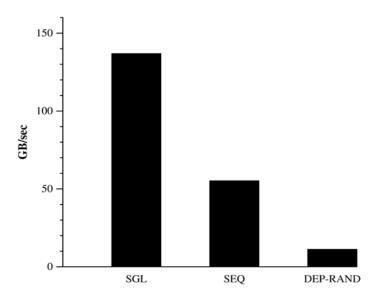
Does access pattern affect latency?

- This is the **most important** question.
- A benchmarking study done by Stanford University
 - Try different texture fetch
 - Cache every fetch to the same texel
 - Sequential every fetch increments address by I
 - Random dependent lookup with random texture



Results

- Random is **Bad**, Coherent is **Good**
- Just like a CPU!
 - out of cache
 - 147GB/s
 - sequential
 - 50GB/s
 - random
 - terrible



NVIDIA 8800GTX

References: SIGRAPH 2007 Courses on GPGPU. http://www.gpgpu.org/s2007/

Off-board bandwidth

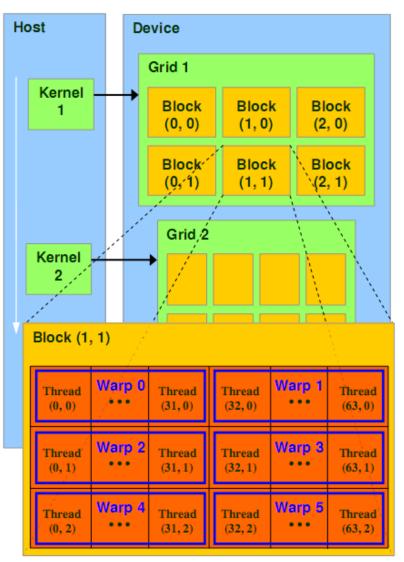
- How fast can we get data on the board (download)?
- How fast can we get data off the board (readback)?
 - PCI express has a theoretical limit of 4GB/s
 - In practice, GL is about I GB/s, CUDA can do over 2.7GB/s (about 85%).
- GPU $\leftarrow \rightarrow$ HOST = SLOW

Programming on the GPU

- Old Model: use graphics API such as OpenGL and DirectX
 - Use programming tricks
 - Hard to do
 - Relatively slow
- New Model: Nvidia CUDA
 - Extension to C
 - Special Compiler host code and kernal code
 - (Huge) speed up

8800GTX Architecture

- **GPU** CUDA device
- **Host** CPU program
- Thread unit of parallelism in CUDA
- Warp a group of threads
- Block a group of warp
- Grid a group of blocks



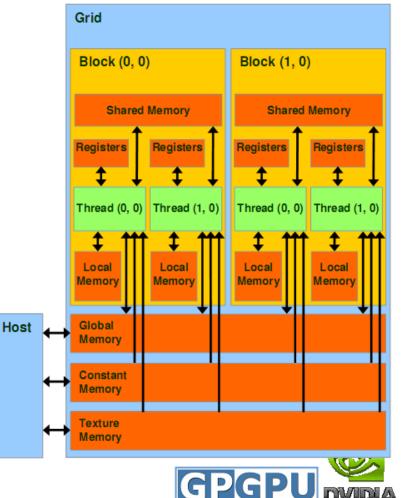
References: SIGRAPH 2007 Courses on GPGPU. http://www.gpgpu.org/s2007/

Memory Architecture – key to good performance

- Host memory
 - Device ↔ host memory bandwidth is 4 GB/s peak (PCI-express x16)

Global/local device memory

- High latency, not cached
- 80 GB/s peak, 1.5 GB (Quadro FX 5600)
- Shared memory
 - On-chip, low latency, very high bandwidth, 16 KB
 - Like a user-managed permultiprocessor cache
- Texture memory
 - Read-only, high latency, cached
- Constant memory
 - Read-only, low latency, cached, 64 KB



References: SIGRAPH 2007 Courses on GPGPU. http://www.gpgpu.org/s2007/

Performance Strategies

- Maximize **parallelism**
 - Parallelism in algorithm
 - Concurrency of CPU and GPU
- Optimize access pattern
- Minimize CPU $\leftarrow \rightarrow$ GPU data transfer
- Group data transfer
- Maximize use of **shared memory**