

# Database Systems (資料庫系統)

December 13/14, 2006

Lecture #10

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## Announcement

- Midterm exams will be hand out today.
- Assignment #5 will be posted on the course webpage and due in two weeks.

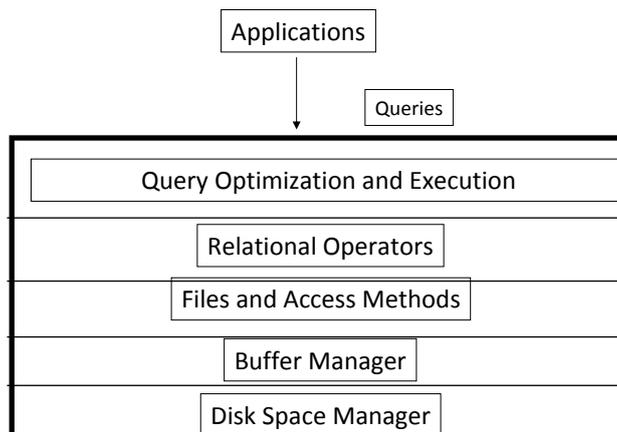
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# Overview of Query Evaluation

## Chapter 12

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## Review



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## Outline

- Query evaluation (Overview)
- Relational Operator Evaluation Algorithms (Overview)
- Statistics and Catalogs
- Query Optimization (Overview)
- Example

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## Tables

Sailors(sid, sname, rating, age)

Reserves(sid, bid, day, rname)

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## Overview of Query Evaluation (1)

- What is Query Evaluation?
- What is a good Query Evaluation?
  - Find an efficient plan (minimal disk I/Os)
- How do you find a good plan?

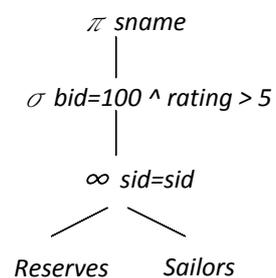
```
SELECT S.sname
FROM Reserves R, Sailors S
WHERE R.sid=S.sid ^ R.bid=100 ^ S.rating>5
```

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## Overview of Query Evaluation (II)

- Step 1: a query is translated into a relational algebra tree
  - $\sigma$  (selection),  $\pi$  (projection), and  $\Join$  (join)

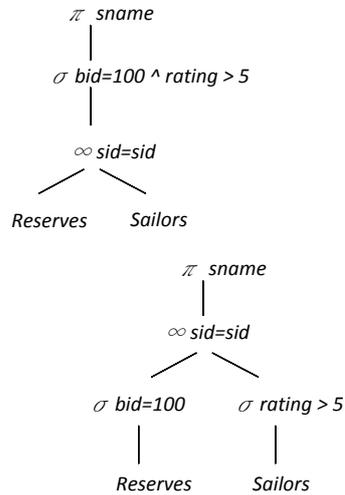
```
SELECT S.sname
FROM Reserves R, Sailors S
WHERE R.sid=S.sid ^ R.bid=100 ^ S.rating>5
```



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## Overview of Query Evaluation (III)

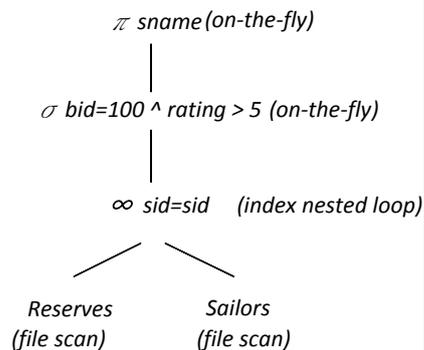
- Step 2: Find a good evaluation plan (Query Optimization)
  - Estimate costs for several alternative equivalent evaluation plans.
  - How to estimate disk I/O cost?
    - access method & evaluation algorithm
    - statistics on table sizes, etc.
  - Different order of evaluations gives different cost.
  - How does it affect cost?
    - Push selection ( $bid=100$ ) before join)



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## Overview of Query Evaluation (IV)

- (continue step 2)
  - An evaluation plan is consisted of choosing access method & evaluation algorithm.
  - Selecting an access method to retrieve records for each table on the tree (e.g., file scan, index search, etc.)
  - Selecting an evaluation algorithm for each relational operator on the tree (e.g., index nested loop join, sort-merge join, etc.)



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## Overview of Query Evaluation (V)

- Two main issues in query optimization:
  - For a given query, what plans are considered?
    - Consider a few plans (considering all is too many & expensive), and find the one with the cheapest (estimated) cost.
  - How is the cost of a plan estimated?
  - Consider:
    - Reserves  $\bowtie$  reserves.sid = sailors.sid Sailors (assume simple nested loop join)  
Foreach tuple r in reserves  
    Foreach tuple s in sailors  
        If (r.sid = s.sid) then add <r,s> to the results
    - Sailors  $\bowtie$  ( $\sigma$  bid = 10 Reserves)
    - Sailors  $\bowtie$  ( $\sigma$  bid > 5 Reserves)

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## Statistics and Catalogs

- Examine catalog table that has data schemas and statistics.
- Need information about the relations and indexes involved.  
Catalogs typically contain at least:
  - # tuples (NTuples) and # pages (NPages) for each table.
  - # distinct key values (NKeys) and NPages for each index.
  - Index height, low/high key values (Low/High) for each tree index.
- There are system-wide factors that can also affect cost, such as size of buffer pool, buffer replacement algorithm.

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## Statistics and Catalogs

- Catalogs are updated periodically.
  - Updating whenever lots of data changes; lots of approximation anyway, so slight inconsistency is ok.
- More detailed information (e.g., histograms of the values in some fields) are sometimes stored.
  - They can be used to estimate # tuples matching certain conditions (bid > 5)

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## Relational Operator Evaluation

- There are several alternative algorithms for implementing each relational operator (selection, projection, join, etc.).
- No algorithm is always better (disk I/O costs) than the others. It depends on the following factors:
  - Sizes of tables involved
  - Existing indexes and sort orders
  - Size of buffer pool (Buffer replacement policy)
- Describe (1) common techniques for relational operator algorithms, (2) access path, and (3) details of these algorithms.

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## Some Common Techniques

- Algorithms for evaluating relational operators use some simple ideas repeatedly:
  - Consider:  $\sigma_{bid = 10}$  Reserves
    - Indexing: If a selection or join condition is specified, use an index (<bid>) to retrieve the tuples that satisfy the condition.
  - Consider:  $\sigma_{bid \neq 10}$  Reserves, bid = 1 .. 1000
    - Iteration: Sometimes, faster to scan all tuples even if there is an index. Sometimes, scan the data entries in an index instead of the table itself. ( $\pi_{bid}$  Reserves).
  - Consider:  $\pi_{sid, rname}$  Reserves
    - Partitioning: By using sorting or hashing, partition the input tuples and replace an expensive operation by similar operations on smaller inputs

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## Access Paths

- An access path is a method of retrieving tuples.
  - Note that every relational operator takes one or two tables as its input.
  - There are two possible methods: (1) file scan, or (2) index that matches a selection condition.
- Can we use an index for a selection condition? How does an index match a selection condition?
  - Selection condition can be rewritten into Conjunctive Normal Form (CNF), or a set of terms (conjuncts) connected by  $\wedge$  (and).
    - Example:  $(rname='Joe') \wedge (bid = 5) \wedge (sid = 3)$
  - Intuitively, an index matching conjuncts means that it can be used to retrieve (just) tuples that satisfy the conjunct.

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## Access Paths for Tree Index

- A tree index matches conjuncts that involve only attributes in a prefix of its index search key.
  - E.g., Tree index on  $\langle a, b, c \rangle$  matches the selection condition  $(a=5 \wedge b=3)$ ,  $(a=5 \wedge b>6)$ , but not  $(b=0)$ .
    - Tree index on  $\langle a, b, c \rangle$ :  $\langle a_0, b_0, c_0 \rangle$ ,  $\langle a_0, b_0, c_1 \rangle$ ,  $\langle a_0, b_0, c_2 \rangle$ , ...,  $\langle a_0, b_1, c_0 \rangle$ ,  $\langle a_0, b_1, c_1 \rangle$ , ...  $\langle a_1, b_0, c_0 \rangle$ , ...
    - Can match range condition  $(a=5 \wedge b>3)$ .
- How about  $(a=5 \wedge b=3 \wedge c=2 \wedge d=1)$ ?
  - $(a=5 \wedge b=3 \wedge c=2)$  is called primary conjuncts. Use index to get tuples satisfying primary conjuncts, then check the remaining condition  $(d=1)$  for each retrieved tuple.
- How about two indexes  $\langle a, b \rangle$  &  $\langle c, d \rangle$ ?
  - Many access paths: (1) use  $\langle a, b \rangle$  index, (2) use  $\langle c, d \rangle$  index, ...
  - Pick the access path with the best selectivity (fewest page I/Os)

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## Access Paths for Hash Index

- A hash index matches a conjunct that has a term attribute = value for every attribute in the search key of the index.
  - E.g., Hash index on  $\langle a, b, c \rangle$  matches  $(a=5 \wedge b=3 \wedge c=5)$ , but it does not match  $(b=3)$ ,  $(a=5 \wedge b=3)$ , or  $(a>5 \wedge b=3 \wedge c=5)$ .
- Compare to Tree Index:
  - Cannot match range condition.
  - Partial matching on primary conjuncts is ok.

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## A Note on Complex Selections

$(\text{day} < 8/9/94 \text{ AND rname} = \text{'Paul'}) \text{ OR bid} = 5 \text{ OR sid} = 3$

- Selection conditions are first converted to conjunctive normal form (CNF):  
 $(\text{day} < 8/9/94 \text{ OR bid} = 5 \text{ OR sid} = 3) \text{ AND } (\text{rname} = \text{'Paul'} \text{ OR bid} = 5 \text{ OR sid} = 3)$
- We only discuss case with no ORs; see text if you are curious about the general case.

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## Selectivity of Access Paths

- Selectivity of an access path is the number of page I/Os needed to retrieve the tuples satisfying the desired condition.
- Why do we want to use the most selective access path (with the fewest page I/Os)?
- What are the possible access paths for selections?
  - Use an index that matches the selection condition.
  - Scan the file records.
  - Scan the index (e.g.,  $\pi_{\text{bid}}$  Reserves, index on bid)
- Access path using index may not be the most selective!
  - Why not?
  - Example:  $(\sigma_{\text{bid} \neq 10} \text{ Reserves, unclustered index on bid})$ .

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## Selection

```
SELECT (*)
FROM Reserves R
WHERE day < 8/9/94 ^ bid=5 ^ sid=3
```

- 1.
- 2.
- 3.

- Consider  $\sigma_{\text{day} < 8/9/94 \wedge \text{bid}=5 \wedge \text{sid}=3}$ 
  - A B+ tree index on day can be used; then, ( $\text{bid}=5 \wedge \text{sid}=3$ ) must be checked for each retrieved tuple.
  - A hash index on  $\langle \text{bid}, \text{sid} \rangle$  could be used;  $\text{day} < 8/9/94$  must then be checked.

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## Example

- Use the following example to estimate page I/O cost of different algorithms.
- Sailors( sid:integer, sname:string, rating:integer, age:real)
  - Each Sailor tuple is 50 bytes long
  - A page is 4KB. It can hold 80 sailor tuples.
  - We have 500 pages of Sailors (total 40,000 sailor tuples).
- Reserves( sid:integer, bid:integer, day:dates, rname:string)
  - Each reserve tuple is 40B long
  - A page is 4KB. It can hold 100 reserve tuples.
  - We have 1000 pages of Reserves (total 100,000 reserve tuples).

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## Reduction Factor & Catalog Stats

- Reduction factor is the fraction of tuples in the table that satisfy a given conjunct.
- Example #1:
  - Index H on Sailors with search key <bid>
  - Selection condition (bid=5)
  - Stats from Catalog: NKeys(H) = # of distinct key values = 10
  - Reduction factor =
- Examples #2:
  - Index on Reserves <bid, sid> (not a key, no stats on them)
  - Selection condition (bid=5 ^ sid=3)
  - Typically, can use default fraction of 1/10 for each conjunct.
  - Reduction factor =

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## More on Reduction Factor

- Examples 3:
  - Range condition as (day > 9/1/2002)
  - Index Key T on day
  - Stats from Catalog: High(T) = highest day value, Low(T) = lowest day value.
  - Reduction factor = ()
  - Say: High(T) = 12/31/2002, Low(T) = 1/1/2002
  - Reduction factor = 1/3

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## Using an Index for Selections

- Cost depends on #matched tuples and clustering.
  - Cost of finding qualifying data entries (typically small) plus cost of retrieving records (could be large w/o clustering)
    - Why large? Each matched entry could be on a different page.
  - Assume uniform distribution, 10% of tuples matched (100 pages, 10,000 tuples).
    - With a clustered index on <rid>, cost is little more than 100 I/Os;
    - If unclustered, worse case is 10,000 I/Os.
    - Faster to do file scan => 1,000 I/Os

```
SELECT *  
FROM Reserves R  
WHERE R.rid mod 10 = 1
```

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## Projection

```
SELECT DISTINCT R.sid, R.bid  
FROM Reserves R
```

- Projection drops columns not in the select attribute list.
- The expensive part is removing duplicates.
- If no duplicate removal,
  - 
  - Given index <sid, bid>, scan the index entries.
- If duplicate removal

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## More on Projection

- Hash-based projection:
  - Hash on  $\langle \text{sid}, \text{bid} \rangle$  (#buckets = #buffer pages).
  - Load buckets into memory one at a time and eliminate duplicates.

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## Join: Index Nested Loops

```
foreach tuple  $r$  in  $R$  do  $\text{Reserves } (R) \bowtie \text{Sailors } (S)$   
    foreach tuple  $s$  in  $S$  where  $r.\text{sid} = S.\text{sid}$  do  
        add  $\langle r, s \rangle$  to result
```

- There exists an index  $\langle \text{sid} \rangle$  for Sailors.
- Index Nested Loops: Scan  $R$ , for each tuple in  $R$ , then use index to find matching tuple in  $S$ .
- Say we have unclustered static hash index  $\langle \text{sid} \rangle$  in Sailors.  
What is the cost of join operation?
  - Scan  $R = 1000$  I/Os
  - $R$  has 100,000 tuples. For each  $R$  tuple, retrieve index page (1.2 I/Os on average for hashing) and data page (1 I/O).
  - Total cost =  $1,000 + 100,000 * (1.2 + 1) = 221,000$  I/Os.

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## Join: Sort-Merge

- It does not use any index.
- Sort R and S on the join column
- Scan sorted lists to find matches, like a merge on join column
- Output resulting tuples.
- More details about Sort-Merge in Chapter 14.

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## Example of Sort-Merge Join

<i>sid</i>	<i>sname</i>	<i>rating</i>	<i>age</i>
22	dustin	7	45.0
28	yuppy	9	35.0
28	lubber	8	55.5
44	guppy	5	35.0
58	rusty	10	35.0

<i>sid</i>	<i>bid</i>	<i>day</i>	<i>rname</i>
28	103	12/4/96	guppy
28	103	11/3/96	yuppy
31	101	10/10/96	dustin
31	102	10/12/96	lubber
31	101	10/11/96	lubber
58	103	11/12/96	dustin

- The cost of a merge sort is  $2 * M \log_{(B-1)} M$ , whereas  $M = \#pages$ ,  $B = \text{size of buffer}$ .
  - $B-1$  is quite large, so  $\log_{(B-1)} M$  is generally just 2.
- Total cost = cost of sorting R & S + Cost of merging =  $2 * 2 * (1000 + 500) + (1000 + 500) = 7500$  I/Os. (a lot less than index nested loops join!)

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## Index Nested Loop Join vs. Sort-Merge Join

$Reserves (R) \bowtie Sailors (S)$

- Sort-merge join does not require a pre-existing index, and ...
  - Performs better than index-nested loop join.
  - Resulting tuples sorted on sid.
- Index-nested loop join has a nice property: incremental.
  - The cost proportional to the number of Reserves tuples.
    - Cost = #tuples(R) \* Cost(accessing index+record)
  - Say we have very selective condition on Reserves tuples.
    - Additional selection: R.bid=101
    - Cost small for index nested loop, but large for sort-merge join (sort Sailors & merging)
  - Example of considering the cost of a query (including the selection) as a whole, rather than just the join operation → query optimization.

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## Other Relational Operators

- Discussed simple evaluation algorithms for
  - Projection, Selection, and Join
- How about other relational operators?
  - Set-union, set-intersection, set-difference, etc.
  - The expensive part is duplicate elimination (same as in projection).
  - How to do  $R1 \cup R2$  ?
- SQL aggregation (group-by, max, min, etc.)
  - Group-by is typically implemented through sorting (without search index on group-by attribute).
  - Aggregation operators are implemented using counters as tuples are retrieved.

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# Query Optimization

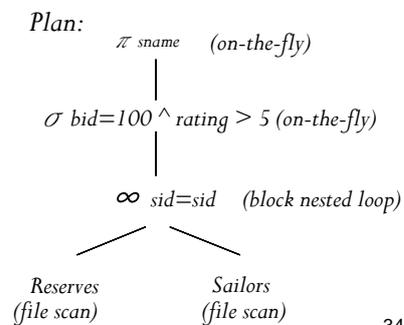
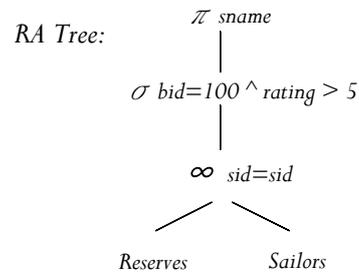
- Find a good plan for an entire query consisting of many relational operators.
  - So far, we have seen evaluation algorithms for each relational operator.
- Query optimization has two basic steps:
  - Enumerate alternative plans for evaluating the query
  - Estimating the cost of each enumerated plan & choose the one with lowest estimated cost.
    - Consult the catalog for estimation.
    - Estimate size of result for each operation in tree (reduction factor).
- More details on query optimization in Chapter 15.

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## Motivating Example

```
SELECT S.sname
FROM Reserves R, Sailors S
WHERE R.sid=S.sid AND
      R.bid=100 AND S.rating>5
```

- Cost: 1000+1000\*500 I/Os
- Misses several opportunities: selections could have been 'pushed' earlier, no use is made of any available indexes, etc.
- *Goal of optimization:* To find more efficient plans that compute the same answer.

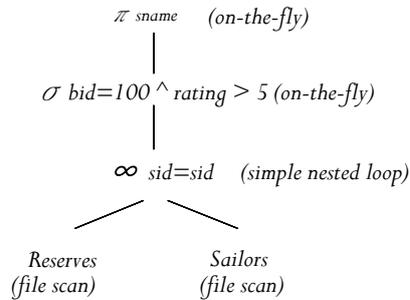


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# Pipeline Evaluation

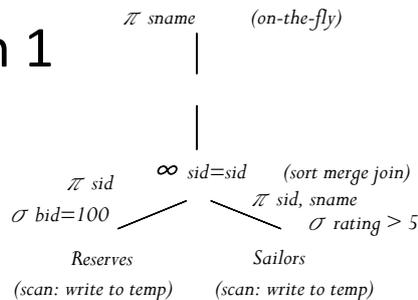
- How to avoid the cost of physically writing out intermediate results between operators?

- Example: between join and selection
- Use pipelining, each join tuple (produced by join) is (1) checked with selection condition, and (2) projected out on the fly, before being physically written out (materialized).



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# Alternative Plan 1 (No Indexes)

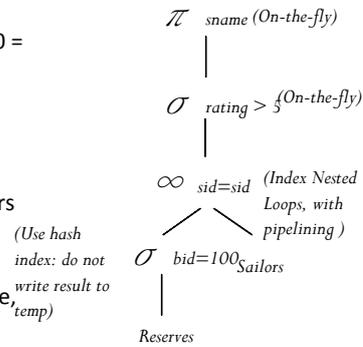


- Main difference: push selects.
- With 5 buffers, cost of plan:
  - Scan Reserves (1000 pages) for selection + write temp T1 (10 pages, if we have 100 boats, uniform distribution).
  - Scan Sailors (500 pages) for selection + write temp T2 (250 pages, if we have 10 ratings, uniform distribution).
  - Sort T1 (2\*2\*10), sort T2 (2\*4\*250), merge (10+250)
  - Total: (1000 + 500 + 10 + 250) + (40 + 2000 + 260) = 4060 page I/Os.
- If we used BNL join, join cost = 10+4\*250, total cost = 2770.
- If we `push` projection, T1 has only sid, T2 only sid and sname:
  - T1 fits in 3 pages, cost of BNL drops to under 250 pages, total < 2000.

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## Alternative Plan 2 With Indexes

- With clustered index on bid of Reserves, we get 100,000/100 = 1000 tuples on 1000/100 = 10 pages.
- Use pipelining (the join tuples are not materialized).
- Join column *sid* is a key for Sailors.
- Projecting out unnecessary fields from Sailors may not help.
  - Why not? Need Sailors.sid for join.
- Not to push *rating>5* before the join because,
  - Want to use *sid* index on Sailors.
- Cost: Selection of Reserves tuples (10 I/Os); for each,
  - Must get matching Sailors tuple (1000\*1.2); total 1210 I/Os.



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## Next 2 Lectures

- External sorting
- Evaluation of relational operators
- (Relational query optimizer)

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