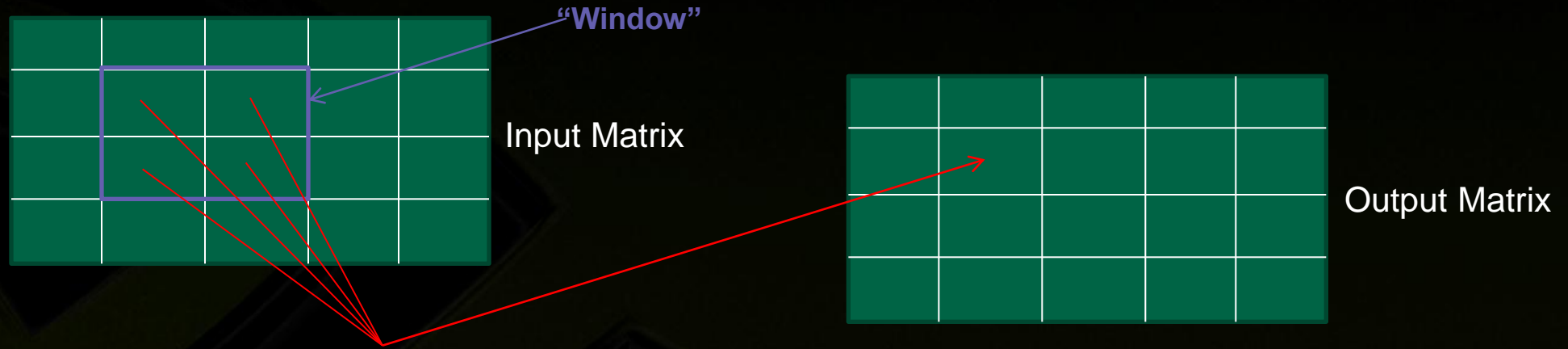


**Accelerate your Application  
with CUDA C**



# 2D Minimum Algorithm

- Consider applying a 2D window to a 2D array of elements
  - Each output element is the minimum of input elements within the window



- 2D operations like this are found in many fundamental algorithms
  - Interpolation, Convolution, Filtering
- Applications in seismic processing, weather simulation, image processing, etc

# 2D Minimum: C Version



```
#define WIN_SIZE 16
#define N 20000
```

```
int main() {
    int size=N*N*sizeof(int);
    int i, j, x, y, temp;
    //allocate resources
    int *cell=(int *)malloc(size); //input
    int *node=(int *)malloc(size); //output
```

Allocate Resources

```
initializeArray(cell,N);
initializeArray(node,N);
```

Initialize data

```
for(i=0;i<N;i++)
    for(j=0;j<N;j++)
    {
        //find minimum in window
        temp = node[i][j];
        for(x=0;x<WIN_SIZE;x++)
            for(y=0;y<WIN_SIZE;y++)
                if (temp > cell[i+x][j+y])
                    temp = cell[i+x][j+y];
        node[i][j] = temp;
    }

    //free resources
    free(cell); free(node);
}
```

Loop over dataset

Loop over window

Find min

Cleanup



# 2D Minimum: C Version



```
#define WIN_SIZE 16
#define N 20000
```

```
int main() {
    int size=N*N*sizeof(int);
    int i, j, x, y, temp;
```

```
//allocate
int *cell;
int *node;
```

```
initializeArray(cell,N);
initializeArray(node,N);
```

```
for(i=0;i<N;i++)
    for(j=0;j<N;j++)
    {
        //find minimum in window
        temp = node[i][j];
```

```
        temp = cell[i+x][j+y];
```

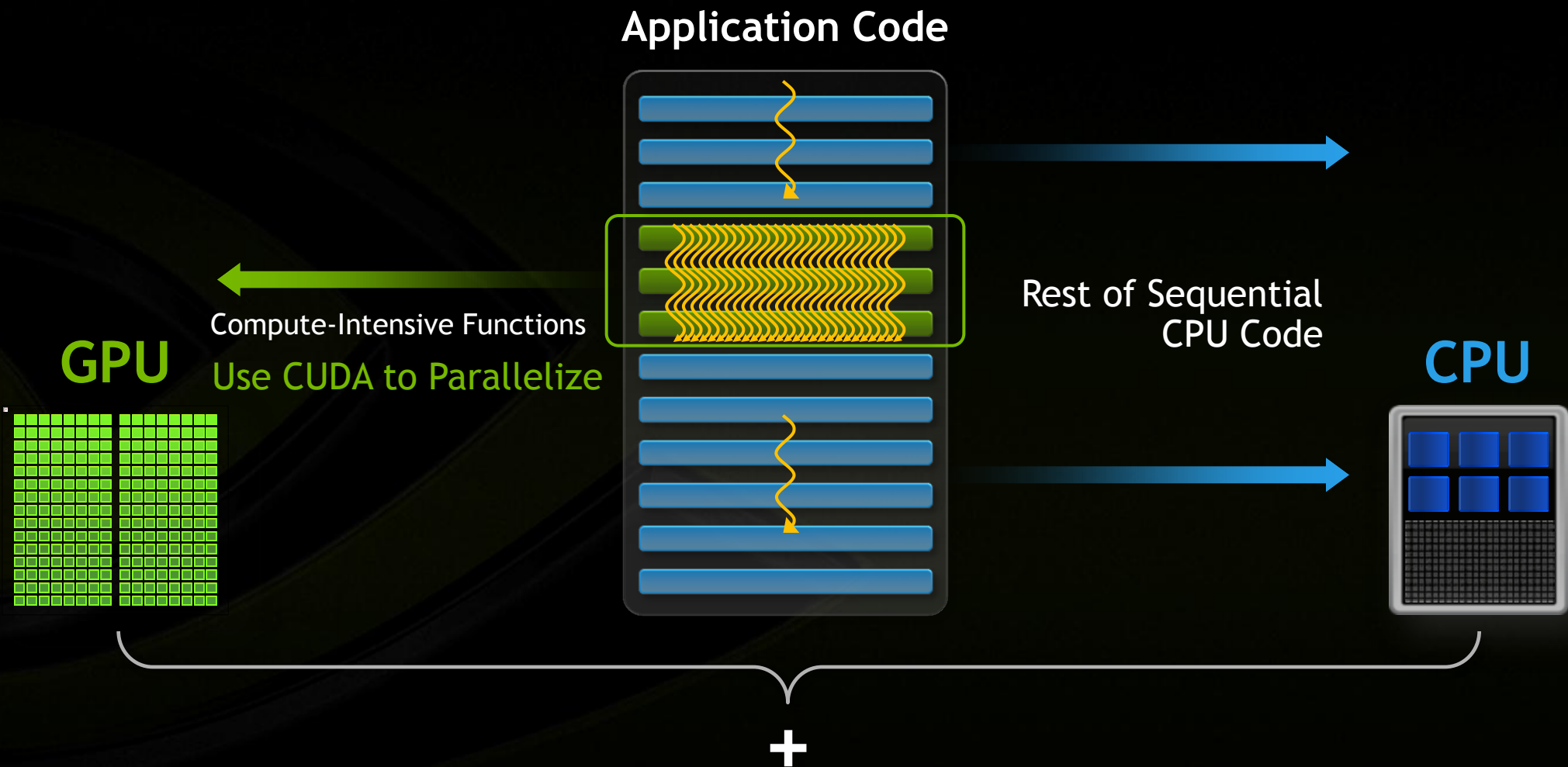
```
        node[i][j] = temp;
```

```
    }
```

```
//free resources
free(cell); free(node);
}
```

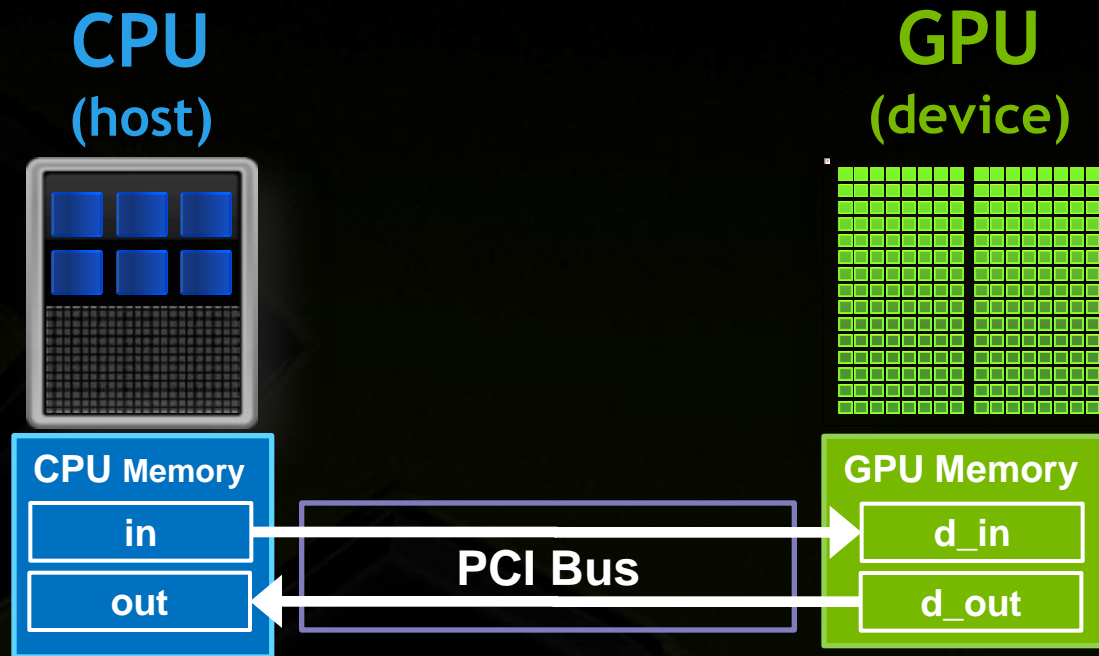
Algorithm	Device	Compute	Speedup
C (serial)	Xeon X5650	96.1sec	--

# CPU + GPU = Big Speedup



<http://developer.nvidia.com/cuda>

# Explicit Data Movement



# 2D Window: CUDA – Main Program



## C

```
int main() {
    int size=N*N*sizeof(int);
    //allocate resources
    int *cell=(int*)malloc(size); //input
    int *node=(int*)malloc(size); //output

    initializeArray(cell,N);
    initializeArray(node,N);
    // nested for loops
    for...
        for ...
            for ...
                for ....
    //free resources
    free(in); free(out);
}
```

## CUDA C

```
int main() {
    int size=N*N*sizeof(int);
    //allocate resources
    int *cell=(float*)malloc(size);
    int *node=(float*)malloc(size);
    int *d_cell; cudaMalloc(&d_cell,size);
    int *d_node; cudaMalloc(&d_node,size);
    initializeArray(cell,N); initializeArray(node,N);

    cudaMemcpy(d_cell,cell,size,cudaMemcpyHostToDevice);
    cudaMemcpy(d_node,node,size,cudaMemcpyHostToDevice);
    compute_win2D<<<nblocks, nthreads>>>(d_node,d_cell);
    //free resources
    free(cell); free(node);
    cudaFree(d_cell); cudaFree(d_node);
}
```

# 2D Window: CUDA – Main Program



C

```
int main() {
    int size=N*N*sizeof(int);
    //allocate resources
    int *cell=(int*)malloc(size); //input
    int *node=(int*)malloc(size); //output

    initializeArray(cell,N);
    initializeArray(node,N);
    // nested for loops
    for...
        for ...
            for ...
                for ....
    //free resources
    free(in); free(out);
}
```

CUDA C

```
int main() {
    int size=N*N*sizeof(int);
    //allocate resources
    int *cell=(float*)malloc(size);
    int *node=(float*)malloc(size);
    int *d_cell; cudaMalloc(&d_cell,size);
    int *d_node; cudaMalloc(&d_node,size);
    initializeArray(cell,N); initializeArray(node,N);

    cudaMemcpy(d_cell,cell,size,cudaMemcpyHostToDevice);
    cudaMemcpy(d_node,node,size,cudaMemcpyHostToDevice);
    compute_win2D<<<nblocks, nthreads>>>(d_node,d_cell);
    //free resources
    free(cell); free(node);
    cudaFree(d_cell); cudaFree(d_node);
}
```

Allocate  
Device  
Memory



# 2D Window: CUDA – Main Program



## C

```
int main() {
    int size=N*N*sizeof(int);
    //allocate resources
    int *cell=(int*)malloc(size); //input
    int *node=(int*)malloc(size); //output

    initializeArray(cell,N);
    initializeArray(node,N);
    // nested for loops
    for...
        for ...
            for ...
                for ....
    //free resources
    free(in); free(out);
}
```

## CUDA C

```
int main() {
    int size=N*N*sizeof(int);
    //allocate resources
    int *cell=(float*)malloc(size);
    int *node=(float*)malloc(size);
    int *d_cell; cudaMalloc(&d_cell,size);
    int *d_node; cudaMalloc(&d_node,size);
    initializeArray(cell,N); initializeArray(node,N);

    cudaMemcpy(d_cell,cell,size,cudaMemcpyHostToDevice);
    cudaMemcpy(d_node,node,size,cudaMemcpyHostToDevice);
    compute_win2D<<<nblocks, nthreads>>>(d_node,d_cell);
    //free resources
    free(cell); free(node);
    cudaFree(d_cell); cudaFree(d_node);
}
```

Copy Data to the Device

# 2D Window: CUDA – Main Program



C

```
int main() {
    int size=N*N*sizeof(int);
    //allocate resources
    int *cell=(int*)malloc(size); //input
    int *node=(int*)malloc(size); //output

    initializeArray(cell,N);
    initializeArray(node,N);
    // nested for loops
    for...
        for ...
            for ...
                for ....
    //free resources
    free(in); free(out);
}
```

CUDA C

```
int main() {
    int size=N*N*sizeof(int);
    //allocate resources
    int *cell=(float*)malloc(size);
    int *node=(float*)malloc(size);
    int *d_cell; cudaMalloc(&d_cell,size);
    int *d_node; cudaMalloc(&d_node,size);
    initializeArray(cell,N); initializeArray(node,N);

    cudaMemcpy(d_cell,cell,size,cudaMemcpyHostToDevice);
    cudaMemcpy(d_node,node,size,cudaMemcpyHostToDevice);
    compute_win2D<<<nblocks, nthreads>>>(d_node,d_cell);
    //free resources
    free(cell); free(node);
    cudaFree(d_node);
}
```

Call Cuda Function

Launch Parameters

Device Pointers

# 2D Window: CUDA – Main Program



## C

```
int main() {
    int size=N*N*sizeof(int);
    //allocate resources
    int *cell=(int*)malloc(size); //input
    int *node=(int*)malloc(size); //output

    initializeArray(cell,N);
    initializeArray(node,N);
    // nested for loops
    for...
        for ...
            for ...
                for ....
    //free resources
    free(in); free(out);
}
```

## CUDA C

```
int main() {
    int size=N*N*sizeof(int);
    //allocate resources
    int *cell=(float*)malloc(size);
    int *node=(float*)malloc(size);
    int *d_cell; cudaMalloc(&d_cell,size);
    int *d_node; cudaMalloc(&d_node,size);
    initializeArray(cell,N); initializeArray(node,N);

    cudaMemcpy(d_cell,cell,size,cudaMemcpyHostToDevice);
    cudaMemcpy(d_node,node,size,cudaMemcpyHostToDevice);
    compute_win2D<<<nblocks, nthreads>>>(d_node.d_cell);
    //free resources
    free(cell); free(node);
    cudaFree(d_cell); cudaFree(d_node);
}
```

Cleanup

# Parallel Execution Model

- A CUDA C function is executed by **many parallel threads**
- Threads are organized as a **grid** of independent thread **blocks**





# 2D Window: CUDA – Kernel Function



C

```
for(i=0;i<N;i++)
  for(j=0;j<N;j++)
  {
    //find minimum in window
    temp = node[i][j];
    for(x=0;x<WIN_SIZE;x++)
      for(y=0;y<WIN_SIZE;y++)
        if (temp> cell[i+x][j+y])
          temp = cell[i+x][j+y];
    node[i][j] = temp;
  }
```

CUDA C

```
__global__ void compute_win2D(int knode[][N], int kcell[][N])
{
  int idx=blockIdx.x*blockDim.x+threadIdx.x;
  int idy=blockIdx.y*blockDim.y+threadIdx.y;
  int temp, x, y;
  if((idx<N)&&(idy<N)) {
    //find minimum in window
    temp = knode[idx][idy];
    for(x=0;x<WIN_SIZE;x++)
      for(y=0;y<WIN_SIZE;y++)
        if (temp> kcell[idx+x][idy+y])
          temp = kcell[idx+x][idy+y];
    knode[i][j] = temp;
  }
}
```

# 2D Window: CUDA – Kernel Function



C

CUDA C

```
for(i=0;i<N;i++)
  for(j=0;j<N;j++)
  {
    //find minimum in window
    temp = node[i][j];
    for(x=0;x<WIN_SIZE;x++)
      for(y=0;y<WIN_SIZE;y++)
        if (temp> cell[i+x][j+y])
          temp = cell[i+x][j+y];
    node[i][j] = temp;
  }
```

Add  
\_\_global\_\_  
Keyword

```
__global__ void compute_win2D(int knode[][N], int kcell[][N])
{
  int idx=blockIdx.x*blockDim.x+threadIdx.x;
  int idy=blockIdx.y*blockDim.y+threadIdx.y;
  int temp, x, y;
  if((idx<N)&&(idy<N)) {
    //find minimum in window
    temp = knode[idx][idy];
    for(x=0;x<WIN_SIZE;x++)
      for(y=0;y<WIN_SIZE;y++)
        if (temp> kcell[idx+x][idy+y])
          temp = kcell[idx+x][idy+y];
    knode[i][j] = temp;
  }
}
```

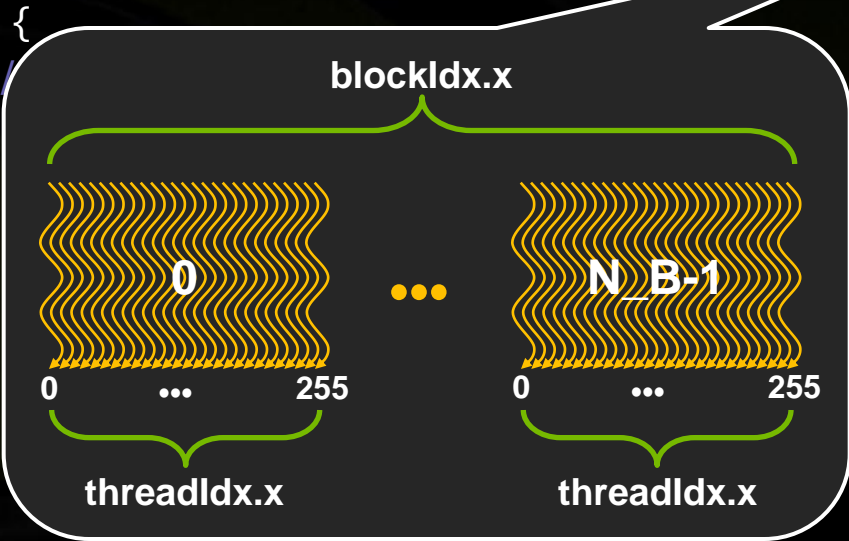
# 2D Window: CUDA – Kernel Function



C

Replace Outer  
Loops With an  
Index  
Calculation

```
for(i=0;i<N;i++)  
  for(j=0;j<N;j++)
```



CUDA C

```
__global__ void compute_win2D(int knode[][N], int kcell[][N])  
{  
  int idx=blockIdx.x*blockDim.x+threadIdx.x;  
  int idy=blockIdx.y*blockDim.y+threadIdx.y;  
  int temp, x, y;  
  if((idx<N)&&(idy<N)) {  
    //find minimum in window  
    temp = knode[idx][idy];  
    for(x=0;x<WIN_SIZE;x++)  
      for(y=0;y<WIN_SIZE;y++)  
        if (temp > kcell[idx+x][idy+y])  
          temp = kcell[idx+x][idy+y];  
    knode[i][j] = temp;  
  }  
}
```

# 2D Window: CUDA – Kernel Function



C

CUDA C

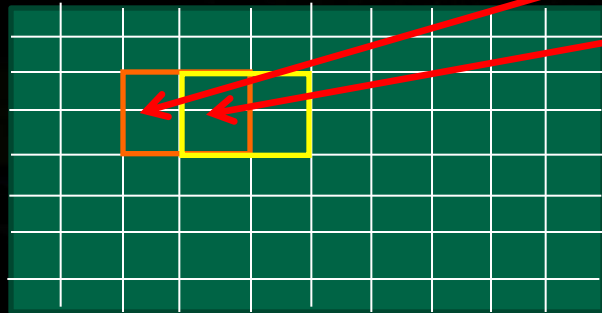
```
for(i=0;i<N;i++)
  for(j=0;j<N;j++)
  {
    //find minimum
    temp = node[i][j];
    for(x=0;x<V;x++)
      for(y=0;y<V;y++)
        if (temp > cell[i+x][j+y])
          temp = cell[i+x][j+y];
    node[i][j] = temp;
  }
```

```
__global__ void compute_win2D(int knode[][N], int kcell[][N])
{
  int idx=blockIdx.x*blockDim.x+threadIdx.x;
  int idy=blockIdx.y*blockDim.y+threadIdx.y;
  int temp = node[i][j];
  if (temp > kcell[idx+x][idy+y])
    temp = kcell[idx+x][idy+y];
  knode[i][j] = temp;
}
```

Algorithm	Device	Compute	Speedup
C (serial)	X5650	96.1sec	--
CUDA	M2090	8.33sec	11.5x



# Observation: Data Reuse



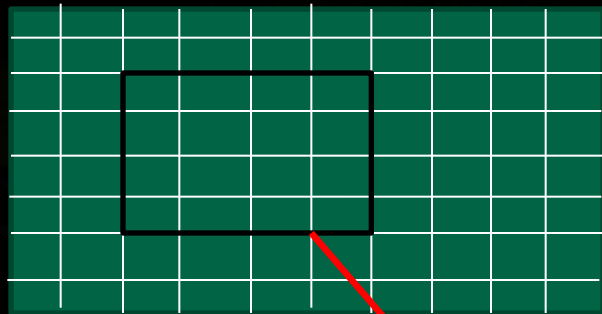
Global Memory

Thread(i)

Thread(i+1)

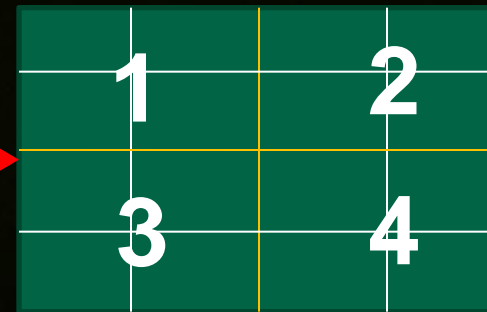
Neighboring threads read the same elements.

# Optimization: Use Shared Memory



Global Memory

SMEM COPY



BLK\_SIZE

WSIZE

Shared Memory

# CUDA C: Optimized Kernel



```
__global__ void compute_win2D(int knode[][N], int kcell[][N])
{
    __shared__ int smem[BLK_SIZE+WSIZE][BLK_SIZE+WSIZE];
    int idx=blockIdx.x*blockDim.x+threadIdx.x;
    int idy=blockIdx.y*blockDim.y+threadIdx.y;
    int temp, x, y;
    if((idx<N)&&(idy<N)) {

smem[threadIdx.x][threadIdx.y]=kcell[idx][idy];
if (threadIdx.y > (N-WSIZE))
    smem[threadIdx.x][threadIdx.y + WSIZE]=kcell[idx][idy+WSIZE];
if (threadIdx.x >(N-WSIZE))
    smem[threadIdx.x + WSIZE][threadIdx.y]=kcell[idx+WSIZE][idy];
if ((threadIdx.x >(N-WSIZE)) && (threadIdx.y > (N-WSIZE)))
    smem[threadIdx.x+WSIZE][threadIdx.y+WSIZE]=
        kcell[idx+WSIZE][idy+WSIZE];

//wait for all threads to finish read
__syncthreads();
```

```
//find minimum in window
temp = knode[idx][idy];
for(x=0;x<WSIZE;x++)
    for(y=0;y<WSIZE;y++)
        if (temp> smem[threadIdx.x+x][threadIdx.y+y])
            temp = smem[threadIdx.x+x][threadIdx.y+y];
    knode[i][j] = temp;
}
}
```

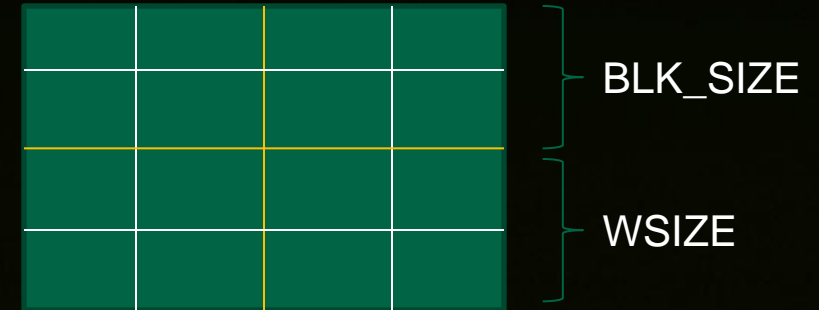
# CUDA C: Optimized Kernel

```
__global__ void compute_win2D(int knode[][N], int kcell[][N])
{
    __shared__ int smem[BLK_SIZE+WSIZE][BLK_SIZE+WSIZE];
    int idx=blockIdx.x*blockDim.x+threadIdx.x;
    int idy=blockIdx.y*blockDim.y+threadIdx.y;
    int temp, x, y;
    if((idx<N)&&(idy<N)) {

smem[threadIdx.x][threadIdx.y]=kcell[idx][idy];
if (threadIdx.y > (N-WSIZE))
    smem[threadIdx.x][threadIdx.y + WSIZE]=kcell[idx][idy+WSIZE];
if (threadIdx.x >(N-WSIZE))
    smem[threadIdx.x + WSIZE][threadIdx.y]=kcell[idx+WSIZE][idy];
if ((threadIdx.x >(N-WSIZE)) && (threadIdx.y > (N-WSIZE)))
    smem[threadIdx.x+WSIZE][threadIdx.y+WSIZE]=
        kcell[idx+WSIZE][idy+WSIZE];

//wait for all threads to finish read
__syncthreads();
```

Allocate Shared  
Memory for  
Each Block



Shared Memory



# CUDA C: Optimized Kernel

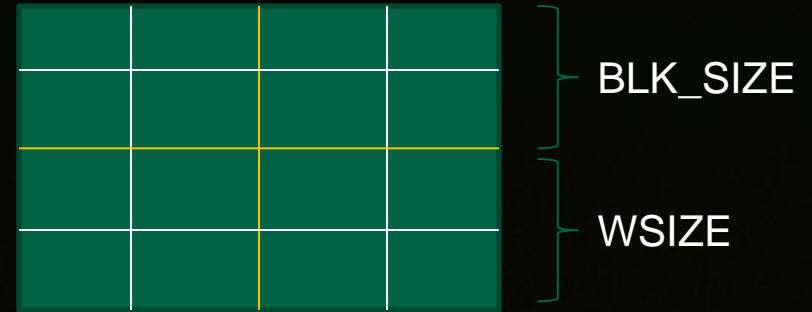


```
__global__ void compute_win2D(int knode[][N], int kcell[][N])
{
    __shared__ int smem[BLK_SIZE+WSIZE][BLK_SIZE+WSIZE];
    int idx=blockIdx.x*blockDim.x+threadIdx.x;
    int idy=blockIdx.y*blockDim.y+threadIdx.y;
    int temp, x, y;
    if((idx<N)&&(idy<N)) {

smem[threadIdx.x][threadIdx.y]=kcell[idx][idy];
if (threadIdx.y > (N-WSIZE))
    smem[threadIdx.x][threadIdx.y + WSIZE]=kcell[idx][idy+WSIZE];
if (threadIdx.x >(N-WSIZE))
    smem[threadIdx.x + WSIZE][threadIdx.y]=kcell[idx+WSIZE][idy];
if ((threadIdx.x >(N-WSIZE)) && (threadIdx.y > (N-WSIZE)))
    smem[threadIdx.x+WSIZE][threadIdx.y+WSIZE]=
        kcell[idx+WSIZE][idy+WSIZE];

//wait for all threads to finish read
__syncthreads();
```

Calculate Global Memory Indices



Shared Memory

# CUDA C: Optimized Kernel

```

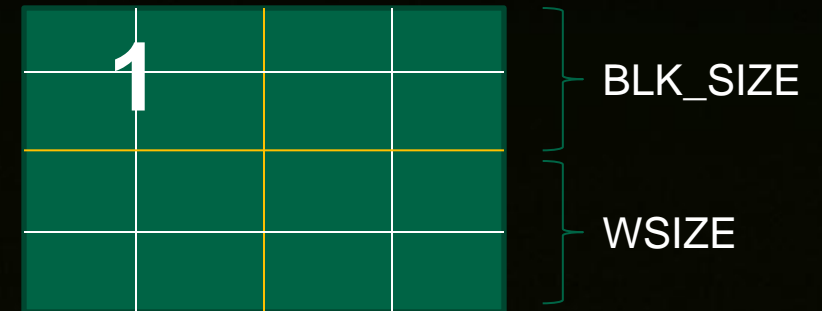
__global__ void compute_win2D(int knode[][N], int kcell[][N])
{
    __shared__ int smem[BLK_SIZE+WSIZE][BLK_SIZE+WSIZE];
    int idx=blockIdx.x*blockDim.x+threadIdx.x;
    int idy=blockIdx.y*blockDim.y+threadIdx.y;
    int temp, x, y;
    if((idx<N)&&(idy<N)) {

smem[threadIdx.x][threadIdx.y]=kcell[idx][idy];
    if (threadIdx.y > (N-WSIZE))
        smem[threadIdx.x][threadIdx.y + WSIZE]=kcell[idx][idy+WSIZE];
    if (threadIdx.x >(N-WSIZE))
        smem[threadIdx.x + WSIZE][threadIdx.y]=kcell[idx+WSIZE][idy];
    if ((threadIdx.x >(N-WSIZE)) && (threadIdx.y > (N-WSIZE)))
        smem[threadIdx.x+WSIZE][threadIdx.y+WSIZE]=
            kcell[idx+WSIZE][idy+WSIZE];

//wait for all threads to finish read
    __syncthreads();

```

Load Interior  
Region 1 to Shared  
Memory



Shared Memory

# CUDA C: Optimized Kernel

```

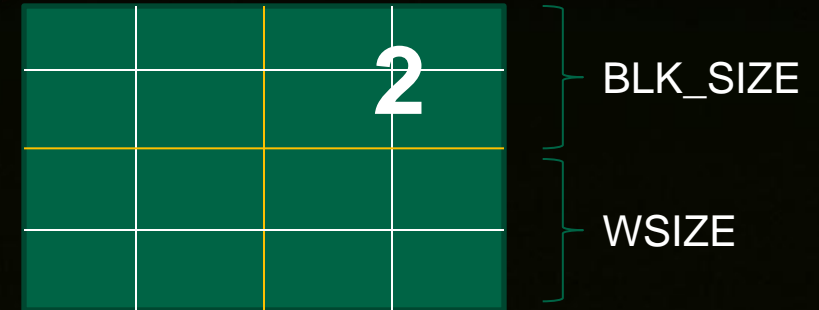
__global__ void compute_win2D(int knode[][N], int kcell[][N])
{
    __shared__ int smem[BLK_SIZE+WSIZE][BLK_SIZE+WSIZE];
    int idx=blockIdx.x*blockDim.x+threadIdx.x;
    int idy=blockIdx.y*blockDim.y+threadIdx.y;
    int temp, x, y;
    if((idx<N)&&(idy<N)) {

smem[threadIdx.x][threadIdx.y]=kcell[idx][idy];
    if (threadIdx.y > (N-WSIZE))
        smem[threadIdx.x][threadIdx.y + WSIZE]=kcell[idx][idy+WSIZE];
    if (threadIdx.x >(N-WSIZE))
        smem[threadIdx.x + WSIZE][threadIdx.y]=kcell[idx+WSIZE][idy];
    if ((threadIdx.x >(N-WSIZE)) && (threadIdx.y > (N-WSIZE)))
        smem[threadIdx.x+WSIZE][threadIdx.y+WSIZE]=
            kcell[idx+WSIZE][idy+WSIZE];

//wait for all threads to finish read
    __syncthreads();

```

Load Halo  
Region 2 to  
Shared Memory

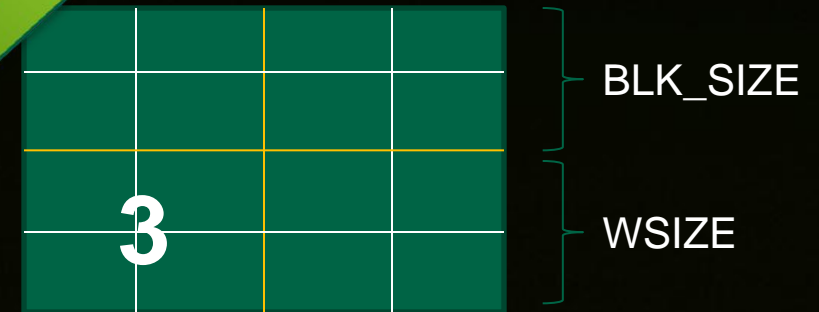


Shared Memory

# CUDA C: Optimized Kernel

```
__global__ void compute_win2D(int knode[][N], int kcell[][N])  
{  
    __shared__ int smem[BLK_SIZE+WSIZE][BLK_SIZE+WSIZE];  
    int idx=blockIdx.x*blockDim.x+threadIdx.x;  
    int idy=blockIdx.y*blockDim.y+threadIdx.y;  
    int temp, x, y;  
    if((idx<N)&&(idy<N)) {  
  
        smem[threadIdx.x][threadIdx.y]=kcell[idx][idy];  
        if (threadIdx.y > (N-WSIZE))  
            smem[threadIdx.x][threadIdx.y + WSIZE]=kcell[idx][idy+WSIZE];  
        if (threadIdx.x >(N-WSIZE))  
            smem[threadIdx.x + WSIZE][threadIdx.y]=kcell[idx+WSIZE][idy];  
        if ((threadIdx.x >(N-WSIZE)) && (threadIdx.y > (N-WSIZE)))  
            smem[threadIdx.x+WSIZE][threadIdx.y+WSIZE]=  
                kcell[idx+WSIZE][idy+WSIZE];  
  
        //wait for all threads to finish read  
        __syncthreads();  
    }  
}
```

Load Halo  
Region 3 to  
Shared Memory



Shared Memory

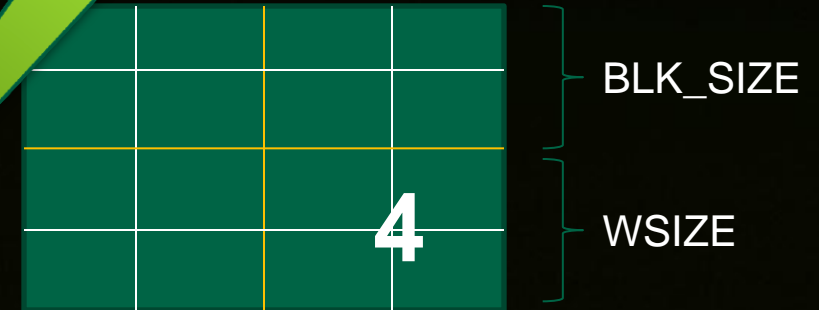
# CUDA C: Optimized Kernel

```
__global__ void compute_win2D(int knode[][N], int kcell[][N])
{
    __shared__ int smem[BLK_SIZE+WSIZE][BLK_SIZE+WSIZE];
    int idx=blockIdx.x*blockDim.x+threadIdx.x;
    int idy=blockIdx.y*blockDim.y+threadIdx.y;
    int temp, x, y;
    if((idx<N)&&(idy<N)) {

smem[threadIdx.x][threadIdx.y]=kcell[idx][idy];
if (threadIdx.y > (N-WSIZE))
    smem[threadIdx.x][threadIdx.y + WSIZE]=kcell[idx][idy+WSIZE];
if (threadIdx.x >(N-WSIZE))
    smem[threadIdx.x + WSIZE][threadIdx.y]=kcell[idx+WSIZE][idy];
if ((threadIdx.x >(N-WSIZE)) && (threadIdx.y > (N-WSIZE)))
    smem[threadIdx.x+WSIZE][threadIdx.y+WSIZE]=
        kcell[idx+WSIZE][idy+WSIZE];

//wait for all threads to finish read
__syncthreads();
```

Load Halo  
Region 4 to  
Shared Memory



Shared Memory

# CUDA C: Optimized Kernel

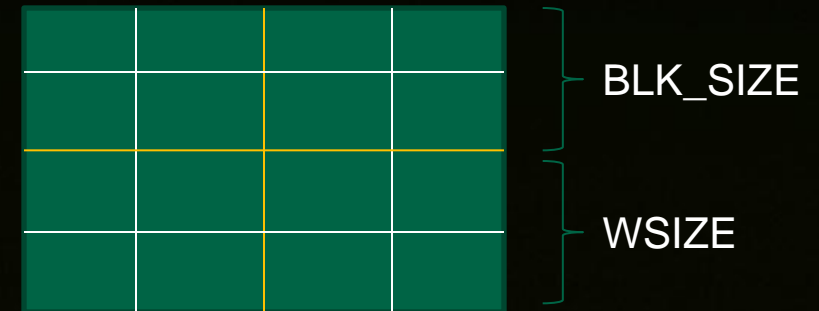


```
__global__ void compute_win2D(int knode[][N], int kcell[][N])
{
    __shared__ int smem[BLK_SIZE+WSIZE][BLK_SIZE+WSIZE];
    int idx=blockIdx.x*blockDim.x+threadIdx.x;
    int idy=blockIdx.y*blockDim.y+threadIdx.y;
    int temp, x, y;
    if((idx<N)&&(idy<N)) {

smem[threadIdx.x][threadIdx.y]=kcell[idx][idy];
if (threadIdx.y > (N-WSIZE))
    smem[threadIdx.x][threadIdx.y + WSIZE]=kcell[idx][idy+WSIZE];
if (threadIdx.x >(N-WSIZE))
    smem[threadIdx.x + WSIZE][threadIdx.y]=kcell[idx+WSIZE][idy];
if ((threadIdx.x >(N-WSIZE)) && (threadIdx.y > (N-WSIZE)))
    smem[threadIdx.x+WSIZE][threadIdx.y+WSIZE]=
        kcell[idx+WSIZE][idy+WSIZE];

//wait for all threads to finish read
__syncthreads();
```

**Wait for All Threads to Finish Writing to Shared Memory**



Shared Memory



# CUDA C: Optimized Kernel



```
__global__ void compute_win2D(int knode[][N], int kcell[][N])
{
    __shared__ int smem[BLK_SIZE+WSIZE][BLK_SIZE+WSIZE];
    int idx=blockIdx.x*blockDim.x+threadIdx.x;
    int idy=blockIdx.y*blockDim.y+threadIdx.y;
    int temp, x, y;
    if((idx<N)&&(idy<N)) {

smem[threadIdx.x][threadIdx.y]=kcell[idx][idy];
if (threadIdx.y > (N-WSIZE))
    smem[threadIdx.x][threadIdx.y + WSIZE]=kcell[idx][idy+WSIZE];
if (threadIdx.x >(N-WSIZE))
    smem[threadIdx.x + WSIZE][threadIdx.y]=kcell[idx+WSIZE][idy];
if ((threadIdx.x >(N-WSIZE)) && (threadIdx.y > (N-WSIZE)))
    smem[threadIdx.x+WSIZE][threadIdx.y+WSIZE]=
        kcell[idx+WSIZE][idy+WSIZE];

//wait for all threads to finish read
__syncthreads();
```

```
//find minimum in window
temp = knode[idx][idy];
for(x=0;x<WSIZE;x++)
    for(y=0;y<WSIZE;y++)
        if (temp> smem[threadIdx.x+x][threadIdx.y+y])
            temp = smem[threadIdx.x+x][threadIdx.y+y];
    knode[i][j] = temp;
}
}
```

**Find Minimum:  
Read Input from  
Shared Memory,  
Accumulate into a  
Register**

# CUDA C: Optimized Kernel



```
__global__ void compute_win2D(int knode[][N], int kcell[][N])
{
    __shared__ int smem[BLK_SIZE+WSIZE][BLK_SIZE+WSIZE];
    int idx=blockIdx.x*blockDim.x+threadIdx.x;
    int idy=blockIdx.y*blockDim.y+threadIdx.y;
    int temp, x, y;
    if((idx<N)&&(idy<N)) {

smem[threadIdx.x][threadIdx.y]=kcell[idx][idy];
if (threadIdx.y > (N-WSIZE))
    smem[threadIdx.x][threadIdx.y + WSIZE]=kcell[idx][idy+WSIZE];
if (threadIdx.x >(N-WSIZE))
    smem[threadIdx.x + WSIZE][threadIdx.y]=kcell[idx+WSIZE][idy];
if ((threadIdx.x >(N-WSIZE)) && (threadIdx.y > (N-WSIZE)))
    smem[threadIdx.x+WSIZE][threadIdx.y+WSIZE]=
        kcell[idx+WSIZE][idy+WSIZE];

//wait for all threads to finish read
__syncthreads();
```

```
//find minimum in window
temp = knode[idx][idy];
for(x=0;x<WSIZE;x++)
    for(y=0;y<WSIZE;y++)
        if (temp> smem[threadIdx.x+x][threadIdx.y+y])
            temp = smem[threadIdx.x+x][threadIdx.y+y];
knode[i][j] = temp;
}
}
```

**Write  
Minimum  
to Global  
Memory**



Questions?

