### Query Processing

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CS 640 Principles of Database Management and Use Winter 2013

Some of these slides are based on a slide set provided by Ulf Leser.

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### Outline

- 1 Query Processing Steps
- 2 Query Representations Logical Plans Physical Plans
- 3 Examples for Physical Operators

Table Scan Sorting Duplicate Elimination Nested Loop Join Sort-Merge Join Hash Join

4 Summary

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Notes

Notes

### Query Processing Steps

Parsing Query Validation View Resolution Optimization Plan Compilation 1  ${\tt Execution}$ 

As given in: Goetz Graefe: Query Evaluation Techniques for Large Databases. ACM Comp. Surveys 25(2): 73-170 (1993).

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### Query Processing Steps (Parsing)



- Input: SQL query
- Output: internal representation (e.g. based on relational algebra)

Optimization  $\downarrow$ Plan Compilation 1 Execution

As given in: Goetz Graefe: Query Evaluation Techniques for Large Databases. ACM Comp. Surveys 25(2): 73-170 (1993).

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# Notes

### Query Processing Steps (Query Validation)

Parsing Query Validation 1 View Resolution 1 Optimization  $\downarrow$ Plan Compilation

1 Execution Check whether:

- mentioned tables, attributes, etc. exist.
- comparisons are feasible (e.g. comparability of attribute types),
- · aggregation queries have a valid SELECT clause,
- etc.

As given in:

Goetz Graefe: Query Evaluation Techniques for Large Databases. ACM Comp. Surveys 25(2): 73-170 (1993).

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### Query Processing Steps (View Resolution)

Parsing Query Validation  $\downarrow$ View Resolution 1 Optimization  $\downarrow$ Plan Compilation 1 Execution

- Substitute references to views by the view definitions
- (More on views in a later lecture)

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| As given | in:     |        |              |          |          |         |
|----------|---------|--------|--------------|----------|----------|---------|
| Goetz    | Graefe: | Query  | Evaluat io n | Techniqu | es for l | Large   |
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### Query Processing Steps (Optimization)



 $\downarrow$ 

Plan Compilation

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- plans (QEPs)
  - · Different QEPs have different costs (that is, resources needed for their execution)
  - Output: an efficient QEP (i.e. estimated cost is the lowest or comparatively low)

• Considers possible query execution

• This task is all but trivial...

Execution

As given in: Goetz Graefe: Query Evaluation Techniques for Large Databases. ACM Comp. Surveys 25(2): 73-170 (1993).

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# Notes

### Query Processing Steps (Optimization, cont'd)



- The set of all possible QEPs is huge.
  - Optimizers enumerate only a restricted subset (search space)
- A desirable optimizer:
  - cost estimation is accurate
  - search space includes low cost QEPs
  - enumeration algorithm is efficient
- (Query optimization will be the main topic of our discussion next week.)

As given in: Goetz Graefe: Query Evaluation Techniques for Large Databases. ACM Comp. Surveys 25(2): 73-170 (1993).

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### Query Processing Steps (Plan Compilation)

| Parsing          |
|------------------|
| <b>↓</b>         |
| Query Validation |
| $\downarrow$     |
| View Resolution  |
| $\downarrow$     |
| Optimization     |
|                  |
| Plan Compilation |
| 1                |

• Translate the selected QEP into a representation ready for execution (e.g. compiled machine code, interpreted language)

| $\stackrel{\downarrow}{	ext{Execution}}$ |  |
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As given in: Goetz Graefe: Query Evaluation Techniques for Large

Databases. ACM Comp. Surveys 25(2): 73-170 (1993).

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### Query Processing Steps (Execution)



- Execute the compiled plan
- Return the query result via the respective interface

As given in:

Goetz Graefe: Query Evaluation Techniques for Large Databases. ACM Comp. Surveys 25(2): 73-170 (1993).

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## Notes

### Query Representations

While it is processed by a DBMS, a query goes through multiple representations.

Usually, these are:

- $\ensuremath{\textbf{0}}$  an expression in the query language (e.g. SQL query)
- parse tree
- 3 logical plan
- 4 physical plan
- 6 compiled program

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## Not es

### Logical Plans

- represented as an expression in a logical algebra (such as the relational algebra)
- closely related to the logical data model
- can be visualized as a tree of logical operators

SELECT title
FROM StarsIn
WHERE starName IN (
SELECT name
FROM MovieStar
WHERE dob LIKE "% 1960")

| I Ititle                              |                       |  |  |  |  |
|---------------------------------------|-----------------------|--|--|--|--|
|                                       |                       |  |  |  |  |
| $\sigma_{	ext{	iny star Na}}$         |                       |  |  |  |  |
| • starNa                              | me=name               |  |  |  |  |
|                                       |                       |  |  |  |  |
| >                                     |                       |  |  |  |  |
|                                       | `                     |  |  |  |  |
|                                       |                       |  |  |  |  |
| StarsIn                               | $\Pi_{\mathtt{name}}$ |  |  |  |  |
|                                       |                       |  |  |  |  |
| $\sigma_{\scriptscriptstyle 	ext{d}}$ | b LIKE "% 1960s"      |  |  |  |  |
|                                       |                       |  |  |  |  |
|                                       | MovieStar             |  |  |  |  |
|                                       |                       |  |  |  |  |

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### Logical Plans (cont'd)

Remember, algebra expressions may be rewritten into semantically equivalent expressions.

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### Physical Plans

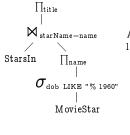
- Also often called query execution plan (QEP)
- Represented as an expression in a physical algebra
- Physical operators come with a specific algorithm.
  - e.g. a nested loop join

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### Physical Plans (Example)



A possible physical plan for the given logical plan:

Project (Attributes: {title}) Hash Join (Predicate: starName=name) Sequential Scan Index Scan (Table: StarsIn) (Predicate: dob LIKE "% 1960" Table: MovieStar)

Notes

### Logical Operators vs. Physical Operators

- Logical operators and physical operators do not necessarily map directly into one another.
  - e.g. most join algorithms can project out attributes (without duplicate elimination)
  - e.g. a (physical) duplicate removal operator implements only a part of the (logical) projection operator  $% \left( 1\right) =\left( 1\right) \left( 1\right) \left($
  - e.g. a (physical) sort operator has no counterpart in a (set based) logical algebra
- Physical operators can be associated with a cost function (to compute the amount of resources needed for their execution).

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### Examples for Physical Operators

- Table scan
- Sorting
- Duplicate elimination
- Selection
- Projection

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### Table Scan

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- The leaves of each physical operator tree are (physical) tables.
- Accessing them completely implies a sequential scan.
  - Load each page of the table.
  - Sequentially scanning a table that occupies n pages has n I/O cost.

### Combining the scan with the next operation in the plan is often better.

Example: SELECT A, B FROM t WHERE A = 5

Selection: If index on A available, perform an index scan instead (i.e. obtain relevant tuples by accessing the index)

• Especially effective if A is a key

Projection: Integrate into the table scan (i.e. read all tuples but only pass on attributes that are needed)

> · Can also be combined with an index scan. Query Processing

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## Sorting Notes • Many physical operators require input to be sorted. • However, the (unsorted) input may not fit into main memory. • We need an external sorting algorithm. · Intermediate results are temporarily stored on secondary memory. Winter 2013 19 / 30 Query Processing (Simple) External Merge Sort Notes • First, sort each page internally. • Group these sorted pages into pairs and for each pair merge its two pages. • Each of these groups is then merged with another group, resulting in groups of four pages. • And so on. • The final group is the completely sorted file. • This strategy makes use of 3 page buffers in main memory. • If more buffers are available, we should exploit them ... CS 640 Query Processing Winter 2013 20 / 30 External Merge Sort Notes • Suppose: m+1 page buffers are available in main memory; • the input occupies p pages. • Group the pages into $\frac{p}{m}$ groups. • Sort each group (using an m-way merge after sorting each of its pages internally). • Each additional stage n (n > 1): • Group the sorted groups from stage n-1 into larger groups such that each larger group consists of m of the previous groups (and $m^n$ pages). • For each of these new groups perform an m-way merge. • If $m^{n+1} \ge p$ we are done. • Maximum number of stages: $\lceil \log_m(p) \rceil$ • Maximum number of pages read and written: $2 \times p \times \lceil \log_m(p) \rceil$

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## Duplicate Elimination (Option 1) Notes Two steps: Sort input table (or intermediate result) on DISTINCT column(s) • Can be skipped if input is sorted already. 2 Scan sorted table and output unique tuples. • Generated output is sorted · Cannot be pipelined CS 640 Query Processing Winter 2013 22 / 30 Duplicate Elimination (Option 2) Notes • Idea: Scan the input and gradually populate an internal data structure that holds each unique input tuple once. • For each input tuple check whether it has already been seen • No: insert tuple into the data structure and output the tuple • Yes: skip to the next input tuple • Possible data structures: • Hash table - might be faster, needs good hash function • Binary tree - some cost for balancing, robust • Does not sort output (but existing sorting would remain) • Can be pipelined CS 640 Query Processing Winter 2013 23 / 30 Nested Loop Join Notes (We focus on equi joins and natural joins.) • General idea: FOR EACH tuple r in relation R DO FOR EACH tuple s in relation S DO IF r.A = s.A THEN output tuple $r \cup s$ . • Of course, we do this for relations that are distributed over multiple pages: FOR EACH page p of R DO FOR EACH page q of S DO FOR EACH tuple r on page p DO FOR EACH tuple s on page q DO IF r.A = s.A THEN output tuple $r \cup s$ .

• I/O cost:  $pages(R) + pages(R) \times pages(S)$ 

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### Nested Loop Join (Possible Improvements)

- Block nested loop join
- Zig-zag join
- Index nested loop join

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Notes

Notes

### Sort-Merge Join

- Sort phase:

  - Sort both inputs on the join attributes
    May need to use an external sorting algorithm
  - Sorting may be skipped for inputs that are already sorted
- Merge phase:
  - Synchronously iterate over both (sorted) inputs
    Merge and output tuples that can be joined

  - · Caution if join values may appear multiple times

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### Sort-Merge Join (Example)

 $\mathbf{R}$ 

| A  | В |               | A  | В |            |               |
|----|---|---------------|----|---|------------|---------------|
| a2 | 1 |               | a4 | 0 | <=         | $\Rightarrow$ |
| a4 | 0 | $sort(B)^{'}$ | a2 | 1 | <=         | $\Rightarrow$ |
| a3 | 2 |               | a4 | 1 | <=         | $\Rightarrow$ |
| a4 | 1 |               | a3 | 2 | <b> </b> ← | $\Rightarrow$ |

 $\mathbf{S}$ 

|         | В | $\mathbf{C}$ |
|---------|---|--------------|
|         | 3 | c4           |
| sort(B) | 2 | c1           |
|         | 0 | c2           |
|         | 2 | c3           |

 $\mathbf{R} \bowtie \mathbf{S}$ 

| A  | В | C  |
|----|---|----|
| a4 | 0 | c2 |
| a3 | 2 | с3 |
| a3 | 2 | c1 |
|    |   |    |

В  $\mathbf{C}$ 0 c2 2 c3

2 c1 3

Notes

### Sort-Merge Join (Cost Estimation)

• I/O costs for sort phase are approximately:

$$\underbrace{2 \times \operatorname{pages}(R) \times \left\lceil \operatorname{log}(\operatorname{pages}(R)) \right\rceil}_{\operatorname{sorting } R} + \underbrace{2 \times \operatorname{pages}(S) \times \left\lceil \operatorname{log}(\operatorname{pages}(S)) \right\rceil}_{\operatorname{sorting } S}$$

• I/O costs for merge phase are:

$$pages(R) + pages(S)$$

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### Hash Join

- Idea: use join attributes as hash keys in both input relations
- Choose hash function for building hash tables with m buckets (where m is the number of page buffers available in main memory)
- Partitioning phase:
  - ullet Scan relation R and populate its hash table.
  - · Whenever the page buffer for a hash bucket is full, write it to disc and start a new page for that buffer.
  - · Finally, write the remaining page buffers to disc.
  - Do the same for relation S (using the same hash function!).
  - · Result: hash-partitioned versions of both relations on disc
  - Now, we only need to compare tuples in corresponding partitions.
- Probing phase:
  - Read in a complete partition from R (assuming |R| < |S|).
  - Scan over the corresponding partition of S and produce join tuples.

• I/O costs: 
$$2(pages(R) + pages(S)) + (pages(R) + pages(S))$$

partitioning

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Summary

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- For each query different physical operators can be combined into different, semantically equivalent QEPs (query execution plans).
- Each physical operator comes with an algorithm.
- Commonly used techniques for many of these algorithms:
  - Combining: Multiple tasks may be combined once some input data has been read in.
  - Partitioning: Either by sorting or by hashing, we can partition the input(s) and do less work by ignoring many irrelevant combinations.
  - Indexing: Existing indexes may be exploited for reducing work to relevant parts of the input.
- Each of these algorithms has a certain cost.
- Thus, different QEPs have different costs.
- The actual cost can only be estimated (as long as we do not execute the QEP).

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