# Data Wrangling and Data Analysis 

## Data Extraction

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## Outlines

- So Far
- Data types
- Structured, semi-structured and unstructured
- Data Models
- Relational model and entity-relationship model
- Graphs and trees
- Objects
- Data model components
- Data, structure, semantics, and operations
- Databases vs file systems
- DDL and DML
- Creating and modifying tables (relations) in SQL

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## Outlines

- Today
- Operations on databases
- Relational algebra
- SQL

Database System Concepts

## Reading Material for Today

Database System Concepts ( $7^{\text {th }}$ Edition) CH 2.6, 3.3-3.8.


## Relational Algebra

## Relational Algebra Operators

- Union $\cup$, intersection $\cap$, difference -
- Selection $\sigma$
- Projection $\pi$
- Join $\bowtie$
- Rename $\rho$
- Duplicate elimination $\delta$
- Grouping and aggregation $\gamma$
- Sorting $\tau$



## Union



| $r \cup S$ |  |
| :---: | :---: |
| $\mathbf{A}$ | $\mathbf{B}$ |
| $\alpha$ | 1 |
| $\beta$ | 2 |
| $\gamma$ | 3 |
| $\alpha$ | 3 |

## Intersection

$r \cap s$

| $r$ |  |
| :---: | :---: |
| A | B |
| $\alpha$ | 3 |
| $\beta$ | 2 |


| $S$ |  |
| :---: | :---: |
| A | B |
| $\alpha$ | 1 |
| $\beta$ | 2 |
| $\gamma$ | 3 |



## Difference



Can you find an expression that is equivalent to $r-s$ using the operators $\cap$ and $\sim$ ?

## Selection

| $r$ |  |  |  |
| :---: | :---: | :---: | :---: |
| A | B | C | D |
| $\alpha$ | $\alpha$ | 1 | 7 |
| $\alpha$ | $\beta$ | 5 | 7 |
| $\beta$ | $\beta$ | 12 | 3 |
| $\beta$ | $\beta$ | 23 | 10 |


| $\sigma_{(A=B)} \wedge(D>5)$ |  |  |  |
| :---: | :---: | :---: | :---: |
| A | B | C | D |
| $\alpha$ | $\alpha$ | 1 | 7 |
| $\beta$ | $\beta$ | 23 | 10 |

## Projection

| $r$ |  |  |  |
| :---: | :---: | :---: | :---: |
| A | B | C | D |
| $\alpha$ | $\alpha$ | 1 | 7 |
| $\alpha$ | $\beta$ | 5 | 7 |
| $\beta$ | $\beta$ | 12 | 3 |
| $\beta$ | $\beta$ | 23 | 10 |


| $\pi_{A, C}(r)$ |  |
| :---: | :---: |
| A | c |
| $\alpha$ | 1 |
| $\alpha$ | 5 |
| $\beta$ | 12 |
| $\beta$ | 23 |

## Join

Cartesian Product

| $r$ |  | $S$ |  |
| :---: | :---: | :---: | :---: |
| A | B | C | D |
| $\alpha$ | 3 | $\alpha$ | 1 |
| $\beta$ | 2 | $\beta$ | 2 |
|  |  | $\gamma$ | 3 |


| $r \times S$ |  |  |  |
| :---: | :---: | :---: | :---: |
| A | B | C | D |
| $\alpha$ | 3 | $\alpha$ | 1 |
| $\alpha$ | 3 | $\beta$ | 2 |
| $\alpha$ | 3 | $\gamma$ | 3 |
| $\beta$ | 2 | $\alpha$ | 1 |
| $\beta$ | 2 | $\beta$ | 2 |
| $\beta$ | 2 | $\gamma$ | 3 |

## Join

## Cartesian Product



| $r \times S$ |  |  |  |
| :---: | :---: | :---: | :---: |
| r.A | B | S.A | C |
| $\alpha$ | 3 | $\alpha$ | 1 |
| $\alpha$ | 3 | $\beta$ | 2 |
| $\alpha$ | 3 | $\gamma$ | 3 |
| $\beta$ | 2 | $\alpha$ | 1 |
| $\beta$ | 2 | $\beta$ | 2 |
| $\beta$ | 2 | $\gamma$ | 3 |

## Rename

Rename operation $\rho_{x}(E)$ returns the output of the expression $E$ under the name $x$

| $r$ |  |
| :---: | :---: |
| $\mathbf{A}$ | $\mathbf{B}$ |
| $\alpha$ | 3 |
| $\beta$ | 2 |


| $r \times \rho_{S}(r)$ |  |  |  |
| :---: | :---: | :---: | :---: |
| r.A | r.B | s.A | s.B |
| $\alpha$ | 3 | $\alpha$ | 3 |
| $\alpha$ | 3 | $\beta$ | 2 |
| $\beta$ | 2 | $\alpha$ | 3 |
| $\beta$ | 2 | $\beta$ | 2 |

## Natural Join

- Let $r$ and $s$ be relations on schemas $R$ and $S$, respectively.
- Natural join of relations $R$ and $S$ is a relation on schema $R \cup S$ obtained as follows:
- Consider each pair of tuples $\mathrm{t}_{r}$ from $r$ and $\mathrm{t}_{s}$ from $s$.
- If $\mathrm{t}_{r}$ and $\mathrm{t}_{s}$ have the same value on each of the attributes in $R \cap S$, add a tuple $t$ to the result, where
- $t$ has the same value as $t_{r}$ on $r$
- $t$ has the same value as $t_{s}$ on $s$


## Natural Join - Example

| $r$ |  |  |  |
| :---: | :---: | :---: | :---: |
|  |  |  |  |
| A | B | C | D |
| $\alpha$ | 1 | $\alpha$ | a |
| $\beta$ | 2 | $\gamma$ | a |
| $\gamma$ | 4 | $\beta$ | b |
| $\alpha$ | 1 | $\gamma$ | a |
| $\delta$ | 2 | $\beta$ | b |


| $S$ |  |  |
| :---: | :---: | :---: |
| B | D | E |
| 1 | a | $\alpha$ |
| 3 | a | $\beta$ |
| 1 | a | $\gamma$ |
| 2 | b | $\delta$ |
| 3 | b | $\epsilon$ |

$r \bowtie s$

| A | B | C | D | E |
| :---: | :---: | :---: | :---: | :---: |
| $\alpha$ | 1 | $\alpha$ | a | $\alpha$ |
| $\alpha$ | 1 | $\alpha$ | a | $\gamma$ |
| $\alpha$ | 1 | $\gamma$ | a | $\alpha$ |
| $\alpha$ | 1 | $\gamma$ | a | $\gamma$ |
| $\delta$ | 2 | $\beta$ | b | $\delta$ |

$$
r \bowtie s \equiv \pi_{A, r . B, C, r . D, E}\left(\sigma_{r . B=s . B \wedge r . D=s . D}(r \times s)\right)
$$

## Composition of Operations

| $r$ |  | $S$ |  | $r \times s$ |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| A | B | A | B | r.A | r.B | s.A | s.B |
| $\alpha$ | 3 | $\alpha$ | 1 | $\alpha$ | 3 | $\alpha$ | 1 |
| $\beta$ | 2 | $\beta$ | 2 | $\alpha$ | 3 | $\beta$ | 2 |
|  |  | $\gamma$ | 3 | $\alpha$ | 3 | $\gamma$ | 3 |
|  |  |  |  | $\beta$ | 2 | $\alpha$ | 1 |
|  |  |  |  | $\beta$ | 2 | $\beta$ | 2 |
|  |  |  |  | $\beta$ | 2 | $\gamma$ | 3 |


| $\sigma_{r . A=S . A}$ |  |  |  |
| :---: | :---: | :---: | :---: |
| $(r \times s)$ |  |  |  |
| r.A | r.B | s.A | s.B |
| $\alpha$ | 3 | $\alpha$ | 1 |
| $\beta$ | 2 | $\beta$ | 2 |

## Summary of Relational Algebra Operators

| Symbol (name) | Description |
| :---: | :--- |
| $\sigma$ (Selection) | Return rows of the input relation that satisfy a predicate. |
| $\pi$ (Projection) | Return specified attributes from all rows of the input relation. <br> Remove duplicate tuples from the output. |
| $\times$(Cartesian <br> Product) | Return pairs of rows from the two input relations. |
| (Union) | Return the union of tuples from the two input relations. |
| - (Difference) | Return the set of records that exist in the relation before the <br> operator(-) but not in the relation after the operator. |
| $\cap$ (Intersection) | Return the common tuples in both input relations. |
| $\bowtie$ (Natural Join) | Return pairs of rows from the two input relations that have the <br> same value on all attributes that have the same name. |
| $\rho$ (Rename) | Returns the outcome of an expression under the specified name |
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## Remarks on RA

- Each Query input is a table (or set of tables)
- Each query output is a table.
- All data in the output table appears in one of the input tables
- Can we compute:
- SUM $\gamma_{\text {SUM(tot_credit) }}($ student)
- AVG $\gamma_{A V G(\text { salary })}$ (instructor)
- MAX $\gamma_{\text {MAX (buget) }}$ (department)
- MIN $\quad \gamma_{\text {MIN(budget) }}$ (department)
- COUNT $\gamma_{\text {count }}$ (tot_credit $\geq 12$ ) $($ student)
- GROUP BY dept_name $\gamma_{A V G(\text { salary })}$ (instructor)


## SELECT-FROM-WHERE Statements

SELECT desired attributes
FROM one or more tables
WHERE condition about tuples of the tables

## Remember Our Main Database?



## Example: The SELECT Clause

- Get the IDs, names and total credits of students who completed at least 24 credits

SELECT ID, name, tot_cred
FROM student
WHERE tot_cred >= 24;

- The answer is a relation with three attributes (ID, name, tot_cred)
- What if we need only the names of the students?
- Note that: the SQL operator names are case insensitive SELECT $\equiv$ Select $\equiv$ select


## The SELECT Clause

- Lists the desired attributes in the result of the query
- Corresponds to the projection operator of the relational algebra
- SQL allows duplicates in relations as well as in query results
- To force the elimination of duplicates, use the keyword DISTINCT after select
- Example: find the department names of all instructors whose salary is strictly greater than 60000 without showing the department name more than once


## SELECT DISTINCT dept_name

FROM instructor
WHERE salary > 60000

## The SELECT Clause (Cont.)

- The keyword ALL specifies that duplicates should not be removed

SELECT ALL dept_name
FROM instructor
WHERE salary > 60000

- An asterisk in the SELECT clause denotes "all attributes"

SELECT * FROM instructor
will return all the records from table "instructor"

## The SELECT Clause (Cont.)

- An attribute could be literal with no FROM clause

SELECT '542'
Results in a relation with one column and one row with value " 542 "
We can also give the column a name using
SELECT '542' AS V1

- An attribute could be a literal with FROM clause

SELECT 'A' FROM instructor
will return a relation with one column and N rows (the number of tuples in the 'instructor' relation) where each row will contain the value " $A$ "

## The SELECT Clause (Cont.)

- SELECT clause can contain arithmetic expressions involving the operations *, + , -, and /.

SELECT ID, name, salary/12.0
FROM instructor
This query would return a relation with the same number of records as the 'instructor' relation and the (ID, name, salary/12.0) where the yearly salary is replaced by the monthly salary
We can rename the "salary/12.0" using the AS clause
SELECT ID, name, salary/12.0 as monthly_salary
FROM instructor

## The WHERE Clause

- Specifies conditions that the result must satisfy
- Corresponds to the selection predicate of the relational algebra
- To find all students enrolled in the 'Math.' department

SELECT ID, name FROM student
WHERE dept_name = 'Math.'

- Conditions can be also combined using logical operators (AND, OR, NOT)
- Find all students in the 'Math.' department who completed a minimum of 24 credits

SELECT ID, name FROM student
WHERE dept_name = 'Math.' AND tot_cred >= 24

- Comparisons =, <>, <, >, <=, >=


## The FROM Clause

- Lists the relations involved in the query
- Corresponds to the Cartesian product operation of the relational algebra
- Find the Cartesian product ' instructor' $X$ ' teaches'

SELECT * FROM instructor, teaches

- Generates every possible instructor - teaches pair, with all attributes from both relations.
- For common attributes (e.g., ID), the attributes in the resulting table are renamed using the relation name (e.g., instructor.ID)
- Similar to the cartesian product in RA
- Cartesian product not very useful directly, but useful when combined with where-clause condition.


## SELECT-FROM-WHERE Examples

SELECT name, course_id
FROM instructor, teaches
WHERE instructor.ID = teaches.ID
Returns the names of all instructors who have taught any courses and the course_id
SELECT name, course_id
FROM instructor, teaches
WHERE instructor.ID = teaches.ID AND instructor.dept_name = 'Art'
Returns the names of all instructors in the Art department who have taught any courses and the course_id

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## The Rename Operation

- SQL allows renaming relations and attributes using the AS clause:


## old-name AS new-name

- Find the names of all instructors who have a higher salary than some instructor in ‘Comp. Sci'.

SELECT DISTINCT T.name
FROM instructor AS T, instructor AS S
WHERE T.salary >= 75000 AND S.dept_name = 'Comp. Sci.'
Returns the names of instructors in the 'Comp. Sci.' department joined with whose salary is greater than or equal 75000

- Keyword AS is optional and may be omitted instructor AS $T \equiv$ instructor $T$


## Renaming Example: Self-Join

- Sometimes, a query needs to use two copies of the same relation.
- Distinguish copies by renaming the relations.
- Example self-Join

SELECT T.name AS N1, S.name AS N2
FROM instructor T, instructor S
WHERE T.salary = S.salary AND T.name < S.name

- Returns the names of instructors who has the same salary
- Do not produce pairs like (Miller, Miller)
- Produces pairs in alphabetic order, e.g. (Adison, Miller), not (Miller, Adison)
- Note that we omit AS when renaming the relations


Let us try:
Running a few SQL queries on different platforms (SQLite3 command line, Google Colab, and w3school)

## What have we learnt?

Let us spend 2 minutes to look at what we have studied so far

## Join Operation

- JOIN operations take two relations and return as a result another relation.
- A join operation is a Cartesian product which requires that tuples in the two relations match (under some condition). It also specifies the attributes that are present in the result of the join
- The join operations are typically used as subquery expressions in the FROM clause


## Join Operation (Cont.)

- We will consider the following relations in the few coming slides
- Relation course

| course_id | title | dept_name | credits |
| :---: | :---: | :---: | :---: |
| BIO-301 | Genetics | Biology | 4 |
| CS-490 | Game Design | Comp. Sci. | 4 |
| CS-315 | Boolean Algebra | Comp. Sci. | 3 |

- Relation prereq

| course_id | prereq_id |
| :---: | :---: |
| BIO-301 | BIO-101 |
| CS-490 | CS-101 |
| CS-347 | CS-201 |

- Note that:
- prereq information is missing for course CS-315
- course information is missing for course CS-347


## Outer Join

- An extension of the join operation that avoids loss of information.
- Computes the join and then adds tuples form one relation that does not match tuples in the other relation to the result of the join.
- Uses null values.


## Left Outer Join

SELECT *
FROM course

## LEFT OUTER JOIN prereq

ON course.course_id = prereq.course_id

| course_id | title | dept_name | credits | prereq_id |
| :--- | :--- | :--- | :---: | :--- |
| BIO-301 | Genetics | Biology | 4 | BIO-101 |
| CS-490 | Game Design | Comp. Sci. | 4 | CS-101 |
| CS-315 | Boolean Algebra | Comp. Sci. | 3 | null |

## Right Outer Join

SELECT *
FROM course
RIGHT OUTER JOIN prereq
ON course.course_id = prereq.course_id

| course_id | prereq_id | title | dept_name | credits |
| :--- | :--- | :--- | :--- | :---: |
| BIO-301 | BIO-101 | Genetics | Biology | 4 |
| CS-490 | CS-101 | Game Design | Comp. Sci. | 4 |
| CS-347 | CS-201 | null | null | null |

- Remember:
- The order of the attributes in a relation has no meaning


## Full Outer Join

SELECT *
FROM course
FULL OUTER JOIN prereq
ON course.course_id = prereq.course_id

| course_id | prereq_id | title | dept_name | credits |
| :--- | :--- | :--- | :--- | :---: | :---: |
| BIO-301 | BIO-101 | Genetics | Biology | 4 |
| CS-490 | CS-101 | Game Design | Comp. Sci. | 4 |
| CS-347 | CS-201 | null | null | null |
| CS-315 | null | Boolean Algebra | Comp. Sci. | 3 |

## Inner Join

SELECT *
FROM course
INNER JOIN prereq
ON course.course_id = prereq.course_id

| course_id | prereq_id | title | dept_name | credits |
| :--- | :--- | :--- | :--- | :---: |
| BIO-301 | BIO-101 | Genetics | Biology | 4 |
| CS-490 | CS-101 | Game Design | Comp. Sci. | 4 |

- An SQL INNER JOIN is same as JOIN clause
- Question:
- What is the difference between the above JOIN and the right/left outer join


## String Operations

- SQL includes a string-matching operator for comparisons on character strings.
- The operator LIKE uses patterns that are described using two special characters
- Percent ( \% ). The \% character matches any substring.
- Underscore ( _ ). The _ character matches any character.
- Example: find the names of all instructors whose name includes the substring "Van der"

SELECT DISTINCT name
FROM instructor WHERE name LIKE '\%Van der\%'

## String Operations (Cont.)

- Match the string " $100 \%$ "
LIKE ‘100 <br>%’ ESCAPE '\'
in that above we use backslash $(\backslash)$ as the escape character
- Patterns are case sensitive.
- Pattern matching examples:
- 'Intro\%' matches any string beginning with "Intro".
- "\%Comp\%' matches any string containing "Comp" as a substring.
- ‘_ _ ' matches any string of exactly three characters.
- __ _ \%' matches any string of at least three characters.


## Range Queries

- SQL includes a BETWEEN comparison operator
- Example: Find the names of all instructors with salary between $\$ 90,000$ and $\$ 100,000$ (that is, $\geq \$ 90,000$ and $\leq \$ 100,000$ )

SELECT name
FROM instructor
WHERE salary BETWEEN 90000 AND 100000

## Tuple Comparison

SELECT name, course_id
FROM instructor, teaches
WHERE (instructor.ID, dept_name) = (teaches.ID, 'Biology')

## Set Operations

- Find courses that ran in Fall 2009 or in Spring 2010

SELECT course_id FROM section WHERE sem = 'Fall' AND year = 2009
UNION
SELECT course_id FROM section WHERE sem = 'Spring' AND year = 2010

- Find courses that ran in Fall 2009 and in Spring 2010

SELECT course_id FROM section WHERE sem = 'Fall' AND year $=2009$ INTERSECT
SELECT course_id FROM section WHERE sem = 'Spring' AND year $=2010$

- Find courses that ran in Fall 2009 but not in Spring 2010

SELECT course_id FROM section WHERE sem = 'Fall' AND year = 2009 EXCEPT
SELECT course_id FROM section WHERE sem = 'Spring' AND year = 2010

## Null Values

- It is possible for tuples to have a null value, denoted by NULL, for some of their attributes
- null signifies an unknown value or that a value does not exist.
- The result of any arithmetic expression involving NULL is NULL
- Example: 5 + NULL returns NULL
- The predicate IS NULL can be used to check for null values.
- Example: Find all instructors whose salary is null.

SELECT name
FROM instructor
WHERE salary IS NULL

## Null Values and Three Valued Logic

- Three values - true, false, unknown
- Any comparison with null returns unknown
- Example: 5 <null or null <> null or null = null
- Three-valued logic using the value unknown:
- OR: (unknown OR true) = true, (unknown OR false) = unknown (unknown OR unknown) = unknown
- AND: (true AND unknown) = unknown, (false AND unknown) = false,

| $\Lambda$ | $T$ | $F$ | $U$ |
| :---: | :---: | :---: | :---: |
| $T$ | T | F | $U$ |
| $F$ | F | F | F |
| $U$ | U | F | U | (unknown AND unknown) = unknown

- NOT: (NOT unknown) = unknown
- " $P$ is unknown" evaluates to true if predicate $P$ evaluates to unknown
- Result of WHERE clause predicate is treated as false if it evaluates to unknown


## The IN Operator

- <v> IN <S> evaluates to true if the value v matches one of the values in $S$.
- It can be used to replace a sequence of conditions connected by OR
- Example:

SELECT name
FROM instructor
WHERE dept_name IN ('Comp. Sci., ' Math.', 'Chem.');
This Query is equivalent to:
SELECT name
FROM instructor
WHERE dept_name = 'Comp. Sci.' OR dept_name = 'Math.' OR dept_name = 'Chem.'

## Aggregate Functions

- These functions operate on the multiset of values of a column of a relation, and return a value avg: average value min: minimum value max: maximum value sum: sum of values count: number of values


## Aggregate Functions (Cont.)

- Find the average salary of instructors in the Computer Science department

SELECT AVG (salary)
FROM instructor
WHERE dept_name= 'Comp. Sci.';

- Find the total number of instructors who taught a course in the Spring 2010 semester

SELECT COUNT (DISTINCT ID)
FROM teaches
WHERE semester = 'Spring' AND year = 2010;

- Find the number of tuples in the course relation

SELECT COUNT (*)
FROM course;

## Aggregate Functions (Cont.)

- Find the average salary of instructors in each department

SELECT dept_name, AVG (salary) AS avg_salary
FROM instructor
GROUP BY dept_name;

| ID | name | dept_name | salary |
| :--- | :--- | :--- | :--- |
| 22322 | Einstein | Physics | 95000 |
| 33452 | Gold | Physics | 87000 |
| 21212 | Wu | Finance | 90000 |
| 10101 | Brandt | Comp. Sci. | 82000 |
| 43521 | Katz | Comp. Sci. | 75000 |
| 98531 | Kim | Biology | 78000 |
| 58763 | Crick | Elec. Eng. | 80000 |
| 52187 | Mozart | History | 65000 |
| 32343 | El Said | History | 86000 |

The query result

| dept_name | avg_salary |
| :--- | :--- |
| Physics | 91000 |
| Finance | 90000 |
| Comp. Sci. | 78500 |
| Biology | 78000 |
| Elec. Eng. | 80000 |
| History | 75500 |

## Aggregate Functions (Cont.)

- Find the average salary of instructors in each department which has average salary greater than 80000 - use HAVING because WHERE cannot be used with aggregate functions

SELECT dept_name, AVG (salary) AS avg_salary FROM instructor GROUP BY dept_name
HAVING avg_salary > 80000;

The query result

| dept_name | avg_salary |
| :--- | :--- |
| Physics | 91000 |
| Finance | 90000 |


| ID | name | dept_name | salary |
| :--- | :--- | :--- | :--- |
| 22322 | Einstein | Physics | 95000 |
| 33452 | Gold | Physics | 87000 |
| 21212 | Wu | Finance | 90000 |
| 10101 | Brandt | Comp. Sci. | 82000 |
| 43521 | Katz | Comp. Sci. | 75000 |
| 98531 | Kim | Biology | 78000 |
| 58763 | Crick | Elec. Eng. | 80000 |
| 52187 | Mozart | History | 65000 |
| 32343 | El Said | History | 86000 |

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## Subqueries

- SQL provides a mechanism for the nesting of subqueries.
- A subquery is a SELECT-FROM-WHERE expression that is nested within another query.
- The nesting can be done in the following SQL query
$\operatorname{SELECT} A_{1}, A_{2}, \ldots, A_{n}$
FROM $r_{1}, r_{2}, \ldots, r_{n}$
WHERE $P$
as follows:
- $A_{i}$ can be replaced be a subquery that generates a single value.
- $r_{i}$ can be replaced by any valid subquery
- $P$ can be replaced with an expression of the form:
$B$ <operation> (subquery)

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## Subqueries - Examples (Subquery in the WHERE clause)

- Find courses offered in Fall 2009 and in Spring 2010

SELECT DISTINCT course_id
FROM section
WHERE semester $=$ 'Fall' AND year $=2009$ AND course_id IN (SELECT course_id

FROM section
WHERE semester = 'Spring' AND year= 2010);

## Subqueries - Examples (Subquery in the FROM clause)

- Find the average instructors' salaries of those departments where the average salary is greater than $\$ 42,000$."

SELECT dept_name, avg_salary
FROM (SELECT dept_name, AVG (salary) AS avg_salary
FROM instructor GROUP BY dept_name)
WHERE avg_salary > 42000;

## Subqueries - Examples (Subquery in the SELECT clause)

- List all departments along with the number of instructors in each department

SELECT dept_name,
(SELECT COUNT(*)
FROM instructor
WHERE department.dept_name $=$ instructor.dept_name)
AS num_instructors
FROM department;

- Runtime error if subquery returns more than one result tuple
- Note that: subqueries are parenthesized SELECT-FROM-WHERE statements


## Boolean Operators - Revision

## Boolean Operators

- Searching through a database or search engine can often be frustrating
- Boolean Operators create relationships between concepts and terms for better search results
- Most popular Boolean operators are AND, OR and NOT
- The red areas represent the results of the operators

A

B

A AND B

$A$ OR B

A AND NOT(B)


## AND (^)

| $\boldsymbol{A}$ | $\boldsymbol{B}$ | $\boldsymbol{A} \wedge \boldsymbol{B}$ |
| :---: | :---: | :---: |
| 1 | 1 | 1 |
| 1 | 0 | 0 |
| 0 | 1 | 0 |
| 0 | 0 | 0 |



- Retrieves only records that satisfy both conditions
- Example:
name = "Taylor" AND dept_name = "Chem."
Returns all instructors in the Chem. department whose name is Taylor



The red area $-(A \vee B)$

- Retrieves records that satisfy one of the conditions
- Example:
name $=$ "Taylor" OR dept_name $=$ "Chem."
Returns all instructors with the name Taylor and all instructors of the Chem. department



The red area - A AND NOT (B)

- Retrieves only records that satisfy the first condition and doesn't satisfy the second
- Example:
name = "Taylor" AND
NOT dept_name = "Chem."
Returns all instructors with the name Taylor who do not work in the Chem. department


## Boolean Equivalence

- Equivalence of two Boolean operations can be easily proven using truth tables
- Equivalence of Boolean operations is useful for optimizing the Boolean queries
- Examples:
$\bullet \sim(A \wedge B) \equiv \sim A \vee \sim B \longrightarrow$

| $\boldsymbol{A}$ | $\boldsymbol{B}$ | $(\boldsymbol{A} \wedge \boldsymbol{B})$ | $\sim(\boldsymbol{A} \wedge \boldsymbol{B})$ | $\sim \boldsymbol{A} \vee \sim \boldsymbol{B}$ |
| :---: | :---: | :---: | :---: | :---: |
| 1 | 1 | 1 | 0 | 0 |
| 1 | 0 | 0 | 1 | 1 |
| 0 | 1 | 0 | 1 | 1 |
| 0 | 0 | 0 | 1 | 1 |
|  |  |  | $\square$ |  |

- $(A \wedge B) \wedge \sim B \equiv A \wedge(B \wedge \sim B) \equiv$ false
- $(\boldsymbol{A} \wedge B) \vee(\sim B \wedge C) \vee(A \wedge C) \vee \sim(A \wedge C) \equiv(A \wedge C) \vee \sim(A \wedge C) \equiv$ true


## Proving Boolean Equivalence

- Truth Table: Helpful when the number of statements in the Boolean expression is small
- Proof by contradiction: assume the expression is false/true and proof that it leads to contradiction
- Using the Boolean axioms.


## Boolean Axioms

- Let $\boldsymbol{T}$ and $\boldsymbol{F}$ represent the cases of always True and always False
- $(\boldsymbol{T} \wedge \boldsymbol{T})=\boldsymbol{T}$
- $(\boldsymbol{F} \wedge \boldsymbol{F})=\boldsymbol{F}$
- $(T \vee T)=T$
- $(\boldsymbol{F} \vee \boldsymbol{F})=\boldsymbol{F}$
- $(\boldsymbol{T} \wedge F)=(F \wedge T)=F$
- $(\boldsymbol{T} \vee \boldsymbol{F})=(\boldsymbol{F} \vee T)=T$
- $\bar{T}=F$
- $\overline{\boldsymbol{F}}=\boldsymbol{T}$


## Boolean Axioms

- Commutativity
- $(A \wedge B)=(B \wedge A)$
- $(A \vee B)=(B \vee A)$
- Identity
- $(A \wedge T)=A$
- $(A \vee T)=T$
- $(A \wedge F)=F$
- $(\boldsymbol{A} \vee F)=\boldsymbol{A}$


## Boolean Axioms

- Idempotent
- $(A \wedge A)=A$
- $(A \vee A)=A$
- Involution
- $\overline{\bar{A}}=A$
- Complement
- $(A \wedge \bar{A})=F$
- $(A \vee \bar{A})=T$


## Boolean Axioms

- Associativity
- $(A \wedge B) \wedge C=A \wedge(B \wedge C)$
- $(\boldsymbol{A} \vee B) \vee C=\boldsymbol{A} \vee(B \vee C)$
- Distributivity
- $A \wedge(B \vee C)=(A \wedge B) \vee(A \wedge C)$
- $A \vee(B \wedge C)=(A \vee B) \wedge(A \vee C)$


## Proving Boolean Equivalence

- Using the Boolean axioms (Example):
- prove that: $(A \wedge B) \vee(\sim A \wedge C) \vee(B \wedge C)=(A \wedge B) \vee(\sim A \wedge C)$
- LHS $=(A \wedge B) \vee(\sim A \wedge C) \vee(B \wedge C)=(A \wedge B) \vee(\sim A \wedge C) \vee[(B \wedge C) \wedge T]$

$$
\begin{aligned}
& =(A \wedge B) \vee(\sim A \wedge C) \vee[(B \wedge C) \wedge(A \vee \sim A)] \\
& =(A \wedge B) \vee(\sim A \wedge C) \vee[(B \wedge C \wedge A) \vee(B \wedge C \wedge \sim A)] \\
& =[(A \wedge B) \vee(B \wedge C \wedge A)] \vee[(\sim A \wedge C) \vee(B \wedge C \wedge \sim A)] \\
& =[(A \wedge B) \wedge(T \vee C)] \vee[(\sim A \wedge C) \wedge(T \vee B)] \\
& =[(A \wedge B)] \vee[(\sim A \wedge C)]=R H S
\end{aligned}
$$

- $\boldsymbol{T}$ means always TRUE.


# Read more FROM <br> John Kelly, The Essence of Logic (Prentice Hall, 1997) <br> Chapter 1 is good enough 

