

Introduction to Accelerated/Hybrid Computing with GPGPU Architectures

Carlos J. Barrios H., PhD

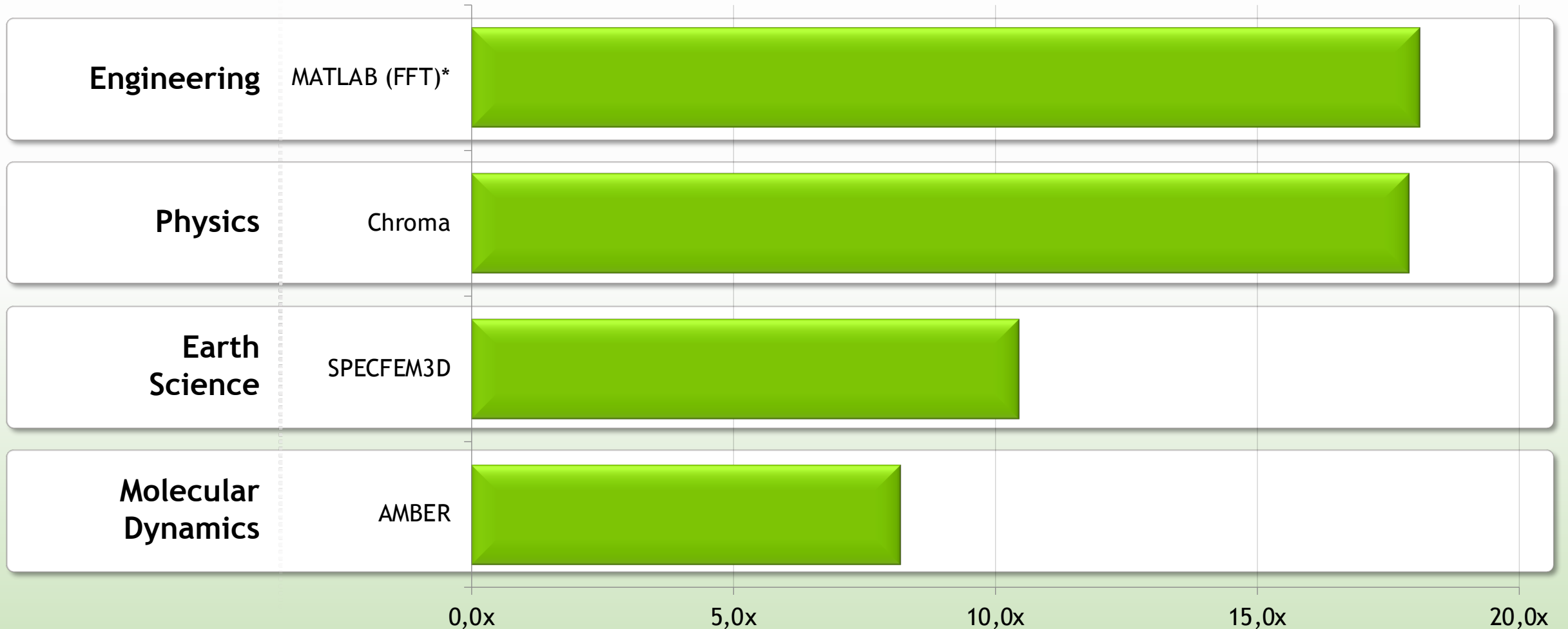
@carlosjaimebh

@SuperCCamp



Fastest Performance on Scientific Applications

Comparing Tesla K20X Speed-Up over Sandy Bridge CPUs



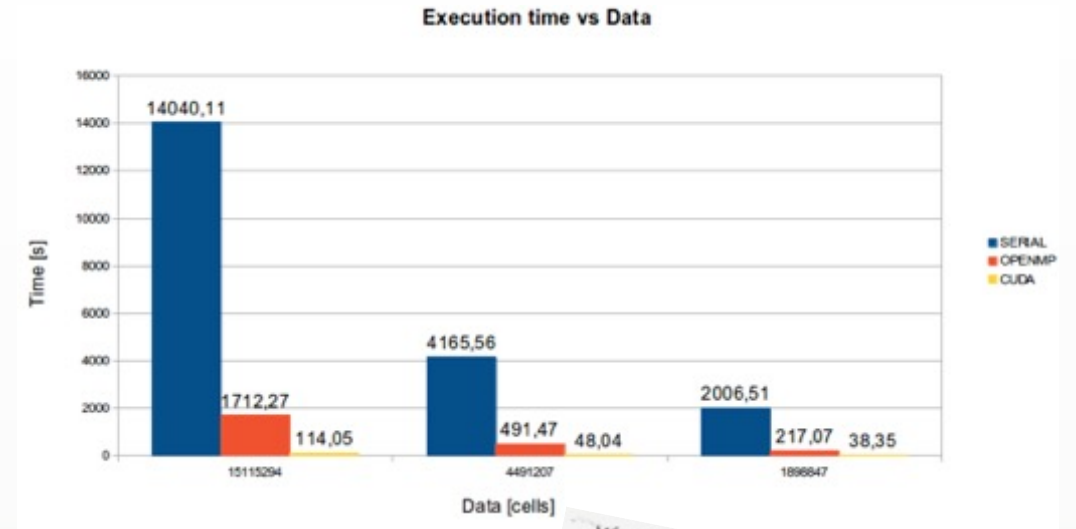
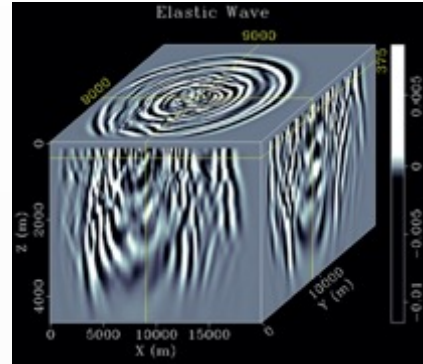
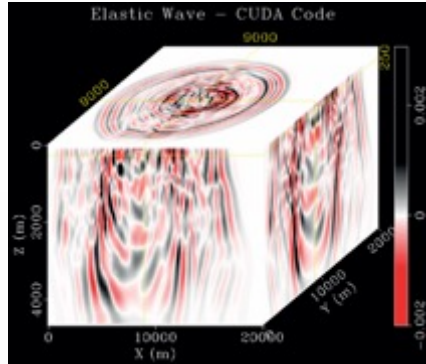
CPU results: Dual socket E5-2687w, 3.10 GHz, GPU results: Dual socket E5-2687w + 2 Tesla K20X GPUs

*MATLAB results comparing one i7-2600K CPU vs with Tesla K20 GPU

Disclaimer: Non-NVIDIA implementations may not have been fully optimized

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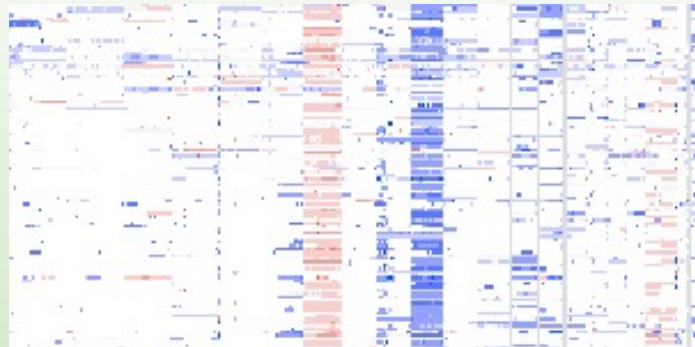
Interesting @SC3UIS Experiences



Super Computación y
Cálculo Científico UIS



Processing and Visualization for Oil Reservoirs (3D seismic modelling in isotropic and heterogeneous media)



For 10 Millions of bases

0. Original App 3 Months
1. App (3 Weeks)
2. App (2- Days)
3. App (4 Minutes)



Super Computación y
Cálculo Científico UIS



Processing Genomic Data for Mexican Flu AHN1 Discovering



About Top500 List -2021



Rank	System	Cores	Rmax (TFlop/s)	Rpeak (TFlop/s)	Power (kW)
1	Supercomputer Fugaku - Supercomputer Fugaku, A64FX 48C 2.2GHz, Tofu interconnect D, Fujitsu RIKEN Center for Computational Science Japan	7,630,848	442,010.0	537,212.0	29,899
2	Summit - IBM Power System AC922, IBM POWER9 22C 3.07GHz, NVIDIA Volta GV100, Dual-rail Mellanox EDR Infiniband, IBM DOE/SC/Oak Ridge National Laboratory United States	2,414,592	148,600.0	200,794.9	10,096
3	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	94,640.0	125,712.0	7,438
4	Sunway TaihuLight - Sunway MPP, Sunway SW26010 260C 1.45GHz, Sunway, NRCPC National Supercomputing Center in Wuxi China	10,649,600	93,014.6	125,435.9	15,371
5	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	70,870.0	93,750.0	2,589
6	Selene - NVIDIA DGX A100, AMD EPYC 7742 64C 2.25GHz, NVIDIA A100, Mellanox HDR Infiniband, Nvidia NVIDIA Corporation United States	555,520	63,460.0	79,215.0	2,646
7	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	61,444.5	100,678.7	18,482
8	JUWELS Booster Module - Bull Sequana XH2000 , AMD EPYC 7402 24C 2.8GHz, NVIDIA A100, Mellanox HDR InfiniBand/ParTec ParaStation ClusterSuite, Atos Forschungszentrum Juelich [FZJ] Germany	449,280	44,120.0	70,980.0	1,764
9	HPC5 - PowerEdge C4140, Xeon Gold 6252 24C 2.1GHz, NVIDIA Tesla V100, Mellanox HDR Infiniband, DELL EMC Eni S.p.A. Italy	669,760	35,450.0	51,720.8	2,252
10	Voyager-EUS2 - ND96amsr_A100_v4, AMD EPYC 7V12 48C 2.45GHz, NVIDIA A100 80GB, Mellanox HDR Infiniband, Microsoft Azure Azure East US 2 United States	253,440	30,050.0	39,531.2	

- 9/10 Powerful Machines are MPP Clusters
- 7/10 are Hybrid Machines with Accelerators
 - 5 NVIDIA GPU Technology
 - 3 Different Generations (Kepler, Pascal and Volta)
 - 2 Chinese PU's Technology
 - 1 Combines GPUs + MICs

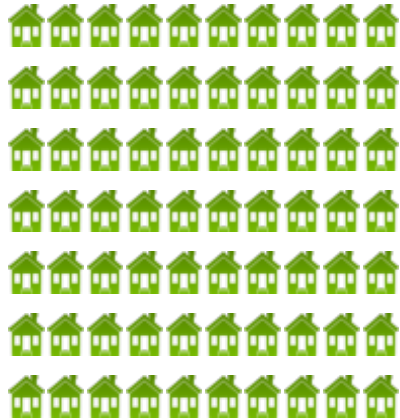
Why Computing Perf/Watt Matters?

2.3 PFlops



7.0 Megawatts

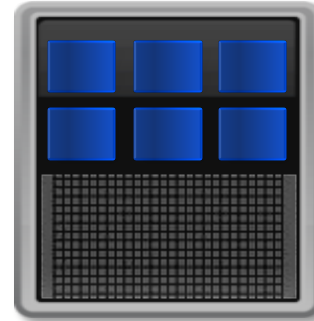
7000 homes



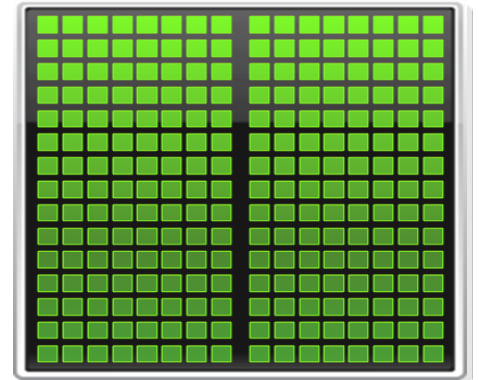
7.0 Megawatts

Traditional CPUs are
not economically feasible

CPU
Optimized for
Serial Tasks



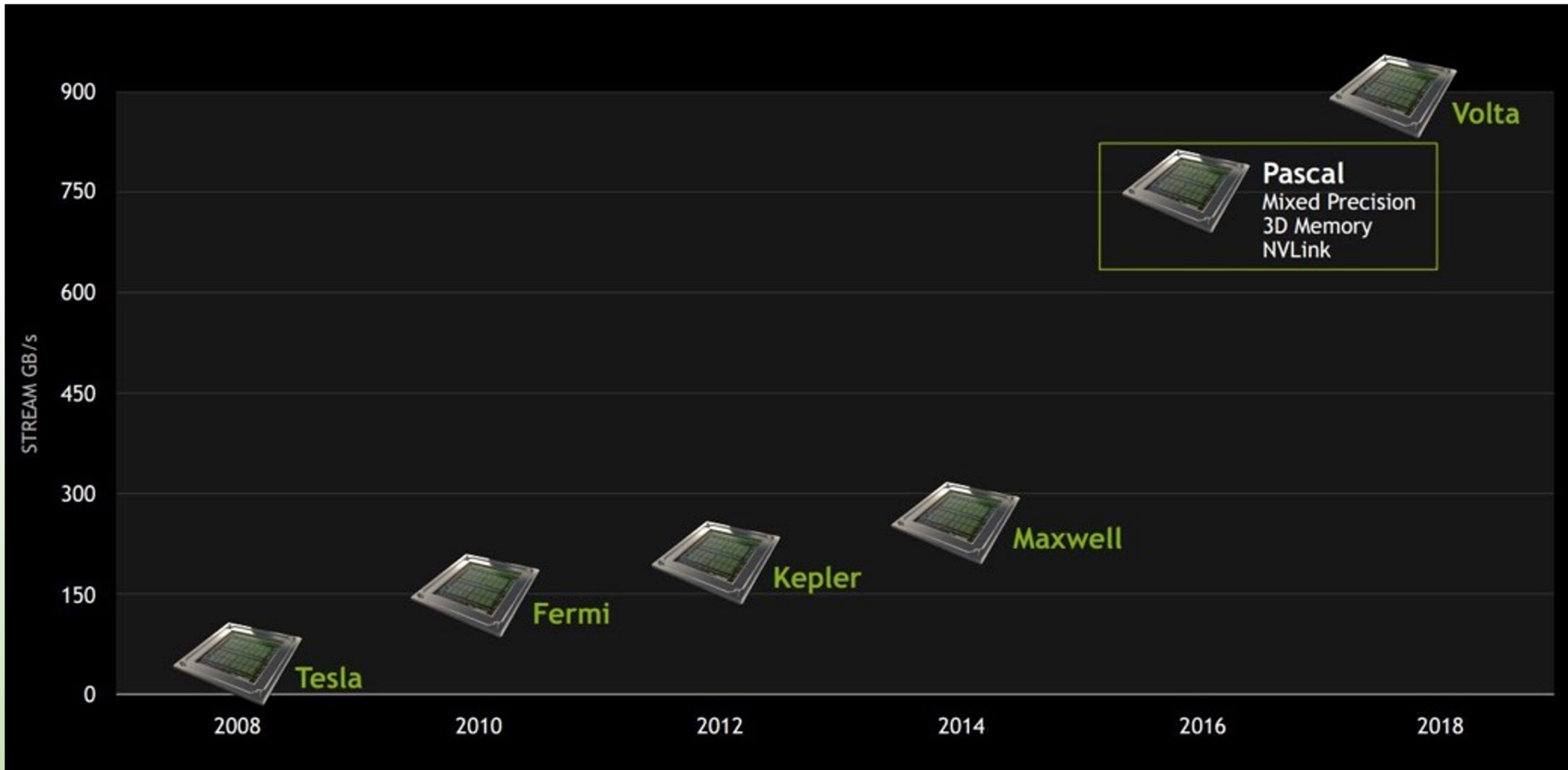
GPU Accelerator
Optimized for Many
Parallel Tasks



10x performance/socket
> 5x energy efficiency

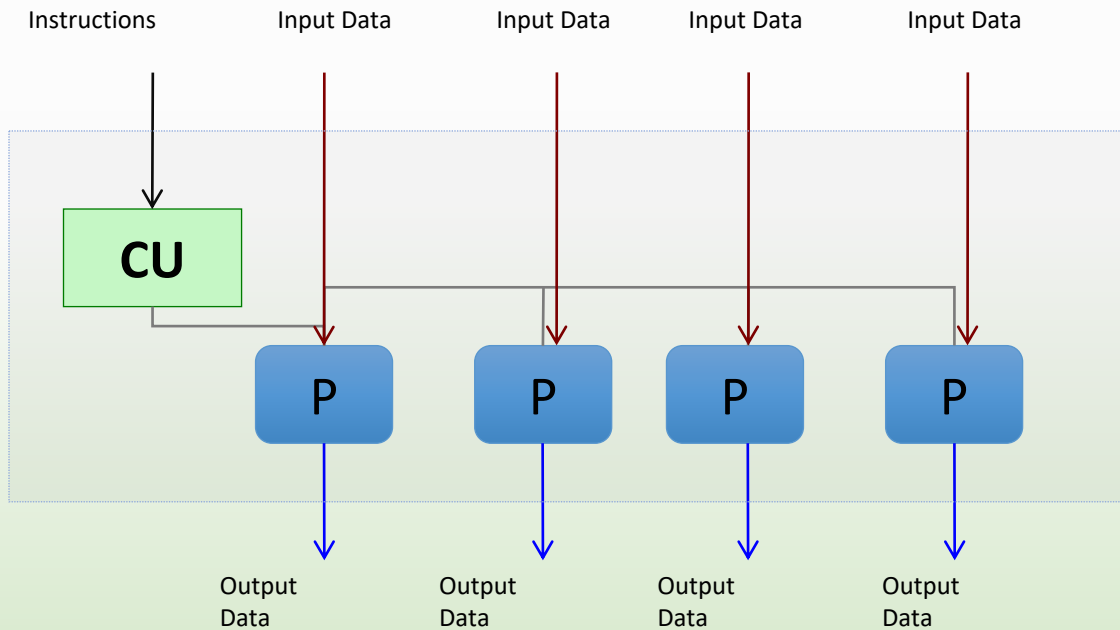
Era of GPU-accelerated computing is
here

10 Years NVIDIA GPUs Development



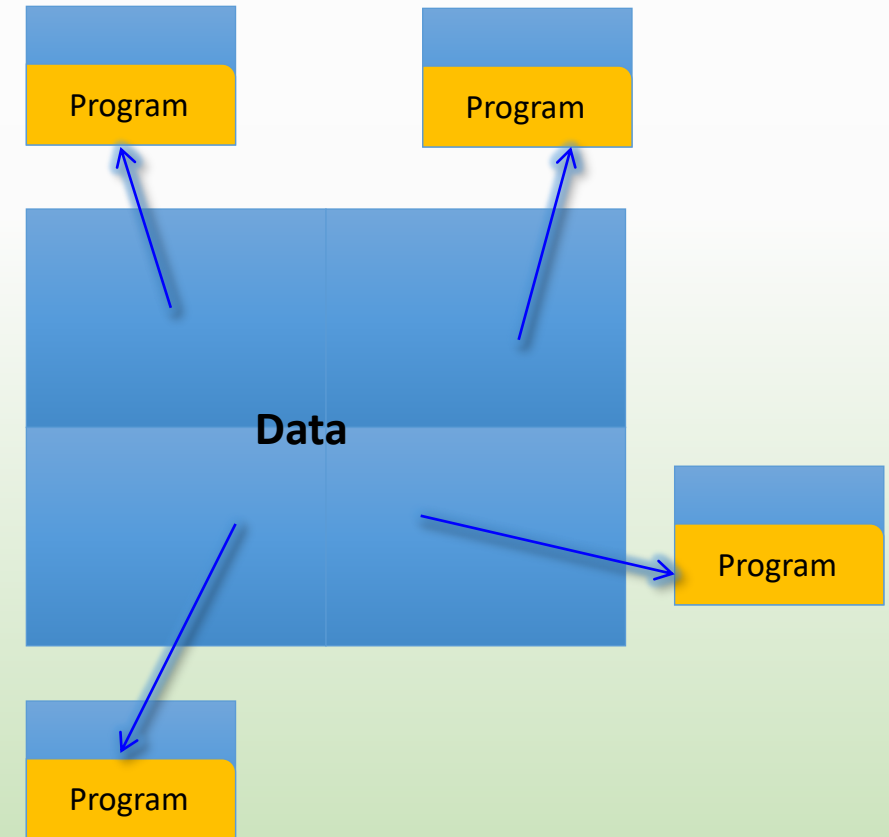
Remember Architectural Systems Facts (From Flynn's Taxonomy)

SPMD: Parallel Processing Units execute the same program on multiple parts of data



SIMD

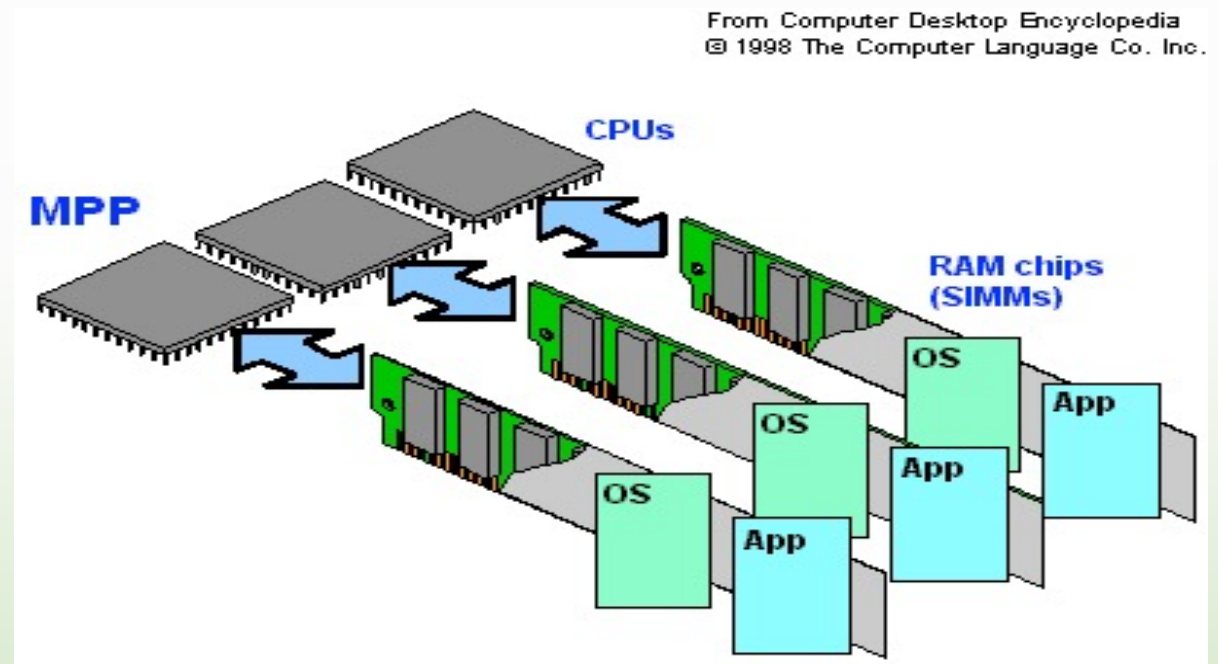
SIMD: All processors units are executing the same instructions in any instant.



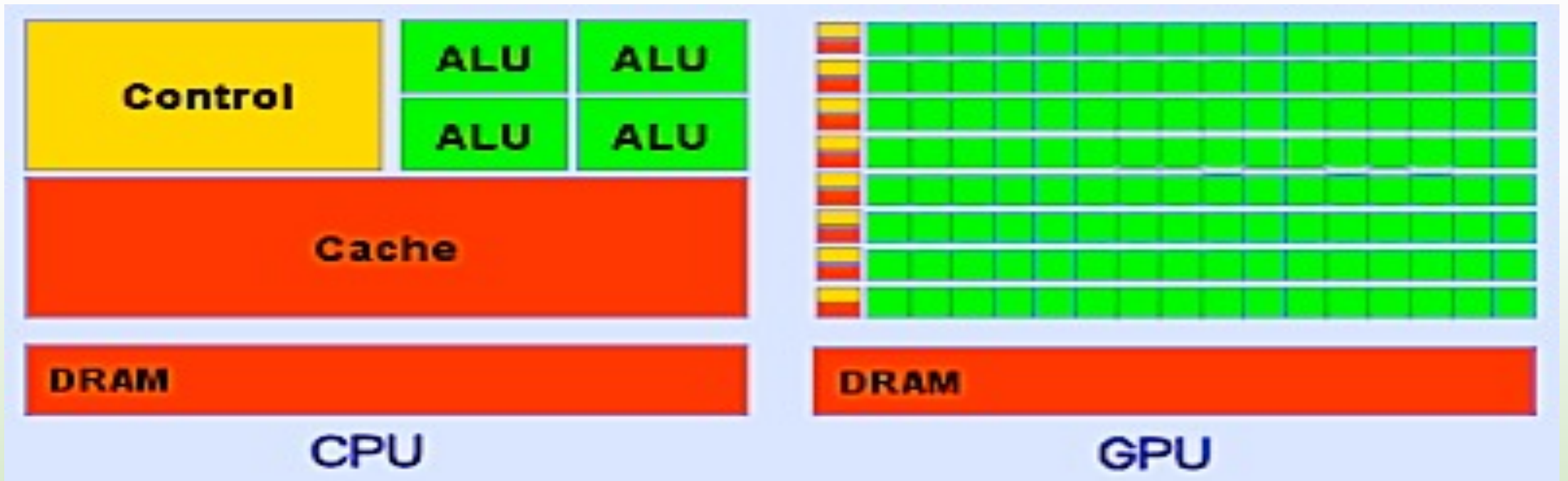
Processor

Massive Parallel Processing (MPP)

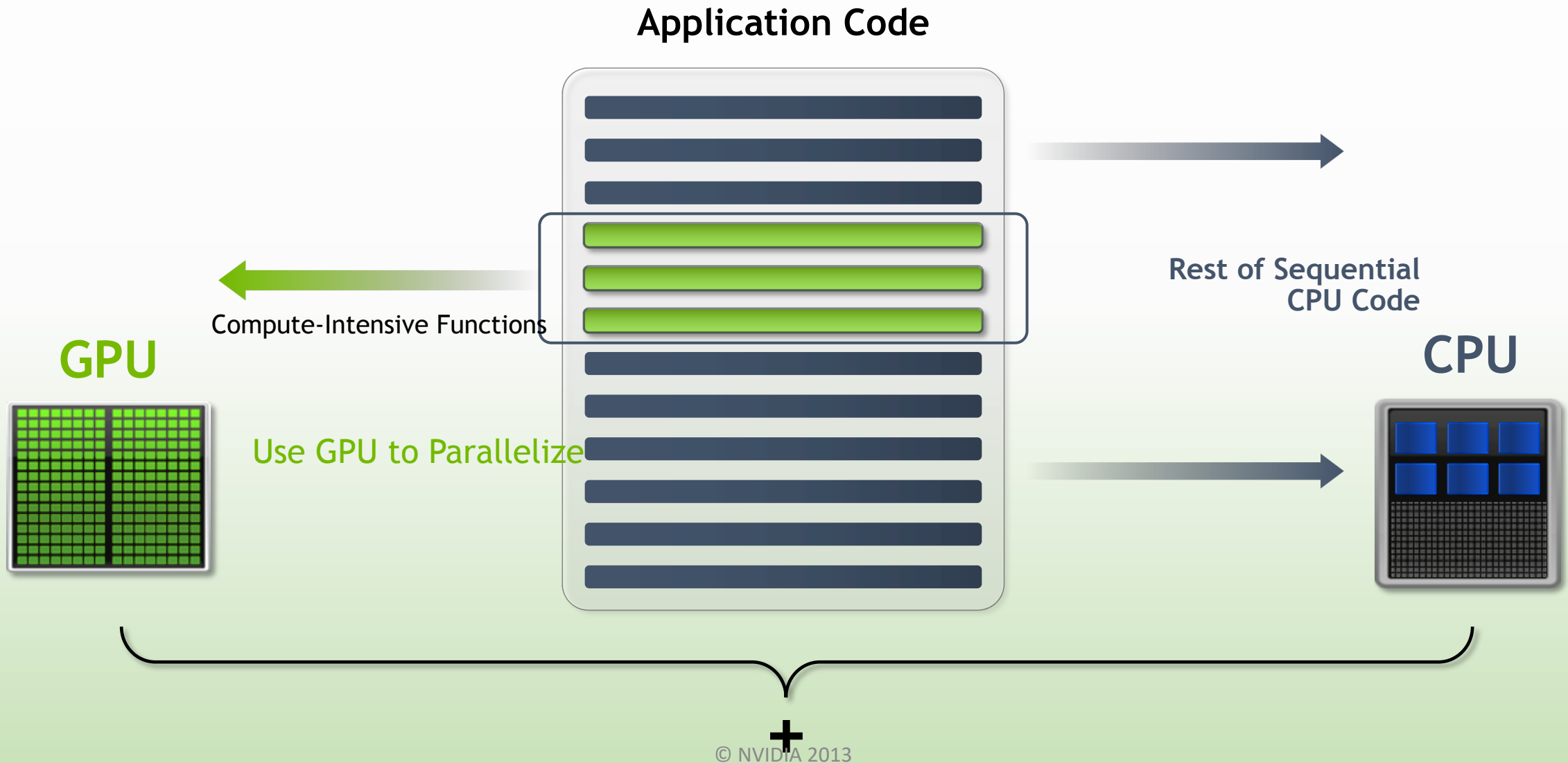
- Computer system with many independent arithmetic units or entire microprocessors, that run in parallel
- MPPA is a MIMD (Multiple Instruction streams, Multiple Data) architecture, with distributed memory accessed locally, not shared globally



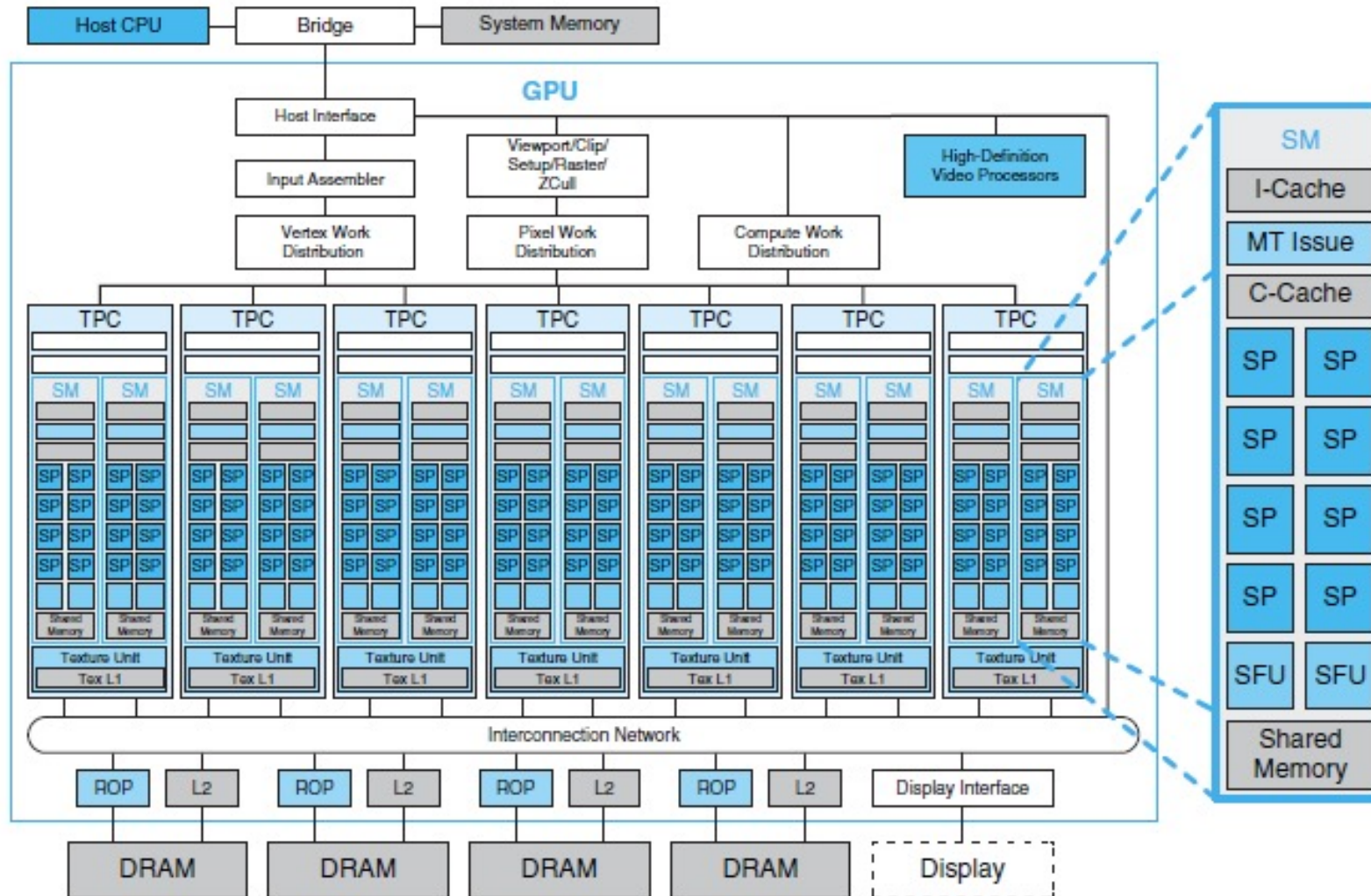
CPUs and GPUs Architecture



Small Changes, Big Speed-up



NVIDIA TESLA® Architecture



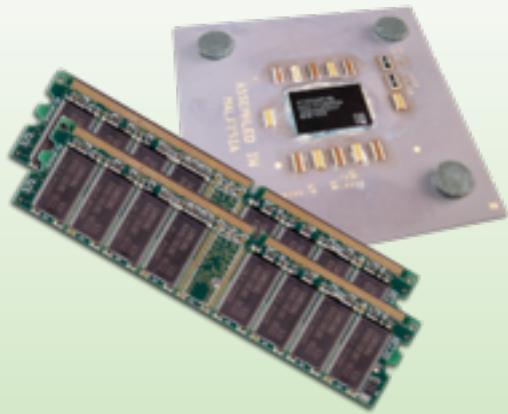
NVIDIA TESLA™ Graphics and Computing Architecture Features

- TESLA™ shader processors are fully programmable
 - Large instructions memory
 - Cache Instructions
 - Logic Sequence Instructions
- TESLA™ to non-graphics programs:
 - Hierarchical Parallel Threads
 - Barrier Synchronization
 - Atomic Operators (Manage Highly Parallel Computing Work)

Heterogeneous Computing

Terminology

- ***Host*** The CPU and its memory (host memory)
- ***Device*** The GPU and its memory (device memory)



Host



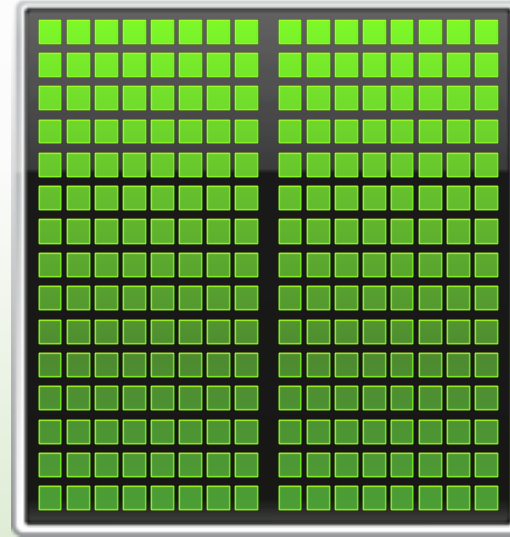
Device

GPGPU Accelerate Computing

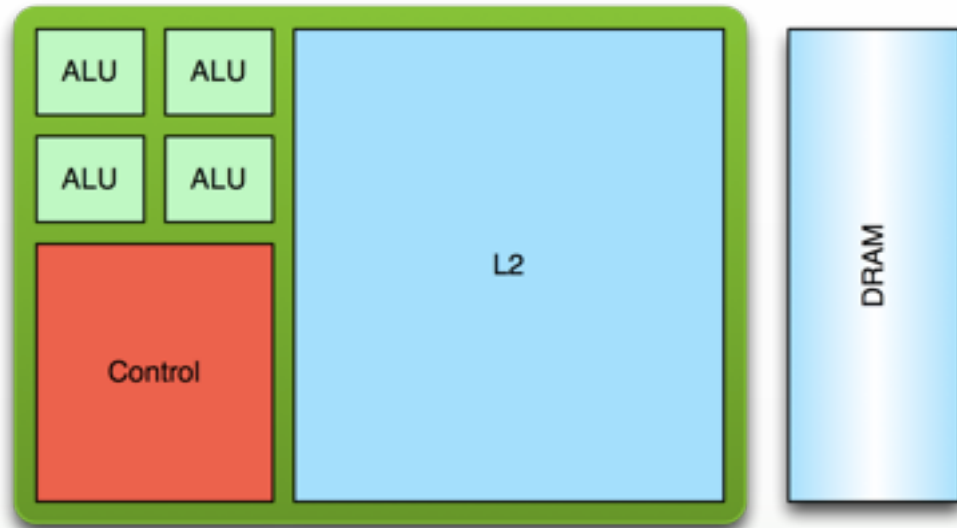
Latency Processor + Throughput processor



+

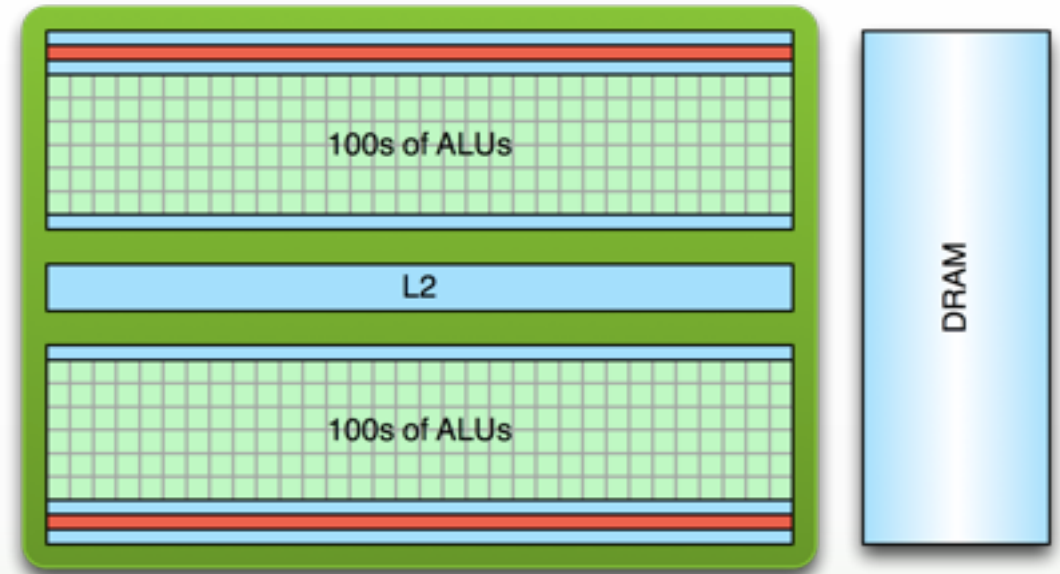


Low Latency or High Throughput?



CPU

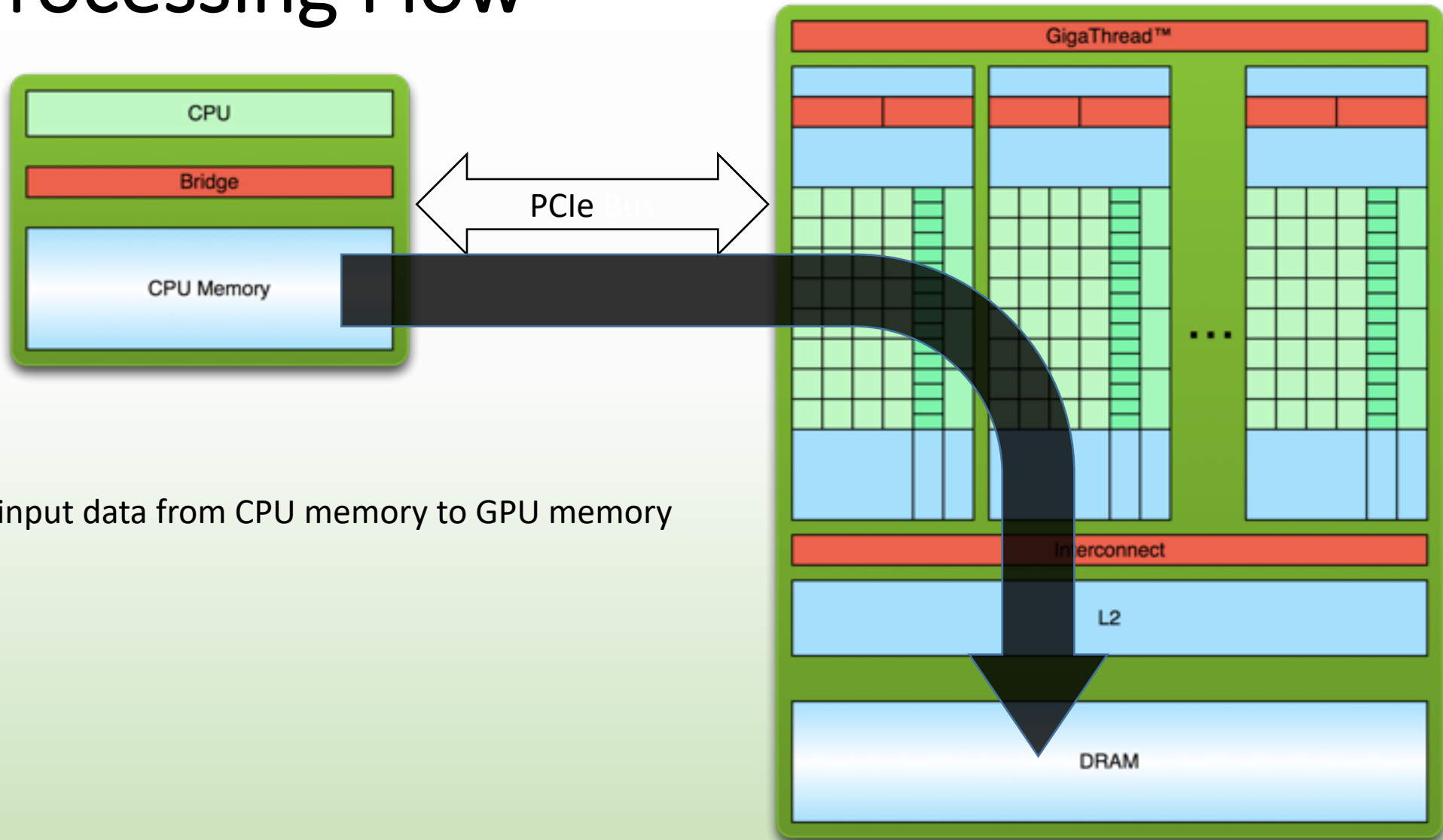
- Optimized for low-latency access to cached data sets
- Control logic for out-of-order and speculative execution



GPU

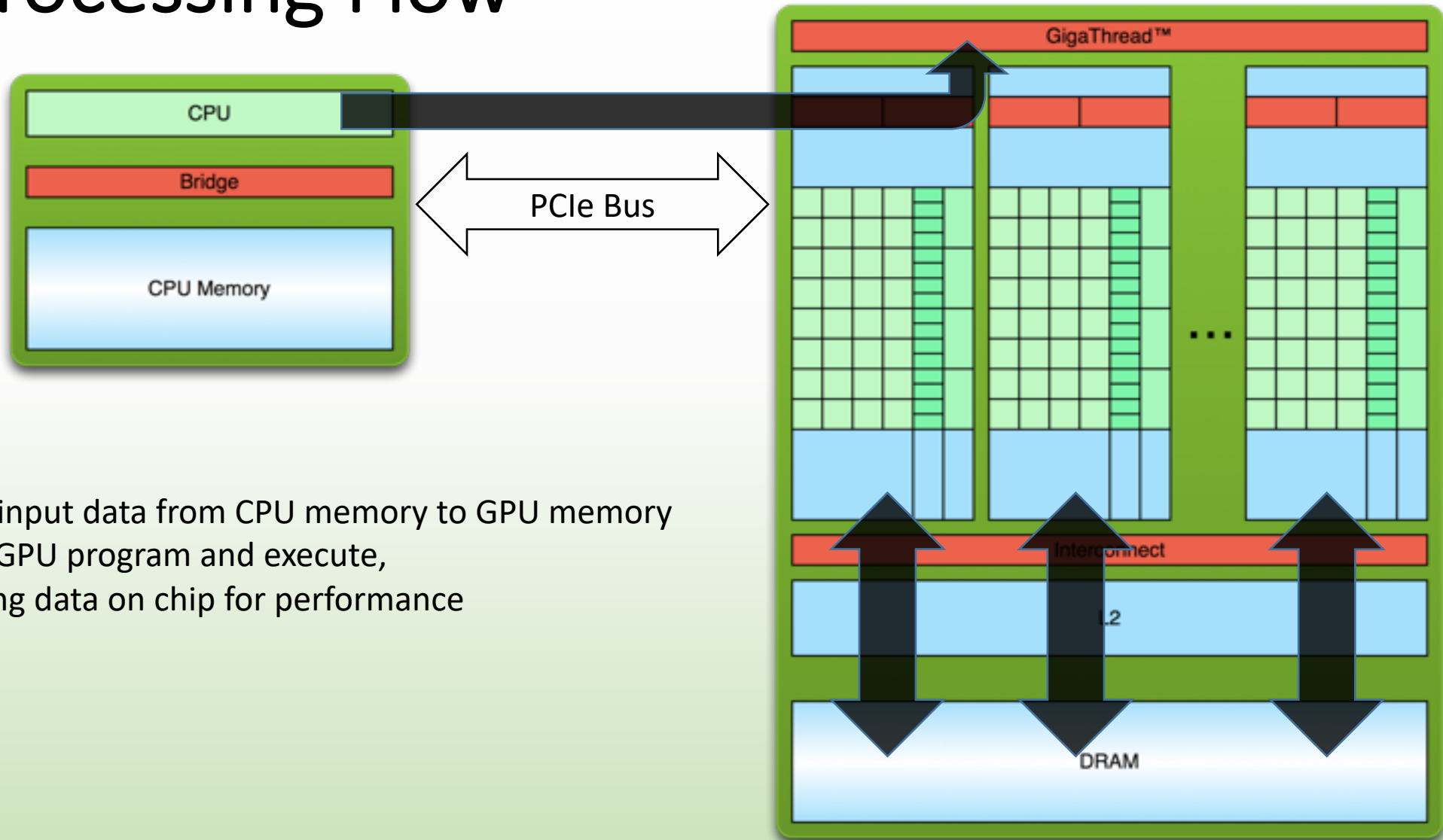
- Optimized for data-parallel, throughput computation
- Architecture tolerant of memory latency
- More transistors dedicated to computation

Processing Flow

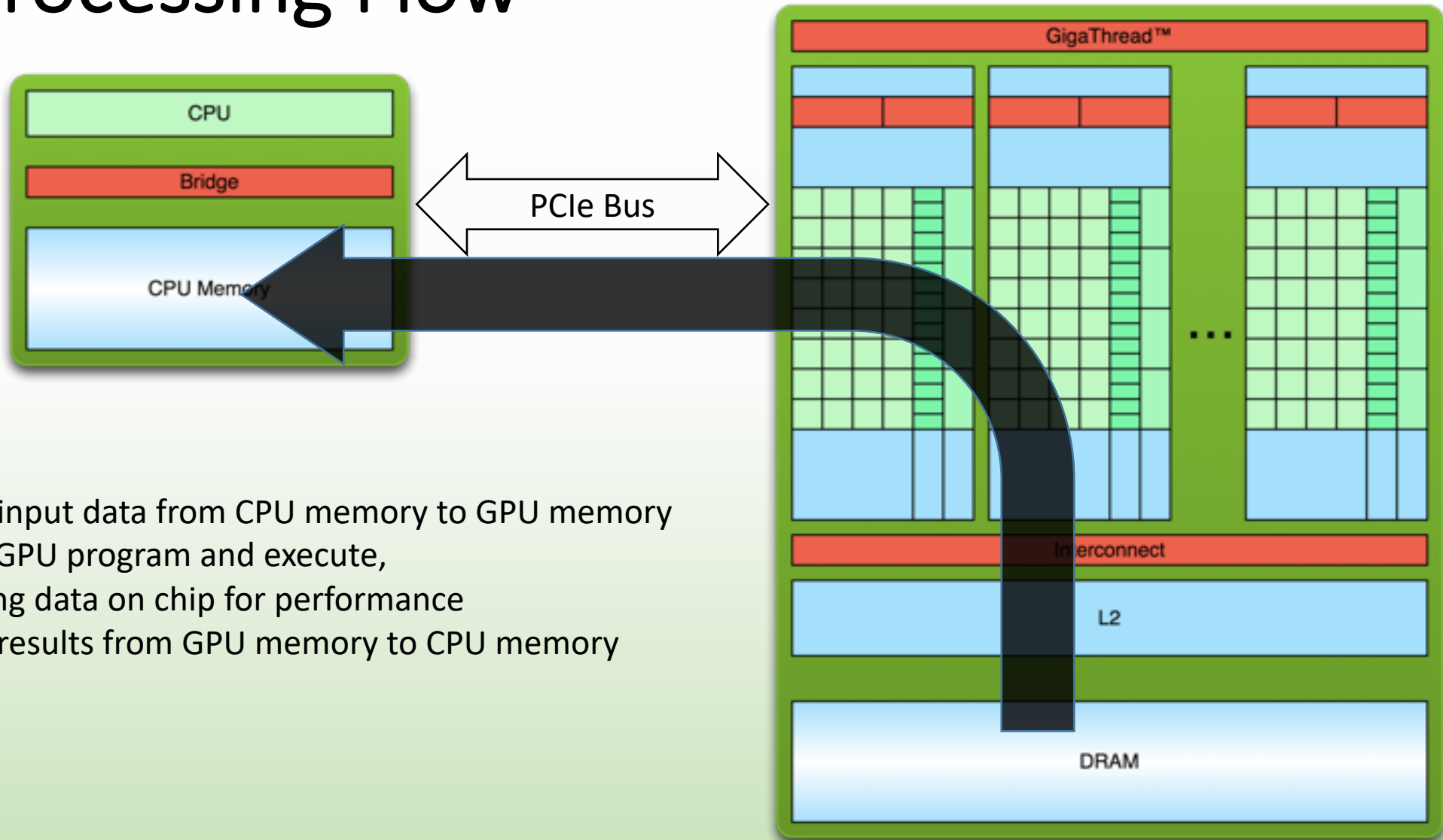


1. Copy input data from CPU memory to GPU memory

Processing Flow



Processing Flow



1. Copy input data from CPU memory to GPU memory
2. Load GPU program and execute, caching data on chip for performance
3. Copy results from GPU memory to CPU memory

CUDA Parallel Computing Platform

www.nvidia.com/getcuda

Programming
Approaches

Libraries

“Drop-in” Acceleration

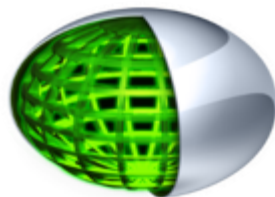
OpenACC Directives

Easily Accelerate Apps

Programming
Languages

Maximum Flexibility

Development
Environment



Nsight IDE
Linux, Mac and Windows
GPU Debugging and Profiling

CUDA-GDB debugger
Nsight Visual Profiler

Open Compiler
Tool Chain



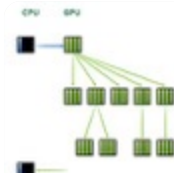
Enables compiling new languages to CUDA platform, and CUDA languages to other architectures

Hardware
Capabilities

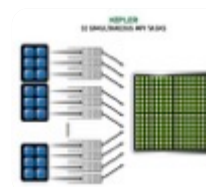
SMX



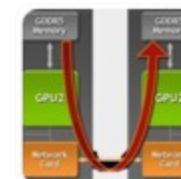
Dynamic Parallelism



HyperQ



GPUDirect



© NVIDIA 2013

3 Ways to Accelerate Applications

Applications

Libraries

“Drop-in”
Acceleration

OpenACC
Directives

Easily Accelerate Applications

Programming
Languages

Maximum
Flexibility

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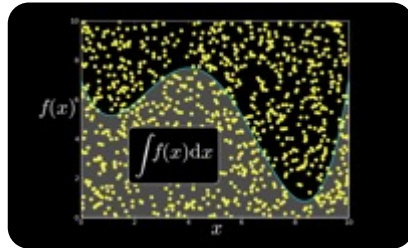
Libraries: Easy, High-Quality Acceleration

- **Ease of use:** Using libraries enables GPU acceleration without in-depth knowledge of GPU programming
- **“Drop-in”:** Many GPU-accelerated libraries follow standard APIs, thus enabling acceleration with minimal code changes
- **Quality:** Libraries offer high-quality implementations of functions encountered in a broad range of applications
- **Performance:** NVIDIA libraries are tuned by experts

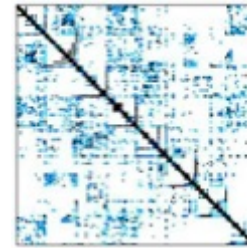
Some GPU-accelerated Libraries



NVIDIA cuBLAS



NVIDIA cuRAND



NVIDIA cuSPARSE



NVIDIA NPP



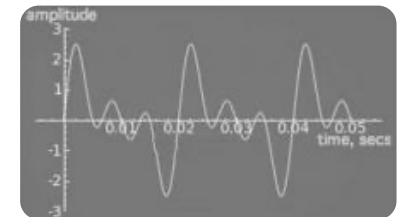
Vector Signal
Image Processing



GPU Accelerated
Linear Algebra



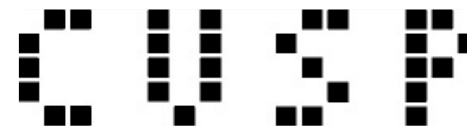
Matrix Algebra on GPU
and Multicore



NVIDIA cuFFT



ArrayFire Matrix
Computations



Sparse Linear
Algebra



C++ STL Features
for CUDA



3 Steps to CUDA-accelerated application

- **Step 1:** Substitute library calls with equivalent CUDA library calls

`saxpy (...)`  `cublasSaxpy (...)`

- **Step 2:** Manage data locality

- with CUDA: `cudaMalloc()`, `cudaMemcpy()`, etc.

- with CUBLAS: `cublasAlloc()`, `cublasSetVector()`, etc.

- **Step 3:** Rebuild and link the CUDA-accelerated library

`nvcc myobj.o -l cublas`

Explore the CUDA (Libraries) Ecosystem

Tools & Ecosystem

Home > ComputeWorks



Accelerated Solutions

GPUs are accelerating many applications across numerous industries.

[Learn more >](#)



Numerical Analysis Tools

GPU acceleration for applications with high arithmetic density.

[Learn more >](#)



GPU-Accelerated Libraries

Application accelerating can be as easy as calling a library function.

[Learn more >](#)



Language and APIs

GPU acceleration can be accessed from most popular programming languages.

[Learn more >](#)



Performance Analysis Tools

Find the best solutions for analyzing your application's performance profile.

[Learn more >](#)



Debugging Solutions

Powerful tools can help debug complex parallel applications in intuitive ways.

[Learn more >](#)



Key Technologies

Learn more about parallel computing technologies and architectures.

[Learn more >](#)



Accelerated Web Services

Micro services with visual and intelligent capabilities using deep learning.

[Learn more >](#)



Cluster Management

Managing your cluster and job scheduling can be simple and intuitive.

[Learn more >](#)

QUICKLINKS

[Accelerated Computing - Training](#)

[CUDA GPUs](#)

[Tools & Ecosystem](#)

[OpenACC: More Science Less Programming](#)

[CUDA FAQ](#)

GPU Computing

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 NVIDIA DEVELOPER

GET STARTED

LEARN MORE

GET INVOLVED

- CUDA Tools and Ecosystem described in detail on NVIDIA Developer Zone: developer.nvidia.com/cuda-tools-ecosystem

3 Ways to Accelerate Applications

Applications

Libraries

“Drop-in”
Acceleration

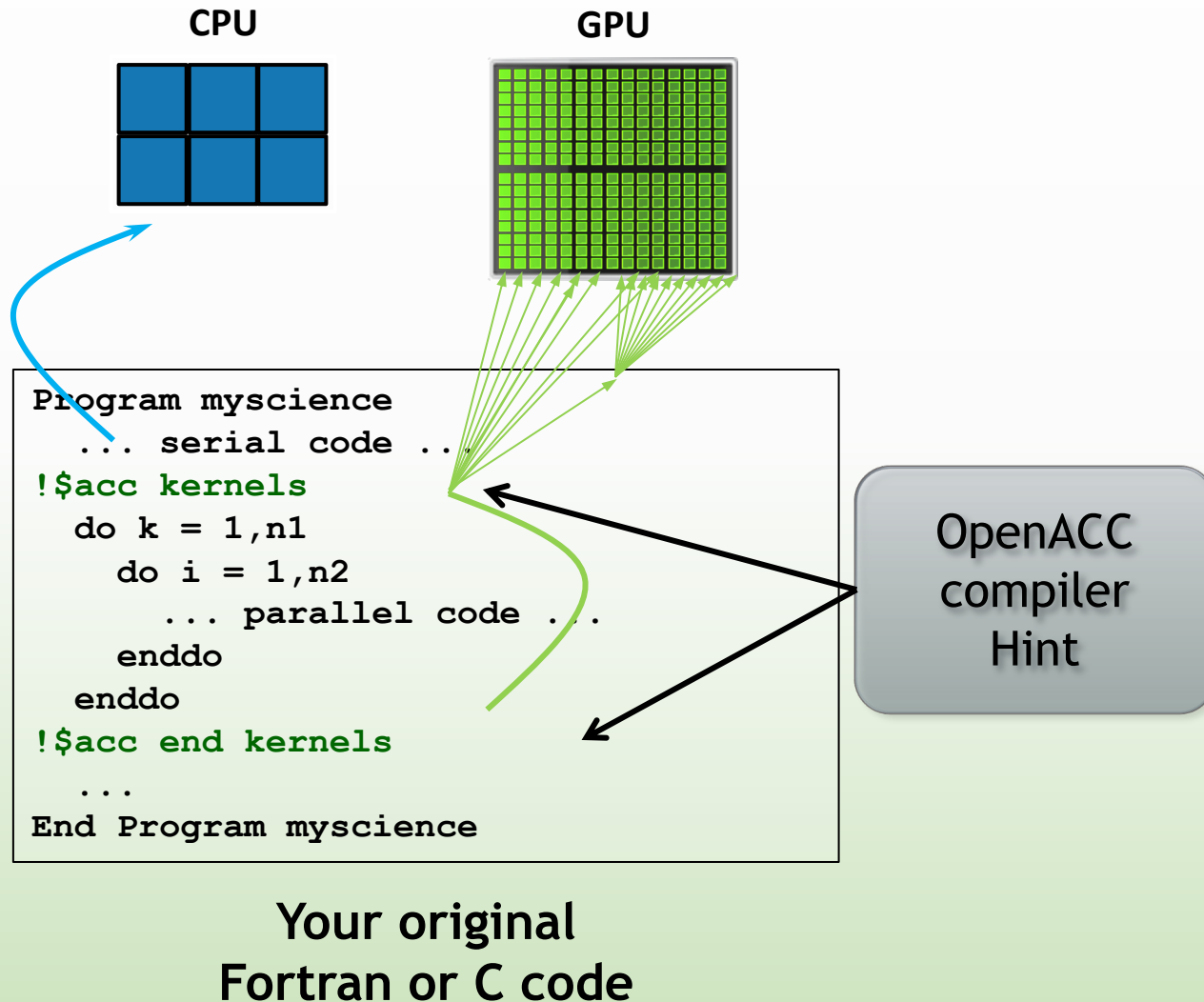
OpenACC
Directives

Easily Accelerate
Applications

Programming
Languages

Maximum
Flexibility

OpenACC Directives



Simple Compiler hints

Compiler Parallelizes code

Works on many-core GPUs & multicore CPUs

OpenACC

The Standard for GPU Directives



- **Easy:** Directives are the easy path to accelerate compute intensive applications
- **Open:** OpenACC is an open GPU directives standard, making GPU programming straightforward and portable across parallel and multi-core processors
- **Powerful:** GPU Directives allow complete access to the massive parallel power of a GPU

Start Now with OpenACC Directives

Free trial license to PGI Accelerator

Tools for quick ramp

<https://developer.nvidia.com/openacc>

3 Steps To More Science

Simple Guide to Programming GPUs

START NOW >

OpenACC

Home > ComputeWorks > OpenACC: More Science Less Programming

OpenACC Directives

Accelerated computing is fueling some of the most exciting scientific discoveries today. For scientists and researchers seeking faster application performance, OpenACC is a directive-based programming model designed to provide a **simple** yet powerful approach to accelerators without significant programming effort. With OpenACC, a single version of the source code will deliver **performance portability** across the platforms.

[Learn More](#)

```
main()
{
  <serial code>
  #pragma acc kernels
  //automatically runs on GPU
  {
    <parallel code>
  }
}
```

Application	Speedup vs. % of code modified
OpenACC Weather Forecaster	3.7x
NCAR Climate Modeling	7.8x
EdVinci Quantum Chemistry	6.5x

PGI Community Edition

The PGI Community Edition with OpenACC offers scientists and researchers a quick path to accelerated computing with less programming effort. By inserting compiler "hints" or directives into your C11, C++14 or Fortran 2003 code, with the PGI OpenACC compiler you can offload and run your code on the GPU and CPU.

In addition to the PGI OpenACC compilers, the PGI Community Edition includes GPU-enabled libraries and developer tools to help with your GPU acceleration effort. [Learn more](#)

[Get PGI Community Edition](#)

Success Stories

"OpenACC makes GPU computing approachable for domain scientists. Initial OpenACC implementation required only minor effort, and more importantly, **no modifications** of our existing CPU implementation"

— Janus Juhl Eriksen, PhD Fellow, qLEAP Center for Theoretical Chemistry, Aarhus University

[Read More](#)

A vibrant, multi-colored image showing a complex, interconnected network or molecular structure, likely representing a scientific discovery or simulation.

```
graph TD
    A[Identify Parallelism] --> B[Express Loop Parallelism]
    B --> C[Express Data Movement]
    C --> D[Express Parallelism]
```

OpenACC Courses

Join HPC industry's OpenACC experts for free online courses. These courses are comprised of instructor-led classes that include interactive lectures, hands-on exercises, and office hours with the instructors. You'll learn everything you need to start accelerating your code with OpenACC on GPUs and x86 CPUs.

[Courses and Recordings](#)

3 Ways to Accelerate Applications

Applications

Libraries

“Drop-in”
Acceleration

OpenACC
Directives

Easily Accelerate
Applications

Programming
Languages

Maximum
Flexibility + Best
Performance

GPU Programming Languages

Numerical analytics ▶

MATLAB, Mathematica, LabVIEW

Fortran ▶

OpenACC, CUDA Fortran

C ▶

OpenACC, CUDA C

C++ ▶

Thrust, CUDA C++

Python ▶

PyCUDA, Copperhead

F# ▶

Alea.cuBase

Learn More

These languages are supported on all CUDA-capable GPUs.

You might already have a CUDA-capable GPU in your laptop or desktop PC!

CUDA C/C++

<http://developer.nvidia.com/cuda-toolkit>

GPU.ORG Different Resources

<http://gpgpu.org>

Thrust C++ Template Library

<http://developer.nvidia.com/thrust>

MATLAB

<http://www.mathworks.com/discovery/matlab-gpu.html>

CUDA Fortran

<http://developer.nvidia.com/cuda-toolkit>

Mathematica

<http://www.wolfram.com/mathematica/new-in-8/cuda-and-opencl-support/> or
<http://www.wolfram.com/gridmathematica/>

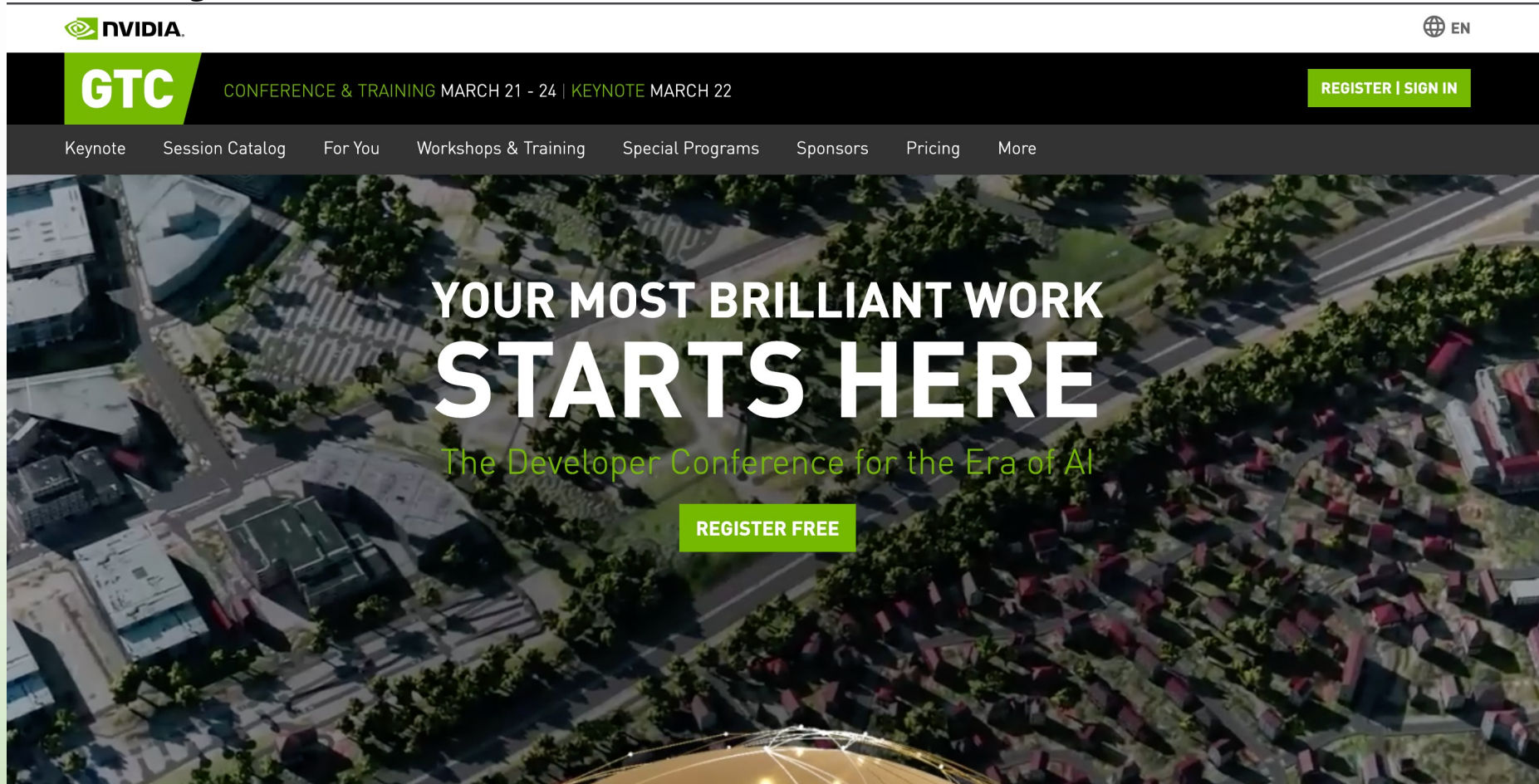
PyCUDA (Python)

<http://mathematician.de/software/pycuda>

Getting Started

- Download CUDA Toolkit & SDK: <https://developer.nvidia.com/cuda-downloads>
- Nsight IDE (Eclipse or Visual Studio): <http://www.nvidia.com/object/nsight.html>
- General GPU Computing Community: <http://gpgpu.org/>
- Programming Guide/Best Practices:
 - docs.nvidia.com
- Questions:
 - NVIDIA Developer forums: devtalk.nvidia.com
 - Search or ask on: www.stackoverflow.com/tags/cuda
- Developer Community: <https://developer.nvidia.com/> (Join Now!)

Thank you!
@carlosjaimebh



The screenshot shows the NVIDIA GTC 2018 website. At the top left is the NVIDIA logo. To its right is a language selector showing a globe icon and 'EN'. Below the logo is a green bar with 'GTC' in white. To the right of 'GTC' is the text 'CONFERENCE & TRAINING MARCH 21 - 24 | KEYNOTE MARCH 22'. Further right is a green button with 'REGISTER | SIGN IN' in white. Below this is a dark grey navigation bar with links: 'Keynote', 'Session Catalog', 'For You', 'Workshops & Training', 'Special Programs', 'Sponsors', 'Pricing', and 'More'. The main content area features a large aerial photograph of a city. Overlaid on the photo is the text 'YOUR MOST BRILLIANT WORK STARTS HERE' in large white letters, followed by 'The Developer Conference for the Era of AI' in smaller green letters. At the bottom center of the photo is a green button with 'REGISTER FREE' in white.

<https://www.nvidia.com/gtc>