

The OpenMP* Common Core: A hands on exploration

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The first version and the majority of the "Common Core" slides were developed by Tim Mattson, Intel Corp. Many others have contributed.

About The Presenters

- Yun (Helen) He works at LBL/NERSC in the User Engagement Group. She is a Berkeley Lab representative on the OpenMP standards committee.
- Barbara Chapman is a Professor at Stony Brook University. She has been involved with OpenMP since 2000. She is the lead author of the "Using OpenMP" book and the founder of the cOMPunity.
- Oscar Hernandez works at ORNL with DOE application developers to help them write scalable OpenMP code. He is an ORNL representative on the OpenMP standards committee.

Active Learning

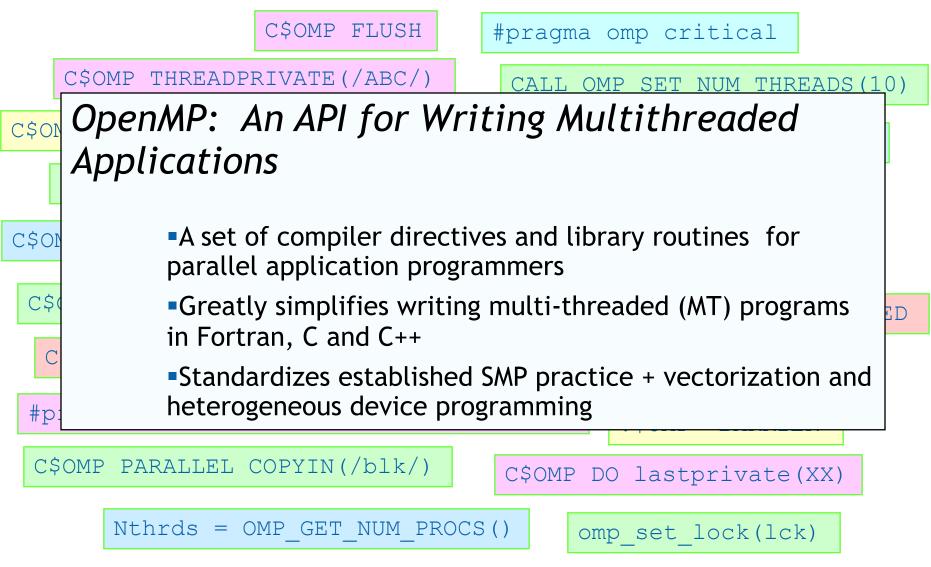
- Our plan is
 - Mix short lectures with short exercises.
 - You will use your laptop to connect to a multiprocessor server.
- Please follow these simple rules
 - Do the exercises that we assign and then change things around and experiment.
 - Embrace active learning!
 - -<u>Don't cheat</u>: Do Not look at the solutions before you complete an exercise ... even if you get really frustrated.
 - Progress depends on how quick the exercises are completed

Outline

Introduction and Why Common Core

- OpenMP Basics
- Creating Threads
- Synchronization
- Parallel Loops
- Data environment
- Memory model
- Irregular Parallelism and tasks
- Recap

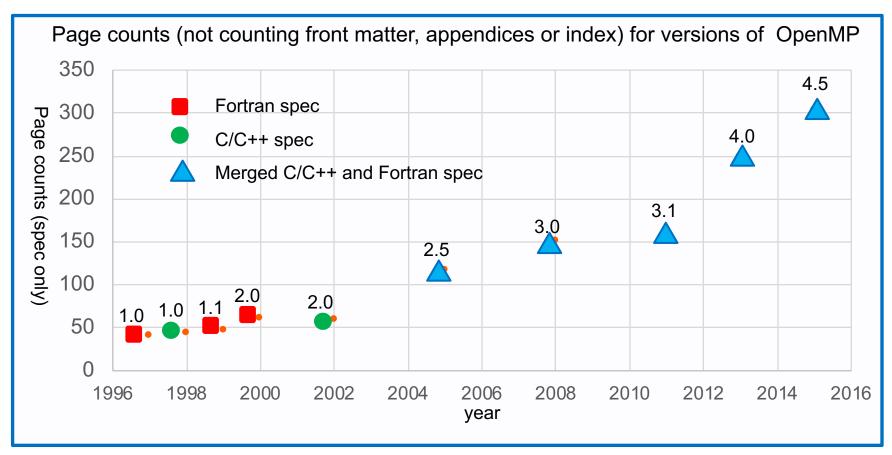
OpenMP^{*} **overview**:



* The name "OpenMP" is the property of the OpenMP Architecture Review Board.

The growth of complexity in OpenMP

- OpenMP started out in 1997 as a simple interface for the application programmers more versed in their area of science than computer science.
- The complexity has grown considerably over the years!



The complexity of the full spec is overwhelming, so we focus on the 19 items most OpenMP programmers restrict themselves to ... the so called "OpenMP Common Core"

A Great Video about OpenMP History and SC18 Tutorials

- The video was downloaded and shown offline at the tutorial
- Here is the YouTube link
 - https://www.youtube.com/watch?v=sncF6s7xym4

The OpenMP Common Core: Most OpenMP programs only use these 19 items

OpenMP pragma, function, or clause	Concepts
#pragma omp parallel	Parallel region, teams of threads, structured block, interleaved execution across threads
int omp_get_thread_num() int omp_get_num_threads()	Create threads with a parallel region and split up the work using the number of threads and thread ID
double omp_get_wtime()	Speedup and Amdahl's law. False Sharing and other performance issues
setenv OMP_NUM_THREADS N	Internal control variables. Setting the default number of threads with an environment variable
#pragma omp barrier #pragma omp critical	Synchronization and race conditions. Revisit interleaved execution.
#pragma omp for #pragma omp parallel for	Worksharing, parallel loops, loop carried dependencies
reduction(op:list)	Reductions of values across a team of threads
schedule(dynamic [,chunk]) schedule (static [,chunk])	Loop schedules, loop overheads and load balance
private(list), firstprivate(list), shared(list)	Data environment
nowait	Disabling implied barriers on workshare constructs, the high cost of barriers. The flush concept (but not the concept)
#pragma omp single	Workshare with a single thread
#pragma omp task #pragma omp taskwait	Tasks including the data environment for tasks.

Resources

http://www.openmp.org

- We can only give an overview of the basics today
 - We won't cover all features
- Lots of information available at ARB's website
 - Specifications, technical reports, **summary cards** for downloading
 - Compilers and Tools
 - Examples; Tutorials and publications; links to other tutorials
- Tutorials also at:
 - Supercomputing conferences
 - OpenMPCon, IWOMP workshop
 - Some user sites, e.g. NERSC



Cori - Cray XC40



- We will use the Cori system at NERSC for hands on exercises
- 9,688 Intel Knights Landing compute nodes
 - 68 cores per node, 4 hardware threads per core
 - Larger vector units (512 bits) with more complex instructions
 - 96 GB DRAM, 16 GB on-package MCDRAM
- 2,388 Intel Xeon Haswell compute nodes: 32 cores/node
- Cori KNL nodes are integrated with Haswell nodes on Aries network as one system
- Choices of Intel, Cray, and GNU compilers

Compile and Run on Cori

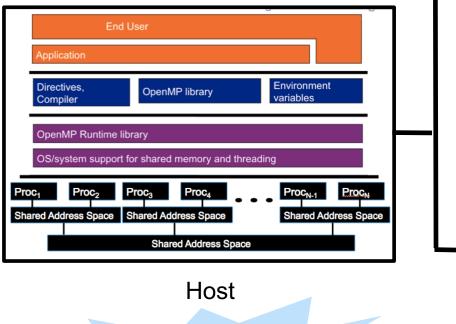
- Obtain Exercises:
 - % cd \$SCRATCH # or another local directory
 - % cp -r /project/projectdirs/training/IWOMP2018 .
 - % cd omp-core # there is a README file there
 - % cd C (or % cd Fortran)
 - % make
- The default compiler is Intel. Use compiler wrappers (ftn, cc, and CC) and the OpenMP compiler flag to build, such as:
 - % cc -qopenmp mycode.c
- To use another compiler, such as gcc:
 - % module swap PrgEnv-intel PrgEnv-gnu
 - % cc -fopenmp mycode.c
- To run on a compute node, use an interactive batch session:
 - Haswell node: % salloc -N 1 -C haswell -q interactive -t 1:00:00
 - KNL node: % salloc -N 1 -C knl -q interactive -t 1:00:00
 - Pure OpenMP code: % ./a.out
 - You will need to set OMP_NUM_THREADS and other OpenMP environment variables when necessary

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Where Does OpenMP Run?

Supported (since OpenMP 4.0) with target, teams, distribute, and other constructs



OpenMP 4.5

Соге Соге Соге Соге PCle Client L2 L2 L2 L2 Logic TD TD TD TD GDDR MC GDDR MC GDDR MC GDDR MC ΔT ΔT 1D **D** ٢S ٢S ۲S ٢S Core Core Core Core Target Device: Intel[®] Xeon Phi[™] coprocessor DRAMI DRAMIJ DRAMI/F

Target Device: GPU

How Does OpenMP Work?

- Teams of OpenMP threads are created to perform the computation in a code
 - Work is divided among the threads, which run on the different cores
 - The threads collaborate by sharing variables
 - Threads **synchronize** to order accesses and prevent data corruption
 - Structured programming is encouraged to reduce likelihood of bugs
- Most Fortran/C/C++ compilers implement OpenMP
 - Use compiler "flag", sometimes a specific **optimization level**
- Alternatives:
 - MPI
 - POSIX thread library is lower level
 - Automatic parallelization is higher level (user does nothing)
 - But usually successful on simple codes only

Programming in Pthreads vs. OpenMP

```
#include <pthread.h>
#define DEFAULT NUM THREADS 4
/* encapsulate multiple args to a thread */
typedef struct args {
   int id;
                /* this thread's number */
} args_t;
/* function that is run inside each thread */
void *do_hello_world(void *arg)
{
   args_t *ap = (args_t *) arg; /* unpack incoming args */
   printf("Hello from thread %d\n", ap->id);
                                            /* ACTUAL WORK */
   return NULL;
                                                                            int main(int argc, char *argv[]) {
}
                                                                               #pragma omp parallel
int main(int argc, char *argv[])
{
   int i, num threads = DEFAULT_NUM_THREADS;
   pthread t *thread pool;
                                                                                  int ID = omp get thread num();
   args_t *thread_args;
                                                                                 printf("hello from thread %d\n", ID);
   if (argc > 1) {
       num_threads = atoi(argv[1]);
       if (num_threads < 0) {</pre>
                                                                               return 0;
           num threads = DEFAULT NUM THREADS;
                                                                            }
   thread pool = (pthread t *) malloc(num threads *
                                     sizeof(*thread pool));
                              malloc(num_threads *
   thread_args = (args_t *)
                                    sizeof(*thread_args));
   /* create and run threads: pass id of thread to each */
   for (i = 0; i < num_threads; i += 1) {</pre>
       thread_args[i].id = i;
       pthread create(&thread pool[i], NULL, do hello world,
                     (void *) &thread_args[i]);
   }
   /* wait for all threads to finish */
   for (i = 0; i < num_threads; i += 1) {
       pthread join(thread pool[i], NULL);
   free(thread_args);
   free(thread_pool);
```

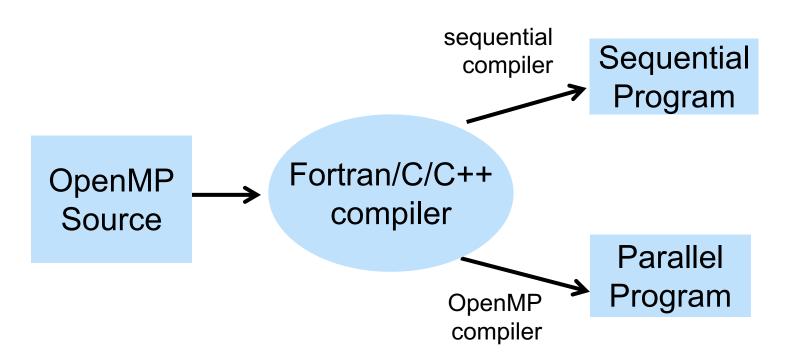
return 0;

What Does the User Have to Do?

- Starting point is most often MPI or sequential program code
- Application developer must decide how the work can be divided up among multiple threads
 - Identify parallelism and needed synchronization
 - Getting this right is the **user's responsibility**!
 - Insert OpenMP constructs that represent the strategy
- Getting good performance requires an understanding of implications of chosen strategy
 - Translation introduces overheads
 - Data access pattern might affect performance
- Sometimes, non-trivial rewriting of code is needed to accomplish desired results

User makes strategic decisions; compiler figures out details

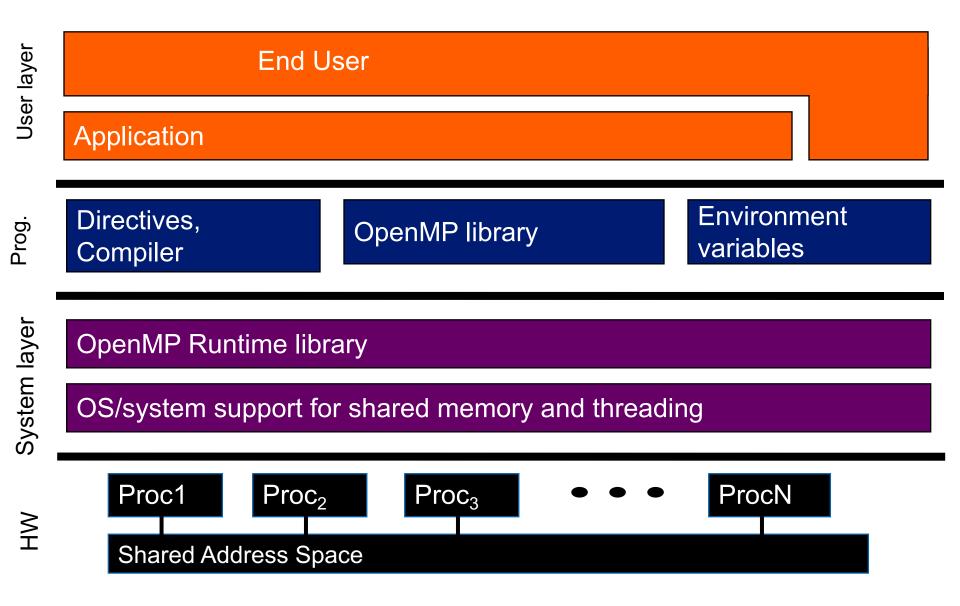
OpenMP Usage



Needs special flag to enable OpenMP, such as:

- Intel compiler: -qopenmp
- GNU compiler: -fopenmp
- PGI compiler: -mp
- Cray compiler: none

OpenMP basic definitions: Basic Solution stack



OpenMP basic syntax, C/C++

- Most of the constructs in OpenMP are compiler directives.
 #pragma omp construct [clause [clause]...]
 - Example

#pragma omp parallel private(x)

 Function prototypes and types in the file: #include <omp.h>

- Most OpenMP* constructs apply to a "structured block".
 - Structured block: a block of one or more statements with one point of entry at the top and one point of exit at the bottom.
 - It's OK to have an exit() within the structured block.

OpenMP Fortran:

Some syntax details for Fortran programmers

- Most of the constructs in OpenMP are compiler directives.
 - For Fortran, the directives take one of the forms: C\$OMP construct [clause [clause]...]
 \$OMP construct [clause [clause]...]
 *\$OMP construct [clause [clause]...]
- The OpenMP include file and lib module

use omp_lib Include omp.h

OpenMP Fortran: Structured Block Boundaries

• In Fortran: a block is a single statement or a group of statements between directive/end-directive pairs.

```
C$OMP PARALLEL
```

10 wrk(id) = garbage(id) res(id) = wrk(id)**2 if(conv(res(id)) goto 10 C\$OMP END PARALLEL C\$OMP PARALLEL DO do I=1,N res(I)=bigComp(I) end do C\$OMP END PARALLEL DO

- The "construct/end construct" pairs is done anywhere a structured block appears in Fortran. Some examples:
 - DO ... END DO
 - PARALLEL ... END PARREL
 - CRICITAL ... END CRITICAL
 - SECTION ... END SECTION

- SECTIONS ... END SECTIONS
- SINGLE ... END SINGLE
- MASTER ... END MASTER

Exercise, Part A: Hello world Verify that your environment works

• Write a program that prints "hello world".

```
#include<stdio.h>
int main()
{
    printf(" hello ");
    printf(" world \n");
}
```

Exercise, Part B: Hello world Verify that your OpenMP environment works

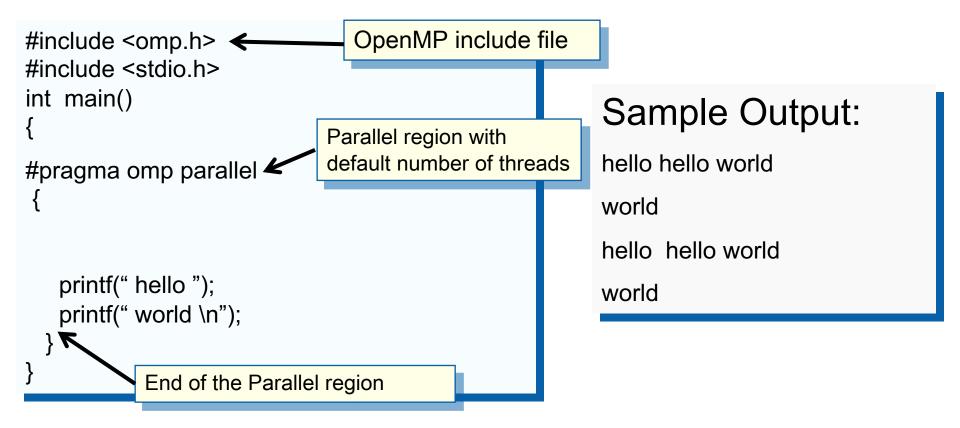
• Write a multithreaded program that prints "hello world".

```
Switches for compiling and linking
#include <omp.h>
#include <stdio.h>
                                               Gnu (Linux, OSX)
                          gcc -fopenmp
int main()
                                               PGI (Linux)
                          pgcc -mp pgi
 #pragma omp parallel
                          icl /Qopenmp
                                               Intel (windows)
 {
                                               Intel (Linux, OSX)
                          icc -qopenmp
   printf(" hello ");
   printf(" world \n");
```

Solution

A multi-threaded "Hello world" program

• Write a multithreaded program where each thread prints "hello world".



The statements are interleaved based on how the operating schedules the threads

Outline

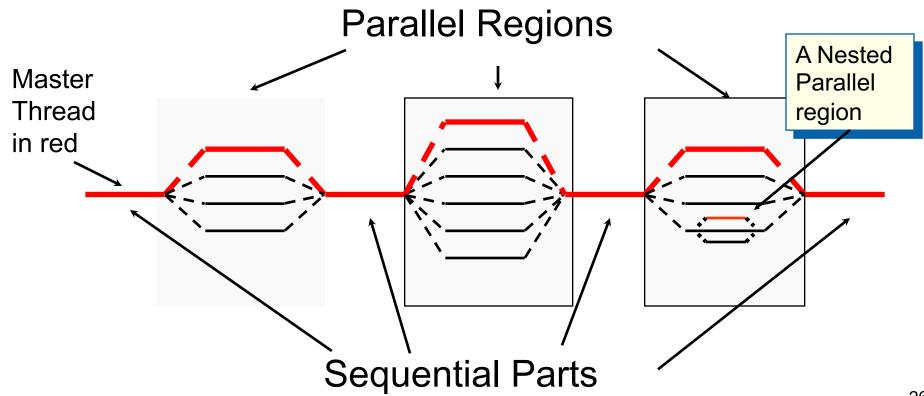
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OpenMP programming model:

Fork-Join Parallelism:

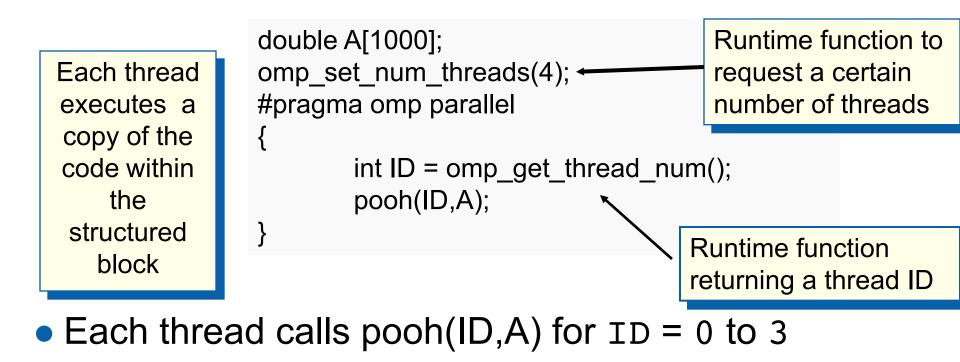
Master thread spawns a team of threads as needed.

 Parallelism added incrementally until performance goals are met, i.e., the sequential program evolves into a parallel program.

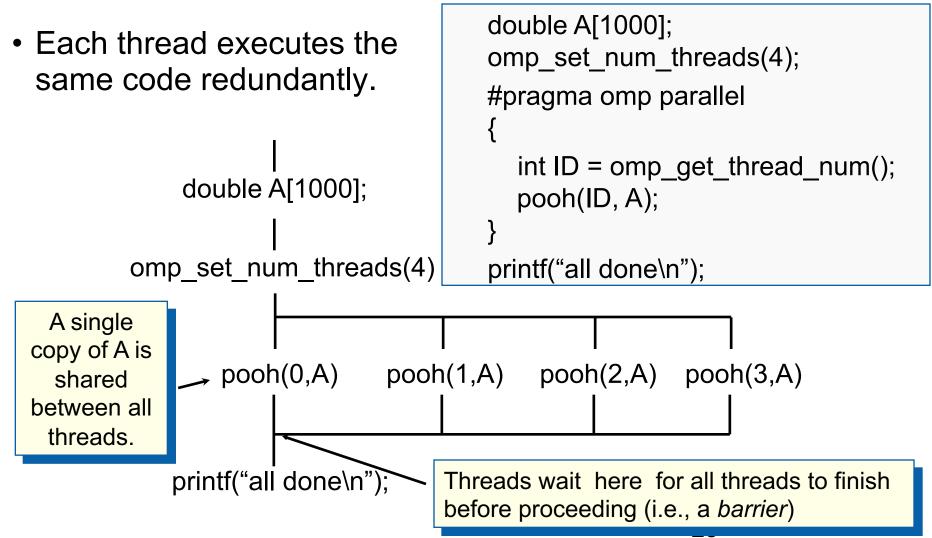


Thread creation: Parallel regions

- You create threads in OpenMP* with the parallel construct.
- For example, To create a 4 thread Parallel region:

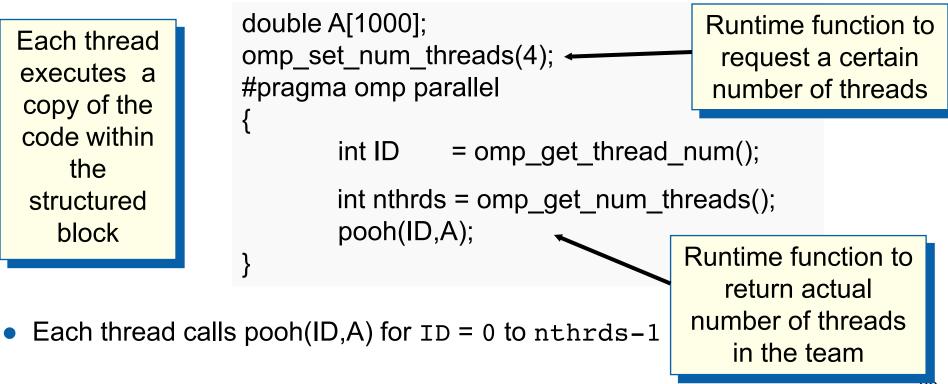


Thread creation: Parallel regions example



Thread creation: How many threads did you actually get?

- You create a team threads in OpenMP* with the parallel construct.
- You can request a number of threads with omp_set_num_threads()
- But is the number of threads requested the number you actually get?
 - NO! An implementation can silently decide to give you a team with fewer threads.
 - Once a team of threads is established ... the system will not reduce the size of the team.



Internal control variables & the number of threads

- There are a few ways to control the number of threads.
 omp_set_num_threads(4)
- What does omp_set_num_threads() actually do?
 - It <u>resets</u> an "<u>internal control variable</u>" the system queries to select the default number of threads to request on subsequent parallel constructs.
- Is there an easier way to change this internal control variable ... perhaps one that doesn't require re-compilation? Yes.
 - When an OpenMP program starts up, it queries an environment variable OMP_NUM_THREADS and sets the appropriate <u>internal control variable</u> to the value of OMP_NUM_THREADS
- For example, to set the initial, default number of threads to request in OpenMP on Linux in bash shell

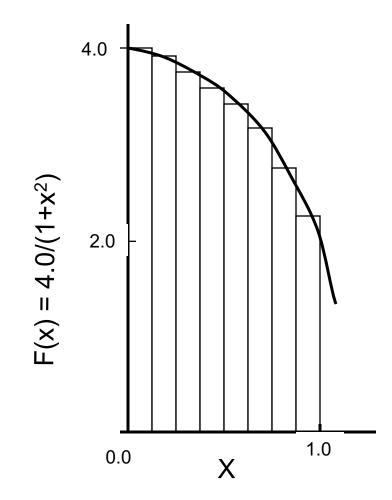
> export OMP_NUM_THREADS=12

Performance Tips

- Experiment to find the best number of threads on your system
- Put as much code as possible inside parallel regions
 - Amdahl's law: If 1/s of the program is sequential, then you cannot ever get a speedup better than s
 - So if 1% of a program is serial, speedup is limited to 100, no matter how many processors it is computed on
- Have large parallel regions
 - Minimize overheads: starting and stopping threads, executing barriers, moving data into cache
 - Directives can be "orphaned"; procedure calls inside regions are fine
- Run-time routines are your friend
 - Usually very efficient and allow maximum control over thread behavior
- Barriers are expensive
 - With large numbers of threads, they can be slow
 - Depends in part on HW and on implementation quality
 - Some threads might have to wait a long time if load not balanced

An interesting problem to play with Numerical integration

Mathematically, we know that:



$$\int_{0}^{1} \frac{4.0}{(1+x^2)} \, dx = \pi$$

We can approximate the integral as a sum of rectangles:

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

Where each rectangle has width Δx and height $F(x_i)$ at the middle of interval i.

Serial PI program

```
static long num steps = 100000;
double step;
int main ()
         int i; double x, pi, sum = 0.0;
{
         step = 1.0/(double) num_steps;
         for (i=0;i< num steps; i++){</pre>
                  x = (i+0.5)^*step;
                  sum = sum + 4.0/(1.0+x^*x);
         pi = step * sum;
```

Serial PI program

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

```
static long num_steps = 100000;
double step;
int main ()
{      int i;      double x, pi, sum = 0.0, tdata;
      step = 1.0/(double) num_steps;
```

```
double tdata = omp_get_wtime();
for (i=0;i< num_steps; i++){
        x = (i+0.5)*step;
        sum = sum + 4.0/(1.0+x*x);
}
pi = step * sum;
```

The library routine get_omp_wtime() is used to find the elapsed "wall time" for blocks of code

```
tdata = omp_get_wtime() - tdata;
printf(" pi = %f in %f secs\n",pi, tdata);
```

Exercise: the parallel Pi program

• Create a parallel version of the pi program using a parallel construct:

#pragma omp parallel.

- Pay close attention to shared versus private variables.
- In addition to a parallel construct, you will need the runtime library routines
 - int omp_get_num_threads();
 - int omp_get_thread_num();----- Thread ID or rank
 - double omp_get_wtime();
 - omp_set_num_threads();

Request a number of threads in the team

Time in Seconds since a fixed point in the past

Hints: the Parallel Pi program

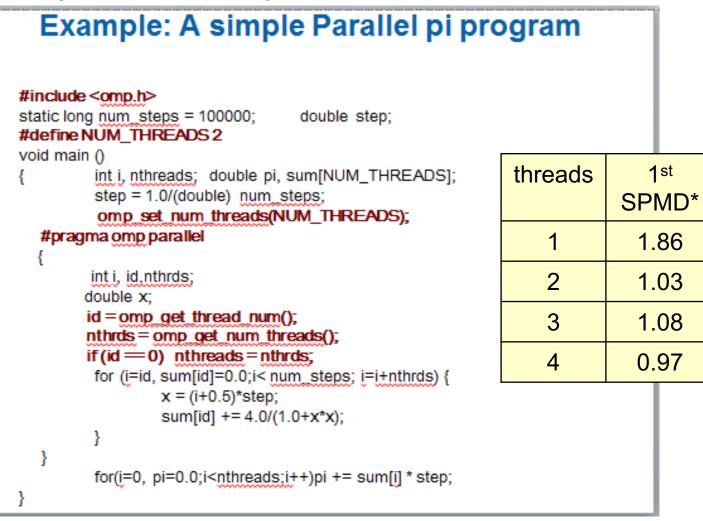
• Use a parallel construct:

#pragma omp parallel

- The challenge is to:
 - divide loop iterations between threads (use the thread ID and the number of threads).
 - Create an accumulator for each thread to hold partial sums that you can later combine to generate the global sum.
- In addition to a parallel construct, you will need the runtime library routines
 - int omp_set_num_threads();
 - int omp_get_num_threads();
 - int omp_get_thread_num();
 - double omp_get_wtime();

Results*

• Original Serial pi program with 100000000 steps ran in 1.83 seconds.

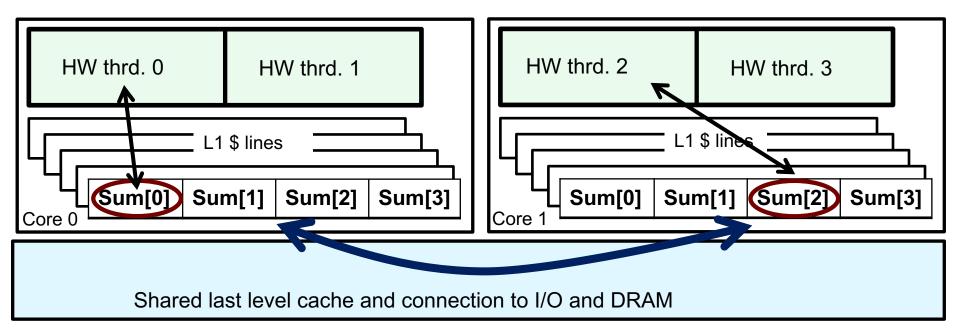


*SPMD: Single Program Multiple Data

*Intel compiler (icpc) with no optimization on Apple OS X 10.7.3 with a dual core (four HW thread) Intel® Core[™] i5 processor at 1.7 Ghz and 4 Gbyte DDR3 memory at 1.333 Ghz.

Why such poor scaling? False sharing

 If independent data elements happen to sit on the same cache line, each update will cause the cache lines to "slosh back and forth" between threads ... This is called "false sharing".



- If you promote scalars to an array to support creation of an SPMD program, the array elements are contiguous in memory and hence share cache lines ... Results in poor scalability.
- Solution: Pad arrays so elements you use are on distinct cache lines.

```
Example: Eliminate false sharing by padding the sum array
#include <omp.h>
static long num_steps = 100000; double step;
#define PAD 8 // assume 64 byte L1 cache line size
#define NUM_THREADS 2
void main ()
         int i, nthreads; double pi, sum[NUM_THREADS][PAD];
         step = 1.0/(double) num_steps;
         omp_set_num_threads(NUM_THREADS);
  #pragma omp parallel
                                                     Pad the array so
        int i, id, nthrds;
  ł
                                                    each sum value is
        double x;
                                                       in a different
        id = omp_get_thread_num();
                                                        cache line
        nthrds = omp_get_num_threads();
        if (id == 0) nthreads = nthrds;
         for (i=id, sum[id]=0.0;i< num_steps; i=i+nthrds) {
                x = (i+0.5)^*step;
                sum[id][0] += 4.0/(1.0+x^*x);
         }
         for(i=0, pi=0.0;i<nthreads;i++)pi += sum[i][0] * step;</pre>
```

Results*: pi program padded accumulator

• Original Serial pi program with 100000000 steps ran in 1.83 seconds.

```
Example: eliminate False sharing by padding the sum array
#include <omp.h>
static long num_steps = 100000;
                                 double step;
#define PAD 8
                        // assume 64 byte L1 cache line size
#define NUM THREADS 2
void main ()
         int i, nthreads; double pi, sum[NUM_THREADS][PAD];
                                                                threads
                                                                                1st
                                                                                             1st
         step = 1.0/(double) num_steps;
                                                                             SPMD
                                                                                          SPMD
         omp set num threads(NUM THREADS);
                                                                                          padded
  #pragma omp parallel
                                                                               1.86
                                                                                            1.86
                                                                    1
        int i, id.nthrds;
       double x:
                                                                    2
                                                                               1.03
                                                                                            1.01
        id = omp_get_thread_num();
       nthrds = omp_get_num_threads();
                                                                    3
                                                                               1.08
                                                                                            0.69
       if (id == 0) nthreads = nthrds;
         for (i=id, sum[id]=0.0;i< num_steps; i=i+nthrds) {
                                                                              0.97
                                                                                            0.53
                                                                    4
                 x = (i+0.5)*step;
                 sum[id][0] += 4.0/(1.0+x*x);
         for(i=0, pi=0.0;i<nthreads;i++)pi += sum[i][0] * step;
```

*Intel compiler (icpc) with no optimization on Apple OS X 10.7.3 with a dual core (four HW thread) Intel® Core[™] i5 processor at 1.7 Ghz and 4 Gbyte DDR3 memory at 1.333 Ghz.

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Synchronization

- High level synchronization included in the common core (the full OpenMP specification has MANY more):
 - -critical
 - -barrier

Synchronization is used to impose order constraints and to protect access to shared data

Synchronization: critical

• Mutual exclusion: Only one thread at a time can enter a critical region.

float res;

#pragma omp parallel

{ float B; int i, id, nthrds;

id = omp_get_thread_num();

nthrds = omp_get_num_threads();

for(i=id;i<niters;i+=nthrds){</pre>

 $B = big_job(i);$

#pragma omp critical res += consume (B);

Threads wait their turn – only one at a time calls consume()

Synchronization: barrier

- Barrier: a point in a program all threads much reach before any threads are allowed to proceed.
- It is a "stand alone" pragma meaning it is not associated with user code ... it is an executable statement.

	double Arr[8], Brr[8]; int numthrds;
	omp_set_num_threads(8)
	#pragma omp parallel
	{ int id, nthrds;
	id = omp_get_thread_num();
	nthrds = omp_get_num_threads();
	if (id==0) numthrds = nthrds;
	Arr[id] = big_ugly_calc(id, nthrds);
-	#pragma omp barrier
	<pre>Brr[id] = really_big_and_ugly(id, nthrds, Arr); }</pre>

Threads wait until all threads hit the barrier. Then they can go on.

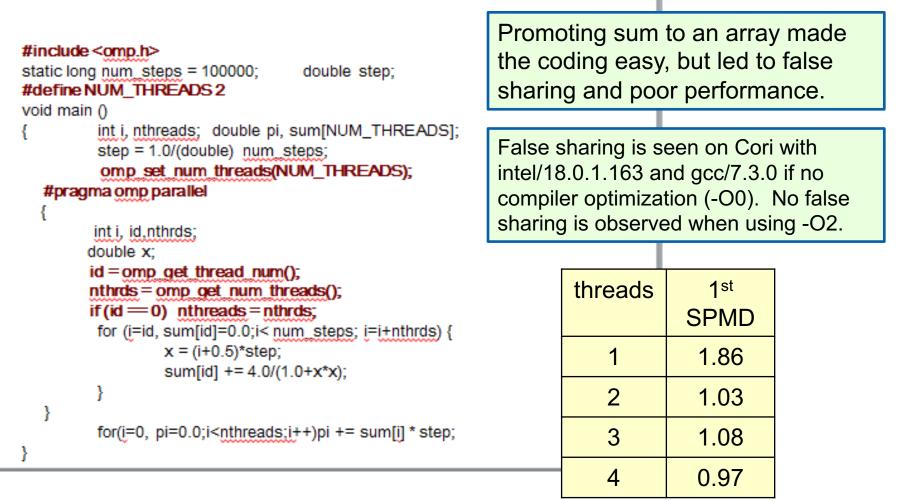
Exercise

- In your first Pi program, you probably used an array to create space for each thread to store its partial sum.
- If array elements happen to share a cache line, this leads to false sharing.
 - Non-shared data in the same cache line so each update invalidates the cache line ... in essence "sloshing independent data" back and forth between threads.
- Modify your "pi program" to avoid false sharing due to the partial sum array.

Pi program with false sharing*

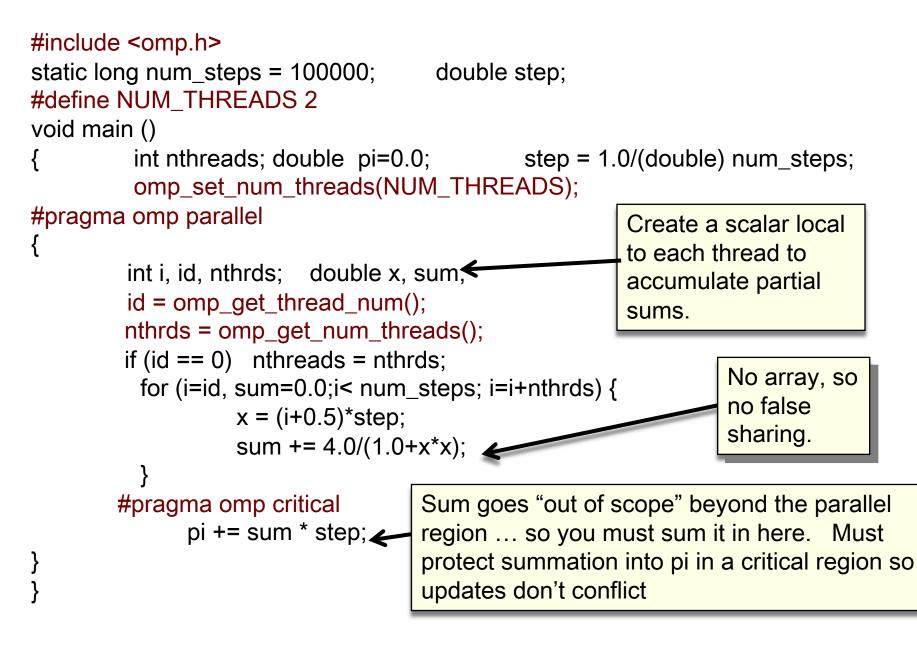
• Original Serial pi program with 100000000 steps ran in 1.83 seconds.

Example: A simple Parallel pi program



*Intel compiler (icpc) with no optimization on Apple OS X 10.7.3 with a dual core (four HW thread) Intel® CoreTM i5 processor at 1.7 Ghz and 4 Gbyte DDR3 memory at 1.333 Ghz.

Example: Using a critical section to remove impact of false sharing



Results*: pi program critical section

• Original Serial pi program with 100000000 steps ran in 1.83 seconds.

```
Example: Using a critical section to remove impact of false sharing
#include <omp.h>
                                  double step:
static long num steps = 100000;
#define NUM_THREADS 2
void main ()
         int nthreads; double pi=0.0;
                                    step = 1.0/(double) num_steps;
Ł
         omp_set_num_threads(NUM_THREADS);
#pragma omp parallel
        int i, id, nthrds; double x, sum;
                                                                    1 st
                                                                                 1st
                                                     threads
                                                                                           SPMD
        id = omp_get_thread_num();
                                                                  SPMD
                                                                              SPMD
                                                                                            critical
        nthrds = omp_get_num_threads();
        if (id == 0) nthreads = nthrds;
                                                                              padded
         for (i=id, sum=0.0;i< num_steps; i=i+nthrds) {</pre>
                                                         1
                                                                   1.86
                                                                                1.86
                                                                                             1.87
                 x = (i+0.5)*step;
                 sum += 4.0/(1.0+x^*x);
                                                         2
                                                                   1.03
                                                                                1.01
                                                                                             1.00
       #pragma omp critical
                                                         3
                                                                   1.08
                                                                               0.69
                                                                                             0.68
             pi += sum * step;
                                                                               0.53
                                                         4
                                                                   0.97
                                                                                             0.53
```

*Intel compiler (icpc) with no optimization on Apple OS X 10.7.3 with a dual core (four HW thread) Intel® CoreTM i5 processor at 1.7 Ghz and 4 Gbyte DDR3 memory at 1.333 Ghz.

Example: Using a critical section to remove impact of false sharing

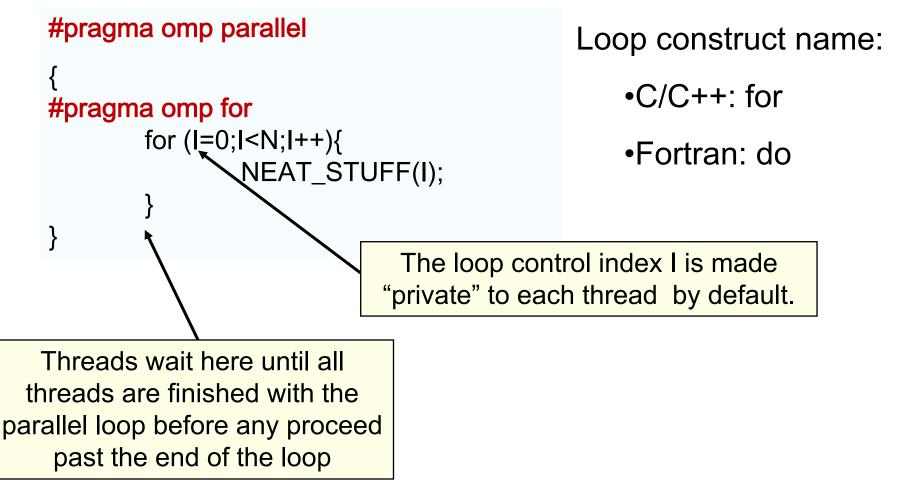
```
#include <omp.h>
static long num_steps = 100000;
                                     double step;
#define NUM_THREADS 2
void main ()
         int nthreads; double pi=0.0; step = 1.0/(double) num_steps;
{
          omp_set_num_threads(NUM_THREADS);
#pragma omp parallel
                                                         Be careful where
                                                         you put a critical
        int i, id, nthrds; double x;
                                                         section
        id = omp get thread num();
        nthrds = omp_get_num_threads();
        if (id == 0) nthreads = nthrds;
          for (i=id, sum=0.0;i< num_steps; i=i+nthreads){
                                                          What would happen if
                  x = (i+0.5)^*step;
                                                          you put the critical
                  #pragma omp critical
                                                          section inside the
                      pi += 4.0/(1.0+x^*x);
                                                          loop?
          }
pi *= step;
```

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The loop worksharing constructs

• The loop worksharing construct splits up loop iterations among the threads in a team



Loop worksharing constructs A motivating example

Sequential code

OpenMP parallel region

OpenMP parallel region and a worksharing for construct

for(i=0;i<N;i++) { a[i] = a[i] + b[i];}

#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++) { a[i] = a[i] + b[i];}</pre>

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

Loop worksharing constructs: The schedule clause

- The schedule clause affects how loop iterations are mapped onto threads
 - schedule(static [,chunk])
 - Deal-out blocks of iterations of size "chunk" to each thread.
 - schedule(dynamic[,chunk])
 - Each thread grabs "chunk" iterations off a queue until all iterations have been handled.

Schedule Clause	When To Use		Least work at runtime : scheduling done
STATIC	Pre-determined and predictable by the programmer	K	at compile-time
DYNAMIC	Unpredictable, highly variable work per iteration	-	runtime : complex scheduling logic used at run-time

Combined parallel/worksharing construct

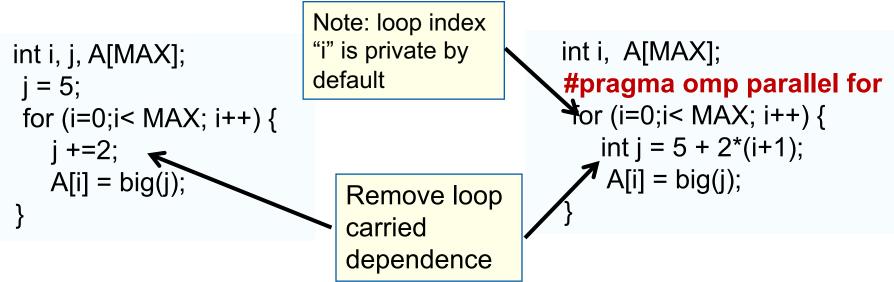
• OpenMP shortcut: Put the "parallel" and the worksharing directive on the same line

```
double res[MAX]; int i;
#pragma omp parallel
{
    #pragma omp for
    for (i=0;i< MAX; i++) {
        res[i] = huge();
    }
}</pre>
```

```
double res[MAX]; int i;
#pragma omp parallel for
for (i=0;i< MAX; i++) {
    res[i] = huge();
  }
These are equivalent</pre>
```

Working with loops

- Basic approach
 - Find compute intensive loops
 - Make the loop iterations independent ... So they can safely execute in any order without loop-carried dependencies
 - Place the appropriate OpenMP directive and test



Reduction

• How do we handle this case?

```
double ave=0.0, A[MAX]; int i;
for (i=0;i< MAX; i++) {
    ave + = A[i];
}
ave = ave/MAX;
```

- We are combining values into a single accumulation variable (ave) ... there is a true dependence between loop iterations that can't be trivially removed
- This is a very common situation ... it is called a "reduction".
- Support for reduction operations is included in most parallel programming environments.

Reduction

- OpenMP reduction clause: reduction (op : list)
- Inside a parallel or a work-sharing construct:
 - A local copy of each list variable is made and initialized depending on the "op" (e.g. 0 for "+").
 - Updates occur on the local copy.
 - Local copies are reduced into a single value and combined with the original global value.
- The variables in "list" must be shared in the enclosing parallel region.

```
double ave=0.0, A[MAX]; int i;
#pragma omp parallel for reduction (+:ave)
for (i=0;i< MAX; i++) {
    ave + = A[i];
}
ave = ave/MAX;</pre>
```

OpenMP: Reduction operands/initial-values

- Many different associative operands can be used with reduction:
- Initial values are the ones that make sense mathematically.

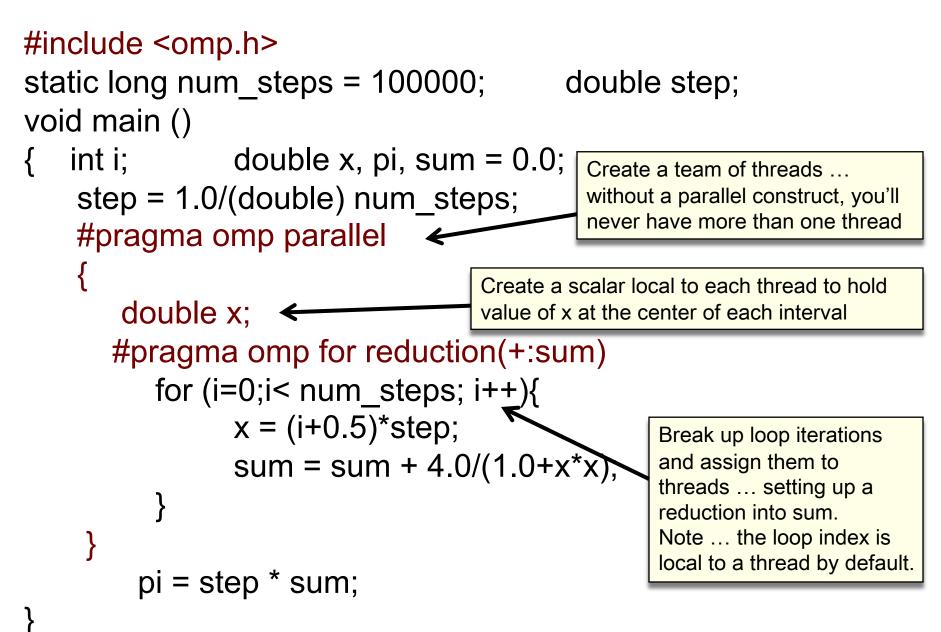
Operator	Initial value
+	0
*	1
-	0
min	Largest pos. number
max	Most neg. number

Exercise: Pi with loops

- Go back to the serial pi program and parallelize it with a loop construct
- Your goal is to minimize the number of changes made to the serial program.

#pragma omp parallel
#pragma omp for
#pragma omp parallel for
#pragma omp for reduction(op:list)
#pragma omp critical
int omp_get_num_threads();
int omp_get_thread_num();
double omp_get_wtime();

Example: Pi with a loop and a reduction



Results*: pi with a loop and a reduction

• Original Serial pi program with 100000000 steps ran in 1.83 seconds.

Example: Pi with a	threads	1 st SPMD	1 st SPMD	SPMD critical	PI Loop			
#include < <u>omp.h</u> >			padded					
static long num steps = 1000 void main ()	1	1.86	1.86	1.87	1.91			
{ int i; double x, pi, su		1.03	1.01	1.00	1.02			
step = 1.0/(double) num s #pragma omp parallel	3	1.08	0.69	0.68	0.80			
{	4	0.97	0.53	0.53	0.68			
double x;				1				
<pre>#pragma omp for reduction(+:sum)</pre>								
for (i=0;i< num_steps; i++){								
x = (i+0.5)*step								
sum = sum + 4								
}								
}								
pi = step * sum;	1							
}								

*Intel compiler (icpc) with no optimization on Apple OS X 10.7.3 with a dual core (four HW thread) Intel® Core[™] i5 processor at 1.7 Ghz and 4 Gbyte DDR3 memory at 1.333 Ghz.

The nowait clause

• Barriers are really expensive. You need to understand when they are implied and how to skip them when its safe to do so.

```
double A[big], B[big], C[big];
#pragma omp parallel
       int id=omp_get_thread num();
       A[id] = big calc1(id);
                                    implicit barrier at the end of a for
#pragma omp barrier
                                    worksharing construct
#pragma omp for
       for(i=0;i<N;i++){C[i]=big calc3(i,A);}
#pragma omp for nowait
       for(i=0;i<N;i++){ B[i]=big_calc2(C, i); } 
       A[id] = big calc4(id);
                                                no implicit barrier
            implicit barrier at the end
                                                due to nowait
             of a parallel region
```

Limitations of Parallel For / Do

```
#pragma omp parallel
{
    ...
    while (my_pointer != NULL) {
        do_independent_work(my_pointer);
        my_pointer = my_pointer->next;
        } // End of while loop
    ...
}
```

To use a for or do construct, loops must be countable.

To parallelize this loop, it is necessary to first count the number of iterations and then rewrite it as a *for* loop.

Or we can use tasks. More on this later...

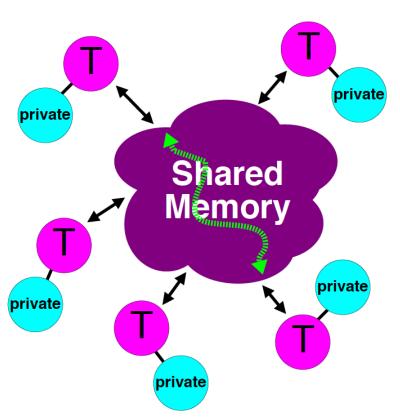
Performance Tips

- Is there enough work to amortize overheads?
 - May not be worthwhile for very small loops (if clause can control this)
 - Might be overcome by choosing different loop, rewriting loop nest or collapsing loop nest
- Best choice of schedule might change with system, problem size
 - Experimentation may be needed
- Minimize synchronization
 - Use nowait where possible
- Locality
 - Most large systems are NUMA
 - Be prepared to modify your loop nests
 - Change loop order to get better cache behavior
- If performance is bad, look for false sharing
 - We talk about this in part 2 of the tutorial
 - Occurs frequently, performance degradation can be catastrophic 64

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OpenMP Memory Model



- All threads access the same, globally • shared memory
- Data can be shared or private
 - Shared only one instance of data
 - Threads can access data simultaneously
 - Changes are visible to all threads
 - Not necessarily immediately
 - **Private** Each thread has copy of data
 - No other thread can access it
 - Changes only visible to the thread owning the data
- OpenMP has relaxed-consistency • shared memory model
 - Threads may have a *temporary* view of shared memory that is not consistent with that of other threads
 - These temporary views are made consistent at certain places in code

Data environment: Default storage attributes

- Shared memory programming model:
 - Most variables are shared by default
- Global variables are SHARED among threads
 - Fortran: COMMON blocks, SAVE variables, MODULE variables
 - C: File scope variables, static
 - Both: dynamically allocated memory (ALLOCATE, malloc, new)
- But not everything is shared...
 - Stack variables in subprograms(Fortran) or functions(C) called from parallel regions are PRIVATE
 - Automatic variables within a statement block are PRIVATE.

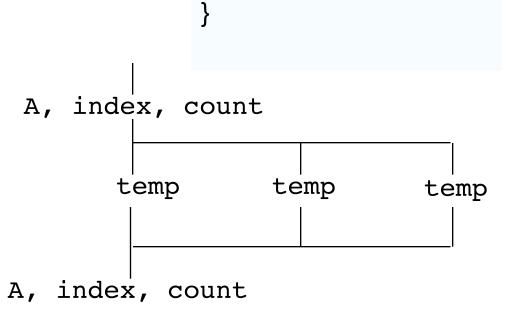
Data sharing: Examples

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

extern double A[10]; 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



. . .

Data sharing: Changing storage attributes

- One can selectively change storage attributes for constructs using the following clauses* (note: list is a comma-separated list of variables)
 - -shared(list)
 - -private(list)
 - -firstprivate(list)

These clauses apply to the OpenMP construct NOT to the entire region.

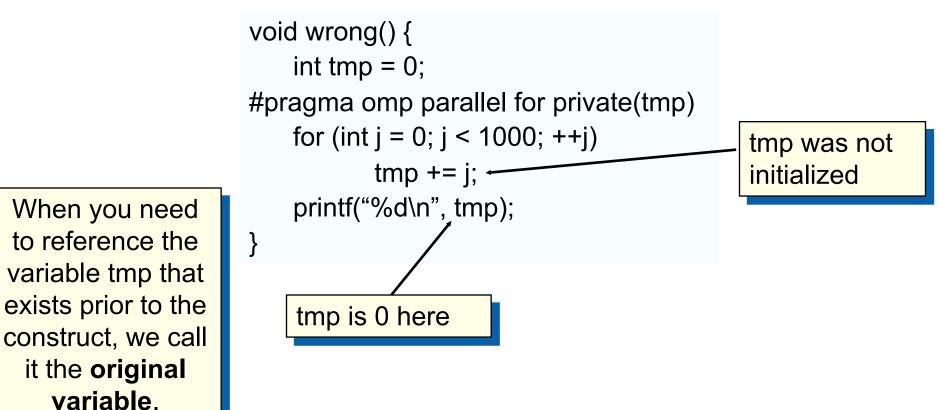
parallel constructs

- These can be used on parallel and for constructs ... other than shared which can only be used on a parallel construct
- Force the programmer to explicitly define storage attributes

 default (none)
 default() can be used on

Data sharing: Private clause

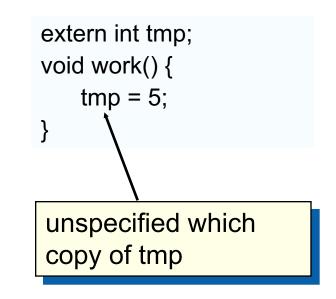
- private(var) creates a new local copy of var for each thread.
 - The value of the private copies is uninitialized
 - The value of the original variable is unchanged after the region



Data sharing: Private clause When is the original variable valid?

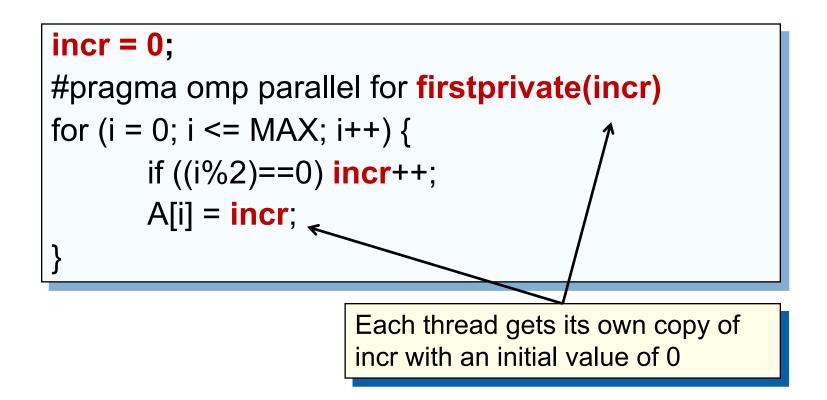
- The original variable's value is unspecified if it is referenced outside of the construct
 - Implementations may reference the original variable or a copy a dangerous programming practice!
 - For example, consider what would happen if the compiler inlined work()?

```
int tmp;
void danger() {
    tmp = 0;
#pragma omp parallel private(tmp)
    work();
    printf("%d\n", tmp);
}
tmp has unspecified value
```



Firstprivate clause

- Variables initialized from a shared variable
- C++ objects are copy-constructed



Data sharing: A data environment test

Consider this example of PRIVATE and FIRSTPRIVATE

variables: A = 1,B = 1, C = 1
#pragma omp parallel private(B) firstprivate(C)

- Are A,B,C private to each thread or shared inside the parallel region?
- What are their initial values inside and values after the parallel region?

Inside this parallel region ...

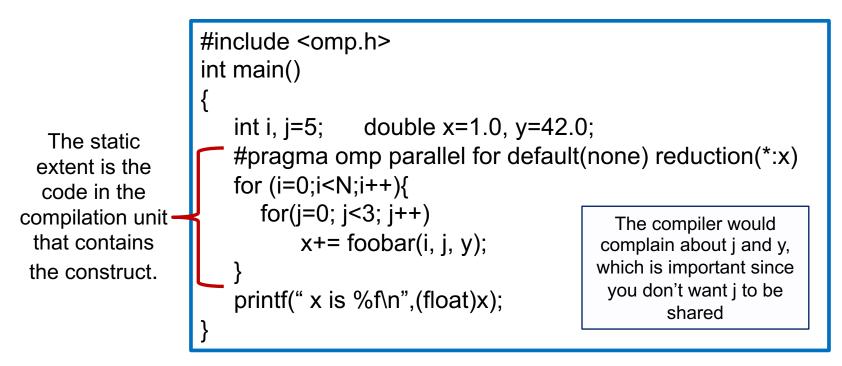
- "A" is shared by all threads; equals 1
- "B" and "C" are private to each thread.
 - B's initial value is undefined
 - C's initial value equals 1

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: Default clause

- default(none): Forces you to define the storage attributes for variables that appear inside the static extent of the construct ... if you fail the compiler will complain. Good programming practice!
- You can put the default clause on parallel and parallel + workshare constructs.



The full OpenMP specification has other versions of the default clause, but they are not used very often so we skip them in the common core

Performance and Correctness Tips

- There is one version of shared data
 - Keeping data shared reduces overall memory consumption
- Private data is stored locally, so use of private variables can increase efficiency
 - Avoids false sharing
 - May make it easier to parallelize loops
 - But private data is no longer available after parallel regions ends
- It is an error if multiple threads update the same variable at the same time (a data race)
- It is a good idea to use "default none" while testing code
- Putting code into a subroutine / function can make it easier to write code with many private variables
 - Local / automatic data in a procedure is private by default

Exercise: Mandelbrot set area

- The supplied program (mandel.c) computes the area of a Mandelbrot set.
- The program has been parallelized with OpenMP, but we were lazy and didn't do it right.
- Find and fix the errors (hint ... the problem is with the data environment).
- Once you have a working version, try to optimize the program.
 - Try different schedules on the parallel loop.
 - Try different mechanisms to support mutual exclusion ... do the efficiencies change?

The Mandelbrot area program

```
#include <omp.h>
# define NPOINTS 1000
# define MXITR 1000
struct d complex{
 double r; double i;
};
void testpoint(struct d_complex);
struct d complex c;
int numoutside = 0;
int main(){
 int i, j;
  double area, error, eps = 1.0e-5;
#pragma omp parallel for default(shared) private(c, j) \
  firstprivate(eps)
  for (i=0; i<NPOINTS; i++) {
   for (j=0; j<NPOINTS; j++) {
    c.r = -2.0+2.5*(double)(i)/(double)(NPOINTS)+eps;
    c.i = 1.125*(double)(j)/(double)(NPOINTS)+eps;
    testpoint(c);
```

```
area=2.0*2.5*1.125*(double)(NPOINTS*NPOINTS-
numoutside)/(double)(NPOINTS*NPOINTS);
error=area/(double)NPOINTS;
```

}

void testpoint(struct d_complex c){ struct d complex z; int iter; double temp; z=c; for (iter=0; iter<MXITR; iter++){ $temp = (z.r^*z.r) - (z.i^*z.i) + c.r;$ $z_i = z_r^2 - i^2 + c_i$ z.r = temp;if ((z.r*z.r+z.i*z.i)>4.0) { **#pragma omp critical** numoutside++; break:

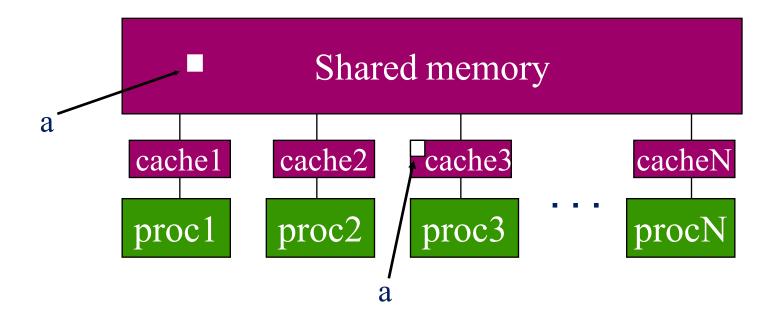
- eps was not initialized
- Protect updates of numoutside
- Which value of c does testpoint() see? Global or private?

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OpenMP memory model

- OpenMP supports a shared memory model
- All threads share an address space, but it can get complicated:



• Multiple copies of data may be present in various levels of cache, or in registers

OpenMP and relaxed consistency

- OpenMP supports a relaxed-consistency shared memory model
 - Threads can maintain a temporary view of shared memory that is not consistent with that of other threads
 - These temporary views are made consistent only at certain points in the program
 - The operation that enforces consistency is called the flush operation

Flush operation

- Defines a sequence point at which a thread is guaranteed to see a consistent view of memory
 - All previous read/writes by this thread have completed and are visible to other threads
 - No subsequent read/writes by this thread have occurred
 - A flush operation is analogous to a **fence** in other shared memory APIs

Flush and synchronization

- A flush operation is implied by OpenMP synchronizations, e.g.,
 - at entry/exit of parallel regions
 - at implicit and explicit barriers
 - at entry/exit of critical regions

. . . .

(but not at entry to worksharing regions)

This means if you are mixing reads and writes of a variable across multiple threads, you cannot assume the reading threads see the results of the writes unless:

- the writing threads follow the writes with a construct that implies a flush.
- the reading threads preceed the reads with a construct that implies a flush.

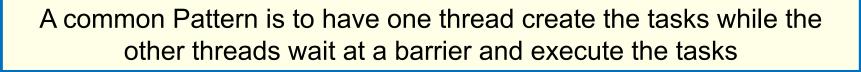
This is a rare event ... or putting this another way, you should avoid writing code that depends on ordering reads/writes around flushes.

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What are tasks?

- Tasks are independent units of work
- Tasks are composed of:
 - code to execute
 - data to compute with
- Threads are assigned to perform the work of each task.
 - The thread that encounters the task construct may execute the task immediately.
 - The threads may defer execution until later



Parallel

Serial

Single worksharing Construct

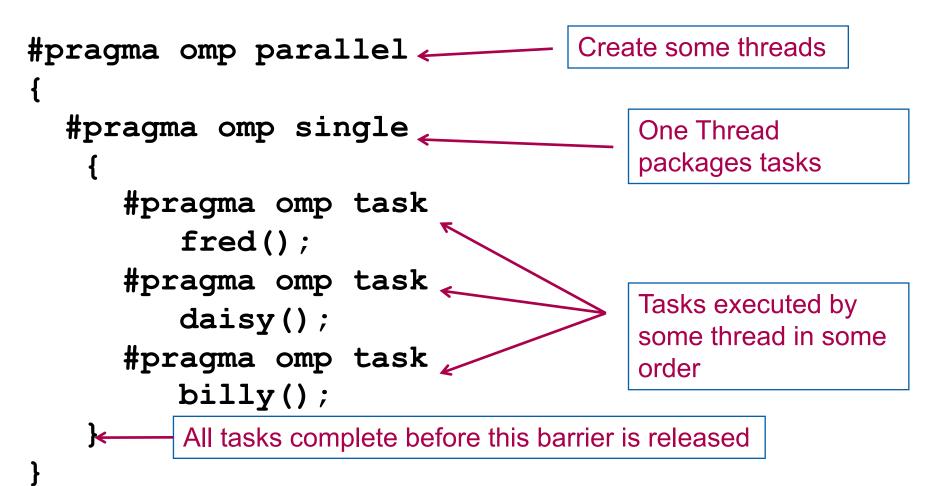
- The single construct denotes a block of code that is executed by only one thread (not necessarily the master thread).
- A barrier is implied at the end of the single block (can remove the barrier with a *nowait* clause).

```
#pragma omp parallel
{
    do_many_things();
#pragma omp single
    { exchange_boundaries(); }
    do_many_other_things();
}
```

Task Directive

#pragma omp task [clauses]

structured-block



Exercise: Simple tasks

- Write a program using tasks that will "randomly" generate one of two strings:
 - I think race cars are fun
 - I think car races are fun
- Hint: use tasks to print the indeterminate part of the output (i.e. the "race" or "car" parts).
- This is called a "Race Condition". It occurs when the result of a program depends on how the OS schedules the threads.
- NOTE: A "data race" is when threads "race to update a shared variable". They produce race conditions. Programs containing data races are undefined (in OpenMP but also ANSI standards C++'11 and beyond).

#pragma omp parallel#pragma omp task#pragma omp single

Racey cars: solution

```
#include <stdio.h>
#include <omp.h>
int main()
{ printf("I think");
 #pragma omp parallel
  ł
   #pragma omp single
    ł
     #pragma omp task
       printf(" car");
     #pragma omp task
       printf(" race");
   }
  printf("s");
  printf(" are fun!\n");
```

When/where are tasks complete?

- At thread barriers (explicit or implicit)
 - applies to all tasks generated in the current parallel region up to the barrier
- At taskwait directive
 - i.e. Wait until all tasks defined in the current task have completed.
 #pragma omp taskwait
 - Note: applies only to tasks generated in the current task, not to "descendants".

Example

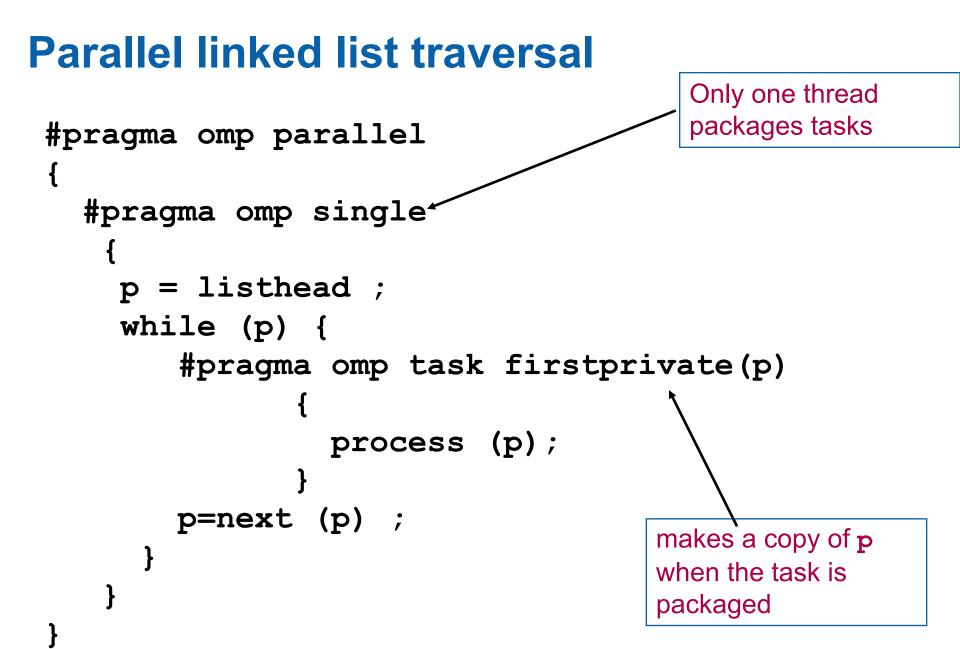
}

```
#pragma omp parallel
  #pragma omp single
   ł
     #pragma omp task
         fred();
     #pragma omp task
                                   fred() and daisy()
         daisy();
                                   must complete before
     #pragma taskwait 🛩
                                   billy() starts
     #pragma omp task
         billy();
```

Linked list traversal

```
p = listhead ;
while (p) {
    process(p);
    p=next(p) ;
}
```

- Classic linked list traversal
- Do some work on each item in the list
- Assume that items can be processed independently
- Cannot use an OpenMP worksharing loop directive



Data scoping defaults

- The behavior you want for tasks is usually firstprivate, because the task may not be executed until later (and variables may have gone out of scope)
 - Variables that are private when the task construct is encountered are firstprivate by default
- Variables that are shared in all constructs starting from the innermost enclosing parallel construct are shared by default

```
#pragma omp parallel shared(A) private(B)
{
    ...
#pragma omp task
    A is shared
    B is firstprivate
    int C;
    compute(A, B, C);
}
```

Example: Fibonacci numbers

```
int fib (int n)
  int x,y;
  if (n < 2) return n;
  x = fib(n-1);
  y = fib (n-2);
  return (x+y);
}
Int main()
  int NW = 5000;
  fib(NW);
```

- $F_n = F_{n-1} + F_{n-2}$
- Inefficient O(n²) recursive implementation!

Parallel Fibonacci

int fib (int n)
{ int x,y;
 if (n < 2) return n;</pre>

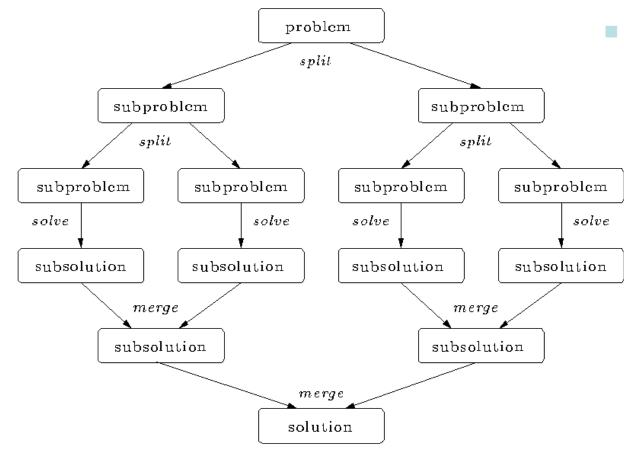
```
#pragma omp task shared(x)
  x = fib(n-1);
#pragma omp task shared(y)
  y = fib (n-2);
#pragma omp taskwait
  return (x+y);
}
```

```
Int main()
{ int NW = 5000;
    #pragma omp parallel
    {
        #pragma omp single
        fib(NW);
    }
}
```

- Binary tree of tasks
- Traversed using a recursive function
- A task cannot complete until all tasks below it in the tree are complete (enforced with taskwait)
- **x**, **y** are local, and so by default they are private to current task
 - must be shared on child tasks so they don't create their own firstprivate copies at this level!

Divide and conquer

• Split the problem into smaller sub-problems; continue until the sub-problems can be solve directly



3 Options:

- Do work as you split into sub-problems
- Do work only at the leaves
- Do work as you recombine

Using tasks

- Don't use tasks for things already well supported by OpenMP
 - -e.g. standard do/for loops
 - the overhead of using tasks is greater

- Don't expect miracles from the runtime
 - best results usually obtained where the user controls the number and granularity of tasks

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The OpenMP Common Core: Most OpenMP programs only use these 19 items

OpenMP pragma, function, or clause	Concepts
#pragma omp parallel	Parallel region, teams of threads, structured block, interleaved execution across threads
int omp_get_thread_num() int omp_get_num_threads()	Create threads with a parallel region and split up the work using the number of threads and thread ID
double omp_get_wtime()	Speedup and Amdahl's law. False Sharing and other performance issues
setenv OMP_NUM_THREADS N	Internal control variables. Setting the default number of threads with an environment variable
#pragma omp barrier #pragma omp critical	Synchronization and race conditions. Revisit interleaved execution.
#pragma omp for #pragma omp parallel for	Worksharing, parallel loops, loop carried dependencies
reduction(op:list)	Reductions of values across a team of threads
schedule(dynamic [,chunk]) schedule (static [,chunk])	Loop schedules, loop overheads and load balance
private(list), firstprivate(list), shared(list)	Data environment
nowait	Disabling implied barriers on workshare constructs, the high cost of barriers. The flush concept (but not the concept)
#pragma omp single	Workshare with a single thread
#pragma omp task #pragma omp taskwait	Tasks including the data environment for tasks.