

## **AGENDA**

**Expressive Parallelism** 

**Pipelining** 

Routines

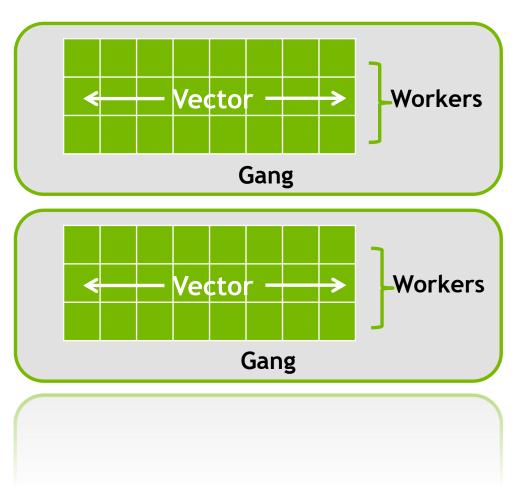
### The loop Directive

The **loop** directive gives the compiler additional information about the *next* loop in the source code through several clauses.

- independent
- all iterations of the loop are independent
- collapse(N)
- turn the next N loops into one, flattened loop
- tile(N[,M,...])
- break the next 1 or more loops into *tiles* based on the provided dimensions.



## OpenACC: 3 Levels of Parallelism



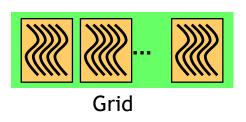
- Vector threads work in lockstep (SIMD/SIMT parallelism)
- Workers compute a vector
- Gangs have 1 or more
   workers and share resources
   (such as cache, the
   streaming multiprocessor,
   etc.)
- Multiple gangs work independently of each other

### **Execution Model**

#### **Software**







#### **Hardware**

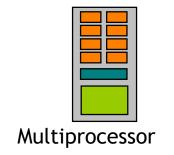


Threads are executed by scalar processors

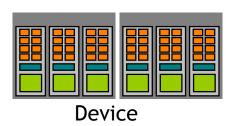


Thread blocks do not migrate

Several concurrent thread blocks can reside on one multiprocessor - limited by multiprocessor resources (shared memory and register file)



A kernel is launched as a grid of thread blocks



### gang, worker, vector Clauses

gang, worker, and vector can be added to a loop clause

A parallel region can only specify one of each gang, worker, vector

Control the size using the following clauses on the parallel region

num\_gangs(n), num\_workers(n), vector\_length(n)

```
#pragma acc parallel loop gang
for (int i = 0; i < n; ++i)
#pragma acc loop vector
for (int j = 0; j < n; ++j)
....</pre>
```

```
#pragma acc parallel vector_length(32)
#pragma acc loop gang worker
for (int i = 0; i < n; ++i)
    #pragma acc loop vector
    for (int j = 0; j < n; ++j)
    ...</pre>
```



### gang, worker, vector Clauses

gang, worker, and vector can be added to a kernels loop clause too

Since different loops in a kernels region may be parallelized differently, fine-tuning is done as a parameter to the gang, worker, and vector clauses.

```
#pragma acc kernels loop gang
for (int i = 0; i < n; ++i)
  #pragma acc loop vector
  for (int j = 0; j < n; ++j)
   ...</pre>
```

```
#pragma acc kernels loop gang worker
for (int i = 0; i < n; ++i)
    #pragma acc loop vector(32)
    for (int j = 0; j < n; ++j)
    ...</pre>
```



## The collapse Clause

collapse(n): Takes the next n tightly-nested loops, folds them into one, and applies the OpenACC directives to the new loop.

```
#pragma acc parallel loop \
  collapse(2)
for(int i=0; i<N; i++)
  for(int j=0; j<M; j++)
   ...</pre>
#pragma acc parallel loop
for(int ij=0; ij<N*M; ij++)
   ...
```

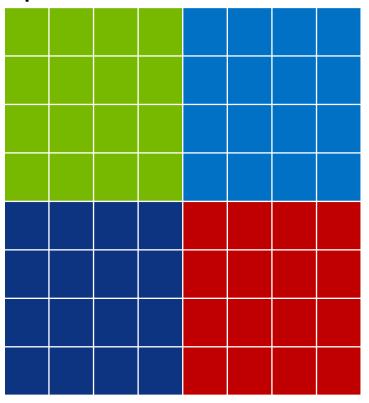
#### Why?

- Collapse outer loops to enable creating more gangs.
- Collapse inner loops to enable longer vector lengths.
- Collapse all loops, when possible, to do both.



#### The tile clause

Operate on smaller blocks of the operation to exploit data locality



```
#pragma acc loop tile(4,4)
  for(i = 1; i <= ROWS; i++) {
    for(j = 1; j <= COLUMNS; j++) {
      Temp[i][j] = 0.25 *
       (Temp last[i+1][j] +
        Temp last[i-1][j] +
        Temp last[i][j+1] +
        Temp last[i][j-1]);
```



## **Stride-1 Memory Accesses**

```
for(i=0; i<N; i++)
  for(j=0; j<M; j++)
  {
    A[i][j][1] = 1.0f;
    A[i][j][2] = 0.0f;
  }
}</pre>
```

```
for(i=0; i<N; i++)
  for(j=0; j<M; j++)
  {
    A[1][i][j] = 1.0f;
    A[2][i][j] = 0.0f;
}</pre>
```

The fastest dimension is length 2 and fastest loop strides by 2.

Now the inner loop is the fastest dimension through memory.

## Stride-1 Memory Accesses

```
for(i=0; i<N; i++)
  for(j=0; j<M; j++)
  {
    A[i][j].a = 1.0f;
    A[i][j].b = 0.0f;
  }
}</pre>
```

If all threads access the "a" element, they will be accesses every-other memory element.

```
for(i=0; i<N; i++)
  for(j=0; j<M; j++)
  {
    Aa[i][j] = 1.0f;
    Ab[i][j] = 0.0f;
  }
}</pre>
```

Now all threads are access contiguous elements of Aa and Ab.

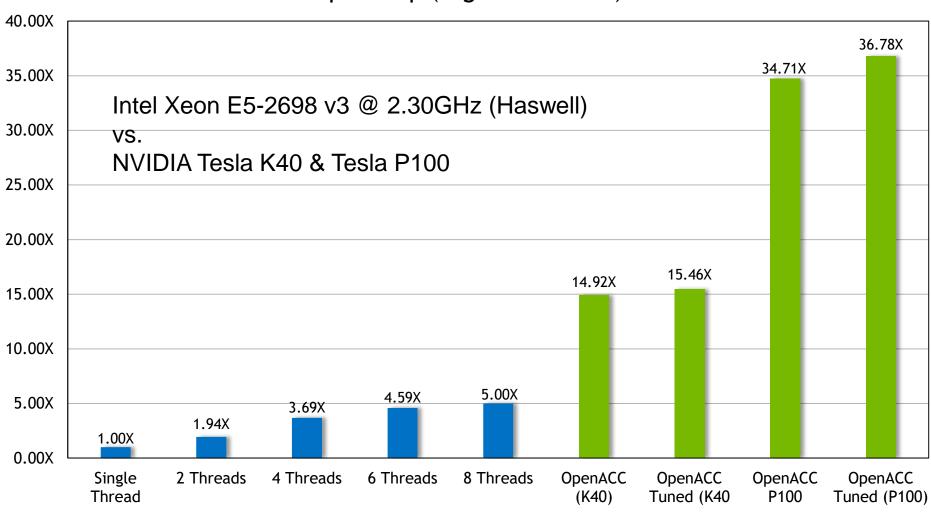


### **Optimize Loop Performance**

```
#pragma acc data copy(A) create(Anew)
while ( err > tol && iter < iter max ) {</pre>
  err=0.0;
#pragma acc parallel loop device type(nvidia) tile(32/4)
  for ( int j = 1; j < n-1; j++) {
    for(int i = 1; i < m-1; i++) {
      Anew[j][i] = 0.25 * (A[j][i+1] + A[j][i-1] +
                           A[j-1][i] + A[j+1][i]);
      err = max(err, abs(Anew[j][i] - A[j][i]));
#pragma acc parallel loop device type(nvidia) tile(32,4)
  for ( int j = 1; j < n-1; j++) {
    for( int i = 1; i < m-1; i++ ) {
      A[j][i] = Anew[j][i];
  iter++;
```

"Tile" the next two loops into 32x4 blocks, but only on NVIDIA GPUs.

#### Speed-Up (Higher is Better)



## **Asynchronous Programming**

Programming multiple operations without immediate synchronization

#### Real World Examples:

- Cooking a Meal: Boiling potatoes while preparing other parts of the dish.
- Three students working on a project on George Washington, one researches his early life, another his military career, and the third his presidency.
- Automobile assembly line: each station adds a different part to the car until it is finally assembled.

# **Asynchronous OpenACC**

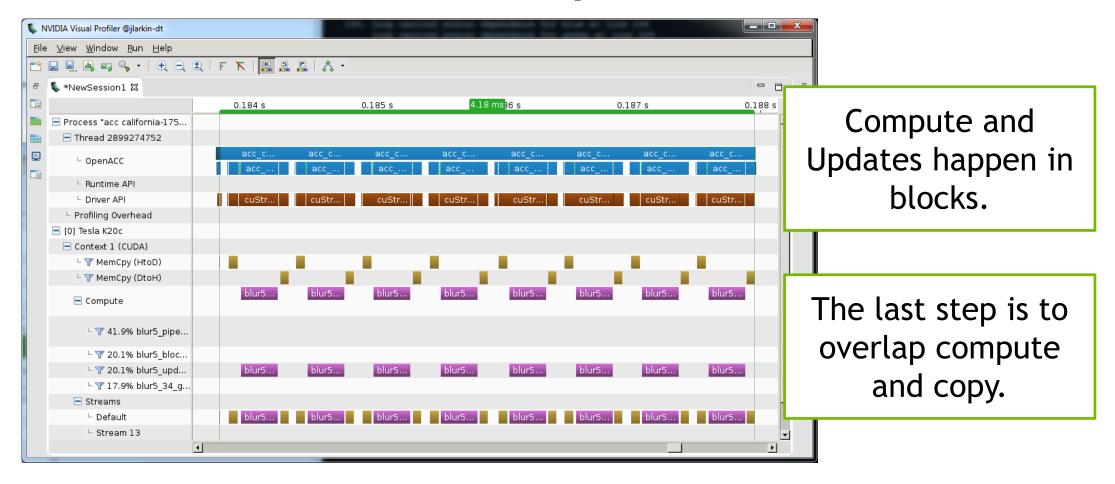
So far, all OpenACC directives have been synchronous with the host

- Host waits for the parallel loop to complete
- Host waits for data updates to complete

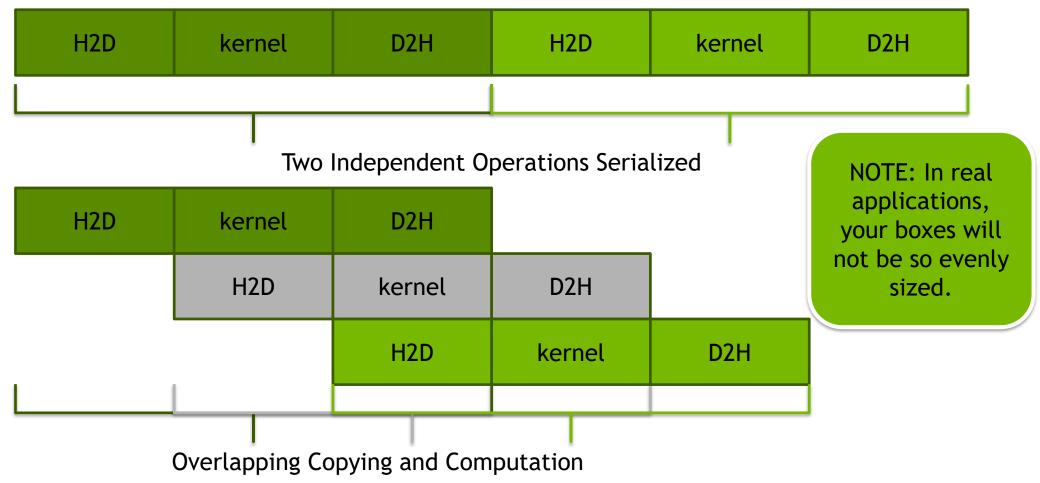
Most OpenACC directives can be made asynchronous

- Host issues multiple parallel loops to the device before waiting
- Host performs part of the calculation while the device is busy
- Data transfers can happen before the data is needed

# **GPU Timeline Blocked Updates**



# Pipelining Data Transfers



## OpenACC async and wait

```
async(n): launches work asynchronously in queue n
```

wait(n): blocks host until all operations in queue n have completed

Work queues operate in-order, serving as a way to express dependencies.

Work queues of different numbers may (or may not) run concurrently.

```
#pragma acc parallel loop async(1)
...
#pragma acc parallel loop async(1)
for(int i=0; i<N; i++)
...
#pragma acc wait(1)
for(int i=0; i<N; i++)</pre>
```

If *n* is not specified, async will go into a default queue and wait will wait all previously queued work.

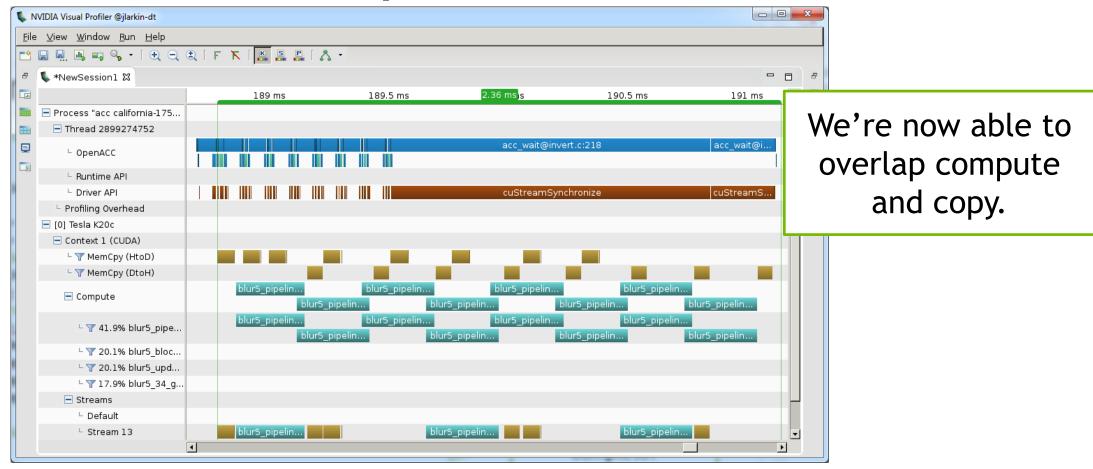
# Pipelined Code

```
#pragma acc data create(imgData[w*h*ch],out[w*h*ch])
                 copyin(filter)
for ( long blocky = 0; blocky < nblocks; blocky++)
  long starty = MAX(0,blocky * blocksize - filtersize/2);
  long endy = MIN(h,starty + blocksize + filtersize/2);
#pragma acc update device(imgData[starty*step:(endy-starty)*step]) async(block%3+1)
  starty = blocky * blocksize;
 endy = starty + blocksize;
#pragma acc parallel loop collapse(2) gang vector async(block%3+1)
 for (y=starty; y<endy; y++) for ( x=0; x<w; x++ ) {
    <filter code ommitted>
   out[y * step + x * ch] = 255 - (scale * blue);
   out[y * step + x * ch + 1 ] = 255 - (scale * green);
   out[v * step + x * ch + 2 ] = 255 - (scale * red);
#pragma acc update self(out[starty*step:blocksize*step]) async(block%3+1)
#pragma acc wait
```

Cycle between 3 async queues by blocks.

Wait for all blocks to complete.

# **GPU Timeline Pipelined**



## **OpenACC Routine Directive**

Specifies that the compiler should generate a device copy of the function/subroutine and what type of parallelism the routine contains.

#### **Clauses:**

#### gang/worker/vector/seq

Specifies the level of parallelism contained in the routine.

#### bind

Specifies an optional name for the routine, also supplied at call-site

#### no\_host

The routine will only be used on the device

#### device type

Specialize this routine for a particular device type.

You *must* declare *one* level of parallelism on the routine directive.



### Routine Directive: C/C++

```
// foo.h
#pragma acc routine seq
double foo(int i);

// Used in main()
#pragma acc parallel loop
for(int i=0;i<N;i++) {
   array[i] = foo(i);
}</pre>
```

- At function source:
  - Function needs to be built for the GPU.
  - It will be called by each thread (sequentially)
- At call the compiler needs to know:
  - Function will be available on the GPU
  - It is a sequential routine

#### **OPENACC Resources**

Guides • Talks • Tutorials • Videos • Books • Spec • Code Samples • Teaching Materials • Events • Success Stories • Courses • Slack • Stack Overflow





https://www.openacc.org/community#slack

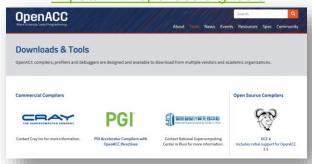
#### Resources

https://www.openacc.org/resources



#### **Compilers and Tools**

https://www.openacc.org/tools



#### **Success Stories**

https://www.openacc.org/success-stories



#### **Events**

https://www.openacc.org/events

