# Sobel算子边缘检测的 CUDA实现

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#### 1、Sobel原理

• 主要用于获得数字图像的一阶梯度,常见的应用和物理意义是边缘检测

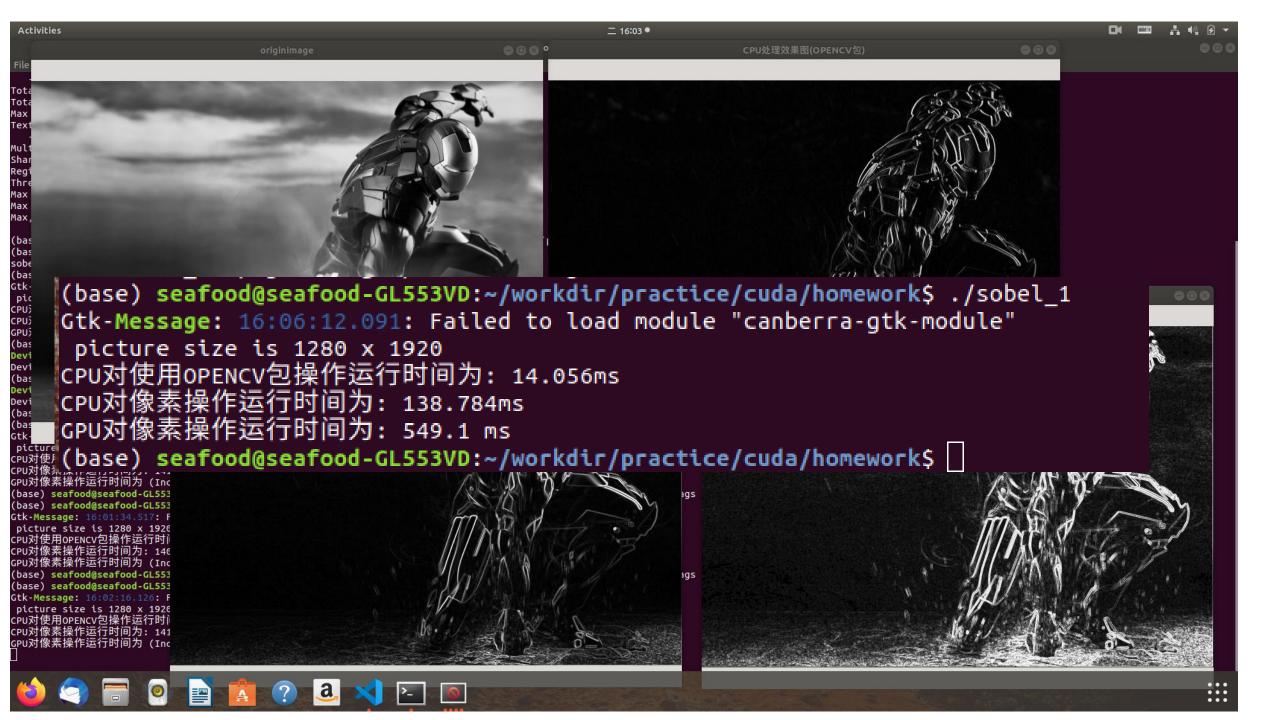
$$\mathbf{G}_{x} = \begin{bmatrix} -1 & 0 & 1 \\ -2 & 0 & 2 \\ -1 & 0 & 1 \end{bmatrix} * A \qquad \mathbf{G}_{y} = \begin{bmatrix} 1 & 2 & 1 \\ 0 & 0 & 0 \\ -1 & -2 & 1 \end{bmatrix} * A$$

### 2、Sobel的CPU实现

```
for (int j = 0; j < img.rows - 2; j + +)
            for (int i = 0; i < img.cols-2; i++)
                                                                   int pixval x =
                                                                    (sobel_x[0][0] * (int)img.at<uchar>(j,i)) + (sobel_x[0][1] * (int)img.at<uchar>(j+1,i)) + (sobel_x[0][2] * (int)
                                                                     (sobel_x[1][0] * (int)img.at<uchar>(j,i+1)) + (sobel_x[1][1] * (int)img.at<uchar>(j+1,i+1)) + (sobel_x[1][2] * (int)img.at<uchar>(j,i+1)) + (sobel_x[1][2] * (int)img.at<uchar>(j+1,i+1)) + (sobel_x[1][2] * (int)img.at<uch
                                                                     (sobel x[2][0] * (int)img.at<uchar>(j,i+2)) + (sobel x[2][1] * (int)img.at<uchar>(j+1,i+2)) + (sobel x[2][2] * (int)img.at<uchar>(j,i+2)) + (sobel x[2][2] * (int)img.at<uchar>(j+1,i+2)) + (sobel x[2][2] * (int)img.at<uch
                                                                   int pixval y =
                                                                     (sobel_y[0][0] * (int)img.at<uchar>(j,i)) + (sobel_y[0][1] * (int)img.at<uchar>(j+1,i)) + (sobel_y[0][2] * (int)
                                                                     (sobel_y[1][0] * (int)img.at<uchar>(j,i+1)) + (sobel_y[1][1] * (int)img.at<uchar>(j+1,i+1)) + (sobel_y[1][2] * (int)img.at<uchar>(j+1,i+1)) + (sobel_y[2][2] * (int)img.at<u
                                                                     (sobel y[2][0] * (int)img.at<uchar>(j,i+2)) + (sobel y[2][1] * (int)img.at<uchar>(j+1,i+2)) + (sobel y[2][2] * (int)img.at<uchar>(j,i+2)) + (sobel y[2][2] * (int)img.at<uchar>(j+1,i+2)) + (sobel y[2][2] * (int)img.at<uch
                                                                   int sum = abs(pixval x) + abs(pixval y);
                                                                   if (sum > 255)
                                                                                                                        sum = 255; //for best performance
                                                                 newimg.at<uchar>(j,i) = sum;
```

## 3、Sobel的GPU实现

```
while(yIndex < imgHeight - 2)
   Gx = (-1) * dataIn[(yIndex) * imgWidth + xIndex] + 0*dataIn[(yIndex +1) * imgWidth + xIndex] + 1*dataIn[(yIndex + 2) * imgWidth + xIndex]
       + (-2) * dataIn[(yIndex) * imgWidth + xIndex + 1] + 0 * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + 2 * dataIn[(yIndex + 2) * imgWidth +
       xIndex + 1
       + (-1) * dataIn[(yIndex) * imgWidth + xIndex + 2] + 0 * dataIn[(yIndex+1) * imgWidth + xIndex + 2] + 1 * dataIn[(yIndex + 2) * imgWidth +
       xIndex + 2];
   Gy = (-1) * dataIn[(yIndex) * imgWidth + xIndex] + (-2) * dataIn[(yIndex +1) * imgWidth + xIndex] + (-1)*dataIn[(yIndex + 2) * imgWidth +
   xIndex]
       + (0) * dataIn[(yIndex) * imgWidth + xIndex + 1] + 0 * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + 0 * dataIn[(yIndex + 2) * imgWidth +
       xIndex + 1
       + (1) * dataIn[(yIndex) * imgWidth + xIndex + 2] + 2 * dataIn[(yIndex+1) * imgWidth + xIndex + 2] + 1 * dataIn[(yIndex + 2) * imgWidth +
       xIndex + 2];
   int sum = abs(Gx) + abs(Gy);
   if (sum > 255)
       sum = 255; //for best performance
   dataOut[index] = sum;
   xIndex ++;
   if (xIndex == imgWidth-2)
       xIndex = 0;
       yIndex ++;
   index = xIndex + yIndex * imgWidth;
```



#### 5、程序优化-GPU配置

```
(base) seafood@seafood-GL553VD:~/workdir/practice/cuda/homework$ ./DeviceInformation
  ---General Information for Device 0 ---
                           |GeForce GTX 1050
Name:
Compute capability:
                           6.1
Clock rate:
                           1493000
Device copy overlap : |Enabled
Kernel execition timeout : |Disabled
  --- Memory Information for device 0 ---
Total global mem:
                           14238737408
Total constant Mem:
                           165536
Max mem pitch:
                           12147483647
Texture Alignment:
                           1512
  --- MP Information for device 0 ---
Multiprocessor count:
                           15
Shared mem per mp:
                       49152
Registers per mp:
                           165536
Threads in warp:
                           132
Max threads per block: |1024
Max thread dimensions: |(1024, 1024, 64)
Max, grid dimensions:
                           <u>|(2147483647, 65535, 65535)</u>
(base) seafood@seafood-GL553VD:~/workdir/practice/cuda/homework$
```

```
//Sobel算子边缘检测核函数
     global void sobelInCuda(unsigned char *dataIn, unsigned char *dataOut, int imgHeight, int imgWidth, int *dev_sobel_x, int *dev_sobel_
             //用单thread操作
             //int index = threadIdx.x + blockIdx.x * blockDim.x;
             int xIndex = threadIdx.x + blockIdx.x * blockDim.x;
             int yIndex = threadIdx.y + blockIdx.y * blockDim.y;
             int offset = xIndex + yIndex * imgWidth;
             //printf("blockDim: %d, gridDim: %d\n", blockDim.x, gridDim.x);
             //printf("xIndex : %d,yIndex : %d,Index : %d\n",xIndex, yIndex, offset);
             int Gx = 0;
             int Gy = 0;
             while(offset < (imgHeight - 2) * (imgWidth - 2))</pre>
                            Gx = dev \ sobel \ x[0] * dataIn[(yIndex) * imgWidth + xIndex] + dev \ sobel \ x[1] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataIn[(yIndex +1) * imgWidth + xIndex] + dev \ sobel \ x[0] * dataI
                                          + dev_sobel_x[3] * dataIn[(yIndex) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + dev_sobel_x[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] + 
                                           + dev_sobel_x[6] * dataIn[(yIndex) * imgWidth + xIndex + 2] + dev_sobel_x[7] * dataIn[(yIndex+1) * imgWidth + xIndex + 2] +
                            Gy = dev sobel y[0] * dataIn[(yIndex) * imgWidth + xIndex] + dev sobel y[1] * dataIn[(yIndex +1 ) * imgWidth + xIndex] + dev sobel
                                           + dev sobel y[3] * dataIn[(yIndex) * imgWidth + xIndex + 1] + dev_sobel_y[4] * dataIn[(yIndex+1) * imgWidth + xIndex + 1] +
                                           + dev_sobel_y[6] * dataIn[(yIndex) * imgWidth + xIndex + 2] + dev_sobel_y[7] * dataIn[(yIndex+1) * imgWidth + xIndex + 2] +
                            int sum = abs(Gx) + abs(Gy);
                            if (sum > 255)
                                          sum = 255; //for best performance
                            dataOut[offset] = sum;
```

#### 5.1 程序优化-二维Block二维Thread

```
GPU处理后的图像
                    processed by CPU in Paxel
(base) seafood@seafood-GL553VD:~/workdir/practice/cuda/homework$ ./sobel 3
Gtk-Message: 16:14:36.167: Failed to load module "canberra-gtk-module"
picture size is 6016 x 4016
CPU对使用OPENCV包操作运行时间为:89.982ms
CPU对像素操作运行时间为: 1256.71ms
GPU对像素操作运行时间为 : 32.6 ms
(base) seafood@seafood-GL553VD:~/workdir/practice/cuda/homework$
(base) seafood@seafood-GL553VD:~/workdir/practice/cuda/homework$ ./sobel_3
Gtk-Message: 16:18:40.733: Failed to load module "canberra-gtk-module"
picture size is 6016 x 4016
CPU对使用OPENCV包操作运行时间为: 97.299ms
CPU对像素操作运行时间为: 1315.59ms
GPU对像素操作运行时间为 : 791.1 ms
(base) seafood@seafood-GL553VD:~/workdir/practice/cuda/homework$
```

```
/Sobel算子边缘检测核函数
 global void sobelInCuda(unsigned char *dataIn, unsigned char *dataOut, int imgHeight, int imgWidth)
       //用单thread操作
       //int index = threadIdx.x + blockIdx.x * blockDim.x;
      int xIndex = threadIdx.x + blockIdx.x * blockDim.x;
       int yIndex = threadIdx.y + blockIdx.y * blockDim.y;
       int offset = xIndex + yIndex * imgWidth;
       //printf("blockDim: %d, gridDim: %d\n", blockDim.x, gridDim.x);
       //printf("xIndex : %d,yIndex : %d,Index : %d\n",xIndex, yIndex, offset);
       int Gx = 0;
      int Gy = 0;
       while(offset < (imgHeight - 2) * (imgWidth - 2))</pre>
                Gx = dev sobel x[0][0] * dataIn[(vIndex) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex] + dev sobel x[0][1] * dataIn[(vIndex +1) * imgWidth + xIndex
                          + dev sobel x[1][0] * dataIn[(yIndex) * imgWidth + xIndex + 1] + dev sobel x[1][1] * dataIn[(yIndex+1) * i
                          + dev sobel x[2][0] * dataIn[(yIndex) * imgWidth + xIndex + 2] + dev sobel x[2][1] * dataIn[(yIndex+1) * i
                Gy = dev sobel y[0][0] * dataIn[(yIndex) * imgWidth + xIndex] + dev sobel y[0][1] * dataIn[(yIndex +1 ) * imgW
                          + dev sobel y[1][0] * dataIn[(yIndex) * imgWidth + xIndex + 1] + dev_sobel_y[1][1] * dataIn[(yIndex+1) * i
                           + dev sobel y[2][0] * dataIn[(yIndex) * imgWidth + xIndex + 2] + dev sobel y[2][1] * dataIn[(yIndex+1) * i
                 int sum = abs(Gx) + abs(Gy);
                 if (sum > 255)
                          sum = 255; //for best performance
```

#### 5.2 程序优化-常量内存

```
(base) seafood@seafood-GL553VD:~/workdir/practice/cuda/homework$ ./sobel_4a
Gtk-Message: 16:20:39.867: Failed to load module "canberra-gtk-module"
picture size is 6016 x 4016
CPU对使用OPENCV包操作运行时间为:90.309ms
CPU对像素操作运行时间为: 1278.53ms
GPU对像素操作运行时间为: 19.5 ms
(base) seafood@seafood-GL553VD:~/workdir/practice/cuda/homework$
(base) seafood@seafood-GL553VD:~/workdir/practice/cuda/homework$ ./sobel_4a
Gtk-M<mark>essage: 16:23:05.167:</mark> Failed to load module "canberra-gtk-module"
picture size is 6016 x 4016
CPU对使用OPENCV包操作运行时间为: 102.548ms
CPU对像素操作运行时间为: 1341.65ms
GPU对像素操作运行时间为: 510.3 ms
(base) seafood@seafood-GL553VD:~/workdir/practice/cuda/homework$
```

#### 5.3 程序优化-纹理内存

```
//cuda的常量内存
while(offset < (imgHeight - 2) * (imgWidth - 2))</pre>
{
    //纹理内存上下左右
    int down 00 = offset;
                                           int down 01 = down \ 00 + 1; int down 02 = down \ 00 + 2;
                                           int down 11 = down 10 + 1; int down_12 = down_10 + 2;
    int down_10 = offset + imgWidth;
    int down 20 = offset + imgWidth * 2;
                                           int down 21 = down \ 20 + 1; int down 22 = down \ 20 + 2;
    tex 00 = tex1Dfetch(texIn, down 00);
                                          tex 01 = tex1Dfetch(texIn, down 01);
                                                                                   tex 02 = tex1Dfetch(texIn, down 02);
    tex 10 = tex1Dfetch(texIn, down_10);
                                           tex 11 = tex1Dfetch(texIn, down 11);
                                                                                   tex 12 = tex1Dfetch(texIn, down 12);
    tex 20 = tex1Dfetch(texIn, down 20);
                                           tex 21 = tex1Dfetch(texIn, down 21);
                                                                                   tex 22 = tex1Dfetch(texIn, down 22);
    Gx = dev \ sobel \ x[0][0] * tex 00 + dev \ sobel \ x[0][1] * tex 01 + dev \ sobel \ x[0][2] * tex 02
        + dev sobel x[1][0] * tex 10 + dev sobel x[1][1] * tex 11 + dev sobel x[1][2] * tex 12
        + dev sobel x[2][0] * tex 20 + dev sobel x[2][1] * tex 21 + dev sobel x[2][2] * tex 22;
    Gy = dev_sobel_y[0][0] * tex_00 + dev_sobel_y[0][1] * tex_01 + dev_sobel_y[0][2] * tex_02
        + dev_sobel_y[1][0] * tex_10 + dev_sobel_y[1][1] * tex_11 + dev_sobel_y[1][2] * tex_12
        + dev sobel y[2][0] * tex 20 + dev sobel y[2][1] * tex 21 + dev sobel y[2][2] * tex 22;
    int sum = abs(Gx) + abs(Gv);
    COURTEMEDY TO SYMBOLICATE AND SOURCE A, SIZEOT (SOURCE A) /,
    cudaMemcpyToSymbol(dev sobel y, sobel y, sizeof(sobel y) );
```

#### 5.3 程序优化-纹理内存

processed by CPU in Paxel GPU处理后的图像 (base) seafood@seafood-GL553VD:~/workdir/practice/cuda/homework\$ ./sobel\_4b Gtk-Message: 16:24:40.921: Failed to load module "canberra-gtk-module" picture size is 6016 x 4016 CPU对使用OPENCV包操作运行时间为: 92.969ms CPU对像素操作运行时间为: 1265.27ms GPU对像素操作运行时间为: 13.5 ms (base) seafood@seafood-GL553VD:~/workdir/practice/cuda/homework\$ (base) seafood@seafood-GL553VD:~/workdir/practice/cuda/homework\$ ./sobel\_4b Gtk-Message: 16:26:35.321: Failed to load module "canberra-gtk-module" picture size is 6016 x 4016 CPU对使用OPENCV包操作运行时间为: 104.26ms CPU对像素操作运行时间为: 1263.55ms GPU对像素操作运行时间为: 448.1 ms (base) seafood@seafood-GL553VD:~/workdir/practice/cuda/homework\$

# 6. 优化结果(6016x4016)

优化	Opencv包运行	CPU对像素操作	GPU对像素操作 (自定)	GPU对像素操作 (4x4)
单Block单Thread	100ms	1260ms		
多Block多Thread	100ms	1260ms	32ms	791ms
常量内存	100ms	1260ms	20ms	510ms
纹理内存	100ms	1260ms	13ms	448ms

# 6. 优化结果

优化过程	相对于CPU对像素进行 操作的优化程度	优化过程	相对于上一级优化程度 (4x4)
多Block多Thread	40倍	多Block多Thread	<b>-</b>
常量内存	60倍	常量内存	1.6倍
纹理内存	96倍	纹理内存	1.13倍