

# MIC-GPU: High-Performance Computing for Medical Imaging on Programmable Graphics Hardware (GPUs)

## Closing Remarks

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## OpenCL

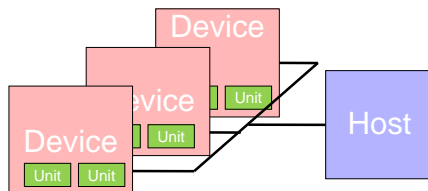
OpenCL: Open Computing Language (based on C)

- support for heterogeneous devices (GPU, CPU, ...)
- pick the device best suited for the job
- potential parallelism is key for selection
- recall Amdahl's law

## OpenCL Mindset

Platform model:

- a host is connected to one or more OpenCL devices
- a device is divided into one or more compute units (cores)
- compute units are divided into one or more processing elements



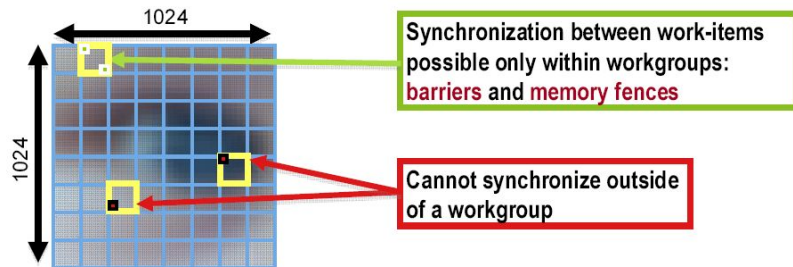
## OpenCL Mindset

Execution Model

- host programs execute on the host
  - kernels execute on one or more OpenCL devices
  - each instance of a kernel is called a *work item*
  - work items are organized as *work groups*
  - work groups and work items are defined into an *index space*
  - index space is created upon kernel submission
  - work items can be identified by work group and local work item IDs
- this is all quite similar to CUDA

CUDA Terminology	OpenCL Terminology
Grid	Index Space
Block	Work Group
Thread	Work Item

# Global and Local Dimensions



from: Khronos OpenCL Overview  
SPIE Medical Imaging 2012

# OpenCL Memory Model

## Private memory

- per work item

## Local memory (16kB)

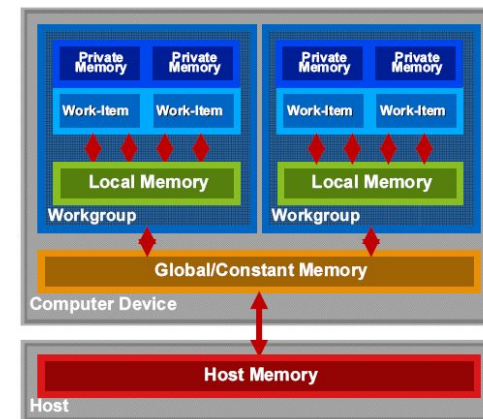
- shared per work group

## Global/constant memory

- not synchronized

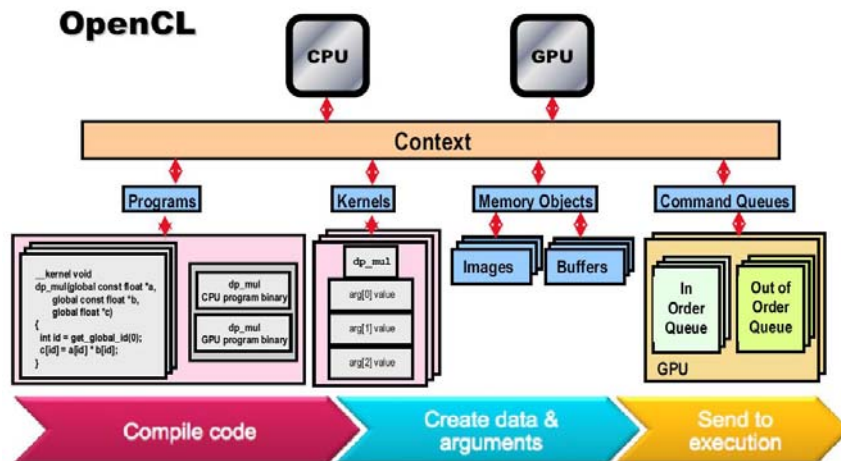
## Host memory

- on CPU



from: Khronos OpenCL Overview  
SPIE Medical Imaging 2012

# Execution Model



from: Khronos OpenCL Overview  
SPIE Medical Imaging 2012

# More Information

## CUDA

- NVIDIA CUDA Programming Guide (version 2.3)
- NVIDIA CUDA Best Practices Guide (version 2.3)
- go to <http://developer.download.nvidia.com>

## Fermi

- go to [http://www.nvidia.com/object/fermi\\_architecture.html](http://www.nvidia.com/object/fermi_architecture.html)
- also informative: "NVIDIA's 'Fermi' GPU architecture revealed" by Scott Wasson, available at <http://techreport.com/articles.x/17670/1>

## OpenCL

- Khronos Group OpenCL Overview
- go to <http://www.khronos.org/opencl>

SPIE Medical Imaging 2012

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- K. Mueller and R. Yagel, "Rapid 3D cone-beam reconstruction with the Algebraic Reconstruction Technique (ART) by using texture mapping hardware," 19(12):1227-1237, IEEE Transactions on Medical Imaging, 2000.



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