

Programming OpenMP

Christian Terboven
Michael Klemm







Agenda (in total 7 Sessions)



- Session 1: OpenMP Introduction
- Session 2: Tasking
- Session 3: Optimization for NUMA and SIMD
- Session 4: What Could Possibly Go Wrong Using OpenMP
- Session 5: Introduction to Offloading with OpenMP
 - → Review of Session 3 / homework assignments
 - →OpenMP device and execution model
 - →Offload basics and exploiting parallelism
 - →Optimizing data transfers
 - → Homework assignments ⊚
- Session 6: Advanced Offloading Topics
- Session 7: Selected / Remaining Topics



Programming OpenMP

Review

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Questions?



PI

Example solution: Pl w/ SIMD



```
#pragma omp simd private(fX) reduction(+:fSum)
for (i = 0; i < n; i += 1)
{
    fX = fH * ((double)i + 0.5);
    fSum += f(fX);
}
return fH * fSum;</pre>
```



Jacobi









```
#pragma omp parallel
   /* copy new solution into old */
   #pragma omp for private(i) // or collapse(2) instead of private(i)
   for (j=0; j<m; j++)
     for (i=0; i<n; i++) {
      UOLD(j,i) = U(j,i);
   /* compute stencil, residual and update */
   #pragma omp for private(i, resid) reduction(+:error) // or collapse(2)
   for (j=1; j< m-1; j++) {
     for (i=1; i<n-1; i++) {
       resid = ( /* left out for brevity */ ) / b;
       /* update solution */
       U(j,i) = UOLD(j,i) - omega * resid;
       /* accumulate residual error */
       error =error + resid*resid;
```



Introduction to Offloading with OpenMP



OpenMP device and execution model

Running Example for this Presentation: saxpy



```
void saxpy() {
    float a, x[SZ], y[SZ];
    // left out initialization
    double t = 0.0;
    double tb, te;
    tb = omp get wtime();
#pragma omp parallel for firstprivate(a)
    for (int i = 0; i < SZ; i++) {
        y[i] = a * x[i] + y[i];
    te = omp get wtime();
    t = te - tb;
    printf("Time of kernel: %lf\n", t);
```

Timing code (not needed, just to have a bit more code to show ©)

This is the code we want to execute on a target device (i.e., GPU)

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Running Example for this Presentation: saxpy



```
void saxpy() {
    float a, x[SZ], y[SZ];
    // left out initialization
    double t = 0.0;
    double tb, te;
    tb = omp get wtime();
#pragma omp parallel for firstprivate(a)
    for (int i = 0; i < SZ; i++) {
        y[i] = a * x[i] + y[i];
    te = omp get wtime();
    t = te - tb;
    printf("Time of kernel: %lf\n", t)
```

Timing code (not needed, just to have a bit more code to show ©)

This is the code we want to execute on a target device (i.e., GPU)

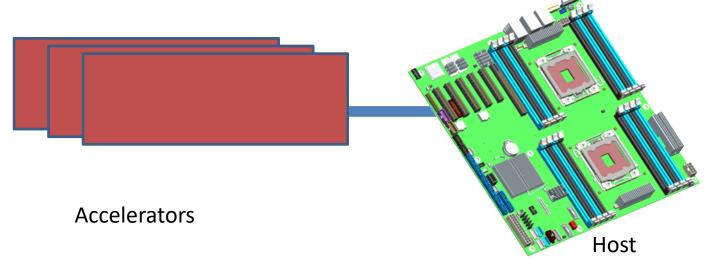
Timing code (not needed, just to have a bit more code to show ③)

Don't do this at home!
Use a BLAS library for this!

Device Model

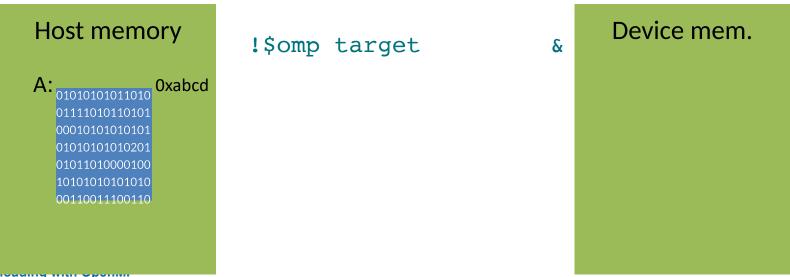


- As of version 4.0 the OpenMP API supports accelerators/coprocessors
- Device model:
 - →One host for "traditional" multi-threading
 - → Multiple accelerators/coprocessors of the same kind for offloading





- Offload region and its data environment are bound to the lexical scope of the construct
 - → Data environment is created at the opening curly brace
 - → Data environment is automatically destroyed at the closing curly brace
 - → Data transfers (if needed) are done at the curly braces, too:
 - →Upload data from the host to the target device at the opening curly brace.
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```
A:
010101010101010
0111101010101
00010101010101
010101010000100
10101010101010
00110010101010
00110011100110
```



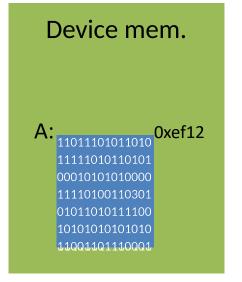
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```
!$omp target &
!$omp map(alloc:A) &
!$omp map(to:A) &
```



- Offload region and its data environment are bound to the lexical scope of the construct
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```
!$omp target &
!$omp map(alloc:A) &
!$omp map(to:A) &
!$omp map(from:A) &
```

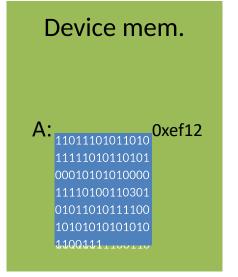




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 - →Upload data from the host to the target device at the opening curly brace.
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```
A:
11011101011010
1111101011010
00010101010000
1111010111100
10101010101010
1100110101010
11001111100
1100111110001
```

```
!$omp target &
!$omp map(alloc:A) &
!$omp map(to:A) &
!$omp map(from:A) &
    call compute(A)
```

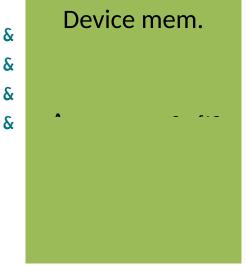




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```
A:
11011101011010
1111101011010
00010101010000
1111010111100
10101010101010
1100110101010
110011110001
```

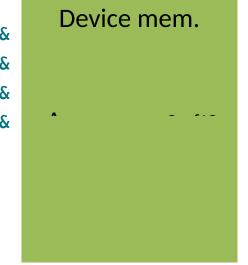
```
!$omp target &
!$omp map(alloc:A) &
!$omp map(to:A) &
!$omp map(from:A) &
call compute(A)
```





- Offload region and its data environment are bound to the lexical scope of the construct
 - → Data environment is created at the opening curly brace
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 - →Upload data from the host to the target device at the opening curly brace.
 - → Download data from the target device at the closing curly brace.

```
!$omp target &
!$omp map(alloc:A) &
!$omp map(to:A) &
!$omp map(from:A) &
    call compute(A)
!$omp end target
```



OpenMP for Devices - Constructs



- Transfer control and data from the host to the device
- Syntax (C/C++)

 #pragma omp target [clause[[,] clause],...]

 structured-block
- Syntax (Fortran)

```
!$omp target [clause[[,] clause],...]
structured-block
!$omp end target
```

Clauses

```
device(scalar-integer-expression)
map([{alloc | to | from | tofrom}:] list)
if(scalar-expr)
```



```
void saxpy() {
    float a, x[SZ], y[SZ];
    double t = 0.0;
    double tb, te;
    tb = omp get wtime();
#pragma omp target
    for (int i = 0; i < SZ; i++) {
        y[i] = a * x[i] + y[i];
    te = omp get wtime();
    t = te - tb;
    printf("Time of kernel: %lf\n", t);
```

```
clang -fopenmp --offload-arch=gfx90a ...
```



```
void saxpy() {
    float a, x[SZ], y[SZ];
    double t = 0.0;
    double tb, te;
    tb = omp get wtime();
#pragma omp target
    for (int i = 0; i < SZ; i++) {
        y[i] = a * x[i] + y[i];
    te = omp get wtime();
    t = te - tb;
    printf("Time of kernel: %lf\n", t);
```

```
clang -fopenmp --offload-arch=gfx90a ...
```



The compiler identifies variables that are

```
used in the target region.
void saxpy() {
    float a, x[SZ], y[SZ];
    double t = 0.0;
    double tb, te;
    tb = omp get wtime();
#pragma omp target
    for (int i = 0; i < SZ; i++) {
        y[i] = a * x[i] + y[i];
    te = omp get wtime();
    t = te - tb;
    printf("Time of kernel: %lf\n", t);
```

```
clang -fopenmp --offload-arch=gfx90a ...
```



The compiler identifies variables that are

```
used in the target region.
void saxpy() {
    float a, x[SZ], y[SZ];
    double t = 0.0;
    double tb, te;
    tb = omp get wtime();
#pragma omp target "map(tofrom:y[0:SZ])"
    for (int i = 0; i < SZ; i++) {
        y[i] = a * x[i] + y[i];
    te = omp get wtime();
    t = te - tb;
    printf("Time of kernel: %lf\n", t);
```

```
clang -fopenmp --offload-arch=gfx90a ...
```



The compiler identifies variables that are

```
used in the target region.
void saxpy() {
                                                                   All accessed arrays are copied from
    float a, x[SZ], y[SZ];
                                                                       host to device and back
    double t = 0.0;
                                                        a
    double tb, te;
                                                        x[0:SZ]
    tb = omp get wtime();
                                                        y[0:SZ]
#pragma omp target "map(tofrom:y[0:SZ])"
    for (int i = 0; i < SZ; i++) {
         y[i] = a * x[i] + y[i];
    te = omp get wtime();
                                                        x[0:SZ]
    t = te - tb;
                                                        y[0:SZ]
    printf("Time of kernel: %lf\n", t);
```

```
clang -fopenmp --offload-arch=gfx90a ...
```



```
void saxpy() {
    float a, x[SZ], y[SZ];
    double t = 0.0;
    double tb, te;
    tb = omp get wtime();
#pragma omp target "map(tofrom:y[0:SZ])"
    for (int i = 0; i < SZ; i++) {
        y[i] = a * x[i] + y[i];
    te = omp get wtime();
    t = te - tb;
    printf("Time of kernel: %lf\n", t);
```

```
The compiler identifies variables that are
         used in the target region.
              All accessed arrays are copied from
                    host to device and back
x[0:SZ]
y[0:SZ]
x[0:SZ]
y[0:SZ]
               Copying x back is not necessary: it
                       was not changed.
```

```
clang -fopenmp --offload-arch=gfx90a ...
```



```
The compiler identifies variables that are
                                                                    used in the target region.
void saxpy() {
                                                                        All accessed arrays are copied from
    float a, x[SZ], y[SZ];
                                                                             host to device and back
    double t = 0.0;
    double tb, te;
                                                            x[0:SZ]
    tb = omp get wtime();
                                                            y[0:SZ]
#pragma omp target "map(tofrom:y[0:SZ])"
     for (int i = 0; i < SZ; i++) {
         y[i] = a * x[i] + y[i];
                                                                           Presence check: only transfer if
    te = omp get wtime();
                                                            x[0:SZ]
                                                                           not yet allocated on the device.
    t = te - tb;
                                                            y[0:SZ]
    printf("Time of kernel: %lf\n", t);
                                                                         Copying x back is not necessary: it
                                                                                was not changed.
```

clang -fopenmp --offload-arch=gfx90a ...



The compiler identifies variables that are used in the target region.

```
subroutine saxpy(a, x, y, n)
    use iso fortran env
    integer :: n, i
                                                                  All accessed arrays are copied from
    real(kind=real32) :: a
                                                                      host to device and back
    real(kind=real32), dimension(n)
                                                       a
                                                       x(1:n)
    real(kind=real32), dimension(n) ::
                                                       y(1:n)
!$omp target "map(tofrom:y(1:n))"
    do i=1,n
        y(i) = a * x(i) + y(i)
    end do
!$omp end target
                                                      x(1:n)
end subroutine
                                                      y(1:n)
```

Presence check: only transfer if not yet allocated on the device.

Copying x back is not necessary: it was not changed.

flang -fopenmp --offload-arch=gfx90a ...



```
void saxpy() {
    double a, x[SZ], y[SZ];
    double t = 0.0;
                                                    a
    double tb, te;
                                                    x[0:SZ]
    tb = omp get wtime();
                                                    y[0:SZ]
#pragma omp target map(to:x[0:SZ]) \
                   map(tofrom:y[0:SZ])
    for (int i = 0; i < SZ; i++) {
        y[i] = a * x[i] + y[i];
                                                   y[0:SZ]
    te = omp get wtime();
    t = te - tb;
    printf("Time of kernel: %lf\n", t);
```

```
clang -fopenmp --offload-arch=gfx90a ...
```



```
void saxpy(float a, float* x, float* y,
           int sz) {
    double t = 0.0;
    double tb, te;
                                                   x[0:sz]
    tb = omp get wtime();
                                                   y[0:sz]
#pragma omp target map(to:x[0:sz]) \
                   map(tofrom:y[0:sz])
    for (int i = 0; i < sz; i++) {
        y[i] = a * x[i] + y[i];
                                                   y[0:sz]
    te = omp get wtime();
    t = te - tb;
    printf("Time of kernel: %lf\n", t);
```

clang -fopenmp --offload-arch=gfx90a



```
The compiler cannot determine the size of
                                                               memory behind the pointer.
void saxpy(float a, float* x, float* y,
            int sz) {
    double t = 0.0;
    double tb, te;
                                                        x[0:sz]
    tb = omp get wtime();
                                                        y[0:sz]
#pragma omp target map(to:x[0:sz]) \
                     map(tofrom:y[0:sz])
    for (int i = 0; i < sz; i++) {
        y[i] = a * x[i] + y[i];
                                                        y[0:sz]
    te = omp get wtime();
    t = te - tb;
    printf("Time of kernel: %lf\n", t);
                                                         Programmers have to help the compiler
                                                        with the size of the data transfer needed.
```

Introduction to Offloading with OpenMP Christian Terboven

clang -fopenmp --offload-arch=gfx90a



Exploiting (Multilevel) Parallelism

Creating Parallelism on the Target Device



- The target construct transfers the control flow to the target device
 - → Transfer of control is sequential and synchronous
 - →This is intentional!
- OpenMP separates offload and parallelism
 - → Programmers need to explicitly create parallel regions on the target device
 - →In theory, this can be combined with any OpenMP construct
 - →In practice, there is only a useful subset of OpenMP features for a target device such as a GPU, e.g., no I/O, limited use of base language features.



```
clang -fopenmp --offload-arch=gfx90a
```

Example: saxpy



Create a team of threads to execute the loop in parallel using SIMD instructions.

```
clang -fopenmp --offload-arch=gfx90a
```

Example: saxpy



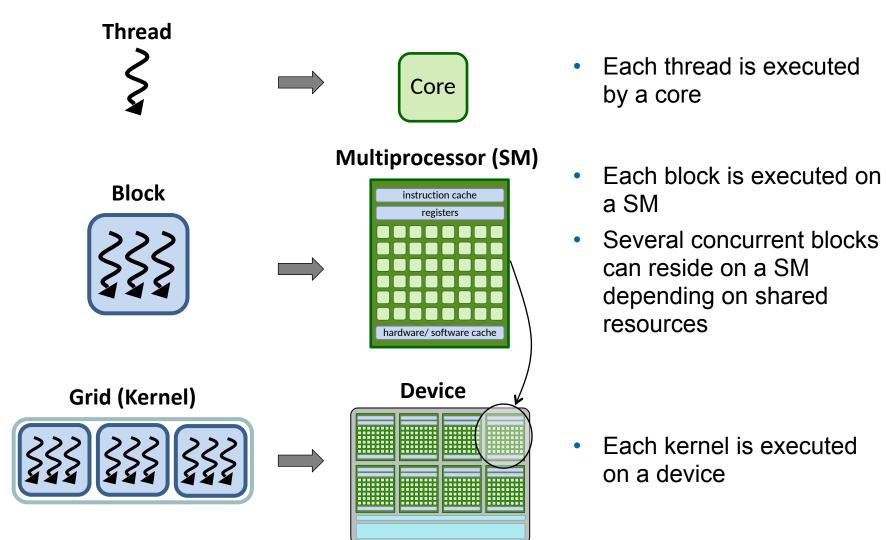
GPUs are multi-level devices: SIMD, threads, thread blocks

Create a team of threads to execute the loop in parallel using SIMD instructions.

```
clang -fopenmp --offload-arch=gfx90a
```

Mapping to Hardware









- Support multi-level parallel devices
- Syntax (C/C++):
 #pragma omp teams [clause[[,] clause],...]
 structured-block
- Syntax (Fortran):
 !\$omp teams [clause[[,] clause],...]
 structured-block
- Clauses

```
num_teams(integer-expression), thread_limit(integer-
expression)
  default(shared | firstprivate | private none)
  private(list), firstprivate(list), shared(list),
reduction(operator:list)
```

Multi-level Parallel saxpy



- Manual code transformation
 - → Tile the loop into an outer loop and an inner loop.
 - → Assign the outer loop to "teams".
 - → Assign the inner loop to the "threads".
 - → (Assign the inner loop to SIMD units.)

```
void saxpy(float a, float* x, float* y, int sz) {
   int bs = n / omp_get_num_teams();
   for (int i = 0; i < sz; i += bs) {
      y[ii] = a * x[ii] + y[ii];
   }
}</pre>
```

Multi-level Parallel saxpy



- Manual code transformation
 - → Tile the loop into an outer loop and an inner loop.
 - → Assign the outer loop to "teams".
 - → Assign the inner loop to the "threads".
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Multi-level Parallel saxpy

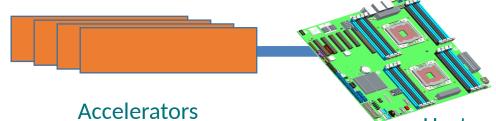


 For convenience, OpenMP defines composite constructs to implement the required code transformations



Optimizing Data Transfers

Optimizing Data Transfers is Key to Performance



 Connections between host and accelerator arest typically lower-bandwidth, higher-latency interconnects

→Bandwidth host memory: hundreds of GB/sec

→ Bandwidth accelerator memory: TB/sec

→ PCIe Gen 4 bandwidth (16x): tens of GB/sec

- Unnecessary data transfers must be avoided, by
 - →only transferring what is actually needed for the computation, and
 - → making the lifetime of the data on the target device as long as possible.

Role of the Presence Check



If map clauses are not added to target constructs, presence checks determine if data is already available in the device data environment:

```
subroutine saxpy(a, x, y, n)
    use iso fortran env
    integer :: n, i
    real(kind=real32) :: a
    real(kind=real32), dimension(n) ::
X
    real(kind=real32), dimension(n) ::
!$omp target
    do i=1,n
        y(i) = a * x(i) + y(i)
    end do
!$omp end target
end subroutine
  Introduction to Omoading with Openwir
```

- OpenMP maintains a mapping table that records what memory pointers have been mapped.
- That table also maintains the translation between host memory and device memory.
- Constructs with no map clause for a data item then determine if data has been mapped and if not, a map(tofrom:...) is added for that data item.

Role of the Presence Check



If map clauses are not added to target constructs, presence checks determine if data is already available in the device data environment:

```
subroutine saxpy(a, x, y, n)
    use iso fortran env
    integer :: n, i
    real(kind=real32) :: a
    real(kind=real32), dimension(n) ::
X
    real(kind=real32), dimension(n) ::
!$omp target "present?(y)" "present?(x)"
    do i=1,n
        y(i) = a * x(i) + y(i)
    end do
!$omp end target
end subroutine
  Introduction to Omoading with Openwir
```

- OpenMP maintains a mapping table that records what memory pointers have been mapped.
- That table also maintains the translation between host memory and device memory.
- Constructs with no map clause for a data item then determine if data has been mapped and if not, a map(tofrom:...) is added for that data item.

Optimize Data Transfers



- Reduce the amount of time spent transferring data:
 - → Use map clauses to enforce direction of data transfer.
 - →Use target data, target enter data, target exit data constructs to keep data environment on the target device.

```
subroutine saxpy(a, x, y, n)
  ! Declarations omitted

!$omp target
    do i=1,n
        y(i) = a * x(i) + y(i)
    end do
!$omp end target
end subroutine
```

Optimize Data Transfers



- Reduce the amount of time spent transferring data:
 - → Use map clauses to enforce direction of data transfer.
 - →Use target data, target enter data, target exit data constructs to keep data environment on the target device.

```
subroutine saxpy(a, x, y, n)
  ! Declarations omitted

!$omp target "present?(y)" "present?(x)"
  do i=1,n
          y(i) = a * x(i) + y(i)
        end do
!$omp end target
end subroutine
```

Optimize Data Transfers



- Reduce the amount of time spent transferring data:
 - → Use map clauses to enforce direction of data transfer.
 - →Use target data, target enter data, target exit data constructs to keep data environment on the target device.

```
void zeros(float* a, int n) {
#pragma omp target teams distribute parallel
for
    for (int i = 0; i < n; i++)
        a[i] = 0.0f;
}

void saxpy(float a, float* y, float* x, int
n) {
#pragma omp target teams distribute parallel
for
    for (int i = 0; i < n; i++)
        y[i] = a * x[i] + y[i];
}</pre>
```



target data Construct Syntax

- Create scoped data environment and transfer data from the host to the device and back
- Syntax (C/C++)
 #pragma omp target data [clause[[,] clause],...]
 structured-block
- Syntax (Fortran)

```
!$omp target data [clause[[,] clause],...]
structured-block
!$omp end target data
```

Clauses

```
device(scalar-integer-expression)
  map([{alloc | to | from | tofrom | release | delete}:]
list)
  if(scalar-expr)
```



target update Construct Syntax

- Issue data transfers to or from existing data device environment
- Syntax (C/C++)
 #pragma omp target update [clause[,] clause],...]
- Syntax (Fortran) !\$omp target update [clause[[,] clause],...]
- Clauses

```
device(scalar-integer-expression)
to(list)
from(list)
if(scalar-expr)
```



Example: target data and target update OpenMP

```
#pragma omp target data device(0) map(alloc:tmp[:N]) map(to:input[:N)) map(from:res)
#pragma omp target device(0)
#pragma omp parallel for
    for (i=0; i< N; i++)
      tmp[i] = some computation(input[i], i);
   update input array on the host(input);
#pragma omp target update device(0) to(input[:N])
#pragma omp target device(0)
#pragma omp parallel for reduction(+:res)
    for (i=0; i< N; i++)
      res += final computation(input[i], tmp[i], i)
  }
```

Example: target data and target update Openl

```
#pragma omp target data device(0) map(alloc:tmp[:N]) map(to:input[:N)) map(from:res)
#pragma omp target device(0)
#pragma omp parallel for
    for (i=0; i< N; i++)
      tmp[i] = some computation(input[i], i);
   update input array on the host(input);
#pragma omp target update device(0) to(input[:N])
#pragma omp target device(0)
#pragma omp parallel for reduction(+:res)
    for (i=0; i< N; i++)
      res += final computation(input[i], tmp[i], i)
  }
```



Programming OpenMP

Hands-on Exercises: Jacobi on GPU

Christian Terboven
Michael Klemm



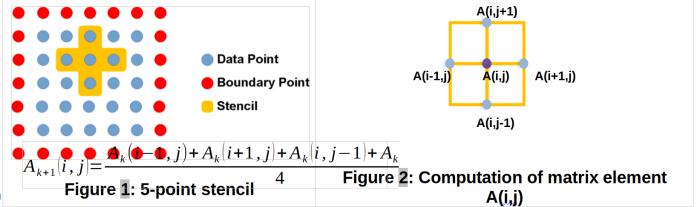
Jacobi on GPU / 1



During the following exercises, you will port a Jacobi solver to OpenMP. This **Jacobi** example solves a finite difference discretization (5-point-stencil) of the Laplace equation (2D):

$$\nabla^2 A(x,y) = 0$$

using the Jacobi iterative method. To this end, the Jacobi method starts with an approximation of the objective function f(x,y) and reuses formerly-computed matrix elements to solve the current one. It iterates only about the inner elements of the 2D-grid so that the boundary elements are only used within the stencil. The solving process is aborted if either a certain number of iterations is achieved (see $iter_max$) or the computed approximation is probably close to the solution. In this code, the latter is evaluated by checking whether the biggest change on any matrix element (see array err and variable err) is smaller than a given tolerance value, in the current iteration.



Jacobi on GPU / 2



- Task 0: You might want to acquire reference measurements on the host (wo/ GPU)...
- Task 1: Get it to the GPU: Parallelize only the one most compute-intensive loop
- Task 2: Improve the data management and the amount of parallelism on the GPU
- Task 3: Optimize that scheduling of iterations for the GPU
- Understand the performance of the host and the GPU
- Future tasks: use multiple GPUs, use the host and a GPU, ...