

Towards SQL - Relational Algebra

Attributes
(column
headers)

Beers

- Relation schema = relation name and attribute list.
 - Optionally: types of attributes.
 - Example: Beers(name, manf) or Beers(name: string, manf: string)
- Database = collection of relations.
- Database schema = set of all relation schemas in the database.

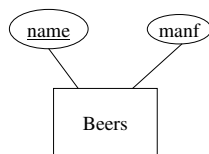
Why Relations?

- Very simple model.
- *Often* matches how we think about data.
- Abstract model that underlies SQL, the most important database language today.

From E/R Diagrams to Relations

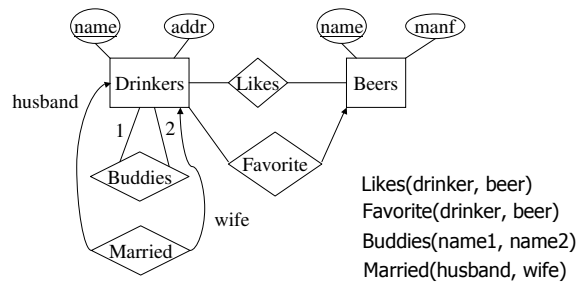
- Entity set \rightarrow relation.
 - Attributes \rightarrow attributes.
- Relationships \rightarrow relations whose attributes are only:
 - The keys of the connected entity sets.
 - Attributes of the relationship itself.

Entity Set \rightarrow Relation



Relation: Beers(name, manf)

Relationship -> Relation



What is an "Algebra"

Mathematical system consisting of:

- **Operands** --- variables or values from which new values can be constructed.
- **Operators** --- symbols denoting procedures that construct new values from given values.

More on Algebras

- **Arithmetic**: operands are variables and constants, operators are $+$, $-$, \times , \div , $/$, etc.
- **Set algebra**: operands are sets and operators are Union, Intersection Set Difference etc.
- An algebra allows us to *construct expressions* by combining operands and expression using operators.
 - $a^2 + 2 \times a \times b + b^2$, $(a + b)^2$.
 - $R - (R - S)$, $R \cap S$ etc.

What is Relational Algebra?

- An algebra whose operands are relations or variables that represent relations.
- Operators are designed to do the most common things that we need to do with relations in a database.
 - The result is an algebra that can be used as a basis for a *query language* for relations.
- Relational algebra is a notation for specifying queries about the contents of relations.
- Notation of relational algebra eases the task of reasoning about queries.
 - Operations in relational algebra have counterparts in SQL.

Roadmap

- There is a core relational algebra that has traditionally been thought of as *the* relational algebra.
- But there are several other operators we shall add to the core in order to model better the language SQL --- the principal language used in relational database systems.

Core Relational Algebra

- Union, intersection, and difference.
 - Usual set operations, but require both operands have the same relation schema.
- Selection: picking certain rows.
- Projection: picking certain columns.
 - Both Selection and Projection remove certain parts of a relation!
- Products and joins: compositions of relations.
- Renaming of relations and attributes.

Union

- The union of two relations R and S is the set of tuples that are in R or in S or in both.
- R and S must have identical sets of attributes and the types of the attributes must be the same.
- The attributes of R must occur in the same order as the attributes in S.
- $RA R \cup S$

```
(SELECT * FROM R) UNION (SELECT * FROM S);
```

Intersection

- The intersection of two relations R and S is the set of tuples that are in both R and S.
- Same conditions hold on R and S as for the union operator.
- $RA R \cap S$

```
(SELECT * FROM R) INTERSECT (SELECT * FROM S);
```

Difference

- The difference of two relations R and S is the set of tuples that are in R but not in S.
- Same conditions hold on R and S as for the union operator.
- $RA: R - S$
- ```
(SELECT * FROM R) EXCEPT (SELECT * FROM S);
```
- $R - (R-S) = ??$
- $R \cap S$

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## Selection

- **R1 := SELECT<sub>C</sub>(R2)**
- *C* is a condition (as in "if" statements) that refers to attributes of R2.
- R1 is all those tuples of R2 that satisfy *C*.
- Basis of:  
`SELECT * FROM R WHERE C;`

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## More on Selection

- Syntax of *C*: similar to conditionals in programming languages.
- Values compared are constants and attributes of the relations mentioned in the FROM clause.
- We may apply usual arithmetic operators to numeric values before comparing them.
  - SQL Compare values using =, <, >, <=, >=.

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## Example

Relation Sells:

| bar   | beer   | price |
|-------|--------|-------|
| Joe's | Bud    | 2.50  |
| Joe's | Miller | 2.75  |
| Sue's | Bud    | 2.50  |
| Sue's | Miller | 3.00  |

JoeMenu := SELECT<sub>bar="Joe's"</sub>(Sells):

| bar   | beer   | price |
|-------|--------|-------|
| Joe's | Bud    | 2.50  |
| Joe's | Miller | 2.75  |

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## Projection

### ■ $R1 := PROJ_L(R2)$

- $L$  is a list of attributes from the schema of  $R2$ .
  - Same as selecting select columns from a table.
- $R1$  is constructed by looking at each tuple of  $R2$ , extracting the attributes on list  $L$ , in the order specified, and creating from those components a tuple for  $R1$ .
- Eliminate duplicate tuples, if any.

**SELECT A1, A2, . . . , An FROM R;**

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## Example

Relation Sells:

| bar   | beer   | price |
|-------|--------|-------|
| Joe's | Bud    | 2.50  |
| Joe's | Miller | 2.75  |
| Sue's | Bud    | 2.50  |
| Sue's | Miller | 3.00  |

Prices :=  $PROJ_{beer, price}(Sells)$ :

| beer   | price |
|--------|-------|
| Bud    | 2.50  |
| Miller | 2.75  |
| Miller | 3.00  |

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## Product

### ■ $R3 := R1 * R2$

- Pair each tuple  $t1$  of  $R1$  with each tuple  $t2$  of  $R2$ .
- Concatenation  **$t1t2$**  is a tuple of  $R3$ .
- Schema of  $R3$  is the attributes of  $R1$  and then  $R2$ , in order.
- But beware attribute  $A$  of the same name in  $R1$  and  $R2$ : use  $R1.A$  and  $R2.A$ .

**SELECT \* FROM R1, R2**

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## Example: $R3 := R1 * R2$

$$R1($$

| A | B |
|---|---|
| 1 | 2 |
| 3 | 4 |

$$R2($$

| B | C  |
|---|----|
| 5 | 6  |
| 7 | 8  |
| 9 | 10 |

$$R3($$

| A | R1.B | R2.B | C  |
|---|------|------|----|
| 1 | 2    | 5    | 6  |
| 1 | 2    | 7    | 8  |
| 1 | 2    | 9    | 10 |
| 3 | 4    | 5    | 6  |
| 3 | 4    | 7    | 8  |
| 3 | 4    | 9    | 10 |

$$)$$

## Theta-Join

### ■ $R3 := R1 \text{ JOIN}_C R2$

- Set of tuples in the Cartesian product that satisfies some condition C

### ■ Computing it

- Take the product  $R1 * R2$ .
- Then apply  $\text{SELECT}_C$  to the result.

- C can be any boolean-valued condition.

- Historic versions of this operator allowed only  $A \theta B$ , where  $\theta$  is  $=$ ,  $<$ , etc.; hence the name "theta-join."

**SELECT \* from R1, R2 WHERE C**

## Example

$$\text{Sells}($$

| bar   | beer   | price |
|-------|--------|-------|
| Joe's | Bud    | 2.50  |
| Joe's | Miller | 2.75  |
| Sue's | Bud    | 2.50  |
| Sue's | Coors  | 3.00  |

$$\text{Bars}($$

| name  | addr      |
|-------|-----------|
| Joe's | Maple St. |
| Sue's | River Rd. |

$$)$$

**BarInfo := Sells JOIN<sub>Sells.bar = Bars.name</sub> Bars**

$$\text{BarInfo}($$

| bar   | beer   | price | name  | addr      |
|-------|--------|-------|-------|-----------|
| Joe's | Bud    | 2.50  | Joe's | Maple St. |
| Joe's | Miller | 2.75  | Joe's | Maple St. |
| Sue's | Bud    | 2.50  | Sue's | River Rd. |
| Sue's | Coors  | 3.00  | Sue's | River Rd. |

$$)$$



## Natural Join

- The *natural join* of two relations R and S is a set of pairs of tuples, one from R and one from S, that agree on whatever attributes are common to the schemas of R and S
- Connect two relations by:
  - Equating attributes of the same name, and
  - Projecting out one copy of each pair of equated attributes.
- The schema for the result contains the union of the attributes of R and S.
- Denoted  $R_3 := R_1 \text{ JOIN } R_2$

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## Example

| Sells( | bar,  | beer,  | price | ) | Bars( | bar,       | addr | ) |
|--------|-------|--------|-------|---|-------|------------|------|---|
|        | Joe's | Bud    | 2.50  |   | Joe's | Maple St.  |      |   |
|        | Joe's | Miller | 2.75  |   | Sue's | River Rd.  |      |   |
|        | Sue's | Bud    | 2.50  |   | Ben's | Central Av |      |   |
|        | Sue's | Coors  | 3.00  |   |       |            |      |   |

BarInfo := Sells JOIN Bars

Note: Bars.name has become Bars.bar to make the natural join "work."

|          |       |        |        |           |   |
|----------|-------|--------|--------|-----------|---|
| BarInfo( | bar,  | beer,  | price, | addr      | ) |
|          | Joe's | Bud    | 2.50   | Maple St. |   |
|          | Joe's | Miller | 2.75   | Maple St. |   |
|          | Sue's | Bud    | 2.50   | River Rd. |   |
|          | Sue's | Coors  | 3.00   | River Rd. |   |

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## More on Natural Join

- A dangling tuple is one that fails to pair with any tuple in the other relation.
  - Ben's bar on Central Ave. in the previous example

$R(A, B, C)$  and  $S(B, C, D)$ .

```
SELECT R.A, R.B, R.C, S.D FROM R, S
WHERE R.B = S.B AND R.C = S.C;
```

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## Renaming

- The RENAME operator gives a new schema to a relation.
- $R1 := \text{RENAME}_{R1(A1, \dots, An)}(R2)$  makes R1 be a relation with attributes  $A1, \dots, An$  and the same tuples as R2.
- Simplified notation:  $R1(A1, \dots, An) := R2$ .

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## Example

Bars( 

| name  | addr      |
|-------|-----------|
| Joe's | Maple St. |
| Sue's | River Rd. |

 )

Pubs(bar, addr) := Bars

Pubs( 

| bar   | addr      |
|-------|-----------|
| Joe's | Maple St. |
| Sue's | River Rd. |

 )

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## Building Complex Expressions

- Combine operators with parentheses and precedence rules.
- Three notations, just as in arithmetic:
  1. Sequences of assignment statements.
  2. Expressions with several operators.
  3. Expression trees.

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## Sequences of Assignments

- Create temporary relation names.
- Renaming can be implied by giving relations a list of attributes.
- Example:  $R3 := R1 \text{ JOIN}_C R2$  can be written:  
 $R4 := R1 * R2$   
 $R3 := \text{SELECT}_C (R4)$

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## Expressions in a Single Assignment

- Example: the theta-join  $R3 := R1 \text{ JOIN}_C R2$  can be written:  $R3 := \text{SELECT}_C (R1 * R2)$
- Precedence of relational operators:
  1. [SELECT, PROJECT, RENAME] (highest).
  2. [PRODUCT, JOIN].
  3. INTERSECTION.
  4. [UNION, --]

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## Expression Trees

- Leaves are operands --- either variables standing for relations or particular, constant relations.
- Interior nodes are operators, applied to their child or children.

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## Example

- Using the relations **Bars**(*name*, *addr*) and **Sells**(*bar*, *beer*, *price*), find the names of all the bars that are either on Maple St. **or** sell Budweiser for less than \$3.

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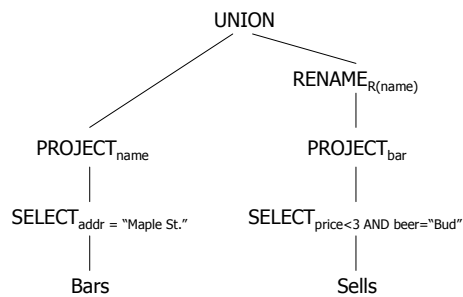
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## As a Tree:



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## Example

- Using **Sells**(*bar*, *beer*, *price*), find the bars that sell two different beers at the same price.
- **Strategy:** by renaming, define a copy of Sells, called S(*bar*, *beer1*, *price*). The natural join of Sells and S consists of quadruples (*bar*, *beer*, *beer1*, *price*) such that the bar sells both beers at this price.

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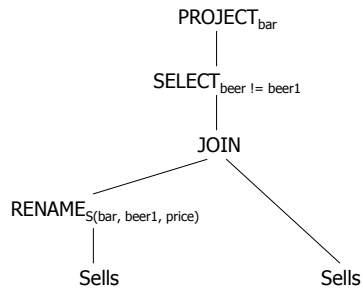
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## The Tree



## Schemas for Results

- Union, intersection, and difference: the schemas of the two operands must be the same, so use that schema for the result.
- Selection: schema of the result is the same as the schema of the operand.
- Projection: list of attributes tells us the schema.

## Schemas for Results --- (2)

- Product: schema is the attributes of both relations.
  - Use  $R.A$ , etc., to distinguish two attributes named  $A$ .
- Theta-join: same as product.
- Natural join: union of the attributes of the two relations.
- Renaming: the operator tells the schema.

## Relational Algebra on Bags

- A *bag* (or *multiset* ) is like a set, but an element may appear more than once.
- Example:  $\{1,2,1,3\}$  is a bag.
- Example:  $\{1,2,3\}$  is also a bag that happens to be a set.

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## Why Bags?

- SQL, the most important query language for relational databases, is actually a bag language.
- Some operations, like projection, are much more efficient on bags than sets.

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## Operations on Bags

- Selection applies to each tuple, so its effect on bags is like its effect on sets.
- Projection also applies to each tuple, but as a bag operator, we do not eliminate duplicates.
- Products and joins are done on each pair of tuples, so duplicates in bags have no effect on how we operate.

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### Example: Bag Selection

R(

| A | B |
|---|---|
| 1 | 2 |
| 5 | 6 |
| 1 | 2 |

SELECT<sub>A+B<5</sub> (R)

=

| A | B |
|---|---|
| 1 | 2 |
| 1 | 2 |

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### Example: Bag Projection

R(

| A | B |
|---|---|
| 1 | 2 |
| 5 | 6 |
| 1 | 2 |

PROJECT<sub>A</sub> (R)

=

| A |
|---|
| 1 |
| 5 |
| 1 |

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### Example: Bag Product

R(

| A | B |
|---|---|
| 1 | 2 |
| 5 | 6 |
| 1 | 2 |

S(

| B | C |
|---|---|
| 3 | 4 |
| 7 | 8 |

R \* S =

| A | R.B | S.B | C |
|---|-----|-----|---|
| 1 | 2   | 3   | 4 |
| 1 | 2   | 7   | 8 |
| 5 | 6   | 3   | 4 |
| 5 | 6   | 7   | 8 |
| 1 | 2   | 3   | 4 |
| 1 | 2   | 7   | 8 |

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### Example: Bag Theta-Join

|    |                                                                                                                                      |    |   |   |   |   |   |   |   |    |                                                                                                         |    |   |   |   |   |   |
|----|--------------------------------------------------------------------------------------------------------------------------------------|----|---|---|---|---|---|---|---|----|---------------------------------------------------------------------------------------------------------|----|---|---|---|---|---|
| R( | <table><tr><td>A,</td><td>B</td></tr><tr><td>1</td><td>2</td></tr><tr><td>5</td><td>6</td></tr><tr><td>1</td><td>2</td></tr></table> | A, | B | 1 | 2 | 5 | 6 | 1 | 2 | S( | <table><tr><td>B,</td><td>C</td></tr><tr><td>3</td><td>4</td></tr><tr><td>7</td><td>8</td></tr></table> | B, | C | 3 | 4 | 7 | 8 |
| A, | B                                                                                                                                    |    |   |   |   |   |   |   |   |    |                                                                                                         |    |   |   |   |   |   |
| 1  | 2                                                                                                                                    |    |   |   |   |   |   |   |   |    |                                                                                                         |    |   |   |   |   |   |
| 5  | 6                                                                                                                                    |    |   |   |   |   |   |   |   |    |                                                                                                         |    |   |   |   |   |   |
| 1  | 2                                                                                                                                    |    |   |   |   |   |   |   |   |    |                                                                                                         |    |   |   |   |   |   |
| B, | C                                                                                                                                    |    |   |   |   |   |   |   |   |    |                                                                                                         |    |   |   |   |   |   |
| 3  | 4                                                                                                                                    |    |   |   |   |   |   |   |   |    |                                                                                                         |    |   |   |   |   |   |
| 7  | 8                                                                                                                                    |    |   |   |   |   |   |   |   |    |                                                                                                         |    |   |   |   |   |   |

|                                  |   |     |     |   |
|----------------------------------|---|-----|-----|---|
| R JOIN <sub>R.B&lt;S.B</sub> S = | A | R.B | S.B | C |
|                                  | 1 | 2   | 3   | 4 |
|                                  | 1 | 2   | 7   | 8 |
|                                  | 5 | 6   | 7   | 8 |
|                                  | 1 | 2   | 3   | 4 |
|                                  | 1 | 2   | 7   | 8 |

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### Bag Union

- An element appears in the union of two bags the sum of the number of times it appears in each bag.

$$\{1, 2, 1\} \cup \{1, 1, 2, 3, 1\} = \{1, 1, 1, 1, 1, 2, 2, 3\}$$

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### Bag Intersection

- An element appears in the intersection of two bags the minimum of the number of times it appears in either.

$$\{1, 2, 1, 1\} \cap \{1, 2, 1, 3\} = \{1, 1, 2\}.$$

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## Bag Difference

- An element appears in the difference  $A - B$  of bags as many times as it appears in  $A$ , minus the number of times it appears in  $B$ .
  - But never less than 0 times.

$$\{1,2,1,1\} - \{1,2,3\} = \{1,1\}.$$

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## Beware: Bag Laws $\neq$ Set Laws

- Some, but *not all* algebraic laws that hold for sets also hold for bags.
- Question: Does the commutative law for Union hold for bags?
- Answer: The *commutative law* for union ( $R \cup S = S \cup R$ ) **does** hold for bags.
  - Since addition is commutative, adding the number of times  $x$  appears in  $R$  and  $S$  doesn't depend on the order of  $R$  and  $S$ .

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## More on sets Vs bags

- Set union is *idempotent*, meaning that  $S \cup S = S$ .
- Question: Is Bag union idempotent?
- Answer: If  $x$  appears  $n$  times in  $S$ , then it appears  $2n$  times in  $S \cup S$ . Thus  $S \cup S \neq S$  in general.

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## The Extended Algebra

- ◆ DELTA = eliminate duplicates from bags.
- ◆ TAU = sort tuples.
- ◆ *Extended projection* : arithmetic, duplication of columns.
- ◆ GAMMA = grouping and aggregation.
- ◆ *Outerjoin* : avoids "dangling tuples" = tuples that do not join with anything.

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## Duplicate Elimination

- $R1 := \text{DELTA}(R2)$ .
- R1 consists of one copy of each tuple that appears in R2 one or more times.

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## Example: Duplicate Elimination

$R =$ 

| A | B |
|---|---|
| 1 | 2 |
| 3 | 4 |
| 1 | 2 |

$\text{DELTA}(R) =$ 

| A | B |
|---|---|
| 1 | 2 |
| 3 | 4 |

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## Sorting

- $R1 := \text{TAU}_L(R2)$ .
  - $L$  is a list of some of the attributes of  $R2$ .
- $R1$  is the list of tuples of  $R2$  sorted first on the value of the first attribute on  $L$ , then on the second attribute of  $L$ , and so on.
  - Break ties arbitrarily.

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## Example: Sorting

$R =$

| A | B |
|---|---|
| 1 | 2 |
| 3 | 4 |
| 5 | 2 |

$\text{TAU}_B(R) = [(5,2), (1,2), (3,4)]$

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## Extended Projection

- Using the same  $\text{PROJ}_L$  operator, we allow the list  $L$  to contain **arbitrary expressions involving attributes**, for example:
  1. Arithmetic on attributes, e.g.,  $A+B$ .
  2. Duplicate occurrences of the same attribute.

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### Example: Extended Projection

$R =$ 

| A | B |
|---|---|
| 1 | 2 |
| 3 | 4 |

$PROJ_{A+B, A1, A2}(R) =$ 

| A+B | A1 | A2 |
|-----|----|----|
| 3   | 1  | 1  |
| 7   | 3  | 3  |

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### Aggregation Operators

- Aggregation operators are not operators of relational algebra.
- Rather, they apply to entire columns of a table and produce a single result.
- The most important examples: SUM, AVG, COUNT, MIN, and MAX.

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### Example: Aggregation

$R =$ 

| A | B |
|---|---|
| 1 | 3 |
| 3 | 4 |
| 3 | 2 |

SUM(A) = 7  
COUNT(A) = 3  
MAX(B) = 4  
AVG(B) = 3

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## Grouping Operator

- $R1 := \text{GAMMA}_L(R2)$
- $L$  is a list of elements that are either:
  1. Individual (*grouping*) attributes.
  2.  $\text{AGG}(A)$ , where  $\text{AGG}$  is one of the aggregation operators and  $A$  is an attribute.

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## Applying $\text{GAMMA}_L(R)$

- Group  $R$  according to all the grouping attributes on list  $L$ .
  - That is: form one group for each distinct list of values for those attributes in  $R$ .
- Within each group, compute  $\text{AGG}(A)$  for each aggregation on list  $L$ .
- Result has one tuple for each group:
  1. The grouping attributes and
  2. Their group's aggregations.

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## Example: Grouping/Aggregation

$R =$

| A | B | C |
|---|---|---|
| 1 | 2 | 3 |
| 4 | 5 | 6 |
| 1 | 2 | 5 |

Then, average  $C$  within groups:

| A | B | AVG(C) |
|---|---|--------|
| 1 | 2 | 4      |
| 4 | 5 | 6      |

$\text{GAMMA}_{A,B,\text{AVG}(C)}(R) = ??$

First, group  $R$  by  $A$  and  $B$ :

| A | B | C |
|---|---|---|
| 1 | 2 | 3 |
| 1 | 2 | 5 |
| 4 | 5 | 6 |

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## Outerjoin

- Suppose we join  $R \text{ JOIN}_C S$ .
- A tuple of  $R$  that has no tuple of  $S$  with which it joins is said to be *dangling*.
  - Similarly for a tuple of  $S$ .
- Outerjoin preserves dangling tuples by padding them with a special NULL symbol in the result.

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## Example: Outerjoin

$R =$

| A | B |
|---|---|
| 1 | 2 |
| 4 | 5 |

$S =$

| B | C |
|---|---|
| 2 | 3 |
| 6 | 7 |

(1,2) joins with (2,3), but the other two tuples are dangling.

$R \text{ OUTERJOIN } S =$

| A    | B | C    |
|------|---|------|
| 1    | 2 | 3    |
| 4    | 5 | NULL |
| NULL | 6 | 7    |

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