## Parallel Models

Different ways to exploit parallelism













### **Outline**

- Shared-Variables Parallelism
  - threads
  - shared-memory architectures
- Message-Passing Parallelism
  - processes
  - distributed-memory architectures
- Practicalities
  - compilers
  - libraries
  - usage on real HPC architectures





### **Shared Variables**

Threads-based parallelism





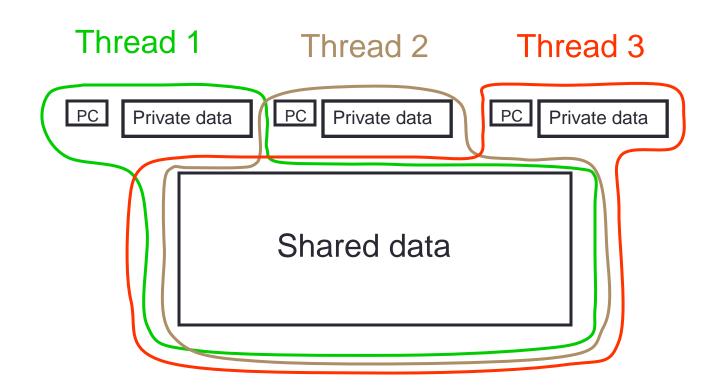
## **Threaded Programming Model**

- Programming model for shared memory based on threads
  - threads are like processes, except that threads can share memory with each other (as well as having private memory)
- Shared data can be accessed by all threads
  - Private data can only be accessed by the owning thread
- Different threads can follow different flows of control through the same program
  - each thread has its own program counter
- Usually run one thread per CPU/core
  - but could be more
  - can have hardware support for multiple threads per core





## Threads (cont.)

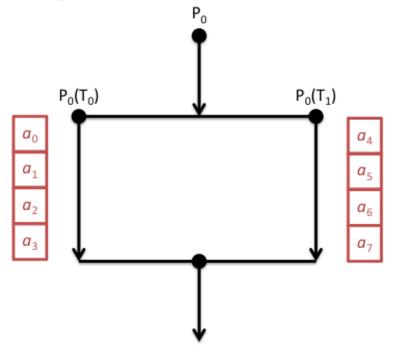






## Shared-memory concepts

- Have already covered basic concepts
  - threads can all see data of parent process
  - can run on different cores
  - potential for parallel speedup

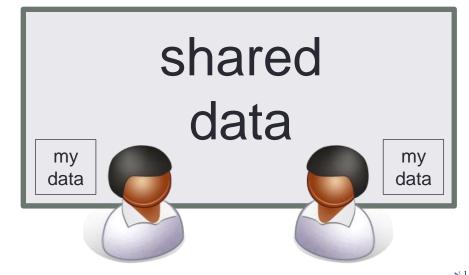






## Analogy

- One very large whiteboard in a two-person office
  - the shared memory
- Two people working on the same problem
  - the threads running on different cores attached to the memory
- How do they collaborate?
  - working together
  - but not interfering
- Also need private data







### **Thread Communication**

#### Thread 1

Thread 2

Program

$$mya=23$$

$$mya=a+1$$

Private data

23

24

Shared data







## Synchronisation

- By default, threads execute asynchronously
- Each thread proceeds through program instructions independently of other threads
- This means we need to ensure that actions on shared variables occur in the correct order: e.g.

thread 1 must write variable A before thread 2 reads it,

or

thread 1 must read variable A before thread 2 writes it.

- Note that updates to shared variables (e.g. a = a + 1) are not atomic!
- If two threads try to do this at the same time, one of the updates may get overwritten.





## Synchronisation example

#### Thread 1

#### Thread 2

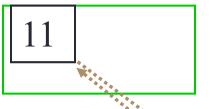
Program

load a add a 1 store a

load a
add a 1
store a

CPU

Registers



11

Memory





## Synchronisation

- Synchronisation crucial for shared variables approach
  - thread 2's code must execute after thread 1
- Most commonly use global barrier synchronisation
  - other mechanisms such as locks also available
- Writing parallel codes relatively straightforward
  - access shared data as and when its needed
- Getting correct code can be difficult!





## Parallel loops

- Loops are the main source of parallelism in many applications.
- If the iterations of a loop are independent (can be done in any order) then
  we can share out the iterations between different threads.
- e.g. if we have two threads and the loop

```
for (i=0; i<100; i++) {
    a[i] += b[i];
}</pre>
```

we could do iteration 0-49 on one thread and iterations 50-99 on the other.

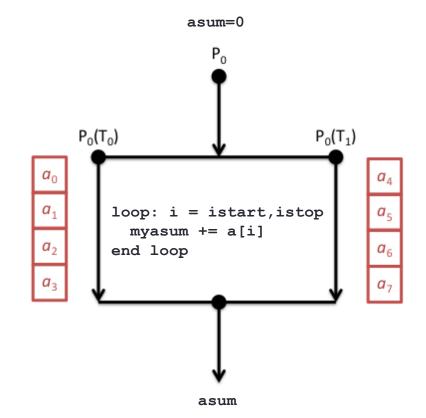
Can think of an iteration, or a set of iterations, as a task.





## Specific example

- Computing  $asum = a_0 + a_1 + ... a_7$ 
  - shared:
    - main array: a [8]
    - result: asum
  - private:
    - loop counter: i
    - loop limits: istart, istop
    - local sum: myasum
  - synchronisation:
    - thread0: asum += myasum
    - barrier
    - thread1: asum += myasum







#### Reductions

• A *reduction* produces a single value from associative operations such as addition, multiplication, max, min, and, or.

```
asum = 0;
for (i=0; i<n; i++)
    asum += a[i];</pre>
```

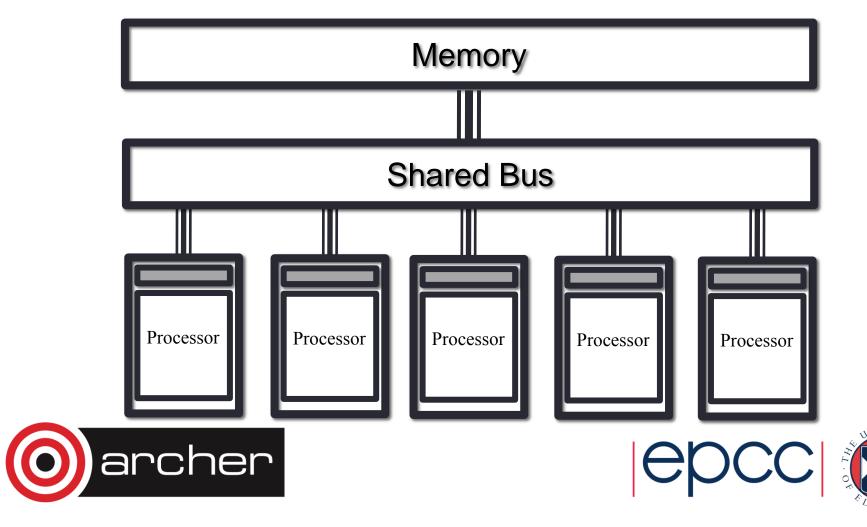
- Only one thread at a time updating asum removes all parallelism
  - each thread accumulates own private copy; copies reduced to give final result.
  - if the number of operations is much larger than the number of threads, most of the operations can proceed in parallel
- Want common patterns like this to be automated
  - not programmed by hand as in previous slide





### Hardware

Needs support of a shared-memory architecture



## Threads: Summary

- Shared blackboard a good analogy for thread parallelism
- Requires a shared-memory architecture
  - in HPC terms, cannot scale beyond a single node
- Threads operate independently on the shared data
  - need to ensure they don't interfere; synchronisation is crucial
- Threading in HPC usually uses OpenMP directives
  - supports common parallel patterns such as reductions
  - e.g. loop limits computed by the compiler
  - e.g. summing values across threads done automatically





## Message Passing

Process-based parallelism





## Analogy

- Two whiteboards in different single-person offices
  - the distributed memory
- Two people working on the same problem
  - the processes on different nodes attached to the interconnect
- How do they collaborate?
  - to work on single problem
- Explicit communication
  - e.g. by telephone
  - no shared data









### Process communication

#### Process 1

a = 23

Send (2, a)

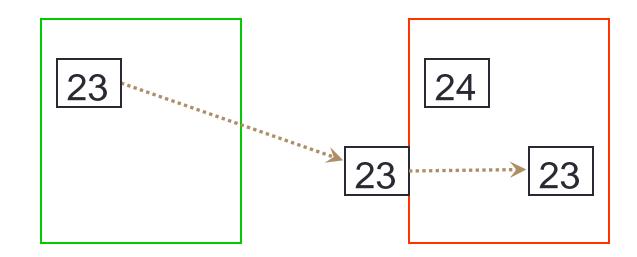
#### Process 2

Recv(1,b)

a=b+1

Data

Program







## Synchronisation

- Synchronisation is automatic in message-passing
  - the messages do it for you
- Make a phone call ...
  - ... wait until the receiver picks up
- Receive a phone call
  - ... wait until the phone rings
- No danger of corrupting someone else's data
  - no shared blackboard





### Communication modes

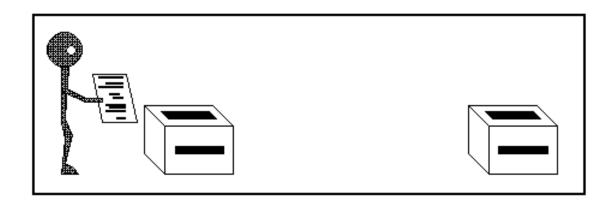
- Sending a message can either be synchronous or asynchronous
- A synchronous send is not completed until the message has started to be received
- An asynchronous send completes as soon as the message has gone
- Receives are usually synchronous the receiving process must wait until the message arrives





## Synchronous send

- Analogy with faxing a letter.
- Know when letter has started to be received.

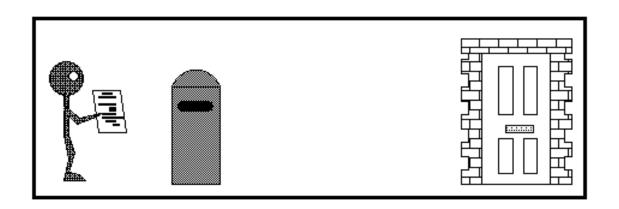






## Asynchronous send

- Analogy with posting a letter.
- Only know when letter has been posted, not when it has been received.







### Point-to-Point Communications

- We have considered two processes
  - one sender
  - one receiver
- This is called point-to-point communication
  - simplest form of message passing
  - relies on matching send and receive
- Close analogy to sending personal emails





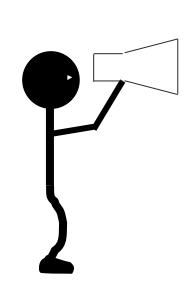
### Collective Communications

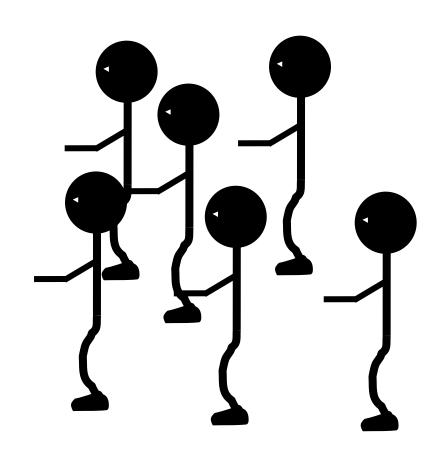
- A simple message communicates between two processes
- There are many instances where communication between groups of processes is required
- Can be built from simple messages, but often implemented separately, for efficiency





## Broadcast: one to all communication



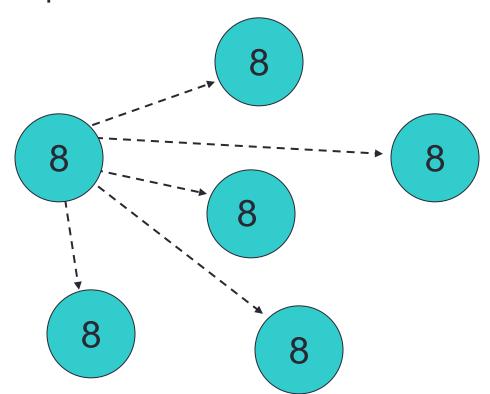






### **Broadcast**

From one process to all others

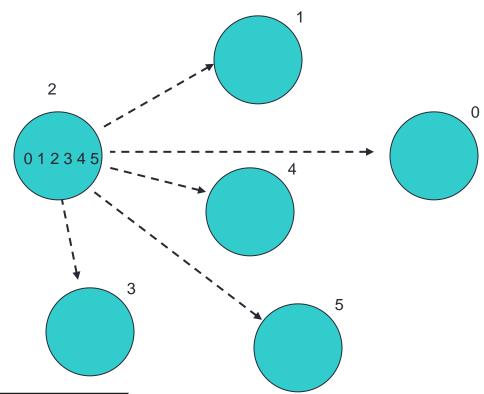






### Scatter

Information scattered to many processes

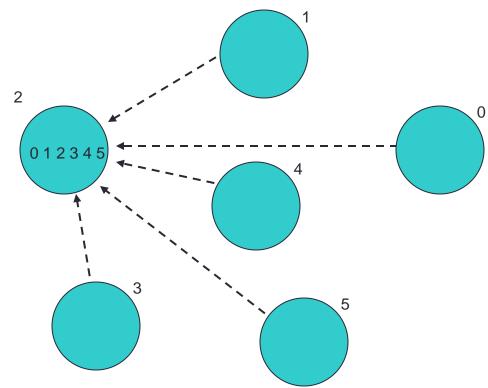






## Gather

Information gathered onto one process



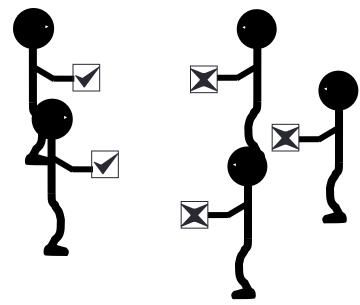




## Reduction Operations

Combine data from several processes to form a single result

Strike?

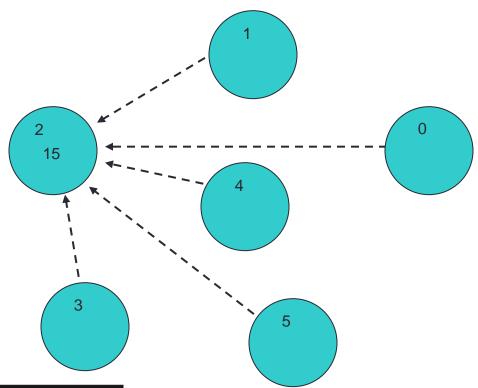






### Reduction

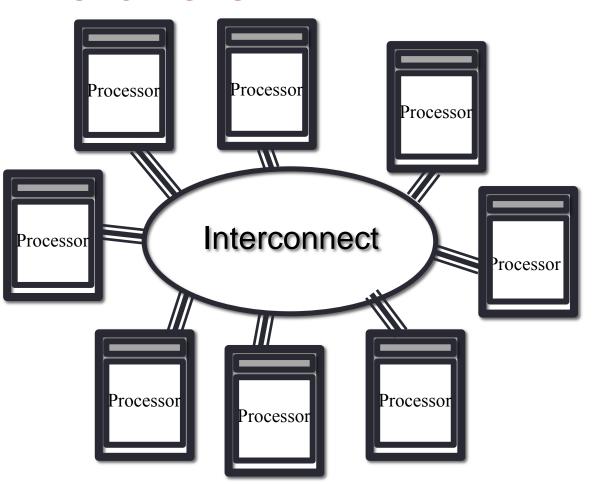
• Form a global sum, product, max, min, etc.







### Hardware



- Natural map to distributed-memory
  - one process per processor-core
  - messages go over the interconnect, between nodes/OS's





## **Programming Models**

#### **Serial Programming**

#### **Concepts**

Arrays

Control flow

Subroutines

Variables

OO

# Python Java Fortran

if/then/else

#### **Implementations**

gcc -O3 icc pgcc -fast crayftn craycc javac

# Message-Passing Parallel Programming

#### Concepts

Processes
Groups Send/Receive
SPMD Collectives

#### Libraries

**MPI** 

MPI Init()

#### **Implementations**

MPICH2 Intel MPI

Cray MPI

OpenMPI IBM MPI





### SPMD

- Most message passing programs use the Single-Program-Multiple-Data (SPMD) model
- All processes run (their own copy of) the same program
- Each process has a separate copy of the data
- To make this useful, each process has a unique identifier
- Processes can follow different control paths through the program, depending on their process ID
- Usually run one process per processor / core





## Launching a Message-Passing Program

- Write a single piece of source code
  - with calls to message-passing functions such as send / receive
- Compile with a standard compiler and link to a messagepassing library provided for you
  - both open-source and vendor-supplied libraries exist
- Run multiple copies of same executable on parallel machine
  - each copy is a separate process
  - each has its own private data completely distinct from others
  - each copy can be at a completely different line in the program
- Running is usually done via a launcher program
  - "please run N copies of my executable called program.exe"





#### Issues

- Sends and receives must match
  - danger of deadlock
  - program will stall (forever!)
- Possible to write very complicated programs, but ...
  - most scientific codes have a simple structure
  - often results in simple communications patterns
- Use collective communications where possible
  - may be implemented in efficient ways





## Summary (i)

- Messages are the only form of communication
  - all communication is therefore explicit
- Most systems use the SPMD model
  - all processes run exactly the same code
  - each has a unique ID
  - processes can take different branches in the same codes
- Basic communications form is point-to-point
  - collective communications implement more complicated patterns that often occur in many codes





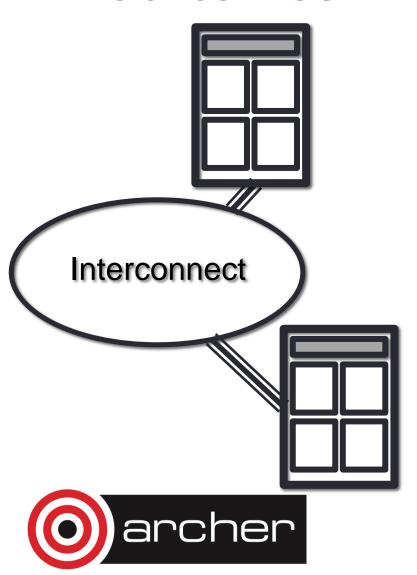
## Processes: Summary

- Processes cannot share memory
  - ring-fenced from each other
  - analogous to white boards in separate offices
- Communication requires explicit messages
  - analogous to making a phone call, sending an email, ...
  - synchronisation is done by the messages
- Almost exclusively use Message-Passing Interface
  - MPI is a library of function calls / subroutines





### **Practicalities**

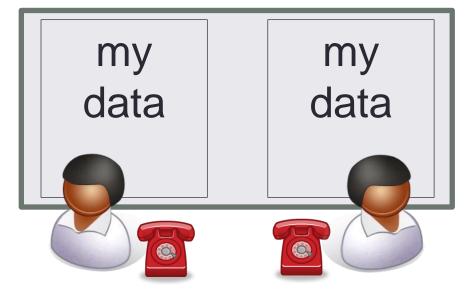


- 8-core machine might only have 2 nodes
  - how do we run MPI on a real HPC machine?
- Mostly ignore architecture
  - pretend we have single-core nodes
  - one MPI process per processor-core
  - e.g. run 8 processes on the 2 nodes
- Messages between processes on the same node are fast
  - but remember they also share access to the network



## Message Passing on Shared Memory

- Run one process per core
  - don't directly exploit shared memory
  - analogy is phoning your office mate
  - actually works well in practice!
- Message-passing programs run by a special job launcher
  - user specifies #copies
  - some control over allocation to nodes







## Summary

- Shared-variables parallelism
  - uses threads
  - requires shared-memory machine
  - easy to implement but limited scalability
  - in HPC, done using OpenMP compilers
- Distributed memory
  - uses processes
  - can run on any machine: messages can go over the interconnect
  - harder to implement but better scalability
  - on HPC, done using the MPI library



