

## 3.2 SQL

SQL: Structured (Standard) Query Language

**Literature:** A Guide to the SQL Standard, 3rd Edition, C.J. Date and H. Darwen, Addison-Wesley 1993

**History:** about 1974 as SEQUEL (IBM System R, INGRES@Univ. Berkeley, first product: Oracle in 1978)

**Standardization:**

**SQL-86** and **SQL-89:** core language, based on existing implementations, including procedural extensions

**SQL-92 (SQL2):** some additions

**SQL-99 (SQL3):**

- active rules (triggers)
- recursion
- object-relational and object-oriented concepts

### Underlying Data Model

SQL uses the relational model:

- SQL relations are **multisets (bags)** of tuples (i.e., they can contain duplicates)
- Notions: Relation  $\rightsquigarrow$  Table  
Tuple  $\rightsquigarrow$  Row  
Attribute  $\rightsquigarrow$  Column

The relational algebra serves as theoretical base for SQL as a query language.

- comprehensive treatment in the “Practical Training SQL”  
(<http://dbis.informatik.uni-goettingen.de/Teaching/DBP/>)

## BASIC STRUCTURE OF SQL QUERIES

SELECT  $A_1, \dots, A_n$       (... corresponds to  $\pi$  in the algebra)  
FROM  $R_1, \dots, R_m$       (... specifies the contributing relations)  
WHERE  $F$                     (... corresponds to  $\sigma$  in the algebra)

corresponds to the algebra expression  $\pi[A_1, \dots, A_n](\sigma[F](r_1 \times \dots \times r_m))$

- Note: cartesian product  $\rightarrow$  prefixing (optional)

### Example

```
SELECT code, capital, country.population, city.population
FROM country, city
WHERE country.code = city.country
      AND city.name = country.capital
      AND city.province = country.province;
```

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## PREFIXING, ALIASING AND RENAMING

- Prefixing: *tablename.attr*
- Aliasing of relations in the FROM clause:

```
SELECT alias1.attr1, alias2.attr2
FROM table1 alias1, table2 alias2
WHERE ...
```

- Renaming of result columns of queries:

```
SELECT attr1 AS name1, attr2 AS name2
FROM ... WHERE ...
```

(formal algebra equivalent: renaming)

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## SUBQUERIES

Subqueries of the form (SELECT ... FROM ... WHERE ...) can be used anywhere where a relation is required:

Subqueries in the FROM clause allow for selection/projection/computation of intermediate results/subtrees before the join:

```
SELECT ...
FROM (SELECT ...FROM ...WHERE ...),
     (SELECT ...FROM ...WHERE ...)
WHERE ...
```

(interestingly, although “basic relational algebra”, this has been introduced e.g. in Oracle only in the early 90s)

Subqueries in other places allow to express other intermediate results:

```
SELECT ... (SELECT ...FROM ...WHERE ...) FROM ...
WHERE [NOT] value1 IN (SELECT ...FROM ...WHERE)
      AND [NOT] value2 comparison-op [ALL|ANY] (SELECT ...FROM ...WHERE)
      AND [NOT] EXISTS (SELECT ...FROM ...WHERE);
```

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## SUBQUERIES IN THE FROM CLAUSE

- often in combination with aliasing and renaming of the results of the subqueries.

```
SELECT alias1.name1,alias2.name2
FROM (SELECT attr1 AS name1 FROM ...WHERE ...) alias1,
     (SELECT attr2 AS name2 FROM ...WHERE ...) alias2 WHERE ...
```

... all big cities that belong to large countries:

```
SELECT city, country
FROM (SELECT name AS city, country AS code2
      FROM city
      WHERE population > 1000000
     ),
     (SELECT name AS country, code
      FROM country
      WHERE area > 1000000
     )
WHERE code = code2;
```

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## SUBQUERIES

- Subqueries of the form (SELECT ... FROM ... WHERE ...) that result in a **single value** can be used anywhere where a value is required

```
SELECT function(..., (SELECT ... FROM ... WHERE ...))
FROM ... ;

SELECT ...
FROM ...
WHERE value1 = (SELECT ... FROM ... WHERE ...)
      AND value2 < (SELECT ... FROM ... WHERE ...);
```

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### Subqueries in the WHERE clause

#### Non-Correlated subqueries

... the simple ones. Inner SFW independent from outer SFW

```
SELECT name
FROM country
WHERE area >
  (SELECT area
   FROM country
   WHERE code='D');

SELECT name
FROM country
WHERE code IN
  (SELECT country
   FROM encompasses
   WHERE continent='Europe');
```

#### Correlated subqueries

Inner SELECT ... FROM ... WHERE references value of outer SFW in its WHERE clause:

```
SELECT name
FROM city
WHERE population > 0.25 *
  (SELECT population
   FROM country
   WHERE country.code = city.country);

SELECT name, continent
FROM country, encompasses enc
WHERE country.code=enc.country
      AND area > 0.25 *
  (SELECT area
   FROM continent
   WHERE name = enc.continent);
```

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## Subqueries: EXISTS

- EXISTS makes only sense with a correlated subquery:

```
SELECT name
FROM country
WHERE EXISTS (SELECT *
              FROM city
              WHERE country.code = city.country
              AND population > 1000000);
```

algebra equivalent: semijoin.

- NOT EXISTS can be used to express things that otherwise cannot be expressed by SFW:

```
SELECT name
FROM country
WHERE NOT EXISTS (SELECT *
                  FROM city
                  WHERE country.code = city.country
                  AND population > 1000000);
```

Alternative: use (SFW) MINUS (SFW)

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## SET OPERATIONS: UNION, INTERSECT, MINUS/EXCEPT

```
(SELECT name FROM city) INTERSECT (SELECT name FROM country);
```

Often applied with renaming:

```
SELECT *
FROM ((SELECT river AS name, country, province FROM geo_river)
      UNION
      (SELECT lake AS name, country, province FROM geo_lake)
      UNION
      (SELECT sea AS name, country, province FROM geo_sea))
WHERE country = 'D';
```

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## HANDLING OF DUPLICATES

In contrast to algebra relations, SQL tables may contain duplicates (cf. Slide 111):

- some applications require them
- duplicate elimination is relatively expensive ( $O(n \log n)$ )

⇒ do not do it automatically

⇒ SQL allows for *explicit* removal of duplicates:

Keyword: `SELECT DISTINCT  $A_1, \dots, A_n$  FROM ...`

The internal optimization can sometimes put it at a position where it does not incur additional costs.

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## GENERAL STRUCTURE OF SQL QUERIES:

<code>SELECT [DISTINCT] <math>A_1, \dots, A_n</math></code>	list of expressions
<code>FROM <math>R_1, \dots, R_m</math></code>	list of relations
<code>WHERE <math>F</math></code>	condition(s)
<code>GROUP BY <math>B_1, \dots, B_k</math></code>	list of grouping attributes
<code>HAVING <math>G</math></code>	condition on groups, same syntax as WHERE clause
<code>ORDER BY <math>H</math></code>	sort order – only relevant for output

- ORDER BY: specifies output order of tuples

`SELECT name, population FROM city;`

full syntax: `ORDER BY attribute-list [ASC|DESC] [NULLS FIRST|LAST]`  
(ascending/descending)

Multiple attributes allowed:

`SELECT * FROM city ORDER BY country, province;`

Next: How many people live in the cities in each country?

- GROUP BY: form groups of “related” tuples and generate one output tuple for each group
- HAVING: conditions evaluated on the groups

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## Grouping and Aggregation

- First Normal Form: all values in a tuple are atomic (string, number, date, ...)
- GROUP BY *attribute-list*: forms groups of tuples that have the same values for *attribute-list*

```
SELECT country, SUM(population), MAX(population), COUNT(*)
FROM City
GROUP BY country
HAVING SUM(population) > 1000000;
```

:	:	:	:
Innsbruck	A	Tirol	118000
Vienna	A	Vienna	1583000
:	:	:	:
Graz	A	Steiermark	238000
:	:	:	:

- each group yields *one* tuple which may contain:

- the group-by attributes
- *aggregations* of all values in a column: SUM, AVG, MIN, MAX, COUNT

:	:	:	:
country: A	SUM(population): 2434525	MAX(population): 1583000	COUNT(*): 9
:	:	:	:

- SELECT and HAVING: use these terms.

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## Aggregation

- Aggregation can be applied to a whole relation:

```
SELECT COUNT(*), SUM(population), MAX(population)
FROM country;
```

- Aggregation with DISTINCT:

```
SELECT COUNT (DISTINCT country)
FROM CITY
WHERE population > 1000000;
```

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## ALTOGETHER: EVALUATION STRATEGY

SELECT [DISTINCT] $A_1, \dots, A_n$	list of expressions
FROM $R_1, \dots, R_m$	list of relations
WHERE $F$	condition(s)
GROUP BY $B_1, \dots, B_k$	list of grouping attributes
HAVING $G$	condition on groups, same syntax as WHERE clause
ORDER BY $H$	sort order – only relevant for output

1. evaluate FROM and WHERE,
2. evaluate GROUP BY → yields groups,
3. generate a tuple for each group containing all expressions in HAVING and SELECT,
4. evaluate HAVING on groups,
5. evaluate SELECT (projection, removes things only needed in HAVING),
6. output result according to ORDER BY.

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## CONSTRUCTING QUERIES

For each problem there are multiple possible equivalent queries in SQL (cf. Example 3.14). The choice is mainly a matter of personal taste.

- analyze the problem “systematically”:
  - collect all relations (in the FROM clause) that are needed
  - generate a suitable conjunctive WHERE clause⇒ leads to a single “broad” SFW query  
(cf. conjunctive queries, relational calculus)
- analyze the problem “top-down”:
  - take the relations that directly contribute to the result in the (outer) FROM clause
  - do all further work in correlated subquery/-queries in the WHERE clause⇒ leads to a “main” part and nested subproblems
- decomposition of the problem into subproblems:
  - subproblems are solved by nested SFW queries that are combined in the FROM clause of a surrounding query

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## Comparison

SQL:

```
SELECT  $A_1, \dots, A_n$  FROM  $R_1, \dots, R_m$  WHERE  $F$ 
```

- **equivalent expression in the relational algebra:**

$$\pi[A_1, \dots, A_n](\sigma[F](r_1 \times \dots \times r_m))$$

- **Algorithm (nested-loop):**

FOR each tuple  $t_1$  in relation  $R_1$  DO

    FOR each tuple  $t_2$  in relation  $R_2$  DO

        :

            FOR each tuple  $t_n$  in relation  $R_n$  DO

                IF tuples  $t_1, \dots, t_n$  satisfy the WHERE-clause THEN

                    evaluate the SELECT clause and generate the result tuple (projection).

Note: the tuple variables can also be introduced in SQL explicitly as alias variables:

```
SELECT  $A_1, \dots, A_n$  FROM  $R_1$   $t_1, \dots, R_m$   $t_m$  WHERE  $F$ 
```

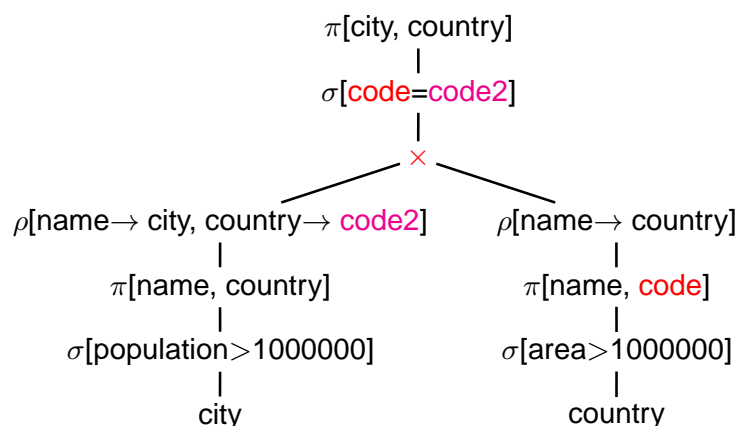
(then optionally using  $t_i.attr$  in SELECT and WHERE)

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## Comparison: Subqueries

- Subqueries in the FROM-clause (cf. Slide 115): **joined subtrees** in the algebra

```
SELECT city, country.name  
FROM (SELECT name AS city,  
          country AS code2  
      FROM city  
      WHERE population > 1000000  
   ),  
(SELECT name AS country, code  
  FROM country  
  WHERE area > 1000000  
 )  
WHERE code = code2;
```

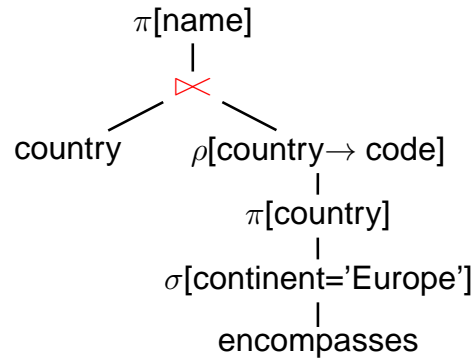


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## Comparison: Subqueries in the WHERE clause

- WHERE ... IN uncorrelated-subquery (cf. Slide 117):  
Natural semijoin outer tree with the subquery tree;

```
SELECT name
FROM country
WHERE code IN
  (SELECT country
   FROM encompasses
   WHERE continent='Europe');
```



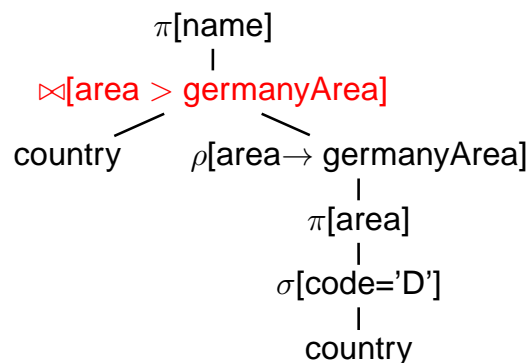
Note that the natural semijoin serves as an equi-selection where all tuples from the outer expression qualify that match an element of the result of the inner expression.

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## Comparison: Subqueries

- WHERE value *op* uncorrelated-subquery:  
(cf. Slide 117):  
join of outer expression with subquery, selection, projection to outer attributes

```
SELECT name
FROM country
WHERE area >
  (SELECT area
   FROM country
   WHERE code='D');
```



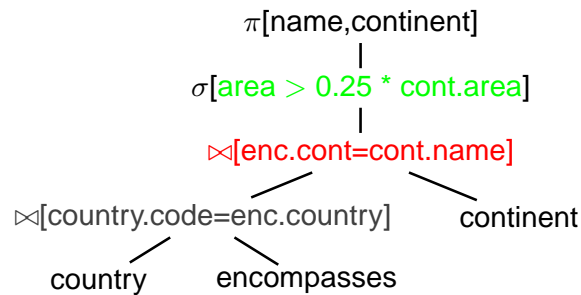
Note: the table that results from the join has the format (name, code, area, population, ..., germanyArea).

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## Comparison: Correlated Subqueries

- WHERE value *op* correlated-subquery:
  - tree<sub>1</sub>: outer expression
  - tree<sub>2</sub>: subquery, uncorrelated
  - **natural join/semijoin** of both trees contains the **correlating condition**
  - afterwards: **WHERE condition**

```
SELECT name, continent
FROM country, encompasses enc
WHERE country.code=enc.country
AND area > 0.25 *
(SELECT area
FROM continent
WHERE name=enc.continent);
```



- equivalent with semijoin:  $\bowtie [enc.cont=cont.name \wedge area > 0.25 * cont.area]$

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## Comparison: Correlated Subqueries

... comment to previous slide:

- although the tree expression looks less target-oriented than the SQL correlated subquery, it does the same:
- instead of iterating over the tuples of the outer SQL expression and evaluating the inner one for each of the tuples,
- the results of the inner expression are “precomputed” and iteration over the outer result just fetches the corresponding one.
- effectiveness depends on the situation:
  - how many of the results of the subquery are actually needed (worst case: no tuple survives the outer local WHERE clause).
  - are there results of the subquery that are needed several times.

database systems are often able to internally choose the most effective solution (schema-based and statistics-based)

... see next section.

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## Comparison: EXISTS-Subqueries

- WHERE EXISTS: similar to above:  
correlated subquery, no additional condition after natural semijoin
- SELECT ... FROM X,Y,Z WHERE NOT EXISTS (SFW):

```
SELECT ...  
FROM ((SELECT * FROM X,Y,Z) MINUS  
      (SELECT X,Y,Z WHERE EXISTS (SFW)))
```

## Results

- all queries (without NOT-operator) including subqueries without grouping/aggregation can be translated into SPJR-trees (selection, projection, join, renaming)
- they can even be flattened into a single broad cartesian product, followed by a selection and a projection.

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## Comparison: the differences between Algebra and SQL

- The relational algebra has no notion of grouping and aggregate functions
- SQL has no clause that corresponds to relational division

### Example 3.16

Consider again Example 3.10 (Slide 91).

The corresponding SQL formulation that implements division corresponds to the textual

*“all countries that occur in  $\pi[\text{country}](\text{enc})$ , with the additional condition that they occur in enc together with each of the continent values that occur in cts”,*

*or equivalent*

*“all countries  $c$  in  $\pi[\text{country}](\text{enc})$  such that there is no continent value  $\text{cont}$  in cts such that  $c$  does not occur together with  $\text{cont}$  in enc”:* □

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### Example 3.16 (Continued)

“all countries  $c$  in  $\pi[\text{country}](\text{enc})$  such that there is no continent value  $\text{cont}$  in  $\text{cts}$  such that  $c$  does not occur together with  $\text{cont}$  in  $\text{enc}$ ”:

```
SELECT enc1.country
```

```
FROM enc enc1 — consider enc1.country="R" and enc1.country="D"
```

```
WHERE NOT EXISTS — correlated subquery
```

```
( ( SELECT ct — always
    FROM cts
  )
```

“Europe”
“Asia”

```
MINUS
```

```
( SELECT ct
  FROM enc enc2
  WHERE enc1.country = enc2.country
)
```

for “R”:

“R”	“Asia”
“R”	“Europe”

for “D”:

“D”	“Europe”
-----	----------

```
) — remains: for “R”: nothing  $\leadsto$  “R” belongs to the result
```

for D: “Asia”  $\leadsto$  “D” does not belong to the result

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### Orthogonality

Full orthogonality means that an expression that results in a relation is allowed everywhere, where an input relation is allowed

- subqueries in the FROM clause
- subqueries in the WHERE clause
- subqueries in the SELECT clause (returning a single value)
- combinations of set operations

But:

- Syntax of aggregation functions is not fully orthogonal:

Not allowed: `SUM(SELECT ...)`

```
SELECT SUM(pop_biggest)
  FROM (SELECT country, MAX(population) AS pop_biggest
        FROM City
        GROUP BY country);
```

- The language OQL (Object Query Language) uses similar constructs and is fully orthogonal.

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### 3.3 Efficient Algebraic Query Evaluation

Queries are formulated *declaratively* (e.g., SQL or algebra trees), actually built over a small set of basic operations (cf. the definition of the relational algebra).

**Semantical optimization:** consider integrity constraints in the database.

Example: *population* > 0, thus, a query that asks for negative values can be answered without explicit computation.

- not always obvious
- general case: first-order theorem proving.
- special cases: [see lecture on Database Theory]

**Logical/algebraic optimization:** search for an equivalent algebra expression that performs better:

- size of intermediate results,
- implementation of operators as algorithms,
- presence of indexes and order.

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### ALGEBRAIC OPTIMIZATION

The operator tree of an algebra expression provides a base for several optimization strategies:

- reusing intermediate results
- equivalent restructuring of the operator tree
- “shortcuts” by melting several operators into one (e.g., join + equality predicate → equijoin)
- combination with actual situation: indexes, properties of data

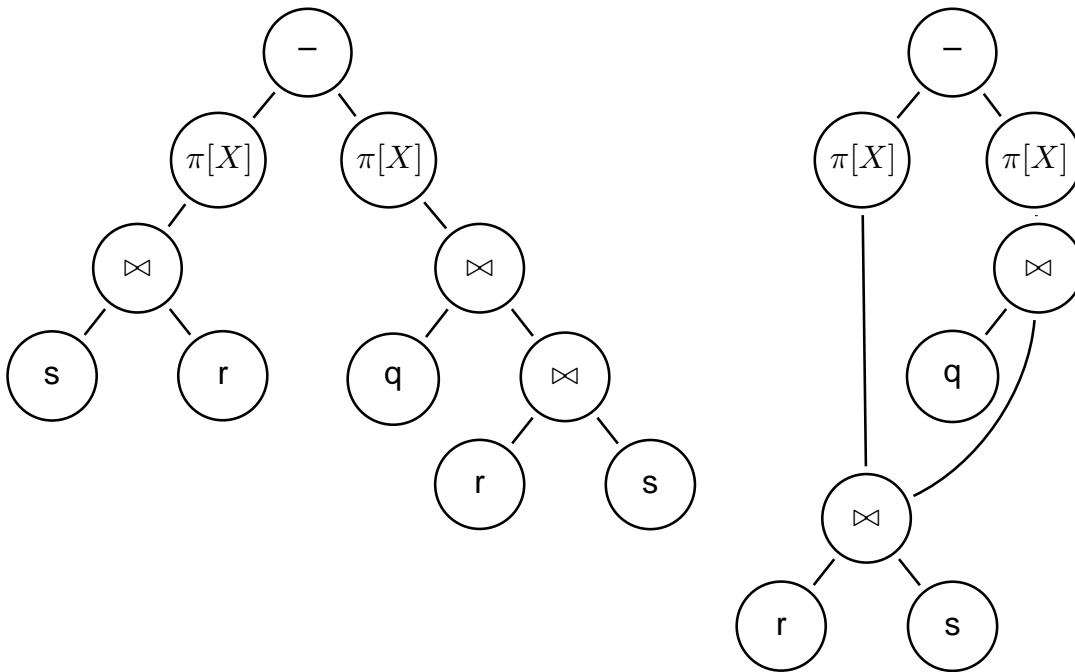
Real-life databases implement this functionality.

- SQL: **declarative** specification of a query
- internal: algebra tree + optimizations

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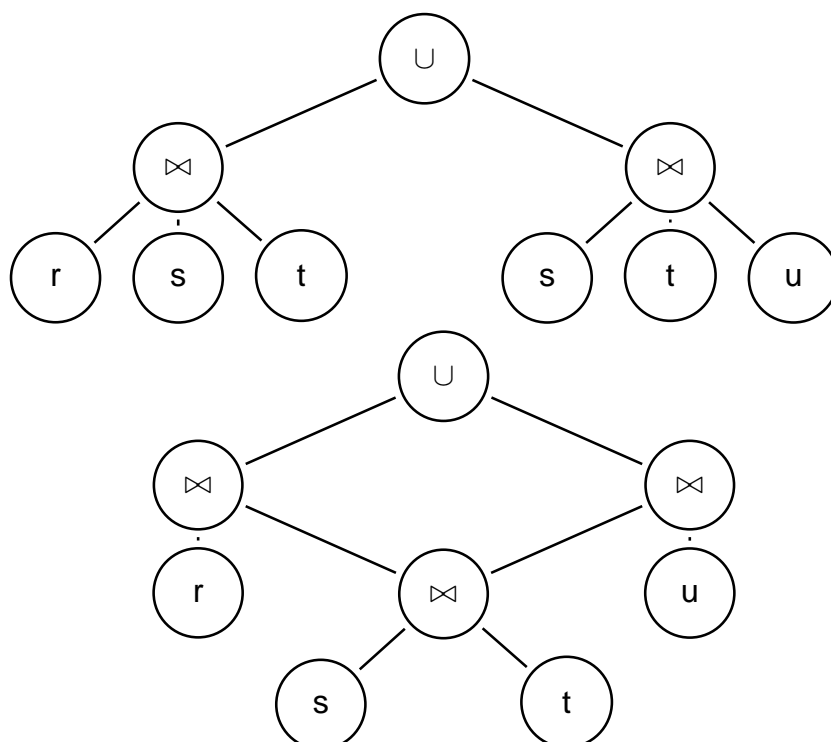
## REUSING INTERMEDIATE RESULTS

- Multiply occurring subtrees can be reused  
(directed acyclic graph (DAG) instead of algebra tree)



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## Reusing intermediate results



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## OPTIMIZATION BY TREE RESTRUCTURING

- Equivalent transformation of the operator tree that represents an expression
- Based on the equivalences shown on Slide 106.
- minimize the size of intermediate results  
(reject tuples/columns as early as possible during the computation)
- selections reduce the number of tuples
- projections reduce the size of tuples
- apply both as early as possible (i.e., before joins)
- different application order of joins
- semijoins instead of joins (in combination with implementation issues; see next section)

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### Push Selections Down

Assume  $r, s \in \text{Rel}(\bar{X})$ ,  $\bar{Y} \subseteq \bar{X}$ .

$$\sigma[\text{cond}](\pi[\bar{Y}](r)) \equiv \pi[\bar{Y}](\sigma[\text{cond}](r))$$

(condition: *cond* does not use attributes from  $\bar{X} - \bar{Y}$ ,  
otherwise left term is undefined)

$$\sigma_{\text{pop} > 1E6}(\pi[\text{name, pop}](\text{country})) \equiv \pi[\text{name, pop}](\sigma_{\text{pop} > 1E6}(\text{country}))$$

$$\sigma[\text{cond}](r \cup s) \equiv \sigma[\text{cond}](r) \cup \sigma[\text{cond}](s)$$

$$\begin{aligned} \sigma_{\text{pop} > 1E6}(\pi[\text{name, pop}](\text{country}) \cup \pi[\text{name, pop}](\text{city})) \\ \equiv \sigma_{\text{pop} > 1E6}(\pi[\text{name, pop}](\text{country})) \cup \sigma_{\text{pop} > 1E6}(\pi[\text{name, pop}](\text{city})) \end{aligned}$$

$$\sigma[\text{cond}](\rho[N](r)) \equiv \rho[N](\sigma[\text{cond}'](r))$$

(where *cond'* is obtained from *cond* by renaming according to *N*)

$$\sigma[\text{cond}](r \cap s) \equiv \sigma[\text{cond}](r) \cap \sigma[\text{cond}](s)$$

$$\sigma[\text{cond}](r - s) \equiv \sigma[\text{cond}](r) - \sigma[\text{cond}](s)$$

$\pi$  : see comment above. Optimization uses only left-to-right.

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## Push Selections Down (Cont'd)

Assume  $r \in \text{Rel}(\bar{X})$ ,  $s \in \text{Rel}(\bar{Y})$ . Consider  $\sigma[\text{cond}](r \bowtie s)$ .

Let  $\text{cond} = \text{cond}_{\bar{X}} \wedge \text{cond}_{\bar{Y}} \wedge \text{cond}_{\overline{\bar{X}\bar{Y}}}$  such that

- $\text{cond}_{\bar{X}}$  is concerned only with attributes in  $\bar{X}$
- $\text{cond}_{\bar{Y}}$  is concerned only with attributes in  $\bar{Y}$
- $\text{cond}_{\overline{\bar{X}\bar{Y}}}$  is concerned both with attributes in  $\bar{X}$  and in  $\bar{Y}$ .

Then,

$$\sigma[\text{cond}](r \bowtie s) \equiv \sigma[\text{cond}_{\overline{\bar{X}\bar{Y}}}] (\sigma[\text{cond}_{\bar{X}}](r) \bowtie \sigma[\text{cond}_{\bar{Y}}](s))$$

### Example 3.17

*Names of all countries that have been founded earlier than 1970, their capital has more than 1.000.000 inhabitants, and more than half of the inhabitants live in the capital.* □

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### Example 3.17 (Continued)

(Solution)

$$\begin{aligned} & \pi[\text{Name}] (\sigma[\text{establ} < \text{"01 01 1970"} \wedge \text{city.pop} > 1.000.000 \wedge \text{country.pop} < 2 \cdot \text{city.pop}] \\ & \quad (\text{country} \times_{\text{country}.\text{(capital,prov,code)}=\text{city}(\text{name,prov,country})} \text{city})) \\ & \equiv \pi[\text{Name}] (\sigma[\text{country.pop} < 2 \cdot \text{city.pop}] \\ & \quad (\sigma[\text{establ} < \text{"01 01 1970"}](\text{country}) \\ & \quad \quad \times_{\text{country}.\text{(capital,prov,code)}=\text{city}(\text{name,prov,country})} \\ & \quad \quad \sigma[\text{city.pop} > 1.000.000](\text{city}))) \end{aligned}$$

- Nevertheless, if  $\text{cond}$  is e.g. a complex mathematical calculation, it can be cheaper first to reduce the number of tuples by  $\cap$ ,  $-$ , or  $\bowtie$

$\Rightarrow$  data-dependent strategies (see later)

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## Push Projections Down

Assume  $r, s \in \text{Rel}(\bar{X}), \bar{Y} \subseteq \bar{X}$ .

Let  $cond = cond_{\bar{X}} \wedge cond_{\bar{Y}}$  such that

- $cond_{\bar{Y}}$  is concerned only with attributes in  $\bar{Y}$
- $cond_{\bar{X}}$  is the remaining part of  $cond$  that is also concerned with attributes  $\bar{X} \setminus \bar{Y}$ .

$$\pi[\bar{Y}](\sigma[cond](r)) \equiv \sigma[cond_{\bar{Y}}](\pi[\bar{Y}](\sigma[cond_{\bar{X}}](r)))$$

$$\pi[\bar{Y}](\rho[N](r)) \equiv \rho[N](\pi[\bar{Y}'](r))$$

(where  $\bar{Y}'$  is obtained from  $\bar{Y}$  by renaming according to  $N$ )

$$\pi[\bar{Y}](r \cup s) \equiv \pi[\bar{Y}](r) \cup \pi[\bar{Y}](s)$$

- Note that this does *not* hold for “ $\cap$ ” and “ $-$ ”!
- advantages of pushing “ $\sigma$ ” vs. “ $\pi$ ” are data-dependent  
Default: push  $\sigma$  lower.

Assume  $r \in \text{Rel}(\bar{X}), s \in \text{Rel}(\bar{Y})$ .

$$\pi[\bar{Z}](r \bowtie s) \equiv \pi[Z](\pi[\bar{X} \cap \bar{Z}\bar{Y}](r) \bowtie \pi[\bar{Y} \cap \bar{Z}\bar{X}](s))$$

- complex interactions between reusing subexpressions and pushing selection/projection

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## Application Order of Joins

Minimize intermediate results (and number of comparisons):

```
SELECT organization.name, country.name
FROM organization, country, isMember
WHERE organization.abbreviation = isMember.organization
      AND country.code = isMember.country
```

Exploit selectivity of join:

- $\underbrace{(\text{org} \times \text{country})}_{200 \cdot 200 = 40000} \bowtie \text{isMember}$   
7000
- $\underbrace{(\text{org} \bowtie \text{isMember})}_{200, 7000 \rightsquigarrow 7000} \bowtie \text{country}$   
7000

If indexes on `country.code` and `organization.abbreviation` are available:

- loop over `isMember`
- extend each tuple with matching country and organization by using the indexes.

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## Example/Exercise

Consider the equivalent (to the previous example) query:

```
SELECT organization.name, country.name
FROM organization, country
WHERE EXISTS
  (SELECT *
   FROM isMember
   WHERE organization.abbreviation = isMember.organization
        AND country.code = isMember.country)
```

- suggests the non-optimal evaluation!
- transform the above query into algebra
- ... yields the same “broad” join as before ...
- ... and leads to the optimized join ordering.

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## OPERATOR EVALUATION BY PIPELINING

- above, each algebra operator has been considered separately
- if a query consists of several operators, the materialization of intermediate results should be avoided
- **Pipelining** denotes the immediate propagation of tuples to subsequent operators

### Example 3.18

- $\sigma[A = 5 \wedge B > 6]R$ :

Assume an index that supports the condition  $A = 5$ .

- without pipelining: compute  $\sigma[A = 5]R$  using the index, obtain  $R'$ . Then, compute  $\sigma[B > 6]R'$ .
- with pipelining: compute  $\sigma[A = 5]R$  using the index, and check **on-the fly** each qualifying tuple against  $\sigma[B > 6]$ . □

- **Unary** (i.e., selection and projection) operations can always be pipelined with the next lower binary operation (e.g., join)

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### Example 3.18 (Continued)

- $\sigma[\text{cond}](R \bowtie S)$ :
  - *without pipelining: compute  $R \bowtie S$ , obtain  $RS$ , then compute  $\sigma[\text{cond}](RS)$ .*
  - *with pipelining: during computing  $(R \bowtie S)$ , each tuple is immediately checked whether it satisfies  $\text{cond}$ .*
  
- $(R \bowtie S) \bowtie T$ :
  - *without pipelining: compute  $R \bowtie S$ , obtain  $RS$ , then compute  $RS \bowtie T$ .*
  - *with pipelining: during computing  $(R \bowtie S)$ , each tuple is immediately propagated to one of the described join algorithms for computing  $RS \bowtie T$ .* □

Most database systems combine materialization of intermediate results, iterator-based implementation of algebra operators, and pipelining.