Module 12 Lab

Breadth-First Search Queue

GPU Teaching Kit - Accelerated Computing

OBJECTIVE

The purpose of this lab is to understand hierarchical queuing in the context of the breadth first search algorithm as an example. You will implement a single iteration of breadth first search that takes a set of nodes in the current level (also called wave-front) as input and outputs the set of nodes belonging to the next level. You will implement two kernels:

- A simple version with global queuing
- An optimized version that uses shared-memory queuing.

INSTRUCTIONS

The graph structure is stored in the following way:

- numNodes the total number of nodes in the graph
- nodePtrs an array of length numNodes. Each entry is a pointer into numNeighbors, described below.
- nodeNeighbors an array whose length is the total number of neighbors each
 - node has. nodeNeighbors[nodePtrs[node]] to nodeNeighbors[nodePtrs[node+1]] describes the neighbors of node node.

The kernels take these structures as inputs, as well as a list of nodes in the current level, for which all of the neighbors must be visited.

- currLevelNodes an array of nodes for which neighbors must be visited
- numCurrLevelNodes the size of the previous array
- visitedNodes an array that describes which nodes have already been visited in the BFS

The kernels will need to produce the following outputs

- nextLevelNodes an array of neighbor nodes.
- numNextLevelNodes the number of neighbors

 visitedNodes - the nodes that have been visited by the end of the iteration. Note that this is the same array as the input. This is the output value that WebGPU will compare for correctness of your implementation.

Sequential pseudocode for the kernel is:

```
// Loop over all nodes in the current level
for idx = 0..numCurrLevelNodes
  node = currLevelNodes[idx];
  // Loop over all neighbors of the node
  for(nbrIdx = nodePtrs[node]..nodePtrs[node + 1];
    neighbor = nodeNeighbors[nbrIdx];
    // If the neighbor hasn't been visited yet
    if !nodeVisited[neighbor]
      // Mark it and add it to the queue
      nodeVisited[neighbor] = 1;
      nextLevelNodes[*numNextLevelNodes] = neighbor;
      ++(*numNextLevelNodes);
```

An empty stub for the kernels is provided. All you need to do is correctly implement the kernel code.

TEST DATASETS

The first three datasets invoke the Global Queue kernel. The second three invoke the Block Queue Kernel

LOCAL SETUP INSTRUCTIONS

The most recent version of source code for this lab along with the buildscripts can be found on the Bitbucket repository. A description on how to use the CMake tool in along with how to build the labs for local development found in the README document in the root of the repository.

The executable generated as a result of compiling the lab can be run using the following command:

```
./BfsQueue_Template -e <expected.raw> \
 -i <input0.raw>,<input1.raw>,<input2.raw>,<input3.raw>,<input4.raw> -t integral_vector
```

where <expected.raw> is the expected output, <input.raw> is the input dataset. The datasets can be generated using the dataset generator built as part of the compilation process.

QUESTIONS

CODE TEMPLATE

The following code is suggested as a starting point for students. The code handles the import and export as well as the checking of the solution. Students are expected to insert their code is the sections demarcated with //@@. Students expected the other code unchanged. The tutorial page describes the functionality of the wb* methods.

```
#include <stdio.h>
   #include <wb.h>
  #define BLOCK_SIZE 512
  // Maximum number of elements that can be inserted into a block queue
   #define BQ_CAPACITY 2048
   #define wbCheck(stmt)
    do {
       cudaError_t err = stmt;
       if (err != cudaSuccess) {
         wbLog(ERROR, "Failed to run stmt ", #stmt);
         return -1;
       }
     } while (0)
  // Global queuing stub
   __global__ void gpu_global_queuing_kernel(
       int *nodePtrs, int *nodeNeighbors, int *nodeVisited,
       int *currLevelNodes, int *nextLevelNodes,
       const unsigned int numCurrLevelNodes, int *numNextLevelNodes) {
22
23
    //@@ Insert Global Queuing Code Here
    // Loop over all nodes in the curent level
     // Loop over all neighbors of the node
     // If the neighbor hasn't been visited yet
     // Add it to the global queue (already marked in the exchange)
   }
30
  // Block queuing stub
  __global__ void gpu_block_queuing_kernel(
       int *nodePtrs, int *nodeNeighbors, int *nodeVisited,
34
       int *currLevelNodes, int *nextLevelNodes,
35
       const unsigned int numCurrLevelNodes, int *numNextLevelNodes) {
     //@@ Insert Block Queuing Code Here
    // Initialize shared memory queue
     // Loop over all nodes in the curent level
42
     // Loop over all neighbors of the node
```

```
// If the neighbor hasn't been visited yet
     // Add it to the block queue
     // If full, add it to the global queue
     // Allocate space for block queue to go into global queue
     // Store block queue in global queue
   }
51
52
   // Host function for global queuing invocation
53
   void gpu_global_queuing(int *nodePtrs, int *nodeNeighbors,
                            int *nodeVisited, int *currLevelNodes,
                            int *nextLevelNodes,
56
                            unsigned int numCurrLevelNodes,
57
                            int *numNextLevelNodes) {
     const unsigned int numBlocks = 45;
60
     gpu_global_queuing_kernel<<<numBlocks, BLOCK_SIZE>>>(
         nodePtrs, nodeNeighbors, nodeVisited, currLevelNodes, nextLevelNodes,
         numCurrLevelNodes, numNextLevelNodes);
63
   }
64
65
   // Host function for block queuing invocation
   void gpu_block_queuing(int *nodePtrs, int *nodeNeighbors, int *nodeVisited,
                           int *currLevelNodes, int *nextLevelNodes,
                           unsigned int numCurrLevelNodes,
69
                           int *numNextLevelNodes) {
     const unsigned int numBlocks = 45;
72
     gpu_block_queuing_kernel<<<numBlocks, BLOCK_SIZE>>>(
73
         nodePtrs, nodeNeighbors, nodeVisited, currLevelNodes, nextLevelNodes,
         numCurrLevelNodes, numNextLevelNodes);
   }
76
77
   int main(int argc, char *argv[]) {
     // Variables
     int numNodes;
     int *nodePtrs_h;
     int *nodeNeighbors_h;
     int *nodeVisited_h;
     int numTotalNeighbors_h;
     int *currLevelNodes_h;
     int *nextLevelNodes_h;
     int numCurrLevelNodes;
     int numNextLevelNodes_h;
     int *nodePtrs_d;
     int *nodeNeighbors_d;
     int *nodeVisited_d;
     int *currLevelNodes_d;
     int *nextLevelNodes_d;
     int *numNextLevelNodes_d;
     enum Mode { GPU_GLOBAL_QUEUE = 2, GPU_BLOCK_QUEUE };
```

```
97
     wbArg_t args = wbArg_read(argc, argv);
     Mode mode
                 = (Mode)wbImport_flag(wbArg_getInputFile(args, 0));
     nodePtrs_h =
          (int *)wbImport(wbArg_getInputFile(args, 1), &numNodes, "Integer");
     nodeNeighbors_h = (int *)wbImport(wbArg_getInputFile(args, 2),
                                        &numTotalNeighbors_h, "Integer");
     nodeVisited_h =
          (int *)wbImport(wbArg_getInputFile(args, 3), &numNodes, "Integer");
     currLevelNodes_h = (int *)wbImport(wbArg_getInputFile(args, 4),
                                         &numCurrLevelNodes, "Integer");
110
     // (do not modify) Datasets should be consistent
     if (nodePtrs_h[numNodes] != numTotalNeighbors_h) {
       wbLog(ERROR, "Datasets are inconsistent! Please report this.");
113
     }
114
     // (do not modify) Prepare next level containers (i.e. output variables)
     numNextLevelNodes_h = 0;
117
     nextLevelNodes_h = (int *)malloc((numNodes) * sizeof(int));
118
     wbLog(TRACE, "# Modes = ", mode);
120
     wbLog(TRACE, "# Nodes = ", numNodes);
121
     wbLog(TRACE, "# Total Neighbors = ", numTotalNeighbors_h);
     wbLog(TRACE, "# Current Level Nodes = ", numCurrLevelNodes);
     // (do not modify) Allocate device variables ------
125
     wbLog(TRACE, "Allocating device variables...");
     wbCheck(cudaMalloc((void **)&nodePtrs_d, (numNodes + 1) * sizeof(int)));
129
     wbCheck(cudaMalloc((void **)&nodeVisited_d, numNodes * sizeof(int)));
     wbCheck(cudaMalloc((void **)&nodeNeighbors_d,
                         nodePtrs_h[numNodes] * sizeof(int)));
     wbCheck(cudaMalloc((void **)&currLevelNodes_d,
133
                         numCurrLevelNodes * sizeof(int)));
     wbCheck(cudaMalloc((void **)&numNextLevelNodes_d, sizeof(int)));
     wbCheck(
         cudaMalloc((void **)&nextLevelNodes_d, (numNodes) * sizeof(int)));
     wbCheck(cudaDeviceSynchronize());
     // (do not modify) Copy host variables to device -----------
141
     wbLog(TRACE, "Copying data from host to device...");
142
143
     wbCheck(cudaMemcpy(nodePtrs_d, nodePtrs_h, (numNodes + 1) * sizeof(int),
144
                         cudaMemcpyHostToDevice));
     wbCheck(cudaMemcpy(nodeVisited_d, nodeVisited_h, numNodes * sizeof(int),
146
                         cudaMemcpyHostToDevice));
147
     wbCheck(cudaMemcpy(nodeNeighbors_d, nodeNeighbors_h,
                         nodePtrs_h[numNodes] * sizeof(int),
149
```

```
cudaMemcpyHostToDevice));
150
     wbCheck(cudaMemcpy(currLevelNodes_d, currLevelNodes_h,
151
                        numCurrLevelNodes * sizeof(int),
152
                        cudaMemcpyHostToDevice));
     wbCheck(cudaMemset(numNextLevelNodes_d, 0, sizeof(int)));
154
     wbCheck(cudaDeviceSynchronize());
155
     // (do not modify) Launch kernel ------
157
     printf("Launching kernel ");
159
     if (mode == GPU_GLOBAL_QUEUE) {
161
       wbLog(INFO, "(GPU with global queuing)...");
162
       gpu_global_queuing(nodePtrs_d, nodeNeighbors_d, nodeVisited_d,
163
                          currLevelNodes_d, nextLevelNodes_d,
                          numCurrLevelNodes, numNextLevelNodes_d);
165
       wbCheck(cudaDeviceSynchronize());
166
     } else if (mode == GPU_BLOCK_QUEUE) {
167
       wbLog(INFO, "(GPU with block and global queuing)...");
       gpu_block_queuing(nodePtrs_d, nodeNeighbors_d, nodeVisited_d,
                         currLevelNodes_d, nextLevelNodes_d,
170
                         numCurrLevelNodes, numNextLevelNodes_d);
171
       wbCheck(cudaDeviceSynchronize());
     } else {
173
       wbLog(ERROR, "Invalid mode!\n");
174
       exit(0);
175
     }
     // (do not modify) Copy device variables from host ----------
178
179
     wbLog(INFO, "Copying data from device to host...");
181
     wbCheck(cudaMemcpy(&numNextLevelNodes_h, numNextLevelNodes_d,
182
                        sizeof(int), cudaMemcpyDeviceToHost));
183
     wbCheck(cudaMemcpy(nextLevelNodes_h, nextLevelNodes_d,
                        numNodes * sizeof(int), cudaMemcpyDeviceToHost));
     wbCheck(cudaMemcpy(nodeVisited_h, nodeVisited_d, numNodes * sizeof(int),
186
                        cudaMemcpyDeviceToHost));
187
     wbCheck(cudaDeviceSynchronize());
     // (do not modify) Verify correctness
     // -----
     // Only check that the visited nodes match the reference implementation
     wbSolution(args, nodeVisited_h, numNodes);
194
     // (do not modify) Free memory
     // -----
     free(nodePtrs_h);
     free(nodeVisited_h);
     free(nodeNeighbors_h);
     free(currLevelNodes_h);
     free(nextLevelNodes_h);
202
```

```
wbCheck(cudaFree(nodePtrs_d));
wbCheck(cudaFree(nodeVisited_d));
wbCheck(cudaFree(nodeNeighbors_d));
wbCheck(cudaFree(currLevelNodes_d));
wbCheck(cudaFree(numNextLevelNodes_d));
wbCheck(cudaFree(nextLevelNodes_d));
wbCheck(cudaFree(nextLevelNodes_d));
return 0;
}
```

CODE SOLUTION

The following is a possible implementation of the lab. This solution is intended for use only by the teaching staff and should not be distributed to students.

```
#include <stdio.h>
   #include <wb.h>
   #define BLOCK_SIZE 512
   // Maximum number of elements that can be inserted into a block queue
   #define BQ_CAPACITY 2048
   #define wbCheck(stmt)
    do {
       cudaError_t err = stmt;
11
       if (err != cudaSuccess) {
         wbLog(ERROR, "Failed to run stmt ", #stmt);
         return -1;
       }
15
     } while (0)
   // Global queuing stub
   __global__ void gpu_global_queuing_kernel(
       int *nodePtrs, int *nodeNeighbors, int *nodeVisited,
       int *currLevelNodes, int *nextLevelNodes,
       const unsigned int numCurrLevelNodes, int *numNextLevelNodes) {
22
23
     //@@ Insert Global Queuing Code Here
24
     const unsigned int tid = blockIdx.x * blockDim.x + threadIdx.x;
27
     // Loop over all nodes in the curent level
     for (unsigned int idx = tid; idx < numCurrLevelNodes;</pre>
          idx += gridDim.x * blockDim.x) {
       const unsigned int node = currLevelNodes[idx];
31
       // Loop over all neighbors of the node
32
       for (unsigned int nbrIdx = nodePtrs[node]; nbrIdx < nodePtrs[node + 1];</pre>
33
            ++nbrIdx) {
         const unsigned int neighbor = nodeNeighbors[nbrIdx];
35
         // If the neighbor hasn't been visited yet
```

```
const unsigned int visited = atomicExch(&(nodeVisited[neighbor]), 1);
37
         if (!visited) {
           // Add it to the global queue (already marked in the exchange)
           const unsigned int gQIdx = atomicAdd(numNextLevelNodes, 1);
           nextLevelNodes[gQIdx]
                                     = neighbor;
         }
       }
     }
   }
45
  // Block queuing stub
   __global__ void gpu_block_queuing_kernel(
       int *nodePtrs, int *nodeNeighbors, int *nodeVisited,
       int *currLevelNodes, int *nextLevelNodes,
       const unsigned int numCurrLevelNodes, int *numNextLevelNodes) {
     //@@ INSERT KERNEL CODE HERE
53
     const unsigned int tid = blockIdx.x * blockDim.x + threadIdx.x;
     const unsigned int numCurrLevelNodes_reg = numCurrLevelNodes;
57
     // Initialize shared memory queue
     __shared__ int bQueue[BQ_CAPACITY];
     __shared__ int bQueueCount, gQueueStartIdx;
     if (threadIdx.x == 0) {
       bQueueCount = 0;
62
     }
     __syncthreads();
64
     // Loop over all nodes in the curent level
     for (unsigned int idx = tid; idx < numCurrLevelNodes_reg;</pre>
          idx += gridDim.x * blockDim.x) {
68
       const unsigned int node = currLevelNodes[idx];
69
       // Loop over all neighbors of the node
       for (unsigned int nbrIdx = nodePtrs[node]; nbrIdx < nodePtrs[node + 1];</pre>
            ++nbrIdx) {
         const unsigned int neighbor = nodeNeighbors[nbrIdx];
73
         // If the neighbor hasn't been visited yet
74
         const unsigned int visited = atomicExch(&(nodeVisited[neighbor]), 1);
         if (!visited) {
           // Add it to the block queue
           const unsigned int bQueueIdx = atomicAdd(&bQueueCount, 1);
           if (bQueueIdx < BQ_CAPACITY) {</pre>
             bQueue[bQueueIdx] = neighbor;
           } else { // If full, add it to the global queue
81
             bQueueCount
                                           = BQ_CAPACITY;
             const unsigned int gQueueIdx = atomicAdd(numNextLevelNodes, 1);
             nextLevelNodes[gQueueIdx]
                                           = neighbor;
           }
         }
       }
     }
     __syncthreads();
```

```
90
      // Allocate space for block queue to go into global queue
      if (threadIdx.x == 0) {
        qQueueStartIdx = atomicAdd(numNextLevelNodes, bQueueCount);
      __syncthreads();
95
      // Store block queue in global queue
97
      for (unsigned int bQueueIdx = threadIdx.x; bQueueIdx < bQueueCount;</pre>
           bQueueIdx += blockDim.x) {
        nextLevelNodes[gQueueStartIdx + bQueueIdx] = bQueue[bQueueIdx];
      }
101
   }
102
103
   // Host function for global queuing invocation
   void gpu_global_queuing(int *nodePtrs, int *nodeNeighbors,
105
                             int *nodeVisited, int *currLevelNodes,
106
                             int *nextLevelNodes,
107
                             unsigned int numCurrLevelNodes,
                             int *numNextLevelNodes) {
110
      const unsigned int numBlocks = 45;
111
      gpu_global_queuing_kernel<<<numBlocks, BLOCK_SIZE>>>(
          nodePtrs, nodeNeighbors, nodeVisited, currLevelNodes, nextLevelNodes,
113
          numCurrLevelNodes, numNextLevelNodes);
114
   }
115
116
   // Host function for block queuing invocation
117
    void gpu_block_queuing(int *nodePtrs, int *nodeNeighbors, int *nodeVisited,
118
                            int *currLevelNodes, int *nextLevelNodes,
119
                            unsigned int numCurrLevelNodes,
                            int *numNextLevelNodes) {
122
      const unsigned int numBlocks = 45;
123
      gpu_block_queuing_kernel<<<numBlocks, BLOCK_SIZE>>>(
          nodePtrs, nodeNeighbors, nodeVisited, currLevelNodes, nextLevelNodes,
          numCurrLevelNodes, numNextLevelNodes);
126
   }
127
   int main(int argc, char *argv[]) {
     // Variables
      int numNodes;
131
      int *nodePtrs_h;
      int *nodeNeighbors_h;
      int *nodeVisited_h;
      int numTotalNeighbors_h;
      int *currLevelNodes_h;
      int *nextLevelNodes_h;
      int numCurrLevelNodes;
      int numNextLevelNodes_h;
      int *nodePtrs_d;
      int *nodeNeighbors_d;
      int *nodeVisited_d;
142
```

```
int *currLevelNodes_d;
     int *nextLevelNodes_d;
     int *numNextLevelNodes_d;
     enum Mode { GPU_GLOBAL_QUEUE = 2, GPU_BLOCK_QUEUE };
147
     wbArg_t args = wbArg_read(argc, argv);
     Mode mode
                  = (Mode)wbImport_flag(wbArg_getInputFile(args, 0));
     nodePtrs_h =
          (int *)wbImport(wbArg_getInputFile(args, 1), &numNodes, "Integer");
     nodeNeighbors_h = (int *)wbImport(wbArg_getInputFile(args, 2),
                                        &numTotalNeighbors_h, "Integer");
155
156
     nodeVisited_h =
          (int *)wbImport(wbArg_getInputFile(args, 3), &numNodes, "Integer");
158
     currLevelNodes_h = (int *)wbImport(wbArg_getInputFile(args, 4),
                                         &numCurrLevelNodes, "Integer");
     // (do not modify) Datasets should be consistent
     if (nodePtrs_h[numNodes] != numTotalNeighbors_h) {
       wbLog(ERROR, "Datasets are inconsistent! Please report this.");
164
     }
166
     // (do not modify) Prepare next level containers (i.e. output variables)
167
     numNextLevelNodes_h = 0;
     nextLevelNodes_h = (int *)malloc((numNodes) * sizeof(int));
     wbLog(TRACE, "# Modes = ", mode);
171
     wbLog(TRACE, "# Nodes = ", numNodes);
172
     wbLog(TRACE, "# Total Neighbors = ", numTotalNeighbors_h);
     wbLog(TRACE, "# Current Level Nodes = ", numCurrLevelNodes);
     // (do not modify) Allocate device variables ------
176
     wbLog(TRACE, "Allocating device variables...");
179
     wbCheck(cudaMalloc((void **)&nodePtrs_d, (numNodes + 1) * sizeof(int)));
180
     wbCheck(cudaMalloc((void **)&nodeVisited_d, numNodes * sizeof(int)));
     wbCheck(cudaMalloc((void **)&nodeNeighbors_d,
182
                         nodePtrs_h[numNodes] * sizeof(int)));
     wbCheck(cudaMalloc((void **)&currLevelNodes_d,
184
                         numCurrLevelNodes * sizeof(int)));
     wbCheck(cudaMalloc((void **)&numNextLevelNodes_d, sizeof(int)));
     wbCheck(
187
         cudaMalloc((void **)&nextLevelNodes_d, (numNodes) * sizeof(int)));
     wbCheck(cudaDeviceSynchronize());
     // (do not modify) Copy host variables to device ------
     wbLog(TRACE, "Copying data from host to device...");
193
     wbCheck(cudaMemcpy(nodePtrs_d, nodePtrs_h, (numNodes + 1) * sizeof(int),
195
```

```
cudaMemcpyHostToDevice));
196
     wbCheck(cudaMemcpy(nodeVisited_d, nodeVisited_h, numNodes * sizeof(int),
197
                        cudaMemcpyHostToDevice));
     wbCheck(cudaMemcpy(nodeNeighbors_d, nodeNeighbors_h,
                        nodePtrs_h[numNodes] * sizeof(int),
200
                        cudaMemcpyHostToDevice));
     wbCheck(cudaMemcpy(currLevelNodes_d, currLevelNodes_h,
                        numCurrLevelNodes * sizeof(int),
203
                        cudaMemcpyHostToDevice));
204
     wbCheck(cudaMemset(numNextLevelNodes_d, 0, sizeof(int)));
     wbCheck(cudaDeviceSynchronize());
     208
     printf("Launching kernel ");
211
     if (mode == GPU_GLOBAL_QUEUE) {
212
       wbLog(INFO, "(GPU with global queuing)...");
213
       gpu_global_queuing(nodePtrs_d, nodeNeighbors_d, nodeVisited_d,
214
                          currLevelNodes_d, nextLevelNodes_d,
                          numCurrLevelNodes, numNextLevelNodes_d);
216
       wbCheck(cudaDeviceSynchronize());
217
     } else if (mode == GPU_BLOCK_QUEUE) {
       wbLog(INFO, "(GPU with block and global gueuing)...");
219
       gpu_block_queuing(nodePtrs_d, nodeNeighbors_d, nodeVisited_d,
220
                         currLevelNodes_d, nextLevelNodes_d,
221
                         numCurrLevelNodes, numNextLevelNodes_d);
       wbCheck(cudaDeviceSynchronize());
     } else {
224
       wbLog(ERROR, "Invalid mode!\n");
225
       exit(0);
     }
227
228
     // (do not modify) Copy device variables from host ----------
229
     wbLog(INFO, "Copying data from device to host...");
232
     wbCheck(cudaMemcpy(&numNextLevelNodes_h, numNextLevelNodes_d,
233
                        sizeof(int), cudaMemcpyDeviceToHost));
234
     wbCheck(cudaMemcpy(nextLevelNodes_h, nextLevelNodes_d,
235
                        numNodes * sizeof(int), cudaMemcpyDeviceToHost));
236
     wbCheck(cudaMemcpy(nodeVisited_h, nodeVisited_d, numNodes * sizeof(int),
237
                        cudaMemcpyDeviceToHost));
     wbCheck(cudaDeviceSynchronize());
240
     // (do not modify) Verify correctness
241
     // -----
     // Only check that the visited nodes match the reference implementation
243
     wbSolution(args, nodeVisited_h, numNodes);
245
     // (do not modify) Free memory
```

```
free(nodePtrs_h);
249
      free(nodeVisited_h);
      free(nodeNeighbors_h);
      free(currLevelNodes_h);
      free(nextLevelNodes_h);
253
     wbCheck(cudaFree(nodePtrs_d));
254
     wbCheck(cudaFree(nodeVisited_d));
     wbCheck(cudaFree(nodeNeighbors_d));
     wbCheck(cudaFree(currLevelNodes_d));
     wbCheck(cudaFree(numNextLevelNodes_d));
     wbCheck(cudaFree(nextLevelNodes_d));
     return 0;
   }
```

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