## Relational Algebra

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## Supplemental Materials

Helpful References

https://en.wikipedia.org/wiki/Relational\_algebra

Relational algebra is the basis for the most popular query language on earth

# What's a Query Language?

Allows 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 (very) large databases
```

# Today Scaling to large datasets is a reality Powerful way to think about... data algorithms that scale asynchronous/parallel programming

## 2 Formal Relational Query Languages

#### Relational Algebra

Operational, used to represent execution plans

```
\pi_{\text{name}}(\sigma_{\text{age}<30}(\text{Sailors})) sailor names younger than 30
```

#### Relational Calculus

```
Logical, describes what data users want (declarative) \{s: name \mid s \in Sailors \land s.age < 30 \} (this is shorthand)
```

## Journey of a Query

SQL

SELECT ... FROM ...

Relational Algebra

 $\pi_b(P\bowtie Q\bowtie...)$ 

Query Rewriting

 $\pi_b(P\bowtie S)\bowtie Q...)$ 

## Query execution

### **Prelims**

Query is a function over relation instances

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

Schemas of input and output relations are *fixed* and well defined by the query Q.

Positional vs Named field notation

Position easier for formal defs

one-indexed (not 0-indexed!!!)

Named is more readable

Both used in SQL

#### **Prelims**

Relation (for this lecture)

Instance: **set** of tuples (important!)

Schema: list of field names and types (domains)

Students(sid int, name text, major text, gpa int)

How are relations different than generic sets  $(\mathbb{R})$ ?

Can assume item structure due to schema

Some algebra operations (x) need to be modified

Will use this later

## Relational Algebra Overview

Core 5 operations

PROJECT  $(\pi)$ 

SELECT  $(\sigma)$ 

UNION (U)

SET DIFFERENCE (-)

CROSSPRODUCT (x)

Additional operations

RENAME (p)

INTERSECT (∩)

JOIN (⋈)

DIVIDE (/) not on exam

## Instances Used Today: Library

Students, Reservations

RI

sid	rid	day
I	101	10/10
2	102	11/11

Use positional or named field notation

SI

sid	name	gpa	age
1	eugene	4	20
2	barb	3	21
3	tanya	2	88

Fields in query results are inherited from input relations (unless specified)

**S2** 

sid	name	gpa	age
4	aziz	3.2	21
2	barb	3	21
3	tanya	2	88
5	rusty	3.5	21

$$\pi_{\langle attr1,...\rangle}(A) = R_{result}$$

Pick out desired attributes (subset of columns)
Schema is subset of input schema in the projection list

 $\pi_{\langle a,b,c\rangle}(A)$  has output schema (a,b,c) w/ types carried over

**S2** 

sid	name	gpa	age
4	aziz	3.2	21
2	barb	3	21
3	tanya	2	88
5	rusty	3.5	21

$$\pi_{\text{name,age}}(S2) =$$

name	age
aziz	21
barb	21
tanya	88
rusty	21

**S2** 

sid	name	gpa	age
4	aziz	3.2	21
2	barb	3	21
3	tanya	2	88
5	rusty	3.5	21

$$\pi_{\text{name,name,age}}(S2) =$$

name	name	age
aziz	aziz	21
barb	barb	21
tanya	tanya	88
rusty	rusty	21

**S2** 

sid	name	gpa	age
4	aziz	3.2	21
2	barb	3	21
3	tanya	2	88
5	rusty	3.5	21

$$\pi_{age}(S2) = \frac{21}{88}$$

Where did all the rows go? Real systems typically don't remove duplicates by default. Why?

## Project (Positional Notation)

**S2** 

sid	name	gpa	age
4	aziz	3.2	21
2	barb	3	21
3	tanya	2	88
5	rusty	3.5	21

$$\pi_{S2.4}(S2) =$$

age
21
88

### Select

$$\sigma_{}(A) = R_{result}$$

Select subset of rows that satisfy condition *p p*: Boolean expr over constants and attributes in A
Won't have duplicates in result. Why?
Result schema same as input

### Select

SI sid name gpa age 20 4 eugene 2 21 barb 3 3 2 88 tanya

$$\sigma_{age < 30}$$
 (S1) =

sid	name	gpa	age
1	eugene	4	20
2	barb	3	21

$$\pi_{\text{name}}(\sigma_{\text{age} < 30} (S1)) = \begin{bmatrix}
\text{name} \\
\text{eugene} \\
\text{barb}
\end{bmatrix}$$

## Select (Positional Notation)

SI

sid	name	gpa	age
1	eugene	4	20
2	barb	3	21
3	tanya	2	88

$$\sigma_{S1.4<30} (S1) =$$

sid	name	gpa	age
1	eugene	4	20
2	barb	3	21

$$\pi_{\$2}(\sigma_{\$1.4<30}(\$1)) =$$

name	
eugene	
barb	

\$ prefix distinguishes\$2 from the number 2

#### **Commutative Operations**

$$A + B = B + A$$

$$A * B = B * A$$

$$A + (B * C) = (B * C) + A$$

#### **Associative Operations**

$$A + (B + C) = (A + B) + C$$
  
 $A + (B * C) = (A + B) * C$ 

#### **Commutative Operations**

$$A + B = B + A$$

$$A * B = B * A$$

$$A + (B * C) = (B * C) + A$$

#### **Associative Operations**

$$A + (B + C) = (A + B) + C$$
  
 $A + (B * C) = (A + B) * C$ 

$$\pi_{age}(\sigma_{age < 30} (SI))$$

	sid	name	gpa	age	
σ <sub>age&lt;30</sub>	I	eugene	4	20	
	2	barb	3	21	
	3	tanya	2	88	

sid	name	gpa	age
1	eugene	4	20
2	barb	3	21

$$\pi_{age}(\sigma_{age < 30} (SI))$$

		sid	name	gpa	age	
$\Pi_{age}$	I	eugene	4	20		
age		2	barb	3	21	

age
20
21

$$\sigma_{\text{age} < 30}(\mathbf{\pi}_{\text{age}}(SI))$$

age	
20	
21	
88	

$$\sigma_{\text{age} < 30}(\pi_{\text{age}}(SI))$$

age
20
21

Does Project and Select always commute?

$$\mathbf{\pi}_{age}(\sigma_{age < 30} (SI)) = \sigma_{age < 30}(\mathbf{\pi}_{age}(SI))$$

$$\pi_{\text{name}}(\sigma_{\text{age}<30} (SI))$$
?

Does Project and Select commute?

$$\mathbf{\pi}_{\text{age}}(\sigma_{\text{age} < 30} (SI)) = \sigma_{\text{age} < 30}(\mathbf{\pi}_{\text{age}}(SI))$$

$$\mathbf{\pi}_{\text{name}}(\sigma_{\text{age} < 30} (SI)) != \sigma_{\text{age} < 30}(\mathbf{\pi}_{\text{name}}(SI))$$

Does Project and Select commute?

$$\mathbf{\pi}_{age}(\sigma_{age < 30} (SI)) = \sigma_{age < 30}(\mathbf{\pi}_{age}(SI))$$

$$\pi_{\text{name}}(\sigma_{\text{age} < 30} (SI)) := \sigma_{\text{age} < 30}(\pi_{\text{name, age}}(SI))$$

Does Project and Select commute?

$$\mathbf{\pi}_{\text{age}}(\sigma_{\text{age} < 30} (SI)) = \sigma_{\text{age} < 30}(\mathbf{\pi}_{\text{age}}(SI))$$

$$\mathbf{\pi}_{\text{name}}(\sigma_{\text{age} < 30} (SI)) = \mathbf{\pi}_{\text{name}}(\sigma_{\text{age} < 30}(\mathbf{\pi}_{\text{name}, \text{age}}(SI)))$$





## Union, Set-Difference

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

A, B must be union-compatible

Same number of fields

Field i in each schema have same type

Result Schema taken from first relation (A)

A(id int, imgid int) U B(blah int, gloop int) = ?

## Union, Set-Difference

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

A, B must be union-compatible

Same number of fields

Field i in each schema have same type

Result Schema taken from first relation (A)

A(id int, imgid int) U B(blah int, gloop int) = R<sub>result</sub>(id int, imgid int)

## Union, Intersect, Set-Difference

SI

sid	name	gpa	age
1	eugene	4	20
2	barb	3	21
3	tanya	2	88

**S2** 

sid	name	gpa	age
4	aziz	3.2	21
2	barb	3	21
3	tanya	2	88
5	rusty	3.5	21

SIUS2 =

sid	name	gpa	age
I	eugene	4	20
4	aziz	3.2	21
5	rusty	3.5	21
3	tanya	2	88
2	barb	3	21

## Union, Intersect, Set-Difference

SI

sid	name	gpa	age
1	eugene	4	20
2	barb	3	21
3	tanya	2	88

**S2** 

sid	name	gpa	age
4	aziz	3.2	21
2	barb	3	21
3	tanya	2	88
5	rusty	3.5	21

$$SI-S2 =$$

sid	name	gpa	age
1	eugene	4	20

#### Note on Set Difference & Performance

Notice that most operators are monotonic increasing size of inputs  $\rightarrow$  outputs grow if  $A \supseteq B \rightarrow Q(A,T) \supseteq Q(B,T)$  can compute incrementally

Set Difference is not monotonic

if 
$$A \supseteq B$$
  $\rightarrow$   $T-A \subseteq T-B$   
e.g.,  $5 > I$   $\rightarrow$   $9-5 < 9-I$ 

Thus, set difference is blocking:

For T – S, must wait for all S tuples before any results

#### Cross-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, inherit if possible
Names of fields found in both A and B are undefined in result
(some DBMSes set a default)

$$\{(1),(2)\} \times \{(3,4)\} = \{(1,3,4),(2,3,4)\}$$

Not same as mathematical "X", which returns **nested** results: math A  $\times$  B = { (a, b) | a  $\in$  A ^ b  $\in$  B } {(1),(2)}  $\times$  {(3,4)} = { ((1),(3,4)), ((2),(3,4)) }

## **Cross-Product**

SI

sid	name	gpa	age
I	eugene	4	20
2	barb	3	21
3	tanya	2	88

RI

sid	rid	day
I	101	10/10
2	102	11/11

SI	X	R	1	_
----	---	---	---	---

(sid)	name	gpa	age	(sid)	rid	day
I	eugene	4	20	1	101	10/10
2	barb	3	21	1	101	10/10
3	tanya	2	88	I	101	10/10
I	eugene	4	20	2	102	11/11
2	barb	3	21	2	102	11/11
3	tanya	2	88	2	102	11/11

#### Rename (can use positional notation)

p(<newRelationName>(<mappings>), Q)

Explicitly defines/changes field names of schema

Mappings of the form: <input attr> -> <new name>

$$p(C(\$1 \rightarrow sid1,\$5 \rightarrow sid2), S1 \times R1)$$

	Sidi	name	gpa	age	Siuz	ria	day
<b>C</b> =	1	eugene	4	20		101	10/10
	2	barb	3	21		101	10/10
	3	tanya	2	88	1	101	10/10
	I	eugene	4	20	2	102	11/11
	2	barb	3	21	2	102	11/11
	3	tanya	2	88	2	102	11/11

### Rename alternate syntax

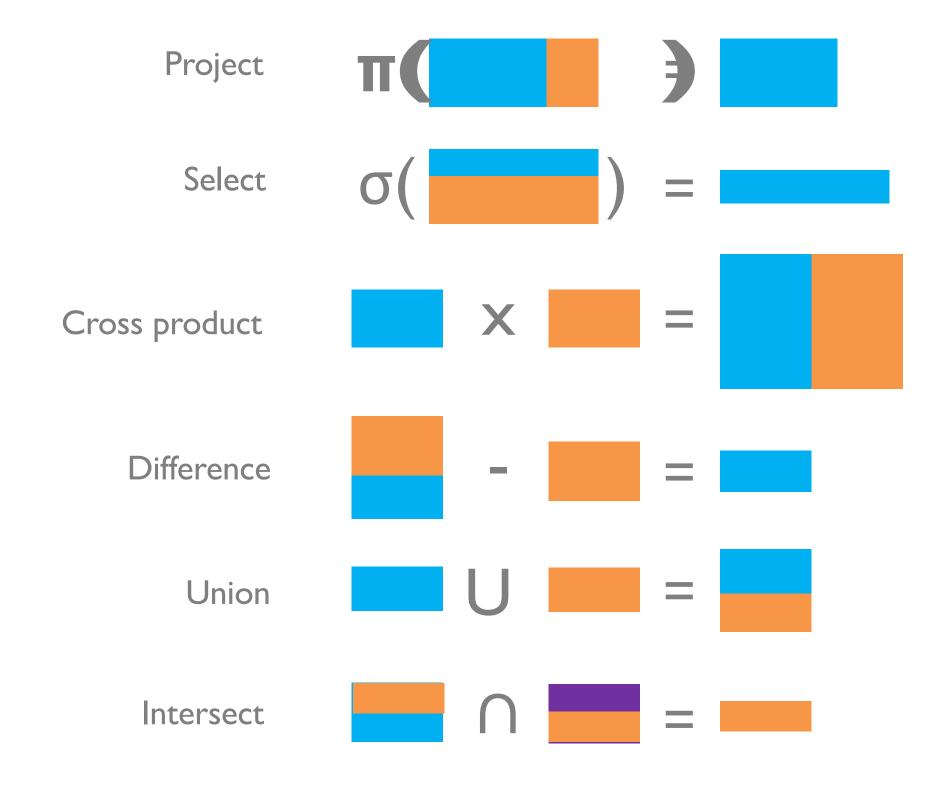
attrnames is list of attributes  $(a_1,...,a_n)$ .

- Same # attrs as output of Q
- a<sub>i</sub> will be assigned i<sup>th</sup> output attribute of Q

$$C = C(sid,rid,day) = RI$$

$$C(foo, bar, baz) = RI$$

sid	rid	day
I	101	10/10
2	102	11/11



#### Compound/Convenience Operators

INTERSECT (∩)

JOIN (⋈)

DIVIDE (/)

$$A \cap B = R_{result}$$

A, B must be union-compatible

SI

sid	name	gpa	age
I	eugene	4	20
2	barb	3	21
3	tanya	2	88

**S2** 

sid	name	gpa	age
4	aziz	3.2	21
2	barb	3	21
3	tanya	2	88
5	rusty	3.5	21

SI∩S2 =

sid	name	gpa	age
2	barb	3	21
3	tanya	2	88

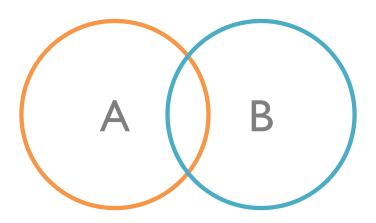
$$A \cap B = R_{result}$$

A, B must be union-compatible

Can we express using core operators?

$$A \cap B = ?$$

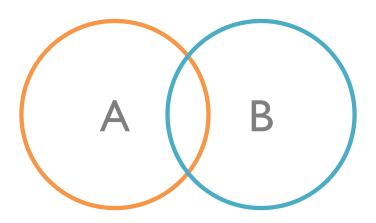
$$A \cap B = R_{result}$$



Can we express using core operators?

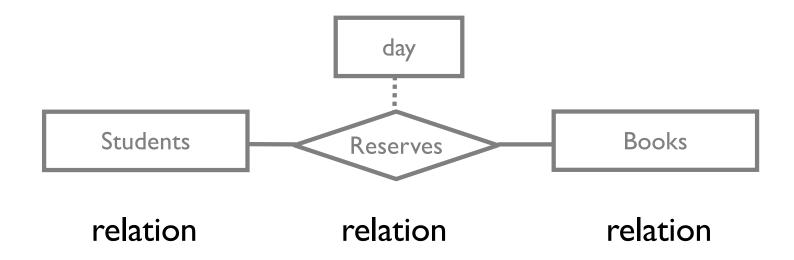
 $A \cap B = A - ?$  (think venn diagram)

$$A \cap B = R_{result}$$



Can we express using core operators?

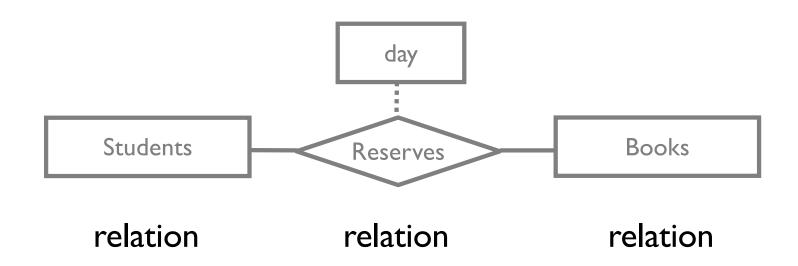
$$A \cap B = A - (A - B)$$



What if you want to query across all three tables? e.g., all names of students that reserved "The Purple Crayon"

#### Need to combine these tables

Cross product? But that ignores foreign key references



SI

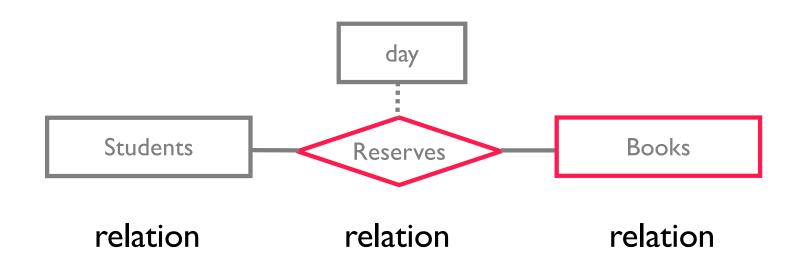
sid	name	gpa	age
I	eugene	4	20
2	barb	3	21
3	tanya	2	88

RI

sid	rid	day
I	101	10/10
2	102	11/11

BI

rid	name
101	The Purple Crayon
102	1984



SI

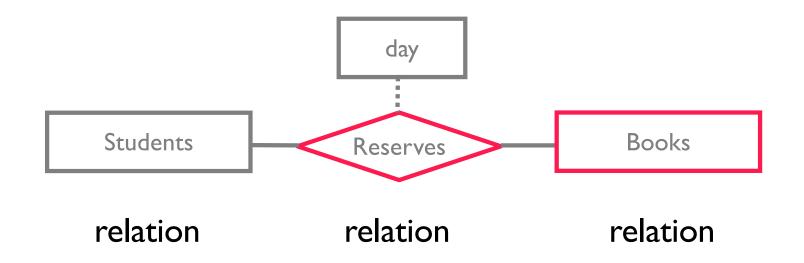
sid	name	gpa	age
1	eugene	4	20
2	barb	3	21
3	tanya	2	88

RI

sid	rid	day
I	101	10/10
2	102	11/11

BI

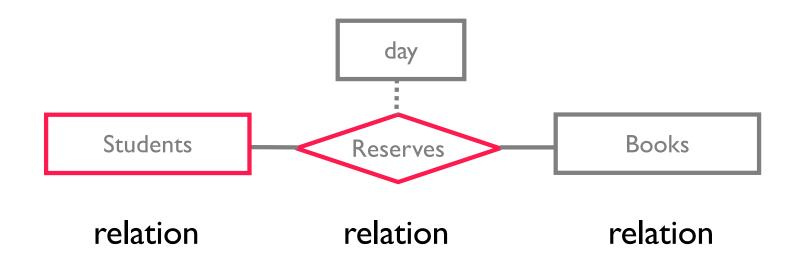
rid	name
101	The Purple Crayon
102	1984



SI RBI

sid	name	gpa	age
I	eugene	4	20
2	barb	3	21
3	tanya	2	88

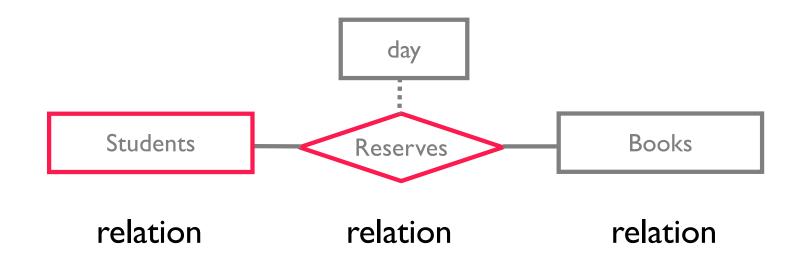
sid	(rid)	day	(rid)	name
I	101	10/10	101	The Purple Crayon
2	102	11/11	102	1984



SI RBI

sid	name	gpa	age
1	eugene	4	20
2	barb	3	21
3	tanya	2	88

sid	(rid)	day	(rid)	name
1	101	10/10	101	The Purple Crayon
2	102	11/11	102	1984



#### SRBI

(sid)	(name)	gpa	age	(sid)	(rid)	day	(rid)	(name)
L	eugene	4	20	1	101	10/10	101	The Purple Crayon
2	barb	3	21	2	102	11/11	102	1984

## Joins

Theta  $(\theta)$  Join Equi-join

$$A \bowtie_{c} B = \sigma_{c}(A \times B)$$

Most general form

Result schema same as cross product

Often far more efficient to compute than cross product

Commutative

$$(A\bowtie_c B)\bowtie_c C = A\bowtie_c (B\bowtie_c C)$$

SI

sid	name	gpa	age
I	eugene	4	20
2	barb	3	21
3	tanya	2	88

sid	rid	day
1	101	10/10
2	102	11/11

```
SI\bowtie_{SI.sid} \leq_{RI.sid} RI = \sigma_{SI.sid} \leq_{RI.sid} (SI \times RI) = \sigma_{SI.sid} (SI \times RI)
```

(sid)	name	gpa	age	(sid)	rid	day
I	eugene	4	20	I	101	10/10
2	barb	3	21	ı	101	10/10
3	tanya	2	88	ı	101	10/10
1	eugene	4	20	2	102	11/11
2	barb	3	21	2	102	11/11
3	tanya	2	88	2	102	11/11

SI

sid	name	gpa	age
I	eugene	4	20
2	barb	3	21
3	tanya	2	88

sid	rid	day
1	101	10/10
2	102	11/11

```
SI \bowtie_{SI.sid \leq RI.sid} RI = 
\sigma_{SI.sid \leq RI.sid}(SI \times RI) =
```

(sid)	name	gpa	age	(sid)	rid	day
ı	eugene	4	20	ı	101	10/10
2	barb	3	21	ı	101	10/10
3	tanya	2	88	ı	101	10/10
ı	eugene	4	20	2	102	11/11
2	barb	3	21	2	102	11/11
3	tanya	2	88	2	102	11/11

SI

sid	name	gpa	age
I	eugene	4	20
2	barb	3	21
3	tanya	2	88

sid	rid	day
1	101	10/10
2	102	11/11

```
SI\bowtie_{SI.sid \leq RI.sid} RI = 
\sigma_{SI.sid \leq RI.sid}(SI \times RI) =
```

(sid)	name	gpa	age	(sid)	rid	day
I	eugene	4	20		101	10/10
ı	eugene	4	20	2	102	11/11
2	barb	3	21	2	102	11/11

### Equi-Join

$$A \bowtie_{attr} B = \pi_{all \ attrs \ except \ B.attr} (A \bowtie_{A.attr = B.attr} B)$$

List the attributes that the two relations will be joined on.

 $A\bowtie_{x,y} B$  is an equijoin on attributes x and y

Special case where the condition is attribute equality Result schema only keeps *one copy* of equality fields Natural Join (AMB):

Equijoin on all shared fields (fields w/ same name)

Not recommended since query results can unexpectedly change if someone changes the schemas (renames an attr)

## Equi-Join

SI

sid	name	gpa	age
I	eugene	4	20
2	barb	3	21
3	tanya	2	88

sid	rid	day
1	101	10/10
2	102	11/11



sid	name	gpa	age	rid	day
I	eugene	4	20	101	10/10
2	barb	3	21	102	11/11

### Equi-Join

SI

sid	name	day	gpa	age
I	eugene	10/10	4	20
2	barb	12/12	3	21
3	tanya	3/3	2	88

RI

sid	rid	day
1	101	10/10
2	102	11/11

 $SI \bowtie_{sid,name} RI = INVALID!$  name not in RI

$$SI\bowtie_{sid,day}RI = \pi_{SI.*,RI.rid}SI\bowtie_{sI.sid=RI.sid \land sI.day} = RI.dayRI$$

$$SI \bowtie RI = SI \bowtie_{sid,day} RI$$

#### Natural Join Example

SI

studid	name	date	gpa	age
I	eugene	10/10	4	20
2	barb	12/12	3	21
3	tanya	3/3	2	88

sid	rid	day
1	101	10/10
2	102	11/11

RI

$$SI \bowtie RI = SI \bowtie_{true} RI$$

semantics of query suddenly changed just by renaming input schema attributes

#### Different Plans, Same Results

Semantic equivalence: results are *always* the same

Note that it is independent of the database instance!

$$\pi_{\text{name}}(\sigma_{\text{rid}=2} (R1) \bowtie SI)$$

# Equivalent Queries

tmp1 = 
$$\sigma_{rid=2}$$
 (R1)  
tmp2 = tmp1  $\bowtie$  SI  
 $\pi_{name}$ (tmp2)

$$\pi_{\text{name}}(\sigma_{\text{rid}=2}(\text{R1}\bowtie\text{SI}))$$

Book(rid, type) Reserve(sid, rid) Student(sid, name)

Need to join DB books with reserve and students  $\sigma_{type='db'}$  (Book)

Book(rid, type) Reserve(sid, rid) Student(sid, name)

Need to join DB books with reserve and students

 $\sigma_{\text{type='db'}}$  (Book)  $\bowtie_{\text{rid}}$  Reserve

Book(rid, type) Reserve(sid, rid) Student(sid, name)

Need to join DB books with reserve and students

 $\sigma_{\text{type='db'}}$  (Book)  $\bowtie_{\text{rid}}$  Reserve  $\bowtie_{\text{sid}}$  Student

Book(rid, type) Reserve(sid, rid) Student(sid, name)

Need to join DB books with reserve and students

 $\pi_{\text{name}}(\sigma_{\text{type='db'}} \text{ (Book)} \bowtie_{\text{rid}} \text{Reserve} \bowtie_{\text{sid}} \text{Student)}$ 

Book(rid, type) Reserve(sid, rid) Student(sid, name)

#### Need to join DB books with reserve and students

 $\pi_{\text{name}}(\sigma_{\text{type}='\text{db}'})$  (Book)  $\bowtie_{\text{rid}}$  Reserve  $\bowtie_{\text{sid}}$  Student)

#### More efficient query

ookrids =  $\pi_{rid} \sigma_{type='db'}$  (Book)  $\pi_{sid}$ (bookrids $\bowtie_{rid}$  Reserve)

Book(rid, type) Reserve(sid, rid) Student(sid, name)

#### Need to join DB books with reserve and students

 $\pi_{\text{name}}(\sigma_{\text{type}='\text{db}'})$  (Book)  $\bowtie_{\text{rid}}$  Reserve  $\bowtie_{\text{sid}}$  Student)

#### More efficient query

bookrids =  $\pi_{rid} \sigma_{type='db'}$  (Book)  $\pi_{name}(\pi_{sid}(bookrids \bowtie_{rid} Reserve) \bowtie_{sid} Student)$ 

Query optimizer can find the more efficient query!

#### Students that reserved DB or HCI book

- I. Find all DB or HCl books
- 2. Find students that reserved one of those books

tmp = 
$$\sigma_{\text{type='DB' v type='HCl'}}$$
 (Book)  
 $\Pi_{\text{name}}$ (tmp  $\bowtie$  Reserve  $\bowtie$  Student)

"v" means logical OR

Alternatives define tmp using UNION (how?)

#### Using UNION

tmpI = 
$$\sigma_{type='DB'}$$
 (Book)  
dbnames =  $\pi_{name}$ (tmpI  $\bowtie$  Reserve  $\bowtie$  Student)

$$tmp2 = \sigma_{type='HCl'}$$
 (Book)

hcinames =  $\pi_{\text{name}}$  (tmp2  $\bowtie$  Reserve  $\bowtie$  Student)

dbnames UNION hcinames

#### Students that reserved a DB and HCl book

Can we change v into ^ (AND)?

tmp = 
$$\sigma_{\text{type='DB' }^{\text{}} \text{ type='HCI'}}$$
 (Book)  
 $\pi_{\text{name}}$ (tmp  $\bowtie$  Reserve  $\bowtie$  Student)



### Why?

```
tmp = \sigma_{\text{type='DB' }^{\text{}} \text{ type='HCl'}} (Book)

\pi_{\text{name}}(tmp \bowtie Reserve \bowtie Student)
```

```
for b in Book:

if b.type = 'DB' and b.type = 'HCl': // resolves to FALSE

for r in Reserve:

for s in Student:

if r.sid = s.sid and r.bid = b.bid:

yield b.name
```

#### Students that reserved a DB and HCI book

#### Does previous approach work?

- Find students that reserved DB books
- 2. Find students that reversed HCl books
- 3. Intersection

tmpDB = 
$$\pi_{sid}(\sigma_{type='DB'}, Book) \bowtie Reserve$$
  
tmpHCl =  $\pi_{sid}(\sigma_{type='HCl'}, Book) \bowtie Reserve$   
 $\pi_{name}((tmpDB\cap tmpHCl) \bowtie Student)$ 

Students where, **for all books**, the student reserved the book no concept of "for all" in relational algebra...

Students – Students that didn't reserve all books

Students where, **for all books**, the student reserved the book no concept of "for all" in relational algebra...

Students – Students where there is a book that they did not reserve

```
Students where, for all books, the student reserved the book
no concept of "for all" in relational algebra...
Students – (Students s where (Books – Books s reserved)) (say s is bob)
                     s_{reserved} = \pi_{bid} \sigma_{sid=bob} (Reserve)
Students – (Students s where (Books – Books s reserved))
               s_{not_reserved} = \pi_{bid}(Books) - s_{reserved}
Students – (Students s where (Books – Books s reserved)) (for each student)
                        \pi_{sid,bid}(Students x Books)
```

```
Students where, for all books, the student reserved the book
no concept of "for all" in relational algebra...
Students – (Students s where (Books – Books s reserved)) (say s is bob)
                     s_{reserved} = \pi_{bid} \sigma_{sid=bob} (Reserve)
Students – (Students s where (Books – Books s reserved))
               s_{not_reserved} = \pi_{bid}(Books) - s_{reserved}
Students – (Students s where (Books – Books s reserved)) (for each student)
                        \pi_{sid,bid}(Students x Books) - \pi_{sid,bid}(Reserve)
```

```
Students where, for all books, the student reserved the book
no concept of "for all" in relational algebra...
Students – (Students s where (Books – Books s reserved)) (say s is bob)
                     s_{reserved} = \pi_{bid} \sigma_{sid=bob} (Reserve)
Students – (Students s where (Books – Books s reserved))
               s_{not_reserved} = \pi_{bid}(Books) - s_{reserved}
Students – (Students s where (Books – Books s reserved)) (for each student)
   del_sids = \pi_{sid}(\pi_{sid,bid}(Students \times Books) - \pi_{sid,bid}(Reserve))
```

```
Students where, for all books, the student reserved the book
no concept of "for all" in relational algebra...
Students – (Students s where (Books – Books s reserved)) (say s is bob)
                     s_{reserved} = \pi_{bid} \sigma_{sid=bob} (Reserve)
Students – (Students s where (Books – Books s reserved))
               s not reserved = \pi_{hid}(Books) - s reserved
Students – (Students s where (Books – Books s reserved)) (for each student)
   del_sids = \pi_{sid}(\pi_{sid,bid}(Students \times Books) - \pi_{sid,bid}(Reserve))
\pi_{sid} (Students) – del_sids
```

# Let's step back

Relational algebra is expressiveness benchmark A language that can express relational algebra is "relationally complete"

```
Limitations
nulls
aggregation
recursion
duplicates
can't really type on keyboard...
```

# Equi-Joins are everywhere

Matching of two sets based on shared attributes

Yelp: Join between your location and restaurants

Market: Join between consumers and suppliers

High five: Join between two hands on time and space

Communication: Join between minds on ideas/concepts



# Who Cares about Relational Alg?

Clean query semantics & rich program analysis

Helps/enables optimization

Opens up rich set of topics

Materialized views

Data lineage/provenance

Query by example

Distributed query execution

• • •

You see its fingerprints EVERYWHERE!

### What can we do with RA?

Query(DB instance)  $\rightarrow$  Relation instance

#### What can we do with RA?

Query(DB instance) = Relation instance

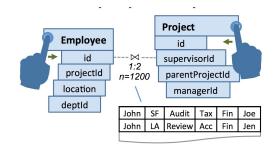
Query by example

Here's DB instance and result, generate the query

Data Generation:

Here's query and result, generate a DB instance

Novel relationally complete interfaces





GestureDB. Nandi et al.

## Summary

Relational Algebra (RA) operators

Operators are closed inputs & outputs are relations

Multiple Relational Algebra queries can be equivalent

It is operational

Same semantics but different performance

Forms basis for optimizations