## Introduction to data parallelism

http://webloria.loria.fr/~slefebvr/teaching/pcomp

Sylvain Lefebvre INRIA

# Previously ...

#### **Execution model**

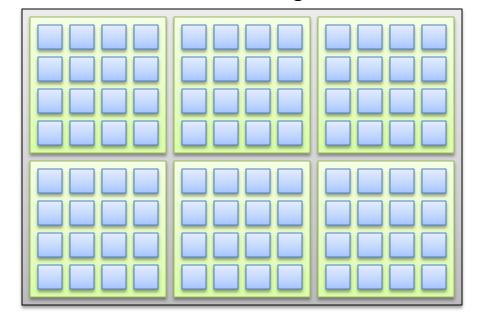
A compute device executes a kernel ...
 ... in parallel on the processing elements

```
_kernel void mainKernel(
    __global const int *a,
    __global const int *b,
    __global int *c)
{
    id = get_global_id( 0 );
    c[ id ] = a[ id ] + b[ id ];
}
```

#### **Execution model**

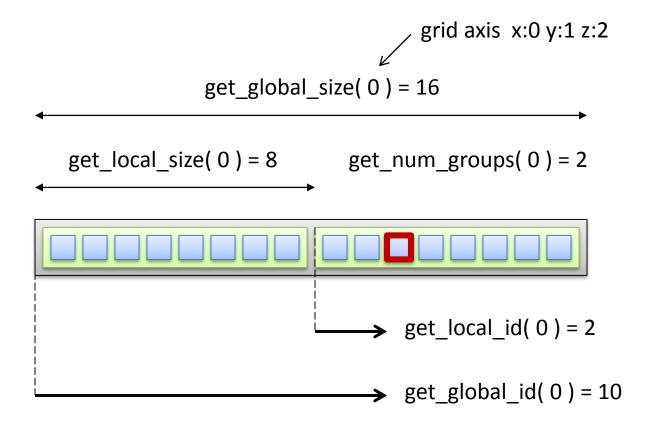
- Organized in a grid
  - 1D, 2D or 3D
- Work-items, work-groups
  - 12 x 8 work-items
  - 3 x 2 work-groups
  - Each group is 4x4 items

2D execution grid

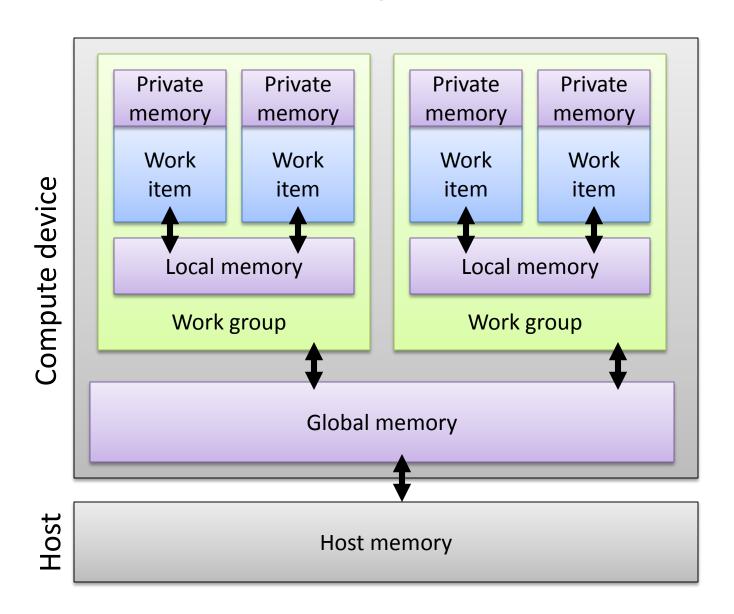


#### **Execution kernel**

The kernel can request its location



## Memory model



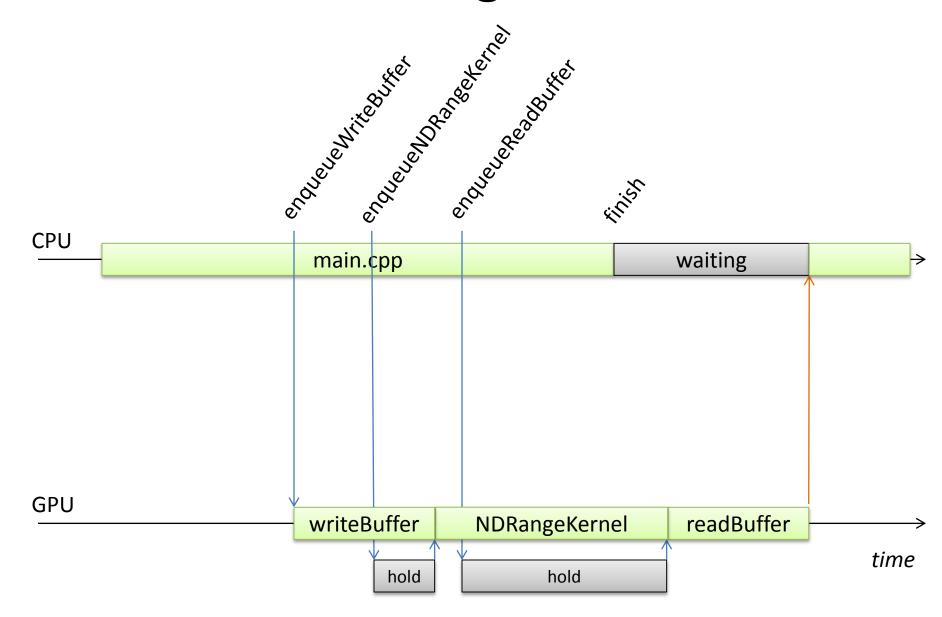
# Today

Processing queue

- Synchronization
  - Barriers
  - Atomics

Pre-fetch

#### **Processing Queue**



## Synchronization

So far, we avoided read/write conflicts

- Unavoidable in some cases
  - Example: Pre-fetch!

## Synchronization mechanisms

1. Global synchronization

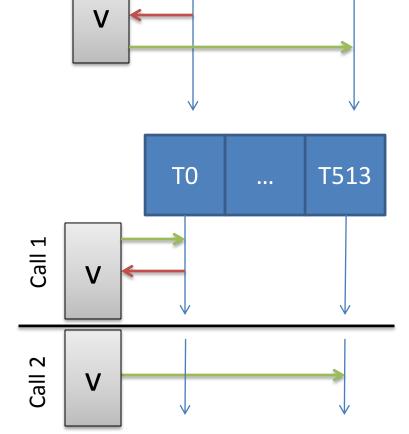
2. Memory barriers

3. Atomic operations

## Global synchronization

- Typical situation:
  - loop with dependent read/write
- Synch all threads
  - Multiple kernel calls!

- Slow due to kernel restart
  - Avoid whenever possible



TO

T513

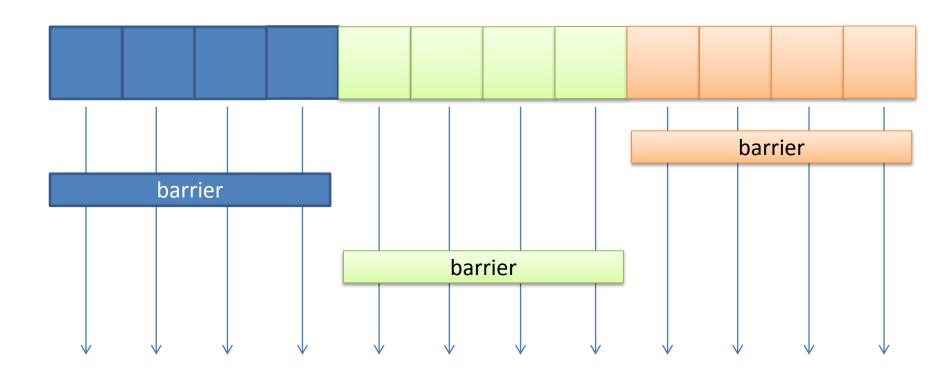
#### **Barriers**

• OpenCL instruction barrier

```
- barrier( CLK_LOCAL_MEM_FENCE );
- barrier( CLK GLOBAL MEM FENCE );
```

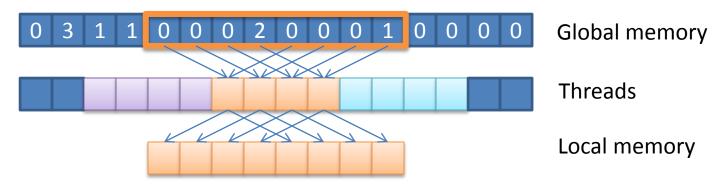
- Guarantees that all memory operations within work group are completed
- Two flavors:
  - CLK\_LOCAL\_MEM\_FENCE
  - CLK\_GLOBAL\_MEM\_FENCE
  - Local synchronization is faster

# Within work group!

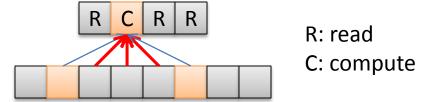


## Pre-fetch and synchronization

1. Each thread in group reads some global data



- 2. Each thread computes from local data
  - Could start while others are not done reading



Use a barrier before!

#### Pre-fetch

```
kernel void main(__global int *table,int N)
int gid = get_global_id(0);
int lid = get local id(0);
// pre-fetch
local int shared[512];
shared[lid] = table[gid];
// sync all
barrier(CLK_LOCAL_MEM_FENCE);
// compute and store in global
// ...
table[ gid ] = ...;
```

## Warnings

Execution stops until all thread in group reach it

- If (x) { barrier() } else { ... }
  - → Very likely to get stuck

- for (int i = 0; i < N; i ++) { ... barrier() ... }</li>
  - → Ok iff N is a constant (no data dependency)

### **Atomic operations**

- Synchronization at the hardware level
  - atomic\_inc / dec
  - atomic\_add / sub
  - atomic\_and / or / xor
  - atomic\_min / max
  - atomic\_cmpxchg (compare and swap)
  - atomic\_xchg

#### **Atomic operations**

- Avoids complex synchronization mechanisms
  - To be preferred whenever possible.

- No free lunch:
  - If two threads conflicts, a slow down results.
  - However, result is correct!

#### Final word

- Barriers
  - Avoid if possible.
  - Often required for correct results.
  - Rarely obvious, think twice!

- Atomic operations
  - Nice way to reduce synchronization.

# Let's practice!

## Fix it (A)

```
__kernel void main(__global int *table,int N)
{
  int lid = get_local_id(0);
  table[ lid ] ++;
}
```

### Fix it (B)

```
kernel void main(__global int *table,int N)
int id = get_global_id(0);
for (int j = 0; j < 4; j ++) {
   int v0=0, v1=0;
  v0 = table[id];
  v1 = table[(id + N/2) % N];
  table[id] = v0 + v1;
```

#### Fix it (C)

#### **Group size = 64**

```
_kernel void main(__global int *table,int N)
int gid = get global id(0);
int lid = get_local_id(0);
int gsz = get local size(0);
 local int tmp[64];
tmp[lid] = table[ gid ];
if (lid == 0) {
  for (int j = 0; j < gsz; j ++) {
    tmp[lid] = tmp[lid] + table[ gid + j ];
int tot = 0:
for (int j = 0; j < gsz; j ++) {
  tot = tot + tmp[ i ];
table[ gid ] = tot;
```

#### Fix it (D)

N <= 256

```
_kernel void main(__global int *table,int N)
{
  int gid = get_global_id(0);
  for (int j = 0 ; j < N ; j ++ ) {
     table[j] = max(table[j],gid);
  }
}</pre>
```