CS5375 Computer Systems Organization and Architecture Lecture 18

Guest Instructors:

Ghazanfar Ali, Ghazanfar. Ali@ttu.edu

Mert Side, Mert.Side@ttu.edu

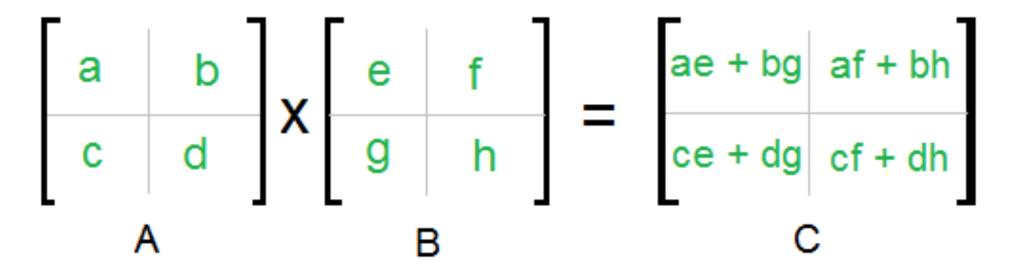
Department of Computer Science

Texas Tech University

Outline

- Programming Project #2 Walkthrough
- Midterm Exam Review

Reminder: Matrix Multiplication



A, B and C are square metrices of size N x N a, b, c and d are submatrices of A, of size N/2 x N/2

e, f, g and h are submatrices of B, of size N/2 x N/2

```
void CPUmatmul(int N, double *x, double *y, double *ans)
 for(int i=0; i < N; i++) {
   for(int j=0; j < N; j++) {
     for(int k=0; k < N; k++) {</pre>
       ans[i*N+j] += (x[i*N+k]*y[k*N+j]);
bool check(int N, double *ans)
 for(int i=0; i < N; i++) {
   for(int j=0; j < N; j++) {
     if(ans[i*N+j]!=20.0)return false;
 return true;
int main(void)
 //size of matrix
 int N = 1 << 9;
 int iter = 3;
 clock_t t;
 // Allocate Memory - accessible from CPU
 double *x = new double[N*N];
 double *y = new double[N*N];
 double *ans = new double[N*N];
 // initialize x,y and ans arrays on the host
 for (int i = 0; i < N; i++) {
   for(int j=0; j < N; j++) {
     x[i*N+j]=5;
     y[i*N+j]=(i==j?1:0);
     ans[i*N+j]=(double)0.000000000000;
 std::cout<<"Starting CPU computation"<<std::endl;</pre>
 for(int i=0; i <= iter; i++) {
   t=clock():
   CPUmatmul(N, x, y,ans);
   t = clock() - t;
   if(i)avg+=t; //we will ignore the first run
   // printf ("It took CPU-%d %f ms.\n",i,(((double)t)/CLOCKS_PER_SEC)*1000);
 avg/=iter;
 avg/=CLOCKS_PER_SEC;
 avg*=1000;
 printf ("It took %lf ms on avg.\n",avg);
```

Matrix Multiplication on the CPU

- Sequential Matrix Multiplication
 - Here is a code for matrix multiplication using C++.
 - It is the standard O(N³) procedure.
- Here x, y, and ans are three N² size matrices
 - N² sized 1D array.
 - We are using 1D arrays as of it were 2D.

```
for(int i = 0; i < N; i++) {
   for(int j = 0; j < N; j++) {
     if(ans[i*N+j] != 20.0) return false;
 return true;
int main(void)
 // size of matrix
 int N = 1<<9; // binary left-shift: 1 * 2^9 = 512
 printf("Size of matrix (N) is %d by %d.\n", N, N);
 int iter = 3;
 clock_t t;
 // Martices
 double *x, *y, *ans;
 // TODO: Allocate Unified Memory — accessible from both CPU and GPU
 // initialize x,y and ans arrays on the host
 for (int i = 0; i < N; i++) {
   for(int j = 0; j < N; j++) {
     x[i*N+j] = 5;
     y[i*N+j] = (i==j?1:0);
     ans[i*N+j] = (double)0.000000000000;
 std::cout<<"Starting unoptimized GPU computation"<<std::endl;</pre>
 // Run kernel on GPU
 for(int i = 0; i <= iter; i++) {
   t = clock();
   GPUmatmul<<<1,1>>>(N, x, y,ans);
   cudaDeviceSynchronize();
   t = clock() - t;
   if(i) avg += t; //we will ignore the first run
   // printf ("It took GPU-%d %f ms.\n",i,(((double)t)/CLOCKS_PER_SEC)*1000);
 avg /= iter;
 avg /= CLOCKS_PER_SEC;
 avg *= 1000;
 printf("It took %lf ms on avg.\n", avg);
 if(check(N,ans)) std::cout<<"RUN OK."<<std::endl;</pre>
 else std::cout<<"RUN NOT OK."<<std::endl;</pre>
 // TODO: Free memory
```

Matrix Multiplication on the GPU

- This is the code to run on the GPU.
 - But it only uses one GPU thread.
 - And it is still sequential.
- You are tasked to use a simple stride pattern to make this parallel on the GPU.

Source Code

• Code from the lecture and project:

https://github.com/mertside/CS5375 GPU Lecture



Readings

- How to CUDA? GPU Accelerated Computing with C and C++:
 - https://developer.nvidia.com/how-to-cuda-c-cpp
- Introduction to CUDA:
 - https://developer.nvidia.com/blog/even-easier-introduction-cuda/
- Unified Memory with CUDA:
 - https://developer.nvidia.com/blog/unified-memory-cuda-beginners/
- How to Optimize Data Transfers in CUDA C/C++:
 - https://developer.nvidia.com/blog/how-optimize-data-transfers-cuda-cc/
- An Efficient Matrix Transpose in CUDA using Shared Memory:
 - https://developer.nvidia.com/blog/efficient-matrix-transpose-cuda-cc/