# CMPT 354: Database System I

Lecture 5. Relational Algebra

#### What have we learned

- Lec 1. Database History
- Lec 2. Relational Model
- Lec 3-4. SQL

# Why Relational Algebra matter?

- An essential topic to understand how query processing and optimization work
  - What happened when an SQL is issued to a database?

- Help you master the kills to quickly learn a new query language
  - How to quickly learn XML QL and MangoDB QL?

### Relational Query Languages

 Query languages allow the manipulation and retrieval of data from a database

- Traditionally: QL != programming language
  - Doesn't need to be Turing complete
  - Not designed for computation
  - Supports easy, efficient access to large databases
- Recent Years:
  - Everything interesting involves a large data set
  - QLs are quite powerful for expressing algorithms at scale

### **Formal Query Languages**

- Relational Algebra
  - Procedural query language
  - used to represent execution plans

- Relational Calculus
  - Non-procedural (declarative) query language
  - Describe what you want, rather than how to compute it
  - Foundation for SQL

### Results of a Query

Query is a function over relations

$$Q(R_1,...,R_n) = R_{result}$$

- The schema of the result relation is determined by the input relation and the query
- Because the result of a query is a relation, it can be used as input to another query

#### Sets v.s. Bags

- Sets: {a, b, c}, {a, d, e, f}, {}, ...
- Bags: {a, a, b, c}, {b, b, b, b, b}, ...

- Relational Algebra has two flavors:
  - Set semantics = standard Relational Algebra
  - Bag semantics = extended Relational Algebra
- DB systems implement bag semantics (Why?)

#### Sets v.s. Bags

- Sets: {a, b, c}, {a, d, e, f}, {}, ...
- Bags: {a, a, b, c}, {b, b, b, b, b}, ...

- Relational Algebra has two flavors:
  - Set semantics = standard Relational Algebra
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- DB systems implement bag semantics (Why?)

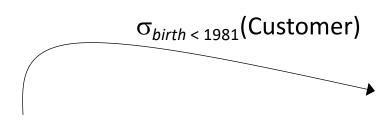
### **Relational Algebra Operators**

- Core 5 operators
  - Selection (♂)
  - Projection  $(\pi)$
  - Union (**U**)
  - Set Difference (-)
  - Cross product (X)
- Additional operators
  - Rename (p)
  - join (⋈)
  - Intersect (∩)

#### Selection

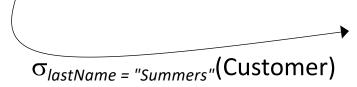
- The selection operator,  $\sigma$  (sigma), specifies the rows to be retained from the input relation
- A selection has the form:  $\sigma_{condition}(relation)$ , where condition is a Boolean expression
  - Terms in the condition are comparisons between two fields (or a field and a constant)
  - Using one of the comparison operators:  $\langle , \leq , =, \neq , \geq , \rangle$
  - Terms may be connected by ∧ (and), or ∨ (or),
  - Terms may be negated using ¬ (not)

# **Selection Example**



#### **Customer**

| sin | firstName | lastName | birth |
|-----|-----------|----------|-------|
| 111 | Buffy     | Summers  | 1981  |
| 222 | Xander    | Harris   | 1981  |
| 333 | Cordelia  | Chase    | 1980  |
| 444 | Rupert    | Giles    | 1955  |
| 555 | Dawn      | Summers  | 1984  |



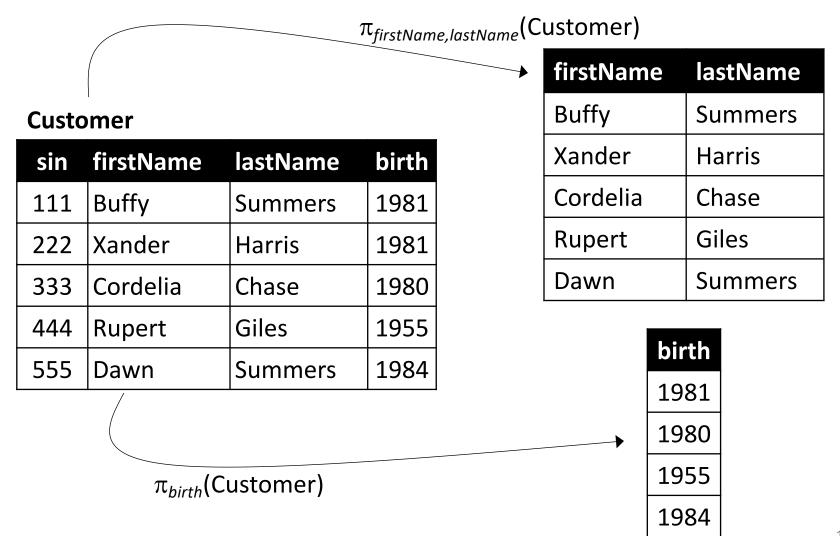
| sin | firstName | lastName | birth |
|-----|-----------|----------|-------|
| 333 | Cordelia  | Chase    | 1980  |
| 444 | Rupert    | Giles    | 1955  |

| sin | firstName | lastName | birth |
|-----|-----------|----------|-------|
| 111 | Buffy     | Summers  | 1981  |
| 555 | Dawn      | Summers  | 1984  |

### **Projection**

- The projection operator,  $\pi$  (pi), specifies the columns to be retained from the input relation
- A selection has the form:  $\pi_{columns}(relation)$ 
  - Where columns is a comma separated list of column names
  - The list contains the names of the columns to be retained in the result relation

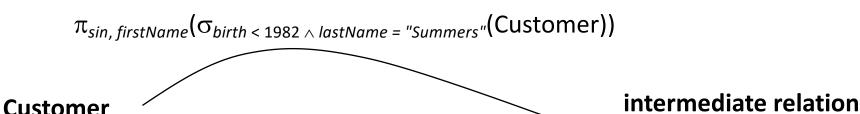
# **Projection Example**



### **Selection and Projection Notes**

- Selection and projection eliminate duplicates
  - Since relations are sets
- Both operations require one input relation
- The schema of the result of a selection is *the same as* the schema of the input relation
- The schema of the result of a projection contains just those attributes in the projection list

#### **Composing Selection and Projection**

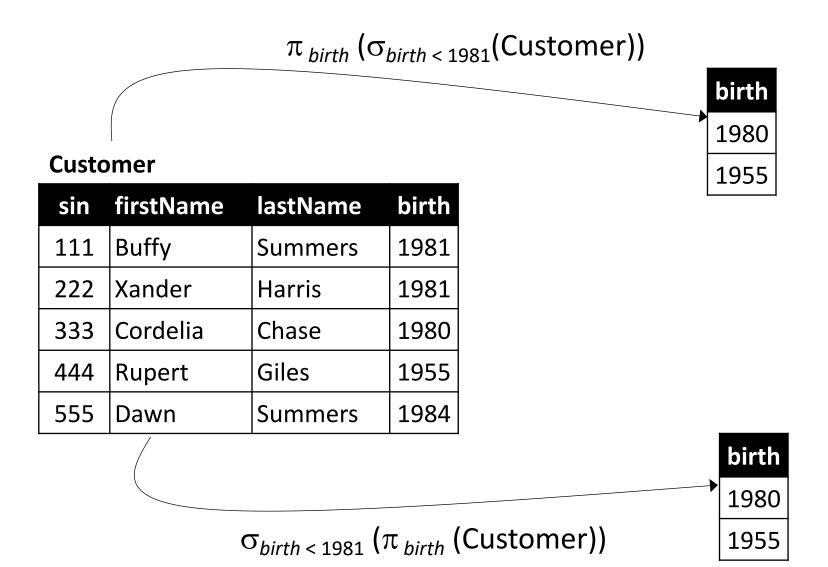


| sin | firstName | lastName | birth |
|-----|-----------|----------|-------|
| 111 | Buffy     | Summers  | 1981  |
| 222 | Xander    | Harris   | 1981  |
| 333 | Cordelia  | Chase    | 1980  |
| 444 | Rupert    | Giles    | 1955  |
| 555 | Dawn      | Summers  | 1984  |

| sin | firstName | lastName | birth |
|-----|-----------|----------|-------|
| 111 | Buffy     | Summers  | 1981  |



#### **Composing Selection and Projection**



### **Commutative property**

- For example:
  - x + y = y + x
  - x \* y = y \* x

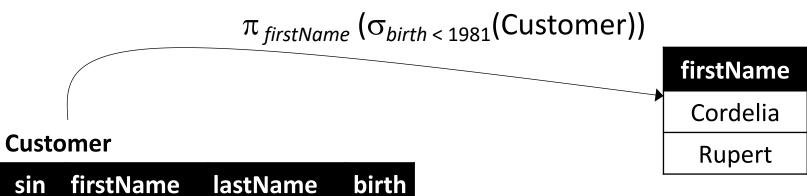
Does it hold for projection and selection?

$$\pi_{columns}(\sigma_{condition}(R)) = \pi_{condition}(\sigma_{columns}(R))$$
?

What about

$$\pi_{firstName}(\sigma_{birth < 1981} \text{ (Customer)})?$$

# **Commutative property**



| sin | firstName | lastName | birth |
|-----|-----------|----------|-------|
| 111 | Buffy     | Summers  | 1981  |
| 222 | Xander    | Harris   | 1981  |
| 333 | Cordelia  | Chase    | 1980  |
| 444 | Rupert    | Giles    | 1955  |
| 555 | Dawn      | Summers  | 1984  |

firstName

Cordelia

Rupert

 $\pi_{firstName}$  ( $\sigma_{birth < 1981}$  ( $\pi_{firstName, birth}$  (Customer)))

### **Set Operations Review**

$$A = \{1, 3, 6\}$$

$$B = \{1, 2, 5, 6\}$$

Union ( $\cup$ )

$$A \cup B \equiv B \cup A$$

$$A \cup B = \{1, 2, 3, 5, 6\}$$

Intersection( $\cap$ )

$$A \cap B \equiv B \cap A$$

$$A \cap B = \{1, 6\}$$

Set Difference(–)

$$A - B \neq B - A$$

$$A - B = \{3\}$$

$$B - A = \{2, 5\}$$

### **Union Compatible Relations**

A op B = 
$$R_{result}$$

- where op =  $\cup$ ,  $\cap$ , or -
- A and B must be union compatible
  - Same number of fields
  - Field i in each schema have the same type

### **Union Compatible Relations**

#### **Intersection of the Employee and Customer relations**

#### **Customer**

| sin | firstName | lastName | birth |
|-----|-----------|----------|-------|
| 111 | Buffy     | Summers  | 1981  |
| 222 | Xander    | Harris   | 1981  |
| 333 | Cordelia  | Chase    | 1980  |
| 444 | Rupert    | Giles    | 1955  |
| 555 | Dawn      | Summers  | 1984  |

#### **Employee**

| sin | firstName | lastName | salary   |
|-----|-----------|----------|----------|
| 208 | Clark     | Kent     | 80000.55 |
| 111 | Buffy     | Summers  | 22000.78 |
| 412 | Carol     | Danvers  | 64000.00 |

The two relations are not union compatible as birth is a DATE and salary is a REAL

We can carry out preliminary operations to make the relations union compatible

 $\pi_{sin, firstName, lastName}$  (Customer)  $\cap \pi_{sin, firstName, lastName}$  (Employee)

### **Union Compatible Relations**

A op B = 
$$R_{result}$$

- where op =  $\cup$ ,  $\cap$ , or -
- A and B must be union compatible
  - Same number of fields
  - Field I in each schema have the same type

Result schema borrowed from A

$$A(age int) \cup B(num int) = R_{result} (age int)$$

# Union

Α

| sin | firstName | lastName |
|-----|-----------|----------|
| 111 | Buffy     | Summers  |
| 222 | Xander    | Harris   |
| 333 | Cordelia  | Chase    |
| 444 | Rupert    | Giles    |
| 555 | Dawn      | Summers  |

В

| sin | firstName | lastName |
|-----|-----------|----------|
| 208 | Clark     | Kent     |
| 111 | Buffy     | Summers  |
| 412 | Carol     | Danvers  |

 $\mathsf{A} \cup \mathsf{B}$ 

| sin | firstName | lastName |
|-----|-----------|----------|
| 111 | Buffy     | Summers  |
| 222 | Xander    | Harris   |
| 333 | Cordelia  | Chase    |
| 444 | Rupert    | Giles    |
| 555 | Dawn      | Summers  |
| 208 | Clark     | Kent     |
| 412 | Carol     | Danvers  |

#### **Set Difference**

Δ

| sin | firstName | lastName |
|-----|-----------|----------|
| 111 | Buffy     | Summers  |
| 222 | Xander    | Harris   |
| 333 | Cordelia  | Chase    |
| 444 | Rupert    | Giles    |
| 555 | Dawn      | Summers  |

A - B

| sin | firstName lastName |         |  |  |
|-----|--------------------|---------|--|--|
| 222 | Xander             | Harris  |  |  |
| 333 | Cordelia           | Chase   |  |  |
| 444 | Rupert             | Giles   |  |  |
| 555 | Dawn               | Summers |  |  |

B

| sin | firstName | lastName |
|-----|-----------|----------|
| 208 | Clark     | Kent     |
| 111 | Buffy     | Summers  |
| 412 | Carol     | Danvers  |

B - A

| sin | firstName | lastName |  |  |
|-----|-----------|----------|--|--|
| 208 | Clark     | Kent     |  |  |
| 412 | Carol     | Danvers  |  |  |

#### **Note on Set Difference**

- Notice that most operators are monotonic
  - Increasing size of inputs → outputs grow
- Set Difference is non-monotonic
  - Example: A − B
  - Increasing the size of B could decrease output size

- Set difference is blocking:
  - For A B, must wait for all B tuples before any results

#### Intersection

#### Α

| sin | firstName lastName |         |  |
|-----|--------------------|---------|--|
| 111 | Buffy              | Summers |  |
| 222 | Xander             | Harris  |  |
| 333 | Cordelia           | Chase   |  |
| 444 | Rupert             | Giles   |  |
| 555 | Dawn               | Summers |  |

В

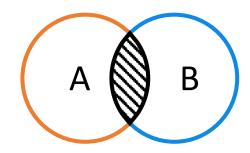
| sin | firstName | lastName |
|-----|-----------|----------|
| 208 | Clark     | Kent     |
| 111 | Buffy     | Summers  |
| 412 | Carol     | Danvers  |

 $\mathsf{A} \cap \mathsf{B}$ 

| sin | firstName | lastName |
|-----|-----------|----------|
| 111 | Buffy     | Summers  |

#### **Note on Intersect**

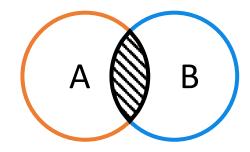
• A  $\cap$  B = R<sub>result</sub>



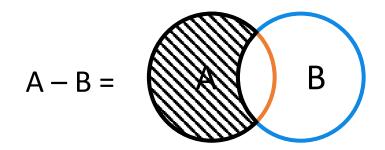
- Can we express using other operators?
  - $A \cap B = ?$

#### **Note on Intersect**

•  $A \cap B = R_{result}$ 



- Can we express using other operators?
  - $A \cap B = A (A B)$



#### **Cartesian Product**

$$A(a_1, ..., a_n) \times B(a_{n+1}, ..., a_m) = R_{result}(a_1, ..., a_m)$$

- Each row of A paired with each row of B
  - Result schema concats A and B's fields
  - Names are inherited if possible (i.e. if not duplicated)
    - If two field names are the same (i.e., a *naming conflict* occurs) and the affected columns are referred to by position
  - If R contains m records, and S contains n records, the result relation will contain m \* n records

### **Cartesian Product Example**

#### $\sigma_{lastName = "Summers"}$ (Customer)

| sin | firstName | lastName | birth |
|-----|-----------|----------|-------|
| 111 | Buffy     | Summers  | 1981  |
| 555 | Dawn      | Summers  | 1984  |

#### Account

| acc | type | balance  | sin |
|-----|------|----------|-----|
| 01  | CHQ  | 2101.76  | 111 |
| 02  | SAV  | 11300.03 | 333 |
| 03  | CHQ  | 20621.00 | 444 |

#### $\sigma_{lastName = "Summers"}$ (Customer) × Account

| 1   | firstName | lastName | birth | acc | type | balance  | 8   |
|-----|-----------|----------|-------|-----|------|----------|-----|
| 111 | Buffy     | Summers  | 1981  | 01  | CHQ  | 2101.76  | 111 |
| 111 | Buffy     | Summers  | 1981  | 02  | SAV  | 11300.03 | 333 |
| 111 | Buffy     | Summers  | 1981  | 03  | CHQ  | 20621.00 | 444 |
| 555 | Dawn      | Summers  | 1984  | 01  | CHQ  | 2101.76  | 111 |
| 555 | Dawn      | Summers  | 1984  | 02  | SAV  | 11300.03 | 333 |
| 555 | Dawn      | Summers  | 1984  | 03  | CHQ  | 20621.00 | 444 |

### Renaming

- It is sometimes useful to assign names to the results of a relational algebra query
- The rename operator,  $\rho$  (rho)
  - $\rho_s(R)$  renames a relation
  - $\rho_{S(a1,a2,...,an)}(R)$  renames a relation and its attributes
  - $\rho_{\text{new/old}}(R)$  renames specified attributes

#### R

| sid1 | firstName | lastName | birth | acc | type | balance  | sid2 |
|------|-----------|----------|-------|-----|------|----------|------|
| 111  | Buffy     | Summers  | 1981  | 01  | CHQ  | 2101.76  | 111  |
| 111  | Buffy     | Summers  | 1981  | 02  | SAV  | 11300.03 | 333  |
| 111  | Buffy     | Summers  | 1981  | 03  | CHQ  | 20621.00 | 444  |
| 555  | Dawn      | Summers  | 1984  | 01  | CHQ  | 2101.76  | 111  |
| 555  | Dawn      | Summers  | 1984  | 02  | SAV  | 11300.03 | 333  |
| 555  | Dawn      | Summers  | 1984  | 03  | CHQ  | 20621.00 | 444  |

 $\rho_{\text{sid}1/1, \text{sid}2/8}(R)$ 

### **Largest Balance**

- Find the account with the largest balance; return accNumber
  - Find accounts which are less than some other account

```
\sigma_{account.balance < d.balance} (Account × \rho_d (Account))
```

2. Use set difference to find the account with the largest balance

```
\pi_{accNumber} (Account) – \pi_{account,accNumber} (\sigma_{account,balance} < d.balance (Account × \rho_d (Account)))
```

### Relational Algebra Operators

- Core 5 operations
  - Selection ( $\sigma$ )
  - Projection  $(\pi)$
  - Union (**U**)
  - Set Difference (-)
  - Cross product (X)
- Additional operations
  - Rename (p)
  - Intersect (∩)
  - Join (⋈)

### Relational Algebra Exercises

- Student (sID, lastName, firstName, cgpa)
  - 101, Jordan, Michael, 3.8
- Offering (oID, dept, cNum, term, instructor)
  - abc, CMPT, 354, Fall 2018, Jiannan
- Took (sID, oID, grade)
  - 101, abc, 95

1. sID of all students who have earned some grade over 80 and some grade below 50.

$$\pi_{sID}(\sigma_{grade > 80}(Took)) \cap \pi_{sID}(\sigma_{grade < 50}(Took))$$

### Relational Algebra Exercises

- Student (sID, lastName, firstName, cgpa)
  - 101, Jordan, Michael, 3.8
- Offering (oID, dept, cNum, term, instructor)
  - abc, CMPT, 354, Fall 2018, Jiannan
- Took (sID, oID, grade)
  - 101, abc, 95

#### 2. Student number of all students who have taken CMPT 354

 $\pi_{SID}$  ( $\sigma_{Offering.oID} = Took.oID \land dept = 'CMPT' \land cNum = 354$  (Offering x Took))

## (Inner) Joins

- Motivation
  - Simplify some queries that require a Cartesian product
- Natural Join:  $R \bowtie S = \pi_A(\sigma_\theta(R \times S))$
- Theta Join:  $R \bowtie_{\theta} S = \sigma_{\theta}(R \times S)$

- Equijoin:  $R \bowtie_{\theta} S = \sigma_{\theta} (R \times S)$ 
  - Join condition  $\theta$  consists only of equalities

### **Natural Join**

- There is often a natural way to join two relations
  - Join based on common attributes
  - Eliminate duplicate common attributes from the result

#### **Customer**

| sin | firstName | lastName | birth |
|-----|-----------|----------|-------|
| 111 | Buffy     | Summers  | 1981  |
| 222 | Xander    | Harris   | 1981  |
| 333 | Cordelia  | Chase    | 1980  |
| 444 | Rupert    | Giles    | 1955  |

#### **Employee**

| sin | firstName | lastName | salary   |
|-----|-----------|----------|----------|
| 208 | Clark     | Kent     | 80000.55 |
| 111 | Buffy     | Summers  | 22000.78 |
| 396 | Dawn      | Allen    | 41000.21 |

#### **Customer** ⋈ **Employee**

| sin | firstName | lastName | birth | salary   |
|-----|-----------|----------|-------|----------|
| 111 | Buffy     | Summers  | 1981  | 22000.78 |

### **Natural Join**

### $R \bowtie S$

- Meaning:  $R \bowtie S = \pi_A(\sigma_\theta (R \times S))$
- Where:
  - Selection  $\sigma_{\theta}$  checks equality of all common attributes (i.e., attributes with same names)
  - Projection  $\pi_A$  eliminates duplicate common attributes
- The natural join of two tables with no fields in common is the Cartesian product
  - Not the empty set

### **Natural Join Example**

R

S

| Α   | В        | С       | D    |
|-----|----------|---------|------|
| 111 | Buffy    | Summers | 1981 |
| 222 | Xander   | Harris  | 1981 |
| 333 | Cordelia | Chase   | 1980 |
| 444 | Rupert   | Giles   | 1955 |

| Α   | В     | C       | E        |
|-----|-------|---------|----------|
| 208 | Clark | Kent    | 80000.55 |
| 111 | Buffy | Summers | 22000.78 |
| 396 | Dawn  | Allen   | 41000.21 |

$$R \bowtie S = \pi_{A,B,C,D,E}(\sigma_{R.A=S.A \land R.B=S.B \land R.C=S.C}(R \times S))$$

| Α   | В     | С       | D    | E        |
|-----|-------|---------|------|----------|
| 111 | Buffy | Summers | 1981 | 22000.78 |

### Theta Join

$$R \bowtie_{\theta} S = \sigma_{\theta}(R \times S)$$

- Most general form
  - $\theta$  can be any condition
- No projection in this case!
  - Result schema same as cross product

# Theta Join Example

#### Customer

| sin | firstName | lastName | birth |
|-----|-----------|----------|-------|
| 111 | Buffy     | Summers  | 1981  |
| 222 | Xander    | Harris   | 1981  |
| 333 | Cordelia  | Chase    | 1980  |
| 444 | Rupert    | Giles    | 1955  |
| 555 | Dawn      | Summers  | 1984  |

#### **Employee**

| sin | firstName | lastName | salary   |
|-----|-----------|----------|----------|
| 208 | Clark     | Kent     | 80000.55 |
| 111 | Buffy     | Summers  | 22000.78 |
| 412 | Carol     | Danvers  | 64000.00 |

#### **Customer** ⋈ Customer.sin < Employee.sin Employee

| 1   | 2        | 3       | birth | 5   | 6     | 7       | salary   |
|-----|----------|---------|-------|-----|-------|---------|----------|
| 111 | Buffy    | Summers | 1981  | 208 | Clark | Kent    | 80000.55 |
| 111 | Buffy    | Summers | 1981  | 412 | Carol | Danvers | 64000.00 |
| 222 | Xander   | Harris  | 1981  | 412 | Carol | Danvers | 64000.00 |
| 333 | Cordelia | Chase   | 1980  | 412 | Carol | Danvers | 64000.00 |

41

### **Equi-Joins**

$$R \bowtie_{\theta} S = \sigma_{\theta}(R \times S)$$

• A theta join where  $\theta$  is an equality predicate

#### Customer

| sin | firstName | lastName | birth |
|-----|-----------|----------|-------|
| 111 | Buffy     | Summers  | 1981  |
| 222 | Xander    | Harris   | 1981  |
| 333 | Cordelia  | Chase    | 1980  |
| 444 | Rupert    | Giles    | 1955  |

#### **Employee**

| sin | firstName | lastName | salary   |
|-----|-----------|----------|----------|
| 208 | Clark     | Kent     | 80000.55 |
| 111 | Buffy     | Summers  | 22000.78 |
| 396 | Dawn      | Allen    | 41000.21 |

#### Customer ⋈<sub>Customer.sin</sub> = Employee.sin Employee

| 1   | 2     | 3       | birth | 5   | 6     | 7       | salary   |    |
|-----|-------|---------|-------|-----|-------|---------|----------|----|
| 111 | Buffy | Summers | 1981  | 111 | Buffy | Summers | 22000.78 | 42 |

# (Inner) Joins Summary

- Natural Join:  $R \bowtie S = \pi_A (\sigma_{\theta}(R \times S))$ 
  - Equality on all fields with same name in R and in S
  - Projection  $\pi_A$  drops all redundant attributes
- Theta Join:  $R \bowtie_{\theta} S = \sigma_{\theta} (R \times S)$ 
  - Join of R and S with a join condition  $\theta$
  - Cross-product followed by selection  $\theta$
  - No projection
- Equijoin:  $R \bowtie_{\theta} S = \sigma_{\theta} (R \times S)$ 
  - Join condition  $\theta$  consists only of equalities
  - No projection

# Relational Algebra Exercises

- Student (sID, lastName, firstName, cgpa)
  - 101, Jordan, Michael, 3.8
- Course (dept, cNum, name, breadth)
  - CMPT, 354, DB, True
- Offering (oID, dept, cNum, term, instructor)
  - abc, CMPT, 354, Fall 2018, Jiannan
- Took (sID, oID, grade)
  - 101, abc, 95

The names of all students who have passed a breadth course (grade >= 60 and breadth = True) with Martin

## Different Plans, Same Results

• Semantic equivalence: results are always the same

$$\pi_{\text{name}}(\sigma_{\text{cNum}=354} (R \bowtie S))$$

$$\pi_{\text{name}}(\sigma_{\text{cNum}=354}(R) \bowtie S)$$

- Are they equivalent?
- Which one is more efficient?
- Can you make it even more efficient?

## **Other Operators**

- There are additional relational algebra operators
  - Usually used in the context of query optimization
- Duplicate elimination  $\delta$ 
  - Used to turn a bag into a set
- Aggregation operators
  - e.g. sum, average
- Grouping  $\gamma$ 
  - Used to partition tuples into groups
    - Typically used with aggregation

## Summary

- Relational Algebra (RA) operators
  - Five core operators: selection, projection, cross-product, union and set difference
  - Additional operators are defined in terms of the core operators: rename, intersection, join
- Theorem: SQL and RA can express exactly the same class of queries
- Multiple RA queries can be equivalent
  - Same semantics but difference performance
  - Form basis for optimizations

# Acknowledge

- Some lecture slides were copied from or inspired by the following course materials
  - "W4111: Introduction to databases" by Eugene Wu at Columbia University
  - "CSE344: Introduction to Data Management" by Dan Suciu at University of Washington
  - "CMPT354: Database System I" by John Edgar at Simon Fraser University
  - "CS186: Introduction to Database Systems" by Joe Hellerstein at UC Berkeley
  - "CS145: Introduction to Databases" by Peter Bailis at Stanford
  - "CS 348: Introduction to Database Management" by Grant Weddell at University of Waterloo