# Parallel Programming Models - II

Lecture 09

## Outline

- Data (work) Distribution
  - 1D array
  - 2D array
- Information Exchange
  - Shared variables
  - Communication operations

Summary

## Data Distribution

 Parallel computing problems are commonly based on array of various dimensions

- Useful to study how to decompose the arrays for distribution on multiple processors
  - known as data distribution / work distribution / decomposition / partitioning

 For problems exhibiting data parallelism, data distribution can be used as a simple parallelization strategy

## Data Distribution for 1D Arrays

- Assumptions for discussion:
  - p identical processors, P<sub>1</sub>, P<sub>2</sub>, ..., P<sub>p</sub>, and with processor rank i in {1, 2, ..., p}
  - Array elements numbered from 1 to n
- Given a one dimensional array, common distribution patterns:
  - Blockwise data distribution
  - Cyclic data distribution

## Blockwise and Cyclic Data Distribution

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- Block size, B =  $\left\lceil \frac{n}{p} \right\rceil$
- Pj takes elements  $[(i-1) \times B + 1 \dots j \times B]$ [CS3210 AY2324S1 L09]

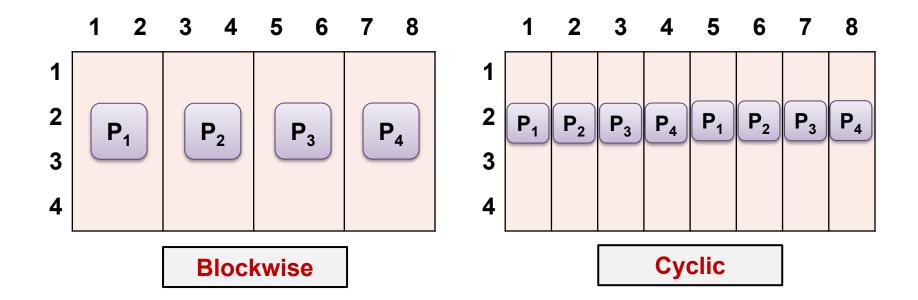
Cyclic

Pj takes elements  $[j, j + p, ..., j + (\left\lceil \frac{n}{p} \right\rceil - 1) \times p] \text{ if } j \leq n \mod p$   $[j, j + p, ..., j + (\left\lceil \frac{n}{p} \right\rceil - 2) \times p] \text{ otherwise}$ 

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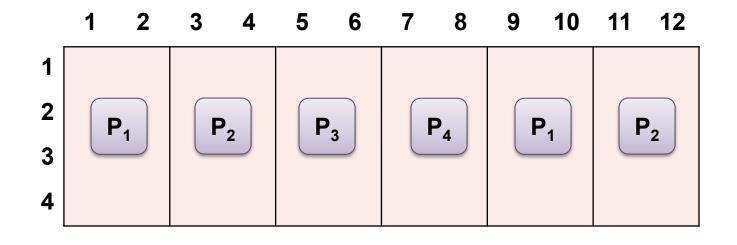
## Data distribution for 2D Arrays

- Combination of blockwise / cyclic distribution in one or both dimensions can be used
- One-dimension distributions
  - Use the column dimension for illustration:



## Data distribution for 2D Arrays

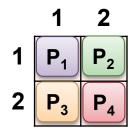
- One-dimension distributions
  - Block-Cyclic is a new distribution pattern
  - Form blocks of size b, then perform cyclic (round robin) allocation



Block-Cyclic with b = 2

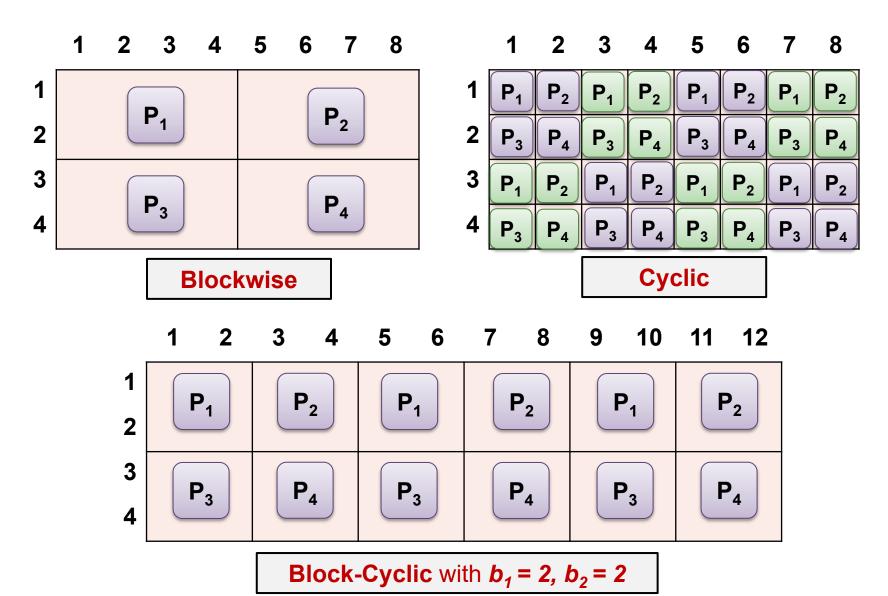
## Two Dimensional Distributions

- Processors are virtually organized into 2D mesh of R x C:
  - i.e. each Processor now has a row and column number:



- Checkerboard distribution can then be applied:
  - Blockwise: elements split into blocks along both dimensions depending on R and C
  - Cyclic: cyclic assignment of elements according to processor mesh
  - Block-Cyclic: elements spilt into b1 x b2 size blocks, then cyclical assignment to processors

## Checkerboard Distribution



# Exercise: Matrix Multiplication

To illustrate the effect of data distribution on the computation

### Assume:

- A x B = C, all matrices of N x N
- There are p processors, p will be specified

 For each value of p, suggest a data distribution pattern for the matrices A and B

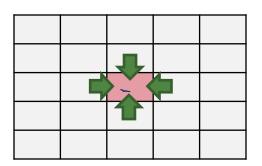
# Exercise: Matrix Multiplication

- 1. 1 , you can use <math>p = N as a start
  - A distributed as
  - B distributed as
  - Each processor calculate

- 2.  $p = N^2$ 
  - A distributed as
  - B distributed as
  - Each processor calculate

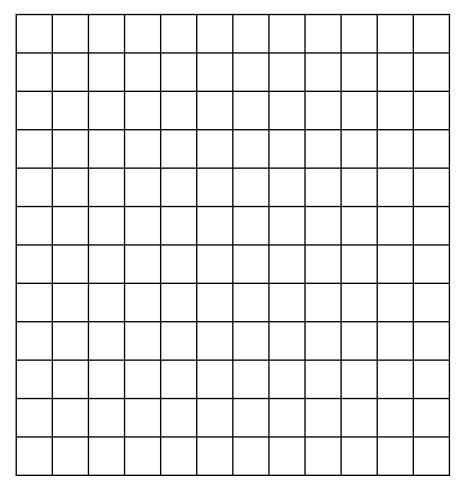
## Exercise: Heat Transfer Simulation

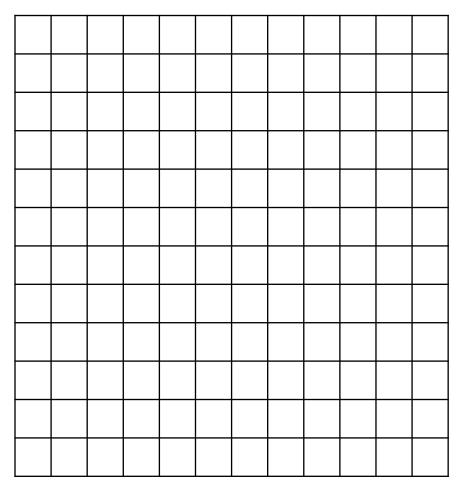
- A simplistic simulation of heat transfer on a metal plate
- The metal plate is modeled as:
  - 2D integer array
  - Each integer represent the temperature of a "point" on the plate
- The temperature is calculated iteratively:
  - Temperature of a point = Average of the top, left, right and down points



## Exercise: Heat Transfer Simulation

- If we have a N x N metal plate and p processor, where p < N:</p>
  - Suggest at least two data distribution patterns and discuss pro/cons





I'll trade my B for your A

## INFORMATION EXCHANGE

# Information Exchange

### Purpose

 Information exchange between the executing processors is necessary for controlling the coordination of different parts of a parallel program execution

## Shared address space

use Shared variables

### Distributed address space

use Communication operations

## Shared Variables

- Shared memory programming models assume a global memory accessible by all processors
  - → Information exchange through shared variables
  - → Need synchronization operations for safe concurrent access
- Flow of control abstractions
  - processes or threads
- Each thread:
  - Executed by one processor or one core in multicore processors
  - Have shared variables and may have private variables

## Synchronized Access

- Data race: multiple threads accessing (read and write) the same shared variable
  - Computation result depends on the execution order of threads (race condition)
  - → May lead to non-deterministic behavior
  - Can be avoided using a critical section mechanism

- Critical section:
  - A program part in which concurrent access should be avoided
    - i.e. only one thread can execution at any point in time
  - Use mutual exclusion (mutex) to provide critical section

## Example: OpenMP

Data race (might produce a race condition):

Mutual exclusion:

```
void main () {
  int count = 0;
  #pragma omp parallel
  {
    count = count + 1; // race
  }
  printf("count = %d\n", count);
}
```

```
void main () {
  int count = 0;
  omp_lock_t lock;
  omp_init_lock(&lock);

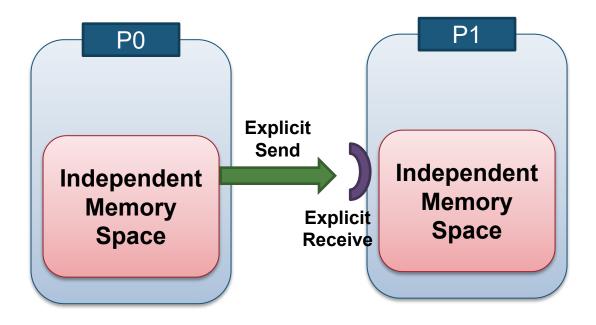
#pragma omp parallel
  {
    omp_set_lock(&lock);
    count = count + 1;
    omp_unset_lock(&lock);
  }
  printf("count = %d\n", count);
}
```

# Communication Operations

- Distributed memory programming models assume disjoint memory space:
  - Exchange of data between processors through dedicated communication operations
- One common communication model send / receive messages between participating processors:
  - known as message-passing programming model

- Two main types of data exchange:
  - point-to-point and global communication

# Principles of Message Passing Model



- Data explicitly partitioned for each process
- All interaction requires both parties to participate
- The programmer has to explicitly express parallelism

# Principles of Message Passing Model

- Loosely synchronous paradigm:
  - Tasks or subsets of tasks synchronize to perform interactions
  - Between these interactions, tasks execute completely asynchronously

So, you talk, I talk?

## **COMMUNICATION PROTOCOLS**

# Send and Receive Operations

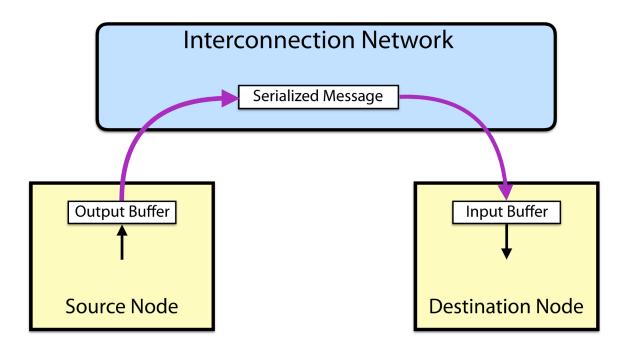
```
a = 100;
send(&a, P1);
a = 0;
Process P0
```

```
receive(&a, P0);
printf("%d\n", a);
Process P1
```

- Semantic of the send():
  - The value received by P1 should be 100
- Motivates the design of the underlying communication protocols

# Point-to-point Communication (Buffered)

- In a distributed memory system, over a network
  - One-way transfer



### Send and Receive Protocols Possibilities

## **Blocking Operations**

## Non-Blocking Operations

#### **Buffered**

Sending process returns after data has been copied into communication buffer	Sending process returns after initiating the transfer to buffer. This operation might not be completed on return.
Sending process blocks until matching receive operation has	

#### Non-buffered

Send and receives semantics assured by corresponding operation.

been encountered.

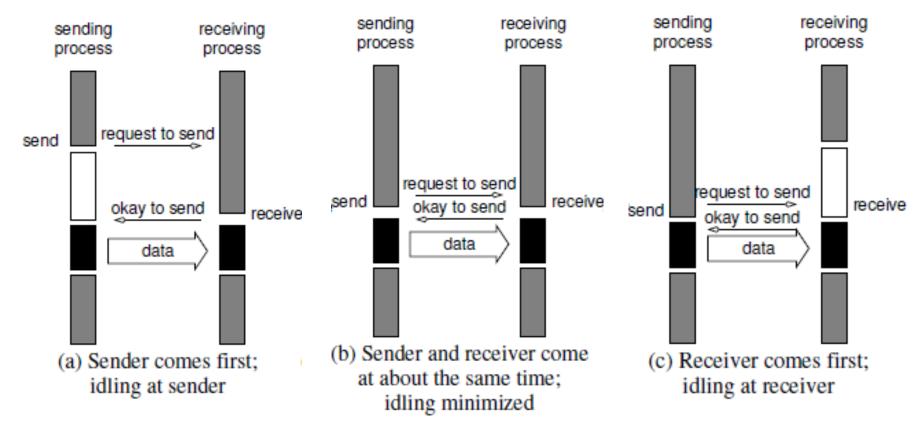
Programmer must explicitly ensure completion of the operation by polling.

## **Blocking** Send

- Send operation blocks until it is safe to reuse the input buffer
  - "Safe" refers to the integrity of the data to be sent

- Non-buffered blocking send:
  - The operation blocks until the matching receive has been performed by the receiving process
  - Idling and deadlocks are major issues with non-buffered blocking sends

# Non-Buffered + Blocking Operations



- Considerable idling overheads
  - Due to the mismatch in timing between sender and receiver

# Buffered + Blocking Operations

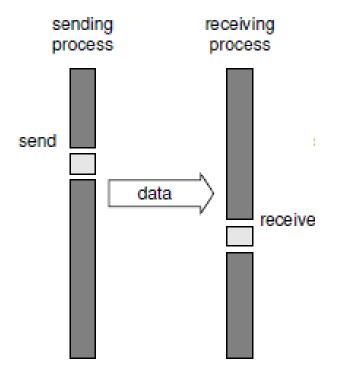
- To reduce idling overhead:
  - Utilize buffers at both ends

 Sender simply copies the data into the designated buffer and returns after the copy operation has been completed

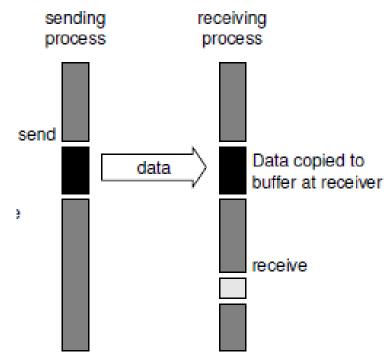
Receiver similarly buffered the incoming data

 Buffering trades off idling overhead for buffer copying overhead

# Buffered + Blocking Operations



(a) Using communication hardware with buffers at send and receive ends



(b) Without communication hardware, sender interrupts receiver and deposits data in buffer at receiver end

### **Blocking buffered transfer protocols**

# Bounded Buffer Size: Impact

```
for (i = 0; i < 1000; i++) {
    produce(&a);
    send(&a, P1);
}
    Process P0</pre>
```

```
for (i = 0; i < 1000; i++) {
    receive(&a, P0);
    consume(&a);
}</pre>
```

- What if consumer was much slower than producer?
  - Think "behind the scene"....

## Deadlock

Deadlocks are still possible with buffering since receive operations block:

```
receive(&a, P1);
send(&b, P1);
Process P0
```

```
receive(&a, P0);
send(&b, P0);

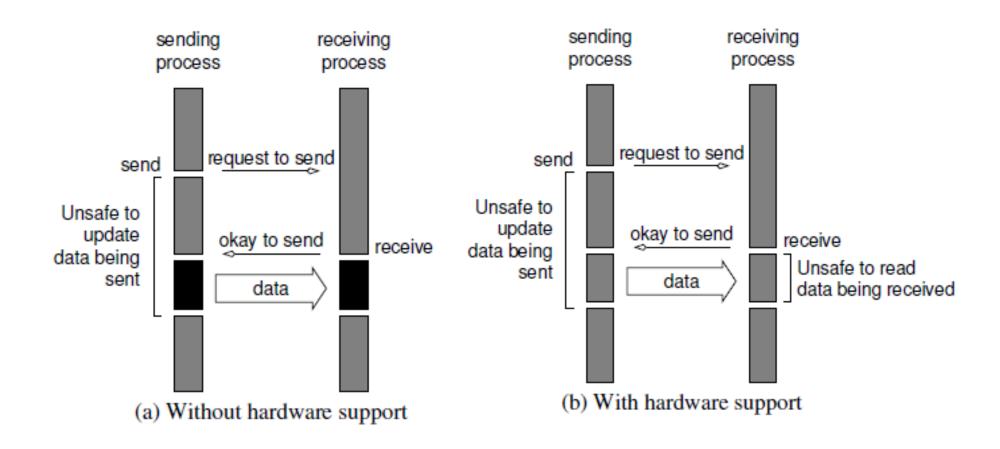
Process P1
```

# Non-Blocking Operations

- Send / Receive returns before it is semantically safe to use the data transferred
  - Non-blocking operations are generally accompanied by a checkstatus operation
  - The programmer must ensure the semantics of the operations
- When used correctly, these primitives are capable of overlapping communication overheads with useful computations

 Message passing libraries typically provide both blocking and non-blocking primitives

## Non-Blocking + Non-Buffered Operations



Non-blocking non-buffered send and receive operations

# Semantics of Send/Receive Operations

#### **Local view**

### **Blocking**

Return from a library call indicates the user is allowed to reuse resources specified in the call

### Non-blocking

A procedure may return before the operation completes, and before the user is allowed to reuse resources specified in the call

#### **Global view**

### **Synchronous**

Communication operation does not complete before both processes have started their communication operation

#### **Asynchronous**

Sender can execute its communication operation without any coordination with the receiver

# Implementation Options

## Synchronous:

- Send completes after matching receive and source data sent
- Receive completes after data transfer completed from matching send

### Asynchronous:

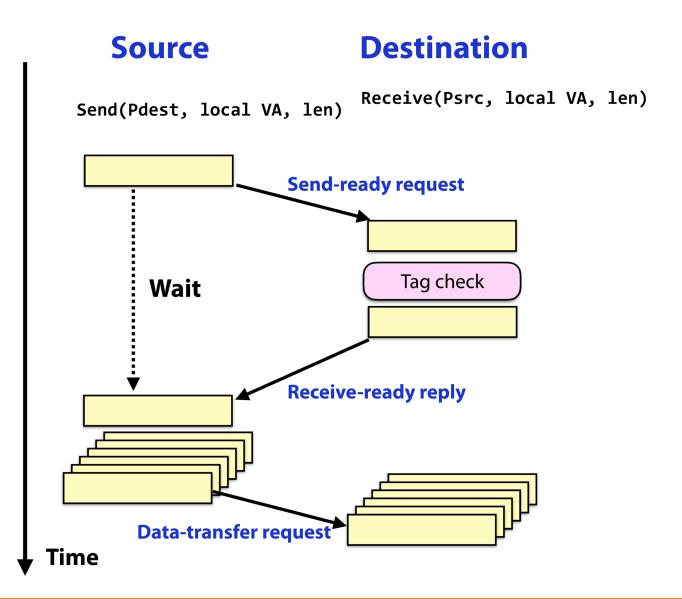
Send completes after input buffer may be reused

## Synchronous Communication

- (1) Initiate send
- (2) Address translation
- (3) Local/remote check
- (4) Send-ready request

- (5) Remote check for posted receive (assume success)
- (6) Reply transaction

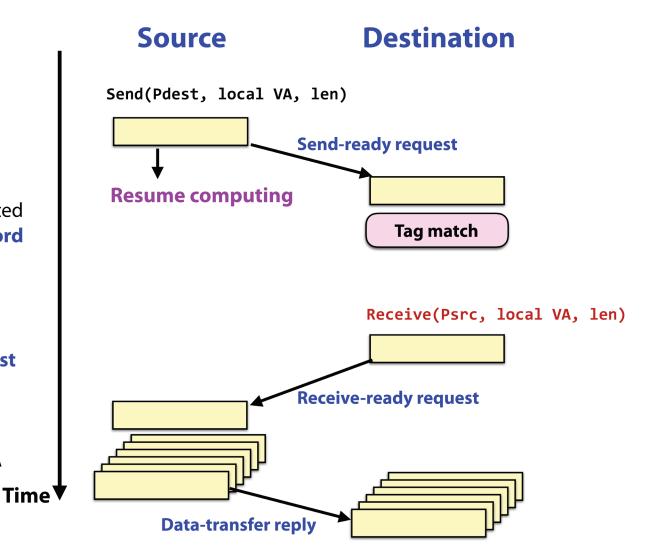
(7) Bulk data transfer Source VA —> Dest VA



## Asynchronous Communication

- (1) Initiate send
- (2) Address translation
- (3) Local/remote check
- (4) Send-ready request
- (5) Remote check for posted receive (assume fail); **record send-ready**

- (6) Receive-ready request
- (7) Bulk data reply
  Source VA —> Dest VA



— [CS3210 - AY2324S1 - L09] — **37** 

## Summary of Communication Protocols

- 1. Overhead of guaranteeing semantic correctness:
  - Idling (non-buffered)
  - Buffer management (buffered)
- 2. Side effect:
  - Safe and easier programming (blocking)
  - Hide communication overhead (non-blocking)
- 3. Local or global view:

Synchronous vs. asynchronous communication

## Summary

Data distribution

 Information exchange for shared and distributed address space