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# Distributed Databases

COMP3211 Advanced Databases



#### Overview

#### Fragmentation

- Horizontal (primary and derived), vertical, hybrid

#### Query processing

Localisation, optimisation (semijoins)

#### Concurrency control

- Centralised 2PL, Distributed 2PL, deadlock

#### Reliability

- Two Phase Commit (2PC)

#### The CAP Theorem



#### What is a distributed database?

A collection of sites connected by a communications network

Each site is a database system in its own right, but the sites have agreed to work together

A user at any site can access data anywhere as if data were all at the user's own site

# DDBMS Principles



# Local autonomy

The sites in a distributed database system should be autonomous or independent of each other

Each site should provide its own security, locking, logging, integrity, and recovery. Local operations use and affect only local resources and do not depend on other sites



#### No reliance on a central site

A distributed database system should not rely on a central site, which may be a single point of failure or a bottleneck

Each site of a distributed database system provides its own security, locking, logging, integrity, and recovery, and handles its own data dictionary. No central site must be involved in every distributed transaction.



## Continuous operation

A distributed database system should never require downtime

A distributed database system should provide on-line backup and recovery, and a full and incremental archiving facility. The backup and recovery should be fast enough to be performed online without noticeable detrimental affect on the entire system performance.



# Location independence

Applications should not know, or even be aware of, where the data are physically stored; applications should behave as if all data were stored locally

Location independence allows applications and data to be migrated easily from one site to another without modifications.



# Fragmentation independence

Relations can be divided into fragments and stored at different sites

Applications should not be aware of the fact that some data may be stored in a fragment of a table at a site different from the site where the table itself is stored.



## Replication independence

Relations and fragments can be stored as many distinct copies on different sites

Applications should not be aware that replicas of the data are maintained and synchronized automatically.



## Distributed query processing

Queries are broken down into component transactions to be executed at the distributed sites



# Distributed transaction management

A distributed database system should support atomic transactions

Critical to database integrity; a distributed database system must be able to handle concurrency, deadlocks and recovery.



## Hardware independence

A distributed database system should be able to operate and access data spread across a wide variety of hardware platforms

A truly distributed DBMS system should not rely on a particular hardware feature, nor should it be limited to a certain hardware architecture.

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## Operating system independence

A distributed database system should be able to run on different operating systems



# Network independence

A distributed database system should be designed to run regardless of the communication protocols and network topology used to interconnect sites



# DBMS independence

An *ideal* distributed database system must be able to support interoperability between DBMS systems running on different nodes, even if these DBMS systems are unalike

All sites in a distributed database system should use common standard interfaces in order to interoperate with each other.



# Distributed Databases vs. Parallel Databases

#### **Distributed Databases**

- Local autonomy
- No central site
- Continuous operation
- Location independence
- Fragmentation independence
- Replication independence

- Distributed query processing
- Distributed transactions
- Hardware independence
- Operating system independence
- Network independence
- DBMS independence



# Distributed Databases vs. Parallel Databases

#### **Parallel Databases**

- Local autonomy
- No central site
- Continuous operation
- Location independence
- Fragmentation independence
- Replication independence

- Distributed query processing
- Distributed transactions
- Hardware independence
- Operating system independence
- Network independence
- DBMS independence

# Fragmentation



# Why Fragment?

#### Fragmentation allows:

- localisation of the accesses of relations by applications
- parallel execution (increases concurrency and throughput)



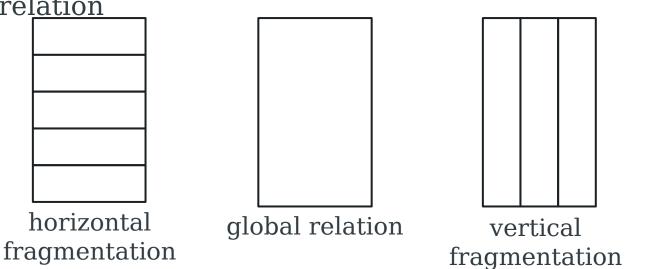
## Fragmentation Approaches

#### Horizontal fragmentation

Each fragment contains a subset of the tuples of the global relation

#### Vertical fragmentation

Each fragment contains a subset of the attributes of the global relation





# Decomposition

Relation R is decomposed into fragments  $F_R = \{R_1, R_2, ..., R_n\}$ 

Decomposition (horizontal or vertical) can be expressed in terms of relational algebra expressions



# Completeness

 $F_{\scriptscriptstyle R}$  is  $\emph{complete}$  if each data item  $d_{\scriptscriptstyle i}$  in R is found in some  $R_{\scriptscriptstyle i}$ 



#### Reconstruction

R can be reconstructed if it is possible to define a relational operator  $\nabla$  such that  $R = \nabla R_i$ , for all  $R_i \in F_R$ 

Note that  $\nabla$  will be different for different types of fragmentation



# Disjointness

 $F_{R}$  is disjoint if every data item  $d_{i}$  in each  $R_{j}$  is not in any  $R_{k}$  where  $k\neq j$ 

Note that this is only strictly true for horizontal decomposition

For vertical decomposition, primary key attributes are typically repeated in all fragments to allow reconstruction; disjointness is defined on non-primary key attributes



# Horizontal Fragmentation

Each fragment contains a subset of the tuples of the global relation

#### Two versions:

- Primary horizontal fragmentation performed using a predicate defined on the relation being partitioned
- Derived horizontal fragmentation performed using a predicate defined on another relation



# Primary Horizontal Fragmentation

#### Decomposition

$$F_R = \{ R_i : R_i = \sigma_{fi}(R) \}$$

where f<sub>i</sub> is the fragmentation predicate for R<sub>i</sub>

#### Reconstruction

$$R = \bigcup R_i \text{ for all } R_i \in F_R$$

#### Disjointness

 $F_R$  is disjoint if the simple predicates used in  $f_i$  are mutually exclusive

Completeness for primary horizontal fragmentation is beyond the scope of this lecture...



# Derived Horizontal Fragmentation

#### Decomposition

```
\begin{split} F_R &= \{\ R_i: R_i = R \rhd S_i\ \} \\ \text{where } F_S &= \{S_i: S_i = \sigma_{fi}(S)\ \} \\ \text{and } f_i \text{ is the fragmentation predicate for the primary} \\ \text{horizontal fragmentation of } S \end{split}
```

#### Reconstruction

$$R = \bigcup R_i \text{ for all } R_i \in F_R$$

Completeness and disjointness for derived horizontal fragmentation is beyond the scope of this lecture...



# Vertical Fragmentation

#### Decomposition

 $F_R \!=\! \{\ R_i: R_i = \pi_{ai}(R)\ \},$  where  $a_i$  is a subset of the attributes of R

#### Completeness

 $F_R$  is complete if each attribute of R appears in some  $a_i$ 

#### Reconstruction

 $R = \bowtie_{K} R_{i}$  for all  $R_{i} \in F_{R}$ 

where K is the set of primary key attributes of R

#### Disjointness

 $F_{\rm R}$  is disjoint if each non-primary key attribute of R appears in  ${
m ^{19}}$ 



# Hybrid Fragmentation

Horizontal and vertical fragmentation may be combined

- Vertical fragmentation of horizontal fragments
- Horizontal fragmentation of vertical fragments

# Query Processing



#### Localisation

Fragmentation expressed as relational algebra expressions

Global relations can be reconstructed using these expressions

- a localisation program

Naively, generate distributed query plan by substituting localisation programs for relations

- use reduction techniques to optimise queries

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# Reduction for Horizontal Fragmentation

Given a relation R fragmented as  $F_R = \{R_1, R_2, ..., R_n\}$ 

Localisation program is  $R = R_1 \cup R_2 \cup ... \cup R_n$ 

Reduce by identifying fragments of localised query that give empty relations

#### Two cases to consider:

- reduction with selection
- reduction with join

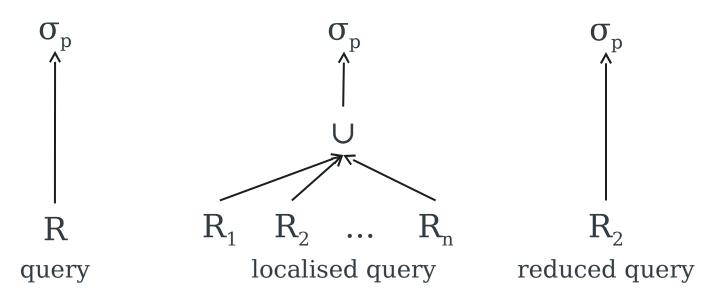


#### Horizontal Selection Reduction

Given horizontal fragmentation of R such that  $R_j = \sigma_{Di}(R)$ :

$$\sigma_{p}(R_{j}) = \emptyset \text{ if } \forall x \in \mathbb{R}, \ \neg(p(x) \land p_{j}(x))$$

where  $p_i$  is the fragmentation predicate for  $R_i$ 



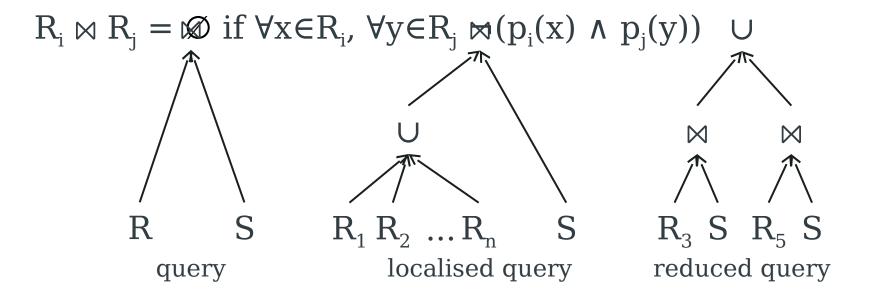


## Horizontal Join Reduction

Recall that joins distribute over unions:

$$(R_1 \cup R_2) \bowtie S \equiv (R_1 \bowtie S) \cup (R_2 \bowtie S)$$

Given fragments  $R_i$  and  $R_j$  defined with predicates  $p_i$  and  $p_j$ :





# Reduction for Vertical Fragmentation

Given a relation R fragmented as  $F_R = \{R_1, R_2, ..., R_n\}$ 

Localisation program is  $R = R_1 \bowtie R_2 \bowtie ... \bowtie R_n$ 

Reduce by identifying useless intermediate relations

One case to consider:

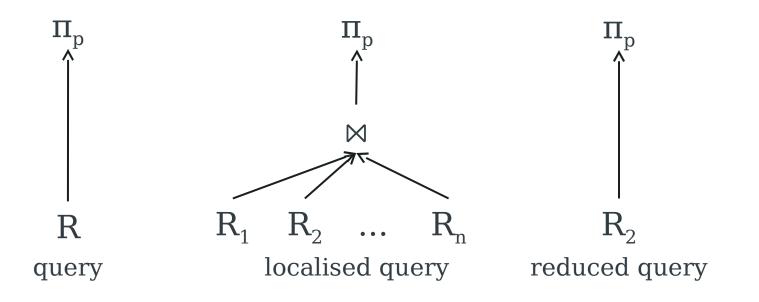
reduction with projection



## Vertical Projection Reduction

Given a relation R with attributes  $A = \{a_1, a_2, ..., a_n\}$  vertically fragmented as  $R_i = \pi_{Ai}(R)$  where  $A_i \subseteq A$ 

 $\Pi_{D,K}(R_i)$  is useless if  $D \nsubseteq A_i$ 





## The Distributed Join Problem

We have two relations, R and S, each stored at a different site

Where do we perform the join  $R \bowtie S$ ?

Site 1

R

 $R \bowtie S$ 

Site 2

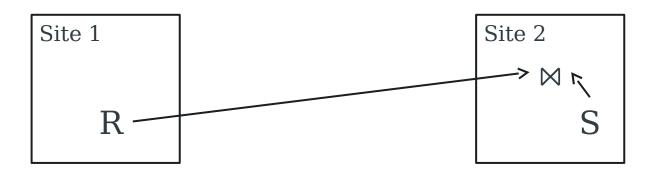
S



## The Distributed Join Problem

We can move one relation to the other site and perform the join there

- CPU cost of performing the join is the same regardless of site
- Communications cost depends on the size of the relation being moved

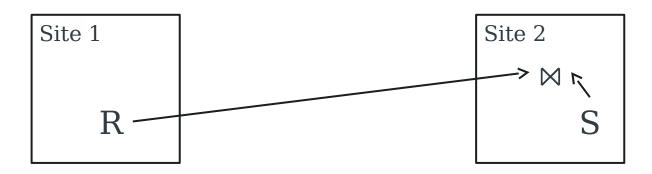




## The Distributed Join Problem

 $Cost_{COM} = size(R) = cardinality(R) * length(R)$ 

if size(R) < size(S) then move R to site 2, otherwise move S to site 1





## Semijoin Reduction

We can further reduce the communications cost by only moving that part of a relation that will be used in the join

Use a semijoin...



## Semijoins

Recall that 
$$R \triangleright_p S \equiv \pi_R(R \bowtie_p S)$$

where p is a predicate defined over R and S  $\pi_R$  projects out only those attributes from R

$$size(R \triangleright_p S) < size(R \bowtie_p S)$$

$$R \bowtie_{p} S \equiv (R \triangleright_{p} S) \bowtie_{p} S$$

$$\equiv R \bowtie_{p} (R \triangleleft_{p} S)$$

$$\equiv (R \triangleright_{p} S) \bowtie_{p} (R \triangleleft_{p} S)$$



## Semijoin Reduction

$$R \triangleright_{p} S \equiv \pi_{R}(R \bowtie_{p} S)$$
$$\equiv \pi_{R}(R \bowtie_{p} \pi_{p}(S))$$

where  $\pi_p(S)$  projects out from S only the attributes used in predicate p

Site 1

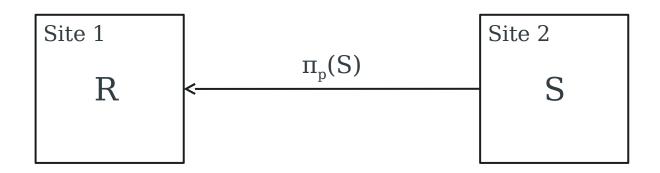
R

Site 2

S



Site 2 sends  $\pi_p(S)$  to site 1





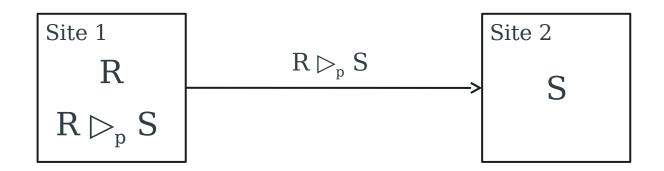
Site 1 calculates 
$$R \triangleright_{p} S \equiv \pi_{R}(R \bowtie_{p} \pi_{p}(S))$$

Site 1 R  $R \triangleright_p S$ 

Site 2



Site 1 sends  $R \triangleright_p S$  to site 2





Site 2 calculates  $R \bowtie_p S \equiv (R \triangleright_p S) \bowtie_p S$ 

Site 1 R  $R \triangleright_{p} S$ 

Site 2 S  $R \bowtie_p S$ 



## Semijoin Reduction

$$Cost_{COM} = size(\pi_p(S)) + size(R \triangleright_p S)$$

This approach is better if  $size(\pi_p(S)) + size(R \triangleright_p S) < size(R)$ 

Site 1
$$R$$

$$R \triangleright_{p} S$$

Site 2
$$S$$

$$R \bowtie_p S$$

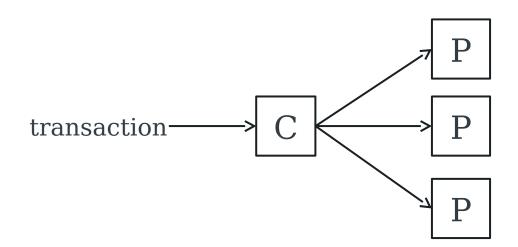
## Concurrency Control



#### Distributed Transactions

Transaction processing may be spread across several sites in the distributed database

- The site from which the transaction originated is known as the *coordinator*
- The sites on which the transaction is executed are known as the *participants*





#### Distribution and ACID

Non-distributed databases aim to maintain isolation

- Isolation: A transaction should not make updates externally visible until committed

Distributed databases commonly use two-phase locking (2PL) to preserve isolation

- 2PL ensures serialisability, the highest isolation level

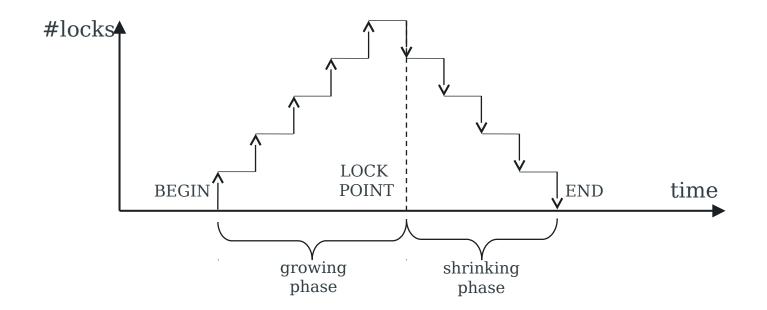


## Two-Phase Locking

#### Two phases:

- Growing phase: obtain locks, access data items
- Shrinking phase: release locks

#### Guarantees serialisable transactions



## Distribution and Two-Phase Locking

In a non-distributed database, locking is controlled by a lock manager

Two main approaches to implementing two-phase locking in a distributed database:

- Centralised 2PL (C2PL)
  Responsibility for lock management lies with a single site
- Distributed 2PL (D2PL) Each site has its own lock manager

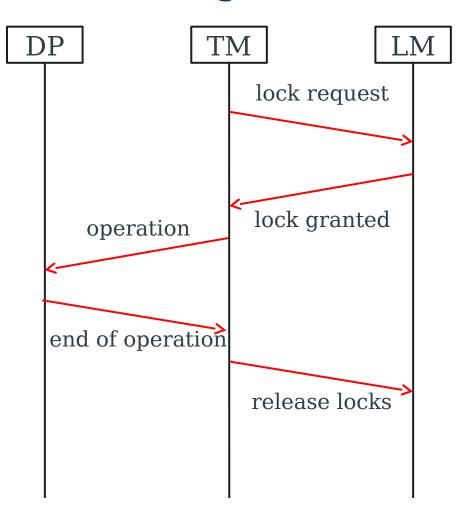
## Centralised Two-Phase Locking (C2PL)

Coordinating site runs transaction manager TM

Participant sites run data processors DP

Lock manager LM runs on central site

- 1. TM requests locks from LM
- 2. If granted, TM submits operations to processors DP
- 3. When DPs finish, TM sends message to LM to release



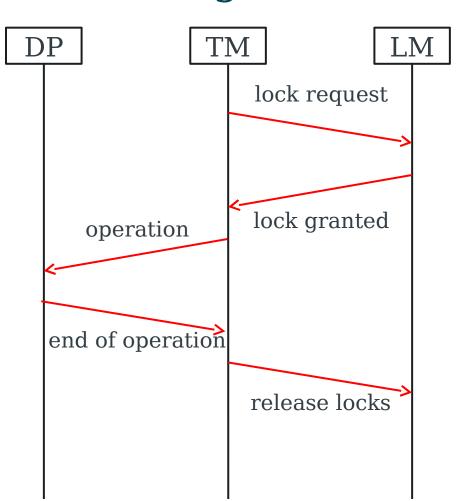
## Centralised Two-Phase Locking (C2PL)

LM is a single point of failure

- less reliable

LM is a bottleneck

- affects transaction throughput

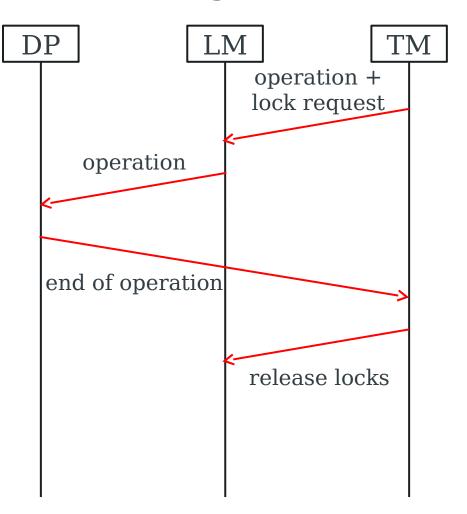


## Distributed Two-Phase Locking (D2PL)

Coordinating site C runs TM

Each participant runs both an LM and a DP

- 1. TM sends operations and lock requests to each LM
- 2. If lock can be granted, LM forwards operation to local DP
- 3. DP sends "end of operation" to TM
- 4. TM sends message to LM to release locks

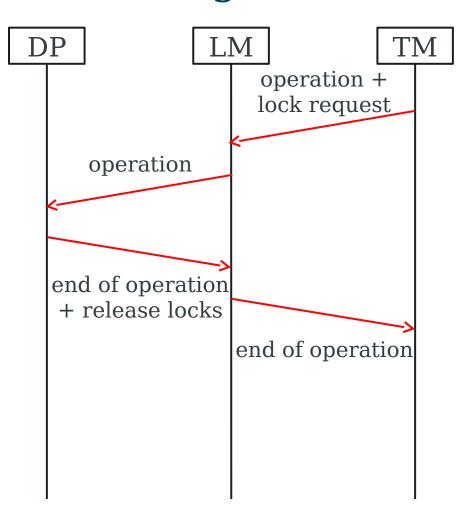


## Distributed Two-Phase Locking (D2PL)

Variant:

DPs may send "end of operation" to their own LM

LM releases lock and informs
TM





#### Deadlock

Deadlock exists when two or more transactions are waiting for each other to release a lock on an item

Three conditions must be satisfied for deadlock to occur:

- Concurrency: two transactions claim exclusive control of one resource
- Hold: one transaction continues to hold exclusively controlled resources until its need is satisfied
- Wait: transactions wait in queues for additional resources while holding resources already allocated



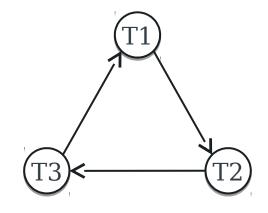
## Wait-For Graph

Representation of interactions between transactions

Directed graph containing:

- A vertex for each transaction that is currently executing
- An edge from T1 to T2 if T1 is waiting to lock an item that is currently locked by T2

Deadlock exists iff the WFG contains a cycle





#### Distributed Deadlock

#### Two types of Wait-For Graph

- Local WFG
   (one per site, only considers transactions on that site)
- Global WFG (union of all LWFGs)

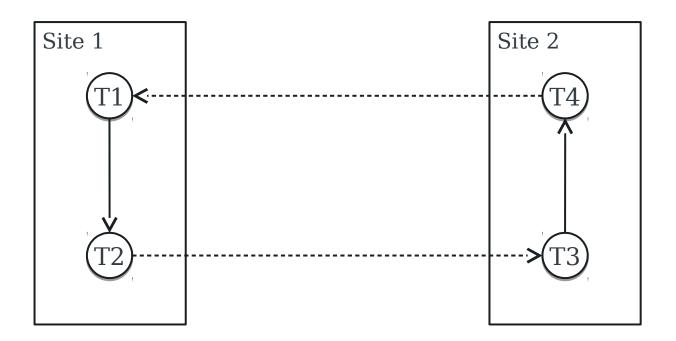
#### Deadlock may occur

- on a single site(within its LWFG)
- between sites(within the GWFG)



## Distributed Deadlock Example

Consider the wait-for relationship T1 $\rightarrow$ T2 $\rightarrow$ T3 $\rightarrow$ T4 $\rightarrow$ T1 with T1, T2 on site 1 and T3, T4 on site 2





## Managing Distributed Deadlock

#### Three main approaches:

- 1. Prevention
  - pre-declaration
- 2. Avoidance
  - resource ordering
  - transaction prioritisation
- 3. Detection and Resolution



#### Prevention

Guarantees that deadlocks cannot occur in the first place

- 1. Transaction pre-declares all data items that it will access
- 2. TM checks that locking data items will not cause deadlock
- 3. Proceed (to lock) only if all data items are available (unlocked)



#### Avoidance

Two main sub-approaches:

- 1. Resource ordering
  - Concurrency controlled such that deadlocks won't happen
- 2. Transaction prioritisation
  - Potential deadlocks detected and avoided



## Resource Ordering

All resources (data items) are ordered

Transactions always access resources in this order

#### Example:

- Data item A comes before item B
- All transactions must get a lock on A before trying for a lock on B
- No transaction will ever be left with a lock on B and waiting for a lock on A



#### Transaction Prioritisation

Each transaction has a timestamp that corresponds to the time it was started: ts(T)

- Transactions can be prioritised using these timestamps

When a lock request is denied, use priorities to choose a transaction to abort

- WAIT-DIE and WOUND-WAIT rules



#### WAIT-DIE and WOUND-WAIT

 $T_{\scriptscriptstyle i}$  requests a lock on a data item that is already locked by  $T_{\scriptscriptstyle j}$ 

#### The WAIT-DIE rule:

```
\begin{split} & \text{if } ts(T_i) < ts(T_j) \\ & \text{then } T_i \text{ waits} \\ & \text{else } T_i \text{ dies (aborts and restarts with same timestamp)} \end{split}
```

#### The WOUND-WAIT rule:

```
\begin{split} & \text{if } ts(T_i) < ts(T_j) \\ & \text{then } T_j \text{ is wounded (aborts and restarts with same} \\ & \text{timestamp)} \\ & \text{else } T_i \text{ waits} \end{split}
```



#### **Detection and Resolution**

- 1. Study the GWFG for cycles (detection)
- 2. Break cycles by aborting transactions (resolution)

Selecting minimum total cost sets of transactions to abort is NP-complete

#### Three main approaches to deadlock detection:

- centralised
- hierarchical
- distributed



#### Centralised Deadlock Detection

One site is designated as the deadlock detector (DD) for the system

Each site sends its LWFG (or changes to its LWFG) to the DD at intervals

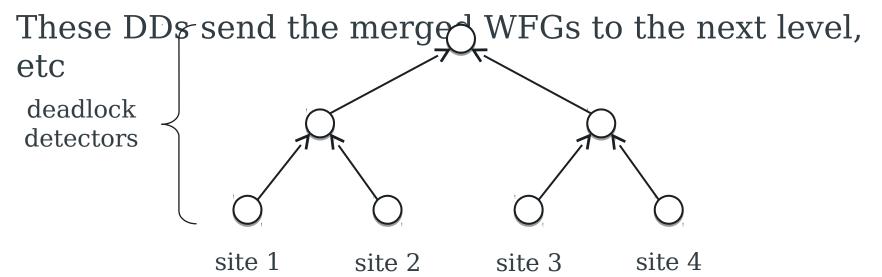
DD constructs the GWFG and looks for cycles



#### Hierarchical Deadlock Detection

Each site has a DD, which looks in the site's LWFG for cycles

Each site sends its LWFG to the DD at the next level, which merges the LWFGs sent to it and looks for cycles

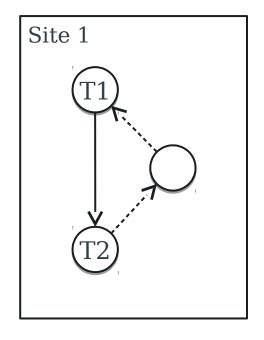


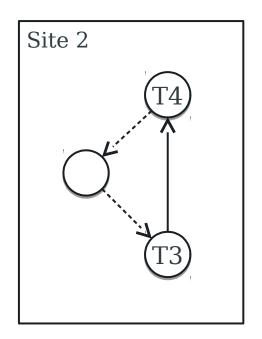


#### Distributed Deadlock Detection

Responsibility for detecting deadlocks is delegated to sites

LWFGs are modified to show relationships between local transactions and remote transactions







#### Distributed Deadlock Detection

LWFG contains a cycle not involving external edges

- Local deadlock, resolve locally

#### LWFG contains a cycle involving external edges

- Potential deadlock communicate to other sites
- Sites must then agree on a victim transaction to abort

## Reliability



#### Distribution and ACID

Non-distributed databases aim to maintain atomicity and durability of transactions

- Atomicity: A transaction is either performed completely or not at all
- Durability: Once a transaction has been committed, changes should not be lost because of failure

As with parallel databases, distributed databases use the two-phase commit protocol (2PC) to preserve atomicity

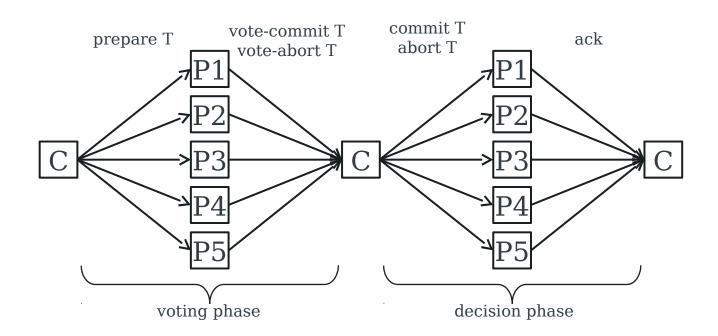
Increased cost of communication may require a variant approach



#### Centralised 2PC

Communication only between the coordinator and the participants

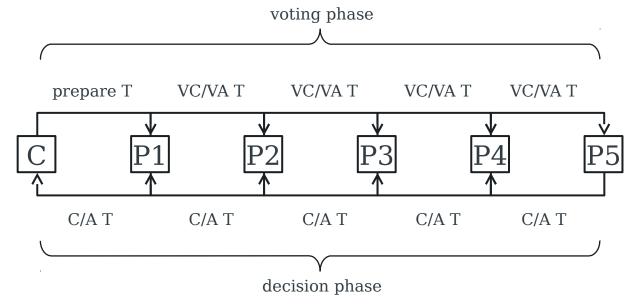
- No inter-participant communication





#### Linear 2PC

- First phase from the coordinator to the participants
- Second phase from the participants to the coordinator
- Participants may unilaterally abort





#### Centralised versus Linear 2PC

- Linear 2PC involves fewer messages
- Centralised 2PC provides opportunities for parallelism
- Linear 2PC has worse response time performance

# The CAP Theorem



#### The CAP Theorem

In any distributed system, there is a trade-off between:

Consistency

Each server always returns the correct response to each request

Availability

Each request eventually receives a response

Partition Tolerance

Communication may be unreliable (messages delayed, messages lost, servers partitioned into groups that cannot communicate with each other), but the system as a whole should continue to function



#### The CAP Theorem

CAP is an example of the trade-off between safety and liveness in an unreliable system

- Safety: nothing bad ever happens
- Liveness: eventually something good happens

We can only manage two of three from C, A, P

- Typically we sacrifice either availability (liveness) or consistency (safety)