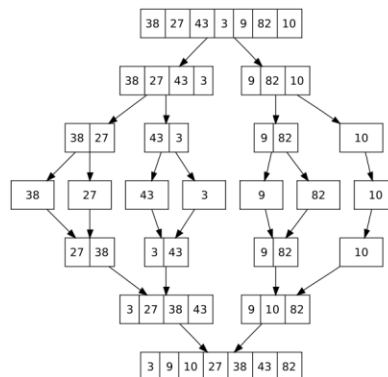


CUDA Misc

Mergesort, Pinned Memory, Device
Query, Multi GPU

Parallel Mergesort

- $O(N)$ runtime with memory copy overhead
 - Not really worth it compared to $O(N \lg N)$ sequential version but an interesting exercise
- Regular mergesort



CUDA Mergesort

- Split portion
 - Assign each thread to a number in the unsorted array
 - Example: 2 blocks, 4 threads per block

B0T0	B0T1	B0T2	B0T3	B1T0	B1T1	B1T2	B1T3
38	27	43	3	9	82	15	37

index = threadIdx.x + (blockIdx.x * blockDim.x)
 e.g. index = 3 + (1 * 4) = 7 for Block1 Thread 3

- Merge split into two phases
 - First phase: Sort each block by merging into shared memory

B0T0	B0T1	B0T2	B0T3	B1T0	B1T1	B1T2	B1T3
27	38	3	43	9	82	15	37

B0T0	B0T1	B0T2	B0T3	B1T0	B1T1	B1T2	B1T3
3	38	27	43	9	15	37	82

Why can't we keep doing this for the whole array?

Code to sort blocks

```
// This version only works for N = THREADS*BLOCKS
__global__ void sortBlocks(int *a)
{
    int i=2;
    __shared__ int temp[THREADS];
    while (i <= THREADS)
    {
        if ((threadIdx.x % i) == 0)
        {
            int index1 = threadIdx.x + (blockIdx.x * blockDim.x);
            int endIndex1 = index1 + i/2;
            int index2 = endIndex1;
            int endIndex2 = index2 + i/2;
            int targetIndex = threadIdx.x;
            int done = 0;
            while (!done)
            {
                if ((index1 == endIndex1) && (index2 < endIndex2))
                    temp[targetIndex++] = a[index2++];
                else if ((index2 == endIndex2) && (index1 < endIndex1))
                    temp[targetIndex++] = a[index1++];
                else if (a[index1] < a[index2])
                    temp[targetIndex++] = a[index1++];
                else
                    temp[targetIndex++] = a[index2++];
                if ((index1 == endIndex1) && (index2 == endIndex2))
                    done = 1;
            }
        }
        i *= 2;
    }
    __syncthreads();
    a[threadIdx.x + (blockIdx.x * blockDim.x)] = temp[threadIdx.x];
    __syncthreads();
}
```

Code for main

```
int main()
{
    int a[N];
    int *dev_a, *dev_temp;

    cudaMalloc((void **) &dev_a, N*sizeof(int));
    cudaMalloc((void **) &dev_temp, N*sizeof(int));

    // Fill array
    srand(time(NULL));
    for (int i = 0; i < N; i++)
    {
        int num = rand() % 100;
        a[i] = num;
        printf("%d ", a[i]);
    }
    printf("\n");

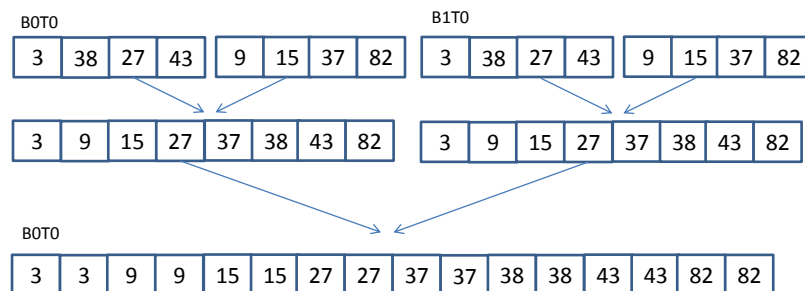
    // Copy data from host to device
    cudaMemcpy(dev_a, a, N*sizeof(int), cudaMemcpyHostToDevice);

    sortBlocks<<<BLOCKS,THREADS>>>(dev_a);
    cudaMemcpy(a, dev_a, N*sizeof(int), cudaMemcpyDeviceToHost);

    ...
}
```

Merging Blocks

- We now need to merge the sorted blocks
 - For simplicity, 1 thread per block



Single Step of Parallel Merge

```
__global__ void mergeBlocks(int *a, int *temp, int sortedsize)
{
    int id = blockIdx.x;

    int index1 = id * 2 * sortedsize;
    int endIndex1 = index1 + sortedsize;
    int index2 = endIndex1;
    int endIndex2 = index2 + sortedsize;
    int targetIndex = id * 2 * sortedsize;
    int done = 0;
    while (!done)
    {
        if ((index1 == endIndex1) && (index2 < endIndex2))
            temp[targetIndex++] = a[index2++];
        else if ((index2 == endIndex2) && (index1 < endIndex1))
            temp[targetIndex++] = a[index1++];
        else if (a[index1] < a[index2])
            temp[targetIndex++] = a[index1++];
        else
            temp[targetIndex++] = a[index2++];
        if ((index1 == endIndex1) && (index2 == endIndex2))
            done = 1;
    }
}
```

temp = device memory
same size as a

sortedsize = length of
a sorted "block" (doubles
in size from original block)

Main code

```
int blocks = BLOCKS/2;
int sortedsize = THREADS;
while (blocks > 0)
{
    mergeBlocks<<<blocks,1>>>>(dev_a, dev_temp, sortedsize);
    cudaMemcpy(dev_a, dev_temp, N*sizeof(int), cudaMemcpyDeviceToDevice);
    blocks /= 2;
    sortedsize *= 2;
}
cudaMemcpy(a, dev_a, N*sizeof(int), cudaMemcpyDeviceToHost);
```

Copy from device to device

MergeSort

- With bigger array:
 `#define N 1048576`
 `#define THREADS 512`
 `#define BLOCKS 2048`
- Our implementation is limited to a power of 2 for the number of blocks and for the number of threads per block
- The slowest part seems to be copying the data back to the host, is there anything we can do about that?

Page-Locked or Pinned Memory

- The CUDA runtime offers `cudaHostAlloc()` which is similar to `malloc`
- `malloc` memory is standard, pageable host memory
- `cudaHostAlloc()` memory is page-locked host memory or pinned memory
 - The OS guarantees it will never page the memory to disk and will reside in physical memory
 - Faster copying to the GPU because paged memory is first copied to pinned memory then DMA copies it to the GPU
- Does take away from total available system memory, may affect system performance

cudaHostAlloc

- Instead of malloc use:

```
int *a;  
cudaHostAlloc((void **) &a, size, cudaHostAllocDefault);  
...  
cudaFreeHost(a);
```

- Won't make much difference on our small mergesort but benchmark test with hundreds of copies:
 - Time using cudaMalloc: 9298.7 ms
 - MB/s during copy up: 2753.1
 - Time using cudaMalloc: 17415.4 ms
 - MB/s during copy down: 1470.0
 - Time using cudaHostAlloc: 6794.8 ms
 - MB/s during copy up: 3767.6
 - Time using cudaHostAlloc: 17167.1 ms
 - MB/s during copy down: 1491.2

Zero-Copy Host Memory

- Skipping, but pinned memory allows the possibility for the GPU to directly access host memory
 - Requires some different flags for cudaHostAlloc
 - Performance win if the GPU is integrated with the host (memory shared with the host anyway)
 - Performance loss for data read multiple times since zero-copy memory is not cached on the GPU

Device Query

- How do you know if you have integrated graphics?
 - Can use deviceQuery to see what devices you have
 - `cudaGetDeviceCount( &count )`
 - Stores number of CUDA-enabled devices in count
 - `cudaGetDeviceProperties( &prop, i )`
 - Stores device info into the prop struct for device i

Code

```
#include "stdio.h"

int main()
{
    cudaDeviceProp prop;

    int count;
    cudaGetDeviceCount(&count);
    for (int i=0; i< count; i++)
    {
        cudaGetDeviceProperties(&prop, i);
        printf( " --- General Information for device %d ---\n", i );
        printf( "Name: %s\n", prop.name );
        printf( "Compute capability: %d.%d\n", prop.major, prop.minor );
        printf( "Clock rate: %d\n", prop.clockRate );
        printf( "Device copy overlap: " );
        printf( "Integrated graphics: " );
        if (prop.integrated)
            printf( "True\n" );
        else
            printf( "False\n" );
        if (prop.deviceOverlap)
            printf( "Enabled\n" );
        else
            printf( "Disabled\n" );
    }
    ...
}
```

Using Multiple GPU's

- Can use `cudaSetDevice(deviceNum)` but has to run on separate threads
- Fortunately this is not too bad
 - Thread implementation varies by OS
 - Simple example using `pthread`s
 - Better than `fork/exec` since threads share the same memory instead of a copy of the memory space

Thread Sample

```

/* Need to compile with -pthread */
#include <pthread.h>
#include <stdio.h>
#include <stdlib.h>
#include <assert.h>

typedef struct argdata
{
    int i;
    int return_val;
} arg_data;

void *TaskCode(void *argument)
{
    int tid;
    arg_data *p;

    p = (arg_data *) argument;
    tid = (*p).i;
    printf("Hello World! It's me, thread %d!\n", tid);
    p->return_val = tid;

    return NULL;
}

int main ()
{
    pthread_t thread1,thread2;
    arg_data arg1, arg2;

    /* create two threads */
    arg1.i = 1;
    arg2.i = 2;
    pthread_create(&thread1, NULL, TaskCode, (void *) &arg1);
    pthread_create(&thread2, NULL, TaskCode, (void *) &arg2);

    /* wait for all threads to complete */
    pthread_join(thread1, NULL);
    pthread_join(thread2, NULL);

    printf("Done, values in return: %d %d\n", arg1.return_val,
        arg2.return_val);

    return 0;
}

```

Threads with GPU Code

```
// Using two GPU's to increment by 1 an array of 4 integers,
// one GPU to increment the first two, the second GPU to increment the next two
// Don't need to use -pthread with nvcc

#include <pthread.h>           // Use 2 threads to increment 2 integers in an array
#include <stdio.h>             void *TaskCode(void *argument)
#include <stdlib.h>             {
#include <assert.h>             arg_data *p;
                                int *dev_data;

typedef struct argdata
{
    int deviceId;
    int *data;
} arg_data;

__global__ void kernel(int *data)
{
    data[threadIdx.x]++;
}

                                p = (arg_data *) argument;
                                cudaSetDevice(p->deviceId);
                                cudaMalloc((void **) &dev_data, 2*sizeof(int));
                                cudaMemcpy(dev_data, p->data, 2*sizeof(int), cudaMemcpyHostToDevice);
                                kernel<<<1,2>>>(dev_data);
                                cudaMemcpy(p->data, dev_data, 2*sizeof(int), cudaMemcpyDeviceToHost);
                                cudaFree(dev_data);

                                return NULL;
}
```

Main

```
int main ()
{
    pthread_t thread1,thread2;
    arg_data arg1, arg2;
    int a[4];

    a[0] = 0; a[1] = 1; a[2] = 2; a[3] = 3;
    arg1.deviceID = 0;
    arg2.deviceID = 1;
    arg1.data = &a[0]; // Address of first 2 ints
    arg2.data = &a[2]; // Address of second 2 ints

    /* create two threads */
    pthread_create(&thread1, NULL, TaskCode, (void *) &arg1);
    pthread_create(&thread2, NULL, TaskCode, (void *) &arg2);

    /* wait for all threads to complete */
    pthread_join(thread1, NULL);
    pthread_join(thread2, NULL);

    for (int i=0; i < 4; i++)
        printf("%d ", a[i]);
    printf("\n");
    return 0;
}
```