Notes of Database 2

A series of not yet structured notes on the course Database 2 as taught in Politecnico di Milano by Sara Comai during the academic year 2018/2019.

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Transactions

what is a transaction?

an elementary, atomic unit of work performed by an application.

each transaction is encapsulated within two commands:

- begin transaction (bot)
- end transaction (eot)

within a transaction, exactly one of the commands below is executed

- commit
- roll-back

Properties of a transaction

- Atomicity
 - o can't be divided in a smaller entity
- Consistency
 - o data should make sense before and after the transaction
- Isolation
 - \circ the execution of a transaction must be independent from the concurrent execution of other transactions \to concurrency control
- Durability
 - the effect of a transaction should last forever

Concurrency Control

Anomalies

Lost Update $ightarrow r_1 - r_2 - w_2 - w_1$

Dirty Read $ightarrow r_1 - w_1 - r_2 - abort_1 - w_2$

Non-Repeat Read $ightarrow r_1 - r_2 - w_2 - r_1$

Phantom Update $ightarrow r_1 - r_2 - w_2 - r_1$ (last r_1 reads an inconsistent value)

Phantom Insert $r_1 - w_2$ (new data) $- r_1$

Core Concepts

• Goal:

reject schedules that cause anomalies

• Scheduler:

a component that accepts or rejects the operations requested by the transaction

Serial Schedule:

a schedule in which the actions of each transaction occur in a contiguous sequence

• Serializable Schedule:

If it produces the same result of a serial schedule of some transactions.

• Assumption Commit-Projection:

Transaction are observed "in the past" and we decide whether the corresponding schedule is

Class Hierarchy

$$!CSR \implies (!2PL \land !TS_MONO)$$
 $CSR \implies VSR$ $!2PL \implies !2PL_STRICT$

VSR - View Serializability

Preliminary Definitions

- Reads-From
 - $r_i(x)$ **reads-from** $w_j(x)$ in a schedule S when $w_j(x)$ precedes $r_i(x)$ and there is no $w_k(x)$ in S between $r_i(x)$ and $w_j(x)$
- Final Write
 - $w_i(x)$ in a schedule S is a **final write** if it is the last write on x that occurs in S

View Equivalence

Two schedules are **view-equivalent** $(S_i \approx_{\mathbf{v}} S_j)$ if: they have the same

- operations
- reads-from relations
- final writes

View Serializable

A schedule is view-serializable if it is view-equivalent to a serial schedule of the same transactions

The class of View-Serializable schedules is named VSR.

Blind Writes

a write $w_i(X)$ is said to be **blind** if it is not the last action on resource X and the following action on X is a write $w_i(X)$.

(disclaimer: if something is not clear in the following 3 notes, you'll understand it in the next section (CSR - Conflict Serializability)

VSR Property

each schedule $S \in VSR$ and $S \notin CSR$ has, in its conflict graph, cycles of arcs due to *pairs* of blind writes. These can be swapped without modifying the *reads-from* and *final-writes* relationships. Once the graph is acyclic it is possible to find a serial schedule view-equivalent to the initial one.

How to find out if a schedule is in VSR?

Do the Conflict Graph.

If such graph is cyclic, consider the cycles that are due to blind writes.

Switch such writes (switch the direction of the arrow).

If now the graph is acyclic we can say it is in VSR.

What's an easy way to build a View Equivalent serial schedule?

Look at the conflict graph and find a node that does not have any incoming arc.

Select it and delete all its outcoming arcs.

Repeat the procedure until you have considered all the nodes of the graph.

CSR - Conflict Serializability

Conflict

Two operations o_i and o_j $(i \neq j)$ are in **conflict** if they address the same resource and at least one of them is a write.

Thus, the possible conflicts are:

- read-write conflicts
- write-write conflicts.

Conflict-Equivalence

Two schedules are **conflict-equivalent** $(S_i \approx_{\mathbf{C}} S_j)$ if:

 S_i and S_i contain the same operations and all conflicting pairs occur in the same order

Conflict-Serializable

A schedule is *conflict-serializable* if it is conflict-equivalent to a serial schedule of the same transactions.

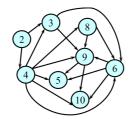
The class of conflict-serializable schedules is named **CSR**.

How to find out if a schedule is in CSR?

We need to do the *Conflict Graph*:

- One node for each transaction T_i .
- One arc from T_i to T_j if there exists at least one conflict between an operation o_i of T_i and an operation o_j of T_j such that o_i precedes o_j .

A schedule is in **CSR** if and only if its conflict graph is acyclic.



Is there any cycle? No. The schedule is in CSR (and then also in VSR). The graph suggests, e.g., the serial schedule 2,4,3,8,6,9,5,10 as view equivalent (built choosing and deleting nodes without incoming arcs)

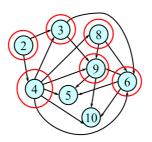
How do we check acyclicity in practice?

A node can be part of a cycle if and only if it has incoming **and** outcoming arcs.

Nodes with only incoming or only outgoing arcs cannot, and can be (recursively) ignored.

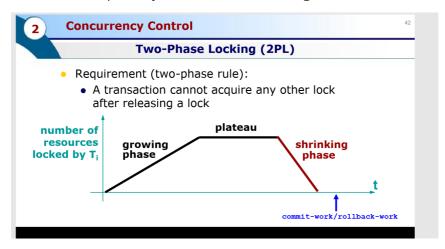
The same holds for arc adjacent to such nodes.

This way, we not only check for acyclicity, but also identify a serial schedule that is view-equivalent to the given one (if transactions are considered in the order in which the corresponding nodes are deleted)



OBJECT STATES	PRIMITIVES(OPERATIONS)
free	r-lock
r-locked (1 or more)	w-lock
w-locked (exclusive)	unlock

Rule: a transaction cannot acquire any other lock after releasing a lock

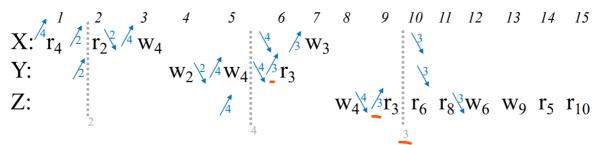


how to actually draw the scheme?

What I've come up with so far is to:

- 1. list in the page all the read and writes in order of execution (just write them in pencil)
- 2. under such list create the empty table with resources as rows.
- 3. for each row copy the corresponding read and write in the correspond position
- 4. now complete the table with all the arrows.

Is the schedule in **2PL**?



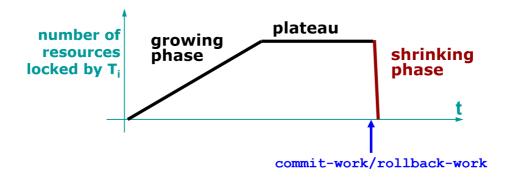
We need look at those acquisitions that must be anticipated and to those releases that must be delayed so as not to violate the 2PL rules.

- **T4** can only get the XL on X only after 2 and on Y after 4 and has to release Y before 6 and X before 7. Thus, the lock on Z must be acquired before 6.
- T2 can get all the locks at the beginning and release them immedialtely after each use.
- T3 can acquire X, Y and Z just before using them and release them all before 12
- All other transactions (T6, T9, T5, T10) clearly pose no problems.

for each transaction we'll draw a vertical line that tells us "from now on I can only release it"

2PL Strict

So far we used the hypothesis of *commit-projection* (no transaction in the schedule aborts). 2PL so far does not protect against dirty reads (and therefore neither do VSR nor CSR). In order to remove such hypothesis we need to add a constraint to 2PL, that defines *2PL Strict*: *Locks held by a transaction can be released only after commit/rollback*.



in 2PL strict, if, for example, I unlock the transition 3, I need to unlock it immediately for all the resources.

 \rightarrow in practice it means that in the table with all the read and write I should put all the downward arrows at the end.

Is the schedule in **2PL-strict**?

First, we label each operation in the schedule with a "time" from 1 to 15 We have to assume that all locks are released together, at the end of each transaction.

$$X: r_4 \quad r_2 \quad w_4 \quad w_3$$

 $Y: \quad w_2 \quad w_4 \quad r_3$
 $Z: \quad w_4 \quad r_3 \quad r_6 \quad r_8 \quad w_6 \quad w_9 \quad r_5 \quad r_{10}$

It is therefore clear that the schedule **cannot be in 2PL-strict**, due to T2 and T4:

T2 ends after 4, but T4 wants to write X at 3, and T2 would thus be required to release X earlier (so as to let T4 upgrade its lock before 3), which is impossible if T2 has to keep all locks until after 4.

TS - Mono

TimeStamp - based concurrency control is characterized by the fact that:

- the scheduler has two counters **RTM(x)** and **WTM(x)** for each object.
- the scheduler receives read/write requests tagged with timestamps.

Let's clarify:

- read(x, ts):
 - if ts < WTM(x) the request is **rejected** and the transaction is killed
 - \circ else, access is **granted** and the RTM(x) is set to $\max(RTM(x), ts)$
- write(x, ts):
 - if ts < RTM(x) or ts < WTM(x) the request is **rejected** and the transaction is killed
 - \circ else, access is **granted** and WTM(x) is set to ts

In order to work without the commit-projection hypothesis, it needs to "buffer" write operations until commit, which introduces waits.

2PL and TS are incomparable, doesn't make sense to compare them since a schedule could be in TS but not in 2PL, the other way around, or even both in TS and in 2PL.

How to find out if a scheduler is in TS in practice?

The fastest way consists in considering the transaction resource-wise and do the following.

```
for each resource we want to have each pair of operations r_i - w_j ; w_i - w_j ordered increasingly (i < j) .
```

Thomas Rule is an improvement to TS which considers legit even resources with such pairs ordered decreasingly.

TS - Multi

• read(x,ts):

reads are **always accepted**. a copy x_k is selected for reading such that:

- \circ if $ts > WTM_N(x)$ then k = N
- \circ else take k such that $WTM_k(x) < ts < WTM_{k+1}(x)$
- write(x, ts):
 - \circ if ts < RTM(x) the request is **rejected** and the transaction is killed
 - \circ else, a new version is created (N is incremented) with $WTM_N(x)=ts$

How to check TS - Multi in practice?

Check it in the same way we check *TS - Mono*, but this time the reasons due to *reads* are excused. So you need to check the order only for *write* operations.

 $X: \ r_4 \quad r_2 \quad w_4 \quad w_3$

Y: w_2 w_4 r_3

Z: $w_4 r_3 r_6 r_8 w_6 w_9 r_5 r_{10}$

The schedule is also **outside TS-multi**, because $w_3(X)$ comes too late $(r_4(X))$ was already given the initial version instead) and also because $W_6(Z)$ is late w.r.t. $r_8(Z)$

The independent reasons are only two (but of course one is enough!). The other five reasons were due to reads (that are always accepted in TS-multi).

Triggers

Skeleton

Before or After

Before

the trigger is considered before the database status changes

After

the trigger is considered after the event

For Each Statement or Row

for each statement

(statement level granularity)

DEFAULT!

the trigger is considered only once for each activating statement, independently of the number of affected tuples in the target table, even if no tuple is affected!

for each row

(row level granularity)

the trigger is considered once for each tuple affected by the activating statement

The Referencing Clause

depends on the granularity

- if statement level
 - two transition tables (old table and new table) contain respectively the old and the new value of all the affected rows
- if row level
 - two transition variables (old and new) represent the value respectively prior and following the modification of the row

variables old and old table are undefined in triggers whose event is insert

variables new and new table are undefined in triggers whose event is delete

Example of a trigger in before mode

- Prevents salaries to be increased by more than 20% within a single update operation
- Presented in two versions: 1. before mode 2. after mode
- 1. "conditioner" (acts before the update and integrity checking)

```
create trigger Max20percent_before
before update of Salary on Employee
for each row
when new.Salary > old.Salary * 1.2
set new.Salary = old.Salary * 1.2
modified

the transition
variable is
modified
```

The same effect in after mode

• 2. "re-installer" (acts after the update)

```
create trigger Max20percent_after
after update of Salary on Employee
for each row
when new.Salary > old.Salary * 1.2
update Employee
set Salary = old.Salary * 1.2
where RegNum = new.RegNum
```

Conflicts on execution of Multiple Triggers

if several triggers are associated with the same event

- <u>Before</u> triggers → statement-level first, row-level then
- After triggers \rightarrow row-level first, statement-level then

Termination Analysis

The Triggering Graph

- a node i for each trigger t_i
- an arc from a node i to a node j if the execution of trigger t_i 's action **may** activate trigger t_j
- if the graph is acyclic, the system is guaranteed to terminate
- if the graph has some cycles, it *may* be non-terminating

Triggers for Replicas and View Maintenance

base table updates must be propagated to views.

Example of materialized view

CREATE MATERIALIZED VIEW EmployeeReplica

REFRESH FAST AS

SELECT * FROM

DBMaster.Employee@mastersite.world

```
CREATE MATERIALIZED VIEW PesonnelDepost(DpN,SalarySum) AS select DeptN, sum(Salary) from Employee group by DeptN;
```

View Maintenance - Naive approach

materialized views are helpful whenever a query is performed more frequently wrt the updates that may change its result.

A naive approach consists in re-computing the view whenever the base table is modified (usually it is an overkill because many operations don't change the info in the view, or change info in only one tuple).

Important: notice that this approach is statement-level (for each statement).

```
create trigger NaiveRecompute_upd
after update on Employee
begin
   delete from PersonnelDepCost;
   insert into PersonnelDepCost
      select DeptN, sum(Salary)
      from Employee
      group by DeptN;
end;
```

View Maintenance - Incremental Approach

better way to do it. to be used whenever the computational effort required to deal with the delta in the view is significantly smaller than that of fully re-computing the view.

Important: notice that this approach is row-level (for each row)

```
create trigger Incremental_InsEmp
after insert on Employee
for each row
update PersonnelDepCost
    set SalarySum = SalarySum + new.salary
    where DpN = new.DeptN

create trigger Incremental_SalaryUpdate
after update of Salary on Employee
for each row
update PersonnelDepCost
    set SalarySum = SalarySum + new.Salary - old.Salary
    where DpN = new.DeptN
```

Recursion Management

it can happen that you have a hierarchy of products, suppose you want to delete a product \rightarrow recursion can be applied simply by writing a trigger that may activate itself.

Triggers for Access Control

• use BEFORE triggers with STATEMENT granularity

```
create trigger ForbidSalaryUpdate
before insert on Employee

DECLARE not_weekend EXPECTION; not_workingHours EXCEPTION;
begin
    if(to_char(sysdate,'dy')) = 'sat' OR to_char(sysdate,'dy')='sun')
        raise not_weekend;
endif;
if (to_char(sysdate,'HH24')) < 8 OR to_char(sysdate,'HH24')>18)
        raise not_workinghours;
endif;
end;
```

```
expection
   when not_weekend
        then raise_application_error(-20324,"cannot modify Employee table during
week-end");
   when not_workinghours
        then raie_application_error(-20325,"cannot modify Employee table outside
working hours");
end;
```

XML

XPATH

Basics

Path expression are made of *steps*. The most common steps are:

- Nodename
 - Selects all child nodes of the current node
- /
- Selects from the root node
- //
 - Selects nodes in the document from the current node that match the selection no matter where they are
- Selects the current node
- .
- Selects the parent of the current node
- @
 - o Qualifies attribute names

Conditions

- doc("books.xml")/bookstore/book[publisher='Macmillan']/title
 - returns the title of the books published by Macmillan
- doc("books.xml")/bookstore/book[2]
 - o returns the second book of the structure

- doc("books.xml")/bookstore/book[2]/
 - returns all the elements (=with any tagname) contained into the second book
- [generic node]//@lang
 - o returns all attributes that are named lang
- /bookstore/book[1]
 - o selects the first book
- /bookstore/book[last()]
 - o selects the last book
- /bookstore/book[last()-1]
 - selects the last but one book
- /bookstore/book[position()<3]
 - o selects the first two books
- //title[@lang]
 - o selects all the title elements that have an attribute named lang
- //title[@lang='eng']
 - o selects all the title elements that have an attribute named lang with a value of 'eng'
- /bookstore/book[price>35.00]
 - selects all the book elements of the bookstore element having a price element with a value greater than 35.00

Wildcards

XPath wildcards can be used to select unknown XML elements

- *
- o matches any element node
- @*
 - o matches any attribute node
- node()
 - o matches any node of any kind

so far example, if I write in a path //title[@*], I will select all title elements which have any attribute

XQuery

FLWR Expressions

FLWR stands for:

- For
- Let
- Where
- (Order By)
- **R**eturn

xML data

for : iteration + "individual" bindings

Every item in a sequence generates a different bindings

let : "collective" bindings

where

Tuples of variable bindings

Tuples of variable bindings

where

Tuples of variable bindings

where

tuples of variable bindings

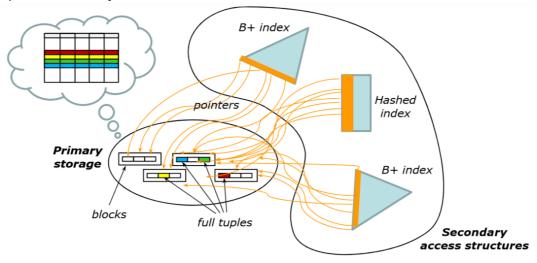
where: filtering expressions
Independently evaluated on each tuple of bindings to keep or discard it

return: construct results

Executed once for each tuple of bindings

Physical Access Structures Introduction

Each table is stored into exactly one primary physical access structure, and may have one or many optional secondary access structures.



Primary Structure

- o Contains all the tuples of a table
- Its main purpose is to store the table content

• Secondary Structures

- Used to index primary structures, and only contains the values of some fields, interleaved with pointers to the blocks of the primary structure
- Their main purpose is to speed up the search for specific tuples within the table, according to some search criterion

Sequential structures

Hash-based structures

Tree-based structures

Primary	Secondary
Typical	-
Frequent	Frequent
Frequent	Typical

Physical Access Structure Types

Legenda:

• $val(A_i)$ = number of distinct values of the attribute A_i in the table T

Three types:

Sequential Structures

Three types:

- Entry Sequenced
 - In an Entry Sequenced organization, the sequence of the tuples is dictated by their order of entry
 - o Optimality
 - Optimal for
 - 1. Space occupancy
 - 2. Carrying out sequential reading and writing
 - Non Optimal for
 - 1. Searching specific data units
 - 2. Updates that increase the size of tuple, in fact all following tuples must be shifted on.
- Array
 - o In an array organization, the tuples (all of the same size) are arranged as in an array, and their position depends on the values of an index (or indexes)
 - Appropriate only when the tuples are of fixed length
- <u>Sequentially Ordered</u>
 - In a Sequentially Ordered organization, the tuples are ordered according to the value of a key (typically one field, but may be obtained by combining more than one attribute)
 - o Main problem:
 - Insertions and Updates could increase the data size, this means that such structures require reordering techniques for the tuples already present. There are some techniques to avoid such reordering problem (i.e. leaving a certain number of slots free at the time of first loading, followed by 'local reordering' operations)

Hash - Based Access Structures

Such structures assure an efficient associative access to data, based on the value of a key field to which the hash is applied.

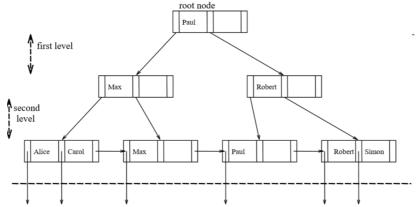
Hash - Based structures have N_B buckets, each typically of the size of 1 block.

A hash algorithm is applied to the key field so as to compute a value between 0 and N_B-1 .

• When is it used?

This is the most efficient structure for queries with equality predicates, but it is rather inefficient for interval queries

Tree Structures



Pointers to the blocks that contain the tuples (in the primary storage, whatever its structure type is)

Gives associative access based on the value of a key field.

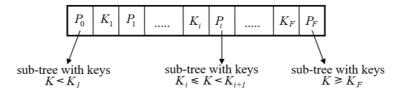
Each tree has:

- One root node
- Several intermediate nodes
- Several leaf nodes

Each node corresponds to a block.

The links between nodes are established by pointers to mass memory.

Search technique:



Suppose we are looking for a tuple with key value V, so at each intermediate node we do the following:

- If $V < K_1$ follow P_0
- $\bullet \quad \text{if } V \geq K_F \text{ follow } P_F$
- Otherwise, follow P_J such that $K_J \leq V < K_i + 1$

The nodes can be organized in two ways:

• <u>B+ trees</u>

- o Pointers to the tuples are only contained in the leaf nodes
- The leaf nodes are linked in a chain ordered by he key
- Supports interval queries efficiently
- The most used by relational DBMSs

• B trees

- \circ Pointers to the tuples can also be contained in intermediate nodes. In this way, for tuples with $V=K_i$, we don't kneed to descend the tree down to the leaves.
- No chain links for leaf nodes, namely there is no support for intervals

• Sequential Structures

- Cost of Equality Lookups:
 - a full scan, because lookups are no supported
- Cost of Interval Lookups:
 - a full scan, because lookups are not supported

Hash and Tree Structures

Cost of Equality Lookups:

The lookup is supported only if A_i is the key attribute on which the structure is built, otherwise, a full scan is required.

Lookup cost depends on

- The storage type (primary/secondary)
- The structure type (tree/hash)
- The key type (unique/non-unique)

If it is a primary hash:

A lookup for $A_i=v$ needs to find the block(s) storing the tuples with the same hash for A_i as those with v.

The hash function is applied to v, the right bucket is therefore immediately identified.

The bucket contains the searched tuples

Cost = 1

if the hash has no overflow chains

• $Cost = 1 + (average \ size \ of \ the \ overflow \ chain)$ if the hash has overflow chains

If it is a secondary hash:

The lookup for $A_i=v$ works exactly in the same way, only the aim is to find the block(s) storing the pointers to the tuples with the same hash for A_i as those with v.

The Hash function is applied to v, the right bucket is identified, and the corresponding block(s) are retrieved.

```
■ Cost =
1(comment: for the initial bucket block) +
(average overflow blocks)(comment: if any) +
(1 block per pointer to be followed)
```

Cost of Interval Lookups:

lookups based on intervals are not supported

• B+ Structures

Cost of equality Lookups :

```
If it is a primary B+
```

A lookup for $A_i=v$ needs to find the block(s) storing all tuples indexed by the key value v.

the root is read first, then, a node per intermediate level is read, until the first leaf node that stores tuples with $A_i=v$ is reached.

If the searched tuples are all stored in that leaf block, stop.

Else, continue in the leaf blocks chain until v changes to v^\prime

```
■ Cost =
(1 \ block \ per \ intermediate \ level) +
(as \ many \ leaf \ blocks \ as \ necessary \ to \ store \ all \ the \ tuples \ with \ A_i = v)
```

If it is a secondary B+

The lookup for $A_i=v$ needs to find the block(s) storing all the pointers that point to all tuples with the key value v for A_i .

The root is read first, then a node per intermediate level is read, until the first leaf node that sores pointers $A_i=v$ is reached.

If the pointers are all stored in that leaf block, stop.

Else, continue in the leaf blocks chain until v changes to v'.

```
Cost = (1 \ block \ per \ intermediate \ level) + (as \ many \ leaf \ blocks \ as \ necess. \ to \ store \ the \ pointers \ pointing \ to \ the \ tuples \ with \ A_i = v) + (1 \ block \ per \ each \ pointer)
```

Cost of Interval Lookups

If it is a primary B+

We consider a lookup for $v_1 \leq A_i \leq v_2$ as the general case.

If $(A_i < v)$ or $(v < A_i)$ we just assume that the other edge of the interval is the first/last value in the structure.

The root is read first, then a node per intermediate level is read, until the first leaf node that stores tuples with $A_i=v_1$ is reached.

if the searched tuples are all stored in that leaf block stop.

Else continue in the leaf blocks chain until v_2 is reached.

```
■ Cost =
(1 block per intermediate level) +
(as many leaf blocks as necess. to store all the tuples in the interval)
```

If it is a secondary B+

We still consider a lookup for $v_1 \leq A_i \leq v_2$ as the general case.

The root is read first, then a node per intermediate level is read, until the first leaf node that stores a the pointers pointing to the tuples with $A_i=v_1$ is reached.

If all the pointers (up to v_2) are in that leaf block, stop.

Else, continue in the leaf blocks chain until v_2 is reached.

```
Cost =
(1 block per intermediate level) +
(as many leaf blocks as necess. to store all pointers to the tuples in theinterval) +
(1 block per each such pointer, in order to retrieve the tuples)
```

Cost of Joins

I cannot talk about the cost of joins regarding each type of structure independently, that's because joins are to do among different tables, that can be represented in different structures one from the other.

Legenda:

- b_A = Number of blocks of the table A
- t_A = Number of tuples of a block of the table A
- E = External table
- I = Internal table
- \bullet L = Left
- R = Right

Type of joins:

- Nested Loop Join Cost (Assuming not enough free pages to host an entire table in the buffer) compares the tuples of a block of table T_E with all the tuples of all the blocks of T_I before moving to the next block T_E .
 - \circ $Cost = b_E * b_I$
- <u>Nested Loop Join Cost (Assuming enough free pages to host an entire table in the buffer)</u> the table in the buffer is chosen as internal table.
 - \circ $Cost = b_E + b_I$
- <u>Nested Loop Join Cost (Assuming that one table supports indexed access in the form of a lookup based on the join predicate)</u>

such table is chosen as internal

- \circ $Cost = b_E + (t_E * (cost of one indexed access to <math>T_I)$
- Merge Scan Join Cost (Assuming the primary storage to be sequentially ordered or B+)

This join is possible only if both tables are ordered according to the same key attribute, that is also the attribute used in the join predicate.

The cost is linear in the size of the table.

- \circ $Cost = b_L + b_R$
- Hashed Joins (Assuming the two hashes to be both primary storages)

This join is possible only if bot tables are hashed according to the same key attribute, that is the same used in the join predicate.

The cost is linear in the size of the hashes

 \circ $Cost = b_L + b_R$

Query Planning

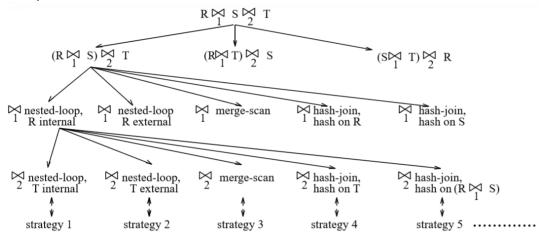
What cost to assign to a plan?

- Construct a decision tree, in which each node corresponds to a choice, each leaf node corresponds to a specific execution plan
- Assign to each plan a cost

$$C_{total} = C_{I/O} n_{I/O} + C_{cpu} n_{cpu}$$

• Choose the plan with the lowest cost, based on operations research (branch and bound)

Example of decision tree:



smvj55csddbdh95