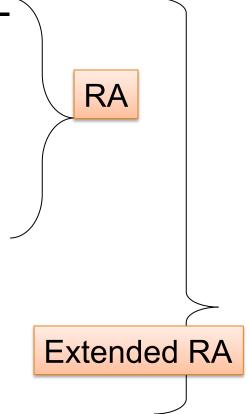
Where we are

- Overview of Data Science
 - We found that and important aspect is Data
 "Munging" / Manipulation / Cleaning / Restructuring /
- Overview of Relational Databases
 - The original problem being addressed:
 - physical data independence
- Secret sauce: an algebra of tables
- This will come up over and over and over....

Most slides adapted from those by
Dan Suciu and Magda Balazinska for
Introduction to Data Management (CSE 344)
at the University of Washington

Relational Algebra Operators

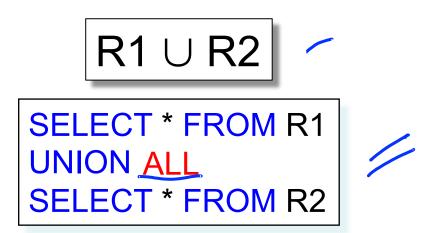
- Union ∪, intersection ∩, difference -
- Selection s
- Projection Π
- Join ⋈
- Duplicate elimination d
- Grouping and aggregation g
- Sorting t



Sets v.s. Bags

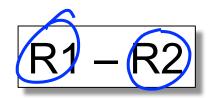
- Sets: {a,b,c}, {a,d,e,f}, { }, . . .
- Bags: {a, a, b, c}, {b, b, b, b, b}, . . .
- Relational Algebra has two semantics:
- Set semantics = standard Relational Algebra
- Bag semantics = extended Relational Algebra
- Rule of thumb:
 - Every paper will assume set semantics
 - Every implementation will assume bag semantics

Union



R1			R2			R1 ∪ R2	
	В			В		Α	В
A	В	 \	Α	В		a1	b1
a1	b1	U	a1.	<u>b1</u>	=	a2	b1
a2	b1	1	a3 •	b4 _		a3	b4
						a1	b1

Difference



SELECT * FROM R1 EXCEPT SELECT * FROM R2

<u>R1</u>		
Α	В	,
a1	b1	
a2	b1	

<u>R2</u>		
Α	В	
a1	b1	_ =
a3	b4	

171 —	112
Α	В
a2	b1

P1 _ P2

What about Intersection?

Derived operator using minus

$$R1 \cap R2 = R1 - (R1 - R2)$$

Derived using join (will explain later)

$$R1 \cap R2 = R1 \bowtie R2$$

Selection

Returns all tuples which satisfy a condition

$$\sigma_{\rm c}(R)$$

- Examples
 - sSalary > 40000 (Employee)
 - sname = "Smith" (Employee)
- The condition c can be =, <, ≤, >, ≥, <>

Employee

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