

## **UNIT I – INTRODUCTION**

**Introduction:** *Definition –Relation to computer system components –Motivation –Relation to parallel systems*

*– Message-passing systems versus shared memory systems –Primitives for distributed communication – Synchronous versus asynchronous executions –Design issues and challenges. A model of distributed computations: A distributed program –A model of distributed executions*

*–Models of communication networks –Global state – Cuts –Past and future cones of an event*

*–Models of process communications. Logical Time: A framework for a system of logical clocks*

*–Scalar time –Vector time – Physical clock synchronization: NTP.*

### **Distributed System**

#### **Definition**

- A distributed system is a collection of independent entities that cooperate to solve a problem that cannot be individually solved.

*A distributed system is the one in which hardware or software components located at networked computers communicate and coordinate their actions only by passing messages each having its own memory and operating system.*

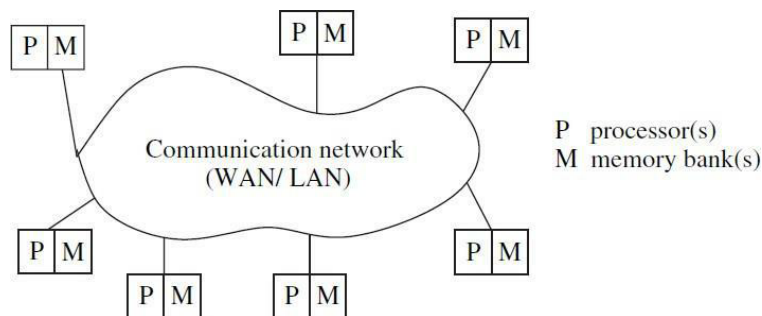
#### **Characteristics of distributed system:**

- It is a collection of autonomous processors communicating over a communication network have the following features:
- **No common physical clock.**
- **No shared memory.**
  - hence it requires message-passing for communication and implies the absence of common physical clock.
  - distributed system provides the abstraction of common address space via distributed shared memory abstraction.
- **Geographical separation**
  - The geographically wider apart processors are the representative of a distributed system i.e., it may be in wide-area network (WAN) or the network/cluster of workstations (NOW/COW) configuration connecting processors on a LAN
  - NOW configuration is the low-cost high-speed off-the-shelf processors. Example: Google search engine.
- **Autonomy and heterogeneity**
  - The processors are “loosely coupled” having different speeds and each runs different operating system but cooperate with one another by offering services for solving a problem jointly.

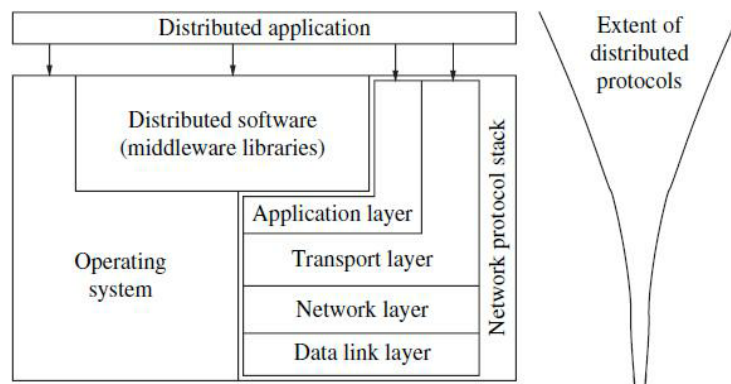
#### **Relation to computer system components**

- As shown in the Figure 1.1, In distributed system each computer has a memory-processing unit and are connected by a communication network.

- Figure 1.2 shows the relationships of software components that run on computers use the local operating system and network protocol stack for functioning.
- A distributed software is also termed as *middleware*.
- A *distributed execution* is the execution of processes across the distributed system to collaboratively achieve a common goal which is also termed a *computation* or a *run*.
- A distributed system follows a layered architecture that reduces the complexity of the system design.
- Middleware hides the *heterogeneity* transparently at the platform level.



(Fig.1.1 A distributed system connects processors by a communication network)



(Fig.1.2 Interaction of the software components at each processor)

- It is assumed that the middleware layer does not contain the application layer functions like *http*, *mail*, *ftp*, and *telnet*.
- User program code includes the code to invoke libraries of the middleware layer to support the reliable and ordered multicasting.
- There are several standards such as
- Object Management Group's (OMG) common object request broker architecture (CORBA) ,
- RPC software
  - o sends a message across the network to invoke the remote procedure.

- o waits for a reply,
  - o after which the procedure call completes from the program perspective that invoked it.
- Some of the commercial versions of middleware often in use are CORBA, DCOM (distributed component object model), Java, and RMI (remote method invocation), message-passing interface (MPI).

The motivation of using a distributed system is because of the following requirements:

### **1. Inherently distributed computations**

Applications like money transfer in banking requires the computation that is inherently distributed.

### **2. Resource sharing**

Resources like peripherals, databases, data (variable/files) cannot be fully replicated at all the sites. Further, they can't be placed at a single site as it leads to the bottleneck problem. Hence, such resources are distributed across the system.

### **3. Access to geographically remote data and resources**

As the data may be too large and sensitive it cannot be replicated. Example, payroll data. Hence stored at a central server (like super computers) which can be queried using remote login. Advances in mobile devices and the wireless technology have proven the importance of distributed protocols and middleware.

### **4. Enhanced reliability**

A distributed system has provided increased reliability by the replicating resources and executions in geographically distributed systems which does not crash/malfunction at the same time under normal circumstances.

Reliability is defined in the aspect of

- *availability*, i.e., the resource should be accessible at all times;
- *integrity*, i.e., the value/state of the resource must be correct, in the face of concurrent access from multiple processors,
- *fault-tolerance*, i.e., the ability to recover from system failures.

### **5. Increased performance/cost ratio**

By resource sharing and accessing remote data will increase the performance/cost ratio. The distribution of the tasks across various computers provides a better performance/cost ratio, for example in NOW configuration.

A distributed system offers the following advantages:

### **6. Scalability**

As the processors are connected by a wide-area network, adding more processors does not impose a bottleneck for communication network.

## 7. Modularity and incremental expandability

Heterogeneous processors can be easily added without affecting the performance, as processors runs the same middleware algorithms. Similarly, existing processors can be easily replaced by other processors.

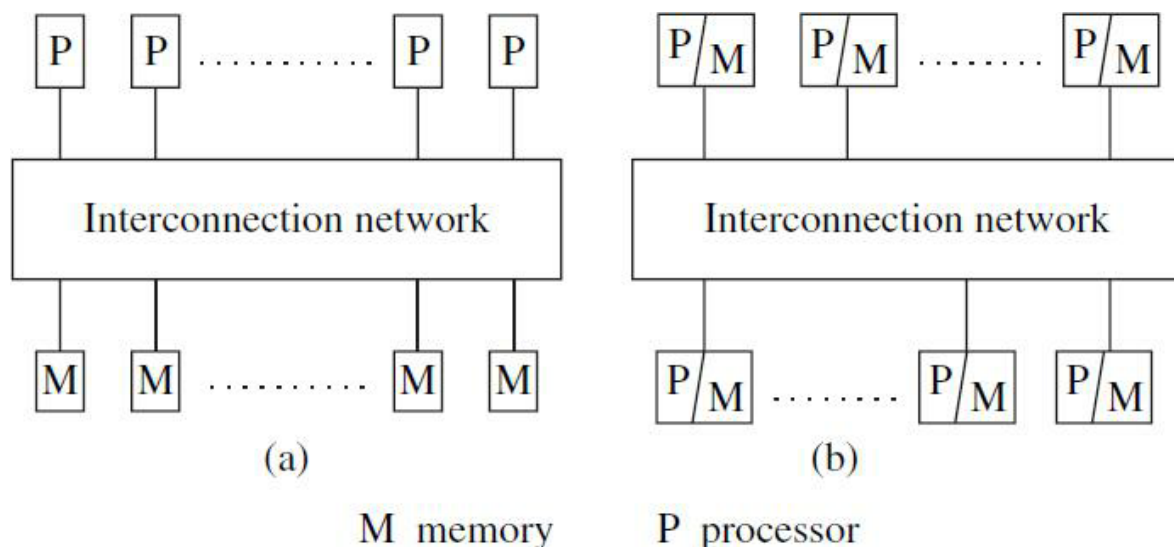
### 1.4 Relation to parallel multiprocessor/multicomputer systems

#### 1.4.1 Characteristics of parallel systems

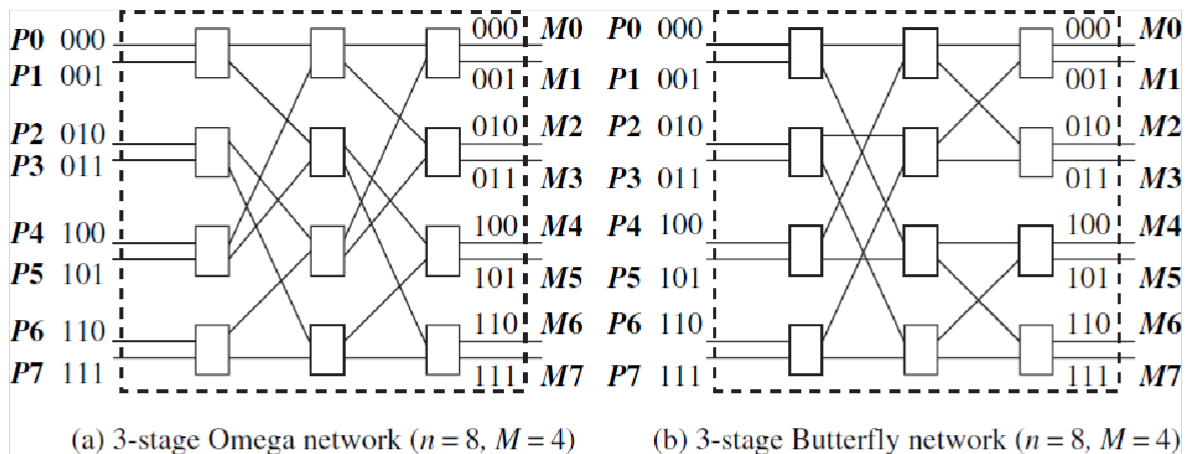
A parallel system may be broadly classified as belonging to one of three types:

##### 1. *multiprocessor system*

- It is a parallel system in which the multiple processors have *direct access to shared memory* which forms a common address space. The architecture is shown in Figure 1.3(a). Such processors usually do not have a common clock and has uniform memory access architecture (UMA -waiting time, access any memory location from any processor is same).
- The processors that are in close physical proximity are connected by an interconnection network. Interprocess communication across processors is done through
  - o read and write operations on the shared memory.
  - o Message-passing primitives using MPI
- All processors run the same operating system, the hardware and software that are very tightly coupled.



**Figure 1.3** Two standard architectures for parallel systems. (a) Uniform memory access (UMA) multiprocessor system. (b) Non-uniform memory access (NUMA) multiprocessor. In both architectures, the processors may locally cache data from memory.



**(Figure 1.4** Interconnection networks for shared memory multiprocessor systems. (a)

Omega network [4] for  $n = 8$  processors P0–P7 and memory banks M0–M7. (b) Butterfly network [10] for  $n = 8$  processors P0–P7 and memory banks M0–M7.)

- The processors are usually of the same type, and are housed within the same box/container with a shared memory.
- The interconnection network to access the memory is using a bus, that provide greater efficiency, it is usually a *multistage switch* with a symmetric and regular design.
- Figure 1.4 shows two popular interconnection networks –
  - the Omega network
  - the Butterfly network
- It is a multi-stage network formed of  $2 \times 2$  switching elements. Each  $2 \times 2$  switch allows data on either of the two input wires to be switched to the upper or the lower output wire.
- In a single step, only one data unit can be sent on an output wire.
- So, if data from both the input wires are to be routed to the same output wire in a single step, collision happens.
- Buffering or more elaborate interconnection designs used to overcome collisions.
- Each  $2 \times 2$  switch is represented as a rectangle in the figure.
- An  $n$ -input and  $n$ -output network uses  $\log n$  stages and  $\log n$  bits for addressing.
- Routing in the  $2 \times 2$  switch at stage  $k$  uses only the  $k$ th bit, and is done at clock speed.
- The multi-stage networks can be constructed recursively, and the interconnection pattern between any two stages can be expressed using an iterative or a recursive generating function.

#### Omega interconnection function

- The Omega network, connects  $n$  processors to  $n$  memory units has  $n/2 \log_2 n$  switching elements of size  $2 \times 2$  arranged in  $\log_2 n$  stages.

- Between each pair of adjacent stages, a link exists between output  $i$  of a stage and input  $j$  to the next stage follows the *perfect shuffle* pattern.
- The iterative generation function is as follows:

$$j = \begin{cases} 2i, & \text{for } 0 \leq i \leq n/2 - 1, \\ 2i + 1 - n, & \text{for } n/2 \leq i \leq n - 1. \end{cases} \quad (1.1)$$

- With respect to the Omega network in Figure 1.4(a),  $n = 8$ . Hence, for any stage, for the outputs  $i$ , where  $0 \leq i \leq 3$ , the output  $i$  is connected to input  $2i$  of the next stage. For

$4 \leq i \leq 7$ , the output  $i$  of any stage is connected to input  $2i+1-n$  of the next stage. **Omega routing function**

- The routing function from input line  $i$  to output line  $j$  considers only  $j$  and the stage number  $s$ , where  $s \in [0, \log_2 n - 1]$ .
- In a stage  $s$  switch, if the  $s+1$  MSB (most significant bit) of  $j$  is 0, the data is routed to the upper output wire, otherwise it is routed to the lower output wire.

### Butterfly interconnection function

- The generation of the interconnection pattern between a pair of adjacent stages depends not only on  $n$  but also on the stage number  $s$ . The recursive expression is as follows.
- Let there be  $M = n/2$  switches per stage, and let a switch be denoted by the tuple  $\langle x, s \rangle$ , where  $x \in [0, M-1]$  and stage  $s \in [0, \log_2 n - 1]$ .
- The two outgoing edges from any switch  $\langle x, s \rangle$  are as follows. There is an edge from switch  $\langle x, s \rangle$  to switch  $\langle y, s+1 \rangle$  if
  - $x = y$  or
  - $x \oplus y$  has exactly one 1 bit, which is in the  $s+1$ th MSB.
- For stage  $s$ , apply the rule above for  $M/2$  switches.
- Whether the two incoming connections go to the upper or lower input port is not important because of the routing function, given below.

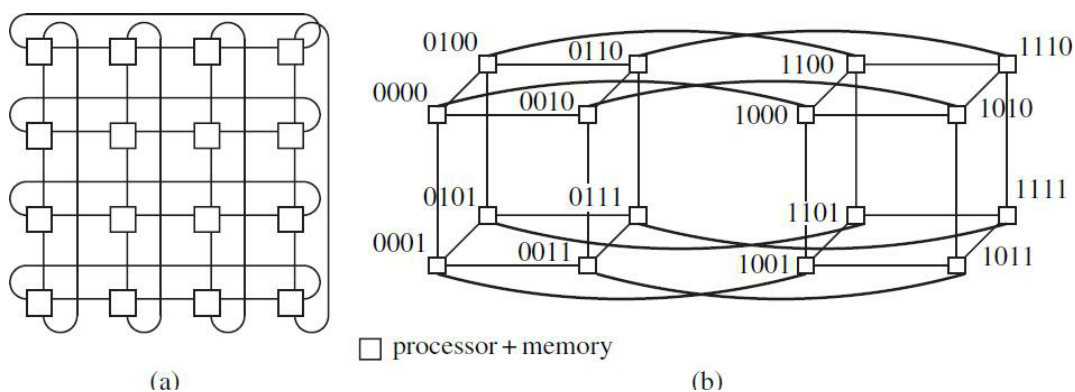
### Butterfly routing function

- In a stage  $s$  switch, if the  $s+1$  MSB of  $j$  is 0, the data is routed to the upper output wire, otherwise it is routed to the lower output wire. **Note:-**
- In Butterfly and Omega networks, the paths from the different inputs to any one output form a spanning tree. This implies that collisions will occur when data is destined to the same output line.
- Advantage: Data can be combined at the switches if the application semantics are known.

## 2. multicomputer parallel system

- It is a parallel system in which the multiple processors *do not have direct access to shared memory*.

- The memory of multiple processors may or may not form a common address space and do not have a common clock as shown in Figure 1.3(b).
- The processors that are in close physical proximity are very tightly coupled (homogenous hardware and software), and connected by an interconnection network.
- The processors communicate either via a common address space or via message-passing.
- A multicomputer system that has a common address space *usually* corresponds to a non-uniform memory access (NUMA – access various shared memory locations from different processors varies) architecture.
- Examples: NYU Ultracomputer, Sequent shared memory machines, the CM\* Connection machine
- Processors configured in regular and symmetrical topologies such as an array or mesh, ring, torus, cube, and hypercube (message-passing machines).
- Figure 1.5(a) shows a wrap-around 4×4 mesh. For a  $k \times k$  mesh which will contain  $k^2$  processors, the maximum path length between any two processors is  $2(k/2-1)$ . Routing can be done along the Manhattan grid.
- Figure 1.5(b) shows a four-dimensional hypercube. A  $k$ -dimensional hypercube has  $2^k$  processor-and-memory units.
- Each such unit is a node in the hypercube and has a unique  $k$ -bit label. The processors are labelled such that the shortest path between any two processors is the *Hamming distance* between the processor labels. This is clearly bounded by  $k$ .



**(Figure 1.5** Some popular topologies for multicomputer shared-memory machines. (a) Wrap-around 2D-mesh, also known as torus. (b) Hypercube of dimension 4.)

- The hypercube and its variant topologies have very interesting mathematical properties with implications for routing and fault-tolerance.

### 3. Array processors

- It belong to a class of parallel computers that are physically co- located, are very tightly coupled, and have a common system clock but may not share memory and communicate by passing data using messages.
- Array processors perform tightly synchronized processing and data exchange in lock-step for applications such as DSP and image processing belong to this category. These applications usually involve a large number of iterations on the data.

#### 1.4.2 Flynn's taxonomy

Flynn identified four processing modes, based on whether the processors executes same or different instruction streams and whether or not processed the same (identical) data at the same time.

##### Single instruction stream, single data stream (SISD)

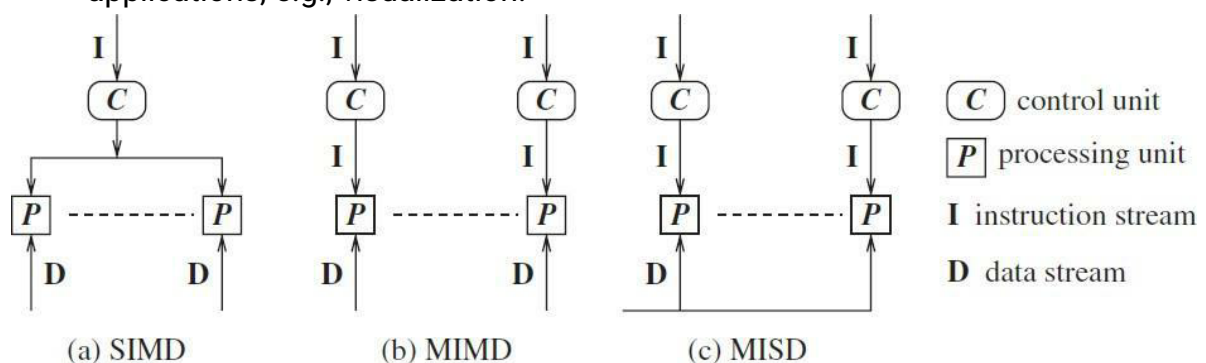
This mode corresponds to the conventional processing in the von Neumann paradigm with a single CPU, and a single memory unit connected by a system bus.

##### Single instruction stream, multiple data stream (SIMD)

- In this mode processing by multiple homogenous processors executes in lock -step on different data items.
- Applications that involve operations on large arrays and matrices like scientific applications can exploit systems with SIMD mode of operation as the data sets can be partitioned easily.
- Example : parallel computers like Illiac-IV, MPP, CM2 were SIMD machines.

##### Multiple instruction stream, single data stream (MISD)

- This mode corresponds to the execution of different operations in parallel on the same data. This is a specialized mode of operation with limited but niche applications, e.g., visualization.



(Figure 1.6 Flynn's taxonomy of SIMD, MIMD, and MISD architectures for multiprocessor/multicomputer systems.)

##### Multiple instruction stream, multiple data stream (MIMD)



- In this mode, various processors execute different code on different data. It is used in distributed systems as well as parallel systems.
- There is no common clock among the system processors.  
Examples: Sun Ultra servers, multicomputer PCs, and IBM SP machines.
- It allows much flexibility in partitioning code and data to be processed among the processors.
- The degree of coupling among a set of modules, whether hardware or software, is measured in terms of the interdependency and binding and/or homogeneity among the modules.
- When the degree of coupling is high (low), the modules are said to be tightly (loosely) coupled.
- SIMD and MISD architectures generally tend to be tightly coupled because of the common clocking of the shared instruction stream or the shared data stream.
- This is a measure of the relative speedup of a specific program, on a given machine.
- The speedup depends on the number of processors and the mapping of the code to the processors.
- It is expressed as the ratio of the time  $T(1)$  with a single processor, to the time  $T(n)$  with  $n$  processors.

#### **Parallelism within a parallel/distributed program**

- This is an aggregate measure of the percentage of time that all the processors are executing CPU instructions productively.

#### **Concurrency of a program**

- The *parallelism/ concurrency* in a parallel/distributed program can be measured by the ratio of the number of local operations to the total number of operations, including the communication or shared memory access operations.
- The ratio of the amount of computation to the amount of communication within the parallel/distributed program is termed as *granularity*.
- If the degree of parallelism is coarse-grained (fine-grained), there are relatively many more (fewer) productive CPU instruction executions and wait to get synchronized with the other processors.
- Programs with fine-grained parallelism are best suited for tightly coupled systems like SIMD and MISD architectures.
- The latency delays for the frequent communication over the WAN would significantly degrade the overall throughput.
- Hence loosely coupled multicomputers, programs with a coarse-grained communication/message-passing granularity will incur less overhead.

***various classes of multiprocessor/multicomputer operating systems:***

- The operating system running on loosely coupled processors (i.e., heterogenous distant processors) running loosely coupled software (i.e., heterogenous), is classified as a *network operating system*.
- The operating system running on loosely coupled processors, running tightly coupled software (i.e., middleware software), is classified as a *distributed operating system*.
- The operating system running on tightly coupled processors, running tightly coupled software, is classified as a *multiprocessor operating system*.

### 1.5 Message-passing systems versus shared memory systems

- In Shared memory systems there is a (common) shared address space throughout the system.
- Communication among processors takes place via shared data variables, and control variables for synchronization (Semaphores and monitors) among the processors.
- If a shared memory is distributed then it is called *distributed shared memory*.
- All multicomputer (NUMA as well as message-passing) systems that do not have a shared address space hence communicate by message passing.

#### 1.5.1 Emulating message-passing on a shared memory system (MP → SM)

- The shared address space is partitioned into disjoint parts, one part being assigned to each processor.
- “Send” and “receive” operations are implemented for writing to and reading from the destination/sender processor’s address space, respectively.
- Specifically, a separate location is reserved as **mailbox** (assumed to have unbounded in size) for each ordered pair of processes.
- A  $P_i$ – $P_j$  message-passing can be emulated by a write by  $P_i$  to the mailbox and then a read by  $P_j$  from the mailbox.
- The write and read operations are controlled using synchronization primitives to inform the receiver/sender after the data has been sent/received.

#### 1.5.2 Emulating shared memory on a message-passing system (SM → MP)

- This involves use of “send” and “receive” operations for “write” and “read” operations.
- Each shared location can be modeled as a separate process;
- “*write*” to a shared location is emulated by sending an *update* message to the corresponding owner process and a “*read*” by sending a *query* message.
- As accessing another processor’s memory requires send and receive operations, this emulation is expensive.
- In a MIMD message-passing multicomputer system, each “processor” may be a tightly coupled multiprocessor system with shared memory. Within the multiprocessor system, the processors communicate via shared memory.
- Between two computers, the communication by message passing are more suited for wide-area distributed systems.

## 1.6 Primitives for distributed communication

### 1.6.1 Blocking/non-blocking, synchronous/asynchronous primitives

- Message send and receive communication primitives are denoted *Send()* and *Receive()*, respectively.
- A *Send* primitive has at least two parameters the destination, and the buffer in the user space, containing the data to be sent.
- a *Receive* primitive has at least two parameters – the source of the data, and the user buffer into which the data is to be received.
- There are two ways of sending data while *Send* is invoked – the *buffered option* and the *unbuffered option*.
- The *buffered option* - copies the data from user buffer to kernel buffer. The data later gets copied from kernel buffer onto the network.
- The *unbuffered option* - the data gets copied directly from user buffer onto the network.
- For *Receive*, buffered option is required as the data has already arrived when the primitive is invoked, and needs a storage place in the kernel.
- The following are some definitions of blocking/non-blocking and synchronous/ asynchronous primitives:
- **Synchronous primitives** A *Send* or a *Receive* primitive is *synchronous* if both the *Send()* and *Receive()* handshake with each other. The processing for the *Send* primitive completes only after the other corresponding *Receive* primitive has also been completed. The processing for the *Receive* primitive completes when the data to be received is copied into the receiver's user buffer.
- **Asynchronous primitives** A *Send* primitive is said to be *asynchronous* if control returns back to the invoking process after the data item to be sent is copied out of the user-specified buffer.
- **Blocking primitives** A primitive is *blocking* if control returns to the invoking process after the processing completes.
- **Non-blocking primitives**
  - A primitive is *non-blocking* if control returns back to the invoking process immediately after invocation, even the operation has not completed.
  - For a non-blocking *Send*, control returns to the process even before the data is copied out of the user buffer. For a non-blocking *Receive*, control returns to the process even before the data may have arrived from the sender.
  - For non-blocking primitives, a return parameter of the call returns a system-generated *handle* which can be later used to check the status of completion of the call.
  - The process can check for the completion of the call in two ways.
    1. keep checking (in loop or periodically), if the handle has been flagged or *posted*.
    2. issue a *Wait* with a list of handles as parameters which will block until posted.
- The code for a non-blocking *Send* would look as shown in Figure 1.7.

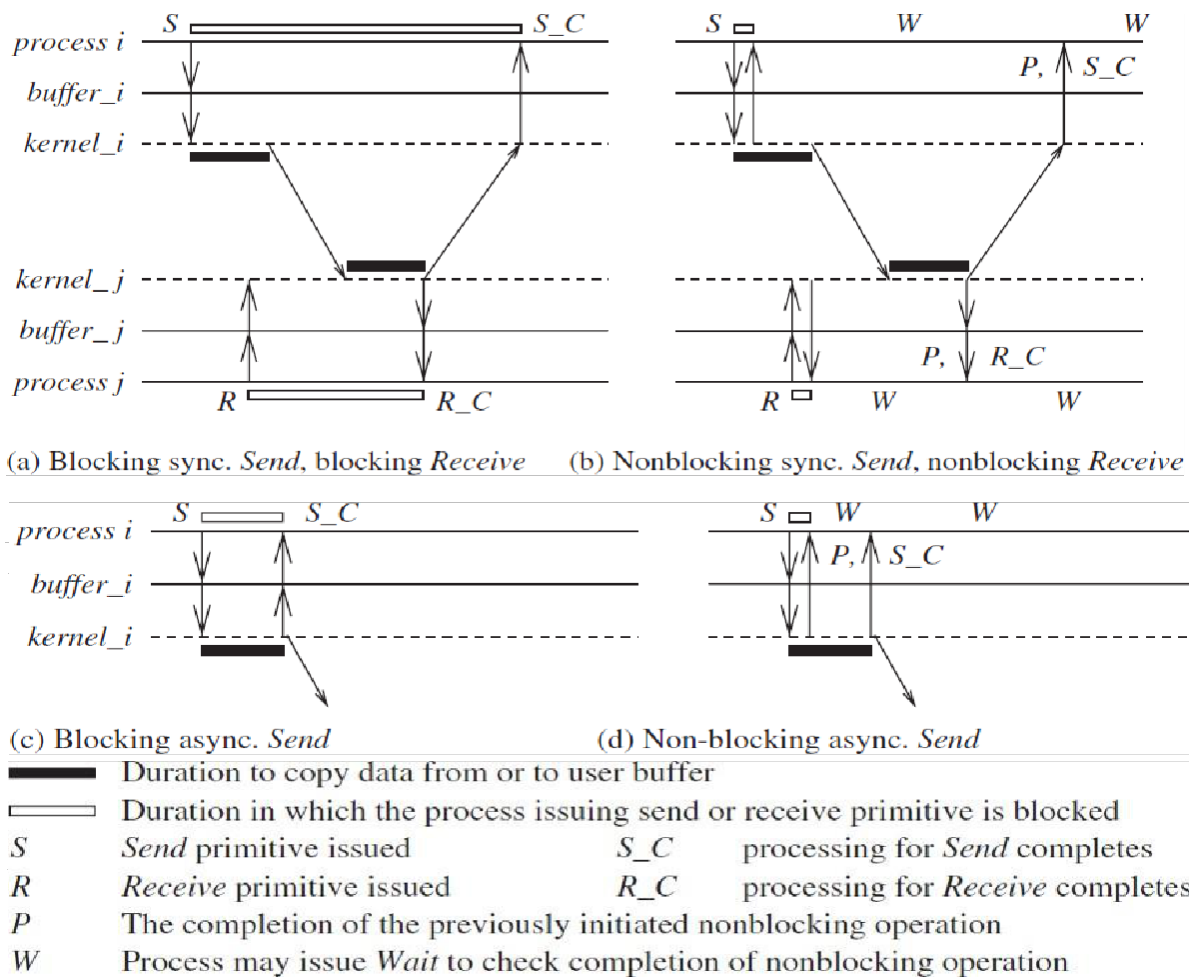
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Send(X, destination, handlek)           // handlek is a return parameter
...
...
Wait(handle1, handle2, ..., handlek, ..., handlem)       // Wait always blocks

```

**Figure 1.7** A non-blocking send primitive. When the Wait call returns, at least one of its parameters is posted

- If the processing of the primitive has not completed, the *Wait* blocks and waits for a signal to wake it up.
- When the processing for the primitive completes, the communication subsystem software sets the value of handle<sub>k</sub> and wakes up (signals) any process with a *Wait* call blocked on this handle<sub>k</sub>. This is called *posting* the completion of the operation.



**Figure 1.8** Blocking/non-blocking and synchronous/asynchronous primitives. Process *P<sub>i</sub>* is sending and process *P<sub>j</sub>* is receiving. (a) Blocking synchronous Send and blocking (synchronous) Receive. (b) Non-blocking synchronous Send and nonblocking (synchronous) Receive. (c) Blocking asynchronous Send. (d) Non-blocking asynchronous Send.

- Here, three time lines are shown for each process: (1) for the process execution,

- **Blocking synchronous *Send*** : The data gets copied from user buffer to kernel buffer and is then sent over the network. After the data is copied to the receiver's system buffer and a *Receive* call has been issued, an acknowledgement back to the sender causes control to return to the process that invoked the *Send* operation and completes the *Send*.
- **non-blocking synchronous *Send***
  - Control returns back to the invoking process as soon as it copies the data from user buffer to kernel buffer is initiated.
  - A parameter in non-blocking call gets set with the handle of a location that a user process can check later for the completion of synchronous send operation.
- **Blocking asynchronous *Send***

The user process that invokes the *Send* is blocked until the data is copied from the user's buffer to the kernel buffer. For the unbuffered option, until the data is copied from the user's buffer to the network.
- **non-blocking asynchronous *Send***
  - *Send* is blocked until the transfer of data from the user's buffer to the kernel buffer is initiated. For the unbuffered option, it is blocked until data gets transferred from user's buffer to network is initiated.
  - Control returns to the user process as soon as this transfer is initiated, and a parameter in non-blocking call gets set with the handle to check later using *Wait* operation for the completion of the asynchronous *Send* operation.
- **Blocking *Receive***

It blocks until the data expected arrives and is written in the specified user buffer. Then control is returned to the user process.
- **non-blocking *Receive***
  - It will cause the kernel to register the call and return the handle of a location that the user process can later check for the completion of the non-blocking *Receive* operation.
  - The user process can check for the completion of the non-blocking *Receive* by invoking the *Wait* operation on the returned handle.
- The non-blocking asynchronous *Send* is useful when a large data item is being sent because it allows the process to perform other instructions in parallel with the completion of the *Send*.
- The non-blocking synchronous *Send* also avoids the large delays for handshaking, particularly when the receiver has not yet issued the *Receive* call.
- The non-blocking *Receive* is useful when a large data item is being received and/or when the sender has not yet issued the *Send* call, because it allows the process to perform other instructions in parallel with the completion of the *Receive*.

### 1.6.2 Processor synchrony

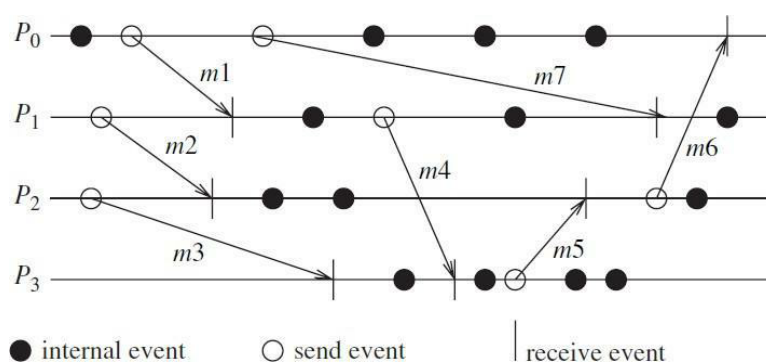
- *Processor synchrony* indicates that all the processors execute in lock-step with their clocks synchronized.
- As this synchrony difficult in distributed system, a large granularity of code, is termed as a *step*, the processors are synchronized.
- This synchronization ensures that no processor begins executing the next step of code until all the processors have completed executing the previous steps of code assigned to each of the processors.

### 1.6.3 Libraries and standards

- There exists a wide range of primitives for message-passing.
1. Many commercial software products(banking, payroll applications) use proprietary primitive libraries supplied with software vendors (i.e., IBM CICS software).
  2. The message-passing interface (MPI) library and the PVM (parallel virtual machine) library are used largely by the scientific community
  3. Commercial software is often written using remote procedure calls (RPC) mechanism in which procedures that resides across the network are invoked transparently to the user, in the same manner that a local procedure is invoked.
  4. socket primitives or socket-like transport layer primitives are invoked to call the procedure remotely.
  5. There exist many implementations of RPC like Sun RPC, and distributed computing environment (DCE) RPC.
  6. "Messaging" and "streaming" are two other mechanisms for communication.
  7. For object based software, libraries for remote method invocation (RMI) and remote object invocation (ROI) is used.
  8. CORBA (common object request broker architecture) and DCOM (distributed component object model) are two other standardized architectures with their own set of primitives.

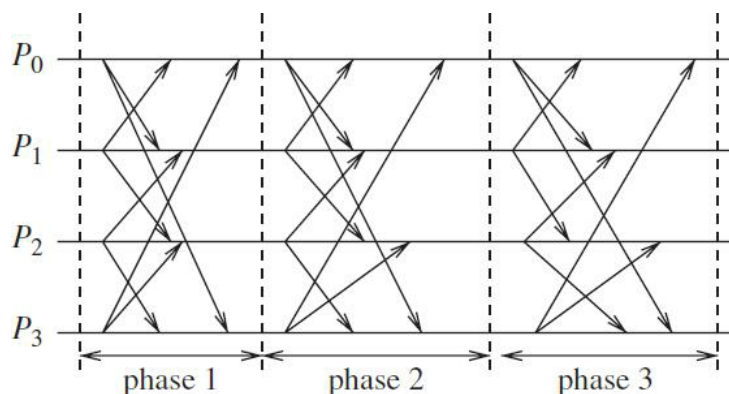
### 1.7 Synchronous versus asynchronous executions

- An *asynchronous execution* is an execution in which (i) there is no processor synchrony and there is no bound on the drift rate of processor clocks, (ii) message delays (transmission + propagation times) are finite but unbounded, and (iii) there is no upper bound on the time taken by a process to execute a step.



**Figure 1.9** An example timing diagram of an asynchronous execution in a message-passing system.

- A *synchronous execution* is an execution in which (i) processors are synchronized and the clock drift rate between any two processors is bounded, (ii) message delivery (transmission + delivery) times are such that they occur in one logical step or round, and (iii) there is a known upper bound on the time taken by a process to execute a step. If processors are allowed to have an asynchronous execution for a period of time and then they synchronize, then the granularity of the synchrony is coarse. This is really a *virtually synchronous execution*, and the abstraction is sometimes termed as *virtual synchrony*. Ideally, many programs want the processes to execute a series of instructions in rounds (also termed as steps or phases) asynchronously, with the requirement that after each round/step/phase, all the processes should be synchronized and all messages sent should be delivered.



**Figure 1.10** An example of a synchronous execution in a message-passing system. All the messages sent in a round are received within that same round.

#### 1.7.1 Emulating an asynchronous system by a synchronous system ( $A \rightarrow S$ )

An asynchronous program can be emulated on a synchronous system as a special case of an asynchronous system – all communication finishes within the same round in which it is initiated.

#### 1.7.2 Emulating a synchronous system by an asynchronous system ( $S \rightarrow A$ )

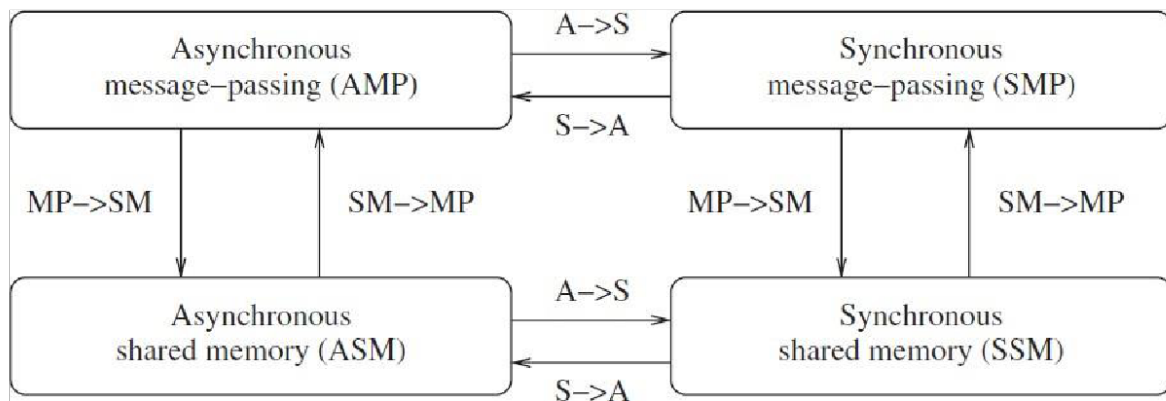
A synchronous program (written for a synchronous system) can be emulated on an asynchronous system using a tool called *synchronizer*.

#### 1.7.3 Emulations

Using the emulations shown, any class can be emulated by any other. If system A can be emulated by system B, denoted  $A/B$ , and if a problem is not solvable in B, then it is also not solvable in A. Likewise, if a problem is solvable in A, it is also solvable in B.

Hence, all four classes are equivalent in terms of “computability” i.e., what can and cannot be computed – in failure-free systems.





**Figure 1.11** Emulations among the principal system classes in a failure-free system

### 1.8 Design issues and challenges

- The important design issues and challenges is categorized as
  - related to systems design and operating systems design, or
  - component related to algorithm design, or
  - emerging from recent technology

#### 1.8.1 Distributed systems challenges from a system perspective

The following functions must be addressed when designing and building a distributed system:

- **Communication** This task involves designing appropriate mechanisms for communication among the processes in the network. Example: remote procedure call (RPC), remote object invocation (ROI), etc.
- **Processes** Some of the issues involved are: management of processes and threads at clients/servers; code migration; and the design of software and mobile agents.
- **Naming** Devising easy to use and robust schemes for names, identifiers, and addresses is essential for locating resources and processes in a transparent and scalable manner. Naming in mobile systems provides additional challenges.
- **Synchronization** Mutual exclusion is an example of synchronization, other forms of synchronization are leader election and synchronizing physical clocks.
- **Data storage and access** Schemes for data storage, and implicitly for accessing the data in a fast and scalable manner across the network are important for efficiency.
- **Consistency and replication** To avoid bottlenecks, to provide fast access to data, and to provide scalability, replication of data objects is highly desirable. This leads to issues of managing the replicas, and dealing with consistency among the replicas/caches in a distributed setting.
- **Fault tolerance** to maintaining correct and efficient operation in spite of any failures of links, nodes, and processes. Process resilience, reliable communication, distributed commit, and check pointing and recovery are some of the fault-tolerance mechanisms.

- **Security** Distributed systems security involves various aspects of cryptography, secure channels, access control, authorization, and secure



group management.

- **Applications Programming Interface (API) and transparency** The API for communication and other services for the ease of use and wider adoption of distributed systems services by non-technical users.

- Transparency deals with hiding the implementation policies from user, and is classified as follows:
  - *Access transparency*: hides differences in data representation on different systems and provides uniform operations to access system resources.
  - *Location transparency*: makes the locations of resources transparent to the users.
  - *Migration transparency*: allows relocating resources without changing names.
  - *Concurrency transparency* deals with masking concurrent use of shared resources for user.
  - *Failure transparency*: refers to the system being reliable and fault-tolerant.
- **Scalability and modularity** The algorithms, data (objects), and services must be as distributed as possible. Various techniques such as replication, caching and cache management, and asynchronous processing help to achieve scalability.

### 1.8.2 Algorithmic challenges in distributed computing

- The key algorithmic challenges in distributed computing is as summarized below:
- **Designing useful execution models and frameworks**
  - The *interleaving* model and *partial order* model are two widely adopted models of distributed system executions are useful for operational reasoning and the design of distributed algorithms.
  - The *input/output automata* model and the *TLA (temporal logic of actions)* are two other examples of models that provide different degrees of infrastructure for proving the correctness of distributed programs.
- **Dynamic distributed graph algorithms and distributed routing algorithms**
- The distributed system is modeled as a distributed graph.
- the graph algorithms form the building blocks for a large number of higher level communication, data dissemination, object location, and object search functions.
- The algorithms need to deal with dynamically changing graph characteristics, such as varying link loads, user-perceived latency, congestion in the network in a routing algorithm. Hence, the design of efficient distributed graph algorithms is important.
- **Time and global state in a distributed system**
- The challenges pertain to providing accurate *physical time*, and to providing a variant of time, called *logical time*.
- Logical time is relative time, and can (i) capture the logic and inter-process dependencies within the distributed program, and also (ii) track the relative progress at each process.
- Observing the *global state* of the system (across space) also involves the time dimension for consistent observation.
- The processes must be allowed to execute concurrently, except when they need to synchronize to exchange information, i.e., communicate about shared data.
- Synchronization is essential for the distributed processes to overcome the limited observation of the system state from the viewpoint of any one process.

- The synchronization mechanisms is viewed as resource and concurrency management mechanisms to control the behavior of the processes.

- some examples of problems requiring synchronization:
  - **Physical clock synchronization** Physical clocks usually diverge in their values due to hardware limitations. Keeping them synchronized is a fundamental challenge to maintain common time.
  - **Leader election** All the processes need to agree on which process will play the role of a distinguished process – called a leader process which is necessary for many distributed algorithms to initiate some action like a broadcast or collecting the state of the system.
  - **Mutual exclusion** This is clearly a synchronization problem because access to the critical resource(s) has to be coordinated.
  - **Deadlock detection and resolution**
    - Deadlock detection needs coordination to avoid duplicate work, and
    - deadlock resolution needs coordination to avoid unnecessary aborts of processes.
  - **Termination detection** This requires cooperation among the processes to detect the specific global state of quiescence.
  - **Garbage collection** Garbage refers to objects that are no longer in use and that are not pointed to by any other process. Detecting garbage requires coordination among the processes.
- A group is a collection of processes on an application domain.
- Specific algorithms need to be designed to enable efficient group communication and group management wherein processes can join and leave groups dynamically, or even fail.
- When multiple processes send messages concurrently, different recipients may receive the messages in different orders that violates the semantics of distributed program. Hence, formal specifications for ordered delivery need to be formulated.

### Monitoring distributed events and predicates

- Predicates defined on program variables that are local to different processes are used for specifying conditions on the global system state, and are useful for applications like debugging, sensing the environment, and in industrial process control hence for monitoring such predicates are important.
- An important paradigm for monitoring distributed events is that of *event streaming*.

### Distributed program design and verification tools

- Methodically designed and verifiably correct programs can greatly reduce the overhead of software design, debugging, and engineering.
- Designing mechanisms to achieve these design and verification goals is a challenge.

### Debugging distributed programs

- debugging distributed programs is much harder because of the concurrency in actions and uncertainty due to the large number of possible executions defined by the interleaved concurrent actions.
- Adequate debugging mechanisms and tools need to be designed to meet this challenge.

**Data replication, consistency models, and caching**

- Fast access to data and other resources requires replication in the distributed system.
- Managing such replicas in the face of updates introduces consistency problems among the replicas and cached copies.
- Additionally, placement of the replicas in the systems is also a challenge.
  
- The Web is an example of widespread distributed system with direct interface to the end user where the operations are read-intensive on most objects.
- The issues of object replication and caching has to be considered.
- Example: Prefetching can be used for subscribing of Content Distribution Servers.
- Minimizing response time to minimize user perceived latencies is an important challenge.
- Object search and navigation on the web are resource-intensive. Designing mechanisms to do this efficiently and accurately is a great challenge.
  
- A shared memory abstraction deals only with read and write operations, and no message communication primitives.
- But the middleware layer abstraction has to be implemented using message-passing.
- Hence, in terms of overheads, the shared memory abstraction is not less expensive.
- **Wait-free algorithms**
  - Wait-freedom is defined as the ability of a process to complete its execution irrespective of the actions of other processes.
  - While wait-free algorithms are highly desirable and expensive hence it is a challenge.
- **Mutual exclusion**
  - the Bakery algorithm and semaphores are used for mutual exclusion in a multiprocessing (uniprocessor or multiprocessor) shared memory setting.
- **Register constructions**
  - emerging technologies like biocomputing and quantum computing alter the present foundations of computer “hardware” design assumptions of memory access of current systems that are exclusively based on semiconductor technology and the von Neumann architecture.
  - The study of register constructions deals with the design of registers from scratch, with very weak assumptions on the accesses allowed to a register.
  - This forms a foundation for future architectures that allow concurrent access even to primitive units of memory (independent of technology) without any restrictions on the concurrency.
- **Consistency models**
  - For multiple copies of a variable/object, varying degrees of consistency among the replicas can be allowed.
  - a strict definition of consistency in a uniprocessor system would be expensive to implement in terms of high latency, high message overhead, and low concurrency.

- o But still meaningful models of consistency are desirable.

### **Reliable and fault-tolerant distributed systems**

- A reliable and fault-tolerant environment has multiple requirements and aspects and addressed using various strategies:
  - **Consensus algorithms**
    - o It relies on message passing, and the recipients take actions based on the contents of the received messages.
    - o It allows correct functioning of processes to reach agreement among themselves in spite of the existence of some malicious (adversarial) processes whose identities are not known to the correctly functioning processes.
  - **Replication and replica management**
    - o Replication ie., having backup servers is a classical method of providing fault-tolerance.
    - o The triple modular redundancy (TMR) technique is used in software as well as hardware installations.
- **Voting and quorum systems** Providing redundancy in the active (e.g., processes) or passive (e.g., hardware resources) components in the system and then performing voting based on some quorum criterion is a classical way of dealing with fault-tolerance. Designing efficient algorithms for this purpose is the challenge.
- **Distributed databases and distributed commit**
  - o For distributed databases, the ACID properties of the transaction (atomicity, consistency, isolation, durability) need to be preserved in distributed setting.
  - o The “transaction commit” protocols is a fairly mature area that can be applied for guarantees on message delivery in group communication in the presence of failures.
- **Self-stabilizing systems**
  - o All system executions have associated good (or legal) states and bad (or illegal) states; during correct functioning, the system makes transitions among the good states.
  - o Faults, internal or external to the program and system, may cause a bad state to arise in the execution.
  - o A *self-stabilizing* algorithm is any algorithm that is guaranteed to eventually take the system to a good state even if a bad state were to arise due to some error.
  - o Designing efficient self-stabilizing algorithms is a challenge.
- **Checkpointing and recovery algorithms**
  - o Checkpointing involves periodically recording the current state on secondary storage so that, in case of a failure, the entire computation is not lost but can be recovered from one of the recently taken checkpoints.
  - o Checkpointing in a distributed environment is difficult because if the checkpoints at the different processes are not coordinated.
- **Failure detectors**
  - o In asynchronous distributed systems there is no bound on time for message transmission.

- o Hence, it is impossible to distinguish a sent-but-not-yet-arrived message from a message that was never sent ie., alive or failed.
- o Failure detectors represent a class of algorithms that probabilistically suspect another process as having failed and then converge on a determination of the up/down status of the suspected process.



#### **Load balancing**

- o The goal of load balancing is to gain higher throughput, and reduce the user perceived latency.
- o Need: high network traffic or high request rate causing the network connection to be a bottleneck, or high computational load and to service incoming client requests with the least turnaround time.
- o The following are some forms of load balancing:
  - **Data migration** The ability to move data around in the system, based on the access pattern of the users.
  - **Computation migration** The ability to relocate processes in order to perform a redistribution of the workload.
  - **Distributed scheduling** This achieves a better turnaround time for the users by using idle processing power in the system more efficiently.

- **Real-time scheduling**

- o Real-time scheduling is important for mission-critical applications, to accomplish the task execution on schedule.
- o The problem becomes more challenging in a distributed system where a global view of the system state is absent.
- o message propagation delays are hard to control or predict, which makes meeting real-time guarantees that are inherently dependent on communication among the processes harder.

- **Performance**

- o Although high throughput is not the primary goal of using a distributed system, achieving good performance is important.
- o In large distributed systems, network latency and access to shared resources can lead to large delays which must be minimized.

### **1.8.3 Applications of distributed computing and newer challenges Mobile systems**

- Mobile systems typically use wireless communication which is based on electromagnetic waves and utilizes a shared broadcast medium.
- characteristics and issues are
  - *communication* : range and power of transmission,
  - *engineering* : battery power conservation, interfacing with wired Internet, signal processing and interference.
  - *computer science Perspective*: routing, location management, channel allocation, localization and position estimation, and the overall management of mobility.
- There are two architectures for a mobile network.

1. *base-station* approach are *cellular approach*,
  - where a *cell* is the geographical region within range of a static and powerful base transmission station is associated with base station.
  - All mobile processes in that cell communicate via the base station.
2. *ad-hoc network* approach
  - where there is no base station
  - All responsibility for communication is distributed among the mobile nodes,
  - Mobile nodes participate in routing by forwarding packets of other pairs of communicating nodes.
  - Hence complex and poses many challenges.
- **Sensor networks**
  - A sensor is a processor with an electro-mechanical interface i.e., capable of sensing physical parameters like temperature, velocity, pressure, humidity, and chemicals.
  - Recent developments in cost-effective hardware technology made very large low-cost sensors.
  - In *event streaming*, the streaming data reported from a sensor network differs from the streaming data reported by “computer processes”. This limits the nature of information about the reported event in a sensor network.
  - Sensors have to self-configure to form an ad-hoc network, that creates a new set of challenges like position estimation and time estimation.

### Ubiquitous or pervasive computing

- It is a class of computing where the processors embedded in the environment and perform computing appear anytime and everywhere like in sci-fi movies.
- The intelligent home, and the smart workplace are some example of ubiquitous environments currently under intense research and development.
- It is an distributed systems with wireless communication, sensor and actuator mechanisms. They are self-organizing, network-centric and resource constrained.
- It has small processors operating collectively in a dynamic network. The processors is connected to networks and processes the resources for collating data.

### Peer-to-peer computing

- Peer-to-peer (P2P) computing represents computing over an application layer network wherein all interactions among the processors are at a “peer” level.
- all processors are equal and play a symmetric role in computation.
- P2P networks are typically self-organizing, and may or may not have a regular structure to the network.
- No central directories for name resolution and object lookup are allowed.
- key challenges include:
  - o object storage mechanisms, efficient object lookup, and retrieval; dynamic reconfiguration as the nodes and objects join and leave the network randomly; anonymity, privacy, and security.



- There exists large amount of information, hence there is a greater need to receive and access only information of interest. Such information can be specified using filters.
- In a dynamic environment the information constantly fluctuates (stock prices), there needs to be an efficient mechanism for :
  - (i) distributing this information (*publish*),
  - (ii) to allow end users to indicate interest in receiving specific kinds of information (*subscribe*), and
  - (iii) aggregating large volumes of information and filtering based on user's subscription.
- Content distribution refers to multimedia data, where the multimedia data is very large and information-intensive, requires compression, and often requires special synchronization during storage and playback.
- Agents are software processes or robots that move around the system to do a specific task for which they are specially programmed.
- Agents collect and process information, and can exchange such information with other agents. It cooperate like an ant colony.
- Challenges: coordination mechanisms among the agents, controlling the mobility of the agents, and their software design and interfaces.

### **Distributed data mining**

- Data mining algorithms examine large amounts of data to detect patterns and trends in the data, to *mine* or extract useful information.
- Example: examining the purchasing patterns of customers to enhance the marketing.
- The mining is done by applying database and artificial intelligence techniques to a data repository.
- In many situations, data is distributed and cannot be collected in a single repository like banking applications where the data is private and sensitive, or in atmospheric weather prediction where the data sets are far too massive to collect and process at a single repository in real-time.
- In such cases, efficient distributed data mining algorithms are required.
- It is the technology that utilizes the idle CPU cycles of machines connected to the network and make it available to others.
- Challenges: scheduling jobs in a distributed environment, to implementing quality of service and real-time guarantees, and security.
- confidentiality – only authorized processes can access information.
- Authentication – whether the information is from the correct source, identity
- Availability – maintaining allowed access to services despite malicious actions.
- Goal: meet these challenges with efficient and scalable solutions.

- For peer-to-peer, grid, and pervasive computing, these challenges are difficult because of the resource-constrained environment, a broadcast medium, the lack of structure and in the network.

### A model of distributed Computations

- A distributed system consists of a set of processors that are connected by a communication network.

#### 2.1 A distributed program

- A distributed program is composed of a set of  $n$  asynchronous processes  $p_1, p_2, \dots, p_i, \dots, p_n$  that communicate by message passing over the communication network.
- The communication delay is finite and unpredictable. The processes do not share a global memory and communicate by passing messages.
- Let  $C_{ij}$  denote the channel from process  $p_i$  to process  $p_j$  and
- Let  $m_{ij}$  denote a message sent by  $p_i$  to  $p_j$ .
- Process execution and message transfer are asynchronous – ie., a process does not wait for the delivery of the message to be complete after sending it.
- *The global state of a distributed computation is composed of the states of the processes and the communication channels.*
- The state of a process is the state of its local memory and depends upon the context.
- The state of a channel is the set of messages in transit on the channel.

#### 2.2 A model of distributed executions

- The execution of a process consists of a sequential execution of its actions.
- The actions are atomic and the actions of a process are modeled as three types of events.
  - o internal events
  - o message send events,
  - o message receive events.

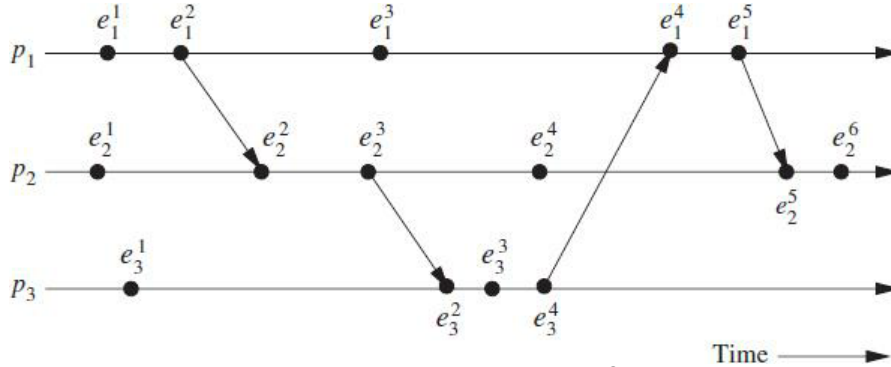
- Let  $e_i^x$  denote the  $x$ th event at process  $p_i$ .
- For a message  $m$ , let  $\text{send}(m)$  &  $\text{rec}(m)$  denote send and receive events, respectively.
- The occurrence of events changes the states of respective processes and channels, thus causing transitions in the global system state.
- An internal event changes the state of the process at which it occurs.
- A send event changes
  - o the state of the process that sends or receives and
  - o the state of the channel on which the message is sent.
- An internal event only affects the process at which it occurs.
- The events at a process are linearly ordered by their order of occurrence. The execution of process  $p_i$  produces a sequence of events  $e_i^1, e_i^2, \dots, e_i^x, e_i^{x+1}, \dots$  and is denoted by  $\mathcal{H}_i$ :

$$\mathcal{H}_i = (h_i, \rightarrow_i),$$

where  $h_i$  is the set of events produced by  $p_i$  and binary relation  $\rightarrow_i$  defines a linear order on these events. Relation  $\rightarrow_i$  expresses causal dependencies among the events of  $p_i$ .

- For every message  $m$  that is exchanged between two processes, have

- Relation  $\rightarrow_{msg}$  defines causal dependencies between send and receive events.
- Fig 2.1 shows a distributed execution using space-time diagram that involves three processes.
- A horizontal line represents the progress of the process; a dot indicates an event; a slant arrow indicates a message transfer.



The space-time diagram of a distributed execution.

- In this figure, for process p1, the 2nd event is a message send event, the 3rd event is an internal event, and the 4th event is a message receive event.

### Causal precedence relation

- The execution of a distributed application results in a set of distributed events produced by the processes.
- Let  $H = \{e_i^x\}$  denote the set of events executed in a distributed computation.
- a binary relation on the set  $H$  is denoted as  $\rightarrow$ , that expresses causal dependencies between events in the distributed execution.

$$\forall e_i^x, \forall e_j^y \in H, e_i^x \rightarrow e_j^y \Leftrightarrow \begin{cases} e_i^x \rightarrow_i e_j^y \text{ i.e., } (i = j) \wedge (x < y) \\ \text{or} \\ e_i^x \rightarrow_{msg} e_j^y \\ \text{or} \\ \exists e_k^z \in H : e_i^x \rightarrow e_k^z \wedge e_k^z \rightarrow e_j^y \end{cases}$$

||

- the
- For any two events  $e_i$  and  $e_j$ , if  $e_i \rightarrow e_j$ , then event  $e_j$  is directly or transitively dependent on event  $e_i$ ; in the figure 2.1,
- $e_1^1 \rightarrow e_3^3$  and  $e_3^3 \rightarrow e_2^6$
- Note that relation  $\rightarrow$  denotes flow of information in a distributed computation i.e., all information available at  $e_i$  is accessible at  $e_j$
- For any two events  $e_i$  and  $e_j$
- $e_1^3 \not\rightarrow e_2^3$  and  $e_2^4 \not\rightarrow e_3^1$
- denotes the fact that event  $e_j$  does not directly or transitively dependent on event  $e_i$ .
- For example in the figure 2.1:

- Note the following rules:
  - for any two events  $e_i$  and  $e_j$ ,  $e_i \not\rightarrow e_j \not\Rightarrow e_j \not\rightarrow e_i$
  - for any two events  $e_i$  and  $e_j$ ,  $e_i \rightarrow e_j \Rightarrow e_j \not\rightarrow e_i$ .

For any two events  $e_i$  and  $e_j$ , if  $e_i \not\rightarrow e_j$  and  $e_j \not\rightarrow e_i$ , then events  $e_i$  and  $e_j$  are said to be concurrent and the relation is denoted as  $e_i \parallel e_j$ . In the execution of Figure 2.1,  $e_1^3 \parallel e_3^3$  and  $e_2^4 \parallel e_3^1$ . Note that relation  $\parallel$  is not transitive; that is,  $(e_i \parallel e_j) \wedge (e_j \parallel e_k) \not\Rightarrow e_i \parallel e_k$ . For example, in Figure 2.1,  $e_3^3 \parallel e_2^4$  and  $e_2^4 \parallel e_1^5$ , however,  $e_3^3 \not\parallel e_1^5$ .

### Logical vs. physical concurrency

- Physical concurrency if and only if the events occur at the same instant in physical time.
- In a distributed computation, two events are logically concurrent if and only if they do not causally affect each other. For example, in Figure 2.1, events in the set  $\{e_1^3, e_2^4, e_3^1\}$  are logically concurrent, but they occurred at different instants in physical time.
- Whether a set of logically concurrent events coincide in the physical time or not they does not change the outcome of the computation.

### Models of communication networks

- models of the service provided by communication networks are:
  - In the FIFO model, each channel acts as a first-in first-out message queue and thus, message ordering is preserved by a channel.
  - In the non-FIFO model, a channel acts like a set in which the sender process adds messages and the receiver process removes messages from it in a random order.
  - The "causal ordering" model is based on Lamport's "happens before" relation. A system that supports the causal ordering model satisfies the following property: *CO: For any two messages  $m_{ij}$  and  $m_{kj}$ , if  $send(m_{ij}) \rightarrow send(m_{kj})$  then  $rec(m_{ij}) \rightarrow rec(m_{kj})$*
- Causally ordered delivery of messages implies FIFO message delivery.  
Note that  $CO \subset FIFO \subset Non-FIFO$ .
- Causal ordering model is useful in developing distributed algorithms. Example: replicated database systems, every process that updates a replica must receives updates in the same order to maintain database consistency.

### Global state of a distributed system

- The global state of a distributed system is a collection of the local states of its processes and the messages in the communication channels.
- The occurrence of events changes the states of respective processes and channels, thus causing transitions in global system state.
- $LS_i^0$  denotes the initial state of process  $p_i$ .
- $LS_i^x$  is a result of the execution of all the events executed by process  $p_i$  till  $e_i^x$ .

Let  $send(m) \leq LS_i^x$  denote the fact that  $\exists y: 1 \leq y \leq x : e_i^y = send(m)$  and  $rec(m)$

denote the fact that  $\forall y: 1 \leq y \leq x : e_i^y \neq rec(m)$ .

$i \neq rec(m)$ .

- Let  $SC_{ij}^{x,y}$  denote the state of a channel  $C_{ij}$  defined as follows:
  - $SC_{ij}^{x,y} = \{m_{ij} \mid send(m_{ij}) \leq LS_i^x \wedge rec(m_{ij}) \not\leq LS_j^y\}$ .

- Thus, channel state  $SC_{ij}^{x,y}$  denotes all messages that  $p_i$  sent up to event  $e_i^x$  and which process  $p_j$  had not received until event  $e_j^y$ .
- The global state  $GS$  of a distributed system is a collection of the local states of the processes and the channels is defined as

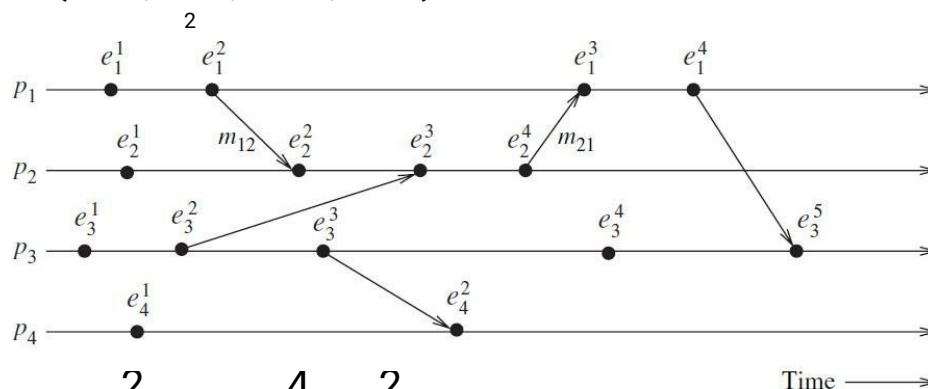
- For a global snapshot, the states of all the components of the distributed system must be recorded at the same instant. This is possible if the local clocks at processes were perfectly synchronized by the processes.
- Basic idea is that a message cannot be received if it was not sent i.e., the state should not violate causality. Such states are called *consistent global states*.
- Inconsistent global states are not meaningful in a distributed system.

A global state  $GS = \{\bigcup_i LS_i^{x_i}, \bigcup_{j,k} SC_{jk}^{y_j, z_k}\}$  is a *consistent global state* iff it satisfies the following condition:

$$\forall m_{ij} : send(m_{ij}) \not\leq LS_i^{x_i} \Rightarrow m_{ij} \notin SC_{ij}^{x_i, y_j} \wedge rec(m_{ij}) \not\leq LS_j^{y_j}$$

global state  $GS$  consisting of local states

- $\{LS_1^1, LS_2^3, LS_3^2, LS_4^2\}$  is inconsistent



- $\{LS_1^2, LS_2^4, LS_3^4, LS_4^2\}$  is consistent;

(The space-time diagram of a distributed execution)

|| A global state  $GS = \{\bigcup_i LS_i^{x_i}, \bigcup_{i,k} SC_{ik}^{y_j, z_k}\}$  is *transitless* iff

$$\forall i, \forall j : 1 \leq i, j \leq n :: SC_{ij}^{y_i, z_j} = \phi.$$

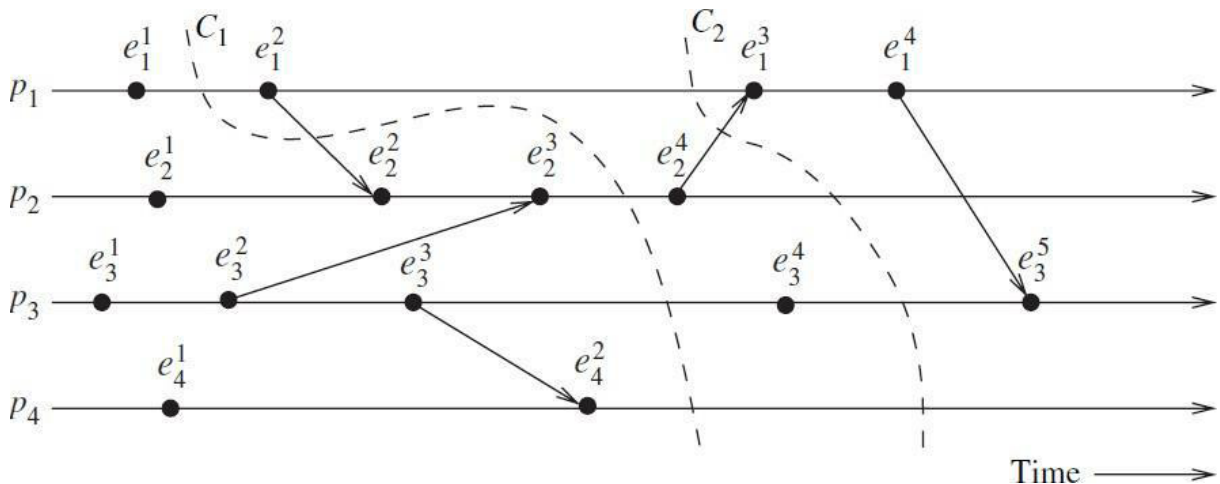
- A global state is *strongly consistent* iff it is transitless as well as consistent.  $\{LS_1^2, LS_2^3, LS_3^4, LS_4^2\}$  is strongly consistent.

## 2.5 Cuts of a distributed computation

- In the space-time diagram of a distributed computation, a zigzag line joining one arbitrary point on each process line is termed as *cut* in the computation.
- The PAST(C) contains all the events to the left of the cut C and the FUTURE(C) contains all the events to the right of the cut C.
- Every cut corresponds to a global state.

**definition 2.1** If  $e_i^{Max\_PAST_i(C)}$  denotes the latest event at process  $p_i$  that is in the PAST of a cut  $C$ , then the global state represented by the cut is  $\{\bigcup_i LS_i^{Max\_PAST_i(C)}, \bigcup_{j,k} SC_{jk}^{y_j, z_k}\}$  where  $SC_{jk}^{y_j, z_k} = \{m \mid send(m) \in PAST(C) \wedge rec(m) \in FUTURE(C)\}$ .

- A consistent global state corresponds to a cut in which every message received in the PAST of the cut is sent in the PAST of that cut. Such a cut is known as a **consistent cut**.
- All messages that cross the cut from the PAST to FUTURE are in transit of consistent global state.
- A cut is **inconsistent** if a message crosses the cut from the FUTURE to PAST.



(Illustration of cuts in a distributed execution)

- Cuts in a space–time diagram is a powerful graphical aid to represent and reason about global states of a computation.

## 2.6 Past and future cones of an event

- Let  $Past(e_j)$  denote all events in the past of  $e_j$  in a computation  $(H, \rightarrow)$ .
- $Pasti(e_j)$  be the set of all those events of  $Past(e_j)$  that are on process  $p_i$ .
- $Max\_Past(e_j) = \bigcup_i \{max(Pasti(e_j))\}$ .  $Max\_Past(e_j)$  consists of the latest event at every process that affected event  $e_j$  called as the *surface of the past cone* of  $e_j$ .
- $max(Pasti(e_j))$  is always a message send event.
- The future of an event  $e_j$ ,  $Future(e_j)$  contains all the events  $e_i$  that are causally affected by  $e_j$ .
- In a computation  $(H, \rightarrow)$ ,  $Future(e_j)$  is defined as:  $Future(e_j) = \{e_i \mid \forall e_i \in H, e_j \rightarrow e_i\}$
- $Future_i(e_j)$  as the set of events of  $Future(e_j)$  on process  $p_i$  and
- $min(Future_i(e_j))$  as the first event on process  $p_i$  that is affected by  $e_j$ . It is always a message receive event.
- $Min\_Past(e_j)$  is  $\bigcup_i \{min\_Future_i(e_j)\}$ , consists of first event at every process i.e., causally affected by event  $e_j$  is called the *surface of the future cone* of  $e_j$ .

- all events at a process  $p_i$  that occurred after  $\max\_Past_i(e_j)$  but before  $\min\_Future_i(e_j)$  are concurrent with  $e_j$ .
- Therefore, all and only those events of computation  $H$  that belong to the set " $H - Past(e_j) - Future(e_j)$ " are concurrent with event  $e_j$ .

### 2.7 Models of process communications

- There are two models of process communications synchronous and asynchronous.
- **Synchronous communication model:**
  - o It is a blocking type where the sender process blocks until the message received by the receiver process.
  - o the sender and receiver processes must synchronize to exchange a message.
  - o Synchronous communication is simple to handle and implement.
  - o The frequent blocking lead to poor performance and deadlocks.
- **Asynchronous Communication Model:**
  - o It is a non-blocking type where the sender and the receiver do not synchronize to exchange a message.
  - o After sent a message, the sender process buffers the message and is delivered to the receiver process when it is ready to accept the message.
  - o A buffer overflow may occur if sender sends a large number of messages. o It provides higher parallelism as the sender executes while the message is in transit to the receiver.
  - o Implementation of asynchronous communication requires complex buffer management.
  - o Due to higher degree of parallelism and non-determinism, it is difficult to design, verify, and implement.

## 3.2 A framework for a system of logical clocks

### 3.2.1 Definition

- A system of logical clocks consists of a time domain  $T$  and a logical clock  $C$ .
- Elements of  $T$  form a partially ordered set over a relation  $<$  called as *happened before* or *causal precedence*.
- The logical clock  $C$  is a function that maps an event  $e$  to the time domain  $T$ , denoted as  $C(e)$  and called the timestamp of  $e$ , and is defined as follows:

$$C: H \mapsto T$$

- such that the following monotonicity property is satisfied then it is called the *clock consistency condition*.  
for two events  $e_i$  and  $e_j$ ,  $e_i \rightarrow e_j \Rightarrow C(e_i) < C(e_j)$ .
- When  $T$  and  $C$  satisfy the following condition, the system of clocks is said to be *strongly consistent*.  
for two events  $e_i$  and  $e_j$ ,  $e_i \rightarrow e_j \Rightarrow C(e_i) < C(e_j)$ .

### 3.2.2 Implementing logical clocks

- Implementation of logical clocks requires addressing two issues:
- data structures local to every process to represent logical time and
- a protocol to update the data structures to ensure the consistency condition.



- Each process  $p_i$  maintains data structures with the following two capabilities:
  - A *local logical clock*,  $l_{ci}$ , that helps process  $p_i$  to measure its own progress.
  - A *logical global clock*,  $g_{ci}$ , represents the process  $p_i$ 's local view of logical global time. It allows this process to assign consistent timestamps to its local events.
- The protocol ensures that a process's logical clock, and thus its view of global time, is managed consistently.
- The protocol consists of the following two rules:
  - R1** This rule governs how the local logical clock is updated by a process when it executes an event (send, receive, or internal).
  - R2** This rule governs how a process updates its global logical clock to update its view of the global time and global progress. It dictates what information about the logical time is piggybacked in a message and how it is used by the process to update its view of global time.

### 3.3 Scalar time

- 3.3.1 Definition**
- The scalar time representation was proposed by Lamport to totally order events in a distributed system. Time domain is represented as the set of non-negative integers.
- The logical local clock of a process  $p_i$  and its local view of global time are squashed into one integer variable  $C_i$ .
- Rules **R1** and **R2** used to update the clocks is as follows:
  - R1** : Before executing an event (send, receive, or internal), process  $p_i$  executes:
    - $C_i := C_i + d$
    - execute **R1**;
    - deliver the message.
  - R2** : Each message piggybacks the clock value of its sender at sending time. When a process  $p_i$  receives a message with timestamp  $C_{msg}$ , it executes the following actions:
    - $C_i := \max(C_i, C_{msg})$ ;
    - execute **R1**;
    - deliver the message.
- $d$  can have a different value, may be application-dependent. Here  $d$  is kept at 1.

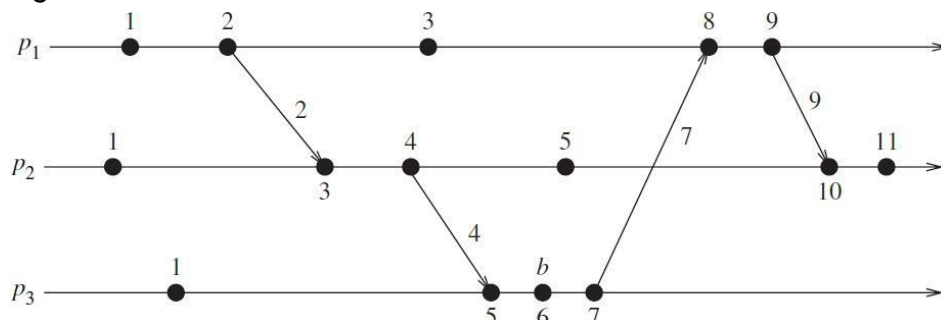


Figure 3.1 Evolution of scalar time

### 3.3.2 Basic properties

#### Consistency property

- scalar clocks satisfy the monotonicity and consistency property. i.e., for two events  $e_i$  and  $e_j$ ,

$$e_i \rightarrow e_j \Rightarrow C(e_i) < C(e_j).$$



## Total Ordering

- Scalar clocks can be used to totally order events in a distributed system.
- Problem in totally ordering events: Two or more events at different processes may have an identical timestamp. i.e., for two events  $e_1$  and  $e_2$ ,  $C(e_1) = C(e_2) \Rightarrow e_1 \parallel e_2$ .
- In Figure 3.1, 3<sup>rd</sup> event of process P1 and 2<sup>nd</sup> event of process P2 have same scalar timestamp. Thus, a tie-breaking mechanism is needed to order such events.
- A tie among events with identical scalar timestamp is broken on the basis of their process identifiers. The lower the process identifier then it is higher in priority.
- The timestamp of an event is a tuple  $(t, i)$  where  $t$  - time of occurrence and  $i$  - identity of the process where it occurred. The total order relation  $<$  on two events  $x$  and  $y$  with timestamps  $(h, i)$  and  $(k, j)$  is:

$$x < y \Leftrightarrow (h < k \text{ or } (h = k \text{ and } i < j))$$

## Event counting

- If the increment value of  $d$  is 1 then, if the event  $e$  has a timestamp  $h$ , then  $h-1$  represents minimum number of events that happened before producing the event  $e$ ;
- In the figure 3.1, five events precede event  $b$  on the longest causal path ending at  $b$ .

## No strong consistency

- The system of scalar clocks is not strongly consistent; that is, for two events  $e_i$  and  $e_j$ ,  $C(e_i) < C(e_j) \not\Rightarrow e_i \rightarrow e_j$ .
- In Figure 3.1, the 3<sup>rd</sup> event of process P1 has smaller scalar timestamp than 3<sup>rd</sup> event of process P2.

## 3.4 Vector time

### Definition

- The system of vector clocks was developed Fidge, Mattern, and Schmuck.
  - Here, the time domain is represented by a set of  $n$ -dimensional non-negative integer vectors.
  - Each process  $p_i$  maintains a vector  $v_{ti}[1..n]$ , where  $v_{ti}[i]$  is the local logical clock of  $p_i$  that specifies the progress at process.
  - $v_{ti}[j]$  represents process  $p_i$ 's latest knowledge of process  $p_j$  local time.
  - If  $v_{ti}[j] = x$ , then process  $p_i$  knowledge on process  $p_j$  till progressed  $x$ .
  - The entire vector  $v_{ti}$  constitutes  $p_i$ 's view of global logical time and is used to timestamp events.
  - Process  $p_i$  uses the following two rules **R1** and **R2** to update its clock:
- R1:**
- Before executing an event, process  $p_i$  updates its local logical time as follows:  

$$v_{ti}[i] = v_{ti}[i] + d \ (d > 0)$$
- R2:**
- Each message  $m$  is piggybacked with the vector clock  $vt$  of the sender process at sending time.
  - On receipt of message  $(m, vt)$ , process  $p_i$  executes:

1. update its global logical time as follows:

$$1 \leq k \leq n : vti[k] := \max(vti[k], vt[k])$$

2. execute **R1**;

3. deliver the message m.

- The timestamp associated with an event is the value of vector clock of its process when the event is executed.
- The vector clocks progress with the increment value  $d = 1$ . Initially, it is  $[0, 0, 0, \dots, 0]$ .
- The following relations are defined to compare two vector timestamps,  $vh$  and  $vk$ :  $vh = vk \Leftrightarrow \forall x : vh[x] = vk[x]$   
 $vh < vk \Leftrightarrow \forall x : vh[x] \leq vk[x]$   
 $vh < vk \Leftrightarrow \exists x : vh[x] < vk[x]$

$$vh \parallel vk \Leftrightarrow \neg(vh < vk) \wedge \neg(vk < vh)$$

### 3.4.2 Basic properties

#### Isomorphism

- The relation " $\rightarrow$ " denotes partial order on the set of events in a distributed execution.
- If events are timestamped using vector clocks, then
- If two events  $x$  and  $y$  have timestamps  $vh$  and  $vk$ , respectively, then  

$$\begin{matrix} x \rightarrow y & \Leftrightarrow & vh < vk \\ x \parallel y & \Leftrightarrow & vh \parallel vk \end{matrix}$$
- Thus, there is an isomorphism between the set of partially ordered events and their vector timestamps.
- Hence, to compare two timestamps consider the events  $x$  and  $y$  occurred at processes  $p_i$  and  $p_j$  are assigned timestamps  $vh$  and  $vk$ , respectively, then  

$$\begin{matrix} x \rightarrow y & \Leftrightarrow & vh[i] < vk[j] \\ x \parallel y & \Leftrightarrow & (vh[i] > vk[j] \wedge vh[j] < vk[i]) \end{matrix}$$

#### Strong consistency

- The system of vector clocks is strongly consistent;
- Hence, by examining the vector timestamp of two events, it can be determined that whether the events are causally related.
- If  $d$  is always 1 in rule **R1**, then the  $i^{th}$  component of vector clock at process  $p_i$ ,  $vti[i]$ , denotes the number of events that have occurred at  $p_i$  until that instant.
- so, if an event  $e$  has timestamp  $vh$ ,  $vh[j]$  denotes the number of events executed by process  $p_j$  that causally precede  $e$ .
- $\sum vh[j] - 1$  represents the total number of events that causally precede  $e$  in the distributed computation.

#### Applications

- As vector time tracks causal dependencies exactly, its applications are as follows:
- distributed debugging,
- Implementations of causal ordering communication in distributed shared memory.

- Establishment of global breakpoints to determine consistency of checkpoints in recovery.

### Linear Extension

- A *linear extension* of a partial order  $(E, \prec)$  is a linear ordering of  $E$  i.e., consistent with partial order, if two events are ordered in the partial order, they are also ordered in the linear order. It is viewed as projecting all the events from the different processes on a single time axis.

### Dimension

- The *dimension* of a partial order is the minimum number of linear extensions whose intersection gives exactly the partial order.

## 3.9 Physical clock synchronization: NTP

### 3.9.1 Motivation

- In centralized systems:
  - there is no need for clock synchronization because, there is only a single clock. A process gets the time by issuing a system call to the kernel.
  - When another process after that get the time, it will get a higher time value. Thus, there is a clear ordering of events and no ambiguity about events occurrences.
- In distributed systems:
  - there is no global clock or common memory.
  - Each processor has its own internal clock and its own notion of time drift apart by several seconds per day, accumulating significant errors over time.
- For most applications and algorithms that runs in a distributed system requires:
  1. The time of the day at which an event happened on a machine in the network.
  2. The time interval between two events that happened on different machines in the network.
  3. The relative ordering of events that happened on different machines in the network.
- Example applications that need synchronization are: secure systems, fault diagnosis and recovery, scheduled operations, database systems.
- *Clock synchronization* is the process of ensuring that physically distributed processors have a common notion of time.
- Due to different clocks rates, the clocks at various sites may diverge with time.
- To correct this periodically a clock synchronization is performed. Clocks are synchronized to an accurate real-time standard like UTC (Universal Coordinated Time).
- Clocks that are not synchronized with each other will adhere to physical time termed as *physical clocks*.

1. **Time** The time of a clock in a machine  $p$  is given by the function  $C_p(t)$ , where  $C_p(t) = t$  for a perfect clock.

2. **Frequency** Frequency is the rate at which a clock progresses. The frequency at time  $t$  of clock  $C_a$  is  $C_a'(t)$ .
3. **Offset** Clock offset is the difference between the time reported by a clock and the *real time*. The offset of the clock  $C_a$  is given by  $C_a(t) - t$ . The offset of clock  $C_a$  relative to  $C_b$  at time  $t$  is given by  $C_a(t) - C_b(t)$ .
4. **Skew** The skew of a clock is the difference in the frequencies of the clock and the perfect clock. The skew of a clock  $C_a$  relative to clock  $C_b$  at time  $t$  is  $C_a'(t) - C_b'(t)$ . If the skew is bounded by  $\rho$ , then as per Eq.(3.1), clock values are allowed to diverge at a rate in the range of  $1 - \rho$  to  $1 + \rho$ .
5. **Drift (rate)** The drift of clock  $C_a$  is the second derivative of the clock value with respect to time, namely,  $C_a''(t)$ . The drift of clock  $C_a$  relative to clock  $C_b$  at time  $t$  is  $C_a''(t) - C_b''(t)$ .

### Clock inaccuracies

- Physical clocks are synchronized to an accurate real-time standard like UTC. However, due to the clock inaccuracy, a timer (clock) is said to be working within its specification if

$$1 - \rho \leq \frac{dC}{dt} \leq 1 + \rho,$$

where constant  $\rho$  is the maximum skew rate.

### Offset delay estimation method

- The *Network Time Protocol (NTP)*, is widely used for clock synchronization on the Internet, uses the *offset delay estimation* method.
- The design of NTP involves a hierarchical tree of time servers.
- The primary server at the root synchronizes with the UTC.
- The next level contains secondary servers, which act as a backup to the primary server.
- At the lowest level is the synchronization subnet which has the clients.

### Clock offset and delay estimation

- This protocol performs several trials and chooses the trial with the minimum delay to accurately estimate the local time on the target node due to varying message or network delays between the nodes.
- Let  $T_1, T_2, T_3, T_4$  be the values of the four most recent timestamps as shown in the figure.
- Assume that clocks A and B are stable and running at the same speed. Let ,
- If the network delay difference from A to B and from B to A, called *differential delay*, is small, the clock offset  $\theta$  and roundtrip delay of B relative to A at time  $T_4$  are approximately given by the following

$$\theta = \frac{a + b}{2}, \quad \delta = a - b.$$

- Each NTP message includes the latest three timestamps  $T_1$ ,  $T_2$ , and  $T_3$ , while  $T_4$  is determined upon arrival.

Figure 3.9 Offset and delay estimation [15].

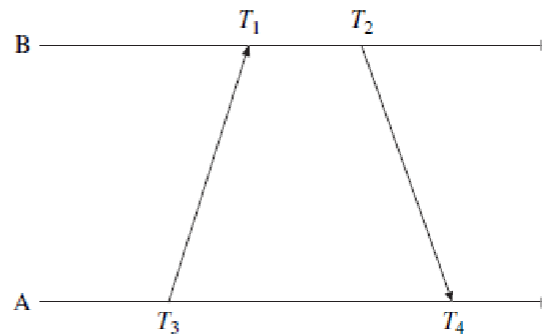


Figure 3.10 Timing diagram for the two servers [15].

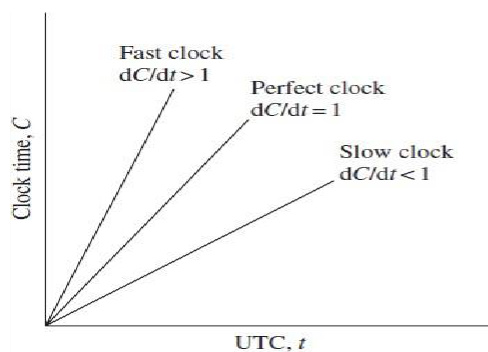
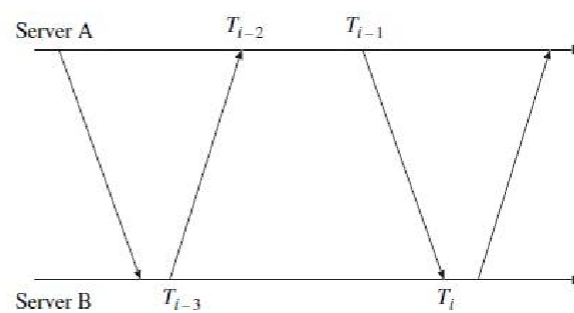


Figure :The Behaviour of fast, slow and perfect clocks with respect to UTC.

- A pair of servers in symmetric mode exchange pairs of timing messages.
- A store of data is then built up about the relationship between the two servers (pairs of offset and delay).

Specifically, assume that each peer maintains pairs  $(O_i, D_i)$ , where:

$O_i$  – measure of offset ( $\theta$ )

$D_i$  – transmission delay of two messages ( $\delta$ ).

- The offset corresponding to the minimum delay is chosen. Specifically, the delay and offset are calculated as follows. Assume that message  $m$  takes time  $t$  to transfer and  $m'$  takes  $t'$  to transfer.
- The offset between A's clock and B's clock is  $O$ . If A's local clock time is  $A(t)$  and B's local clock time is  $B(t)$ , we have

$$A(t) = B(t) + O. \quad (3.3)$$

Then,

$$T_{i-2} = T_{i-3} + t + O, \quad (3.4)$$

$$T_i = T_{i-1} - O + t'. \quad (3.5)$$

Assuming  $t = t'$ , the offset  $O_i$  can be estimated as

$$O_i = (T_{i-2} - T_{i-3} + T_{i-1} - T_i)/2. \quad (3.6)$$

The round-trip delay is estimated as

$$D_i = (T_i - T_{i-3}) - (T_{i-1} - T_{i-2}). \quad (3.7)$$

- The eight most recent pairs of  $(O_i, D_i)$  are retained.
- The value of  $O_i$  that corresponds to minimum  $D_i$  is chosen to estimate  $O$ .

The network time protocol (NTP) synchronization protocol