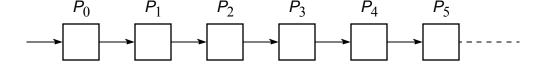
Pipelined Computations

Pipelined Computations

Problem divided into a series of tasks that have to be completed one after the other (the basis of sequential programming).

Each task executed by a separate process or processor.



Example

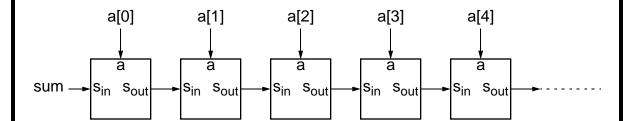
Add all the elements of array a to an accumulating sum:

```
for (i = 0; i < n; i++)
sum = sum + a[i];
```

The loop could be "unfolded" to yield

```
sum = sum + a[0];
sum = sum + a[1];
sum = sum + a[2];
sum = sum + a[3];
sum = sum + a[4];
```

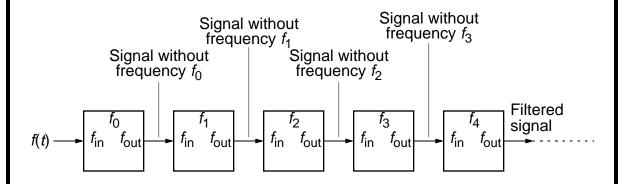
Pipeline for an unfolded loop



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Another Example

Frequency filter - Objective to remove specific frequencies (f_0 , f_1 , f_2 , f_3 , etc.) from a digitized signal, f(t). Signal enters pipeline from left:

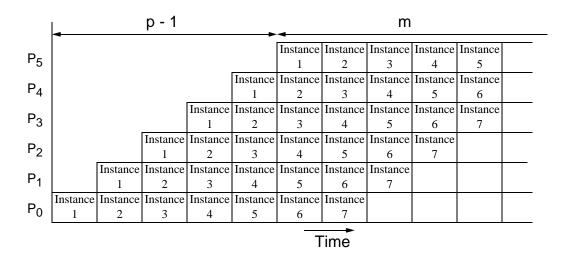


Where pipelining can be used to good effect

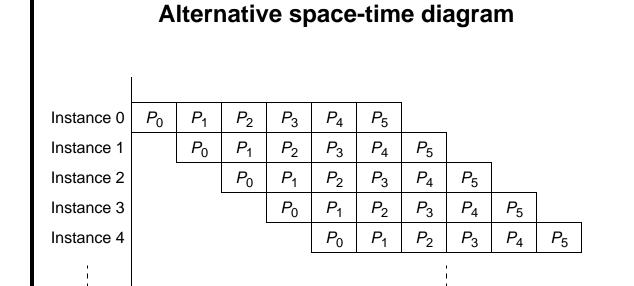
Assuming problem can be divided into a series of sequential tasks, pipelined approach can provide increased execution speed under the following three types of computations:

- 1. If more than one instance of the complete problem is to be executed
- 2. If a series of data items must be processed, each requiring multiple operations
- 3. If information to start the next process can be passed forward before the process has completed all its internal operations

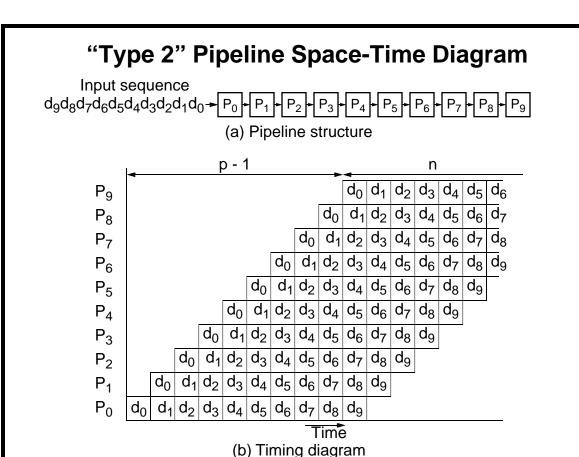
"Type 1" Pipeline Space-Time Diagram

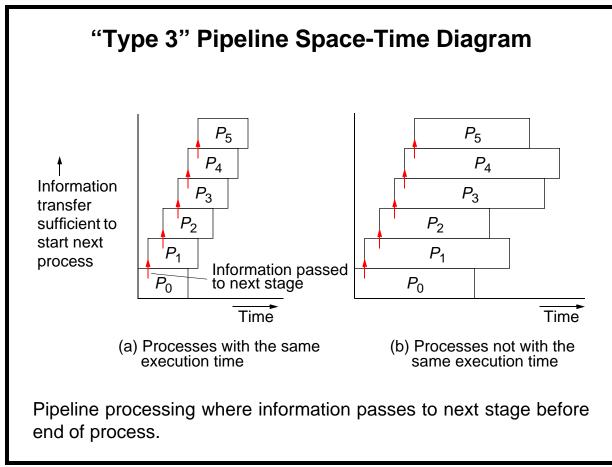


Execution time = m + p - 1 cycles for a p-stage pipeline and m instances.

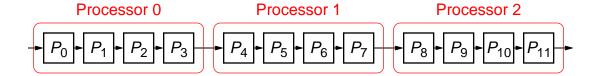


Time



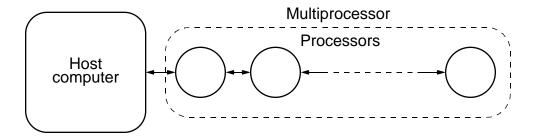


If the number of stages is larger than the number of processors in any pipeline, a group of stages can be assigned to each processor:



Computing Platform for Pipelined Applications

Multiprocessor system with a line configuration.



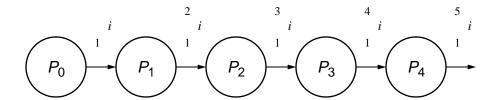
Strictly speaking pipeline may not be the best structure for a cluster - however a cluster with switched direct connections, as most have, can support simultaneous message passing.

Example Pipelined Solutions

(Examples of each type of computation)

Pipeline Program Examples

Adding Numbers



Type 1 pipeline computation

```
Basic code for process P_i:

recv(&accumulation, P_{-1});
accumulation = accumulation + number;
send(&accumulation, P_{+1});

except for the first process, P_0, which is

send(&number, P_0);
and the last process, P_{n-1}, which is

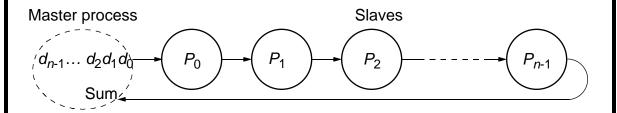
recv(&number, P_{n-2});
accumulation = accumulation + number;
```

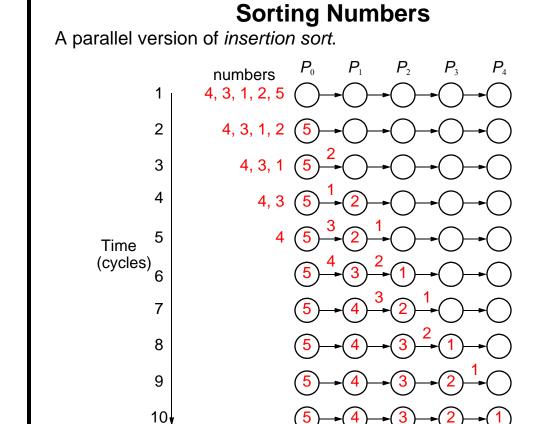
SPMD program

```
if (process > 0) {
    recv(&accumulation, P-1);
    accumulation = accumulation + number;
}
if (process < n-1) send(&accumulation, P1);
The final result is in the last process.</pre>
```

Instead of addition, other arithmetic operations could be done.

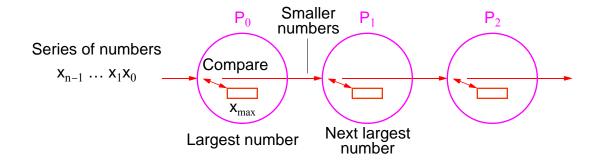
Pipelined addition numbers with a master process and ring configuration





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Pipeline for sorting using insertion sort



Type 2 pipeline computation

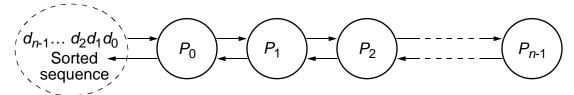
The basic algorithm for process P_i is

```
recv(&number, P<sub>-1</sub>);
if (number > x) {
  send(&x, P<sub>i+1</sub>);
  x = number;
} else send(&number, P<sub>+1</sub>);
```

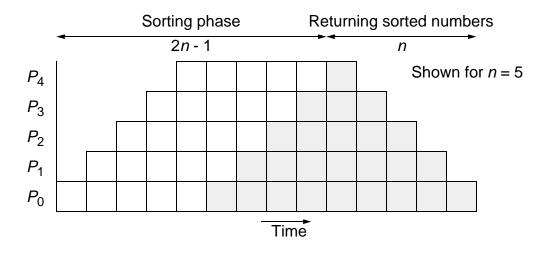
With n numbers, how many the ith process is to accept is known; it is given by n - i. How many to pass onward is also known; it is given by n - i - 1 since one of the numbers received is not passed onward. Hence, a simple loop could be used.

Insertion sort with results returned to the master process using a bidirectional line configuration

Master process



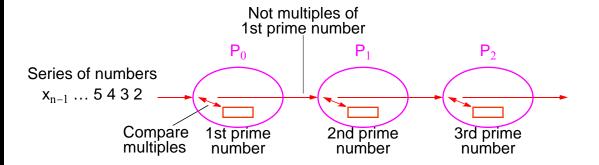
Insertion sort with results returned



Prime Number Generation

Sieve of Eratosthenes

Series of all integers is generated from 2. First number, 2, is prime and kept. All multiples of this number are deleted as they cannot be prime. Process repeated with each remaining number. The algorithm removes nonprimes, leaving only primes.



Type 2 pipeline computation

The code for a process, P_i , could be based upon

```
recv(&x, P<sub>i-1</sub>);
/* repeat following for each number */
recv(&number, P<sub>i-1</sub>);
if ((number % x) != 0) send(&number, P<sub>i</sub>P<sub>i</sub>);
```

Each process will not receive the same amount of numbers and the amount is not known beforehand. Use a "terminator" message, which is sent at the end of the sequence:

```
recv(&x, P<sub>i-1</sub>);
for (i = 0; i < n; i++) {
  recv(&number, P<sub>i-1</sub>);
  if (number == terminator) break;
  if (number % x) != 0) send(&number, P<sub>i</sub>);
}
```

Solving a System of Linear Equations

Upper-triangular form

$$a_{n-1,0}x_0 + a_{n-1,1}x_1 + a_{n-1,2}x_2 + a_{n-1,n-1}x_{n-1} = b_{n-1}$$

•

$$a_{2,0}x_0 + a_{2,1}x_1 + a_{2,2}x_2 = b_2$$

 $a_{1,0}x_0 + a_{1,1}x_1 = b_1$
 $a_{0,0}x_0 = b_0$

where the a's and b's are constants and the x's are unknowns to be found.

Back Substitution

First, the unknown x_0 is found from the last equation; i.e.,

$$x_0 = \frac{b_0}{a_{0,0}}$$

Value obtained for x_0 substituted into next equation to obtain x_1 ; i.e.,

$$x_1 = \frac{b_1 - a_{1,0} x_0}{a_{1,1}}$$

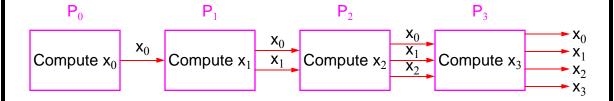
Values obtained for x_1 and x_0 substituted into next equation to obtain x_2 :

$$x_2 = \frac{b_2 - a_{2,0} x_0 - a_{2,1} x_1}{a_{2,2}}$$

and so on until all the unknowns are found.

Pipeline Solution

First pipeline stage computes x_0 and passes x_0 onto the second stage, which computes x_1 from x_0 and passes both x_0 and x_1 onto the next stage, which computes x_2 from x_0 and x_1 , and so on.



Type 3 pipeline computation

The *i*th process (0 < i < n) receives the values $x_0, x_1, x_2, ..., x_{i-1}$ and computes x_i from the equation:

$$x_{i} = \frac{b_{i} - a_{i,j}x_{j}}{a_{i,i}}$$

Sequential Code

Given the constants $a_{i,j}$ and b_k stored in arrays a[][] and b[], respectively, and the values for unknowns to be stored in an array, x[], the sequential code could be

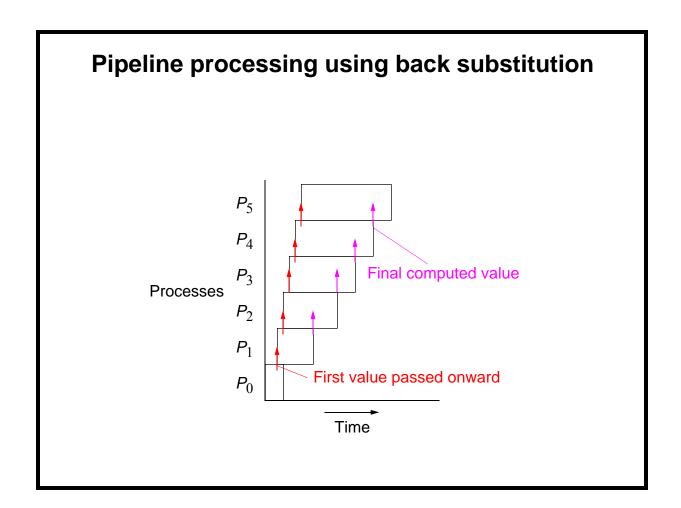
```
x[0] = b[0]/a[0][0]; /* computed separately */
for (i = 1; i < n; i++) {* for remaining}
unknowns */
   sum = 0;
   for (j = 0; j < i; j++
      sum = sum + a[i][j]*x[j];
   x[i] = (b[i] - sum)/a[i][i];
}</pre>
```

Parallel Code

Pseudocode of process P_i (1 < i < n) of could be

```
for (j = 0; j < i; j++) {
  recv(&x[j], P<sub>1-1</sub>);
  send(&x[j], P<sub>1+1</sub>);
}
sum = 0;
for (j = 0; j < i; j++)
  sum = sum + a[i][j]*x[j];
x[i] = (b[i] - sum)/a[i][i];
send(&x[i], P<sub>1+1</sub>);
```

Now we have additional computations to do after receiving and resending values.



Synchronous Computations

Synchronous Computations

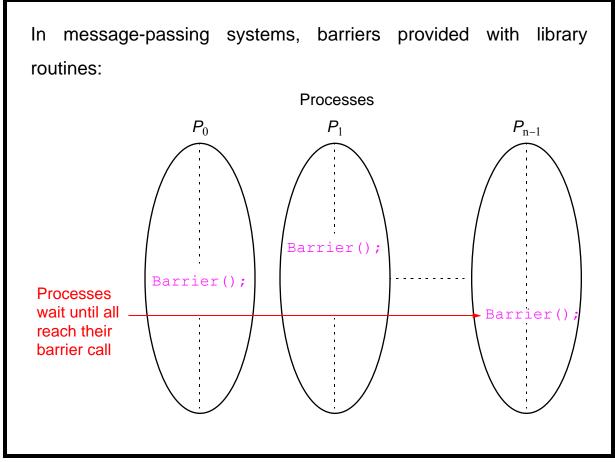
In a (fully) synchronous application, all the processes synchronized at regular points.

Barrier

A basic mechanism for synchronizing processes - inserted at the point in each process where it must wait.

All processes can continue from this point when all the processes have reached it (or, in some implementations, when a stated number of processes have reached this point).

Processes reaching barrier at different times Active Waiting Barrier



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MPI

MPI_Barrier()

Barrier with a named communicator being the only parameter. Called by each process in the group, blocking until all members of the group have reached the barrier call and only returning then.

PVM

pvm barrier()

similar barrier routine used with a named group of processes.

PVM has the unusual feature of specifying the number of processes that must reach the barrier to release the processes.

Centralized counter implementation (sometimes called a linear barrier): Processes Counter, C Increment and check for n Barrier(); Barrier();

Counter-based barriers often have two phases:

- A process enters arrival phase and does not leave this phase until all processes have arrived in this phase.
- Then processes move to departure phase and are released.

Good implementations of a barrier must take into account that a barrier might be used more than once in a process. It might be possible for a process to enter the barrier for a second time before previous processes have left the barrier for the first time.

Two-phase handles this scenario.

Example code:

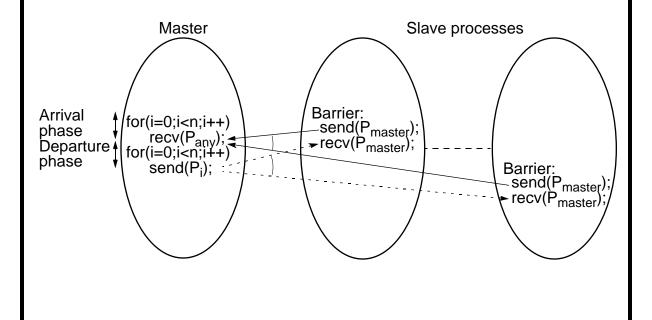
Master:

```
for (i = 0; i < n; i++)*count slaves as they reach
barrier*/
    recv(Pany);
for (i = 0; i < n; i++)* release slaves */
    send(Pi);

    Slave processes:

send(Pmaster);
recv(Pmaster);</pre>
```

Barrier implementation in a message-passing system



Tree Implementation

More efficient. Suppose 8 processes, P_0 , P_1 , P_2 , P_3 , P_4 , P_5 , P_6 , P_7 :

First stage: P_1 sends message to P_0 ; (when P_1 reaches its barrier)

 P_3 sends message to P_2 ; (when P_3 reaches its barrier)

 P_5 sends message to P_4 ; (when P_5 reaches its barrier)

 P_7 sends message to P_6 ; (when P_7 reaches its barrier)

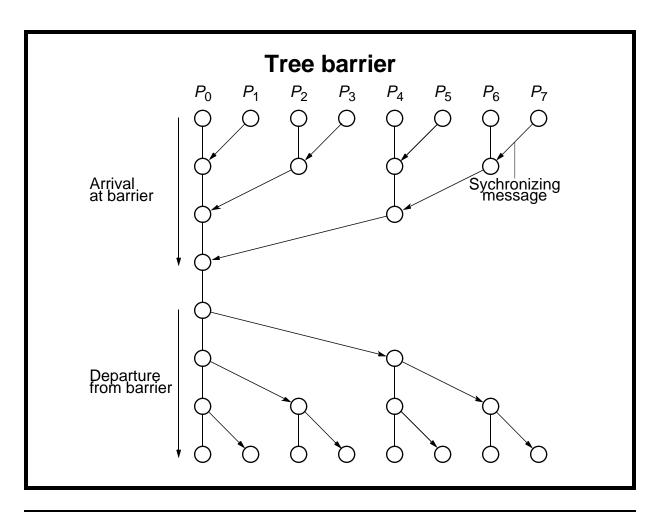
Second stage: P_2 sends message to P_0 ; ($P_2 \& P_3$ reached their barrier) P_6 sends message to P_4 ; ($P_6 \& P_7$ reached their barrier)

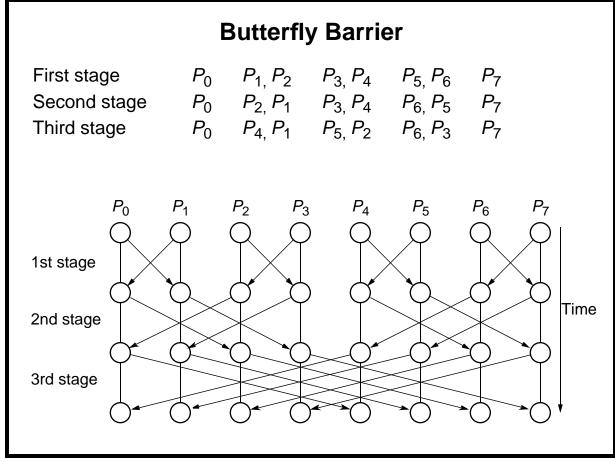
Third stage: P_4 sends message to P_0 ; (P_4 , P_5 , P_6 , & P_7 reached barrier)

P₀ terminates arrival phase;

(when P_0 reaches barrier & received message from P_4)

Release with a reverse tree construction.





Local Synchronization

Suppose a process P_i needs to be synchronized and to exchange data with process P_{i-1} and process P_{i+1} before continuing:

Process
$$P_{i-1}$$
 Process P_i Process P_{i+1}

recv(P_i); send(P_{i-1}); recv(P_i); send(P_{i-1}); recv(P_{i-1}); recv(P_{i-1});

Not a perfect three-process barrier because process P_{i-1} will only synchronize with P_i and continue as soon as P_i allows. Similarly, process P_{i+1} only synchronizes with P_i .

Deadlock

When a pair of processes each send and receive from each other, deadlock may occur.

Deadlock will occur if both processes perform the send, using synchronous routines first (or blocking routines without sufficient buffering). This is because neither will return; they will wait for matching receives that are never reached.

A Solution

Arrange for one process to receive first and then send and the other process to send first and then receive.

Example

Linear pipeline, deadlock can be avoided by arranging so the evennumbered processes perform their sends first and the oddnumbered processes perform their receives first.

Combined deadlock-free blocking sendrecv() routines

MPI provides MPI_Sendrecv() and MPI_Sendrecv_replace()

Example

```
Process P_{i-1} Process P_i Process P_{i+1}

sendrecv(P_i); \longrightarrow sendrecv(P_{i-1});

sendrecv(P_{i+1}); \longrightarrow sendrecv(P_i);
```

sendrev()s have 12 parameters!

Synchronized Computations

Can be classififed as:

Fully synchronous

or

Locally synchronous

In fully synchronous, all processes involved in the computation must be synchronized.

In locally synchronous, processes only need to synchronize with a set of logically nearby processes, not all processes involved in the computation

Fully Synchronized Computation Examples

Data Parallel Computations

Same operation performed on different data elements simultaneously; i.e., in parallel.

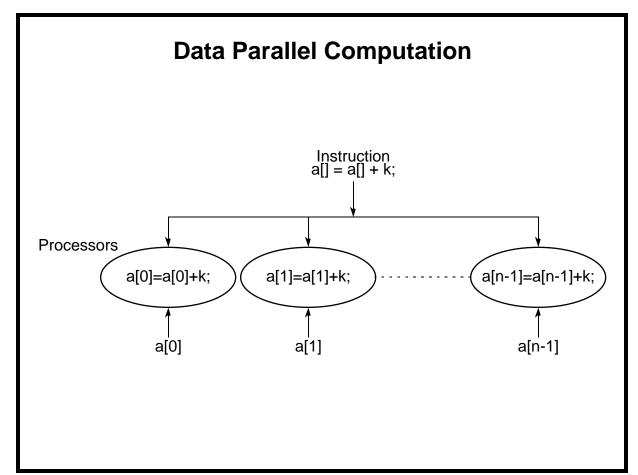
Particularly convenient because:

- Ease of programming (essentially only one program).
- Can scale easily to larger problem sizes.
- Many numeric and some non-numeric problems can be cast in a data parallel form.

Example

To add the same constant to each element of an array:

The statement a[i] = a[i] + k could be executed simultaneously by multiple processors, each using a different index i(0 < i n).



Forall construct

Special "parallel" construct in parallel programming languages to specify data parallel operations

Example

```
forall (i = 0; i < n; i++) {
  body
}</pre>
```

states that n instances of the statements of the body can be executed simultaneously.

One value of the loop variable i is valid in each instance of the body, the first instance has i = 0, the next i = 1, and so on.

To add k to each element of an array, a, we can write

```
forall (i = 0; i < n; i++)
a[i] = a[i] + k;
```

Data parallel technique applied to multiprocessors and multicomputers

Example

To add k to the elements of an array:

```
i = myrank;
a[i] = a[i] + k/* body */
barrier(mygroup);
```

where myrank is a process rank between 0 and n-1.

Data Parallel Example - Prefix Sum Problem

Given a list of numbers, x_0 , ..., x_{n-1} , compute all the partial summations (i.e., $x_0 + x_1$; $x_0 + x_1 + x_2$; $x_0 + x_1 + x_2 + x_3$; ...).

Can also be defined with associative operations other than addition. Widely studied. Practical applications in areas such as processor allocation, data compaction, sorting, and polynomial evaluation.

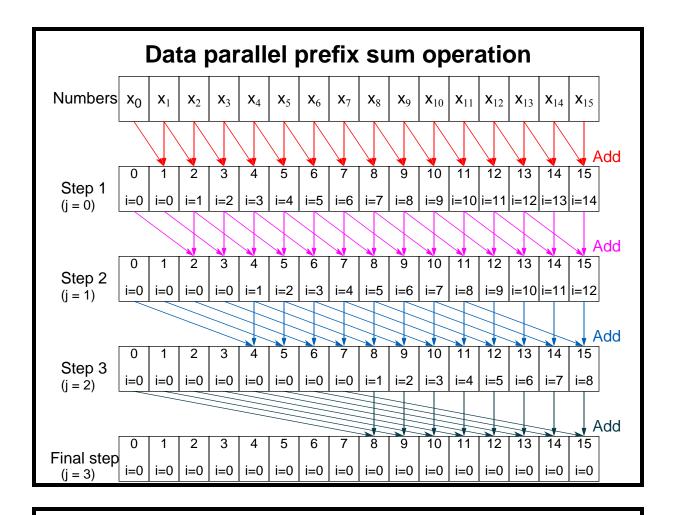
Data parallel method of adding all partial sums of 16 numbers

Sequential code

```
for (j = 0; j < log(n); j++)* at each step, add*/
for (i = 2^{j}; i < n; i++)/* to accumulating sum */
x[i] = x[i] + x[i - \frac{1}{2}];
```

Parallel code

for (j = 0; j < log(n); j++) /* at each step, add */
forall (i = 0; i < n; i++)/*to sum */
if (i >=
$$2^{j}$$
) $x[i] = x[i] + x[i - \frac{1}{2}];$



Synchronous Iteration (Synchronous Parallelism)

Each iteration composed of several processes that start together at beginning of iteration. Next iteration cannot begin until all processes have finished previous iteration. Using forall:

Another fully synchronous computation example

Solving a General System of Linear Equations by Iteration

Suppose the equations are of a general form with *n* equations and *n* unknowns

$$a_{n-1,0}x_0 + a_{n-1,1}x_1 + a_{n-1,2}x_2 \dots + a_{n-1,n-1}x_{n-1} = b_{n-1}$$
 \vdots
 $a_{2,0}x_0 + a_{2,1}x_1 + a_{2,2}x_2 \dots + a_{2,n-1}x_{n-1} = b_2$
 $a_{1,0}x_0 + a_{1,1}x_1 + a_{1,2}x_2 \dots + a_{1,n-1}x_{n-1} = b_1$
 $a_{0,0}x_0 + a_{0,1}x_1 + a_{0,2}x_2 \dots + a_{0,n-1}x_{n-1} = b_0$

where the unknowns are x_0 , x_1 , x_2 , ... x_{n-1} (0 i < n).

By rearranging the ith equation:

$$a_{i,0}x_0 + a_{i,1}x_1 + a_{i,2}x_2 \dots + a_{i,n-1}x_{n-1} = b_i$$

to $x_i = (1/a_{i,i})[b_i - (a_{i,0}x_0 + a_{i,1}x_1 + a_{i,2}x_2 \dots a_{i,i-1}x_{i-1} + a_{i,i+1}x_{i+1} \dots + a_{i,n-1}x_{n-1})]$ or

$$x_{i} = \frac{1}{a_{i,i}} \left[b_{i} - a_{i,j} x_{j} \right]$$

This equation gives x_i in terms of the other unknowns and can be be used as an iteration formula for each of the unknowns to obtain better approximations.

Jacobi Iteration

All values of x are updated together.

Can be proven that the Jacobi method will converge if the diagonal values of a have an absolute value greater than the sum of the absolute values of the other a's on the row (the array of a's is diagonally dominant) i.e. if

$$\int_{j} a_{i,j} |a_{i,j}| < |a_{i,i}|$$

This condition is a sufficient but not a necessary condition.

Termination

A simple, common approach. Compare values computed in one iteration to values obtained from the previous iteration.

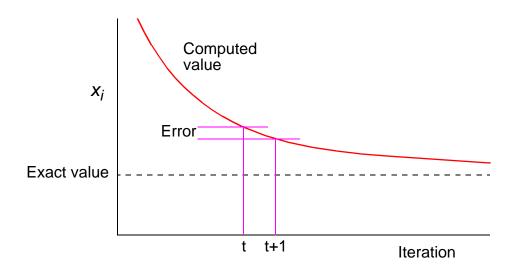
Terminate computation when all values are within given tolerance; i.e., when

$$\left| x_i^t - x_i^{t-1} \right| < \text{error tolerance}$$

for all i, where x_i^t is the value of x_i after the tth iteration and x_i^{t-1} is the value of x_i after the (t-1)th iteration.

However, this does not guarantee the solution to that accuracy.

Convergence Rate



Parallel Code

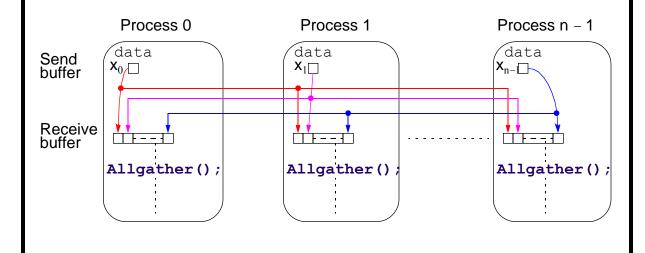
Process P_i could be of the form

allgather() sends the newly computed value of x[i] from process i to every other process and collects data broadcast from the other processes.

Introduce a new message-passing operation - Allgather.

Allgather

Broadcast and gather values in one composite construction.



Partitioning

Usually number of processors much fewer than number of data items to be processed. Partition the problem so that processors take on more than one data item..

block allocation – allocate groups of consecutive unknowns to processors in increasing order.

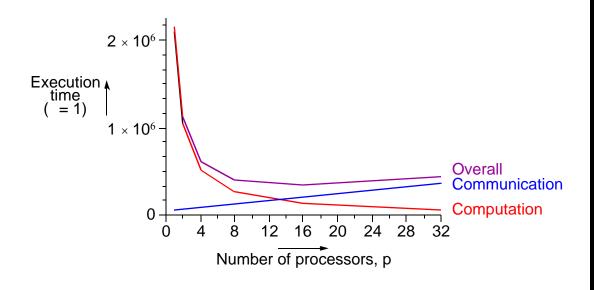
cyclic allocation – processors are allocated one unknown in order; i.e., processor P_0 is allocated $x_0, x_p, x_{2p}, ..., x_{((n/p)-1)p}$, processor P_1 is allocated $x_1, x_{p+1}, x_{2p+1}, ..., x_{((n/p)-1)p+1}$, and so on.

Cyclic allocation no particular advantage here (Indeed, may be disadvantageous because the indices of unknowns have to be computed in a more complex way).

Effects of computation and communication in Jacobi iteration

Consequences of different numbers of processors done in textbook.

Get:



Locally Synchronous Computation Heat Distribution Problem

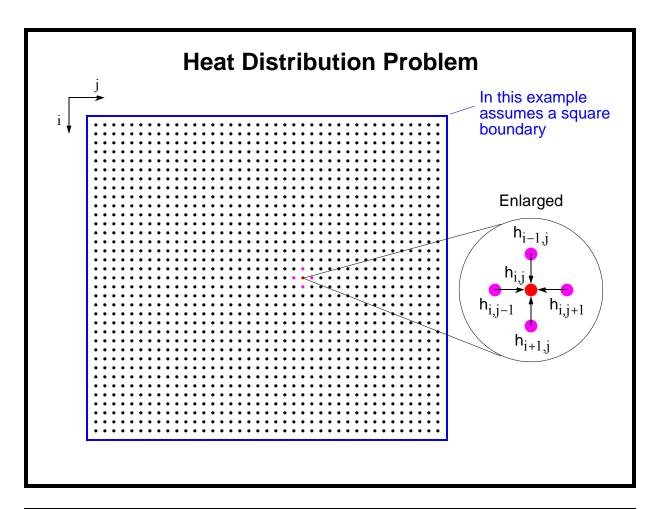
An area has known temperatures along each of its edges. Find the temperature distribution within.

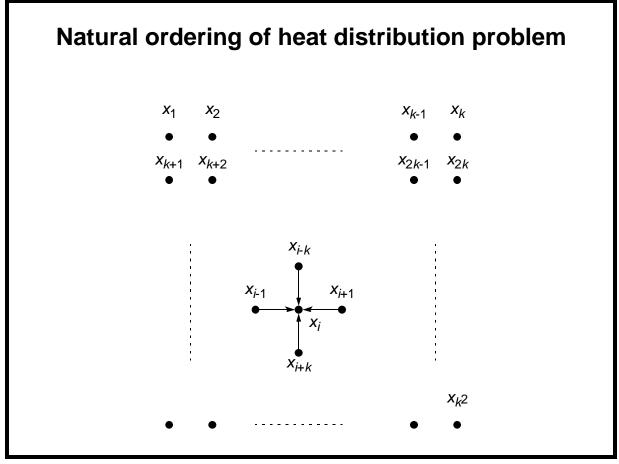
Divide area into fine mesh of points, $h_{i,j}$. Temperature at an inside point taken to be average of temperatures of four neighboring points. Convenient to describe edges by points.

Temperature of each point by iterating the equation:

$$h_{i, j} = \frac{h_{i-1, j} + h_{i+1, j} + h_{i, j-1} + h_{i, j+1}}{4}$$

(0 < i < n, 0 < j < n) for a fixed number of iterations or until the difference between iterations less than some very small amount.





Number points from 1 for convenience and include those representing the edges. Each point will then use the equation

$$x_i = \frac{x_{i-1} + x_{i+1} + x_{i-k} + x_{i+k}}{4}$$

Could be written as a linear equation containing the unknowns x_{i-k} , x_{i-1} , x_{i+1} , and x_{i+k} :

$$x_{i-k} + x_{i-1} - 4x_i + x_{i+1} + x_{i-k} = 0$$

Notice: solving a (sparse) system of linear equations.

Also solving Laplace's equation.

Sequential Code

Using a fixed number of iterations

```
for (iteration = 0; iteration < limit; iteration++) {
  for (i = 1; i < n; i++)
    for (j = 1; j < n; j++)
      g[i][j] = 0.25*(h[i-1][j]+h[i+1][j]+h[i][j-1]+h[i][j+1]);
  for (i = 1; i < n; i++)* update points */
    for (j = 1; j < n; j++)
        h[i][j] = g[i][j];
}</pre>
```

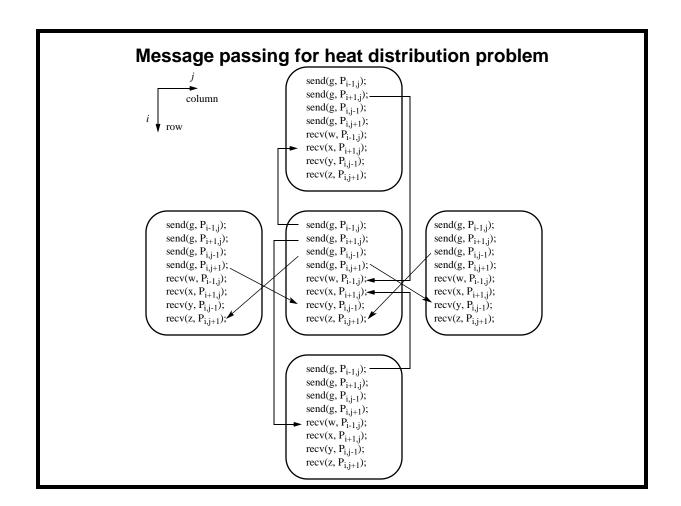
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```
To stop at some precision:
do {
 for (i = 1; i < n; i++)
  for (j = 1; j < n; j++)
   g[i][j] = 0.25*(h[i-1][j]+h[i+1][j]+h[i][j-1]+h[i][j+1]);
 for (i = 1; i < n; i++)* update points */</pre>
   for (j = 1; j < n; j++)
     h[i][j] = g[i][j];
 continue = FALSE;
                        /* indicates whether to continue */
 for (i = 1; i < n; i++)* check each pt for convergence */
   for (j = 1; j < n; j++)
     if (!converged(i,j) {/* point found not converged */
       continue = TRUE;
       break:
     }
} while (continue == TRUE);
```

Parallel Code

With fixed number of iterations, $P_{i,j}$ (except for the boundary points):

Important to use send()s that do not block while waiting for the recv()s; otherwise the processes would deadlock, each waiting for a recv() before moving on - recv()s must be synchronous and wait for the send()s.



Version where processes stop when they reach their required precision:

```
iteration = 0;
do {
    iteration++;
   g = 0.25 * (w + x + y + z);
   send(\&g, P_{i-1,j});
                             /* locally blocking sends */
   send(&g, P_{i+1,j});
   send(\&g, P_{i,j-1});
   send(\&g, P_{i,i+1});
                              /* locally blocking receives */
   recv(&w, P_{i-1,i});
   recv(&x, P_{i+1,j});
   recv(&y, P_{i,i-1});
   recv(&z, P<sub>i,j+1</sub>);
} while((!converged(i, j)) || (iteration < limit));</pre>
send(&g, &i, &j, &iteration, Pmaster);
```

To handle the processes operating at the edges:

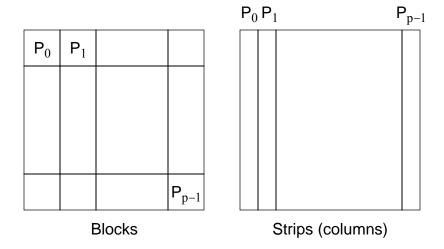
MPI has a construct to help here

```
if (last_row) w = bottom_value;
if (first_row) x = top_value;
if (first_column) y = left_value;
if (last_column) z = right_value;
iteration = 0;
do {
  iteration++;
  g = 0.25 * (w + x + y + z);
  if !(first_row) send(&g, P<sub>-1,i</sub>);
  if !(last_row) send(&g, P<sub>+1,j</sub>);
 if !(first_column) send(&g, P, j-1);
  if !(last_column) send(&g, P<sub>i,i+1</sub>);
  if !(last_row) recv(&w, P<sub>-1.j</sub>);
  if !(first_row) recv(&x, P+1, i);
 if !(first_column) recv(&y, P,j-1);
  if !(last_column) recv(&z, P,j+1);
} while((!converged) || (iteration < limit));</pre>
send(&g, &i, &j, iteration, Paster);
```

Partitioning

Normally allocate more than one point to each processor, because many more points than processors.

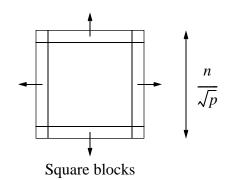
Points could be partitioned into square blocks or strips:



Block partition

Four edges where data points exchanged. Communication time given by

$$t_{\text{commsq}} = 8 t_{\text{startup}} + \frac{n}{\sqrt{p}} t_{\text{data}}$$

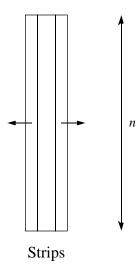


Communication consequences of partitioning

Strip partition

Two edges where data points are exchanged. Communication time is given by

$$t_{\text{commcol}} = 4(t_{\text{startup}} + nt_{\text{data}})$$



Optimum

In general, the strip partition is best for a large startup time, and a block partition is best for a small startup time.

With the previous equations, the block partition has a larger communication time than the strip partition if

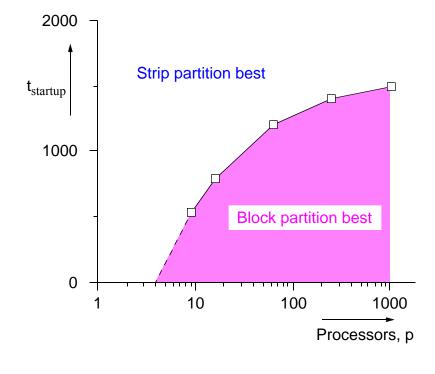
8
$$t_{\text{startup}} + \frac{n}{\sqrt{p}} t_{\text{data}} > 4(t_{\text{startup}} + nt_{\text{data}})$$

or

$$t_{\text{startup}} > n \ 1 - \frac{2}{\sqrt{p}} t_{\text{data}}$$

 $(p \ 9).$

Startup times for block and strip partitions

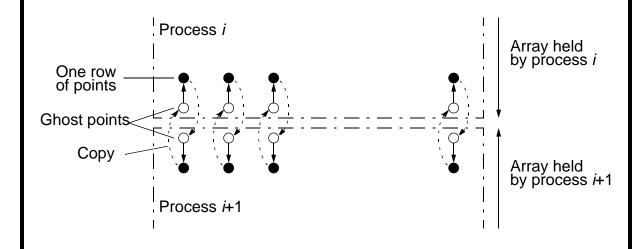


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Ghost Points

An additional row of points at each edgethat hold the values from the adjacent edge. Each array of points is increased to accommodate the ghost rows.



Safety and Deadlock

When all processes send their messages first and then receive all of their messages is "unsafe" because it relies upon buffering in the send()s. The amount of buffering is not specified in MPI.

If insufficient storage available, send routine may be delayed from returning until storage becomes available or until the message can be sent without buffering.

Then, a locally blocking send() could behave as a synchronous send(), only returning when the matching recv() is executed.

Since a matching recv() would never be executed if all the send()s are synchronous, deadlock would occur.

Making the code safe

Alternate the order of the <code>send()s</code> and <code>recv()s</code> in adjacent processes so that only one process performs the <code>send()s</code> first:

Then even synchronous send () s would not cause deadlock.

Good way you can test for safety is to replace message-passing routines in a program with synchronous versions.

MPI Safe Message Passing Routines

MPI offers several alternative methods for safe communication:

- Combined send and receive routines:
 MPI_Sendrecv()
 which is guaranteed not to deadlock
- Buffered send()s:
 MPI_Bsend()
 here the user provides explicit storage space
- Nonblocking routines:

MPI_Isend() and MPI_Irecv()

which return immediately. Separate routine used to establish whether message has been received - MPI_Wait(), MPI_Waitall(), MPI_Waitany(), MPI_Test(), MPI_Testall(), or MPI_Testany().

Other fully synchronous problems

Cellular Automata

The problem space is divided into cells.

Each cell can be in one of a finite number of states.

Cells affected by their neighbors according to certain rules, and all cells are affected simultaneously in a "generation."

Rules re-applied in subsequent generations so that cells evolve, or change state, from generation to generation.

Most famous cellular automata is the "Game of Life" devised by John Horton Conway, a Cambridge mathematician.

Also good assignment for graphical output.

The Game of Life

Board game - theoretically infinite two-dimensional array of cells. Each cell can hold one "organism" and has eight neighboring cells, including those diagonally adjacent. Initially, some cells occupied.

The following rules apply:

- 1. Every organism with two or three neighboring organisms survives for the next generation.
- 2. Every organism with four or more neighbors dies from overpopulation.
- 3. Every organism with one neighbor or none dies from isolation.
- 4. Each empty cell adjacent to exactly three occupied neighbors will give birth to an organism.

These rules were derived by Conway "after a long period of experimentation."

Simple Fun Examples of Cellular Automata

"Sharks and Fishes"

An ocean could be modeled as a three-dimensional array of cells. Each cell can hold one fish or one shark (but not both).

Fish and sharks follow "rules."

Fish

Might move around according to these rules:

- 1. If there is one empty adjacent cell, the fish moves to this cell.
- 2. If there is more than one empty adjacent cell, the fish moves to one cell chosen at random.
- 3. If there are no empty adjacent cells, the fish stays where it is.
- 4. If the fish moves and has reached its breeding age, it gives birth to a baby fish, which is left in the vacating cell.
- 5. Fish die after *x* generations.

Sharks

Might be governed by the following rules:

- 1. If one adjacent cell is occupied by a fish, the shark moves to this cell and eats the fish.
- 2. If more than one adjacent cell is occupied by a fish, the shark chooses one fish at random, moves to the cell occupied by the fish, and eats the fish.
- 3. If no fish are in adjacent cells, the shark chooses an unoccupied adjacent cell to move to in a similar manner as fish move.
- 4. If the shark moves and has reached its breeding age, it gives birth to a baby shark, which is left in the vacating cell.
- 5. If a shark has not eaten for *y* generations, it dies.

Similar examples: "foxes and rabbits" -Behavior of rabbits to move around happily whereas behavior of foxes is to eat any rabbits they come across.

Sample Student Output



Serious Applications for Cellular Automata

Examples

- fluid/gas dynamics
- the movement of fluids and gases around objects
- diffusion of gases
- biological growth
- airflow across an airplane wing
- erosion/movement of sand at a beach or riverbank.