# CS 610: OpenMP

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Content influenced by many excellent references, see References slide for acknowledgements.

Material adapted from

- Several tutorials by Tim Mattson et al.
- P. Sadayappan, Ohio State, CS 5441
- Blaise Barney, OpenMP Tutorial, LLNL

### What is OpenMP?

- OpenMP (Open Multi-Processing) is a popular directive-based parallel programming model for shared-memory systems
  - OpenMP program is essentially a sequential program augmented with compiler directives to specify parallelism, eases conversion of existing sequential programs
- Standardizes established SMP practice + vectorization and heterogeneous device programming
- OpenMP supports C/C++ and Fortran on a wide variety of architectures
  - Supported by popular C/C++ compilers, for e.g., LLVM/Clang, GNU GCC, Intel ICC, and IBM XLC

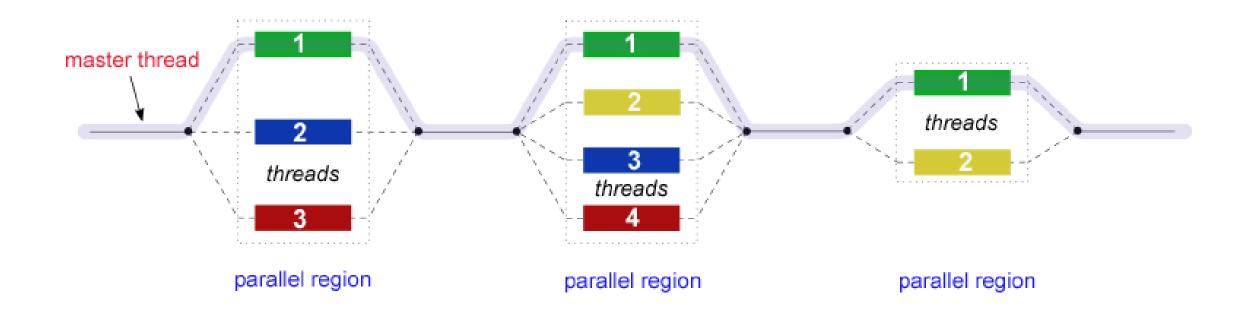
### Key Concepts in OpenMP

- **Parallel regions** where parallel execution occurs via multiple concurrently-executing threads
  - Each thread has its own program counter and executes one instruction at a time, similar to sequential program execution
- Shared and private data: shared variables are the means of communicating data between threads
- Synchronization: fundamental means of coordinating execution of concurrent threads
- Mechanism for **automated work distribution** across threads

### Goals of OpenMP

- Standardization
  - Provide a standard among a variety of shared memory architectures/platforms
  - Jointly defined and endorsed by a group of major computer hardware and software vendors
- Ease of use
  - Provide capability to incrementally parallelize a serial program, unlike message-passing libraries which typically require an all-or-nothing approach
  - Provide the capability to implement both coarse-grain and fine-grain parallelism
- Portability
  - Most major platforms and compilers support OpenMP

### Fork-Join Model of Parallel Execution



### Other Key Features

### • Scope of data

- Most data within a parallel region is shared by default
- Programmers can control scope of access to data by different threads

### Nested parallelism

• You can invoke a parallel region within another parallel region

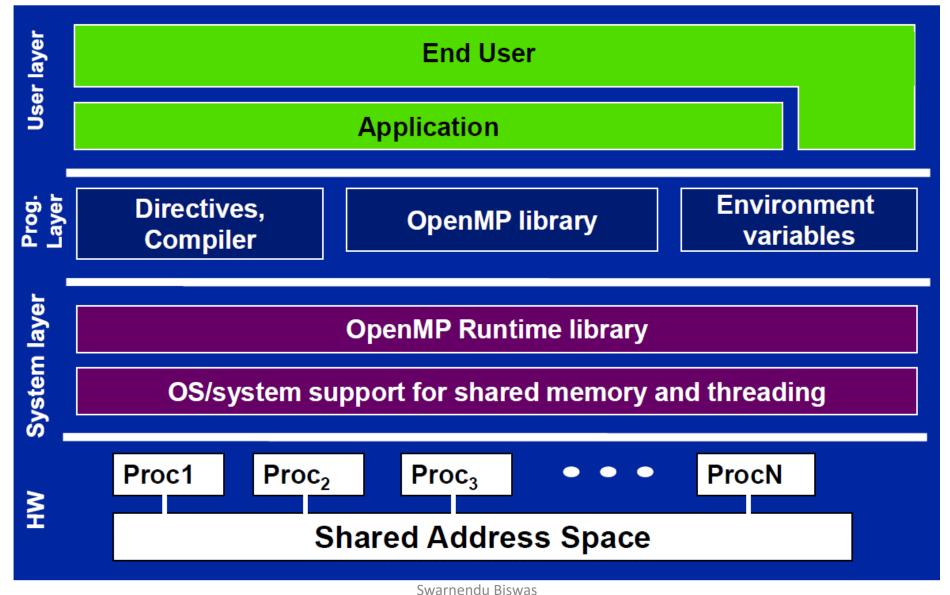
### Dynamic threads and scheduling

• The runtime can dynamically alter the number of parallel threads and also control the scheduling of work among threads

## The OpenMP API

- **Compiler directives:** #pragma omp parallel
  - Comments, ignored unless instructed not to
- Runtime library routines: int omp\_get\_num\_threads(void);
- Environment variables: export OMP\_NUM\_THREADS=8
- Most common constructs in OpenMP are compiler directives
  - #pragma omp directive [clause [clause]...] newline
  - Example: #pragma omp parallel num\_threads(4)
- Function prototypes and types are defined in the header omp.h

### **OpenMP Solution Stack**



### General Code Structure

```
#include <omp.h>
```

```
•••
```

```
int main() {
```

```
// serial code, master thread
```

•••

...

```
// begin parallel section,
// fork a team of threads
#pragma omp parallel ...
{
```

```
// parallel region executed by
  // all threads
  // other logic
  ...
  // all parallel threads join
  // master thread
}
// resume serial code
...
```

### Structured Block

- Most OpenMP constructs apply to a **structured block**
- Structured block is a block of one or more statements surrounded by "{ }", with one point of entry at the top and one point of exit at the bottom
  - It is okay to have an exit within the structured block
  - Disallows code that branches in to or out of the middle of the structured block

### Format of Compiler Directives

- #pragma omp
  - Required for all OpenMP C/C++ directives
- directive-name
  - A valid OpenMP directive. Must appear after the pragma and before any clauses
  - Scope extends to the the structured block following a directive, does not span multiple routines or code files
- [clause, ...]
  - Optional. Clauses can be in any order, and repeated as necessary unless otherwise restricted
- newline
  - Required. Precedes the structured block which is enclosed by this directive.

## Compiling an OpenMP Program

- Linux and GNU GCC
  - g++ -fopenmp hello-world.cpp
- Linux and Clang/LLVM
  - clang++ -fopenmp hello-world.cpp
- Can use the preprocessor macro \_OPENMP to check for compiler support

### Hello World with OpenMP!

```
#include <iostream>
#include <omp.h>
using namespace std;
int main() {
  cout << "This is serial code\n";</pre>
#pragma omp parallel
    int num_threads = omp_get_num_threads();
    int tid = omp_get_thread_num();
    if (tid == 0) {
      cout << num_threads << "\n";</pre>
    }
    cout << "Hello World: " << tid << "\n";</pre>
  }
```

```
cout << "This is serial code\n";</pre>
#pragma omp parallel num_threads(2)
    int tid = omp_get_thread_num();
    cout << "Hello World: " << tid << "\n";</pre>
  cout << "This is serial code\n";</pre>
  omp_set_num_threads(3);
#pragma omp parallel
  ł
    int tid = omp_get_thread_num();
    cout << "Hello World: " << tid << "\n";</pre>
```

### Hello World with OpenMP!

- Each thread has a unique integer "id"; master thread has "id" 0, and other threads have "id" 1, 2, ...
- OpenMP runtime function omp\_get\_thread\_num() returns a thread's unique "id"
- The function omp\_get\_num\_threads() returns the total number of executing threads
- The function omp\_set\_num\_threads(x) asks for "x" threads to execute in the next parallel region (must be set outside region)

### Types of Parallelism with OpenMP

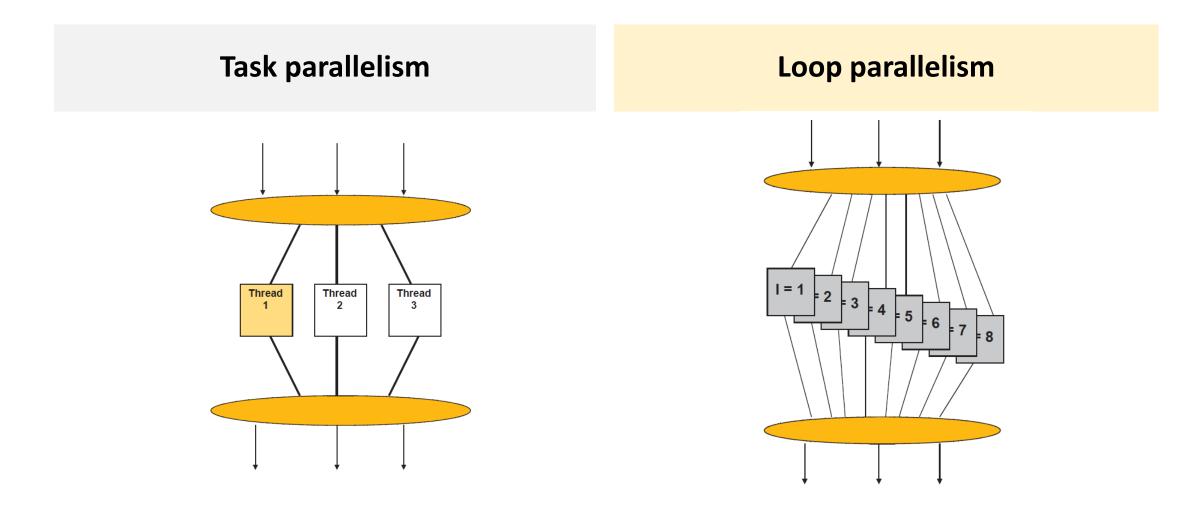
### **Coarse-grained** • Task parallelism • Split the work among threads that execute in parallel

 Implicit join at the end of the segment, or explicit synchronization points

### **Fine-grained**

- Loop parallelism
  - Execute independent iterations of for-loops in parallel
  - Several choices in splitting the work

### Types of Parallelism with OpenMP



### The Essence of OpenMP

#### • Create threads that execute in a shared address space

- The only way to create threads is with the parallel construct
- Once created, all threads execute the code inside the construct

#### • Split up the work between threads by one of two means

- SPMD (Single Program Multiple Data) all threads execute the same code and you use the thread ID to assign work to a thread
- Workshare constructs split up loops and tasks between threads
- Manage data environment to avoid data access conflicts
  - Synchronization so correct results are produced regardless of how threads are scheduled
  - Carefully manage which data can be private (local to each thread) and shared

### OpenMP Constructs

 Construct consists of an executable directive and the associated loop, statement, or structured block

```
#pragma omp parallel
{
   // inside parallel construct
   subroutine();
}
void subroutine () {
   // outside parallel construct
```

Lexical or

static extent

## OpenMP Regions

- Region consists of all code encountered during a specific instance of the execution of a given construct
  - Also includes implicit code introduced by the OpenMP implementation

```
#pragma omp parallel
{
   // inside parallel region
   subroutine( );
}
```

```
void subroutine (void) {
    // inside parallel region
```

### Parallel Region Construct

- Block of code that will be executed by multiple threads
- #pragma omp parallel [*clause* ...] structured\_block
- Example of clauses
  - private (list)
  - shared (list)
  - default (shared | none)
  - firstprivate (list)
  - reduction (operator: list)
  - num\_threads (integer-expression)

• ...

### Parallel Region Construct

- When a thread reaches a parallel directive, it creates a team of threads and becomes the master of the team
  - By default OpenMP creates as many thread as many cores available in the system
- The master is a member of that team and has thread number 0 within that team
- The code is duplicated and all threads will execute that code
- There is an implied barrier at the end of a parallel section
- Only the master thread continues execution past this point

## Threading in OpenMP

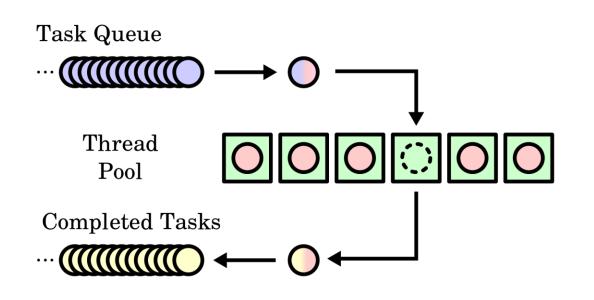
```
#pragma omp parallel num_threads(4)
{
  foobar ();
}
```

- OpenMP implementations use a thread pool so full cost of threads creation and destruction is not incurred for reach parallel region
- Only three threads are created excluding the parent thread

```
void thunk () {
  foobar ();
pthread t tid[4];
for (int i = 1; i < 4; ++i)
  pthread_create (&tid[i],0,thunk, 0);
for (int i = 1; i < 4; ++i)
  pthread_join (tid[i]);
```

### Thread Pool

- Software design pattern
- Maintains a pool of threads waiting for work
- Advantageous when work is short-lived
  - Avoid the overhead of frequent thread creation and destruction
- Excess threads can degrade performance
  - Memory, context-switch, and other resource overhead



## Specifying Number of Threads

- Desired number of threads can be specified in many ways
  - Setting environmental variable OMP\_NUM\_THREADS
  - Runtime OpenMP function omp\_set\_num\_threads(4)
  - Clause in #pragma for parallel region

```
double A[1000];
#pragma omp parallel num_threads(4)
  int t_id = omp_get_thread_num();
  int nthrs = omp_get_num_threads();
 for (int i = t_id; i < 1000; i += nthrs)</pre>
    A[i] = foo(i);
  }
```

## Specifying Number of Threads

### • Three ways

- OMP\_NUM\_THREADS
- omp\_set\_num\_threads(...)
- #pragma omp parallel num\_threads(...)
- OMP\_NUM\_THREADS (if present) specifies initially the number of threads
- Calls to omp\_set\_num\_threads() override the value of OMP\_NUM\_THREADS
- Presence of the num\_threads clause overrides both other values

### Distributing Work

 Threads can perform disjoint work division using their thread ids and knowledge of total # threads

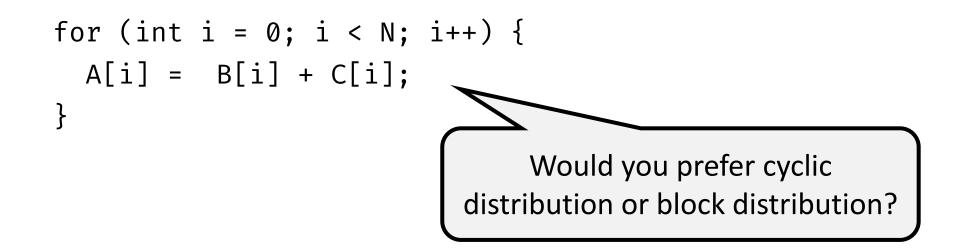
```
double A[1000];
omp_set_num_threads(4);
#pragma omp parallel
{
    int t_id = omp_get_thread_num();
    for (int i = t_id; i < 1000; i += omp_get_num_threads()) {
        A[i]= foo(i);
    }
}
```

### Distributing Work

```
double A[1000];
omp_set_num_threads(4);
#pragma omp parallel
                                              Block distribution
                                                  of work
  int t_id = omp_get_thread_num();
  int num_thrs = omp_get_num_threads();
  int b_size = 1000 / num_thrs;
  for (int i = t_id*b_size; i < (t_id+1)*b_size; i += num_thrs) {</pre>
    A[i] = foo(i);
```

### Cyclic vs Block Distribution of Work

• Say I have a computation like

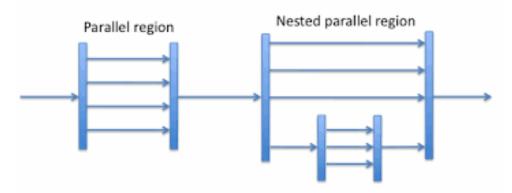


### Other Subtle Issues about parallel Construct

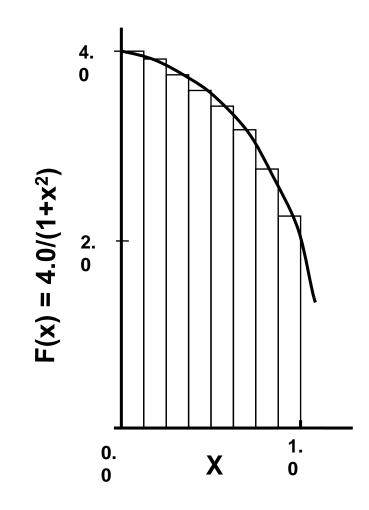
- If a thread in a team executing a parallel region encounters another parallel directive, it creates a new team
- If execution of a thread terminates while inside a parallel region, execution of all threads in all teams terminates
  - The order of termination of threads is unspecified

### Nested Parallelism

- Allows to create parallel region within a parallel region itself
- Nested parallelism can help scale to large parallel computations
- Usually turned off by default
  - Can lead to oversubscription by creating lots of threads
- Set OMP\_NESTED as TRUE or call omp\_set\_nested()



### Recurring Example of Numerical Integration



• Mathematically

$$\int_0^1 \frac{4}{(1+x^2)} dx = \pi$$

• We can approximate the integral as the sum of the rectangles

$$\sum_{i=0}^{N} F(x_i) \Delta x \approx \pi$$

where each rectangle has width  $\Delta x$  and height  $F(x_i)$  at the middle of interval *i* 

### Serial Pi Program

```
double seq_pi() {
  int i;
  double x, pi, sum = 0.0;
  double step = 1.0 / (double)NUM_STEPS;
  for (i = 0; i < NUM_STEPS; i++) {</pre>
    x = (i + 0.5) * step;
    sum += 4.0 / (1.0 + x * x);
  }
  pi = step * sum;
  return pi;
```

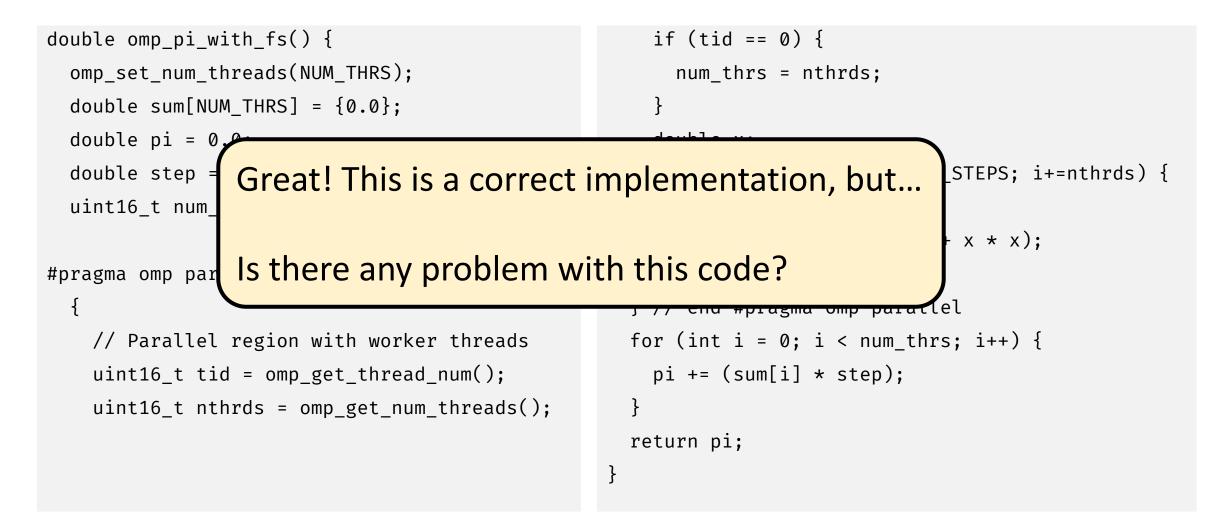
\$ g++ -fopenmp compute-pi.cpp
\$ ./a.out
3.14159

## Computing Pi with OpenMP

```
double omp_pi_with_fs() {
  omp set num threads(NUM THRS);
  double sum[NUM_THRS] = {0.0};
  double pi = 0.0;
  double step = 1.0 / (double)NUM STEPS;
  uint16 t num thrs;
#pragma omp parallel
  ł
   // Parallel region with worker threads
    uint16_t tid = omp_get_thread_num();
    uint16 t nthrds = omp get num threads();
```

```
if (tid == 0) {
    num thrs = nthrds;
  }
  double x;
  for (int i = tid; i < NUM_STEPS; i+=nthrds) {</pre>
    x = (i + 0.5) * step;
    sum[tid] += 4.0 / (1.0 + x * x);
  }
} // end #pragma omp parallel
for (int i = 0; i < num_thrs; i++) {</pre>
  pi += (sum[i] * step);
}
return pi;
```

## Computing Pi with OpenMP



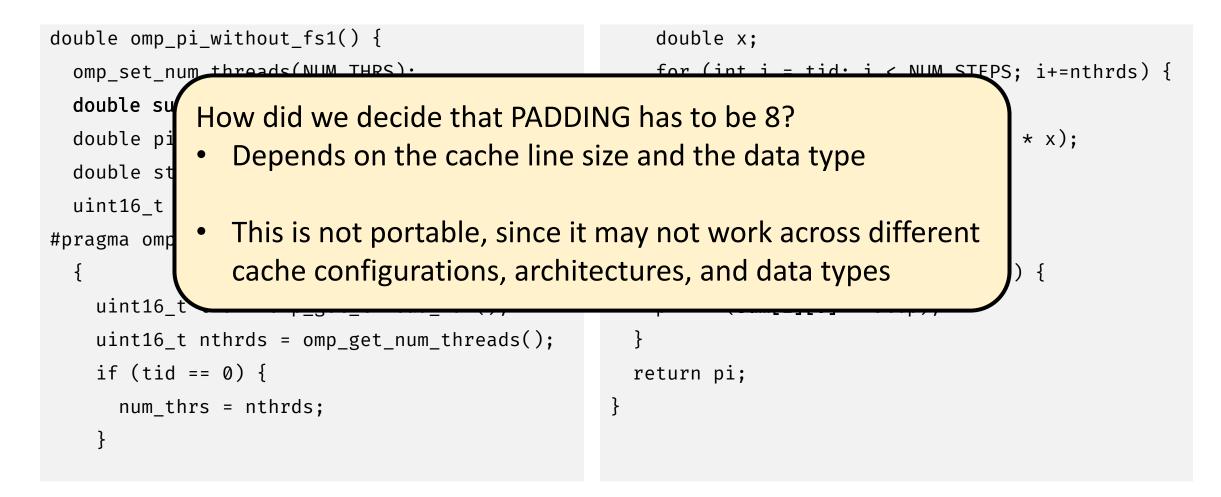
### Avoid False Sharing

- Array sum[] is a shared array, with each thread accessing exactly on element
- Cache line holding multiple elements of sum will be locally cached by each processor in its private L1 cache
- When a thread writes into into an index in sum, the entire cache line becomes "dirty" and causes invalidation of that line in all other processor's caches
- Cache thrashing due to this "false sharing" causes performance degradation

```
double omp_pi_without_fs1() {
  omp set num threads(NUM THRS);
  double sum[NUM_THRS][8];
  double pi = 0.0;
  double step = 1.0 / (double)NUM_STEPS;
  uint16 t num thrs;
#pragma omp parallel
    uint16 t tid = omp get thread num();
    uint16_t nthrds = omp_get_num_threads();
    if (tid == 0) {
      num thrs = nthrds;
    }
```

```
double x;
  for (int i = tid; i < NUM_STEPS; i+=nthrds) {</pre>
    x = (i + 0.5) * step;
    sum[tid][0] += 4.0 / (1.0 + x * x);
  }
} // end #pragma omp parallel
for (int i = 0; i < num thrs; i++) {</pre>
  pi += (sum[i][0] * step);
}
return pi;
```

}

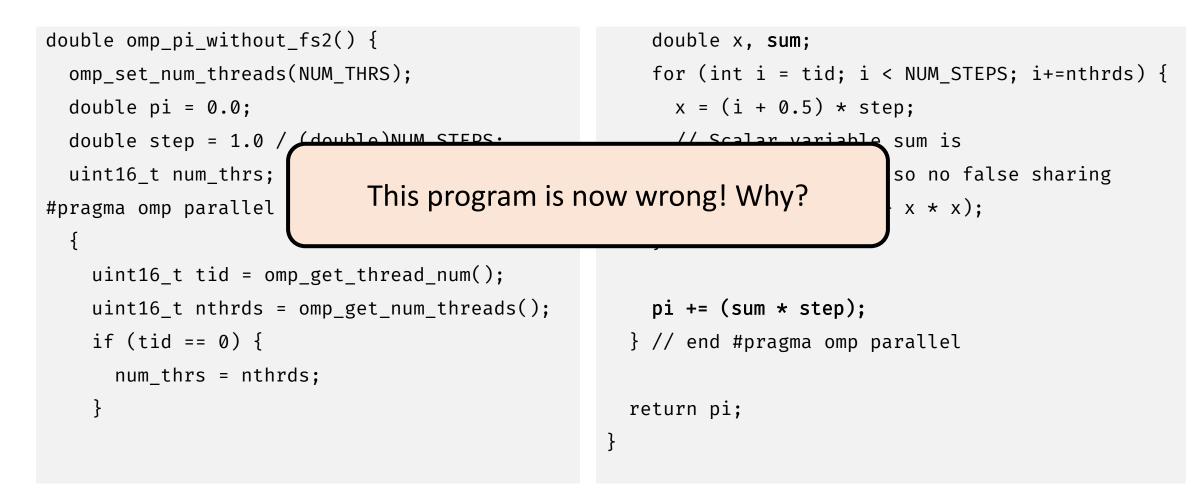


```
double omp_pi_without_fs2() {
  omp set num threads(NUM THRS);
  double pi = 0.0;
  double step = 1.0 / (double)NUM STEPS;
  uint16_t num_thrs;
#pragma omp parallel
  ł
    uint16_t tid = omp_get_thread_num();
    uint16_t nthrds = omp_get_num_threads();
    if (tid == 0) {
      num_thrs = nthrds;
    }
```

```
double x, sum;
for (int i = tid; i < NUM_STEPS; i+=nthrds) {
    x = (i + 0.5) * step;
    // Scalar variable sum is
    // thread-private, so no false sharing
    sum += 4.0 / (1.0 + x * x);
}
pi += (sum * step);
```

```
} // end #pragma omp parallel
```

```
return pi;
```



# Synchronization Constructs

# critical Construct

- Only one thread can enter critical section at a time; others are held at entry to critical section
- Prevents any race conditions in updating res

```
float res;
#pragma omp parallel
  float B;
  int id = omp get thread num();
  int nthrds = omp get num threads();
  for (int i = id; i < MAX; i += nthrds) {</pre>
    B = big_job(i);
#pragma omp critical
    consume (B, res);
```

# critical Construct

- Works by acquiring a lock
- If your code has multiple critical sections, they are all mutually exclusive
- You can avoid this by naming critical sections
  - #pragma omp critical (optional\_name)

#### Correct Pi Program: Fix the Data Race

```
double omp_pi_without_fs2() {
  omp set num threads(NUM THRS);
                                                   {
  double pi = 0.0, step = 1.0 / (double)NUM_S
TEPS;
  uint16 t num thrs;
#pragma omp parallel
    uint16_t tid = omp_get_thread_num();
    uint16_t nthrds = omp_get_num_threads();
    if (tid == 0) {
      num thrs = nthrds;
    }
```

```
double x, sum;
    for (int i = tid; i < NUM STEPS; i += nthrds)</pre>
      x = (i + 0.5) * step;
      // Scalar variable sum is
      // thread-private, so no false sharing
      sum += 4.0 / (1.0 + x * x);
    }
#pragma omp critical // Mutual exclusion
    pi += (sum * step);
  } // end #pragma omp parallel
```

return pi;

# Evaluate the Pi Program Variants

- Sequential computation of pi
- Parallel computation with false sharing
- Parallel computation with padding
- Parallel computation with thread-local sum

| <b>n</b> (†  |         | Tilix: Default |         |  |  |  |  |
|--|---------|----------------|---------|--|--|--|--|
|  | Default | ×              | Default |  |  |  |  |
| 1: swarnendu@cse-BM1AF-BP1AF-BM6AF: ~/iitk-workspace/parallel-computing/src/openmp 🔻 |         |                |         |  |  |  |  |

```
warnendu:~/iitk-workspace/parallel-computing/src/openmp$ ./a.out
alue of PI computed sequentially: 3.14159 in 0.0165884 seconds
alue of PI computed in parallel (with false sharing): 3.14159 in 0.0119428 seconds
alue of PI computed in parallel (without false sharing via padding): 3.14159 in 0.00325493 seconds
alue of PI computed in parallel (without false sharing via thread-private variables, sync out of loop): 3.14159 in 0.00326013 seconds
alue of PI computed in parallel with task sharing construct: 3.14159 in 0.00325819 seconds
alue of PI computed in parallel with task sharing construct: 3.14159 in 0.00325819 seconds
```

# atomic Construct

- Atomic is an efficient critical section for simple reduction operations
- Applies only to the update of a memory location
- Uses hardware atomic instructions for implementation; much lower overhead than using critical section

```
float res;
#pragma omp parallel
  float B;
  int id = omp get thread num();
  int nthrds = omp get num threads();
  for (int i = id; i < MAX; i += nthrds) {</pre>
    B = big_job(i);
#pragma omp atomic
    res += B;
```

# atomic Construct

- Expression operation can be of type
  - x binop= expr
    - X is a scalar type
  - X++
  - ++X
  - x--
  - --X

```
float res;
#pragma omp parallel
  float B;
  int id = omp get thread num();
  int nthrds = omp_get_num_threads();
  for (int i = id; i < MAX; i += nthrds) {</pre>
    B = big_job(i);
#pragma omp atomic
    res += B;
  }
```

### critical vs atomic

#### critical

- Locks code segments
- Serializes all unnamed critical sections
- Less efficient than atomic
- More general

#### atomic

- Locks data variables
- Serializes operations on the same shared data
- Makes use of hardware instructions to provide atomicity
- Less general

#### Is atomic is always the way to go?

```
int sum = 0, m_val = 0;
```

```
#pragma omp parallel for
  for (int i = 0; i < N; i++) {
#pragma omp atomic
    sum += getVal();
  }
int getVal() {
  return ++m_val;
}
```

## **Barrier Synchronization**

```
#pragma omp parallel private(id)
ł
  int id=omp_get_thread_num();
  A[id] = big_calc1(id);
                          explicit barrier
#pragma omp barrier_
 B[id] = big_calc2(id);
}
```

 Each thread waits until all threads arrive

### Barrier Synchronization

```
#pragma omp parallel private(id)
  int id=omp_get_thread_num();
  A[id] = big_calc1(id);
#pragma omp barrier
                         explicit barrier
                                       }
#pragma omp for
  for (i=0;i<N;i++) {</pre>
    B[i]=big calc2(i,A);
          implicit barrier
```

```
#pragma omp for nowait
for (i=0;i<N;i++) {
    C[i]=big_calc2(B, i);
}</pre>
```

no implicit barrier, nowait cancels barrier creation

```
A[id] = big_calc4(id);
```

## Use of nowait clause

Can be useful if the two loops are independent

```
# pragma omp for nowait
for ( /* ... */ ) {
    // .. first loop ..
}
# pragma omp for
```

```
# pragma omp for
for ( /* ... */ ) {
    // .. second loop ..
}
```

```
# pragma omp for nowait
for (int i=0; i<N; i++ ) {
    a[i] = b[i] + c[i];
}</pre>
```

```
# pragma omp for
for (int i=0; i<N; i++) {
   d[i] = a[i] + b[i];
}
```

# Clause ordered

- Specifies that iterations of the enclosed loop will be executed in the same order as if they were executed on a serial processor
- It must appear within the extent of omp for Or omp parallel for

```
    Should be used in two stages
```

```
omp_set_num_threads(4);
#pragma omp parallel
#pragma omp for ordered
  for (int i=0; i<N; i++) {</pre>
    tmp = func1(i);
#pragma omp ordered
   cout << tmp << "\n";</pre>
  }
```

# Synchronization Constructs

| High-level | Low-level |
|------------|-----------|
| • critical | •locks    |
| • atomic   | • flush   |
|            |           |

- barrier
- ordered

# Synchronization with Locks

- More flexible than critical sections (can use multiple locks)
- critical locks a code segment, while locks lock data
- More error-prone
  - For example, deadlock if a thread does not unset a lock after acquiring it

```
omp_lock_t lck;
omp_init_lock(&lck);
#pragma omp parallel
  do_many_things();
  omp_set_lock(&lck);
  // critical section
  omp_unset_lock(&lck);
  do_many_other_things ();
omp_destroy_lock(&lck);
```

# Synchronization with Locks

- Nested locks can be acquired if it is available or owned by the same thread
- omp\_init\_lock()
- omp\_set\_lock()
- omp\_unset\_lock()
- omp\_test\_lock()
- omp\_destroy\_lock()
- omp\_init\_nest\_lock()
- omp\_set\_nest\_lock()
- omp\_unset\_nest\_lock()
- omp\_test\_nest\_lock()
- omp\_destroy\_nest\_lock()

# Example Program

```
int find_total_mass() {
    omp_lock_t lock;
    omp_init_lock(&lock);
#pragma omp parallel for
    for(int i=0;i<n;i++) {
        omp_set_lock(&lock);
        total_mass += mass[i];
        omp_unset_lock(&lock);</pre>
```

```
while(!omp_test_lock(&lock)) {
   find_active_neighbors(list);
}
```

```
total_mass = sum_neigh(list);
omp_unset_lock(&lock);
}
```

```
omp_destroy_lock(&lock);
return total_mass;
```

}

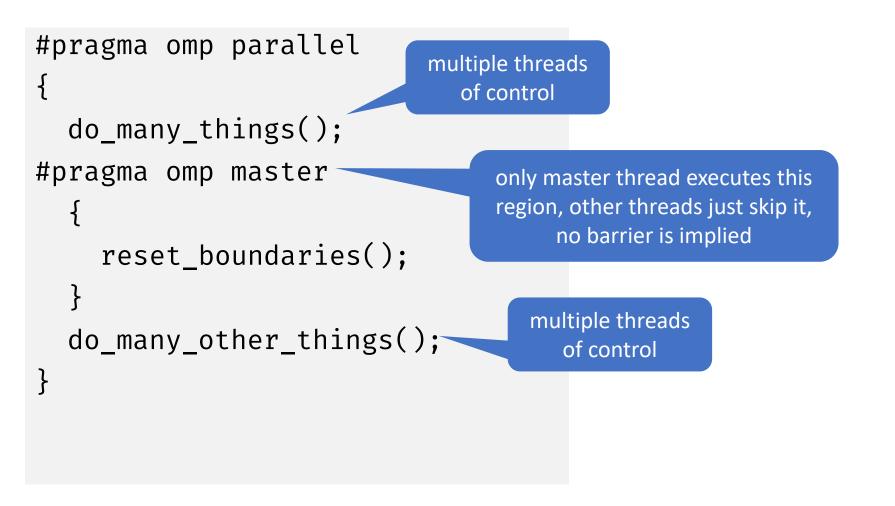
# Synchronization Construct: flush

- #pragma omp flush (list)
- Identifies a point at which a thread is guaranteed to see a consistent view of memory with respect to the variables in "list"
  - Flush forces data to be updated in memory so other threads see the most recent value
- In the absence of a list, all shared objects are synchronized

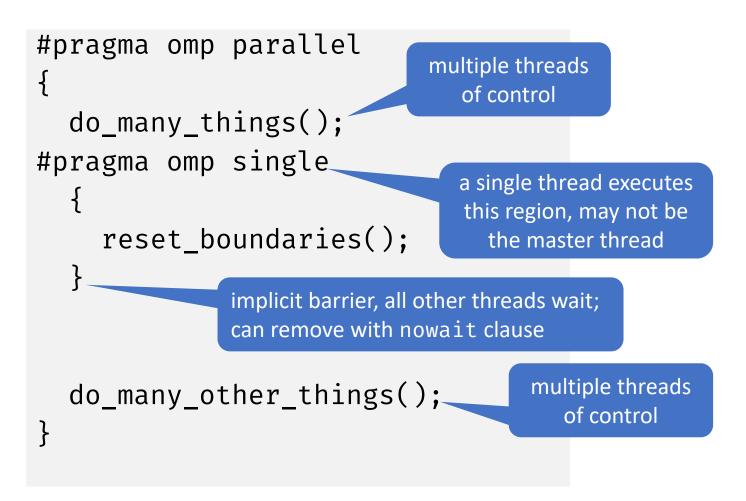
# Synchronization Construct: flush

- If list contains a pointer, the pointer is flushed, not the object referred to by the pointer
- It is recommended not to use flushes, excepting certain cases where you want to implement say your own spin lock
- Flushes are expensive, since they require compilers to generate memory fences

# Clause master



# Clause single



# Simplify Control Flow: Use single

```
double omp_pi_without_fs2() {
  omp set num threads(NUM THRS);
  double pi = 0.0, step = 1.0 / (double)NUM_S
TEPS;
  uint16_t num_thrs;
#pragma omp parallel
    uint16_t tid = omp_get_thread_num();
    uint16 t nthrds = omp get num threads();
#pragma omp single
      num_thrs = nthrds;
```

```
double x, sum;
    for (int i = tid; i < NUM_STEPS; i+=nthrds) {</pre>
      x = (i + 0.5) * step;
      // Scalar variable sum is
      // thread-private, so no false sharing
      sum += 4.0 / (1.0 + x * x):
    }
#pragma omp critical // Mutual exclusion
    pi += (sum * step);
  }
  return pi;
```

}

# Reductions in OpenMP

- Reductions are common patterns
  - True dependence that cannot be removed
- OpenMP provides special support via reduction clause
  - OpenMP compiler automatically creates local variables for each thread, and divides work to form partial reductions, and code to combine the partial reductions
- Predefined set of associative operators can be used with reduction clause,
  - For e.g., +, \*, -, min, max

```
double sum = 0.0;
```

```
omp_set_num_threads(N);
#pragma omp parallel
{
    double my_sum = 0.0;
    my_sum = func(omp_get_thread_num());
#pragma omp critical
    sum += my_sum;
```

# Reductions in OpenMP

- Reductions clause specifies an operator and a list of reduction variables (must be **shared** variables)
- OpenMP compiler creates a local copy for each reduction variable, initialized to operator's identity (e.g., 0 for +; 1 for \*)
- After work-shared loop completes, contents of local variables are combined with the "entry" value of the shared variable
- Final result is placed in shared variable

```
double sum = 0.0;
```

```
omp_set_num_threads(N);
#pragma omp parallel reduction(+ : sum)
    sum += func(omp_get_thread_num());
```

# Reduction Operators and Initial Values



| Operator | Initial value            | Operator | Initial value |
|----------|--------------------------|----------|---------------|
| +        | 0                        | &        | ~0            |
| *        | 1                        | 1        | 0             |
| -        | 0                        | ^        | 0             |
| Min      | Largest positive number  | &&       | 1             |
| Max      | Smallest negative number | 11       | 0             |

# Computing Pi with OpenMP

```
double omp_pi_with_fs() {
  omp set num threads(NUM THRS);
  double sum[NUM THRS] = {0.0};
  double pi = 0.0;
  double step = 1.0 / (double)NUM STEPS;
  uint16 t num thrs;
#pragma omp parallel
  ł
    // Parallel region with worker threads
    uint16_t tid = omp_get_thread_num();
    uint16_t nthrds = omp_get_num_threads();
```

```
#pragma omp single
    num thrs = nthrds;
    double x;
    for (int i = tid; i < NUM_STEPS; i+=nthrds) {</pre>
     x = (i + 0.5) * step;
      sum[tid] += 4.0 / (1.0 + x * x);
    }
  } // end #pragma omp parallel
#pragma omp parallel for reduction(+ : pi)
  for (int i = 0; i < num thrs; i++) {</pre>
    pi += (sum[i] * step);
  }
  return pi;
```

# Data Sharing

# Understanding Scope of Shared Data

- As with any shared-memory programming model, it is important to identify shared data
  - Multiple child threads may read and update the shared data
  - Need to coordinate communication among the team by proper initialization and assignment to variables
- Scope of a variable refers to the set of threads that can access the thread in a parallel block
- Variables (declared outside the scope of a parallel region) are shared among threads unless explicitly made private
- A variable in a parallel region can be either shared or private
  - Variables **declared** within parallel region scope are **private**
  - Stack variables declared in functions called from within a parallel region are private

#### Implicit Rules

```
int n = 10, a = 7;
```

```
#pragma omp parallel
```

```
...
int b = a + n;
b++;
...
}
```

- n and a are shared variables
- b is a private variable

{

# Data Sharing: shared and private Clause

- #pragma omp parallel shared(x)
  - shared (varlist) Shared by all threads, all threads access the same storage area for shared variables
  - Responsibility for synchronizing accesses is on the programmer
- #pragma omp parallel private(x)
  - private (varlist)
    - A new object is declared for each thread in the team
    - Variables declared private should be assumed to be **uninitialized** for each thread
    - Each thread receives its own uninitialized variable x
    - Variable x falls out-of-scope after the parallel region
  - A global variable with the same name is unaffected (v3.0 and later)

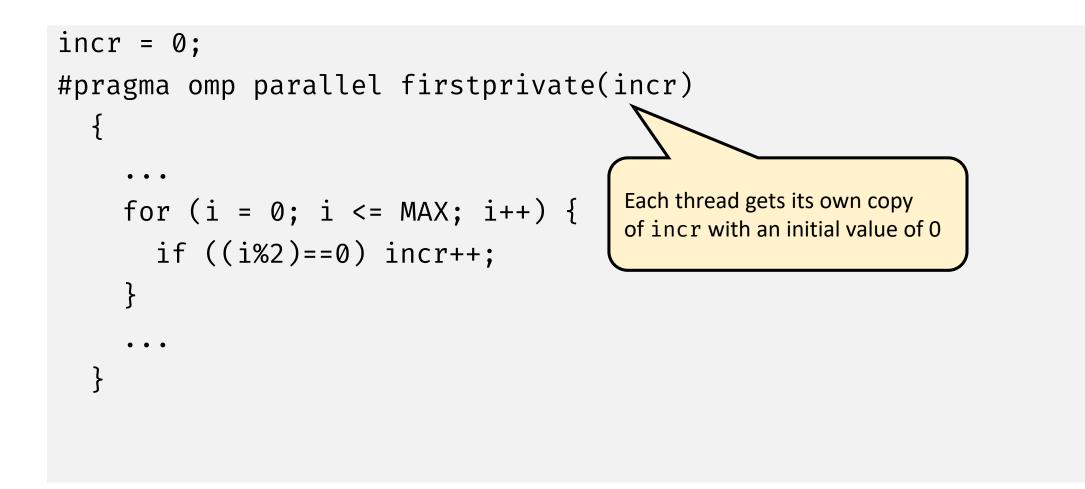
# Understanding the private clause

```
int p = 0;
#pragma omp parallel private(p)
{
 // value of p is undefined
  p = omp_get_thread_num();
 // value of p is defined
  ...
}
// value of p is undefined
```

## Clause firstprivate

- firstprivate (list)
  - Variables in list are private, and are initialized according to the value of their original objects **prior** to entry into the parallel construct
- #pragma omp parallel firstprivate(x)
  - x must be a global-scope variable
  - Each thread receives a **by-value copy** of x
  - The local x's fall out-of-scope after the parallel region
  - The base global variable with the same name is unaffected

### Clause firstprivate



### Clause lastprivate

- lastprivate (list)
  - Variables in list are private, the values from the last (sequential) iteration or section is copied back to the original objects

```
void sq2(int n, double *lastterm) {
  double x; int i;
#pragma omp parallel for
lastprivate(x)
  for (i = 0; i < n; i++) {
    x = a[i]*a[i] + b[i]*b[i];
    b[i] = sqrt(x);
  }
  *lastterm = x;
                 "x" has the value it held for the "last
                 sequential" iteration, i.e., for i=(n-1)
```

### Clause default

- default (shared | none)
  - Specify a default scope for all variables in the lexical extent of any parallel region

```
int a, b, c, n;
```

```
#pragma omp parallel for
default(shared), private(a, b)
for (int i = 0; i < n; i++) {
   // a and b are private variables
   // c and n are shared variables
```

}

### Clause default

```
int n = 10;
std::vector<int> vector(n);
int a = 10;
```

### Data Sharing Example

A = 1, B = 1, C = 1

#pragma omp parallel private(B) firstprivate(C)

- What can we say about the scope of A, B, and C, and their values?
- Inside the parallel region
  - "A" is shared by all threads; equals 1
  - "B" and "C" are local to each thread.
    - B's initial value is undefined
    - C's initial value equals 1
- Following the parallel region
  - B and C revert to their original values of 1
  - A is either 1 or the value it was set to inside the parallel region

### Data Sharing Example

```
double A[10];
int main() {
    int index[10];
#pragma omp parallel
    work(index);
    printf("%d\n", index[0]);;
}
```

```
void work(int *index) {
  double temp[10];
  static int count;
```

A, index, and count are shared by all threads

temp is local to each thread

. . .

### Threadprivate Variables

- A threadprivate variable provides one instance of a variable for each thread
- The variable refers to a unique storage block in each thread
- Enables persistent private variables, not limited in lifetime to one parallel region

```
int a, b;
# pragma omp threadprivate(a, b)
// a and b are thread-private
```

### private vs threadprivate

### private

- Local to a parallel region
- Mostly allocated on the stack
- Value is assumed to be undefined on entry and exit from a parallel region

### threadprivate

- Persists across parallel regions
- Mostly allocated on the heap on thread-local storage
- Value is undefined on entry to the first parallel region

## Clause copyin

- Used to initialize threadprivate data upon entry to a parallel region
- Specifies that the master thread's value of a threadprivate variable should be copied to the corresponding variables in the other threads

```
int a, b;
...
# pragma omp threadprivate (a, b)
    // .. code ..
# pragma omp parallel copyin (a, b)
{
    // a and b copied from master thread
}
```

### Summary of Data Sharing Rules

- Variables are shared by default
- Variables declared within parallel blocks and subroutines called from within a parallel region are private (reside on a stack private to each thread), unless scoped otherwise
- Default scoping rule can be changed with default clause

#### Recommendation

- Always use the default(none) clause
- Declare private variables in the parallel region

# Runtime Routines and Environment Variables

# Runtime Library Routines and Environment Variables

- omp\_set\_num\_threads()
- omp\_get\_num\_threads()
- omp\_get\_thread\_num()
- omp\_get\_max\_threads()
- omp\_in\_parallel()
- omp\_set\_dynamic()
- omp\_get\_dynamic()
- omp\_num\_procs()

- Set the default number of threads to use
  - OMP\_NUM\_THREADS int\_literal
- Control the size of child threads' stack
  - OMP\_STACKSIZE
- Hint to runtime how to treat idle threads
  - OMP\_WAIT\_POLICY
  - ACTIVE keep threads alive at barriers/locks
  - PASSIVE try to release processor at barriers/locks
- Process binding is enabled if this variable is true, the runtime will not move threads around between processors
  - OMP\_PROC\_BIND true | false
- ••••

•••

**Coarse-grained Parallelism** 

- Loop structure in parallel region is same as sequential code
- No explicit thread-id based work division; instead system automatically divides loop iterations among threads
- User can control work division: block, cyclic, block-cyclic, etc., via "schedule" clause in pragma

```
float res;
#pragma omp parallel
#pragma omp for
  for (int i = 0; i < MAX; i++)
ł
    B = big_job(i);
```

#pragma omp parallel

If the team consists of only one thread then the worksharing region is not executed in parallel.

#pragma omp for

0

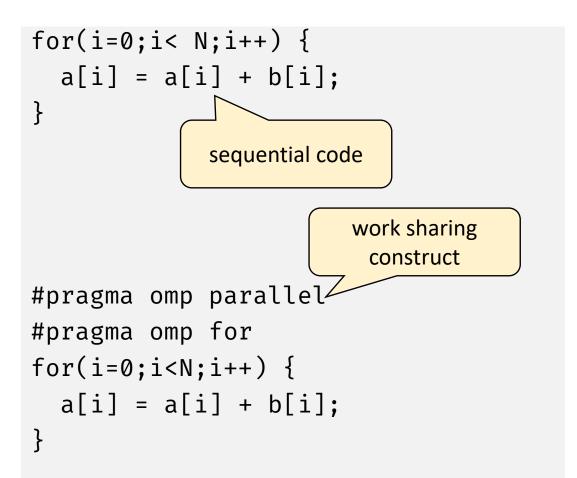
0

data-parallel

execution

Variable i is made "private" to each thread by default. You could also do this explicitly with a "private(i)" clause.

OpenMP parallel region



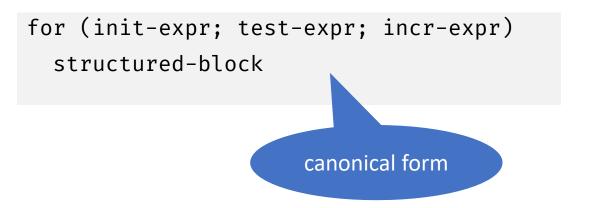
```
#pragma omp parallel
  int id, i, Nthrds, istart, iend;
  id = omp_get_thread_num();
  Nthrds = omp_get_num_threads();
  istart = id * N / Nthrds;
  iend = (id+1) * N / Nthrds;
  if (id == Nthrds-1) iend = N;
  for(i=istart;i<iend;i++) {</pre>
    a[i] = a[i] + b[i];
```

### Combined Worksharing Construct

```
float res;
float res;
                                          #pragma omp parallel for
#pragma omp parallel
                                          for (int i = 0; i < MAX; i++) {</pre>
                                             B = big_job(i);
#pragma omp for
  for (int i = 0; i < MAX; i++) {</pre>
                                          #pragma omp critical
    B = big_job(i);
                                             consume (B, res);
#pragma omp critical
                                           }
    consume (B, res);
}
                          Often a parallel region has a single
                                 work-shared loop
```

### Limitations on the Loop Structure

- Loops need to be in the canonical form
  - Cannot use while or do-while
- Loop variable must have integer or pointer type
- Cannot use a loop where the trip count cannot be determined



# Take Care when Sharing Data with the Worksharing Construct

OpenMP compiler will not check for dependences

```
#pragma omp parallel for
{
   for(i=0; i<n; i++) {
     tmp = 2.0*a[i];
     a[i] = tmp;
     b[i] = c[i]/tmp;</pre>
```

```
#pragma omp parallel for
private(tmp)
{
   for(i=0; i<n; i++) {
     tmp = 2.0*a[i];
     a[i] = tmp;
     b[i] = c[i]/tmp;
   }
</pre>
```

### Our Refined Pi Implementation

```
double omp_pi() {
 double x, pi, sum = 0.0;
  double step = 1.0 / (double)NUM_STEPS;
#pragma omp parallel for private(x) reduction(+ : sum) num_threads(NUM_THRS)
  for (int i = 0; i < NUM_STEPS; i++) {</pre>
    x = (i + 0.5) * step;
    sum += 4.0 / (1.0 + x * x);
  }
  pi = step * sum;
  return pi;
```

### Evaluate the Pi Program Variants

- Sequential computation of pi
- Parallel computation with false sharing
- Parallel computation with padding
- Parallel computation with thread-local sum
- Worksharing construct

|   | Tilix: Default |         |  |  |  |
|---|----------------|---------|--|--|--|
| Default   | ×              | Default |  |  |  |
| 1: swarnendu@cse-BM1AF-BP1AF-BM6AF: ~/iitk-workspace/parallel-computing/src/openmp 🔻  |                |         |  |  |  |
| <pre>warnendu:~/iitk-workspace/parallel-computing/src/openmp\$ ./a.out alue of PI computed sequentially: 3.14159 in 0.0165884 seconds alue of PI computed in parallel (with false sharing): 3.14159 in 0.0119428 seconds alue of PI computed in parallel (without false sharing via padding): 3.14159 in 0.00325493 seconds alue of PI computed in parallel (without false sharing via thread-private variables, sync out of loop): 3.14159 in 0.00326013 seconds alue of PI computed in parallel with task sharing construct: 3.14159 in 0.00325819 seconds alue of PI computed in parallel with task sharing construct: 3.14159 in 0.00325819 seconds</pre> |                |         |  |  |  |

- #pragma omp parallel for schedule [..., <chunksize>]
- The schedule clause determines how loop iterators are mapped onto threads
  - Most implementations use block partitioning
- Good assignment of iterations to threads can have a significant impact on performance

- #pragma omp parallel for schedule(static[,chunk])
  - Fixed-sized chunks (or as equal as possible) assigned (alternating) to num\_threads
  - Typical default is: chunk = iterations/num\_threads
  - Set chunk = 1 for cyclic distribution
- #pragma omp parallel for schedule(dynamic[,chunk] )
  - Run-time scheduling (has overhead)
  - Each thread grabs "chunk" iterations off queue until all iterations have been scheduled, default is 1
  - Good load-balancing for uneven workloads

- schedule(static)
  - OpenMP guarantees that if you have two separate loops with the same number of iterations and execute them with the same number of threads using static scheduling, then each thread will receive exactly the same iteration range(s) in both parallel regions
  - Beneficial for NUMA systems: if you touch some memory in the first loop, it will reside on the NUMA node where the executing thread was. Then in the second loop the same thread could access the same memory location faster since it will reside on the same NUMA node.

https://stackoverflow.com/questions/10850155/whats-the-difference-between-static-and-dynamic-schedule-in-openmp

- #pragma omp parallel for schedule(guided[,chunk])
  - Threads dynamically grab blocks of iterations
  - Chunk size starts relatively large, to get all threads busy with good amortization of overhead
  - Subsequently, chunk size is reduced to "chunk" to produce good workload balance
  - By default, initial size is iterations/num\_threads

### Example of guided Schedule with Two Threads

| Thread | Chunk     | Chunk Size | Remaining Iterations |
|--------|-----------|------------|----------------------|
| 0      | 1-5000    | 5000       | 5000                 |
| 1      | 5001-7500 | 2500       | 2500                 |
| 1      | 7501-8750 | 1250       | 1250                 |
| 1      | 8751-9375 | 625        | 625                  |
| 0      | 9376-9688 | 313        | 312                  |
| 1      | 9689-9844 | 156        | 156                  |
| 0      | 9845-9922 | 78         | 78                   |
| 1      | 9923-9961 | 39         | 39                   |
| 0      | 9962-9981 | 20         | 19                   |
| 1      | 9982-9991 | 10         | 9                    |
| 0      | 9992-9996 | 5          | 4                    |
| 0      | 9997-9998 | 2          | 2                    |
| 0      | 9999      | 1          | 1                    |
| 1      | 10000     | 1          | 0                    |

- #pragma omp parallel for schedule(runtime)
  - Decision deferred till run-time
  - Schedule and chunk size taken from OMP\_SCHEDULE environment variable or from runtime library routines
    - \$ export OMP\_SCHEDULE="static,1"
- #pragma omp parallel for schedule(auto)
  - Schedule is left to the compiler runtime to choose (need not be any of the above)
  - Any possible mapping of iterations to threads in the team can be chosen

### Understanding the **schedule** clause

| Schedule clause | When to use?   |
|-----------------|--|
| static          | Predetermined and predictable by the programmer; low overhead at run-time, scheduling is done at compile-time        |
| dynamic         | Unpredictable, highly variable work per iteration;<br>greater overhead at run-time, more complex<br>scheduling logic |
| guided          | Special case of dynamic to reduce scheduling overhead  |
| auto            | When the runtime can learn from previous executions of the same loop   |

### Nested Loops

• For perfectly nested rectangular loops we can parallelize multiple loops in the nest with the collapse clause

```
#pragma omp parallel for collapse(2)
for (int i = 0; i < N; i++) {
   for (int j = 0; j < M; j++) {
      j is implicitly private with
      the collapse clause
   }
}</pre>
```

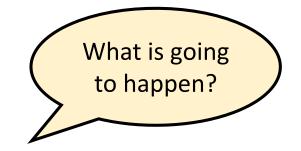
- Will form a single loop of length NxM and then parallelize that
- Useful when there are more than N threads

### Nested Loops

• collapse works with square loops, not with triangular loops

int i, j; #pragma omp parallel for num\_threads(2) collapse(2) private(j) for (i = 0; i < 4; i++) for (j = 0; j <= i; j++) cout << i << j << omp\_get\_thread\_num()) << "\n"; Does not compile with GCC 7.4

### Data Sharing with Worksharing



```
#include <omp.h>
int main() {
  int i, j=5;
  double x=1.0, y=42.0;
#pragma omp parallel for default(none)
reduction(*:x)
  for (i=0;i<N;i++) {</pre>
    for (j=0;j<3;j++)
      x += foobar(i, j, y);
  }
  printf(" x is %f\n",(float)x);
```

```
#include <omp.h>
```

```
int main() {
    int i, j=5;
    double x=1.0, y=42.0;
#pragma omp parallel for
default(none) reduction(*:x)
shared(y) collapse(2)
    for (i=0;i<N;i++) {
        for (j=0;j<3;j++)
            x += foobar(i, j, y);
    }
    printf(" x is %f\n",(float)x);
}</pre>
```

### **OpenMP** Sections

- Noniterative worksharing construct
- Worksharing for function-level parallelism; complementary to "omp for" loops
- The sections construct gives a different structured block to each thread

```
#pragma omp parallel
  •••
#pragma omp sections
  ł
#pragma omp section
    x_calculation();
#pragma omp section
    y_calculation();
#pragma omp section
    z_calculation();
  } // implicit barrier
```

## Explicit Tasks

### Explicit Task Constructs in OpenMP

- OpenMP can only parallelize loops in a basic standard form with loop counts known at runtime
- Not all programs have canonical loops

• Consider a program to traverse a linked list

```
p=head;
while (p) {
  dowork(p);
  p = p->next;°
}
How can we modify the
  program to parallelize
  with OpenMP?
```

### One Potential Solution to Using OpenMP

```
while (p != NULL) {
    p = p->next;
    count++;
```

```
2
```

```
p = head;
for (i=0; i<count; i++) {
    parr[i] = p;
    p = p->next;
}
```

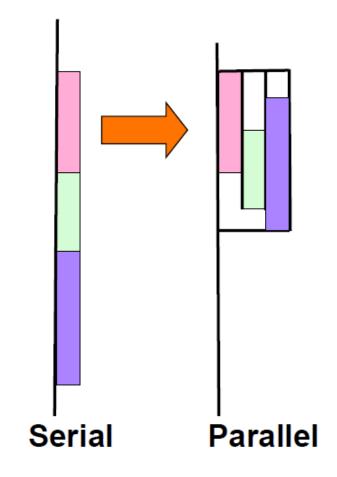
```
#pragma omp parallel
```

```
#pragma omp for schedule (static,1)
for(i=0; i<count; i++)
  dowork(parr[i]);</pre>
```

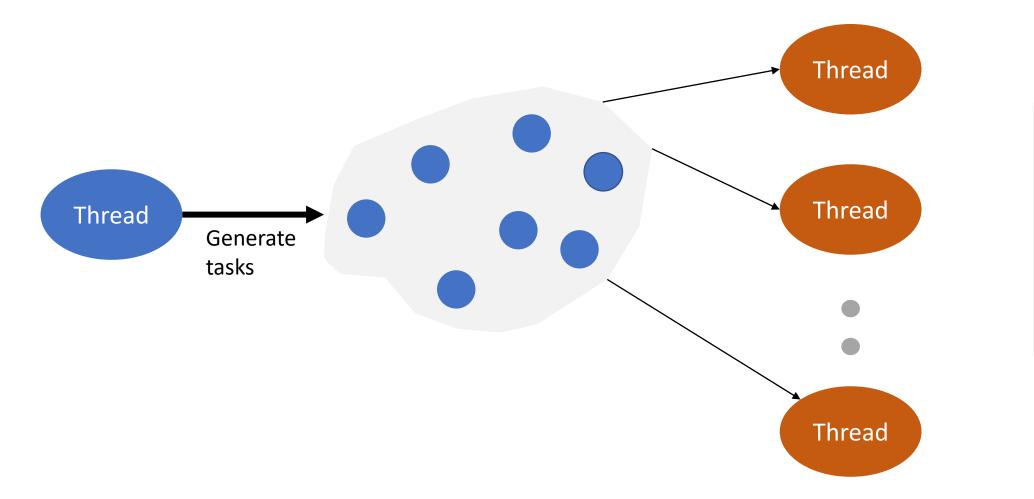
This works, but is inelegant (had to use a vector or array as an intermediate) and is inefficient (requires multiple passes over the data)

### Tasks in OpenMP

- Explicit tasks were introduced in OpenMP 3.0
- Tasks are independent units of work and are composed of
  - code to execute
  - data to compute with
  - control variables
- Threads are assigned to perform the work of each task
- The runtime system decides when tasks are executed
  - Tasks may be deferred or may be executed immediately



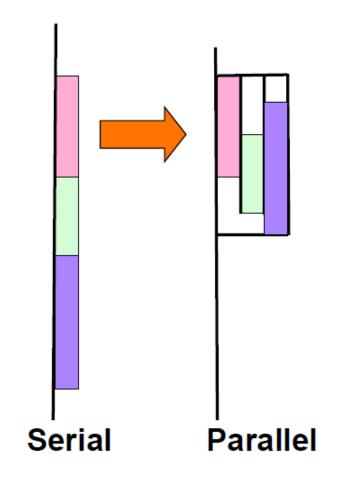
The Tasking Concept in OpenMP



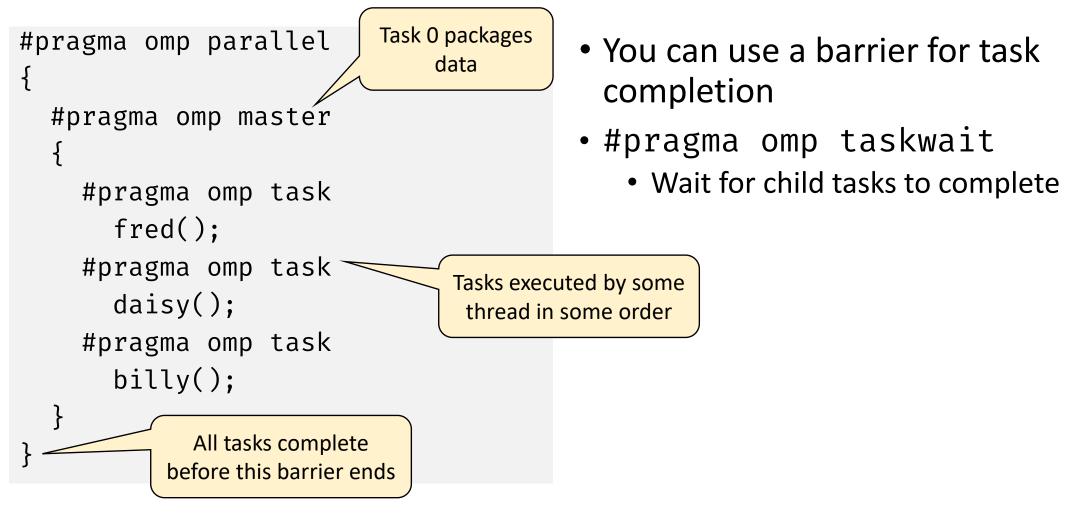
Execute tasks

# Tasks in OpenMP

- The task construct includes a structured block of code
- Inside a parallel region, a thread encountering a task construct will package up the code block and its data for execution
- Tasks can be nested, i.e., a task may itself generate tasks



# Task Directive



# Example of Tasks

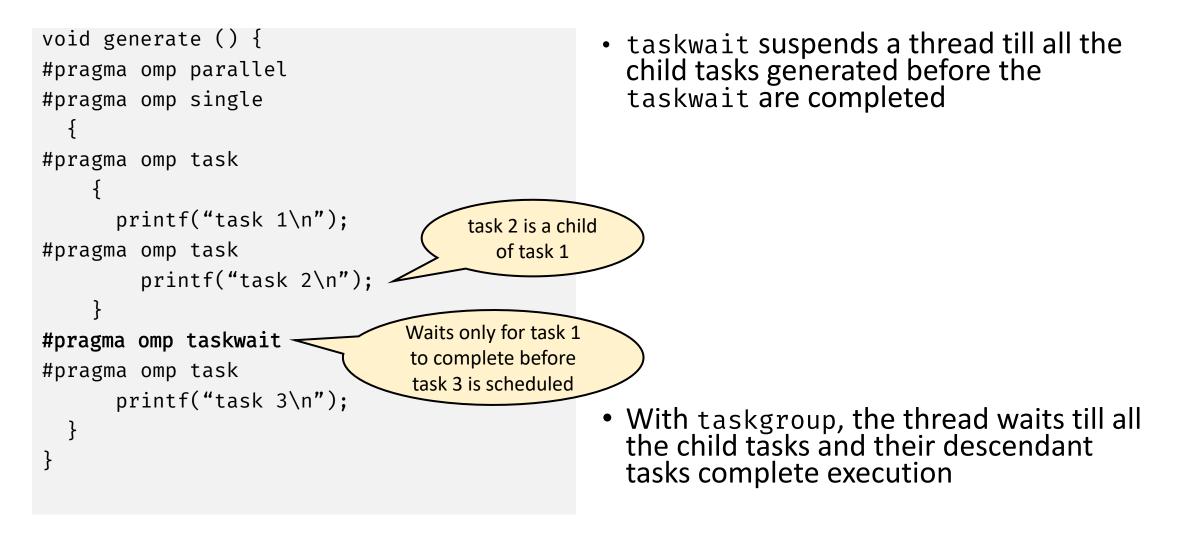
```
#pragma omp parallel
#pragma omp single
  ł
    cout << "A ";</pre>
#pragma omp task
    cout << "race ";</pre>
#pragma omp task
    cout << "car ";</pre>
    cout << "is fun to watch!";</pre>
```

```
#pragma omp parallel
#pragma omp single
  ł
    cout << "A ";</pre>
#pragma omp task
    cout << "race ";</pre>
#pragma omp task
    cout << "car ";</pre>
#pragma omp taskwait
    cout << "is fun to watch!";</pre>
```

## Example with Tasks

```
void walk(node *p) {
                                          int main() {
                         Tasks are executed
  if (p->left) {
                                             node *p = head;
                           in any order
#pragma omp task ...
                                          #pragma omp parallel
    walk(p->left);
                                            walk(p);
  }
  if (p->right) {
#pragma omp task
    walk(p->right);
                                 Be careful about
                                  dependences
#pragma omp taskwait
  sum_weight(p);
```

# taskwait and taskgroup



# taskwait and taskgroup

```
#pragma omp parallel
#pragma omp single
#pragma omp taskgroup
#pragma omp task
      printf("task 1\n");
#pragma omp task
         printf("task 2\n");
                                Waits for both
                                 tasks 1 and 2
  } // end of taskgroup<sup><</sup>
#pragma omp task
      printf("task 3\n");
```

 taskwait suspends a thread till all the child tasks generated before the taskwait are completed

• With taskgroup, the thread waits till all the child tasks and their descendant tasks complete execution

# Generating Large Number of Tasks

```
void generate () {
  const int num_elem=1e7;
  int arr[num_elem];
#pragma omp parallel
#pragma omp single
       for(int i=0;i<num_elem;i++) {</pre>
#pragma omp task
         check(arr[i])
                       The untied clause will allow any thread to
                       resume the task generating loop
```

- If the number of tasks reaches a limit, the task generator thread can be stopped from creating further tasks and starts executing unassigned tasks
- If the generator thread takes a long time to finish executing unassigned tasks, the other threads will idle till the generator thread is done
  - The tasks are "tied" to the generator thread
- The generator thread can start generating new tasks once the number of unassigned tasks becomes low

Swarnendu Biswas

# SIMD Programming

**Fine-grained Parallelism** 

# SPMD Programming with OpenMP

- Single Program Multiple Data
  - Each thread runs the same program
  - Selection of data, or branching conditions, is based on thread id
- In OpenMP implementations
  - 1. Perform work division in parallel loops
  - 2. Query thread\_id and num\_threads
  - 3. Partition work among threads

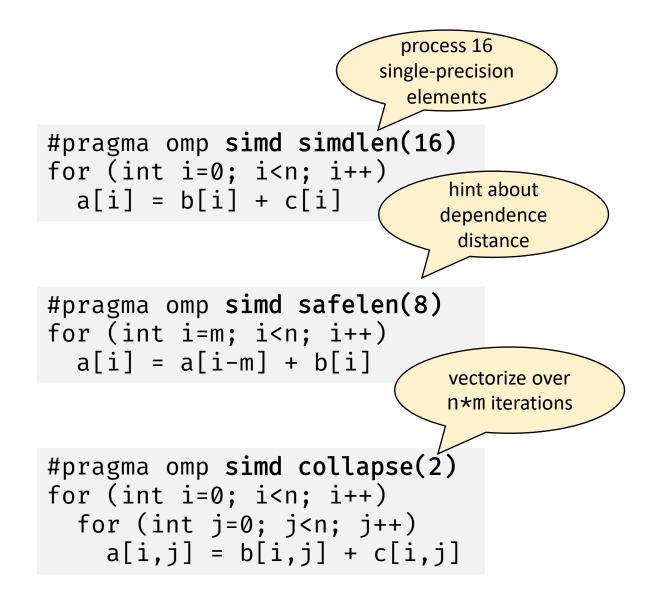
# How about SIMD support?

- Support in older versions of OpenMP required vendor-specific extensions
  - Programming models (e.g., Intel Cilk Plus)
  - Compiler pragmas (e.g., #pragma vector)
  - Low-level constructs or intrinsics (e.g., \_mm\_add\_pd())

```
#pragma omp parallel for
#pragma vector always
#pragma ivdep
for (int i = 0; i < N; i++) {
   a[i] = b[i] + 10;
}</pre>
```

### simd Construct

- #pragma omp simd ...
  - Can be applied to a loop to indicate that the loop can be transformed to a SIMD loop
  - Partition loop into chunks that fit a SIMD vector register
  - Does not parallelize the loop body



# simd Worksharing Construct

- #pragma omp for simd ...
- Parallelize and vectorize a loop nest
  - Distribute a loop's iteration space across a thread team
  - Subdivide loop chunks to fit a SIMD vector register

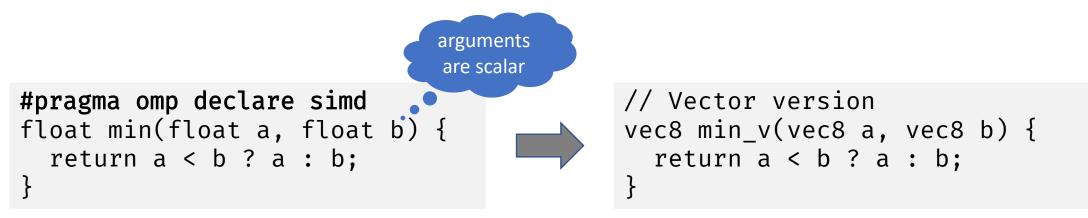
```
#pragma omp simd for collapse(2)
for (int i=0; i<n; i++)
   for (int j=0; j<n; j++)
        a[i,j] = b[i,j] + c[i,j]</pre>
```

https://chryswoods.com/vector\_c++/features.html

#### SIMD Function Vectorization

#pragma omp declare simd ...
function-definition-or-declaration

- Declare one or more functions to be compiled for calls from a SIMD-parallel loop
- Enables creation of one or more versions to allow for SIMD processing



### declare simd Construct

```
#pragma omp simd private(temp) reduction(+:sum)
for (i=0; i<n; i++) {
   sum += add_values(a[i], b[i]);
}
#pragma omp declare simd
int add_values(int a, int b) {
   return a+b;
}
</pre>

   #pragma omp simd alone may not be sufficient
   to vectorize the call to add_values()
Compiler can inline function add_values() and
   vectorize it across the loop over n
```

#### References

- Tim Mattson et al. <u>The OpenMP Common Core: A hands on exploration</u>, SC 2018.
- Tim Mattson and Larry Meadows. <u>A "Hands-on" Introduction to OpenMP</u>. SC 2008.
- Ruud van der Pas. <u>OpenMP Tasking Explained</u>. SC 2013.
- Peter Pacheco. An Introduction to Parallel Programming.
- Blaise Barney. OpenMP. <u>https://hpc-tutorials.llnl.gov/openmp/</u>
- Nitya Hariharan. <u>CS 610: Advanced OpenMP</u>. IIT Kanpur.