

# The Relational Model

# Today's Lecture

1. The Relational Model & Relational Algebra
2. Relational Algebra Pt. II

# 1. The Relational Model & Relational Algebra

# What you will learn about in this section

1. The Relational Model
2. Relational Algebra: Basic Operators
3. Execution
4. ACTIVITY: From SQL to RA & Back

# Motivation

The Relational model is **precise**,  
**implementable**, and we can operate on it  
(query/update, etc.)

Database maps internally into this  
*procedural language*.

# A Little History

- Relational model due to Edgar “Ted” Codd, a mathematician at IBM in 1970
  - [A Relational Model of Data for Large Shared Data Banks](#)". [Communications of the ACM](#) **13** (6): 377–387
- IBM didn't want to use relational model (take money from their Information Management System)



Won Turing  
award 1981

# The Relational Model: Schemata

- Relational Schema:

Students(sid: string, name: string, gpa: float)

Relation name

*String, float, int, etc.*  
are the **domains** of  
the attributes

Attributes

# The Relational Model: Data

An attribute (or column) is a typed data entry present in each tuple in the relation

Student

sid	name	gpa
001	Bob	3.2
002	Joe	2.8
003	Mary	3.8
004	Alice	3.5

The number of attributes is the arity of the relation



# The Relational Model: Data

**Student**

sid	name	gpa
001	Bob	3.2
002	Joe	2.8
003	Mary	3.8
004	Alice	3.5

The number of tuples is the **cardinality** of the relation

A **tuple** or **row** (or *record*) is a single entry in the table having the attributes specified by the schema

# The Relational Model: Data

**Student**

sid	name	gpa
001	Bob	3.2
002	Joe	2.8
003	Mary	3.8
004	Alice	3.5

Recall: In practice DBMSs relax the set requirement, and use multisets.

A relational instance is a *set* of tuples all conforming to the same *schema*

# To Reiterate

- A relational schema describes the data that is contained in a relational instance

Let  $R(f_1:\text{Dom}_1, \dots, f_m:\text{Dom}_m)$  be a relational schema then, an instance of  $R$  is a subset of  $\text{Dom}_1 \times \text{Dom}_2 \times \dots \times \text{Dom}_n$

In this way, a relational schema  $R$  is a **total function** from **attribute names** to **types**

# One More Time

- A relational schema describes the data that is contained in a relational instance

A relation  $R$  of arity  $t$  is a function:  
 $R : \text{Dom}_1 \times \dots \times \text{Dom}_t \rightarrow \{0,1\}$

*I.e. returns whether or not a tuple of matching types is a member of it*

Then, the schema is simply the *signature* of the function

Note here that order matters, attribute name doesn't...  
We'll (mostly) work with the other model (last slide) in which **attribute name matters, order doesn't!**

# A relational database

- A relational database schema is a set of relational schemata, one for each relation
- A relational database instance is a set of relational instances, one for each relation

Two conventions:

1. We call relational database instances as simply *databases*
2. We assume all instances are valid, i.e., satisfy the domain constraints

# Remember the CMS

- *Relation DB Schema*

- Students(sid: *string*, name: *string*, gpa: *float*)
- Courses(cid: *string*, cname: *string*, credits: *int*)
- Enrolled(sid: *string*, cid: *string*, grade: *string*)

*Note that the schemas impose effective domain / type constraints, i.e. Gpa can't be "Apple"*

Sid	Name	Gpa
101	Bob	3.2
123	Mary	3.8

Students

Relation  
Instances

sid	cid	Grade
123	564	A

Enrolled

cid	cname	credits
564	564-2	4
308	417	2

Courses

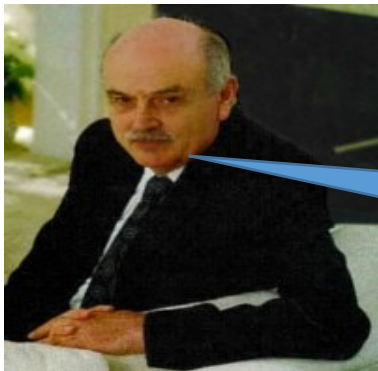
## 2<sup>nd</sup> Part of the Model: Querying

```
SELECT S.name  
FROM Students S  
WHERE S.gpa > 3.5;
```

We don't tell the system *how* or *where* to get the data- **just what we want**, i.e., Querying is declarative

*"Find names of all students  
with GPA > 3.5"*

To make this happen, we need to translate the *declarative* query into a series of operators... we'll see this next!



Actually, I showed how to do this translation for a much richer language!

# Virtues of the model

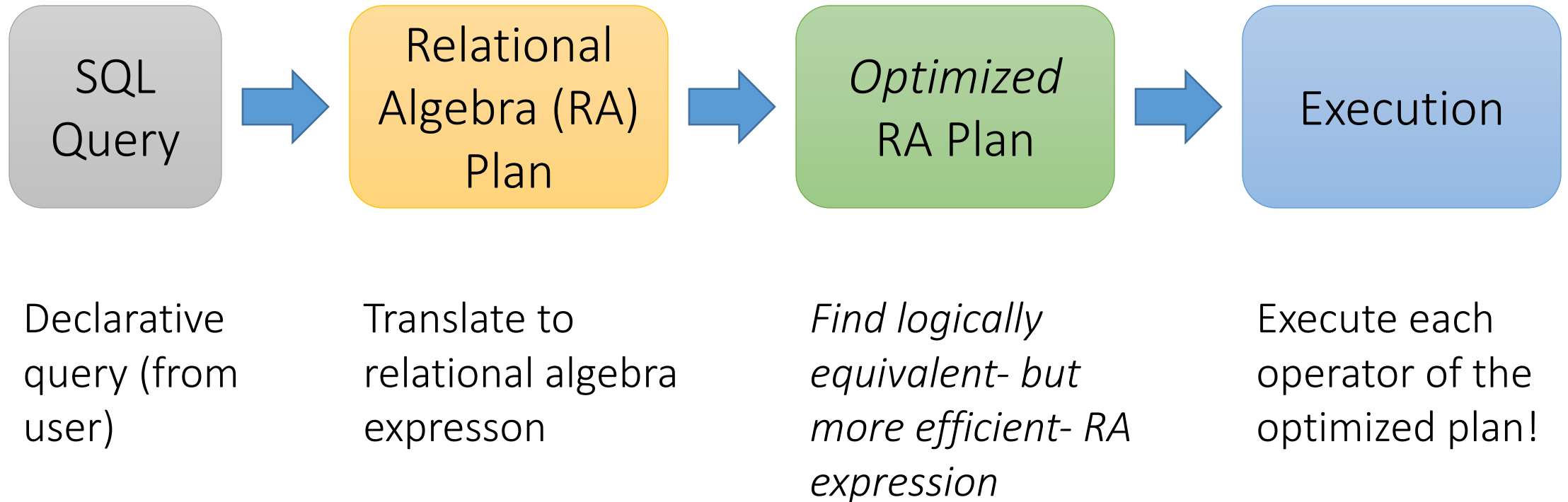
- Physical independence (logical too), Declarative
- Simple, elegant clean: Everything is a relation
- Why did it take multiple years?
  - Doubted it could be done *efficiently*.



# Relational Algebra

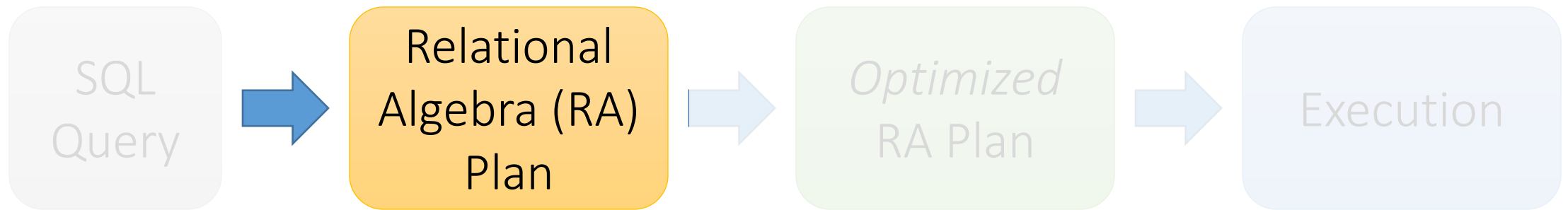
# RDBMS Architecture

How does a SQL engine work ?



# RDBMS Architecture

How does a SQL engine work ?



Relational Algebra allows us to translate declarative (SQL) queries into precise and optimizable expressions!

# Relational Algebra (RA)

- Five **basic** operators:

1. Selection:  $\sigma$
2. Projection:  $\Pi$
3. Cartesian Product:  $\times$
4. Union:  $\cup$
5. Difference:  $-$

We'll look at these first!

- Derived or auxiliary operators:

- Intersection, complement
- Joins (natural, equi-join, theta join, semi-join)
- Renaming:  $\rho$
- Division

*And also at one example of a derived operator (natural join) and a special operator (renaming)*

# Keep in mind: RA operates on sets!

- RDBMSs use *multisets*, however in relational algebra formalism we will consider **sets**!
- Also: we will consider the ***named perspective***, where every attribute must have a unique name
  - → attribute order does not matter...

Now on to the basic RA operators...

# 1. Selection ( $\sigma$ )

- Returns all tuples which satisfy a condition
- Notation:  $\sigma_c(R)$
- Examples
  - $\sigma_{\text{Salary} > 40000}(\text{Employee})$
  - $\sigma_{\text{name} = \text{"Smith"}}(\text{Employee})$
- The condition  $c$  can be  $=, <, \leq, >, \geq, <>$

Students(sid, sname, gpa)

SQL:

```
SELECT *
FROM Students
WHERE gpa > 3.5;
```



RA:

$\sigma_{gpa > 3.5}(\text{Students})$

Another example:

SSN	Name	Salary
1234545	John	200000
5423341	Smith	600000
4352342	Fred	500000

$\sigma_{\text{Salary} > 40000}$  (Employee)



SSN	Name	Salary
5423341	Smith	600000
4352342	Fred	500000

## 2. Projection ( $\Pi$ )

- Eliminates columns, then removes duplicates
- Notation:  $\Pi_{A1, \dots, An}(R)$
- Example: project social-security number and names:
  - $\Pi_{SSN, Name}(Employee)$
  - Output schema: Answer(SSN, Name)

Students(sid, sname, gpa)

SQL:

```
SELECT DISTINCT  
    sname,  
    gpa  
FROM Students;
```



RA:

$\Pi_{sname, gpa}(Students)$



Another example:

SSN	Name	Salary
1234545	John	200000
5423341	John	600000
4352342	John	200000

$\Pi_{\text{Name,Salary}}(\text{Employee})$



Name	Salary
John	200000
John	600000

# Note that RA Operators are Compositional!

Students(sid, sname, gpa)

```
SELECT DISTINCT
  sname,
  gpa
FROM Students
WHERE gpa > 3.5;
```

How do we represent  
this query in RA?


$$\Pi_{sname, gpa}(\sigma_{gpa > 3.5}(Students))$$

$$\sigma_{gpa > 3.5}(\Pi_{sname, gpa}(Students))$$

Are these logically equivalent?

### 3. Cross-Product ( $\times$ )

- Each tuple in R1 with each tuple in R2
- Notation:  $R1 \times R2$
- Example:
  - Employee  $\times$  Dependents
- Rare in practice; mainly used to express joins

```
Students(sid,sname,gpa)  
People(ssn,pname,address)
```

SQL:

```
SELECT *  
FROM Students, People;
```



RA:

*Students  $\times$  People*

Another example: People

ssn	pname	address
1234545	John	216 Rosse
5423341	Bob	217 Rosse

×

Students

sid	sname	gpa
001	John	3.4
002	Bob	1.3

*Students × People*



ssn	pname	address	sid	sname	gpa
1234545	John	216 Rosse	001	John	3.4
5423341	Bob	217 Rosse	001	John	3.4
1234545	John	216 Rosse	002	Bob	1.3
5423341	Bob	216 Rosse	002	Bob	1.3

# Renaming ( $\rho$ )

- Changes the schema, not the instance
- A 'special' operator- neither basic nor derived
- Notation:  $\rho_{B1, \dots, Bn}(R)$
- **Note: this is shorthand for the proper form (since names, not order matters!):**
  - $\rho_{A1 \rightarrow B1, \dots, An \rightarrow Bn}(R)$

Students(sid, sname, gpa)

SQL:

```
SELECT
  sid AS studId,
  sname AS name,
  gpa AS gradePtAvg
FROM Students;
```



RA:

$\rho_{studId, name, gradePtAvg}(Students)$

We care about this operator *because* we are working in a *named perspective*

Another example:

Students

sid	sname	gpa
001	John	3.4
002	Bob	1.3

$\rho_{studId,name,gradePtAvg}(Students)$



Students

studId	name	gradePtAvg
001	John	3.4
002	Bob	1.3

# Natural Join ( $\bowtie$ )

- Notation:  $R_1 \bowtie R_2$
- Joins  $R_1$  and  $R_2$  on *equality of all shared attributes*
  - If  $R_1$  has attribute set  $A$ , and  $R_2$  has attribute set  $B$ , and they share attributes  $A \cap B = C$ , can also be written:  $R_1 \bowtie_C R_2$
- Our first example of a *derived* RA operator:
  - Meaning:  $R_1 \bowtie R_2 = \Pi_{A \cup B}(\sigma_{C=D}(\rho_{C \rightarrow D}(R_1) \times R_2))$
  - Where:
    - The rename  $\rho_{C \rightarrow D}$  renames the shared attributes in one of the relations
    - The selection  $\sigma_{C=D}$  checks equality of the shared attributes
    - The projection  $\Pi_{A \cup B}$  eliminates the duplicate common attributes

```
Students(sid, name, gpa)
People(ssn, name, address)
```

SQL:

```
SELECT DISTINCT
  ssid, S.name, gpa,
  ssn, address
FROM
  Students S,
  People P
WHERE S.name = P.name;
```



RA:

*Students*  $\bowtie$  *People*

Another example:

Students S

sid	S.name	gpa
001	John	3.4
002	Bob	1.3



People P

ssn	P.name	address
1234545	John	216 Rosse
5423341	Bob	217 Rosse

*Students* ⋈ *People*



sid	S.name	gpa	ssn	address
001	John	3.4	1234545	216 Rosse
002	Bob	1.3	5423341	216 Rosse



# Natural Join

- Given schemas  $R(A, B, C, D)$ ,  $S(A, C, E)$ , what is the schema of  $R \bowtie S$  ?
- Given  $R(A, B, C)$ ,  $S(D, E)$ , what is  $R \bowtie S$  ?
- Given  $R(A, B)$ ,  $S(A, B)$ , what is  $R \bowtie S$  ?

# Example: Converting SFW Query -> RA

```
Students(sid, sname, gpa)  
People(ssn, sname, address)
```

```
SELECT DISTINCT  
  gpa,  
  address  
FROM Students S,  
      People P  
WHERE gpa > 3.5 AND  
      sname = pname;
```


$$\Pi_{gpa, address}(\sigma_{gpa > 3.5}(S \bowtie P))$$

How do we represent  
this query in RA?

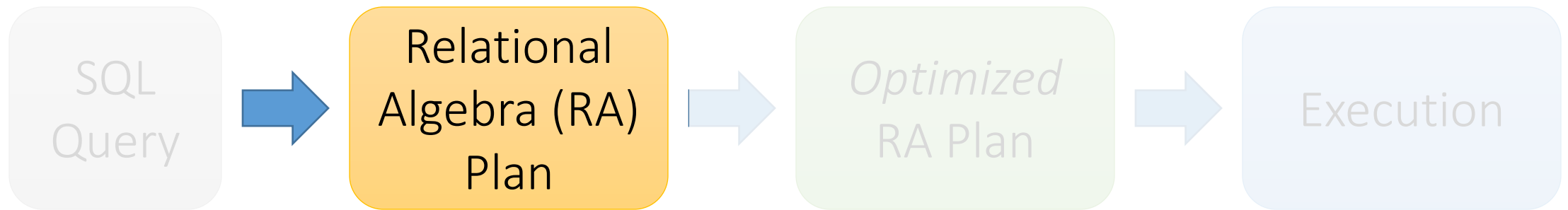
# Logical Equivalence of RA Plans

- Given relations  $R(A,B)$  and  $S(B,C)$ :
  - Here, projection & selection commute:
    - $\sigma_{A=5}(\Pi_A(R)) = \Pi_A(\sigma_{A=5}(R))$
  - What about here?
    - $\sigma_{A=5}(\Pi_B(R)) \stackrel{?}{=} \Pi_B(\sigma_{A=5}(R))$

We'll look at this in more depth later in the lecture...

# RDBMS Architecture

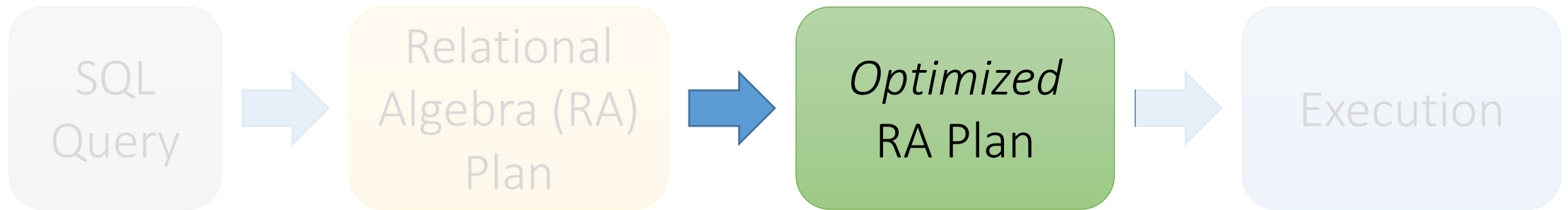
How does a SQL engine work ?



We saw how we can transform declarative SQL queries into precise, compositional RA plans

# RDBMS Architecture

How does a SQL engine work ?



We'll look at how to then optimize these plans later in this class

# RDBMS Architecture

How is the RA “plan” executed?



We already know how to execute all the basic operators!

# RA Plan Execution

- Natural Join / Join:
  - We saw how to use **memory & IO cost considerations to pick the correct algorithm to execute a join with (BNLJ, SMJ, HJ...)**!
- Selection:
  - We saw how to use **indexes to aid selection**
  - Can always fall back on scan / binary search as well
- Projection:
  - The main operation here is finding *distinct* values of the project tuples; we briefly discussed how to do this with e.g. **hashing** or **sorting**

We already know how to execute all the basic operators!

Activity-16-1.ipynb



## 2. Adv. Relational Algebra

# What you will learn about in this section

1. Set Operations in RA
2. Fancier RA
3. Extensions & Limitations

# Relational Algebra (RA)

- Five **basic** operators:

1. Selection:  $\sigma$
2. Projection:  $\Pi$
3. Cartesian Product:  $\times$
4. Union:  $\cup$
5. Difference:  $-$

We'll look at these

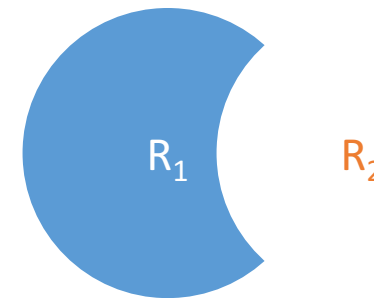
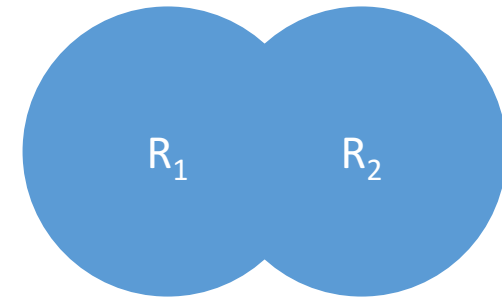
- Derived or auxiliary operators:

- Intersection, complement
- Joins (natural, equi-join, theta join, semi-join)
- Renaming:  $\rho$
- Division

*And also at some of these derived operators*

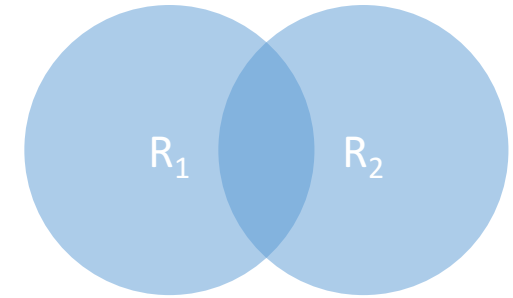
# 1. Union ( $\cup$ ) and 2. Difference ( $-$ )

- $R_1 \cup R_2$
- Example:
  - $\text{ActiveEmployees} \cup \text{RetiredEmployees}$
- $R_1 - R_2$
- Example:
  - $\text{AllEmployees} - \text{RetiredEmployees}$



# What about Intersection ( $\cap$ ) ?

- It is a derived operator
- $R1 \cap R2 = R1 - (R1 - R2)$
- Also expressed as a join!
- Example
  - `UnionizedEmployees`  $\cap$  `RetiredEmployees`



# Fancier RA

# Theta Join ( $\bowtie_{\theta}$ )

- A join that involves a predicate
- $R1 \bowtie_{\theta} R2 = \sigma_{\theta}(R1 \times R2)$
- Here  $\theta$  can be any condition

Note that natural join is a theta join + a projection.

```
Students(sid, sname, gpa)
People(ssn, pname, address)
```

SQL:

```
SELECT *
FROM
  Students, People
WHERE  $\theta$ ;
```



RA:

$Students \bowtie_{\theta} People$

# Equi-join ( $\bowtie_{A=B}$ )

- A theta join where  $\theta$  is an equality
- $R1 \bowtie_{A=B} R2 = \sigma_{A=B} (R1 \times R2)$
- Example:
  - $\text{Employee} \bowtie_{\text{SSN}=\text{SSN}} \text{Dependents}$

Most common join  
in practice!

Students(sid, sname, gpa)  
People(ssn, pname, address)

SQL:

```
SELECT *
FROM
  Students S,
  People P
WHERE sname = pname;
```



RA:

$S \bowtie_{\text{sname}=\text{pname}} P$



# Semijoin ( $\bowtie$ )

- $R \bowtie S = \Pi_{A_1, \dots, A_n} (R \bowtie S)$
- Where  $A_1, \dots, A_n$  are the attributes in  $R$
- Example:
  - $\text{Employee} \bowtie \text{Dependents}$

```
Students(sid, sname, gpa)
People(ssn, pname, address)
```

SQL:

```
SELECT DISTINCT
  sid, sname, gpa
FROM
  Students, People
WHERE
  sname = pname;
```

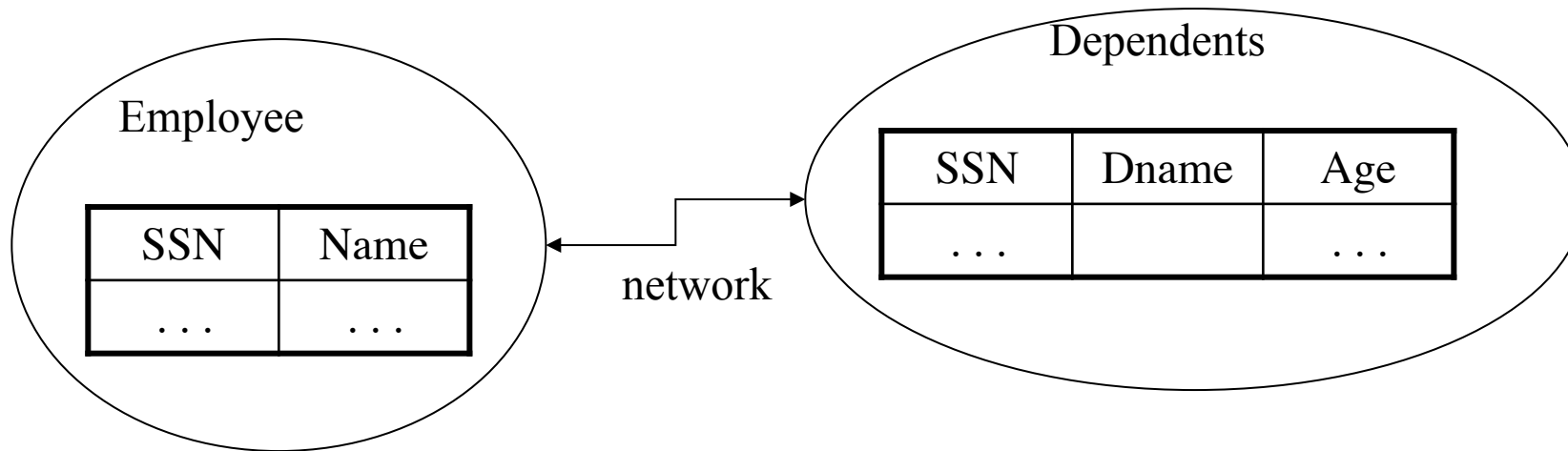


RA:

*Students  $\bowtie$  People*

# Semijoins in Distributed Databases

- Semijoins are often used to compute natural joins in distributed databases



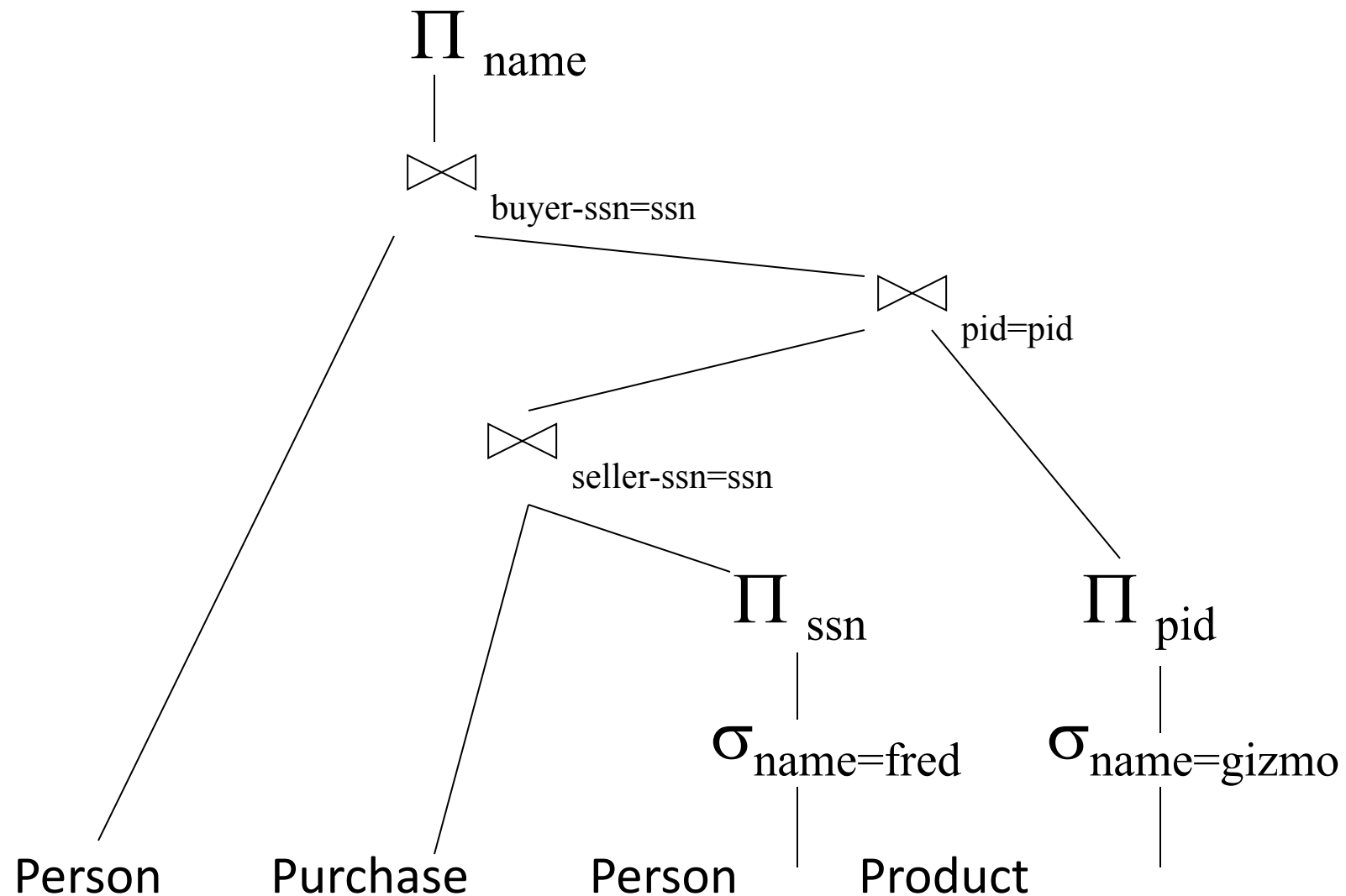
Send less data to  
reduce network  
bandwidth!

$$\text{Employee} \bowtie_{\text{ssn}=\text{ssn}} (\sigma_{\text{age}>71} (\text{Dependents}))$$

$$R = \text{Employee} \bowtie T$$

$T = \Pi_{\text{SSN}} \sigma_{\text{age}>71} (\text{Dependents})$   
 $\text{Answer} = R \bowtie \text{Dependents}$

# RA Expressions Can Get Complex!



# Multisets

# Recall that SQL uses Multisets

Multiset X

Tuple
(1, a)
(1, a)
(1, b)
(2, c)
(2, c)
(2, c)
(1, d)
(1, d)



Equivalent  
Representations  
of a Multiset

$\lambda(\mathbf{X})$  = “Count of tuple in X”  
(Items not listed have  
implicit count 0)

Multiset X

Tuple	$\lambda(\mathbf{X})$
(1, a)	2
(1, b)	1
(2, c)	3
(1, d)	2

Note: In a set all  
counts are  $\{0,1\}$ .

# Generalizing Set Operations to Multiset Operations

Multiset X

Tuple	$\lambda(X)$
(1, a)	2
(1, b)	0
(2, c)	3
(1, d)	0

 $\cap$ 

Multiset Y

Tuple	$\lambda(Y)$
(1, a)	5
(1, b)	1
(2, c)	2
(1, d)	2

 $=$ 

Multiset Z

Tuple	$\lambda(Z)$
(1, a)	2
(1, b)	0
(2, c)	2
(1, d)	0

$$\lambda(Z) = \min(\lambda(X), \lambda(Y))$$

For sets, this is  
intersection

# Generalizing Set Operations to Multiset Operations

Multiset X

Tuple	$\lambda(X)$
(1, a)	2
(1, b)	0
(2, c)	3
(1, d)	0

 $\cup$ 

Multiset Y

Tuple	$\lambda(Y)$
(1, a)	5
(1, b)	1
(2, c)	2
(1, d)	2

 $=$ 

Multiset Z

Tuple	$\lambda(Z)$
(1, a)	7
(1, b)	1
(2, c)	5
(1, d)	2

$$\lambda(Z) = \lambda(X) + \lambda(Y)$$

For sets,  
this is union

# Operations on Multisets

All RA operations need to be defined carefully on bags

- $\sigma_C(R)$ : preserve the number of occurrences
- $\Pi_A(R)$ : no duplicate elimination
- Cross-product, join: no duplicate elimination

This is important- relational engines work on multisets, not sets!



# RA has Limitations !

- Cannot compute “transitive closure”

Name1	Name2	Relationship
Fred	Mary	Father
Mary	Joe	Cousin
Mary	Bill	Spouse
Nancy	Lou	Sister

- Find all direct and indirect relatives of Fred
- Cannot express in RA !!!
  - Need to write C program, use a graph engine, or modern SQL...