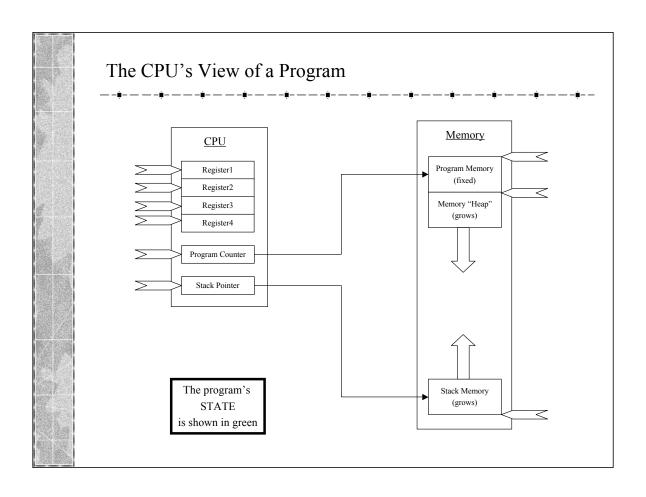
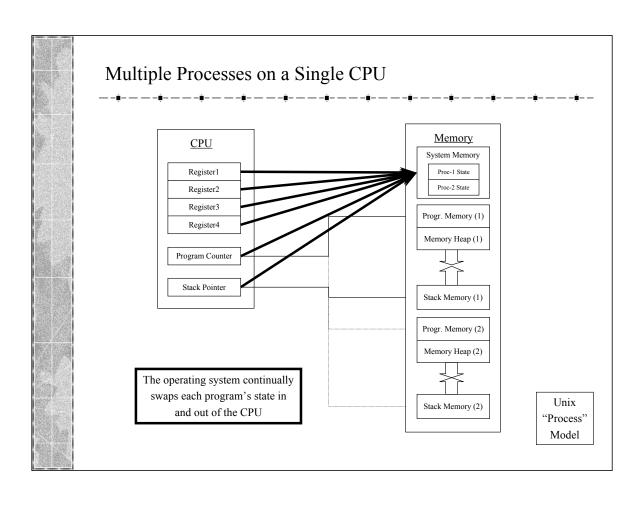
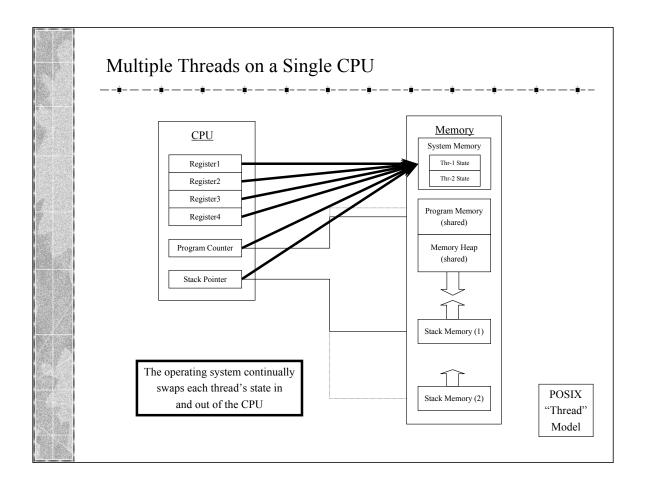


Outline ** CPU Architecture * "Shared Memory" vs. "Distributed Memory" What are Pthreads? * Operational Model for Pthreads ** Pthread Library * Pthreads in 2 Function Calls * Thread "communication" * Thread synchronization ** Performance Issues/Hints

What are Pthreads? ** The Pthread (POSIX Thread) Library is set of functions that enable C/C++ code to spawn multiple "threads" of execution to do multiple tasks simultaneously • It is fairly low-level • You create the thread, you tell it what to do, you wait for it to finish • "Communication" is through shared memory • So a Pthreads program cannot span multiple machines (like MPI) • No explicit Fortran binding is specified, but you can write a "driver" program in C which makes calls to your Fortran routines







Multiple {Processes|Threads} on Multiple CPUs

- ** The operating system handles swapping the {Process|Thread} state in and out of all CPUs according to some scheduling policy
 - Generally, the OS tries to be "smart" and "fair" about this
 - It may implement some kind of priority to allow system threads to jump ahead in the order to do some critical task
 - If CPU#2 is sitting idle, it will run a Prog-2 there instead of kicking Prog-1 out of CPU#1
 - On NUMA SMP systems, the OS may try to run a {Process|Thread} on a CPU that is close to the job's memory
 - ◆ The OS is not always as smart as you want it to be!
- ** Remember:
 - ◆ Multiple processes do NOT share memory
 - ◆ Multiple threads DO share memory

Multiple Threads are Asynchronous

- ** Even if you create two identical threads (or processes) and have them run EXACTLY the same program on EXACTLY the same data, there is no guarantee that they will stay synchronized
 - ◆ OS may have other work to do, so Thread-2 may be stalled while Thread-1 is able to do computations
 - Much of this "OS work" is temporally random
 - ◆ Certain operations are inherently single threaded, so one thread will be done first
 - Disk I/O, Network I/O ... there may be only one disk or one NIC
 - Older libraries may not be thread-aware and may only work if one thread uses the lib at a time (e.g. the C string lib)
 - ◆ This is somewhat counterintuitive given that we know computers are finite-state machines following a fixed program

Outline ** CPU Architecture • "Shared Memory" vs. "Distributed Memory" ** What are Pthreads? • Operational Model for Pthreads Pthread Library • Pthreads in 2 Function Calls • Thread "communication" • Thread synchronization ** Performance Issues/Hints

Pthreads in 2 Function Calls

- # pthread_create()
 - ◆ Create a new thread of execution which executes an assigned function call
 - You can create different threads with different "work" functions
 - Generally, we create a pool of identical "workers"
 - ◆ This is not a hierarchy!!
 - There is a master thread, but everything else is equivalent
 - but threads may not be "visible" to other threads
 - ◆ If one thread exits, other threads keep going
- # pthread_join()
 - ◆ The calling thread waits for the specified thread to exit

"Hello World" Example #include <pthread.h> void* worker(void* p) { printf("Hello world from worker!\n"); return(NULL); int main() { int i; pthread t OtherThreads[4]; for(i=0;i<4;i++) { pthread_create(&OtherThread[i], NULL, worker, NULL); $\label{lem:printf("Hello world from main! \n");} printf("Hello world from main! \n");$ for(i=0;i<4;i++) { pthread_join(OtherThread[i], NULL); return(0);Hello world from worker! Hello world from worker! Hello world from worker! Hello world from worker! Hello world from main!

Building Pthread Code

- ** Most Unix/Linux systems come with the Pthread library already installed
 - ◆ Usually located in a standard location (/usr/lib)
 - ◆ Usually called libpthread.so or libpthread.a

% gcc -o myprog myprog.c -lpthread

- ◆ All major compilers support it
 - All versions of gcc support it
- ◆ You may need to link against "reentrant" versions of the standard libraries
 - E.g. the C string library is not multi-thread enabled -- simultaneous calls to strtok will collide and overwrite each other

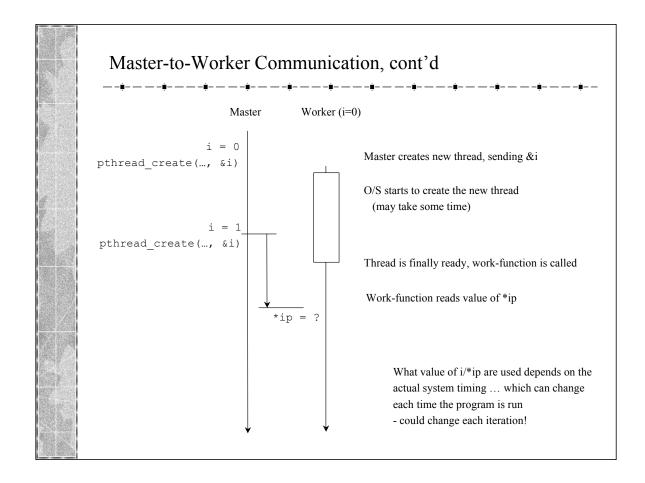
Outline

- ***** CPU Architecture
 - ◆ "Shared Memory" vs. "Distributed Memory"
- ₩ What are Pthreads?
 - ◆ Operational Model for Pthreads
- * Pthread Library
 - ◆ Pthreads in 2 Function Calls
 - Thread "communication"
 - ◆ Thread synchronization
- ****** Performance Issues/Hints

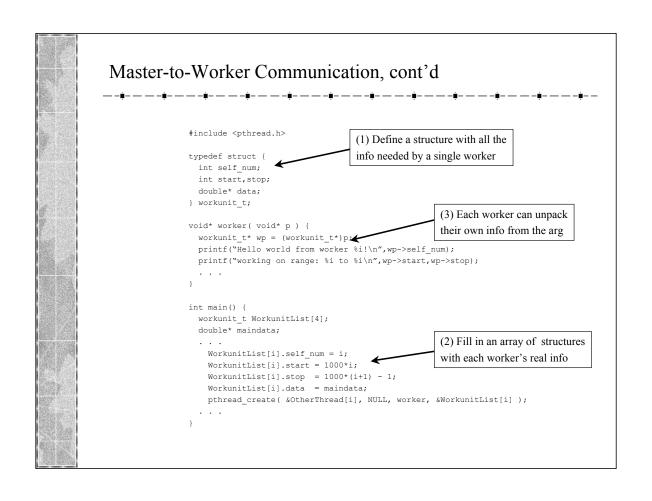
Master-to-Worker Communication

- * The Master passes a pointer as an argument to pthread create()
 - ◆ This pointer is technically void*
 - ◆ Since you have to write both the Master and the Worker code, you can safely assume any pointer type you want
 - Even a pointer to a user-defined structure (or class)

Any potential problems?



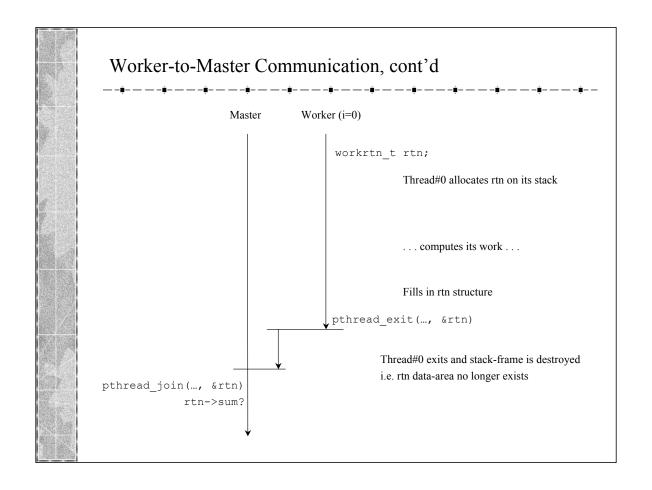
Master-to-Worker Communication, cont'd #include <pthread.h> void* worker (void* p) { int* ip = (int*)p; printf("Hello world from worker %i!\n",*ip); . . . } int main() { pthread_t OtherThread[4]; int ThreadNums[4]; for (i=0;i<4;i++) { ThreadNums[i] = i; pthread_create(&OtherThread[i], NULL, worker, &ThreadNums[i]); } } ThreadNum data-area is stable even as 'i' increments</pre>



Worker-to-Master Communication

- ** You can use pthread_exit() or just the return() statement to return a single void* value
 - ◆ Again, you have to write both the Master and Workers so you can safely assume a pointer of some other type

```
#include <pthread.h>
typedef struct {
 double sum, sum2, min, max;
} workrtn_t;
void* worker( void* p ) {
 workrtn_t rtn;
                                                   You must return a pointer
 rtn.sum = compute_local_sum();
                                                   to a memory area
 rtn.sum2 = compute_local_sum2();
 return( &rtn );
int main() {
                                                   Yes, you send it the
 workrtn_t* result;
                                                   address of a pointer
 pthread_join( OtherThread, &result );
```



Worker-to-Master Communication, cont'd

int main() {

workrtn_t* result;

pthread_join(OtherThread, &result);

- ¥ You could also just allocate "return-data" space somewhere in the global memory space
 - ◆ But you'll need to identify (and keep track of) what thread should write results to what block of the "return-data" memory area
- * You could include a "return-data" field in the "work-unit" structure
 - ◆ This structure must live somewhere globally, or else in the Master's stack -- either way it is a stable location

```
typedef struct {
  int self_num
  int start, stop;
  double* data;
  double sum, sum2, min, max;
} workunit_t;

void* worker( void* p ) {
  workunit_t* wp = (workunit_t*)p;
   ...
  wp->sum = compute_sum();
   ...
  return( NULL );
}
Note that these values will
be visible to the Master always,
  but will only be stable
AFTER the pthread_join() call
```

Why bother with these "Workunit" structures?

- - ◆ Since every thread can read/write global variables, it is easy to have threads overwrite each other (and hence lose data)
 - ◆ Functions may have "side effects" (make changes to global variables) that are not apparent in their argument list
 - So changes to one function may have ripple effects, causing new bugs in other functions due to global variables being accessed differently
- ★ Good OO or Modular Programming technique -- encapsulation

Worker-to-Worker Communication

- ** Basic mechanism is to use shared memory
 - ◆ All threads can "see" the same global memory areas
 - ◆ They CANNOT see variables defined INSIDE a function

```
#include <pthread.h>
                                                  Visible to all Workers
int global_var = 0; 	←
void* worker( void* p ) {
 int local_var1 = 22; 	←
                                                  Only visible to THIS Worker
 int* array;
 array = (int*) malloc (100*sizeof(int));
                                                  Allocated on the heap, but
 return( NULL );
                                                  only known by THIS Worker
int main() {
                                                  Only visible to Master
 int local var2 = 33; ←
 pthread_t OtherThread;
 pthread create( &OtherThread, NULL, worker, NULL );
 /* thread-1 does work here */
 pthread_join( OtherThread, NULL );
```

Shared Memory Communication #include <pthread.h> Workers can exchange data typedef struct { through the (heap-allocated) int self_num global memory area int start, stop; double* data; } workunit_t; It is up to the programmer to ensure that shared memory void* worker(void* p) { workunit_t* wp = (workunit_t*)p; accesses "do the right thing" double* dataptr = wp->data; data[i] = 0.5*(data[i-1] + data[i+1]);Allocated on heap, potentially int main() { workunit_t WorkunitList[4]; visible to all Workers double* maindata; Pointer is passed maindata = (double*)malloc(1000000*sizeof(double)); to EVERY Worker WorkunitList[i].data = maindata; pthread_create(&OtherThread[i], NULL, worker, &WorkunitList[i]);

Writing to Global Memory Areas

- ★ Generally, multiple Threads reading from a global (shared) memory area is fine ... they all read the same value
- Multiple Threads writing to a global (shared) memory area can be problematic ... need to ensure proper synchronization to get consistent (correct) results
 - ◆ Usually best if only one Thread at a time has write-access
 - But you (the programmer) have to enforce this mutually exclusive write-access
 - Note that multiple Threads reading while one Thread writes can also be very tricky
 - Obviously some will read the "old" value, and some will read the "new" value
 - Be careful if the "new" value is supposed to trigger a different response in the workers

Outline

- **※** CPU Architecture
 - ◆ "Shared Memory" vs. "Distributed Memory"
- ** What are Pthreads?
 - ◆ Operational Model for Pthreads
- * Pthread Library
 - ◆ Pthreads in 2 Function Calls
 - ◆ Thread "communication"
 - Thread synchronization
- ** Performance Issues/Hints

Synchronization -- Spin-Loops

** Spin-loops on global (or visible) shared variables seem obvious

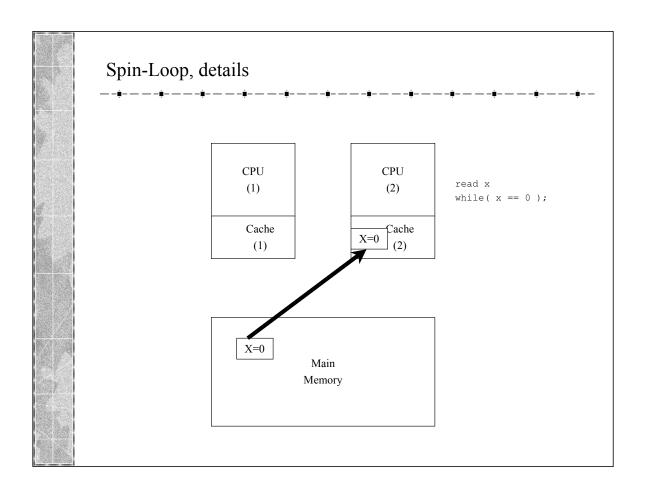
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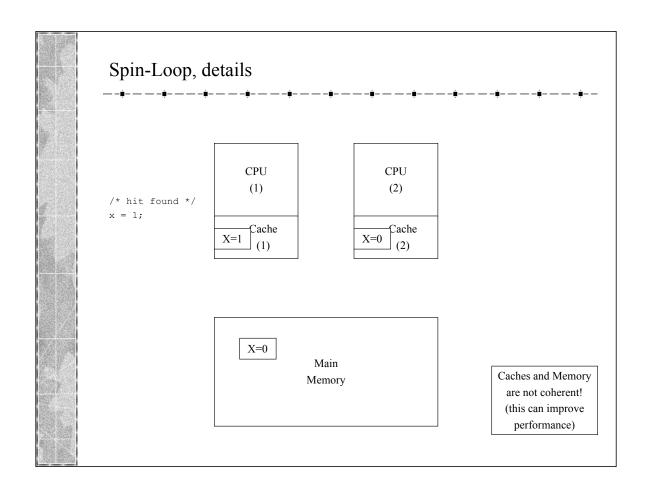
```
while( variable < 100 );</pre>
```

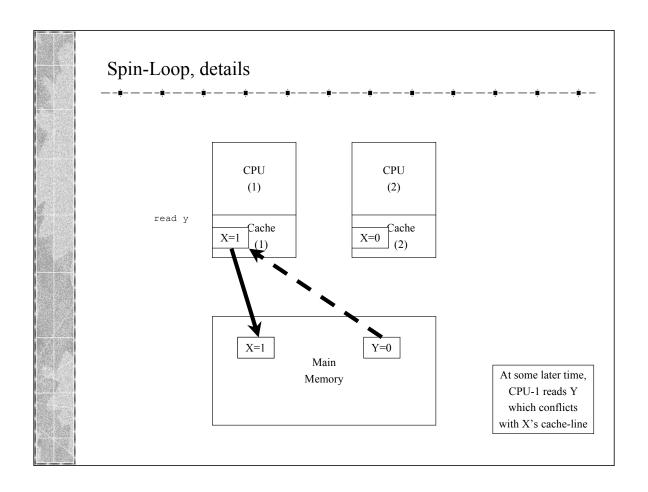
- ◆ ... but WILL NOT WORK!!
 - At least not all the time on all machines
 - Not even if you do:

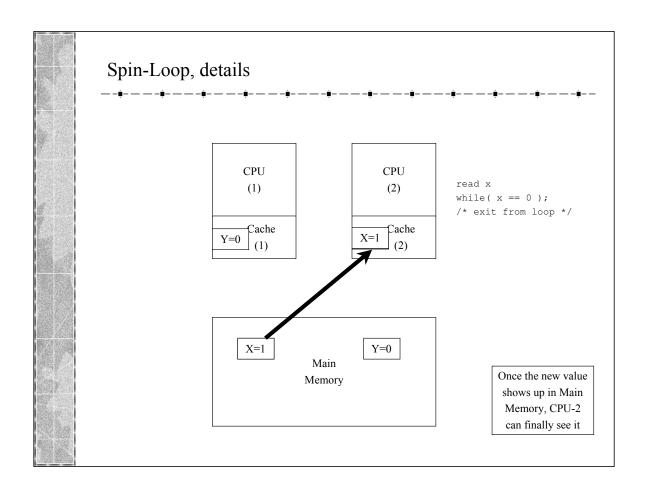
```
while( (volatile) (variable) < 100 );</pre>
```

- ◆ Cache effects make spin loops non-portable
 - If the machine has strict cache coherency, then spin loops will work
 - If the machine uses "relaxed" cache coherency (for better multiprocessor performance), then the variable may not be written out to main memory ... so other CPUs cannot see the correct value
 - A single dual-core chip may have different cache coherency behavior than two single-core chips
 - And two dual-core chips may have different cache behavior if the threads are in the same chip or on two different chips









Synchronization - Mutual-Exclusion

- * A 'mutex' (mutual exclusion) is a region of code that only one thread at a time can enter
 - ◆ A thread 'locks' the mutex when it enters, and 'unlocks' the mutex when it leaves
 - ◆ All other threads attempting to gain the lock must wait until the 'owner' unlocks the mutex -- at which point one of the waiting threads is (essentially) chosen randomly
 - pthread mutex t
 - pthread mutex init()
 - pthread mutex lock()
 - pthread mutex unlock()
 - pthread_mutex_trylock()
- ** This is a single-thread region ... obviously this will be bad for parallel performance

Note that we talk of mutex 'regions' but it is entirely programmer dependent.

The locking/unlocking is done on the mutex variable.

Mutex Example

What if we hadn't locked the increment operation?

Mutex Example, cont'd

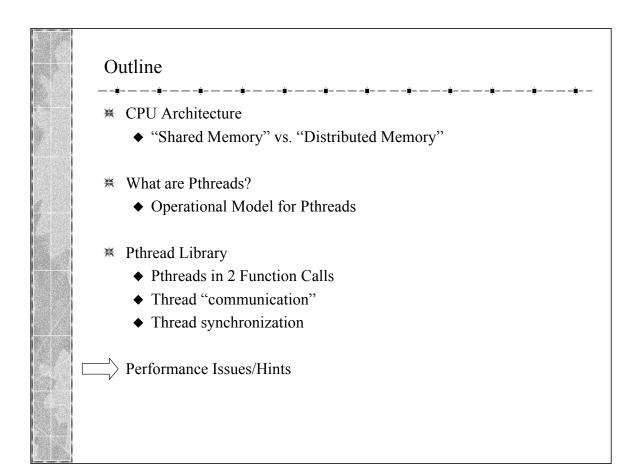
- * The increment operation is really several discrete steps:
 - ◆ Read 'global sum' from shared memory into a CPU-register
 - ◆ Read 'local sum' into a CPU-register
 - ◆ Add the two registers together
 - ◆ Store the sum back to the 'global sum' shared memory location
 - ◆ There is a possible race condition: another Thread could have incremented 'global_sum' *just after* this Thread read the value
 - So our new 'global_sum' will be incorrect ... but will overwrite any previous (correct) value

Barriers

- ** A Barrier is a point in the code where all threads must arrive at that point before any one can leave that point
 - ◆ Sometimes split as two separate operations: enter-barrier and leave-barrier
 - ◆ The POSIX standard recently added barrier functionality
 - pthread barrier init()
 - pthread barrier wait()
 - pthread barrier destroy()
- ** A Barrier implies some number of Threads are WAITING for other Threads to arrive ... obviously, this will not be good for performance
 - ◆ But often makes it easier to program ... eliminates many race conditions since all threads must do "X" before any one of them can do "Y"

Follow-Up to Cache Issues

- ** If you think about this for a minute, how can a Mutex or Barrier work if the caches and Main Memory can be incoherent?
 - ◆ What if the Mutex "lock" is held in someone's cache?
 - ◆ What if the Barrier counter is held in someone's cache?
- ** The PThreads Library calls will ensure that caches are properly flushed before and after lock/count data is updated
 - ◆ Recall that cache memory was intended to speed up calculations
 - ◆ Constantly flushing the entire cache will be bad for performance
- * Unfortunately, there is no user-callable "cache-flush" routine



Basic Tips

- ** Use structures (or classes) as input/output arguments to your Thread-Work functions
 - ◆ Makes it easier to see what is/is not being shared
 - ◆ Keeps things a bit more modular
- ** Domain Decomposition (Iterative Parallelism) seems to be one of the easiest ways to "split" scientific computing problems up into multiple Threads
 - ◆ Look for large 'for' loops in your program
 - ◆ Put these loops into a work-function with 'start' and 'stop' bounds for the loop into a work-unit structure
 - Hint: don't forget about the "left-over" bits if the splitting isn't even
 - ◆ Use pthread_create() to start up multiple Threads

One "Big" Parallel Region vs. Several Smaller Ones

- ★ Starting up and shutting down Threads takes some time
 - ◆ So many, small work-functions can have significant overheads
 - ◆ Some loops may be too small to make Threading worthwhile
- ** Try to build one big work-function that includes all possible parallel regions you might need ... i.e. include all your big loops into one work-function
 - ◆ If you need single-Thread regions within that parallel region, use a mutex with a simple flag/counter
 - ◆ In many cases, it is easier (and cheaper) to just allow Threads to do redundant computations

One "Big" Parallel Region, cont'd

```
void* loop1( wkunit1* w1 ) {
    for(i=w1->start;i<w1->stop;i++) {
        data[i] = . . .
    }
}

void* loop2( wkunit2* w2 ) {
    for(i=w2->start;i<w2->stop;i++) {
        data[i] = . . .
    }
}

int main() {
        . . .
    pthread_create(...,loop1,...);
        . . .
    pthread_create(...,loop2,...);
        . . .
}
```

```
void* loopln2( wkunit* wk ) {
    for(i=wk->start1;i<wk->stop1;i++) {
        data[i] = . . .
    }
    . . .
    for(i=wk->start2;i<wk->stop2;i++) {
        data[i] = . . .
    }
}
int main() {
    . . .
    pthread_create(...,loop1n2,...);
    . . .
}
```

Timing PThreads Code clock(); #include <time.h> work */ = clock(); t0)/(double)(CLOCKS_PER_SEC); (double)(t1 time_t t0,t1; t0 = time(NULL); /* do work */ t1 = time(NULL); #include <sys/time.h> struct timeval t0,t1; dt = (double)(t1-t0);gettimeofday(&t0,NULL); /* do work */ gettimeofday(&t1,NULL); dt = (double)(t1.tv_sec-t0.tv_sec)+(double)(t1.tv_usec-t0.tv_usec)/1.0e6; struct timespec t0,t1; POSIX-4 clock_gettime(CLOCK_REALTIME,&t0); /* do work */ - CLOCK_HIGHRES? clock_gettime(CLOCK_REALTIME,&t1); dt = (double)(t1.tv_sec-t0.tv_sec)+(double)(t1.tv_nsec-t0.tv_nsec)/1.0e9; times() function is considered outdated

Mutexes and Barriers

- * A mutex is, by definition, a single-Thread region
 - ◆ Parallel performance will degrade if you have too many of them
 - But they may be required for correctness of your algorithm
- * A barrier implies a significant amount of waiting
 - ◆ E.g. at some point 9 out of 10 Threads are sitting idle waiting for the last Thread to arrive
 - ◆ Parallel performance will degrade if you have too many of them
 - ◆ They can be helpful with debugging, especially race conditions
 - But they are a crutch!
 - You rarely NEED a barrier
 - If Thread#1 and Thread#2 need to be synchronized, then just synchronize those two, don't use a barrier just because it is easy

Possible Alternatives to Mutexes

- ** In some cases, we can reduce the need for mutexes by doing local computations in each Thread, and THEN grabbing a mutex at the end to perform the global computation
 - E.g. compute the (global) sum of a large list of numbers
 - Each Thread computes its local sum
 - Grab mutex once to accumulate the local sums into the global sum
- ** Use a global (shared) array to store partial (per-Thread) information, then after some synchronization, all Threads can directly compute the sum across the global array
 - Perhaps the sync happens naturally, or is required for other reasons

```
int partial_sum[MAX_NUM_THREADS];

void* work( wkunit* wk ) {
     . . .
    partial_sum[self] = local_sum;
     . . .
}
```

Race Conditions

- * A "Race" is a situation where multiple Threads are making progress toward some shared or common goal where timing is critical
- ★ Generally, this means you've ASSUMED something is synchronized, but you haven't FORCED it to be synchronized
- ₩ E.g. all Threads are trying to find a "hit" in a database
 - ◆ When a hit is detected, the Thread increments a global counter
 - ◆ Normally, hits are rare events and so incrementing the counter is "not a big deal"
 - ◆ But if two hits occur simultaneously, then we have a race condition
 - While one Thread is incrementing the counter, the other Thread may be reading it
 - Hence it may read the old value or new value depending on the exact timing of the two Threads

Race Conditions, cont'd

- **※** Some symptoms:
 - ◆ Running the code with 4 Threads works fine, running with 5 causes erroneous output
 - ◆ Running the code with 4 Threads works fine, running it with 4 Threads again produces different results
 - ◆ Sometimes the code works fine, sometimes it crashes after 4 hours, sometimes it crashes after 10 hours, ...
 - ◆ Program sometimes runs fine, sometimes hits an infinite loop
 - ◆ Program output is sometimes jumbled (the usual line-3 appears before line-1)
 - Any kind of indeterminacy in the running of the code, or seemingly random changes to its output, could indicate a race condition

Race Conditions, cont'd

- ** Race Conditions can be EXTREMELY hard to debug
 - ◆ Generally, race conditions don't cause crashes or even logic-errors
 - E.g. a race condition leads two Threads to both think they are in charge of data-item-X ... nothing crashes, they just keep writing and overwriting X (maybe even doing duplicate computations)
 - Often, race conditions don't cause crashes at the time they actually occur ... the crash occurs much later in the execution and for a totally unrelated reason
 - E.g. a race condition leads one Thread to think that the solver converged but the other Thread thinks we need another iteration ... crash occurs because one Thread tried to compute the global residual
 - ◆ Sometimes race conditions can lead to deadlock
 - Again, this often shows up as seemingly random deadlock when the same code is run on the same input

Deadlock

- ** A "Deadlock" condition occurs when all Threads are stopped at synchronization points and none of them are able to make progress
 - ◆ Sometimes this can be something simple:
 - Thread-1 locks Mutex-1 and waits for Variable-X to be incremented, and then it will release the lock
 - Thread-2 wants to increment X but needs to lock Mutex-1 in order to do that
 - ◆ Sometimes it can be more complex or cyclic:
 - Thread-1 locks Mutex-1 and needs Mutex-2
 - Thread-2 locks Mutex-2 and needs Mutex-3
 - Thread-3 locks Mutex-3 and ...
- ** A related condition is "Starvation": when one Thread needs a resource (Mutex) that is never released by the current lock-holder

Deadlock, cont'd

- ***** Symptoms:
 - ◆ Program hangs (!)
- ** Debugging deadlock is often straightforward ... unless there is also a race condition involved
 - ◆ Simple approach: put print statement in front of all Mutex calls

Thread-1 acquired lock on mutex-A
Thread-1 acquired lock on mutex-C
Thread-2 acquired lock on mutex-B
Thread-1 release lock on mutex-C
Thread-3 acquired lock on mutex-C
Thread-1 waiting for lock on mutex-B
Thread-2 waiting for lock on mutex-A

What I left out

- ★ Condition Variables -- a mechanism for one Thread to "signal" another
 - ◆ Some would argue this is a glaring omission
 - . . . it is fairly confusing for most new parallel programmers
- * Threads and Unix Signals
 - ◆ Individual Threads can "mask" out certain signals so that other Threads will be used to service those signals
 - By default, a signal will be sent to a random Thread
 - If certain Threads are doing "important" work that shouldn't be interrupted, then they should mask out all/most signals
- ** Threads and Unix Semaphores
 - ◆ Semaphores are shared counters
 - ◆ Threads can increment and decrement semaphores, or wait for the semaphore to hit a certain value

Where to go from here?

- * http://www.csem.duke.edu . . . csem@duke.edu
- **※** Get on our mailing lists:
 - ◆ Scientific Visualization seminars (Friday 12-1pm)
 - ◆ CSEM seminars
 - ◆ Workshop announcements
- * Follow-up seminars on specific topics
 - ◆ Parallel programming methods (OpenMP, Pthreads, MPI)
 - ◆ Performance tuning methods (Vtune, Parallel tracing)
 - ◆ Visualization tools (Amira, AVS, OpenDX)
- ***** Contacts:
 - ◆ Dr. Bill Rankin, <u>wrankin@ee.duke.edu</u>
 - ◆ Dr. Rachael Brady, <u>rbrady@duke.edu</u>
 - ◆ Dr. John Pormann, <u>ibp1@duke.edu</u>

Mutex/Condition Variables

- ** A "Condition Variable" is a point in the program where one thread can "signal" a condition to another thread
 - ◆ It is ALWAYS associated with a Mutex (but perhaps a "smaller" mutex including just the two threads that need to communicate)
 - pthread cond init()
 - pthread cond signal(), pthread cond broadcast()
 - pthread cond wait(), pthread cond timedwait()
 - ◆ E.g. when a global counter hits some threshold, we want another Worker (or Master) to print a warning
 - Build a mutex/cond-var for the signal

Waiting for a signal simultaneously unlocks the mutex.

- The "Recv"-Thread waits for the "signal"
- If a worker finds the counter crossed the threshold, they "signal" the "Recv"-Thread through the cond-var

Condition Variable Example

```
int count = 0;
pthread_mutex_t count_mtx;
pthread cond t count cv;
void* worker incr( void *vp ) {
  pthread_mutex_lock( &count_mtx );
   count++;
                                                      While the thread owns the
   if( count > threshold ) {
     pthread cond signal ( &count cv ) *
                                                      lock, it can send a signal
   pthread_mutex_unlock( &count_mtx );
void* worker_watch( void *ip ) {
   pthread mutex lock( &count mtx );
   pthread_cond_wait( &count_cv, &count_mtx );
                                                          While the thread owns the
   pthread mutex unlock( &count mtx );
                                                          lock, it can wait for a signal
```

Sending a signal releases the receiver, but it immediately has to compete to regain the mutex

Barrier, cont'd

```
pthread_mutex_t barrier_mtx;
pthread_cond_t barrier_cv;
int num_workers; /* set by master thread */
int num_arrived = 0;
void Barrier( void ) {
  pthread mutex lock( &barrier mtx );
   num arrived++;
  if( num_arrived < num_workers ) {</pre>
     pthread_cond_wait( &barrier_cv, &barrier_mtx );
   } else {
     num_arrived = 0;
     pthread_cond_broadcast( &cv );
   pthread_mutex_unlock( &barrier_mtx );
void* thread work routine( void* p ) {
   DoWorkX();
  Barrier();
  DoWorkY();
```

Unix Signals

- ★ Signals are asynchronous events that trigger a function call inside the program
 - ◆ E.g. the operating system will tell your program when the user logs out via a SIGHUP (hang-up) signal
 - ◆ E.g. batch queuing systems will tell your program that it is running out of time via a SIGXCPU signal
- - ◆ when given signal arrives, the specified function will automatically be called
 - Your program will immediately jump to the function and execute it
 - Then your program will go back to whatever it was doing before

Unix Signals, cont'd

- ₩ kill
 - ◆ Send a signal to a PROCESS
 - A thread will be selected at random to handle the interrupt
- ₩ pthread_kill
 - ◆ Send a signal to a specific THREAD
- ★ pthread_sigmask
 - ◆ "Mask" out or block certain signals from affecting the current thread
 - Used to force only 1 thread to accept an incoming signal from 'kill'
- * sigsuspend
 - ◆ Wait for a signal to arrive before continuing