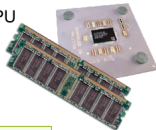


## Data Migration (cont.)

## Parallel

↳ Kernel programming.

Host = CPU  
+ RAM



Host programming.

## Serial

↳ CPU

Host = GPU  
+ RAM

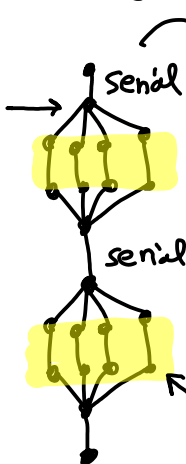


↳ activity

QPV

Copy  
data

exec  
ute  
gpu

[illegible]

- parallel code

serial code

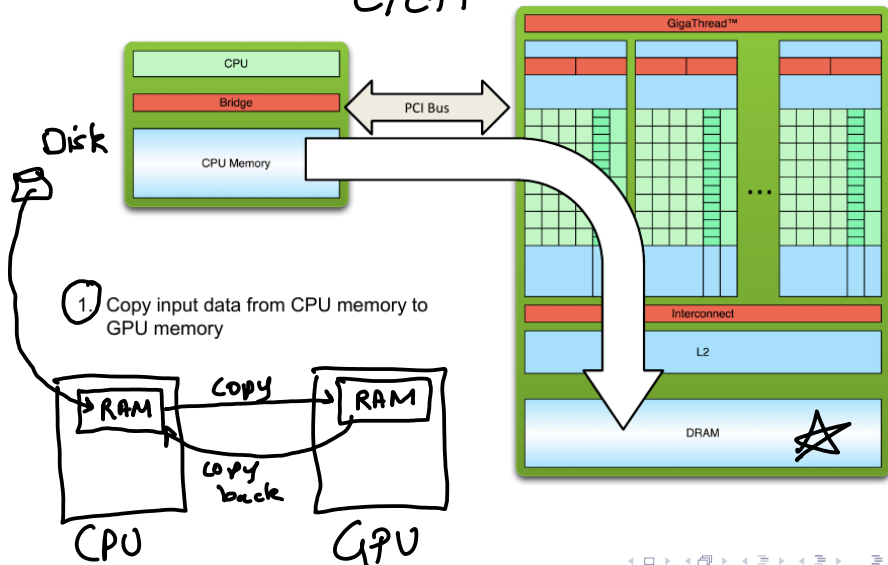
parallel code

serial code

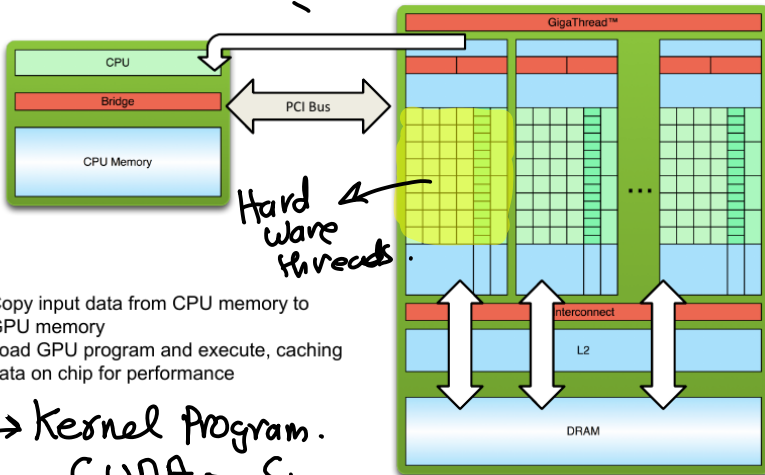
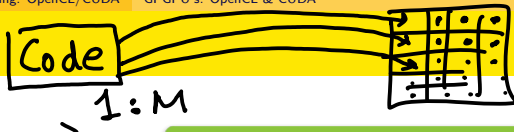
Figure 4: Porting portions of your code to GPU

# Data Migration (cont.)

Serial Programming.  
C/C++



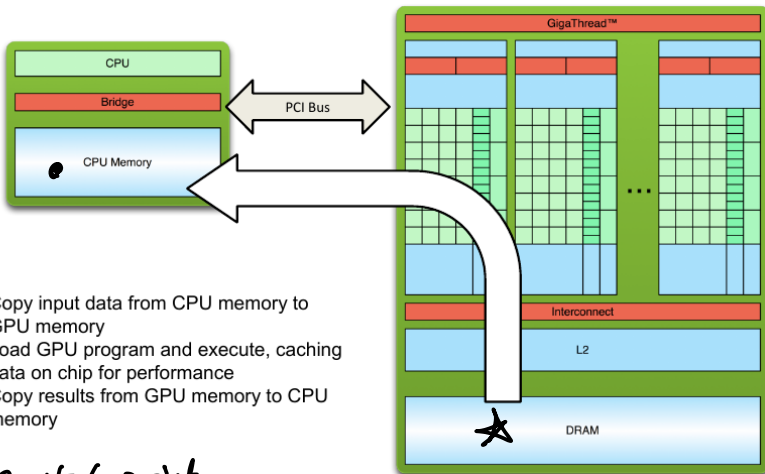
## Data Migration (cont.)



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

Kernel Program.  
CUDA - C

## Data Migration (cont.)



- 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

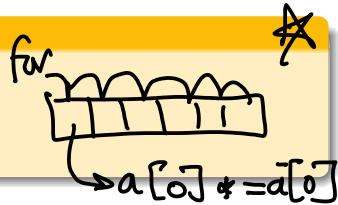
*cout / print .*

## Squaring an Array

kernel.

## C Code

```
void squareCPU(float *a, int size) {
    for (int x = 0; x < size; x++)
        a[x] *= a[x];
}
```



## OpenCL Kernel Code

```
__kernel void squareCPU(__global float *a) {
    int x = get_global_id(0);
    a[x] *= a[x];
}
```

## CUDA Kernel Code

```
__global void hello(float *a) {
    int x = threadIdx.x;
    a[x] *= a[x];
}
```

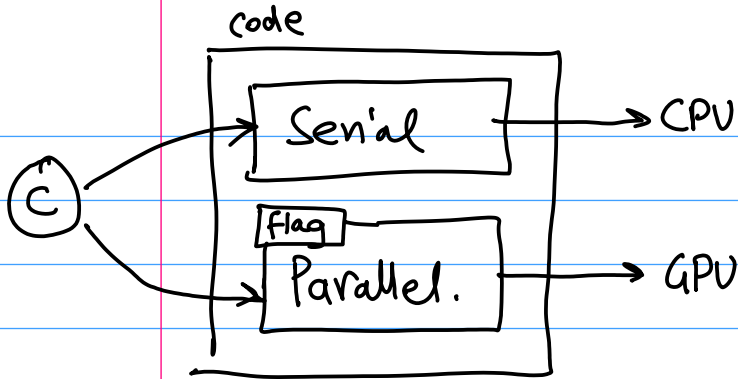
flag.

~~for~~ (x)

x = thread id.

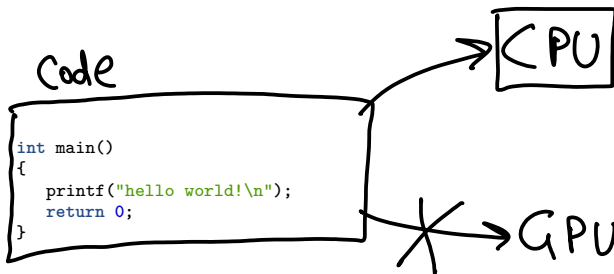
Object member;

$a[0] *= a[0]$



Compiler. (Help needed)

# Building up towards Hello World



## Compilation

- nvcc hello\_world.cu
- ./a.out

## Building up towards Hello World: Inserting GPU Code

Serial

function  
call.

← Parallel

```
__global__ void myKernel(void)
{
}
```

retrieve.

```
int main()
{
```

```
    myKernel(<<<1,1>>>());
}
```

```
// indicates function runs on
// device and is called from
// host code
```

fn name()

```
// like function call, but
// with more information
// 1st digit number of blocks
// 2nd digit threads per block
```

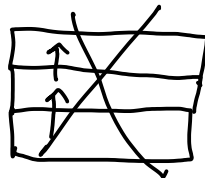
80% ← &lt;&lt;&lt;1,1&gt;&gt;&gt;

```
printf("hello world!\n");
```

```
return 0;
```

```
}
```

- nvcc will separate source code into host and device components
  - Device functions processed by NVIDIA compiler
  - Host functions processed by standard host compiler





## Building up towards Hello World: Inserting GPU Code

~~copy~~②  
exec~~copy~~

```
__global__ void myKernel(void)
{
    empty.
}
```

// indicates function runs on  
// device and is called from  
// host code

```
int main()
```

```
{
    myKernel<<<1,1>>>();
```

②

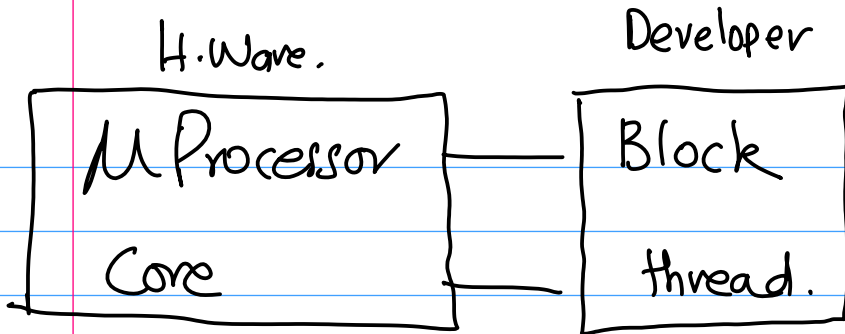
// like function call, but  
// with more information  
// 1st digit number of blocks  
// 2nd digit threads per block

Serial  
↓ 1 Thread

Serial.

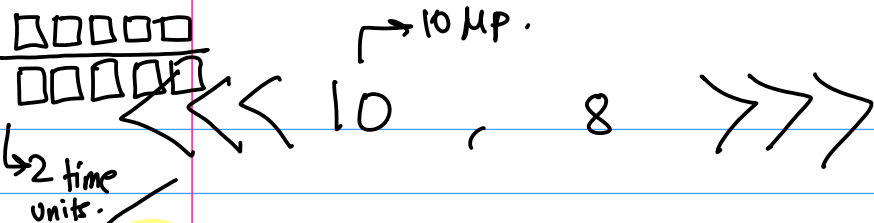
```
    printf("hello world!\n");
    return 0;
}
```

- nvcc will separate source code into host and device components
  - Device functions processed by NVIDIA compiler
  - Host functions processed by standard host compiler



1 block + 1 thread.  
↙ 1 mp. + 1 core.

5  $\mu P \rightarrow$  8 cores.  $\Rightarrow 8 \times 5 = 40$  cores.



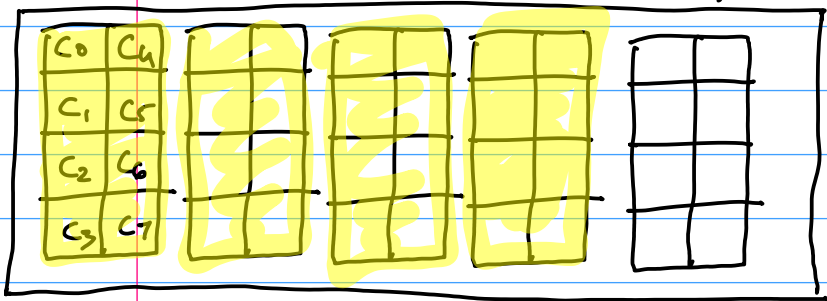
$\mu P_0$

$\mu P_1$

$\mu P_2$

$\mu P_3$

$\mu P_4$



parallel → executed somewhat sequentially (32)  
1 MP.

[ S S S S S S S S ]

---

[ S S S S S S S S ]

---

[ S S S S S S S S ]

---

[ S S S S S S S S ]

---

4 time units  
32 threads.

```
int main( )
```

• 5

```
int a = 5
```

```
int b = 6
```

①

②

③

```
int c = a + b;
```

create memory location on gpu.



①

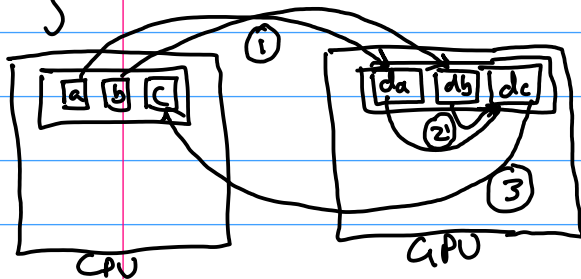
copy (a,b)

②

exec

③

copy



*/\* a, b, c are pointers to memory location on the device \*/*

```
__global__ void add(int *a, int *b, int *c)
```

```
{ *c = *a + *b;
```

```
}
```

```
int main()
```

```
{ int a=2, b=7, c, *da, *db, *dc;
```

*int kda = &a;*

① *destination*

```
cudaMalloc((void **)&da, sizeof(int)); // allocate
cudaMalloc((void **)&db, sizeof(int)); // on device
cudaMalloc((void **)&dc, sizeof(int));
```

*// Copying in blocking mode*

① *source*

```
cudaMemcpy(da, &a, sizeof(int), cudaMemcpyHostToDevice);
```

```
cudaMemcpy(db, &b, sizeof(int), cudaMemcpyHostToDevice);
```

② *add*

```
add<<<1,1>>>>(da, db, dc);
```

③ *cudaMemcpy*

```
cudaMemcpy(&c, dc, sizeof(int), cudaMemcpyDeviceToHost);
```

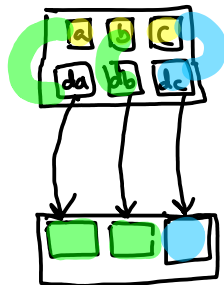
```
printf("a + b = %d\n", c);
```

```
cudaFree(da); cudaFree(db); cudaFree(dc);
```

```
return 0;
```

```
}
```

CPU



GPU

$$*c = *a + *b$$

```

/* a, b, c are pointers to memory location on the device */
__global__ void add(int *a, int *b, int *c)
{
    *c = *a + *b;
}

int main()
{
    int a=2, b=7, c, *da, *db, *dc;

    cudaMalloc((void **)&da, sizeof(int)); // allocate
    cudaMalloc((void **)&db, sizeof(int)); // on device
    cudaMalloc((void **)&dc, sizeof(int));

    // Copying in blocking-mode
    cudaMemcpy(da, &a, sizeof(int), cudaMemcpyHostToDevice);
    cudaMemcpy(da, &a, sizeof(int), cudaMemcpyHostToDevice);
    add<<<1,1>>>>(da, db, dc);
    cudaMemcpy(&c, dc, sizeof(int), cudaMemcpyDeviceToHost);

    printf("a + b = %d\n", c);
    cudaFree(da); cudaFree(db); cudaFree(dc);
    return 0;
}

```

*/\* a, b, c are pointers to memory location on the device \*/*

```
__global__ void add(int *a, int *b, int *c)
```

```
{
    *c = *a + *b;
}
```

$$c[x] = a[x] + b[x]$$

```
int main()
```

```
{
    int a=2, b=7, c, *da, *db, *dc;
```

```
    cudaMalloc((void **)&da, sizeof(int)); // allocate
```

```
    cudaMalloc((void **)&db, sizeof(int)); // on device
```

```
    cudaMalloc((void **)&dc, sizeof(int));
```

*// Copying in blocking-mode*

```
    cudaMemcpy(da, &a, sizeof(int), cudaMemcpyHostToDevice);
```

```
    cudaMemcpy(da, &a, sizeof(int), cudaMemcpyHostToDevice);
```

```
    add<<<1,1>>>>(da, db, dc);
```

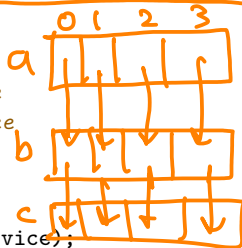
```
    cudaMemcpy(&c, dc, sizeof(int), cudaMemcpyDeviceToHost);
```

```
    printf("a + b = %d\n", c);
```

```
    cudaFree(da); cudaFree(db); cudaFree(dc);
```

```
    return 0;
```

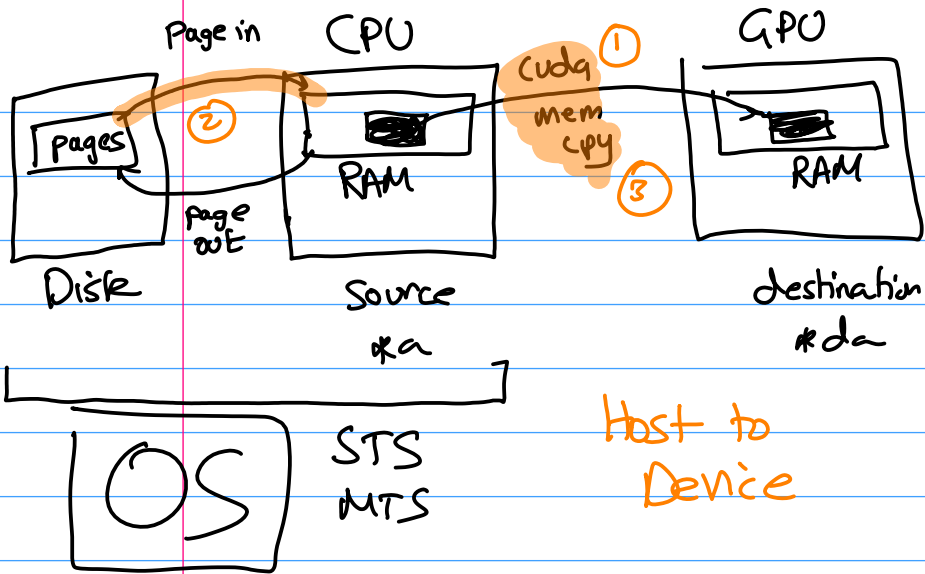
```
}
```



4 threads

<< 1, 4 >>>





*/\* a, b, c are pointers to memory location on the device \*/*

```
__global__ void add(int *a, int *b, int *c)
```

```
{ *c = *a + *b;
```

```
}
```

```
int main()
```

```
{ int a=2, b=7, c, *da, *db, *dc;
```

```
    cudaMalloc((void **)&da, sizeof(int)); // allocate
```

```
    cudaMalloc((void **)&db, sizeof(int)); // on device
```

```
    cudaMalloc((void **)&dc, sizeof(int));
```

*// Copying in blocking-mode*

```
    cudaMemcpy(da, &a, sizeof(int), cudaMemcpyHostToDevice);
```

```
    cudaMemcpy(da, &a, sizeof(int), cudaMemcpyHostToDevice);
```

```
    add<<1,1>>>(da, db, dc);
```

```
    cudaMemcpy(&c, dc, sizeof(int), cudaMemcpyDeviceToHost);
```

```
    printf("a + b = %d\n", c);
```

```
    cudaFree(da); cudaFree(db); cudaFree(dc);
```

```
    return 0;
```

```
}
```

# Running in Parallel


- so far; pointing parameters to GPU, and running single thread on GPU.
- Time to look at how to run things in parallel.

## Code Change

```
// add<<<1, 1>>>(da, db, dc);
add<<<N, 1>>>(da, db, dc);
```

- Instead of running add() once, execute it N times in parallel

## Changes in Kernel Code

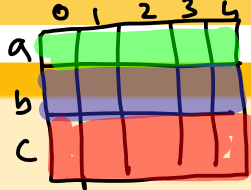


```
__global__ void add(int *a, int *b, int *c)
{
    c[blockIdx.x] = a[blockIdx.x] + b[blockIdx.x];
}
```

## Changes in Host Code

```
int main()
{ int *a, *b, *c, *da, *db, *dc, N=5, i;
```

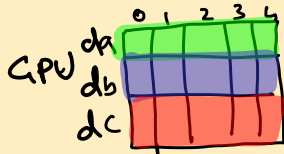
CPU



```

① { a = (int*)malloc(sizeof(int)*N); // allocate host mem
    b = (int*)malloc(sizeof(int)*N); // and assign random
    c = (int*)malloc(sizeof(int)*N); // memory

    cudaMalloc((void **)&da, sizeof(int)*N);
    cudaMalloc((void **)&db, sizeof(int)*N);
    cudaMalloc((void **)&dc, sizeof(int)*N);
  }
```



```

① { cudaMemcpy(da, &a, sizeof(int)*N, cudaMemcpyHostToDevice);
    cudaMemcpy(da, &a, sizeof(int)*N, cudaMemcpyHostToDevice);
  }
② { add<<<N,1>>>>(da, db, dc);
  }
③ { cudaMemcpy(&c, dc, sizeof(int)*N, cudaMemcpyDeviceToHost);
  }
```

$NMP - 1 \text{ core}$

```
for (i = 0; i < N; i++)
  printf("a[%d] + b[%d] = %d\n", i, i, c[i]);
```

}

1MP

$\lll 1, N \ggg$   
N cores

That was Blocks in Parallel. What about Threads in Parallel

$\lll N, 1 \rrr \rightarrow c[\text{blockIdx}.x]$

### Function Call Change

```
// add<<<1, 1>>>(da, db, dc); // single thread GPU
// add<<<N, 1>>>(da, db, dc); // N blocks on GPU
add<<<1, N>>>(da, db, dc); // N threads on GPU
```

### Changes in Kernel Code

```
__global__ void add(int *a, int *b, int *c)
{
    c[threadIdx.x] = a[threadIdx.x] + b[threadIdx.x];
}
```

- Rest of Host code would be the same

$c[x] = a[x] + b[x]$

$\lll 1, N \rrr \rightarrow c[\text{threadIdx}.x]$