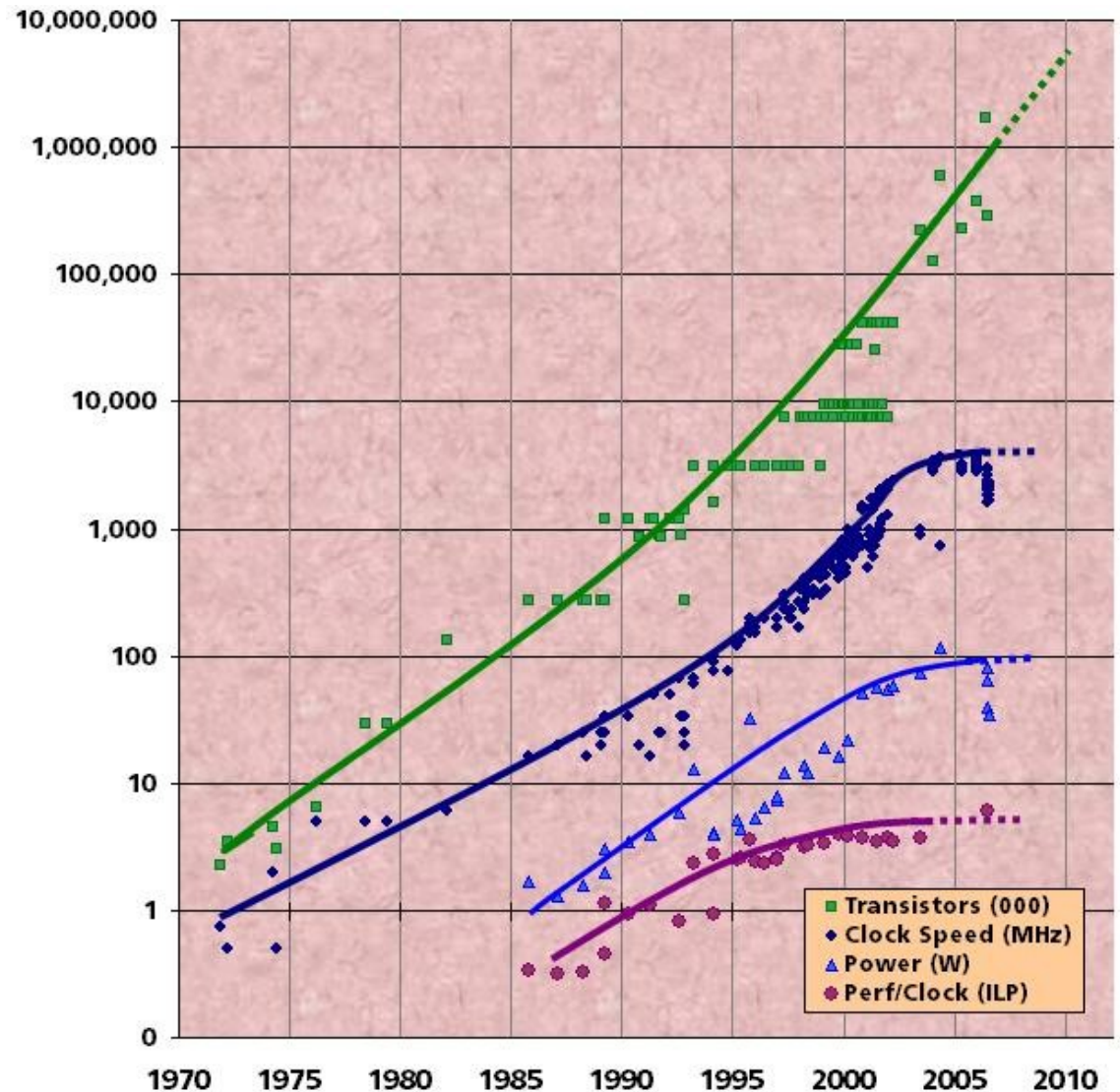
# The Only Option: Use Many Cores

Chip density is increasing by  
~2x every 2 years

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

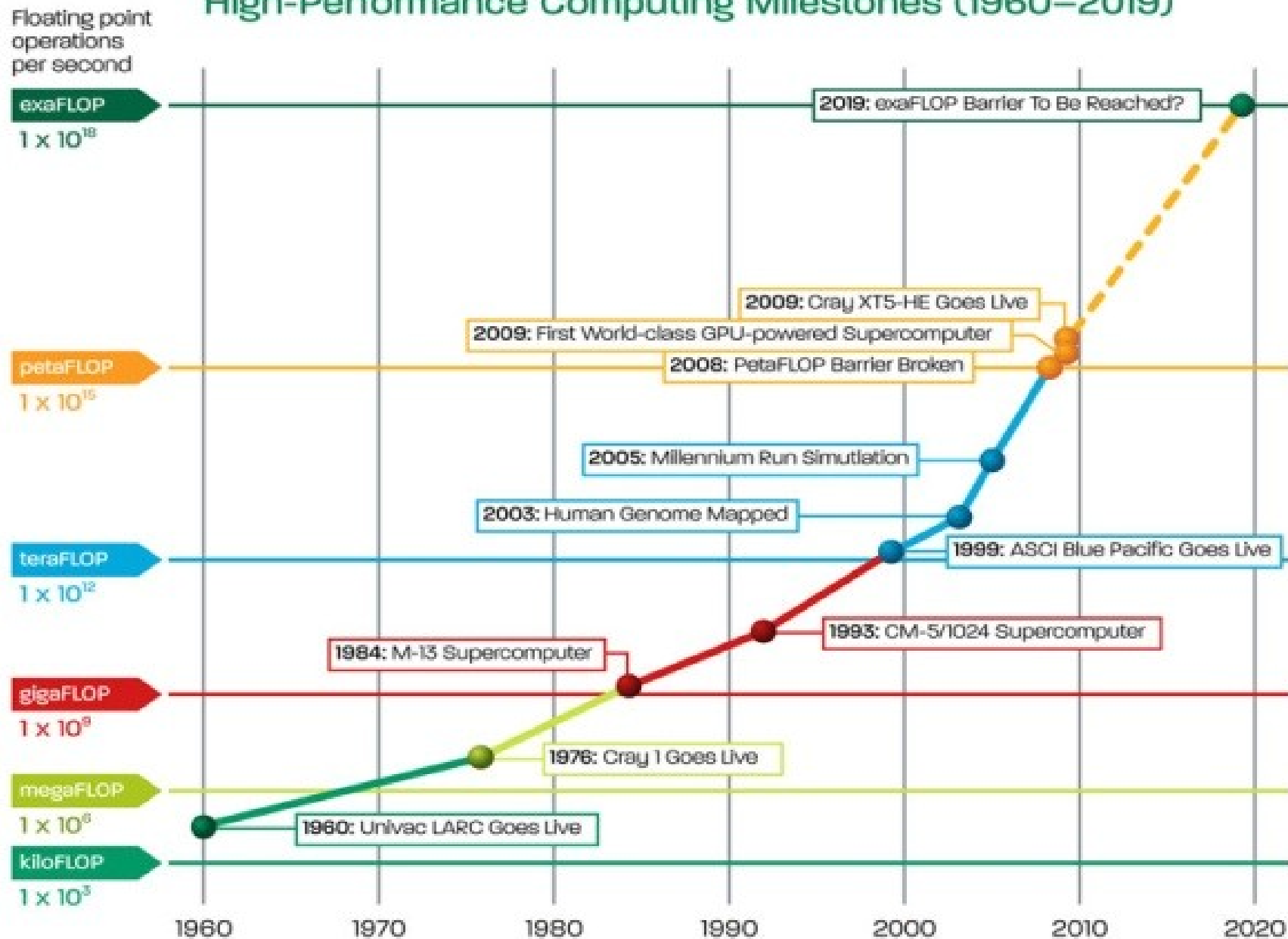
There is little or no more hidden parallelism (ILP) to be found

Parallelism must be exposed to and managed by software



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

## High-Performance Computing Milestones (1960–2019)

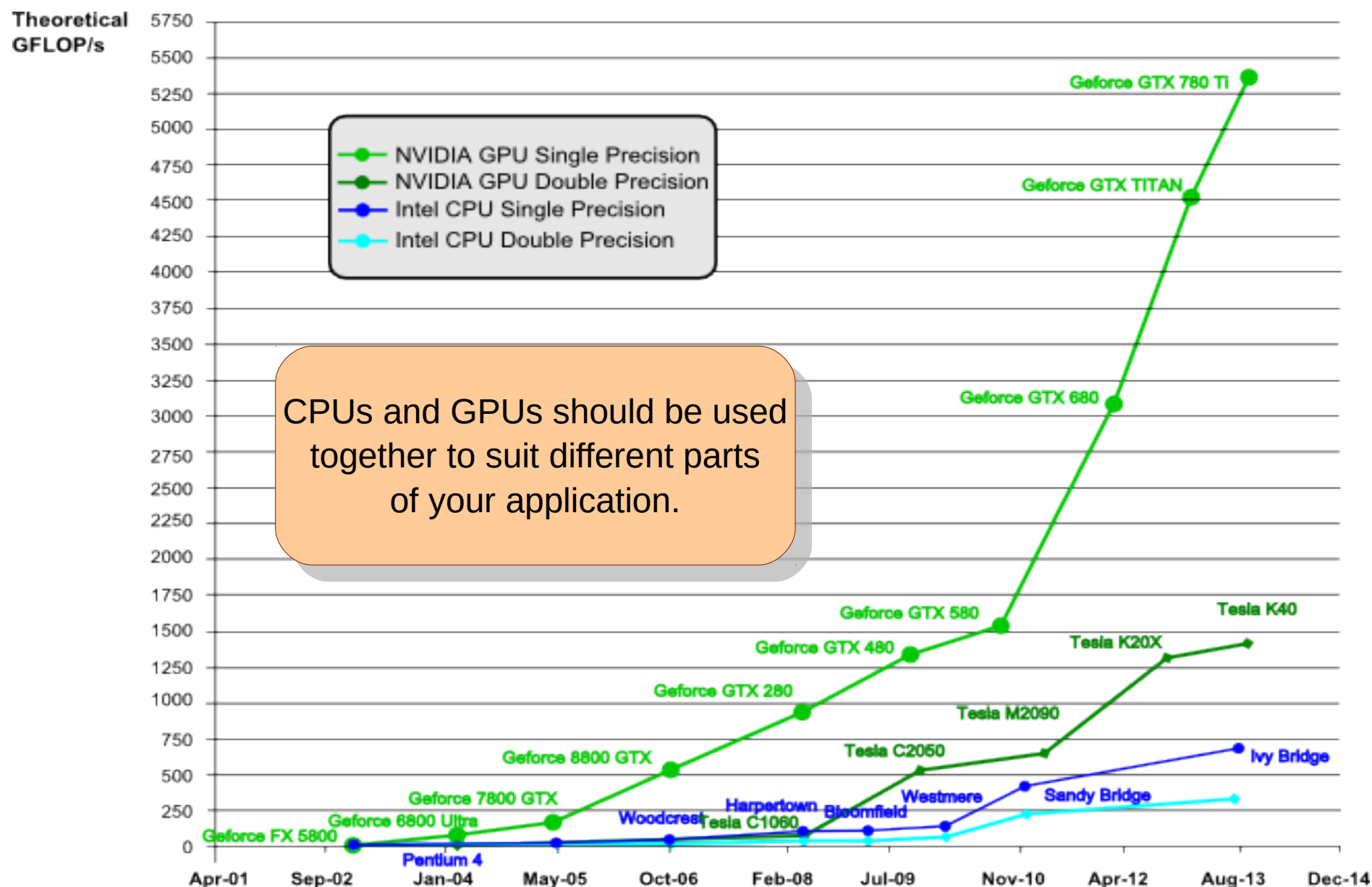


# Parallel Platforms

- Shared memory systems (multi-core)
- Distributed systems (cluster)
- Graphics Processing Units (many-core)
- Field-Programmable Gate Arrays (configurable after manufacturing)
- Application-Specific Integrated Circuits
- Heterogeneous Systems



# GPU-CPU Performance Comparison



# In this course...

- Basic GPU Programming
  - Computation, Memory, Synchronization, Debugging
- Topics in GPU Programming
  - Unified virtual memory, multi-GPU, peer access

# Logistics

- You need to arrange for your GPU.
  - Your laptop may have one.
  - With gmail account, you get some GPU time on Google colab.
  - You can use the central computing facilities at your institute.