

# Database Tuning

## Query Tuning

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Adapted from "Database Tuning" by Dennis Shasha and Philippe Bonnet.

## Outline

- 1 Query Tuning
  - Query Processing
  - Problematic Queries
  - Minimizing DISTINCTs
  - Rewriting of Nested Queries

## About Query Tuning

- Query tuning: rewrite a query to run faster!
- Other tuning approaches may have harmful side effects:
  - adding index
  - changing the schema
  - modify transaction length
- Query tuning: **only beneficial** side effects
  - first thing to do if query is slow!

## Outline

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## Steps in Query Processing

1. Parser
  - input: SQL query
  - output: relational algebra expression
2. Optimizer
  - input: relational algebra expression
  - output: query plan
3. Execution engine
  - input: query plan
  - output: query result

## 1. Parser

Parser:

- **Input:** SQL query from user  
Example: `SELECT balance  
FROM account  
WHERE balance < 2500`
- **Output:** relational algebra expression  
Example:  $\sigma_{balance < 2500}(\Pi_{balance}(account))$
- Algebra expression for a given query **not unique!**  
Example: The following relational algebra expressions are equivalent.
  - $\sigma_{balance < 2500}(\Pi_{balance}(account))$
  - $\Pi_{balance}(\sigma_{balance < 2500}(account))$

## 2. Optimizer

Optimizer:

- **Input:** relational algebra expression  
Example:  $\Pi_{balance}(\sigma_{balance < 2500}(account))$
- **Output:** query plan  
Example:
 

```

      \Pi_{balance}
      |
      \sigma_{balance < 2500}
      use index 1
      |
      account
      
```
- query plan is selected in three steps:
  - A) equivalence transformation
  - B) annotation of the relational algebra expression
  - C) cost estimation for different query plans

## A) Equivalence Transformation

- **Equivalence** of relational algebra expressions:
  - **equivalent** if they generate the same set of tuples on every legal database instance
  - **legal:** database satisfies all integrity constraints specified in the database schema
- **Equivalence rules:**
  - **transform** one relational algebra expression **into equivalent one**
  - similar to numeric algebra:  $a + b = b + a$ ,  $a(b + c) = ab + ac$ , etc.
- **Why** producing equivalent expressions?
  - equivalent algebraic expressions give the **same result**
  - but usually the **execution time varies significantly**

## Equivalence Rules – Examples

- Selection operations are commutative:  $\sigma_{\theta_1}(\sigma_{\theta_2}(E)) = \sigma_{\theta_2}(\sigma_{\theta_1}(E))$ 
  - $E$  is a relation (table)
  - $\theta_1$  and  $\theta_2$  are conditions on attributes, e.g.  $E.salary < 2500$
  - $\sigma_{\theta}$  selects all tuples that satisfy  $\theta$
- Selection distributes over the theta-join operation if  $\theta_1$  involves only attributes of  $E_1$  and  $\theta_2$  only attributes of  $E_2$ :

$$\sigma_{\theta_1 \wedge \theta_2}(E_1 \bowtie_{\theta} E_2) = (\sigma_{\theta_1}(E_1)) \bowtie_{\theta} (\sigma_{\theta_2}(E_2))$$

- $\bowtie_{\theta}$  is the theta-join; it pairs tuples from the input relations (e.g.,  $E_1$  and  $E_2$ ) that satisfy condition  $\theta$ , e.g.  $E_1.accountID = E_2.ID$
- Natural join is associative:  $(E_1 \bowtie E_2) \bowtie E_3 = E_1 \bowtie (E_2 \bowtie E_3)$ 
  - the join condition in the natural join is equality on all attributes of the two input relations that have the same name
- Many other rules can be found in Silberschatz et al., "Database System Concepts"

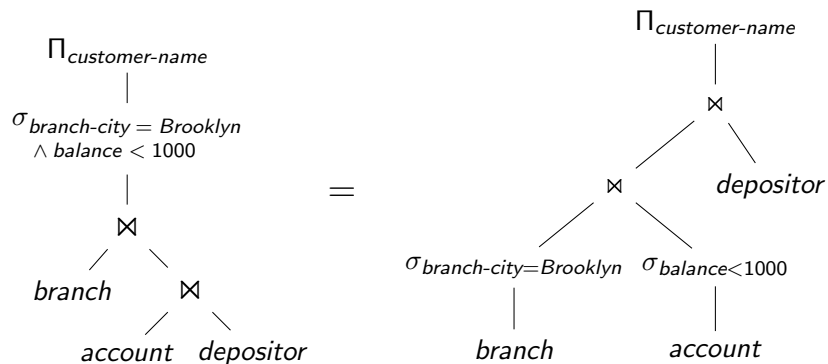
## Equivalence Rules – Example Query

- Schema:
  - branch(branch-name, branch-city, assets)
  - account(account-number, branch-name, balance)
  - depositor(customer-name, account-number)
- Query:
 

```
SELECT customer-name
FROM branch, account, depositor
WHERE branch-city=Brooklyn AND
      balance < 1000 AND
      branch.branch-name = account.branch-name AND
      account.account-number = depositor.account-number
```

## Equivalence Rules – Example Query

- Equivalent relational algebra expressions:

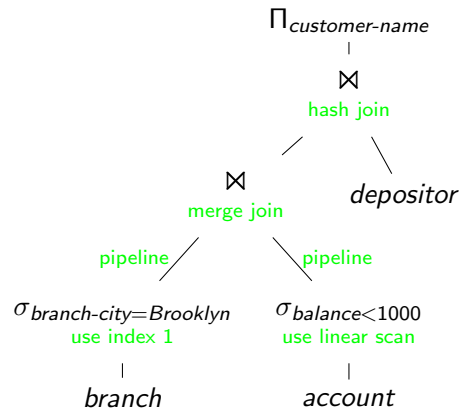


## B) Annotation: Creating Query Plans

- Algebra expression is not a query plan.
- Additional decisions required:
  - which indexes to use, for example, for joins and selects?
  - which algorithms to use, for example, sort-merge vs. hash join?
  - materialize intermediate results or pipeline them?
  - etc.
- Each relational algebra expression can result in many query plans.
- Some query plans may be better than others!

## Query Plan – Example

- query plan of our example query:  
(account physically sorted by branch-name; index 1 on branch-city sorts records with same value of branch-city by branch-name)



## C) Cost Estimation

- Which query plan is the fastest one?
- This is a very hard problem:
  - cost for each query plan can only be estimated
  - huge number of query plans may exist

## Statistics for Cost Estimation

- Catalog information: database maintains statistics about relations
- Example statistics:
  - number of tuples per relation
  - number of blocks on disk per relation
  - number of distinct values per attribute
  - histogram of values per attribute
- Statistics used to estimate cost of operations, for example
  - selection size estimation
  - join size estimation
  - projection size estimation
- Problems:
  - cost can only be estimated
  - updating statistics is expensive, thus they are often out of date

## Choosing the Cheapest Query Plan

- Problem: Estimating cost for all possible plans too expensive.
- Solutions:
  - pruning: stop early to evaluate a plan
  - heuristics: do not evaluate all plans
- Real databases use a combination:
  - Apply heuristics to choose promising query plans.
  - Choose cheapest plan among the promising plans using pruning.
- Examples of heuristics:
  - perform selections as early as possible
  - perform projections early
  - avoid Cartesian products

### 3. Execution Engine

The execution engine

- receives query plan from optimizer
- executes plan and returns query result to user

### Query Tuning and Query Optimization

- Optimizers are not perfect:
  - transformations produce only a subset of all possible query plans
  - only a subset of possible annotations might be considered
  - cost of query plans can only be estimated
- Query Tuning: Make life easier for your query optimizer!

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  - Rewriting of Nested Queries

### Which Queries Should Be Rewritten?

- Rewrite queries that run “too slow”
- How to find these queries?
  - query issues far too many disk accesses, for example, point query scans an entire table
  - you look at the query plan and see that relevant indexes are not used

## Running Example

- Employee(ssnum,name,manager,dept,salary,numfriends)
  - clustering index on ssnum
  - non-clustering index on name
  - non-clustering index on dept
  - keys: ssnum, name
- Students(ssnum,name,course,grade)
  - clustering index on ssnum
  - non-clustering index on name
  - keys: ssnum, name
- Techdept(dept,manager,location)
  - clustering index on dept
  - key: dept
  - manager may manage many departments
  - a location may contain many departments

## DISTINCT

- How can DISTINCT hurt?
  - DISTINCT **forces sort** or other overhead.
  - If not necessary, it should be avoided.
- **Query:** Find employees who work in the information systems department.
 

```
SELECT DISTINCT ssnum
FROM Employee
WHERE dept = 'information systems'
```
- DISTINCT not necessary:
  - ssnum is a key of Employee, so it is also a key of a subset of Employee.
  - Note: Since an index is defined on ssnum, there is likely to be no overhead in this particular examples.

## Non-Correlated Subqueries

- Many systems **handle subqueries inefficiently**.
- **Non-correlated:** attributes of outer query not used in inner query.
- **Query:**

```
SELECT ssnum
FROM Employee
WHERE dept IN (SELECT dept FROM Techdept)
```
- May lead to inefficient evaluation:
  - check for each employee whether they are in Techdept
  - index on Employee.dept not used!
- **Equivalent query:**

```
SELECT ssnum
FROM Employee, Techdept
WHERE Employee.dept = Techdept.dept
```
- Efficient evaluation:
  - look up employees for each dept in Techdept
  - use index on Employee.dept

## Temporary Tables

- **Temporary tables can hurt** in the following ways:
  - force operations to be performed in suboptimal order (optimizer often does a very good job!)
  - creating temporary tables i.s.s.<sup>1</sup> causes catalog update – possible concurrency control bottleneck
  - system may miss opportunity to use index
- **Temporary tables are good:**
  - to rewrite complicated correlated subqueries
  - to avoid ORDER BYs and scans in specific cases (see example)

<sup>1</sup>in some systems

## Unnecessary Temporary Table

- **Query:** Find all IT department employees who earn more than 40000.

```
SELECT * INTO Temp
FROM Employee
WHERE salary > 40000

SELECT ssnnum
FROM Temp
WHERE Temp.dept = 'IT'
```

- **Inefficient SQL:**
  - index on dept can not be used
  - overhead to create Temp table (materialization vs. pipelining)

- **Efficient SQL:**

```
SELECT ssnnum
FROM Employee
WHERE Employee.dept = 'IT'
AND salary > 40000
```

## Joins: Use Clustering Indexes and Numeric Values

- **Query:** Find all students who are also employees.

- **Inefficient SQL:**

```
SELECT Employee.ssnnum
FROM Employee, Student
WHERE Employee.name = Student.name
```

- **Efficient SQL:**

```
SELECT Employee.ssnnum
FROM Employee, Student
WHERE Employee.ssnnum = Student.ssnnum
```

- **Benefits:**

- Join on two clustering indexes allows merge join (fast!).
- Numerical equality is faster evaluated than string equality.

## Don't use HAVING where WHERE is enough

- **Query:** Find average salary of the IT department.

- **Inefficient SQL:**

```
SELECT AVG(salary) as avgsalary, dept
FROM Employee
GROUP BY dept
HAVING dept = 'IT'
```

- **Problem:** May first compute average for employees of all departments.
- **Efficient SQL:** Compute average only for relevant employees.

```
SELECT AVG(salary) as avgsalary, dept
FROM Employee
WHERE dept = 'IT'
GROUP BY dept
```

## Use Views with Care (I/II)

- **Views:** macros for queries
  - queries look simpler
  - but are never faster and sometimes slower

- **Creating a view:**

```
CREATE VIEW Techlocation
AS SELECT ssnnum, Techdept.dept, location
FROM Employee, Techdept
WHERE Employee.dept = Techdept.dept
```

- **Using the view:**

```
SELECT location
FROM Techlocation
WHERE ssnnum = 452354786
```

- **System expands view and executes:**

```
SELECT location
FROM Employee, Techdept
WHERE Employee.dept = Techdept.dept
AND ssnnum = 452354786
```

## Use Views with Care (II/II)

- **Query:** Get the department name for the employee with social security number 452354786 (who works in a technical department).

- Example of an **inefficient SQL**:

```
SELECT dept
FROM Techlocation
WHERE ssnum = 452354786
```

- This SQL **expands to**:

```
SELECT Techdept.dept
FROM Employee, Techdept
WHERE Employee.dept = Techdept.dept
AND ssnum = 452354786
```

- But there is a **more efficient SQL** (no join!) doing the same thing:

```
SELECT dept
FROM Employee
WHERE ssnum = 452354786
```

## System Peculiarity: Indexes and OR

- **Some systems** never use indexes when conditions are OR-connected.
- **Query:** Find employees with name Smith or who are in the acquisitions department.

```
SELECT Employee.ssnum
FROM Employee
WHERE Employee.name = 'Smith'
OR Employee.dept = 'acquisitions'
```

- **Fix:** use UNION instead of OR

```
SELECT Employee.ssnum
FROM Employee
WHERE Employee.name = 'Smith'

UNION

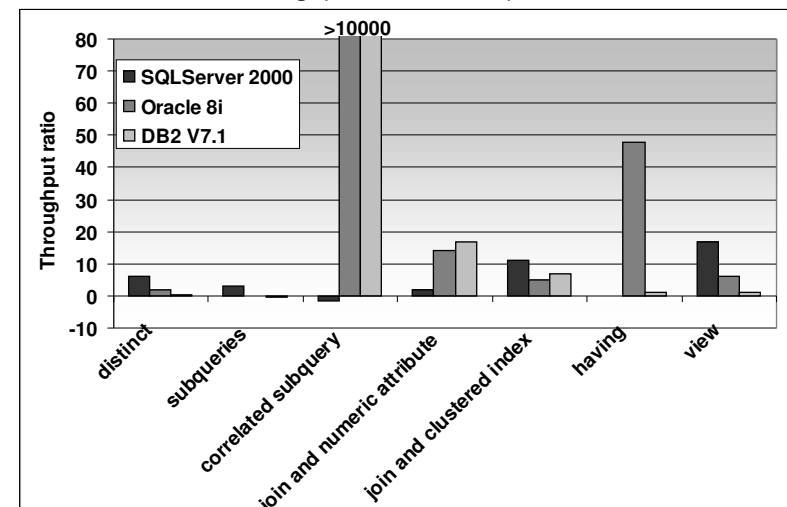
SELECT Employee.ssnum
FROM Employee
WHERE Employee.dept = 'acquisitions'
```

## System Peculiarity: Order in FROM clause

- Order in FROM clause **should be irrelevant**.
- **However:** For long joins (e.g., more than 8 tables) and in some systems the order matters.
- **How to figure out?** Check query plan!

## Experimental Evaluation

Throughput increase in percent.



Running Example: 100k employees, 100k students, 10 technical departments



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## Privileged Tables

- Privileged table: Attributes returned by SELECT clause contain a key.
- Example: Get the social security numbers of all employees that work in a technical department.
 

```
SELECT ssnnum
FROM Employee, Techdept
WHERE Employee.dept = Techdept.dept
```
- Employee is a privileged table:
  - the SELECT clause projects the attribute ssnnum
  - ssnnum is a key of Employee

## About Query Tuning

- DISTINCT removes duplicate tuples from the query result.
- Goal: avoid DISTINCT if possible!
- How to know if DISTINCT is necessary?
- We use the notions of
  - privileged tables and
  - reachability
 to decide whether there can be duplicates in the query result.

## Reachability

- $R$  and  $S$  are tables
- $R$  reaches  $S$  if
  - $R$  and  $S$  are joined on equality and
  - the join attribute in  $R$  is a key of  $R$
- Intuition: A tuple from  $S$  is joined to at most one tuple from  $R$ .
- Reachability is transitive: if  $A$  reaches  $B$  and  $B$  reaches  $C$  then  $A$  reaches  $C$ .

## Reachability – Example

- **Previous Example:** Get the social security numbers of all employees that work in a technical department.

```
SELECT ssnnum
FROM Employee, Techdept
WHERE Employee.dept = Techdept.dept
```

- Techdept **reaches** Employee:
  - Techdept and Employee are joined on equality
  - dept is a key of Techdept

## No-Duplicate Guarantee

- A **query returns no duplicates** if the following conditions hold:
  - Every attribute in the SELECT clause is from a privileged table.
  - Every unprivileged table reaches at least one privileged one.

## No-Duplicate Guarantee – Examples

- This query may return duplicates:

```
SELECT ssnnum
FROM Employee, Techdept
WHERE Employee.manager = Techdept.manager
```

- Reason:
  - manager is not a key of Techdept
  - thus Techdept does not reach privileged table Employee

## No-Duplicate Guarantee – Examples

- This query returns **no** duplicates:

```
SELECT ssnnum, Techdept.dept
FROM Employee, Techdept
WHERE Employee.manager = Techdept.manager
```

- Reason: different from previous example,
  - both Techdept and Employee are privileged table

## No-Duplicate Guarantee – Examples

- This query also returns **no** duplicates:  

```
SELECT ssnum, Techdept.dept
FROM Employee, Techdept
```
- Reason: as before,
  - both Techdept and Employee are privileged table

## No-Duplicate Guarantee – Examples

- This query returns **no** duplicates:  
 (even if Student.name is not a key)  

```
SELECT Student.ssnum
FROM Student, Employee, Techdept
WHERE Student.name = Employee.name
AND Employee.dept = Techdept.dept
```
- Reason:
  - join attribute Employee.name is a key, thus Employee reaches privileged table Student
  - join attribute Techdept.dept is a key thus Techdept reaches Employee
  - **transitivity**: Techdept reaches Employee and Employee reaches Student, thus Techdept reaches Student

## No-Duplicate Guarantee – Examples

- This query returns duplicates:  
 (even if Student.name is a key)  

```
SELECT Student.ssnum
FROM Student, Employee, Techdept
WHERE Student.name = Employee.name
AND Employee.manager = Techdept.manager
```
- Reason:
  - join attribute Techdept.manager is not key
  - thus Techdept does not reach Employee (and Student)

## No-Duplicate Guarantee – Examples

- Try the example queries on the following instance (keys underlined):
  - Employee(ssnum, name, manager, dept)
 

| ssnum | name  | manager | dept        |
|-------|-------|---------|-------------|
| 1     | Peter | John    | IT          |
| 2     | Rose  | Mary    | Development |
  - Techdept(dept, manager)
 

| dept        | manager |
|-------------|---------|
| IT          | John    |
| Development | Mary    |
| Production  | John    |
  - Students(ssnum, name)
 

| ssnum | name  |
|-------|-------|
| 5     | Peter |
| 6     | Peter |

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## Types of Nested Queries

- **Uncorrelated** subqueries
  - **with aggregates** in the inner query
 

```
SELECT ssnun
FROM Employee
WHERE salary > (SELECT AVG(salary) FROM Employee)
```
  - **without aggregates** in the inner query
 

```
SELECT ssnun
FROM Employee
WHERE dept IN (SELECT dept FROM Techdept)
```

## Types of Nested Queries

- **Correlated** subqueries
  - **with aggregates** in the inner query
 

```
SELECT ssnun
FROM Employee e1, Techdept
WHERE salary = (SELECT AVG(e2.salary)
                FROM Employee e2, Techdept
                WHERE e2.dept = e1.dept
                AND e2.dept = Techdept.dept)
```
  - **without aggregates** in the inner query (uncommon)

## Uncorrelated Subquery with Aggregates

- **Uncorrelated** subqueries **with aggregate** in the inner query:
 

```
SELECT ssnun
FROM Employee
WHERE salary > (SELECT AVG(salary) FROM Employee)
```
- **Not problematic:**
  - Result of inner query is a single value (constant).
  - Most systems will first execute the inner query and then substitute it with the resulting constant.

## Uncorrelated Subquery without Aggregates

- **Uncorrelated** subqueries **without aggregate** in the inner query:

```
SELECT ssnun
FROM Employee
WHERE dept IN (SELECT dept FROM Techdept)
```

- Some systems **might not use index** on `Employee.dept`.

- **Unnested** query:

```
SELECT ssnun
FROM Employee, Techdept
WHERE Employee.dept = Techdept.dept
```

## Uncorrelated Subquery without Aggregates

- **Unnesting strategy:**

1. Combine the arguments of the two FROM clauses.
2. AND together the WHERE clauses.
3. Replace “outer.attr1 IN (SELECT inner.attr2 ...)” with “**outer.attr1 = inner.attr2**” in the WHERE clause.
4. Retain the SELECT clause from the outer block.

- Strategy works for nesting of **any depth**.

- **Note:** If inner table **does not reach** outer table in **new join condition**, new duplicates may appear.

## Duplicates in Unnested Queries – Examples

- **Nested** query:

```
SELECT AVG(salary)
FROM Employee
WHERE dept IN (SELECT dept FROM Techdept)
```

- **Unnested** query:

```
SELECT AVG(salary)
FROM Employee, Techdept
WHERE Employee.dept = Techdept.dept
```

- Unnesting is **correct**:

- Techdept reaches Employee, thus **no duplicates** are introduced
- each salary appears once in average

## Duplicates in Unnested Queries – Examples

- **Nested** query:

```
SELECT AVG(salary)
FROM Employee
WHERE manager IN (SELECT manager FROM Techdept)
```

- **Unnested** query:

```
SELECT AVG(salary)
FROM Employee, Techdept
WHERE Employee.manager = Techdept.manager
```

- Unnesting is **not correct**:

- Techdept does not reach Employee, thus **duplicates possible**
- some salaries might appear multiple times in the average

- **Note:** Duplicates do not matter for aggregates like MIN and MAX.

## Duplicates in Unnested Queries – Examples

- Solutions for following query?

```
SELECT AVG(salary)
FROM Employee
WHERE manager IN (SELECT manager FROM Techdept)
```

### A) Derived table:

```
SELECT AVG(salary)
FROM Employee, (SELECT DISTINCT manager FROM Techdept) AS T
WHERE Employee.manager = T.manager
```

### B) Temporary table:

```
SELECT DISTINCT manager INTO Temp
FROM Techdept
```

```
SELECT AVG(salary)
FROM Employee, Temp
WHERE Employee.manager = Temp.manager
```

## Correlated Subqueries with Aggregates

- Correlated subquery with aggregates in the inner query:

```
SELECT snum
FROM Employee e1, Techdept
WHERE salary = (SELECT AVG(e2.salary)
                FROM Employee e2, Techdept
                WHERE e2.dept = e1.dept
                AND e2.dept = Techdept.dept)
```

- Inefficient in many systems.

## Strategy for Rewriting Query

```
SELECT snum
FROM Employee e1, Techdept
WHERE salary = (SELECT AVG(e2.salary)
                FROM Employee e2, Techdept
                WHERE e2.dept = e1.dept
                AND e2.dept = Techdept.dept)
```

1. Create temporary table:
  - GROUP BY on correlated attribute of inner query (must be equality!).
  - Use uncorrelated qualifications of inner query for WHERE clause.

```
SELECT AVG(salary) as avsalary, Employee.dept INTO Temp
FROM Employee e2, Techdept
WHERE e2.dept = Techdept.dept
GROUP BY e2.dept
```

## Strategy for Rewriting Query

```
SELECT snum
FROM Employee e1, Techdept
WHERE salary = (SELECT AVG(e2.salary) ... WHERE e2.dept = e1.dept ...)
SELECT AVG(salary) as avsalary, Employee.dept INTO Temp
FROM Employee, Techdept
WHERE Employee.dept = Techdept.dept
GROUP BY Employee.dept
```

2. Join temporary table with outer query:
  - Condition on the grouped attribute replaces correlation condition.
  - Depending attribute of grouping replaces subquery.
  - All other qualifications of outer query remain (none in example).

```
SELECT snum
FROM Employee e1, Temp
WHERE salary = avsalary
AND e1.dept = Temp.dept;
```

## The Count Bug

- **Correlated** subquery with **COUNT** aggregate in the inner query:

```
SELECT ssnnum
FROM Employee e1, Techdept
WHERE numfriends = COUNT(SELECT e2.ssnnum
                        FROM Employee e2, Techdept
                        WHERE e2.dept = e1.dept
                        AND e2.dept = Techdept.dept)
```

- **Rewrite** with temporary table:

```
SELECT COUNT(ssnum) as numcolleagues, Employee.dept INTO Temp
FROM Employee, Techdept
WHERE Employee.dept = Techdept.dept
GROUP BY Employee.dept

SELECT ssnnum
FROM Employee, Temp
WHERE numfriends = numcolleagues
AND Employee.dept = Temp.dept;
```

- What is going wrong?

## The Count Bug

- Consider for example an employee Jane:
  - Jane is not in a technical department (Techdept).
  - Jane has no friends (Employee.numfriends = 0)
- **Original** (nested) query:
  - since Jane is not in a technical department, inner query is empty
  - but COUNT( $\emptyset$ )=0, thus **Jane is in the result set!**
- **Rewritten** query with temporary table:
  - Jane not in a technical department and does not survive the join
  - thus **Jane is not in the result set**