#### Programmazione di Sistemi <del>Embedded e</del> Multicore

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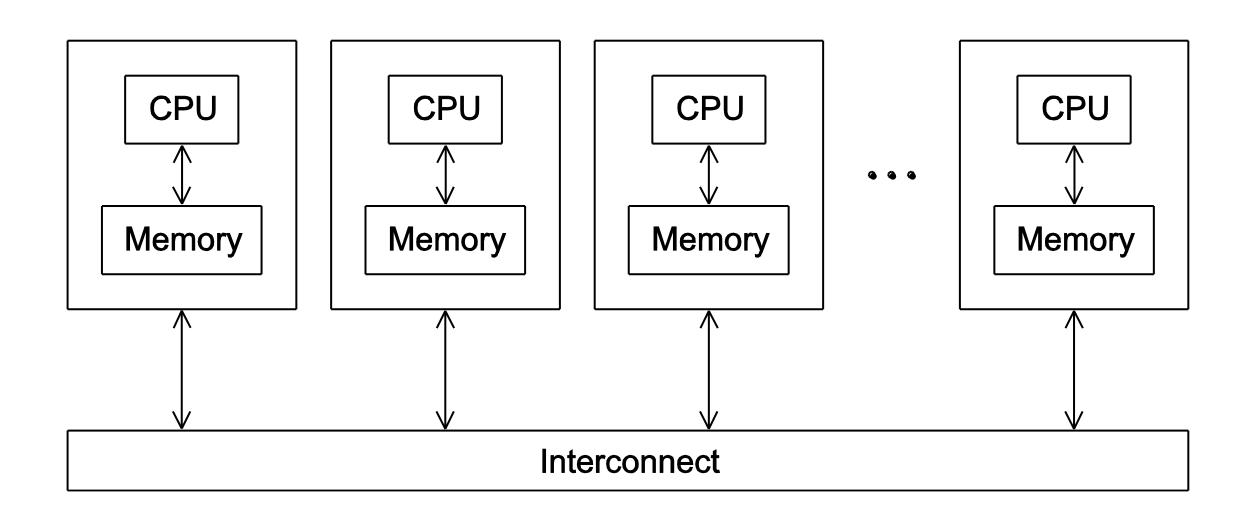
Recap

## Recap

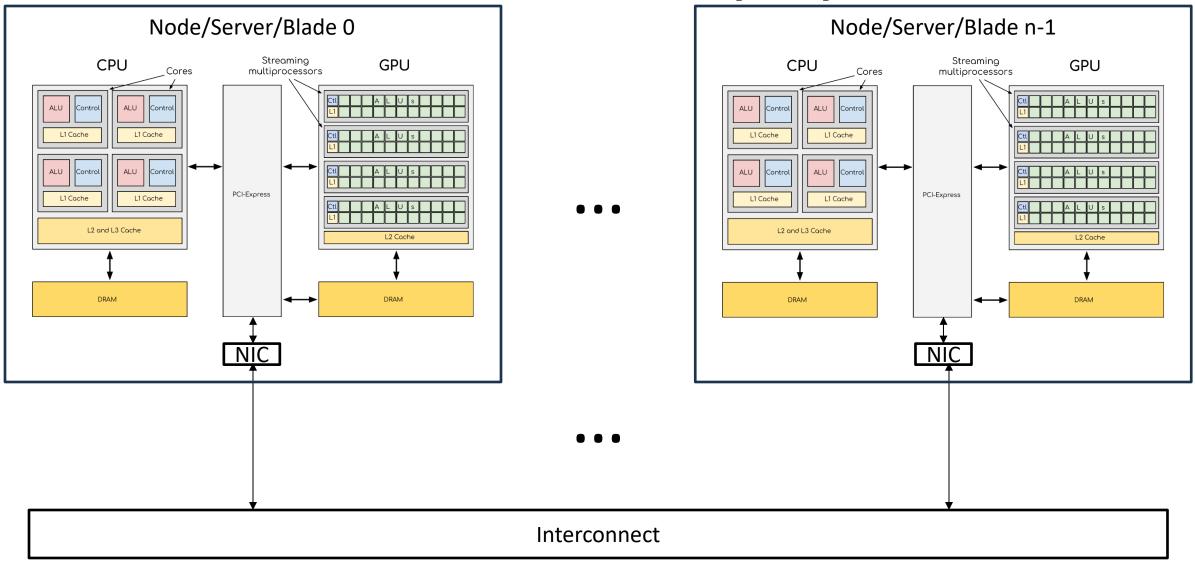
- MPI assumes a distributed memory model
- Cooperation happens through message exchange
- Point-to-point (send/recv) and collectives
- Custom (user-defined) datatypes
- Much more beyond that:
  - communicator creation
  - topologies
  - one-sided operations
  - non-blocking collectives (MPI\_Ibcast, etc...)
  - etc...

Questions?

## Distributed Memory Systems



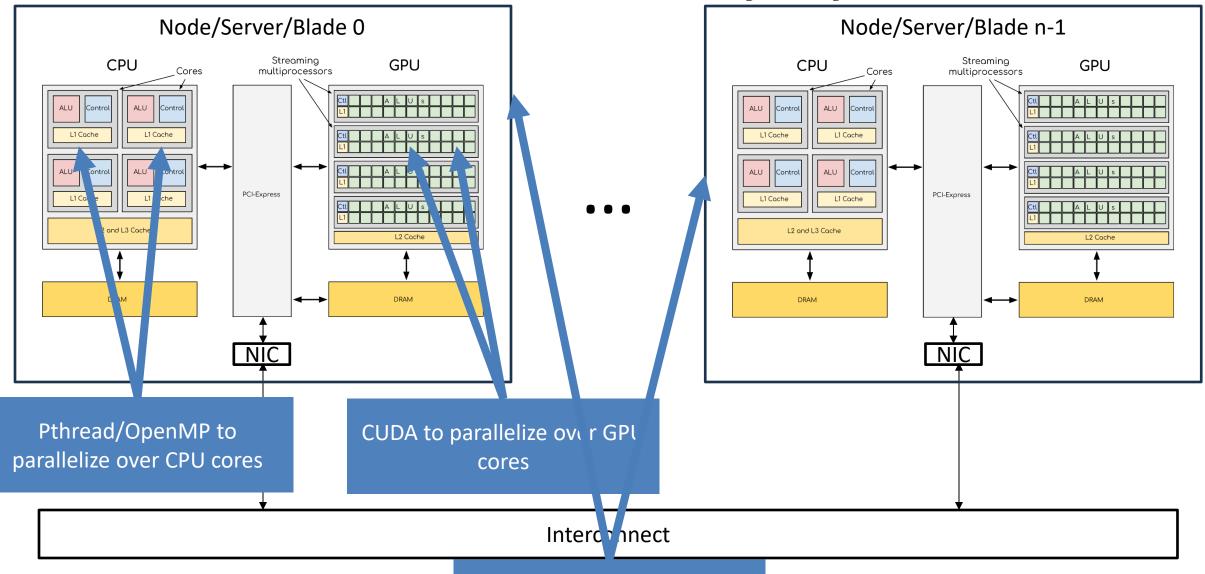
Distributed Memory Systems



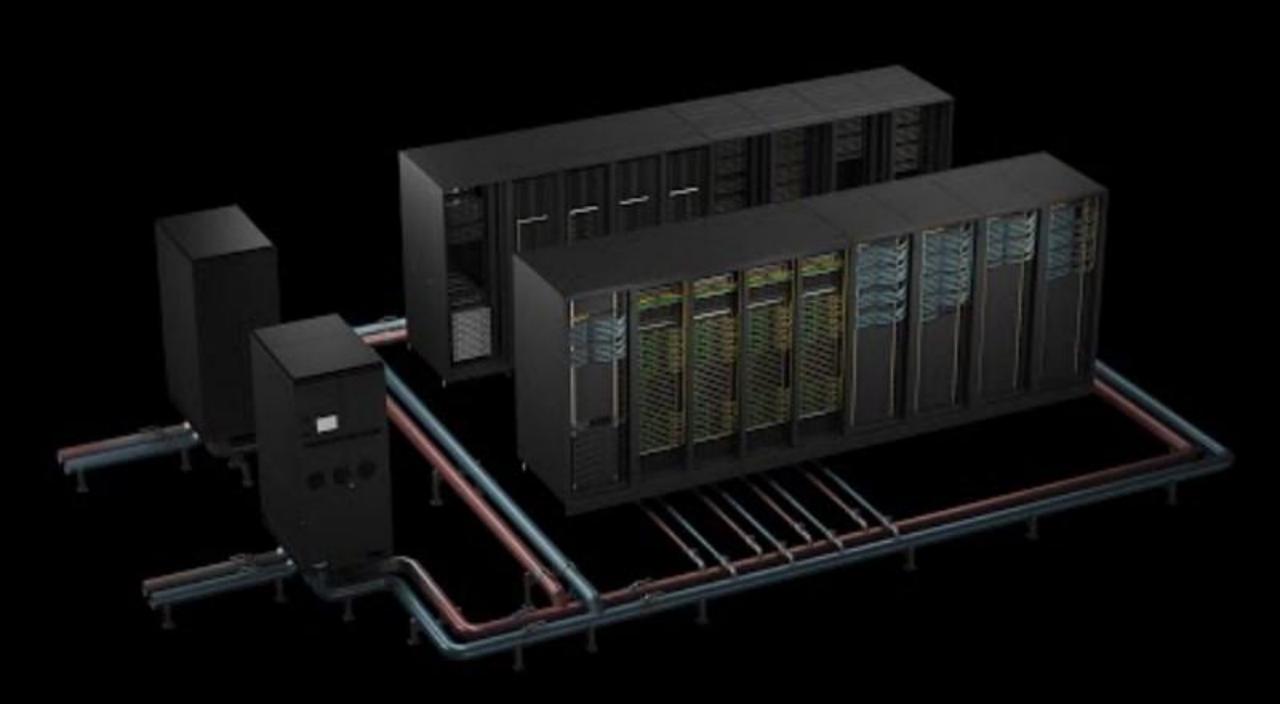
Note: We can have more than one GPU per node (today, up to 4)

Note 2: We can have more than one NIC per node (today, one per GPU/one every 2 GPUs)

## Distributed Memory Systems



MPI to parallelize over nodes





Rank	System	Cores	Rmax (PFlop/s)	Rpeak (PFlop/s)	Power (kW)
1	Frontier - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, HPE DOE/SC/Oak Ridge National Laboratory United States	8,699,904	1,206.00	1,714.81	22,786
2	Aurora - HPE Cray EX - Intel Exascale Compute Blade, Xeon CPU Max 9470 52C 2.4GHz, Intel Data Center GPU Max, Slingshot-11, Intel DOE/SC/Argonne National Laboratory United States	9,264,128	1,012.00	1,980.01	38,698
3	Eagle - Microsoft NDv5, Xeon Platinum 8480C 48C 2GHz, NVIDIA H100, NVIDIA Infiniband NDR, Microsoft Azure Microsoft Azure United States	2,073,600	561.20	846.84	
4	Supercomputer Fugaku - Supercomputer Fugaku, A64FX 48C 2.2GHz, Tofu interconnect D, Fujitsu RIKEN Center for Computational Science Japan	7,630,848	442.01	537.21	29,899
5	<b>LUMI</b> - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, HPE EuroHPC/CSC Finland	2,752,704	379.70	531.51	7,107
6	Alps - HPE Cray EX254n, NVIDIA Grace 72C 3.1GHz, NVIDIA GH200 Superchip, Slingshot-11, HPE Swiss National Supercomputing Centre (CSCS) Switzerland	1,305,600	270.00	353.75	5,194
7	Leonardo - BullSequana XH2000, Xeon Platinum 8358 32C 2.6GHz, NVIDIA A100 SXM4 64 GB, Quad-rail NVIDIA HDR100 Infiniband, EVIDEN EuroHPC/CINECA Italy	1,824,768	241.20	306.31	7,494
8	MareNostrum 5 ACC - BullSequana XH3000, Xeon Platinum 8460Y+ 32C 2.3GHz, NVIDIA H100 64GB, Infiniband NDR, EVIDEN EuroHPC/BSC Spain	663,040	175.30	249.44	4,159

# Top500 List (top500.org)

Questions?

Chapter 4

Shared Memory Programming with Pthreads



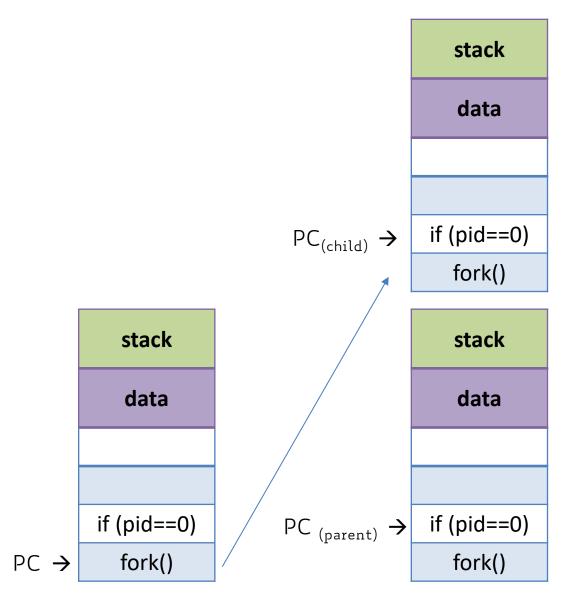
## Roadmap

- Problems programming shared memory systems.
- Controlling access to a critical section.
- Thread synchronization.
- Programming with POSIX threads.
- Mutexes.
- Producer-consumer synchronization and semaphores.
- Barriers and condition variables.
- Read-write locks.
- Thread safety.

#### Processes and Threads

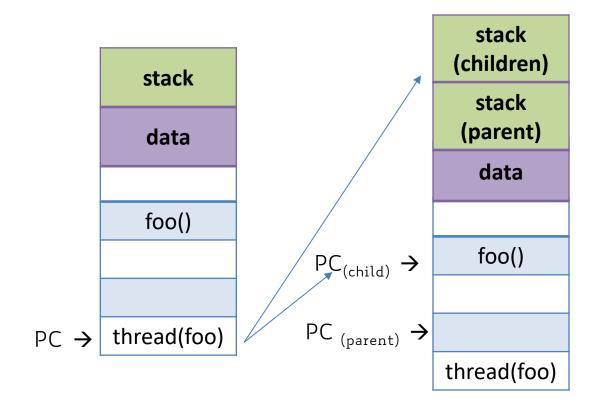
- A process is an instance of a running (or suspended) program.
- Threads are analogous to a "light-weight" process.
- In a shared memory program a single process may have multiple threads of control.

## Memory layout: process



N.B.: modern OSes usually use COW (copy-on-write) policy to optimize memory allocation

## Memory layout: thread

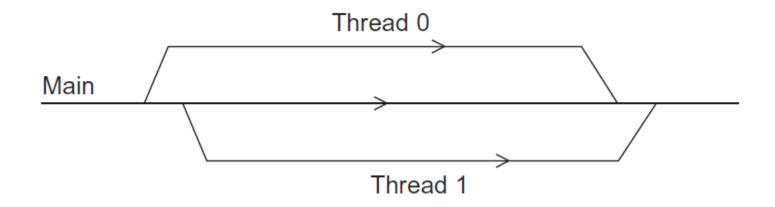




#### POSIX®Threads

- Also known as Pthreads.
- A standard for Unix-like operating systems.
- A library that can be linked with C programs.
- Specifies an application programming interface (API) for multi-threaded programming.
- The Pthreads API is only available on POSIX systems Linux, MacOS X, Solaris, HPUX, ...

## Running the Threads



Main thread forks and joins two threads.

- Processes in MPI are started by mpirun/mpiexec
- In Pthreads the threads are started directly by the program executable.

- It is an handle (one per thread). I.e., an "object" representing a thread
- Must be allocated before the call
- Opaque
- The actual data that they store is system-specific.
- Their data members aren't directly accessible to user code.
- However, the Pthreads standard guarantees that a pthread\_t object does store enough information to uniquely identify the thread with which it's associated.

We won't use it, just set it to NULL

- The function the thread is going to execute
- It is a **pointer** to a function (the address of a piece of memory containing code rather than data)
- In this case, we need a function returning a void\* and taking as argument a void\*

#### Function Pointer in C

- In C, like normal data pointers (int \*, char \*, etc), we can have pointers to functions.
- A function's name can be used to get functions' address.

```
void func(int a)
   printf("a=%d\n", a);
void main()
  void(*func ptr)(int) = func;
   *func ptr(10);
   printf("addr of func is: %p\n", func ptr);
```

#### Function started by pthread\_create

Prototype:
 void\* thread\_function (void\* args\_p);

- Void\* can be cast to any pointer type in C.
- So args\_p can point to a list containing one or more values needed by thread\_function.

 Similarly, the return value of thread\_function can point to a list of one or more values.

Pointer to the data that will be passed to start\_routine

```
void* func(void* a)
{
    int* px = (int*) a;
    int x = *px;
    printf("x=%d\n", x);
}

void main()
{
    ...
    int x = 2;
    pthread_create(...,..., func, (void*) &x);
    ...
}
```

### Recap

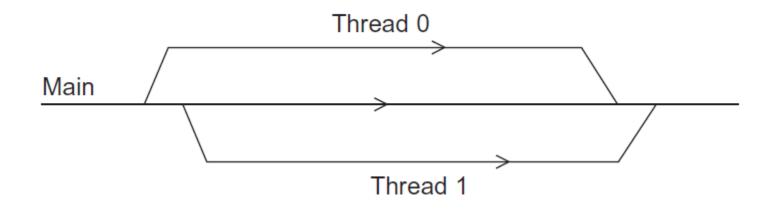
#### Global variables

- Can introduce subtle and confusing bugs!
- Limit use of global variables to situations in which they're really needed.
  - Shared variables.

```
int q; // Visible both from func and main
void* func(void* a)
   int* px = (int*) a;
    int x = *px;
    printf("x=%d\n", x);
void main()
    int x = 2;
    pthread create(...,...,func, (void*) &x);
```

Questions?

## Running the Threads



Main thread forks and joins two threads.

## Waiting for the Threads to finish

- We call the function <a href="pthread\_join">pthread\_join</a> once for each thread.
- A single call to pthread\_join will wait for the thread associated with the pthread\_t object to complete.

```
int pthread_join(pthread_t thread, void **value_ptr)
```

 value\_ptr (if not NULL) has return value of the thread function

## Correct way to wait for thread completion

```
for(int i = 0; i < num_threads; i++) {
    pthread_create(...);
}

for(int i = 0; i < num_threads; i++) {
    pthread_join(...);
}</pre>
```

VS.

```
for(int i = 0; i < num_threads; i++) {
    pthread_create(...);
    pthread_join(...);
}</pre>
```

#### **Correct**

Wrong (everything would be executed sequentially)

#### Thread identification

```
pthread_self provides the thread ID of the calling thread
pthread_t pthread_self(void);
```

```
pthread_equal compares thread IDs
```

```
int pthread_equal(pthread_t t1, pthread_t t2);
```

Example - Hello World

## Hello World! (1)

```
void *Hello(void* rank) {
  long my_rank = (long) rank; /* Use long in case of 64-bit system */
  printf("Hello from thread %ld of %d\n", my_rank, thread_count);
  return NULL;
} /* Hello */
```

## Hello World! (2)

```
declares the various Pthreads
#include < stdio. h>
                                      functions, constants, types, etc.
#include < stdlib.h>
#include <pthread.h>
/* Global variable: accessible to all threads */
int thread_count;
void *Hello(void* rank); /* Thread function */
int main(int argc, char* argv[]) {
              thread; /* Use long in case of a 64-bit system */
   pthread_t* thread_handles;
   /* Get number of threads from command line */
   thread_count = strtol(argv[1], NULL, 10);
   thread_handles = malloc (thread_count*sizeof(pthread_t));
```

## Hello World! (3)

```
for (thread = 0; thread < thread_count; thread++)</pre>
   pthread_create(&thread_handles[thread], NULL,
       Hello, (void*) thread);
printf("Hello from the main thread\n");
for (thread = 0; thread < thread_count; thread++)</pre>
   pthread_join(thread_handles thread], NULL);
free(thread_handles);
return 0;
/* main */
                         Dangerous. What if sizeof(void*) < sizeof(long)?
```

## Compiling a Pthread program

gcc -g -Wall -o pth\_hello pth\_hello . c -lpthread

link in the Pthreads library

## Running a Pthreads program

```
pth_hello <number of threads>
./ pth_hello 1
         Hello from the main thread
         Hello from thread O of 1
. / pth_hello 4
          Hello from the main thread
          Hello from thread O of 4
          Hello from thread 1 of 4
          Hello from thread 2 of 4
          Hello from thread 3 of 4
```

Threads execute in parallel, the order of the prints is not guaranteed

## More complex thread args



main

#### Caveats

To keep the code simpler, I did not explicitly check for erros

- What if the program is called without command line arguments?
- What if one of the pthread functions fail?

Questions?

a <sub>00</sub>	$a_{01}$		$a_{0,n-1}$
$a_{10}$	$a_{11}$	:	$a_{1,n-1}$
:	:		:
$a_{i0}$	$a_{i1}$		$a_{i,n-1}$
<i>a</i> <sub>i0</sub> :	<i>a</i> <sub>i1</sub> :		<i>a<sub>i,n-1</sub></i>

$$\begin{array}{c}
x_0 \\
x_1 \\
\vdots \\
x_{n-1}
\end{array} = 
\begin{array}{c}
y_0 \\
y_1 \\
\vdots \\
y_i = a_{i0}x_0 + a_{i1}x_1 + \cdots + a_{i,n-1}x_{n-1} \\
\vdots \\
y_{m-1}
\end{array}$$

#### MATRIX-VECTOR MULTIPLICATION IN PTHREADS

## Serial pseudo-code

```
/* For each row of A */
for (i = 0; i < m; i++) {
    y[i] = 0.0;
    /* For each element of the row and each element of x */
    for (j = 0; j < n; j++)
        y[i] += A[i][j]* x[j];
}</pre>
```

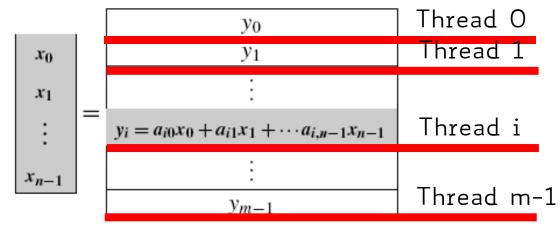
$$y_i = \sum_{j=0}^{n-1} a_{ij} x_j$$

How to do this in parallel?

Partition the matrix (by row) among threads, replicate the vector

#### Intuition

$a_{00}$	$a_{01}$		$a_{0,n-1}$
$a_{10}$	$a_{11}$	• • •	$a_{1,n-1}$
::	:		:
$a_{i0}$	$a_{i1}$		$a_{i,n-1}$
<i>a</i> <sub>i0</sub> :	<i>a</i> <sub>i1</sub> :		<i>a<sub>i,n-1</sub></i>



- In principle, you should try to avoid having more threads than cores
- There are situations where it might make sense (we'll discuss those later)
- Anyway, in general you will partition the *m* rows across *t* threads, with t < m
- Each processes m/t rows
- Thread q processes rows starting from  $q \times \frac{m}{t}$  to  $(q+1) \times \frac{m}{t} 1$
- Note: We do not need to do scatter/broadcast, every thread accesses the same memory/matrix/vector

#### Pthreads matrix-vector multiplication

```
void *Pth_mat_vect(void* rank) {
   long my_rank = (long) rank;
   int i, j;
   int local_m = m/thread_count;
   int my_first_row = my_rank*local_m;
   int my_last_row = (my_rank+1)*local_m - 1;
   for (i = my_first_row; i <= my_last_row; i++) {</pre>
      y[i] = 0.0;
      for (j = 0; j < n; j++)
          y[i] += A[i][i]*x[i];
   return NULL;
  /* Pth_mat_vect */
```

## How many threads should we run?

- In principle, you should try to avoid having more threads than cores
- There are situations where it might make sense (we'll discuss those later)
- How to check how many cores do you have?

```
$ lscpu | grep -E '^Thread|^Core|^Socket|^CPU\('CPU\(s): 32
Thread(s) per core: 2
Core(s) per socket: 8
Socket(s): 2
```

Questions?

#### Critical Sections

## Estimating $\pi$

$$\pi = 4\left(1 - \frac{1}{3} + \frac{1}{5} - \frac{1}{7} + \dots + (-1)^n \frac{1}{2n+1} + \dots\right)$$

```
double factor = 1.0;
double sum = 0.0;
for (i = 0; i < n; i++, factor = -factor) {
    sum += factor/(2*i+1);
}
pi = 4.0*sum;</pre>
```

Parallel algorithm: each thread computes a subset of that series

#### A thread function for computing $\pi$

```
void* Thread_sum(void* rank) {
  long my_rank = (long) rank;
  double factor;
  long long i;
  long long my_n = n/thread_count;
  long long my_first_i = my_n*my_rank;
  long long my_last_i = my_first_i + my_n;
```

```
return NULL;
/* Thread_sum */
```

## Using a dual core processor

n			
$10^{5}$	$10^{6}$	$10^{7}$	$10^{8}$
3.14159	3.141593	3.1415927	3.14159265
3.14158	3.141592	3.1415926	3.14159264
3.14158	3.141480	3.1413692	3.14164686
	3.14159 3.14158	3.14159     3.141593       3.14158     3.141592	3.14159     3.141593     3.1415927       3.14158     3.141592     3.1415926

Note that as we increase n, the estimate with two threads diverge from the real value

#### A thread function for computing $\pi$

```
void* Thread_sum(void* rank) {
                                     long my_rank = (long) rank;
                                     double factor:
                                     long long i;
                                     long long my_n = n/thread_count;
                                     long long my_first_i = my_n*my_rank;
                                     long long my_last_i = my_first_i + my_n;
                                      if (my\_first\_i \% 2 == 0) /* my\_first\_i is even */
                                        factor = 1.0;
                                      else /* my_first_i is odd */
                                        factor = -1.0;
4. Compute sum + factor/(2i + 1)
                                      for (i = mv first i: i < my_last_i; i++, factor = -factor) {
                                         sum += factor/(2*i+1);
```

```
return NULL;
/* Thread_sum */
```

1. Load 'factor' into register

5. Store the result into 'sum'

3. Load 'sum' into register

2. Load 'i' into register

```
y = Compute(my_rank);
x = x + y;
```

```
y = Compute(my_rank);
x = x + y;
```

Time	Thread 0	Thread 1
1	Started by main thread	

```
y = Compute(my_rank);
x = x + y;
```

Time	Thread 0	Thread 1
1	Started by main thread	
2	Call Compute ()	Started by main thread

```
y = Compute(my_rank);
x = x + y;
```

Time	Thread 0	Thread 1
1	Started by main thread	
2	Call Compute ()	Started by main thread
3	Assign y = 1	Call Compute()

```
y = Compute(my_rank);
x = x + y;
```

Time	Thread 0	Thread 1
1	Started by main thread	
2	Call Compute ()	Started by main thread
3	Assign y = 1	Call Compute()
4	Put x=0 and y=1 into registers	Assign $y = 2$

```
y = Compute(my_rank);
x = x + y;
```

Time	Thread 0	Thread 1
1	Started by main thread	
2	Call Compute ()	Started by main thread
3	Assign y = 1	Call Compute()
4	Put x=0 and y=1 into registers	Assign $y = 2$
5	Add 0 and 1	Put x=0 and y=2 into registers

```
y = Compute(my_rank);
x = x + y;
```

Time	Thread 0	Thread 1
1	Started by main thread	
2	Call Compute ()	Started by main thread
3	Assign y = 1	Call Compute()
4	Put x=0 and y=1 into registers	Assign $y = 2$
5	Add 0 and 1	Put x=0 and y=2 into registers
6	Store 1 in memory location x	Add 0 and 2

```
y = Compute(my_rank);
x = x + y;
```

Time	Thread 0	Thread 1
1	Started by main thread	
2	Call Compute ()	Started by main thread
3	Assign y = 1	Call Compute()
4	Put x=0 and y=1 into registers	Assign $y = 2$
5	Add 0 and 1	Put x=0 and y=2 into registers
6	Store 1 in memory location x	Add 0 and 2
7		Store 2 in memory location x

Questions?

## Possible solution: Busy-Waiting

• A thread repeatedly tests a condition, but, effectively, does no useful work until the condition has the appropriate value.

## Possible danger: Optimizing compilers

```
This code: y = Compute(my_rank);
    while (flag != my_rank);
    x = x + y;
    flag++;
```

Could be rearranged by the compiler as:

```
y = Compute(my_rank);
x = x + y;
while (flag != my_rank);
flag++;
```

(the compiler does not know if the code is going to use threads or not. It might rearrange the code this way because it might believe that it is going to make a better use of registers)

#### Pthreads global sum with busy-waiting

```
void* Thread_sum(void* rank) {
   long my_rank = (long) rank;
   double factor:
   long long i;
   long long my n = n/thread count;
   long long my_first_i = my_n*my_rank;
   long long my_last_i = my_first_i + my_n;
   if (my first i \% 2 == 0)
      factor = 1.0;
   else
      factor = -1.0;
   for (i = my_first_i; i < my_last_i; i++, factor = -factor) {</pre>
      while (flag != my_rank);
      sum += factor/(2*i+1);
      flag = (flag+1) \% thread count;
  return NULL;
  /* Thread_sum */
```

If I run this with n threads, this is slower than sequential code, why?

#### Global sum function with critical section after loop

```
void* Thread_sum(void* rank) {
   long my_rank = (long) rank;
   double factor, my_sum = 0.0;
   long long i;
   long long my_n = n/thread_count;
   long long my_first_i = my_n*my_rank;
   long long my_last_i = my_first_i + my_n;
   if (my_first_i \% 2 == 0)
      factor = 1.0;
   else
      factor = -1.0;
   for (i = my_first_i; i < my_last_i; i++, factor = -factor)
      my_sum += factor/(2*i+1);
   while (flag != my_rank);
   sum += my_sum;
   flag = (flag+1) % thread_count;
   return NULL;
   /* Thread_sum */
```

Questions?

- A thread that is busy-waiting may continually use the CPU accomplishing nothing.
- Mutex (mutual exclusion) is a special type of variable that can be used to restrict access to a critical section to a single thread at a time.

 Used to guarantee that one thread "excludes" all other threads while it executes the critical section.

• The Pthreads standard includes a special type for mutexes: pthread\_mutex\_t.

When a Pthreads program finishes using a mutex, it should call

```
int pthread_mutex_destroy(pthread_mutex_t* mutex_p /* in/out */);
```

In order to gain access to a critical section a thread calls

```
int pthread_mutex_lock(pthread_mutex_t* mutex_p /* in/out */);
```

 When a thread is finished executing the code in a critical section, it should call

```
int pthread_mutex_unlock(pthread_mutex_t* mutex_p /* in/out */);
```

The non blocking version of lock is:

```
int pthread_mutex_trylock(pthread_mutex_t* mutex_p /* in/out */);
```

#### Starvation

- Starvation happens when the execution of a thread or a process is suspended or disallowed for an indefinite amount of time, although it is capable of continuing execution.
- Starvation is typically associated with enforcing of priorities or the lack of fairness in scheduling or access to resources.
- If a mutex is locked, the thread is blocked and placed in a queue Q of waiting threads. If the queue Q employed by a semaphore is a FIFO queue, no starvation will occur.

#### Deadlocks

- Deadlock: is any situation in which no member of some group of entities can proceed because each waits for another member, including itself, to take action, such as sending a message or, more commonly, releasing a lock.
- E.g., locking mutexes in reverse order

```
/* Thread A */
pthread_mutex_lock(&mutex1);
pthread_mutex_lock(&mutex2);
/* Thread B */
pthread_mutex_lock(&mutex2);
pthread_mutex_lock(&mutex1);
```

#### Global sum function using mutex

```
void* Thread_sum(void* rank) {
   long my_rank = (long) rank;
   double factor;
   long long i;
   long long my_n = n/thread_count;
   long long my_first_i = my_n*my_rank;
   long long my_last_i = my_first_i + my_n;
   double my_sum = 0.0;
   if (my_first_i \% 2 == 0)
      factor = 1.0;
   else
      factor = -1.0;
   for (i = my_first_i; i < my_last_i; i++, factor = -factor) {</pre>
     my_sum += factor/(2*i+1);
   pthread_mutex_lock(&mutex);
   sum += my_sum;
   pthread mutex unlock(&mutex);
   return NULL;
   /* Thread_sum */
```

Threads	Busy-Wait	Mutex
1	2.90	2.90
2	1.45	1.45
4	0.73	0.73
8	0.38	0.38

Run-times (in seconds) of  $\pi$  programs using  $n=10^8$  terms on a system with two four-core processors.

In both cases, the critical section is outside the loop

Questions?

## Producer-consumer Synchronization and Semaphores

#### Issues

- Busy-waiting enforces the order threads access a critical section.
- Using mutexes, the order is left to chance and the system.
- There are applications where we need to control the order threads access the critical section.

Example: message exchange in a ring (receive from left, send to right)

```
/* messages has type char**. It's allocated in main. */
/* Each entry is set to NULL in main.
void *Send_msg(void* rank) {
   long my_rank = (long) rank;
   long dest = (my_rank + 1) % thread_count;
   long source = (my_rank + thread_count - 1) % thread_count;
   char* my_msq = malloc(MSG_MAX*sizeof(char));
   sprintf(my_msg, "Hello to %ld from %ld", dest, my_rank);
   messages[dest] = my_msq;
   if (messages[my_rank] != NULL)
      printf("Thread %ld > %s\n", my_rank, messages[my_rank]);
   else
      printf("Thread %ld > No message from %ld\n", my_rank, source);
   return NULL;
  /* Send_msg */
```

**Issue:** Some threads might read messages[dest] before the other thread put something in there

#### How to fix it?

 We could fix it with busy waiting, but would have the same problems discussed before

```
while (messages[my rank] == NULL);
    printf("Thread %ld > %s\n", my
        rank, messages[my rank]);
```

- In principle it is possible to fix it with mutex (but in a complex way)
- POSIX provides a better way: semaphores (it is not part of pthread, could be not available on macOS)

#### Syntax of the various semaphore functions

```
Semaphores are not part of
                         Pthreads;
#include <semaphore.h>
                           you need to add this.
int sem_init(
     sem_t* semaphore_p /* out */,
     int shared /*in */,
     unsigned initial_val /* in */);
 Semaphores can be shared also
 among processes (shared !=0)
int sem_destroy(sem_t* semaphore_p /* in/out */);
int sem_post(sem_t* semaphore_p /* in/out */);
int sem_wait(sem_t* semaphore_p /* in/out */);
```

## Semaphores

sem\_wait(sem\_t \*sem) blocks if the semaphore is O. If the semaphore is
> O, it will decrement the semaphore and proceed.

sem\_post(sem\_t \*sem) if there is a a thread waiting in sem\_wait(), that thread can proceed with the execution. Otherwise, the semaphore is incremented.

sem\_getvalue(sem\_t \*sem, int \*sval) places the current value of the semaphore pointed to sem into the integer pointed to by sval.

#### Notes:

- Mutexes are binary. Semaphores are unsigned int.
- Mutexes start unlocked. Semaphores start with initial value.
- Mutexes are usually locked/unlocked by the same thread. Semaphores are usually increased/decreased by different threads.

# Program 4.8: Using semaphores so that threads can send messages

```
/* messages is allocated and initialized to NULL in main */
   /* semaphores is allocated and initialized to 0 (locked) in
         main */
   void* Send_msg(void* rank) {
      long my_rank = (long) rank;
      long dest = (my_rank + 1) % thread_count;
      char* my_msg = malloc(MSG_MAX*sizeof(char));
      sprintf(my_msg, "Hello to %ld from %ld", dest, my_rank);
      messages[dest] = my_msg;
      sem_post(&semaphores[dest])
            /* ''Unlock'' the semaphore of dest */
11
      /* Wait for our semaphore to be unlocked */
13
      sem_wait(&semaphores[my_rank]);
      printf("Thread %ld > %s\n", my_rank, messages[my_rank]);
14
15
      return NULL:
      /* Send_msg */
```

Note: This problem does not have a critical section. It has a type of synchronization known as producer-consumer