



UNIVERSIDAD DEL BÍO-BÍO
FACULTAD DE CIENCIAS EMPRESARIALES

Heterogeneous Architectures

Heterogeneous Computing

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Course Webpage: <http://www.face.ubiobio.cl/~jfuentes/classes/ch>

Contents

- History of processors
- The rise of Heterogenous Systems
- Accelerators

History

- What are accelerators?
- Why is it important to learn to program different architectures?
- Why is it important to optimize our programs?

History

- Software and performance optimization was common since the computing resources were limited.
- A lot of programs simply would not run without being fully optimized.

IBM System/360



Courtesy of [alihodza](#) on Flickr.
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Launched: 1964
Clock rate: 33 KHz
Data path: 32 bits
Memory: 524 Kbytes
Cost: \$5,000/month

DEC PDP-11



Courtesy of [jonrb](#) on Flickr.
Used under CC-BY-NC.

Launched: 1970
Clock rate: 1.25 MHz
Data path: 16 bits
Memory: 56 Kbytes
Cost: \$20,000

Apple II

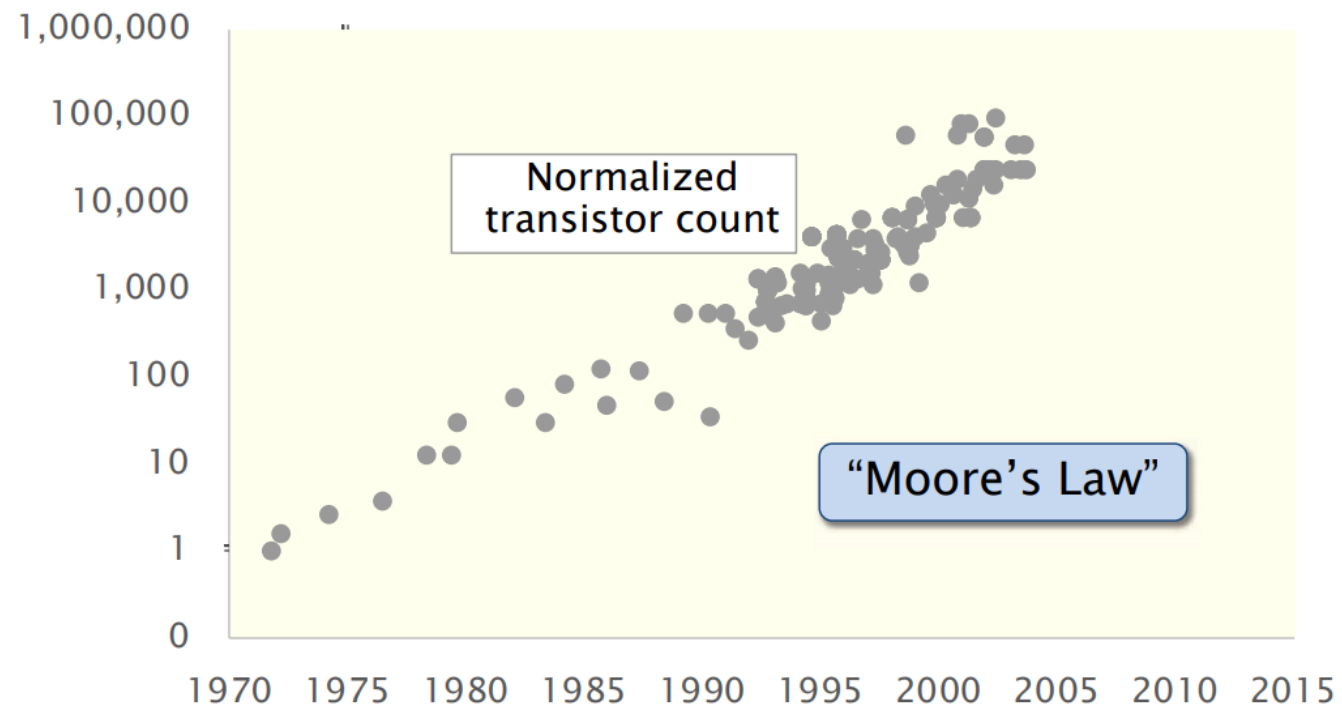


Courtesy of [mwichary](#) on Flickr.
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Launched: 1977
Clock rate: 1 MHz
Data path: 8 bits
Memory: 48 Kbytes
Cost: \$1,395

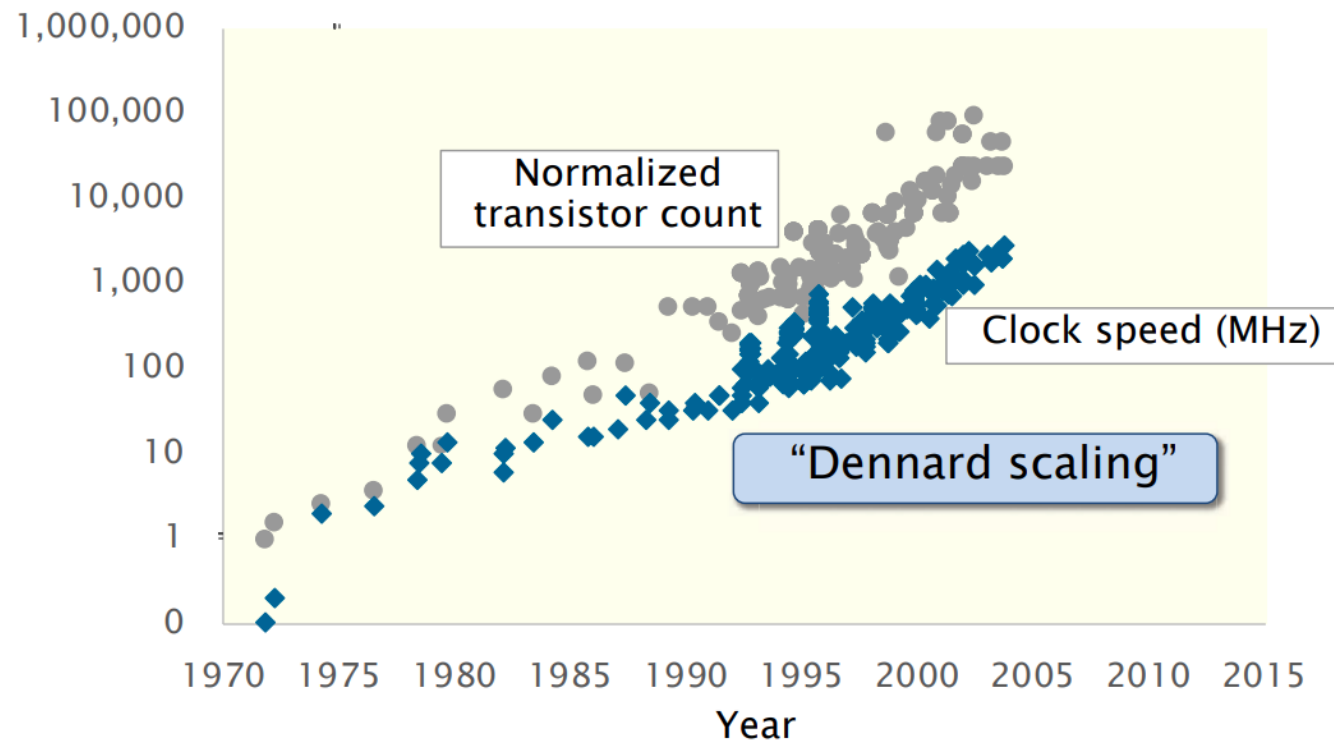
History

- Moore's law: the number of transistors inside a microchip doubles every two years.
- Data up to 2004:



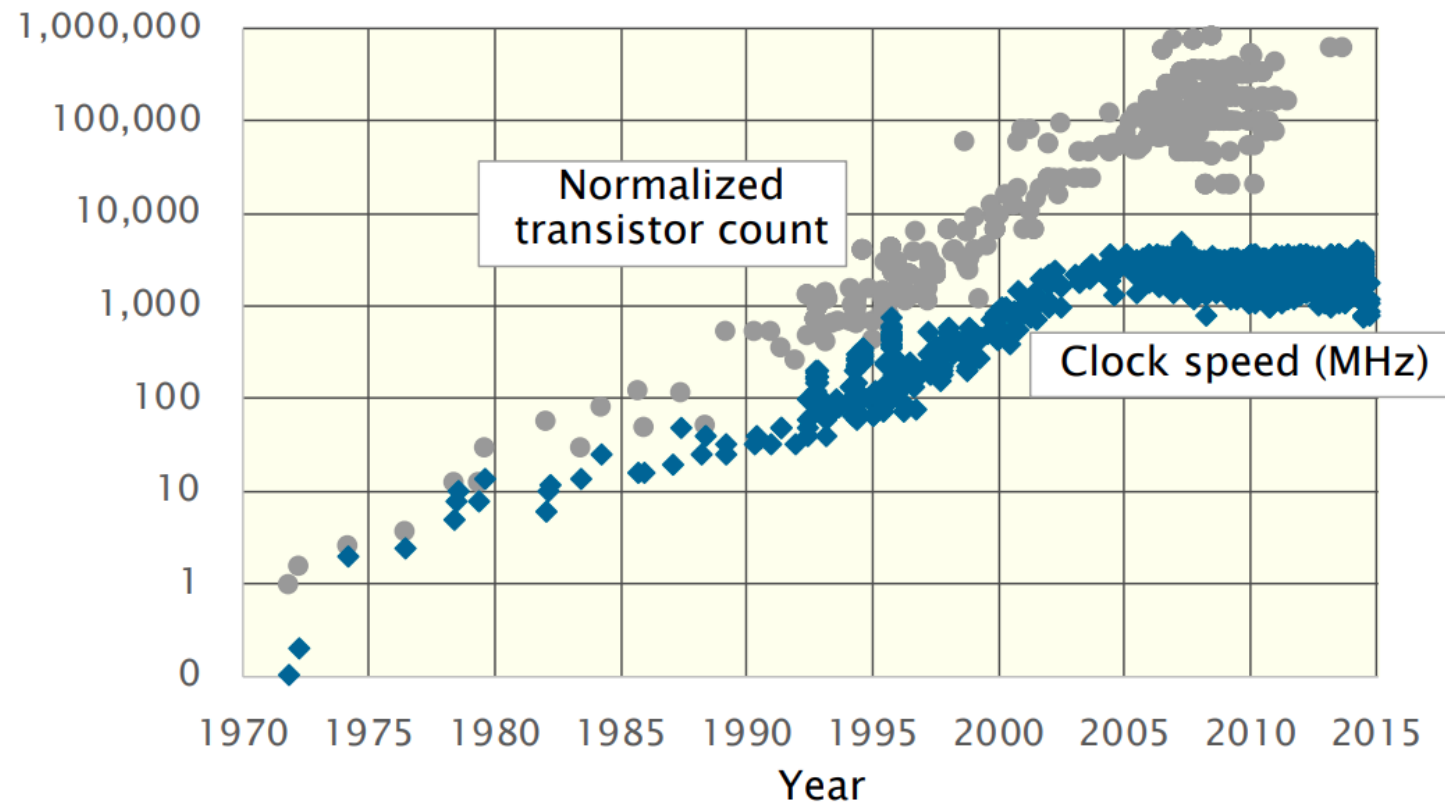
History

- Dennard scaling
- Data up to 2004



History

- Since 2004:



History

- Power density

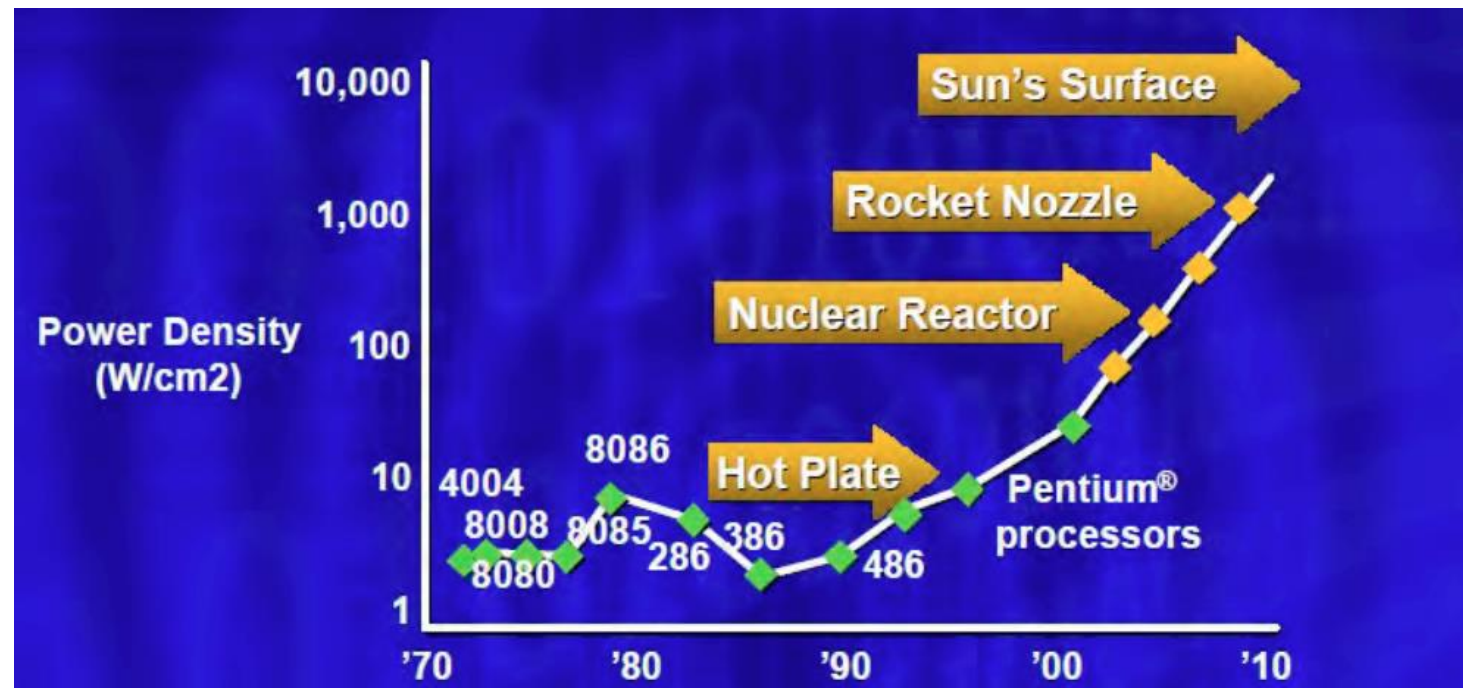
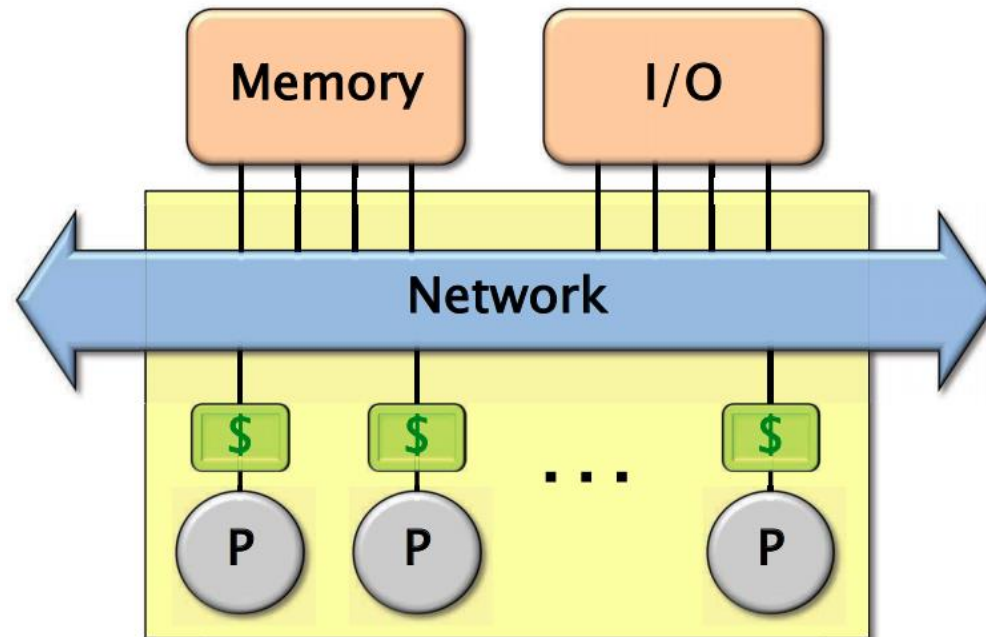


Chart courtesy : Pat Gelsinger, Intel Developer Forum, 2004

- Power density increase if the growth in frequency would have kept its incremental trend of 25-30% each year.

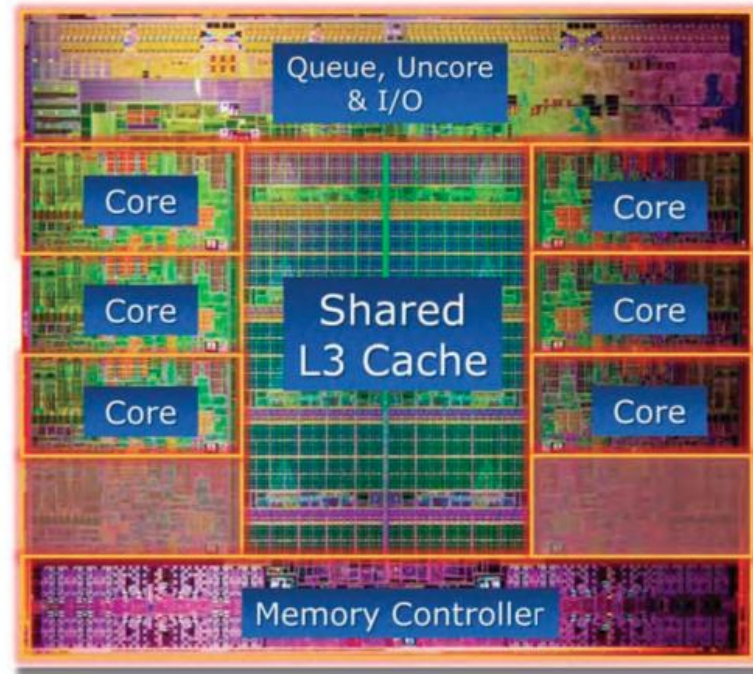
History

- Industry solution: Multi-core



History

- Industry solution: Multi-core



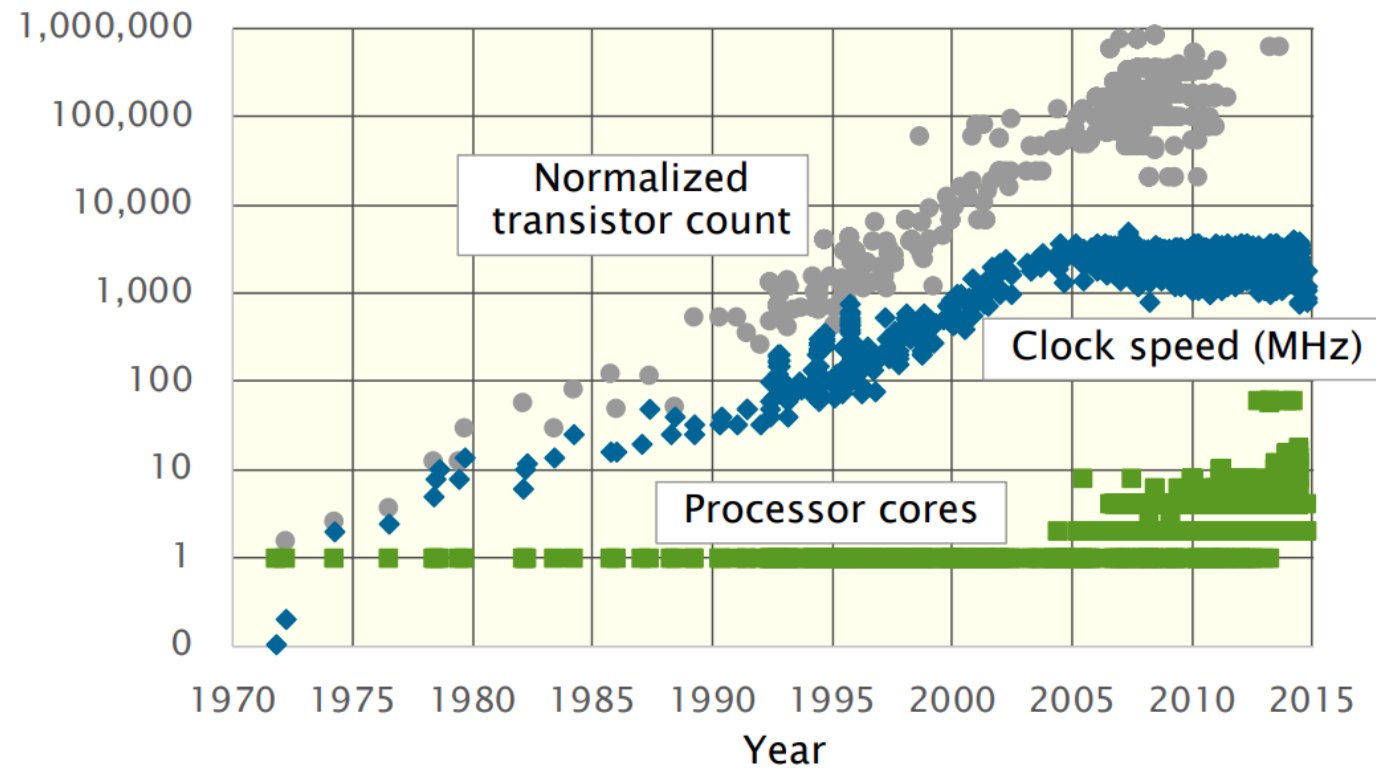
Intel Core i7 3960X (Sandy Bridge), 2011

- 6 cores
- 3.3 GHz
- 15 MB cache L3

- In order to scale up performance, manufacturers added more processing cores inside the processor

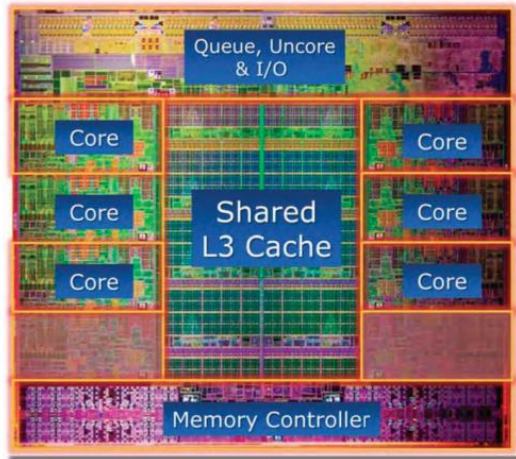
History

- Industry solution: Multi-core



Heterogeneous Computing

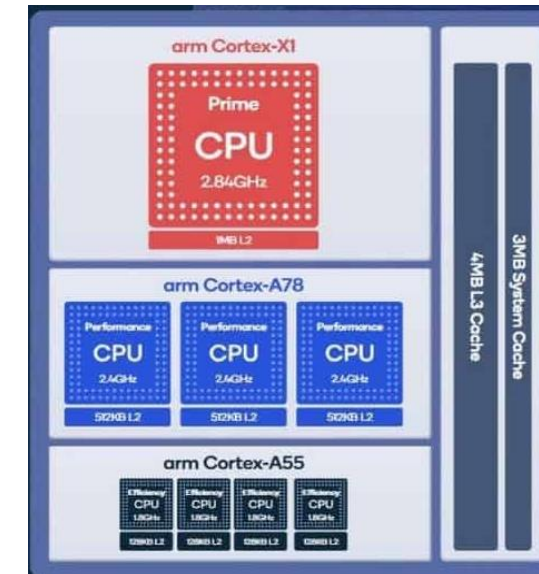
- Nowadays Moore's law keeps increasing the computers' performance.
- However, now architectures have small and large multi-core processors, complex memory hierarchy, vector processor units, GPUs, FPGAs, IA units, etc.



Intel Core i7



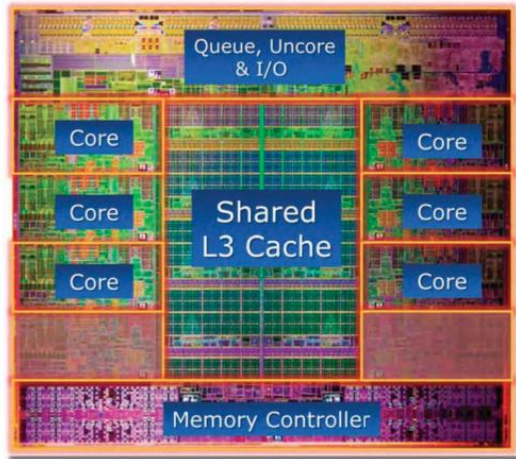
GPU Nvidia RTX 3080



Qualcomm Snapdragon 888 (ARM)

Heterogeneous Computing

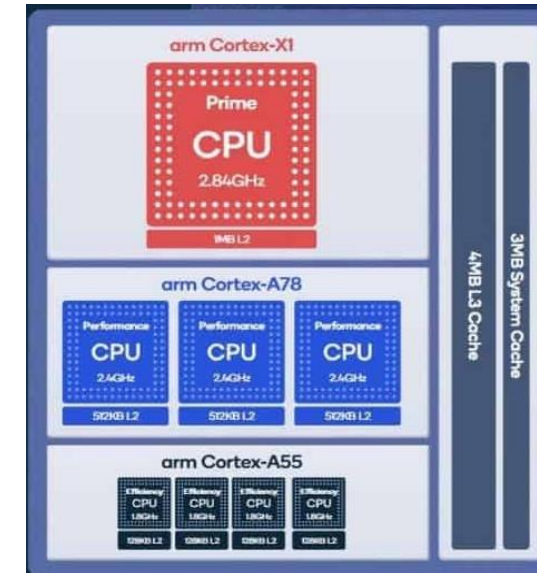
- Software must be adapted to fully use this hardware efficiently



Intel Core i7



GPU Nvidia GT200



Qualcomm Snapdragon 888 (ARM)

Heterogeneous Computing

- Heterogeneous architecture in a smartphone

The screenshot shows the 'Benchmarks' app interface. At the top, there's a blue header with 'Benchmarks' and tabs for 'CPU', 'COMPUTE', and 'BATTERY'. Below this, a section titled 'YOUR DEVICE' lists specifications: Model (OnePlus 5T), OS (Android 9), and CPU (Qualcomm MSM8998 Snapdragon 835). A green box highlights the 'Cluster' section, which shows 'Cluster 1' with '4 Cores @ 1.90 GHz' and 'Cluster 2' with '4 Cores @ 2.46 GHz'. Below this, a 'CPU BENCHMARK' section explains the test and includes a 'RUN CPU BENCHMARK' button.

YOUR DEVICE	
Model	OnePlus 5T
OS	Android 9
CPU	Qualcomm MSM8998 Snapdragon 835
Cluster 1	4 Cores @ 1.90 GHz
Cluster 2	4 Cores @ 2.46 GHz

CPU BENCHMARK

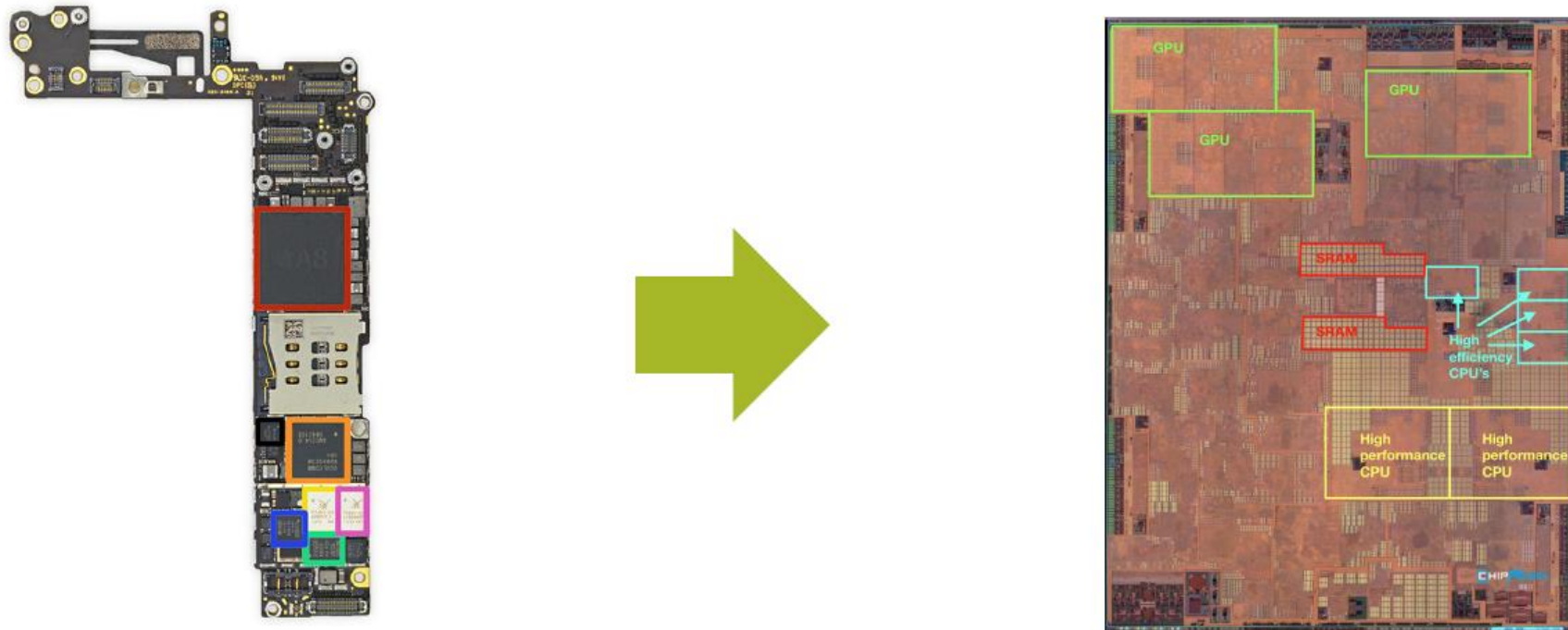
CPU Benchmark measures the performance of CPUs at performing everyday tasks using tests designed to simulate real-world applications. This benchmark takes from 2 to 20 minutes to complete.

[RUN CPU BENCHMARK](#)

8 cores, 2 levels of performance

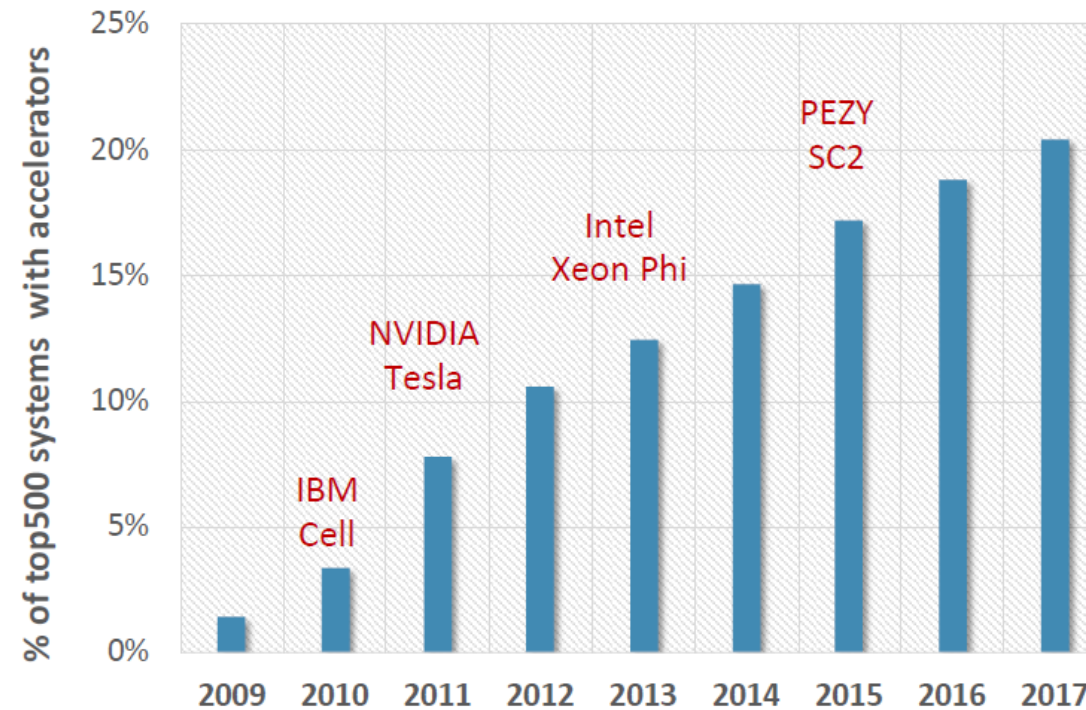
Heterogeneous Computing

- Heterogenous architecture in a smartphone



Heterogenous Computing

- Heterogenous accelerators in the world's most powerful systems



In this first unit we'll review:

- Memory hierarchy
- Heterogenous architectures
 - Multi-core CPUs
 - GPUs
 - FPGAs
 - TPUs (tensor processing unit)