### CS542200 Parallel Programming Lab 2: CUDA

CHEN-CHUN CHEN 2016/12/08

### Outline

- 1. Platform Guide
- 2. Programming Guide
- 3. Tools
- 4. Reference

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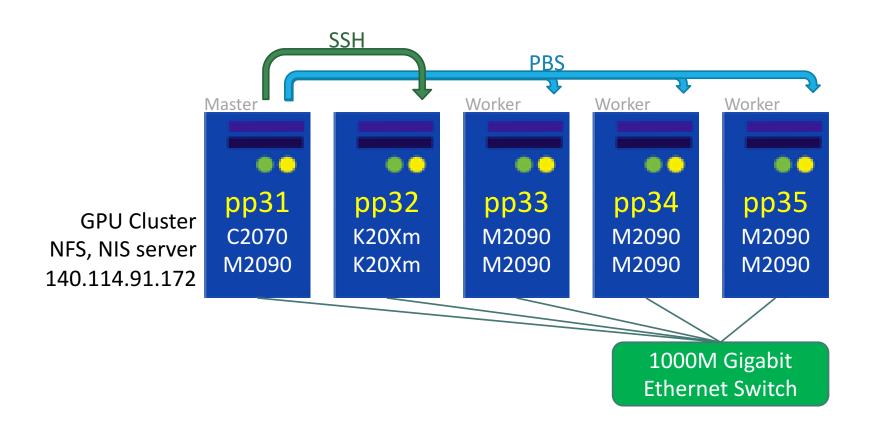
### The GPU Cluster

Host: 140.114.91.172

Account: same as pp01

Password: same as pp01(Dec. 3rd)

### The GPU Cluster



#### Job Scheduler

Master: pp31

Worker: pp33, pp34, pp35

Resource Manager: TORQUE-5.1.1.2

Scheduler: TORQUE-5.1.1.2

- Max nodes = 2
- Max walltime = 30 minute
- Max jobs queuable at any time = 4
- Max jobs runnable at any time = 2

Priority: FIFO

```
#PBS -N CUDA_JOB
#PBS -r n
#PBS -l nodes=1:ppn=1:gpus=1:exclusive_process
#PBS -l walltime=00:01:00

cd $PBS_O_WORKDIR
./executable args
```

#### Password-less SSH

Execute the following script to generate key and go through all nodes:

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### Compile & run

#### Compile

- nvcc [options] input\_file
- Example: nvcc -o executable code.cu

#### Run

./executable [args]

For more options, please see nvcc --help

### Steps to follow

- 1. Initialize CUDA device
- Allocate memory in device & put sequential code into kernel function
- Relabel index variables with combinations of threadIdx, blockIdx, blockDim, gridDim
- 4. Optimizations (requires great deal of effort!)

# How to measure kernel execution time?

cudaEventCreate(): Init timer

cudaEventDestroy(): Destroy timer

cudaEventRecord(): Set timer

cudaEventSynchronize(): Sync timer after each kernel call

cudaEventElapsedTime(): Returns the elapsed time in milliseconds

# How to measure kernel execution time?

```
cudaEvent_t start, stop;
float time;
cudaEventCreate (&start);
cudaEventCreate (&stop);
cudaEventRecord (start, ∅);
kernel <<< grid, threads >>> (d_in, d_out);
cudaEventRecord (stop, ∅);
cudaEventSynchronize (stop);
cudaEventElapsedTime (&time, start, stop);
fprintf (stderr, "%lf\n", time);
cudaEventDestroy (start);
cudaEventDestroy (stop);
```

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#### nvidia-smi

Purpose: Query and modify GPU's state

You can query details about

- device type
- clock rate
- temperature
- power
- memory

0

### nvidia-smi: example

```
[root@pp31 ~]# nvidia-smi
Sun Dec 4 15:49:05 2016
       NVIDIA-SMI 367.48 Driver Version: 367.48
       GPU Name Persistence-M Bus-Id Disp.A | Volatile Uncorr. ECC
       Fan Temp Perf Pwr:Usage/Cap | Memory-Usage | GPU-Util Compute M.
       0 Tesla C2070 Off | 0000:03:00.0 Off | Off
             1 Tesla M2090 Off | 0000:06:00.0 Off | Off
       N/A N/A P0 75W / N/A | 0MiB / 6066MiB | 0% Default
                                                                                                                                                                                                                                                                                              GPU Memory
       Processes:
                             PID Type Process name
                                                                                                                                                                                                                                                                                              Usage
           No running processes found
```

### nvidia-smi: example

```
[root@pp31 ~]# nvidia-smi -q -d CLOCK
Timestamp
                                  : Sun Dec 4 15:53:09 2016
Driver Version
                           : 367.48
Attached GPUs
                                  : 2
GPU 0000:03:00.0
   Clocks
       Graphics
                                  : 573 MHz
       \mathsf{SM}
                                  : 1147 MHz
       Memory
                                  : 1494 MHz
       Video
                                  : 540 MHz
   Applications Clocks
       Graphics
                                  : N/A
       Memory
                                  : N/A
   Default Applications Clocks
       Graphics
                                  : N/A
       Memory
                                  : N/A
   Max Clocks
       Graphics
                                  : 573 MHz
       \mathsf{SM}
                                  : 1147 MHz
       Memory
                                  : 1494 MHz
       Video
                                   : 540 MHz
```

#### cuda-memcheck

This tool checks memory errors of your program, and it also reports hardware exceptions encountered by the GPU.

These errors may not cause program to crash, but they could result in unexpected program behavior and memory misusage.

#### cuda-memcheck

#### Some erroneous code

```
cudaFree (d_data);
  cudaFree (d_data); // error
  return 0;
}
```

#### **Error summary**

```
[user0@gpucluster0 shared]$ cuda-memcheck sobel candy.bmp
====== CUDA-MEMCHECK
====== Program hit cudaErrorInvalidDevicePointer (error 17) due to "invalid
device pointer" on CUDA API call to cudaFree.
             Saved host backtrace up to driver entry point at error
=======
             Host Frame:/lib64/libcuda.so.1 [0x2e4263]
=======
             Host Frame:sobel [0x3dcb6]
=======
             Host Frame:sobel [0x27b1]
=======
             Host Frame:/lib64/libc.so.6 ( libc start main + 0xf5) [0x21af5]
=======
             Host Frame:sobel [0x287d]
=======
=======
====== ERROR SUMMARY: 1 error
```

# cuda-memcheck error types

Name	Description	Location	Precision
Memory access error	Errors due to out of bounds or misaligned accesses to memory by a global, local, shared or global atomic access.	Device	Precise
Hardware exception	Errors that are reported by the hardware error reporting mechanism.	Device	Imprecise
Malloc/Free errors	Errors that occur due to incorrect use ofmalloc()/free() in CUDA kernels.	Device	Precise
CUDA API errors	Reported when a CUDA API call in the application returns a failure.	Host	Precise
cudaMalloc memory leaks	Allocations of device memory using cudaMalloc()that have not been freed by the application.	Host	Precise
Device Heap Memory Leaks	Allocations of device memory using malloc() in device code that have not been freed by the application.	Device	Imprecise

### cuda-gdb

Similar to GDB

A tool provides developers with a mechanism for debugging CUDA application running on actual hardware.

For more details, please refer to cuda-debugging-tools.pdf

# cuda-gdb: print/set variables

#### Print variable

```
(cuda-gdb) print total
$1 = 11.1110363
```

#### Reassign value to variable

```
(cuda-gdb) print total = 31.1095
$2 = 31.109499
```

## cuda-gdb: breakpoint

by kernel name

(cuda-gdb) break sobel\_Kernel

by file & line number

(cuda-gdb) break test.cu:149

by address

(cuda-gdb) break 0x4e15f73

## cuda-gdb: execution control

Launch application (with arguments)

(cuda-gdb) run arg1 arg2

Resume execution

(cuda-gdb) continue

Kill the program

(cuda-gdb) kill

## cuda-gdb: execution control

#### Interrupt the program

• Ctrl + C

#### Single stepping

	At source level	At assembly level
Over function calls	next	nexti
Into function calls	step	stepi

# nvprof

#### A CUDA profiler

Provides feedback to optimize CUDA programs

- --metrics <METRIC\_NAME> to measure specific metrics
- --events <EVENT\_NAME> to record specific events
- -o <FILE> to save result to a file
- -i <FILE> to read result from a file

### nvvp

nvprof's GUI counterpart easier to use

# CUDA Profiling with MPI

Assume we run with 2 MPI tasks

```
$ mpirun -n 2 nvprof -o
profile.out.%q{PMI_RANK} ./exe
```

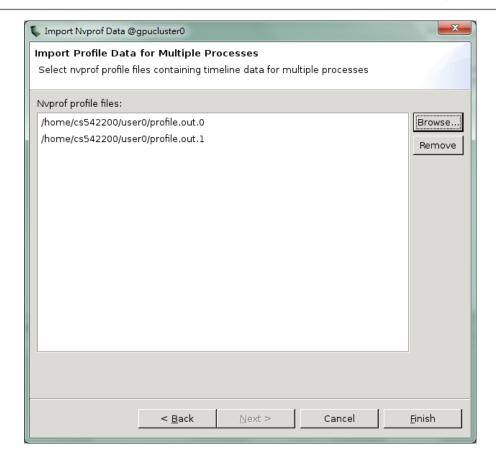
This generates profile.out.0 and profile.out.1

We can use **nvprof** or **nvvp** to further analyze them

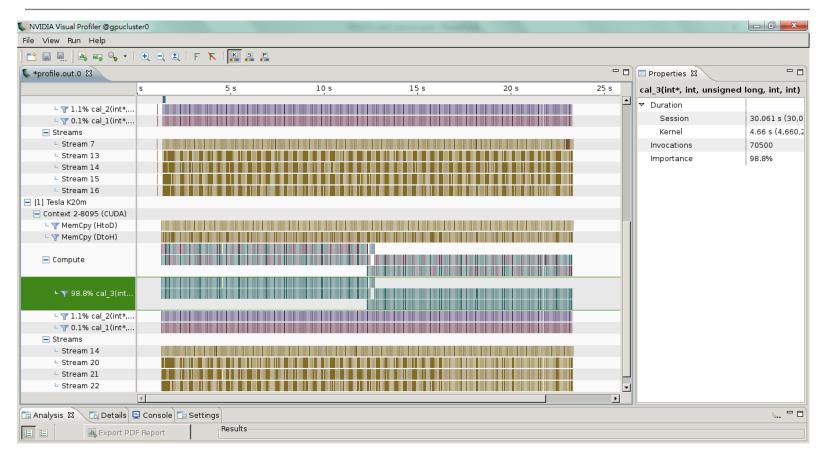
# CUDA+MPI: nvprof example

```
[user0@gpucluster0 ~]$ nvprof -i profile.out.0
====== Profiling result:
            Time
                     Calls
                                          Min
Time(%)
                                Avg
                                                    Max
                                                         Name
                     70125 66.036us 3.3930us 81.699us
                                                         cal 3(int*, int, unsigned long, int,
34.28%
       4.63078s
int)
32.97% 4.45322s
                       376 11.844ms 11.790ms
                                                         [CUDA memcpy HtoD]
                                               23.636ms
                                                         [CUDA memcpy DtoH]
32.32%
       4.36655s
                     70126
                           62.267us 59.458us
                                               21.517ms
                                                         cal 2(int*, int, unsigned long, int)
                       375
                           143.20us 141.96us
                                               145.54us
 0.40%
       53.702ms
 0.03% 4.1410ms
                           11.042us 10.880us
                                                         cal 1(int*, int, unsigned long, int)
                       375
                                              11.392us
====== API calls:
Time(%)
            Time
                     Calls
                                 Avg
                                          Min
                                                         Name
                                                    Max
47.91%
        4.49867s
                       377
                           11.933ms 11.849ms
                                               23.724ms
                                                         cudaMemcpy2D
       2.73946s
                                                         cudaDeviceSynchronize
29.17%
                           7.3052ms 2.7430ms
                                               7.6579ms
                       375
 8.89% 834.79ms
                     70875
                           11.778us 9.6190us
                                               1.6846ms
                                                         cudaLaunch
 7.31%
        686.19ms
                     70125
                           9.7850us 8.2120us
                                               30.115ms
                                                         cudaMemcpy2DAsync
 4.59%
        431.25ms
                         1
                           431.25ms
                                    431.25ms
                                               431.25ms
                                                         cudaHostAlloc
 1.43%
       134.59ms
                    353625
                               380ns
                                        255ns
                                               571.46us
                                                         cudaSetupArgument
                                               557.99us cudaConfigureCall
 0.37%
       34.631ms
                     70875
                              488ns
                                        375ns
                                               28.024ms cudaFreeHost
 0.30%
       28.024ms
                           28.024ms 28.024ms
                         1
                                              1.0072ms cudaMallocPitch
 0.01% 1.0072ms
                         1 1.0072ms 1.0072ms
 0.01% 972.39us
                       166 5.8570us
                                        554ns
                                              204.95us cuDeviceGetAttribute
                                               524.41us cudaStreamCreate
 0.01% 645.85us
                         4
                           161.46us 19.732us
 0.00%
                         1 291.91us 291.91us 291.91us cudaFree
       291.91us
```

# CUDA+MPI: nvvp example(1)



# CUDA+MPI: nvvp example(2)



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### References

**NVIDIA CUDA Toolkit Documentation** 

**NVIDIA CUDA Runtime API Documentation** 

Vyas Venkataraman, "CUDA debugging tools: CUDA-GDB & CUDA-MEMCHECK," GTC 2014.