Data Wrangling and Data Analysis

Data Extraction

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1

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

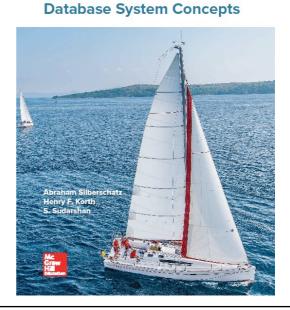
- Today
 - Operations on databases
 - Relational algebra
 - SQL



2

Reading Material for Today

Database System Concepts (7th Edition) CH 2.6, 3.3 – 3.8.



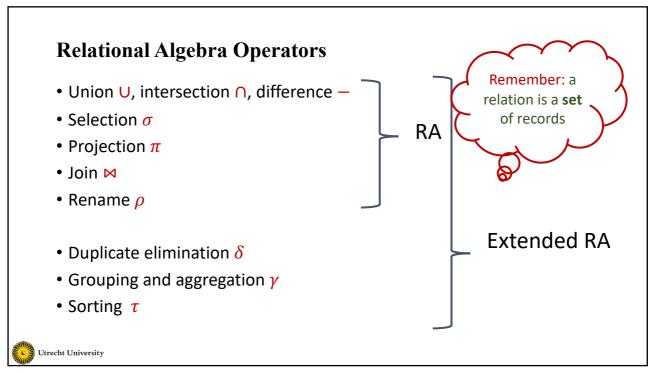
SEVENTH EDITION



Relational Algebra



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Intersection $\begin{array}{c|cccc}
r & s \\
\hline
A & B \\
\hline
A & 3 \\
\hline
\beta & 2 \\
\end{array}$ Utrecht University $\begin{array}{c|cccc}
r \cap s \\
\hline
A & B \\
\hline
\alpha & 1 \\
\hline
\beta & 2 \\
\hline
\gamma & 3 \\
\end{array}$

Difference

r-s

r		
А	В	
α	3	
β	2	

S		
A	В	
α	1	
β	2	
γ	3	

r -	- S
Α	В
α	3

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



9

Selection

r

A	В	С	D
α	α	1	7
α	β	5	7
β	β	12	3
β	β	23	10

 $\sigma_{(A=B) \wedge (D>5)}(r)$

Α	В	С	D
α	α	1	7
β	β	23	10



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Projection

r			
Α	В	С	D
α	α	1	7
α	β	5	7
β	β	12	3
β	β	23	10

 $\pi_{A,C}(r)$ A C α 1 α 5 β 12 β 23

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11

Join

Cartesian Product

ı	
A	В
α	3
β	2

S		
С	D	
α	1	
β	2	
γ	3	

$r \times s$			
Α	В	С	D
α	3	α	1
α	3	β	2
α	3	γ	3
β	2	α	1
β	2	β	2
β	2	γ	3
α β β	3 2 2	γ α β	3 1 2

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Join

Cartesian Product

r	
А	В
α	3
β	2

5		
С		
1		
2		
3		

$r \times s$			
r.A	В	s.A	С
α	3	α	1
α	3	β	2
α	3	γ	3
β	2	α	1
β	2	β	2
β	2	γ	3

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13

Rename

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

r	
Α	В
α	3
β	2

$r \times \rho_s(r)$			
r.A	r.B	s.A	s.B
α	3	α	3
α	3	β	2
β	2	α	3
β	2	β	2



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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 t_r from r and t_s from s.
 - If t_r and 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



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15

Natural Join - Example

r

Α	В	С	D
α	1	α	а
β	2	γ	а
γ	4	β	b
α	1	γ	а
δ	2	β	b

S

	S	
В	D	E
1	а	α
3	а	β
1	а	γ
2	b	δ
3	b	ϵ

 $r \bowtie s$

Α	В	С	D	Е
α	1	α	а	α
α	1	α	а	γ
α	1	γ	а	α
α	1	γ	а	γ
δ	2	β	b	δ

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



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Composition of Operations

1	
A	В
α	3
β	2

S		
Α	В	
α	1	
β	2	
γ	3	

$r \times s$			
r.A	r.B	s.A	s.B
α	3	α	1
α	3	β	2
α	3	γ	3
β	2	α	1
β	2	β	2
β	2	γ	3

$\sigma_{r,A=s,A} (r \wedge s)$			
r.A	r.B	s.A	s.B
α	3	α	1
β	2	β	2

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17

Summary of Relational Algebra Operators

	Symbol (name)	Description
	σ (Selection)	Return rows of the input relation that satisfy a predicate.
	π (Projection)	Return specified attributes from all rows of the input relation. Remove duplicate tuples from the output.
	× (Cartesian Product)	Return pairs of rows from the <i>two</i> input relations.
	U (Union)	Return the union of tuples from the <i>two</i> input relations.
	– (Difference)	Return the set of records that exist in the relation before the operator(-) but not in the relation after the operator.
	\cap (Intersection)	Return the common tuples in both input relations.
	⋈ (Natural Join)	Return pairs of rows from the <i>two</i> input relations that have the same value on all attributes that have the same name.
	ρ (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 $\gamma_{SUM(tot_credit)}(student)$
 - AVG $\gamma_{AVG(salary)}(instructor)$
 - MAX $\gamma_{MAX(buget)}(department)$
 - MIN $\gamma_{MIN(budget)}(department)$
 - COUNT $\gamma_{COUNT(tot_credit \ge 12)}(student)$
 - GROUP BY $_{dept_name} \gamma_{AVG(salary)}(instructor)$



19

Data Extraction Using Structured Query Language (SQL)



SELECT-FROM-WHERE Statements

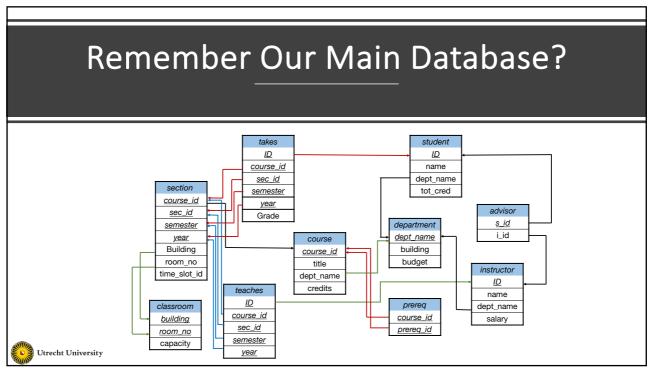
SELECT desired attributes

FROM one or more tables

WHERE condition about tuples of the tables

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21



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



23

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"



25

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



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27

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 =, <>, <, >, <=, >=



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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.



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29

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 ≡ instructor T



31

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)



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33

What have we learnt?

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

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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



35

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.



37

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_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



39

Full Outer Join

SELECT *

FROM course

FULL OUTER JOIN prereq

ON 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_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



41

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 \%' ESCAPE '\'

in that above we use 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.



43

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, $\ge $90,000$ and $\le $100,000$)

SELECT name FROM instructor WHERE salary BETWEEN 90000 AND 100000



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Tuple Comparison

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



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45

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



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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



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47

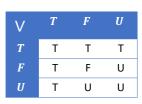
Null Values and Three Valued Logic

- 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, (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



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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'



49

Aggregate Functions

• These functions operate on the multiset of values of a column of a relation, and return a value

avg: average valuemin: minimum valuemax: maximum valuesum: sum of valuescount: 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;



51

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

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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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53

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

SELECT
$$A_1, A_2, ..., A_n$$

FROM $r_1, r_2, ..., r_n$
WHERE P

as follows:

- ullet 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)



55

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



57



Wrap-Up

 Summarize what you learned today in 2minutes

Boolean Operators – Revision



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59

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











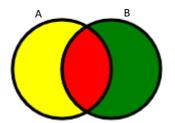
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60

AND (\wedge)

A	В	$A \wedge B$
1	1	1
1	0	0
0	1	0
0	0	0



The red area – $(A \land B)$

- 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

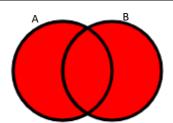


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61

OR (∨)

A	В	$A \vee B$
1	1	1
1	0	1
0	1	1
0	0	0



The red area – $(A \lor B)$

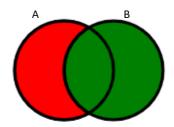
- Retrieves records that satisfy one of the conditions
- Example:
 name = "Taylor" OR dept_name = "Chem."
 Returns all instructors with the name Taylor and all instructors of the Chem. department



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NOT (∼)





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



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63

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:

•
$$\sim (A \land B) \equiv \sim A \lor \sim B$$

A	В	$(A \wedge B)$	$\sim (A \wedge B)$	~ A V~ B
1	1	1	0	0
1	0	0	1	1
0	1	0	1	1
0	0	0	1	1
			L	

- $(A \wedge B) \wedge \sim B \equiv A \wedge (B \wedge \sim B) \equiv false$
- $(A \land B) \lor (\sim B \land C) \lor (A \land C) \lor \sim (A \land C) \equiv (A \land C) \lor \sim (A \land C) \equiv true$



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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.



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65

Boolean Axioms

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



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Boolean Axioms

- Commutativity
 - $(A \wedge B) = (B \wedge A)$
 - $(A \lor B) = (B \lor A)$
- Identity
 - $(A \wedge T) = A$
 - $(A \lor T) = T$
 - $(A \wedge F) = F$
 - $(A \vee F) = A$



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67

Boolean Axioms

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



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Boolean Axioms

- Associativity
 - $(A \wedge B) \wedge C = A \wedge (B \wedge C)$
 - $(A \lor B) \lor C = A \lor (B \lor C)$
- Distributivity
 - $A \wedge (B \vee C) = (A \wedge B) \vee (A \wedge C)$
 - $A \lor (B \land C) = (A \lor B) \land (A \lor C)$



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69

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 = $(A \land B) \lor (\sim A \land C) \lor (B \land C) = (A \land B) \lor (\sim A \land C) \lor [(B \land C) \land T]$ = $(A \land B) \lor (\sim A \land C) \lor [(B \land C) \land (A \lor \sim A)]$ = $(A \land B) \lor (\sim A \land C) \lor [(B \land C \land A) \lor (B \land C \land \sim A)]$ = $[(A \land B) \lor (B \land C \land A)] \lor [(\sim A \land C) \lor (B \land C \land \sim A)]$ = $[(A \land B) \land (T \lor C)] \lor [(\sim A \land C) \land (T \lor B)]$ = $[(A \land B)] \lor [(\sim A \land C)] = RHS$
 - T means always TRUE.



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Read more FROM

John Kelly, The Essence of Logic (Prentice Hall, 1997)

Chapter 1 is good enough

