## The report of part2

## 1. Implementation of code

Successfully generated 3 completed versions of the code during the implementation of the function. At the same time, the other 1 versions were incomplete which is more reasonable on distributing threads and which is a better algorithm.

#### 1.1 version 1

The first version aims to parallelise each input pixel. The size of the block set to c<sup>2</sup> so that threads will within the same block and responsible for calculating a mosaic. So the size of the grid is up to the size of mosaic (c witch input from the user).

First, I get data of r,g,b from PPMrgb structure and store them into three arrays respectively. And these three arrays be passed into the kernel. In the kernel, I index every pixel and add them within every block by atomicAdd(). There are two drawbacks to this method. However, the method cannot calculate the overlarge inputting cell size(c). Because the maximum thread is 1024. In this method, each block will be divided to c^2 threads so that the maximum c is 32. Thus, the limitation of this method is the size of the picture is limited. On another hand, each thread is responsible for a pixel and is not responsible for any calculations, and it only computes the sum of the values in all threads in a block (i.e., the RGB of each pixel). Therefore, this method does not do parallel calculations to complete the addition in the mosaic, resulting in no higher computational speed with parallel computation.



Figure 1.1

I have tried some optimization methods on this method. On the basis of this, c is set to be larger than 32, and a mosaic unit is allocated to a plurality of blocks for calculation. For example, when c is equal to 64, 4 blocks compute a mosaic; when c is equal to 128, 16 blocks compute a mosaic. Then, you get a general formula. When c is greater than 32, 2<sup>(c/32)</sup>, blocks are responsible for computing a mosaic cell. Then, it can handle the case where require c bigger than 32.

### 1.2 version 2

Version 2 is the basic version that implements all the features. Version 2 parallelise each mosaic cell that can solve the problem of the limitation of the number of threads in the Version 1 block. Similarly, Version 2 passes RGB data into the GPU through an array. As Figure 2.1 shows that each block is responsible for calculating the superposition operation in each mosaic unit, and there is only one thread in one block. That is, this thread in each block does the calculation for each mosaic.

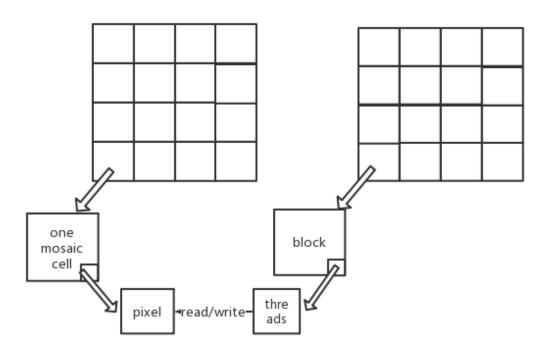


Figure 1.2.1 the structure of Version 2

In this version, the smaller the c value, the shorter the runtime is as shown in Figure c for 256 and 64 respectively (Figure 2.2 a and b). The reason is that the larger the c value, the more computational amount of each block (ie, each thread), so the running time will increase.

```
GPU Average image colour red = 125, green = 126, blue = 111 GPUtime:0.122000请按任意键继续. . .
```

```
C:\Windows\system32\cmd.exe
CPU Average image colour red = 125, green = 126, blue = 111
CPUtime:0.109000请按任意键继续. . .
```

Figure 1.2.2 a) when c=256, the time of GPU running is 0.122000s; b) when c=64, the time of GPU running is 0.109000s.

b

However, for the case of the same c value for different pictures, the smaller the picture size, the shorter the running time. As shown in Figure 2.3 a and b, c is 64 and the pictures are 2048 \* 2048 and 512 \* 512 respectively.

```
C:\Windows\system32\cmd.exe
GPU Average image colour red = 125, green = 126, blue = 111
GPUtime: 0. 109000请按任意键继续. . .
```

```
C:\Windows\system32\cmd.exe

| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\Windows\system32\cmd.exe
| C:\W
```

b

Figure 1.2.3 In case of c=64, a) when the picture size is 2048\*2048, the time of GPU running is 0.109000s; b) when picture size is 512\*512, the time of GPU running is 0.0120000s.

#### 1.3 version 3

I think version 3 is the best version of all the versions I can implement. Based on Version 2, Version 3 changes the way of representing RGB data. In version 2, a one-dimensional array is used. In this version, Structures of Arrays is used instead. Compared with Version 2, it greatly improves the running speed and shortens the running time.

```
ssignment_GPUs_part2
                                                                                                                                                             ▼ © CUDA_MODE3_struc(PPMImage * image)
                                                                                    (Global Scope)
                          PPMrgb *rgb = (PPMrgb *)malloc(sizeof(PPMrgb)*size);
                          rgb = image->rgb;
int *sumr = (int *)malloc(temp * sizeof(int));
    1054
    1055
                          int *sumg = (int *)malloc(temp * sizeof(int));
int *sumb = (int *)malloc(temp * sizeof(int));
    1056
    1057
    1058
    1059
                          int *d sumg;
    1060
                          int *d_sumb;
    1061
    1062
                          PPMrgb *d_rgb;
    1063
                          //malloc gpu space
                         //mailoc gpu space
cudaMalloc((void **)&d_sumr, temp * sizeof(int));
cudaMalloc((void **)&d_sumg, temp * sizeof(int));
cudaMalloc((void **)&d_sumb, temp * sizeof(int));
cudaMalloc((void **)&d_sumb, temp * sizeof(int));
    1064
    1065
    1066
   1067
1068
                          checkCUDAError("CUDA malloc"):
    1070
                          //cpy from cpu to gpu
                          cudaMemcpy(d_sum, sum, temp * sizeof(int), cudaMemcpyHostToDevice);
cudaMemcpy(d_sumg, sumg, temp * sizeof(int), cudaMemcpyHostToDevice);
cudaMemcpy(d_sumb, sumb, temp * sizeof(int), cudaMemcpyHostToDevice);
cudaMemcpy(d_rgb, rgb, sizeof(PPMrgb)*size, cudaMemcpyHostToDevice);
   1071
    1073
   1074
                          checkCUDAError("CUDA memcpy");
   1076
    1077
    1078
                          dim3 Grid(width / c, high / c);
                          \label{eq:dim3_Block} $$\dim Block(1);$$ aveMosaic3 << $<$ Grid, Block, temp >> > (d_rgb, c, width, d_sumr, d_sumg, d_sumb);
   1079
    1081
                          checkCUDAError("CUDA kernel");
90 %
```

Figure 1.3.1 code of Structures of Array

```
C:\Windows\system32\cmd.exe

CPU Average image colour red = 145, green = 126, blue = 111
ceGPUtime:0.060000请按任意键继续. . .

D
```

Figure 1.3.2 runtime of v3

Compared with the version 2, the speed has been improved.

#### 1.4 version 4

Version 4 is based on the optimization of Version 2. This is an incomplete version. The way to transfer data is the same as that of version 2. It is also to transfer and represent RGB data into GPU by an array. Each block is responsible for calculating the superposition operation in each mosaic unit. The difference is that there are c threads in a block to do the superposition operation instead of one block and only one thread to do the operation. Each thread in each block is responsible for the superposition of a row in the mosaic cell. After all the threads in the same block have completed the operation, perform another superposition operation in each block (Figure 1.4.1).

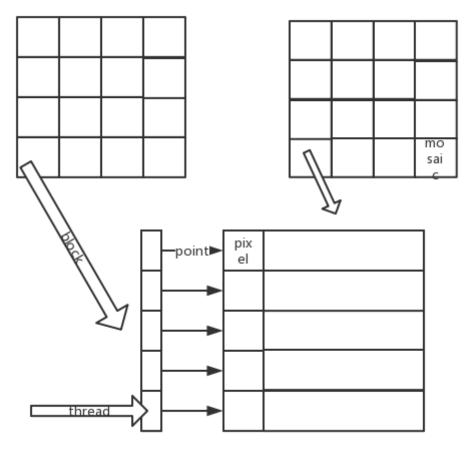


Figure 1.4.1 the structure of Vision 4

```
561
562
              int sum = 0;
563
              __shared__ int sumRed;
              __shared__ int sumGreen;
__shared__ int sumBlue;
564
565
              __shared__ int aveRed;
566
567
              __shared__ int aveGreen;
568
              __shared__ int aveBlue;
569
570
              //int index = threadIdx.x + threadIdx.y * blockDim.x * c + blockIdx.x * c + blockIdx.y * c * width;
571
              int index = threadIdx.x + threadIdx.y*width + blockIdx.x*c + blockIdx.y * c * width;
572
              for (int i = 0; i < c; i++) {|
    sumRed = sumRed + image->rgb[index + i].red;
573
574
                  sumGreen = sumGreen + image->rgb[index + i].green;
575
576
                  sumBlue = sumBlue + image->rgb[index + i].blue;
577
578
              if (threadIdx.x == 0) {
579
                  aveRed = sumRed / (c*c);
aveGreen = sumGreen / (c*c);
aveBlue = sumBlue / (c*c);
580
581
582
583
584
585
              for (int i = 0; i < c; i++) {
586
                  image->rgb[index + i].red = aveRed;
                  image->rgb[index + i].green = aveGreen;
587
                  image->rgb[index + i].blue = aveBlue;
588
589
```

Figure 1.4.2

## 2. Optimisations

## 2.1 Different methods to layout or represent your data

there are two different methods to layout the data of rgb which are array and structures of arrays.which are correspond to Version 2 and Version 3 respectively. The speed of operation of using structures of arrays is greatly improved. The code and results are compared as follows:

```
mosaic.cu* ≠ ×
                                                                                                                                                   (Global Scope)

▼ © CUDA_MODE3(PPMImage * image)

assignment GPUs part2
                                              int *d sumg;
                                              int *d_sumb;
//int *d_block_results;
          925
                                            //int *d_block_results;
//malloc gpu space
cudaMalloc((void **)&d_rarr, width*high * sizeof(int));
cudaMalloc((void **)&d_garr, width*high * sizeof(int));
cudaMalloc((void **)&d_barr, width*high * sizeof(int));
cudaMalloc((void **)&d_sumr, temp * sizeof(int));
cudaMalloc((void **)&d_sum, temp * sizeof(int));
cudaMalloc((void **)&d_sumb, temp * sizeof(int));
//cudaMalloc((void **)&d_sub, temp * sizeof(int));
//cudaMalloc((void **)&d_block_results, temp * sizeof(int));
//cudaMalloc((void **)&d_sub, temp * sizeof(int));
          927
          928
          929
          930
          931
          932
                                              checkCUDAError("CUDA malloc");
          934
                                            //copy data from cpu to gpu,store in global memory
cudaMemcpy(d_rarr, rarr, width*high * sizeof(int), cudaMemcpyHostToDevice);
cudaMemcpy(d_garr, garr, width*high * sizeof(int), cudaMemcpyHostToDevice);
cudaMemcpy(d_blor, barr, width*high * sizeof(int), cudaMemcpyHostToDevice);
//daMemcpy(d_block_results, block_results, width*high * sizeof(int), cudaMemcpyHostToDevice);
cudaMemcpy(d_sumr, sumr, temp * sizeof(int), cudaMemcpyHostToDevice);
cudaMemcpy(d_sumg, sumg, temp * sizeof(int), cudaMemcpyHostToDevice);
cudaMemcpy(d_sumb, sumb, temp * sizeof(int), cudaMemcpyHostToDevice);
checkCUDAError("CUDA memcpy");
//call kepnel
          936
          938
          939
          940
          941
          943
                                               //call kernel
          945
                                              dim3 Grid(width / c, high / c);
                                             dain3 Block(1);
aveMosaic3 << Grid, Block, temp >> > (d_rarr, d_garr, d_barr, c, width, d_sumr, d_sumg, d_sumb);
checkCUDAError("CUDA kernel");
          947
          948
          949
          950
                                              //, sumr, d_block_results
```

Figure 2.1.1 code of using array 1

```
ssignment_GPUs_part2

→ aveMosaic3(int * d_rarr, int * d_garr, int * d_b
                                                                   (Global Scope)
                    int aveGreen = 0;
                     int aveBlue = 0;
    803
                     //extern __shared__ int red[];
    805
                    //int index = threadIdx.x + threadIdx.y * blockDim.x * c + blockIdx.x * c + blockIdx.y * c * width; int index = blockIdx.x*c + blockIdx.y * c * width;
    806
    807
    808
                     __syncthreads();
    809
    810
                     //threads index rgb and do add
                     //threads index rgu and up and
for (int i = 0; i < c; i++) {
    for (int j = 0; j < c; j++) {
        sumRed = sumRed + d_rarr[index + j + i*width];
        sumGreen = sumGreen + d_garr[index + j + i*width];
}
    811
    812
    813
    814
    815
                               sumBlue = sumBlue + d_barr[index + j + i*width];
    816
    817
    818
                     __syncthreads();
    819
    820
                     //calculate the whole pic's rgb sum
    822
                    if (threadIdx.x == 0) {
                          atomicAdd(&d_sumr[0], sumRed);
    823
    824
                          atomicAdd(&d_sumg[0], sumGreen);
    825
                          atomicAdd(&d_sumb[0], sumBlue);
    826
    827
    829
```

Figure 2.1.2 code of using array 2

```
assignment_GPUs_part2
                                                                                         (Global Scope)
                                                                                                                                                                      int *sumr = (int *)malloc(temp * sizeof(int));
int *sumg = (int *)malloc(temp * sizeof(int));
int *sumb = (int *)malloc(temp * sizeof(int));
    1042
    1043
                            int *d_sumr;
     1044
    1945
                           int *d_sumg;
                           int *d_sumb;
PPMrgb *d_rgb;
    1046
    1047
                            //malloc gpu space
    1048
                           //malioc gpu space
cudaMalloc((void **)&d_sumr, temp * sizeof(int));
cudaMalloc((void **)&d_sumg, temp * sizeof(int));
cudaMalloc((void **)&d_sumb, temp * sizeof(int));
cudaMalloc((void **)&d_rgb, sizeof(PPMrgb)*size);
checkCUDAError("CUDA malloc");
    1049
    1050
    1051
    1052
    1053
    1054
    1055
                           //cpy from cpu to gpu
                           cudaMemcpy(d_sump, sump, temp * sizeof(int), cudaMemcpyHostToDevice); cudaMemcpy(d_sumg, sumg, temp * sizeof(int), cudaMemcpyHostToDevice); cudaMemcpy(d_sumb, sumb, temp * sizeof(int), cudaMemcpyHostToDevice);
    1056
    1057
    1058
    1059
                           cudaMemcpy(d_rgb, rgb, sizeof(PPMrgb)*size, cudaMemcpyHostToDevice);
checkCUDAError("CUDA memcpy");
    1060
    1061
    1062
                            //call kernel
                           dim3 Grid(width / c, high / c);
    1963
                           dim3 Block(1);
aveMosaic3 << < Grid, Block, temp >> > (d_rgb, c, width, d_sumr, d_sumg, d_sumb);
checkCUDAError("CUDA kernel");
    1064
    1065
    1066
    1067
    1068
```

Figure 2.1.3 code of using structures of arrays 1

```
mosaic.cu ⊅ ×
                                                                              (Global Scope)
ssignment_GPUs_part2

        ■ aveMosaic3_struc(PPMrgb * d_rgb, int c,

      988
                        int aveBlue = 0;
     989
                         int index = blockIdx.x*c + blockIdx.y * c * width;
     991
                        //threads index rgb and do add
     992
     993
                         for (int i = 0; i < c; i++) {
                               (Int 1 = 0, 1 < c, 1++) {
    for (int j = 0; j < c; j++) {
        sumRed = sumRed + d_rgb[index + j + i*width].red;
        sumGreen = sumGreen + d_rgb[index + j + i*width].green;
        sumBlue = sumBlue + d_rgb[index + j + i*width].blue;</pre>
     994
     995
     996
     997
     998
                              }
                        }
     999
    1000
                        __syncthreads();
//calculate the whole pic's rgb sum
if (threadIdx.x == 0) {
    1001
    1002
    1003
    1004
                               atomicAdd(&d_sumr[0], sumRed);
                              atomicAdd(&d_sumg[0], sumGreen);
atomicAdd(&d_sumb[0], sumBlue);
    1005
    1006
    1007
    1008
    1009
                           _syncthreads();
                        //calculate the average rgb of every mosaic
aveRed = sumRed / div;
aveGreen = sumGreen / div;
    1011
    1012
    1013
    1014
                         aveBlue = sumBlue / div;
    1015
90 %
```

Figure 2.1.4 code of using structures of arrays 2

```
GPU Average image colour red = 125, green = 126, blue = 111
GPUtime: 0. 109000请按任意键继续. . .
```

а

C:\Windows\system32\cmd.exe

```
PU Average image colour red = 125, green = 126, blue = 111
PUtime:0.061000请按任意键继续. . .
```

b

Figure 2.1.5 In case of c=64 and same picture a) when using arrays, the time of GPU running is 0.109000s; b) when using structures of arrays, the time of GPU running is 0.062000s.

# 2.2 The use of various GPU memory caches shared memory

I try to use shared memory to store the sum of every mosaic cell to reduce the number of global memory reads. because found the sum of every mosaic cell value to be used too many times when averaging and summing the whole picture.

```
int div = d_c*d_c;
__shared__ int sumGreen;
__shared__ int sumBlue;
int aveRed = 0;
int aveGreen = 0;
int aveBlue = 0;
int index = blockIdx.x*c + blockIdx.y * c * width;
```

Figure 2.2.1 code of using shared memory

```
C:\Windows\system32\cmd.exe

as.CPU Average image colour red = 180, green = 182, blue = 161

GPUtime: 0. 050000请按任意键继续. . .

fere terr issa
5.p
12F
```

Figure 2.2.1 runtime of using shared memory

#### constant memory:

there are three constants required in the calculation process of gpu which are value c and the width of picture. so I use constant memory to store them. The speed of operation is improved a bit.

```
char *ppmfileout;
__constant__ int d_c;
__constant__ int d_WIDTH;
```

Figure 2.1.4 code of using constant memory

```
C:\Windows\system32\cmd.exe

'as CPU Average image colour red = 125, green = 126, blue = 111

m GPUtime: 0. 059000请按任意键继续. . .

fer

ter

ter

ter

ter

126
```

Figure 2.2.1 runtime of using constant memory

## 2.3 some GPU optimisations for improving the performance syncthreads:

synchronize before calculating the average value to make sure that a mosaic cell completes all internal superposition operations.

```
for (int i = 0; i < d_c; i++) {
    for (int j = 0; j < d_c; j++) {
        sumRed = sumRed + d_rgb[index + j + i*d_WIDTH].red;
        sumGreen = sumGreen + d_rgb[index + j + i*d_WIDTH].green;
        sumBlue = sumBlue + d_rgb[index + j + i*d_WIDTH].blue;
  syncthreads();
//calculate the whole pic's rgb sum
if (threadIdx.x == 0) {
    atomicAdd(&d_sumr[0], sumRed);
    atomicAdd(&d_sumg[0], sumGreen);
    atomicAdd(&d_sumb[0], sumBlue);
}
 _syncthreads();
//calculate the average rgb of every mosaic
aveRed = sumRed / div;
aveGreen = sumGreen / div;
aveBlue = sumBlue / div;
```

#### Reduction:

In the method of calculating the sum RGB of the whole picture, I use atomicAdd function. I have a thought that i can calculate it using reduction, so that the continuous block can be released, but the effect is not significant in the current version, because each block has only one thread, even It is not a discontinuous block in the thread to complete the current operation can also be released.

The effect on v4 should be significant, because there are c threads in a block in v4. When c is larger, the superimposed operation after reduction optimization will release continuous threads.

## 3. summary

During the completion of this assignment, I first corrected the function of the cpu part and simply optimized the openmp part. Inspired by the OPENMP part, I first figure out version version 1 and version 2, and finally I got version 3 which is can implemented all the function through continuous optimization as my assignment version. I still have some better method which i think it's will be ,ore rational use of resources in the gpu calculation process, like version 4, didn't completed and need to debug.