# CUDA

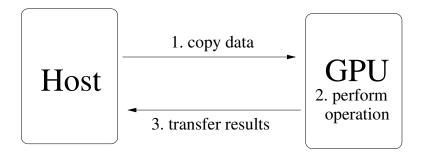
#### **GPGPU** programming

(General-Purpose Graphics Processing Unit)

- Graphics processing requires many similar operations in "graphics pipeline"
  - Triangles going through rotation and scaling, shading, and texturing
- Graphics Processing Units (GPUs) develop to meet this need and then get converted for general purpose programs
- CUDA (Compute Unified Device Architecture) is a GPU design and extension of C (et al) to support GPGPU programming developed by Nvidia
  - Market share leader; leading open alternative is OpenCL

#### Programming model: Memory

- Program mainly runs on "Host" (= CPU), but can call functions on "Device" (= GPU)
- Host and Device have separate address spaces (at least historically)
  - Memory must be explicitly transferred



#### Programming model: Processing

- GPU can run many threads simultaneously, but not independently
  - Device threads connected in groups called warps
  - All members of a warp perform the same operation
    - SIMD = Single Instruction, Multiple Data
- Programmer writes function to run on device (kernel)
- Invokes it with a number of blocks and threads (per block)
- All these threads run the function
  - Use implicit arguments blockldx and threadldx to identify itself

## "Hello World" for CUDA

#### Overview of a CUDA program

- In host code:
  - Allocate memory on device
  - Copy data to device
  - Kernel call
  - Copy results to host
  - Free device memory
- In device code:
  - \_\_global\_\_
  - determine thread ID
  - bounds check

# Adding vectors using CUDA

(Not actually fast...)

#### Recall: Calling a CUDA kernel

```
int threads = 512;  //# threads per block
int blocks = (N+threads-1)/threads;  //# blocks (N/threads, rounded up)
kernel<<<bloom>blocks,threads>>>(res_dev, a_dev, b_dev);
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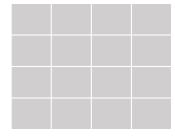
- Why use more than a single block?
- Why not use N blocks?

#### Recall: Calling a CUDA kernel

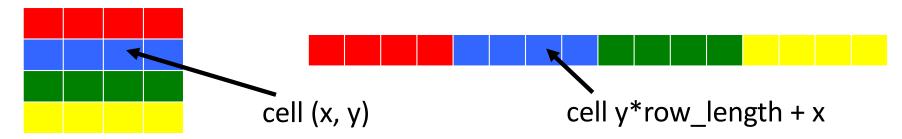
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```

- Why use more than a single block?
  - Limited number of threads per block (depends on card being used)
- Why not use N blocks?
  - Threads in block share variables (\_\_shared\_\_) and have barrier (\_\_syncthreads())
  - Also, technically limited (w/ newer cards, the limit is  $2^{31} 1$ )

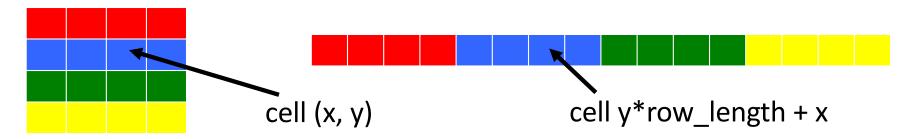
- cudaMemcpy only transfers 1D arrays
- need to represent 2D array:



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What is the 1D index of the cell below the cell with 1D index i?

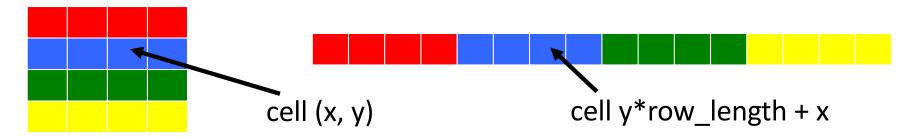
A. 
$$i + 1$$

B. 
$$i + 4$$

A. 
$$i + 1$$
 B.  $i + 4$  C.  $i + row_length$ 

E. Insufficient information to determine it

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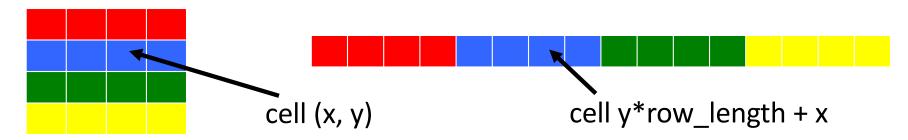
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Which test determines if the cell with 1D index i is on the right edge (of the 2D matrix)?

A. i % row\_length == 0

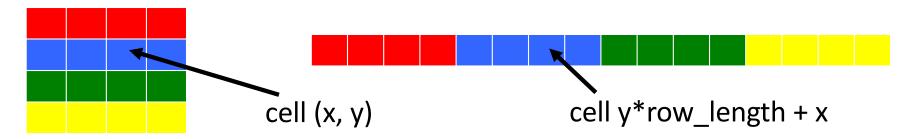
B. i % col\_length == 0

C. i + row\_length >= row\_length \* col\_length

D. i % row\_length == row\_length - 1

E. Not exactly one of the above

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E. Not exactly one of the above