

## Introduction to Data Management Relational Algebra

Paul G. Allen School of Computer Science and Engineering University of Washington, Seattle

## Announcements

- HW3 due next Friday
- Midterm on Friday, 4/26 in class
- Closed books, no cheat sheet (you won't need it)
- Some practice midterms on the course website


## Quantifiers

## Recap: Predicates on Subqueries

- EXISTS / NOT EXISTS
- IN / NOT IN
- ANY / ALL

The are "equivalent" meaning that a query that you can write using one, you can also write using the others

## Quantifiers

## Find people who drive only cars made after 2017

```
SELECT P.*
FROM Payroll P
WHERE 2017 <
    ALL(SELECT R.Year
        FROM Regist R
        WHERE P.UserID = R.UserID);
```


## Quantifiers

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    FROM Regist R
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WHERE NOT EXISTS
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```

```
SELECT P.*
FROM Payroll P
WHERE P.UserID NOT IN
    (SELECT R.UserID
    FROM Regist R
    WHERE R.Year <= 2017);
```


## Quantifiers

## Find people who drive only cars made after 2017

```
SELECT P.*
FROM Payroll P
WHERE 2017 <
    ALL(SELECT R.Year
        FROM Regist R
        WHERE P.UserID = R.UserID);
```

All these compute the same thing

```
SELECT P.*
FROM Payroll P
WHERE NOT EXISTS
    (SELECT *
    FROM Regist R
    WHERE P.UserID = R.UserID
        and R.Year <= 2017);
```


## Discussion

- SQL can express naturally queries that represent existential quantifiers
- To write a query that uses a universal quantifier, use DeMorgan's laws (next few slides)


## Quantifiers

There are two types of quantifiers:

- Exists $(\exists x, \ldots)$ there is at least 1 that satisfies predicate
- Forall: $(\forall x, \ldots)$ all elements satisfy the predicate


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SQL makes it easy to write exists
To write forall, use double negation
predicate holds forall elements if and only if
not (exists element where not(predicate) holds)

## How to Write FORALL in SQL

Find person P drives only cars made after 2017

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Negate again:
find the other other persons

```
SELECT P.*
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## How to Write FORALL in SQL

## Find person P drives only cars made after 2017

Negate: find the other persons quantifier
Find person P drives some car made on or before 2017

```
SELECT P.*
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WHERE EXISTS
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Negate again:
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## Brief Review of Logic

- Implication: $A \rightarrow B$ is same as: $\operatorname{not}(A)$ or $B$


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- DeMorgan's Laws:

```
not}(A\mathrm{ and B ) = not(A) or not(B)
not}(\textrm{A}\mathrm{ or }B)=\operatorname{not}(\textrm{A})\mathrm{ and not(B)
```


## Brief Review of Logic

- Implication: $A \rightarrow B$ is same as: $\operatorname{not}(A)$ or $B$
- DeMorgan's Laws:

$$
\begin{aligned}
& \operatorname{not}(A \text { and } B)=\operatorname{not}(A) \text { or } \operatorname{not}(B) \\
& \operatorname{not}(A \text { or } B)=\operatorname{not}(A) \text { and } \operatorname{not}(B)
\end{aligned}
$$

$$
\begin{aligned}
& \operatorname{not}(\exists \mathrm{x}, \mathrm{P}(\mathrm{x}))=\forall \mathrm{x}, \operatorname{not}(\mathrm{P}(\mathrm{x})) \\
& \operatorname{not}(\forall \mathrm{x}, \mathrm{P}(\mathrm{x}))=\exists \mathrm{x}, \operatorname{not}(\mathrm{P}(\mathrm{x}))
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- Consequences

$$
A \rightarrow B=\operatorname{not}(A \text { and } \operatorname{not}(B))
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- Implication: $A \rightarrow B$ is same as: $\operatorname{not}(A)$ or $B$
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\end{aligned}
$$

- Consequences

$$
A \rightarrow B=\operatorname{not}(A \text { and } \operatorname{not}(B))
$$

$$
\forall \mathrm{x},(\mathrm{~A}(\mathrm{x}) \rightarrow \mathrm{B}(\mathrm{x}))=\operatorname{not}(\exists \mathrm{x}(\mathrm{~A}(\mathrm{x}) \wedge \operatorname{not}(\mathrm{B}(\mathrm{x}))))
$$

## Brief Review of First Order Logic

Query: persons P that drive only cars made after 2017:
$\forall R \in$ Regist, $($ P. UserID $=$ R. UserID $) \Rightarrow($ R. Year $>2017)$

Negation: persons P that drive some car made on/before 2017:
$\exists \mathrm{R} \in$ Regist, (P. UserID $=$ R. UserID) and (R. Year $\leq 2017$ )

## Discussion

## Writing universally quantified queries in SQL requires creativity

- Try using DeMorgan’s laws
- Try using ALL
- Try using aggregates, checking count=0


## Relational Algebra

## Motivation

- SQL is a declarative language: we say what, we don't say how
- The query optimizer needs to convert the query into some language that can be excecuted
- That language is Relational Algebra


## The Five Basic Relational Operators

1. Selection $\sigma_{\text {condition }}(S)$
2. Projection $\Pi_{\text {attrs }}(S)$
3. Join $R \bowtie_{\theta} S=\sigma_{\theta}(R \times S)$
4. Union U
5. Set difference -

- Rename $\rho$

Let's discuss them one by one

## 1. Selection

## $\sigma_{\text {condition }}(\mathrm{T})$

Returns those tuples in T that satisfy the condition:

```
SELECT *
FROM T
WHERE condition;
```


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## $\sigma_{\text {condition }}(\mathrm{T})$

Returns those tuples in T that satisfy the condition:

```
SELECT *
FROM T
WHERE condition;
```

$\sigma_{\text {salary } \geq 55000}($ Payroll $)=$

Payroll

| UserID | Name | Job | Salary |
| :--- | :--- | :--- | :--- |
| 123 | Jack | TA | 50000 |
| 345 | Allison | TA | 60000 |
| 567 | Magda | Prof | 90000 |
| 789 | Dan | Prof | 100000 |

## 1. Selection

## $\sigma_{\text {condition }}(\mathrm{T})$

| UserID | Name | Job | Salary |
| :--- | :--- | :--- | :--- |
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Returns those tuples in T that satisfy the condition:

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## 1. Selection

## $\sigma_{\text {condition }}(\mathrm{T})$

Returns those tuples in T that satisfy the condition:

```
SELECT *
FROM T
WHERE condition;
```

$$
\sigma_{\text {salary } \geq 55000 \text { and Job='TA }}(\text { Payroll })=
$$

## Payroll

| UserID | Name | Job | Salary |
| :--- | :--- | :--- | :--- |
| 123 | Jack | TA | 50000 |
| 345 | Allison | TA | 60000 |
| 567 | Magda | Prof | 90000 |
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## 1. Selection

## $\sigma_{\text {condition }}(\mathrm{T})$

| UserID | Name | Job | Salary |
| :--- | :--- | :--- | :--- |
| 345 | Allison | TA | 60000 |

Returns those tuples in T that satisfy the condition:

```
SELECT *
FROM T
WHERE condition;
```

$\sigma_{\text {salary } \geq 55000 \text { and } \mathrm{Job}=^{\prime} \mathrm{TA}{ }^{\prime}}($ Payroll $)=\square$

Payroll

| UserID | Name | Job | Salary |
| :--- | :--- | :--- | :--- |
| 123 | Jack | TA | 50000 |
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## 2. Projection

## $\Pi_{\text {attrs }}(\mathrm{T})$

Returns all tuples in T keeping only the attributes in the subscript:

```
SELECT attrs
FROM T;
```


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\Pi_{\text {Name,Salary }}(\text { Payroll })=
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| UserID | Name | Job | Salary |
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## 2. Projection

## $\Pi_{\text {attrs }}(\mathrm{T})$

| Name | Salary |
| :--- | :--- |
| Jack | 50000 |
| Allison | 60000 |
| Magda | 90000 |
| Dan | 100000 |

Returns all tuples in T keeping only the attributes in the subscript:

$$
\Pi_{\text {Name,Salary }}(\text { Payroll })=
$$

```
SELECT attrs
FROM T;
```

Payroll

| UserID | Name | Job | Salary |
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## 2. Projection

## $\Pi_{\text {attrs }}(\mathrm{T})$

Returns all tuples in T keeping only the attributes in the subscript:

$$
\Pi_{\mathrm{Job}}(\text { Payroll })=
$$

```
SELECT attrs
FROM T;
```

Payroll

| UserID | Name | Job | Salary |
| :--- | :--- | :--- | :--- | :--- |
| 123 | Jack | TA | 50000 |
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## 2. Projection

## $\Pi_{\text {attrs }}(\mathrm{T})$

## Job

TA
TA
Prof
Prof

Returns all tuples in T keeping only the attributes in the subscript:

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| UseriD | Name | Job | Salary |
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## 2. Projection

## $\Pi_{\text {attrs }}(\mathrm{T})$ <br> Job <br> TA <br> TA <br> Prof <br> Prof

RA can be defined using bag semantics

TA

We always need to say which one we mean.

Returns all tuples in T keeping only the attributes in the subscript:

$$
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$$

SELECT attrs
FROM T;

Payroll

| UserID | Name | Job | Salary |
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## 3. Join

## $S \bowtie_{\theta} T$

Join $S$ and $T$ using condition $\theta$

SELECT<br>FROM S,T<br>WHERE $\theta$;

$S \bowtie_{\theta} T$

Join $S$ and $T$ using condition $\theta$

$$
\text { Payroll } \bowtie_{\text {UserID=UserID }} \text { Regist }=
$$

```
SELECT *
FROM S,T
WHERE 0;
```

| Payroll |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- |
| UserID | Name | Job | Salary | Regist |  |
| 123 | Jack | TA | 50000 | UserID | Car |
| 345 | Allison | TA | 60000 | 123 | Charger |
| 567 | Magda | Prof | 90000 | 567 | Civic |
| 789 | Dan | Prof | 100000 | 567 | Pinto |

## 3. Join

## $S \bowtie_{\theta} T$

| UserID | Name | Job | Salary | UserID | Car |
| :--- | :--- | :--- | :--- | :--- | :--- |
| 123 | Jack | TA | 50000 | 123 | Charger |
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Join $S$ and $T$ using condition $\theta$

$$
\text { Payroll } \bowtie_{\text {UserID=UserID }} \text { Regist }=
$$

SELECT $*$
FROM S,T
WHERE $\theta$;

| Payroll |  |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :---: |
| UserID | Name | Job | Salary | Regist |  |  |
| 123 | Jack | TA | 50000 | UserlD | Car |  |
| 345 | Allison | TA | 60000 | 123 | Charger |  |
| 567 | Magda | Prof | 90000 | 567 | Civic |  |
| 789 | Dan | Prof | 100000 | 567 | Pinto |  |

## Many Variants of Join

- Eq-join: Payroll $\bowtie_{\text {UserID=UserID }}$ Regist
- Theta-join: Payroll $\bowtie_{\text {UserID<UserID }}$ Regist
- Cartesian product: Payroll×Regist
- Natural Join: Payroll $\bowtie$ Regist


## Many Variants of Join

- Eq-join: Payroll $\bowtie_{\text {UserID }} \widehat{\text { UseriD }}$ Regist
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- Eq-join: Payroll $\bowtie_{\text {UserID }}$ UserID Regist
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## Cartesian Product / Cross Product

## $\mathrm{S} \times \mathrm{T}$

## Cross product of S and T

SELECT *<br>FROM S,T

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## $\mathrm{S} \times \mathrm{T}$

## Cross product of S and T

> Payroll×Regist =

## SELECT * FROM S,T

| Payroll |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- |
| UserID | Name | Job | Salary | Regist |  |
| 123 | Jack | TA | 50000 | UserID | Car |
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## Cartesian Product / Cross Product

## $\mathrm{S} \times \mathrm{T}$

12 tuples $\left\{\begin{array}{l|l|l|l|l|l|}\hline \text { UserID } & \text { Name } & \text { Job } & \text { Salary } & \text { UserID } & \text { Car } \\ \hline 123 & \text { Jack } & \text { TA } & 50000 & 123 & \text { Charger } \\ \hline 123 & \text { Jack } & \text { TA } & 50000 & 567 & \text { Civic } \\ \hline 789 & \text { Dan } & \text { Prof } & 100000 & 567 & \text { Pinto }\end{array}\right.$

## Cross product of S and T

## Payroll $\times$ Regist $=$



## SELECT <br> $\star$ FROM S,T

| Payroll |  |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :---: |
| UserID | Name | Job | Salary | Regist |  |  |
| 123 | Jack | TA | 50000 | UserlD | Car |  |
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## Cartesian Product / Cross Product

## $\mathrm{S} \times \mathrm{T}$

## Cross product of S and T

SELECT *<br>FROM S,T

Join $=$ cartesian product + selection

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

## Natural Join

## $S \bowtie T$

Join S, T on common attributes, retain only one copy of those attributes

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## $S \bowtie T$

Join S, T on common attributes, retain only one copy of those attributes

Payroll $\bowtie$ Regist $=$

| Payroll |  |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :---: |
| UserID | Name | Job | Salary | Regist |  |  |
| 123 | Jack | TA | 50000 | UserlD | Car |  |
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## Natural Join

## $S \bowtie T$

Join S, T on common attributes, retain only one copy of those attributes

| UserID | Name | Job | Salary | Car |  |  |
| :--- | :--- | :--- | :--- | :--- | :---: | :---: |
| 123 | Jack | TA | 50000 | Charger |  |  |
| 567 | Magda | Prof | 90000 | Civic |  |  |
| 567 | Magda | Prof | 90000 | Pinto |  |  |
| Only one <br> UserlD attr |  |  |  |  |  |  |


| Payroll |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- |
| UserID | Name | Job | Salary | Regist |  |
| 123 | Jack | TA | 50000 | UserID | Car |
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## Natural Join

What do these natural joins output?

- $R(A, B) \bowtie S(B, C)$
- $R(A, B) \bowtie S(C, D)$
- $R(A, B) \bowtie S(A, B)$


## Natural Join

What do these natural joins output?

- $R(A, B) \bowtie S(B, C)$

| $R$ | $A$ | $B$ | $S$ | $B$ | $C$ |
| :--- | :--- | :--- | :--- | :--- | :--- |
| 1 | 10 |  | 10 | 8 |  |
| 2 | 10 |  | 10 | 9 |  |
| 2 | 20 |  | 20 | 8 |  |
|  |  |  |  |  |  |
|  |  |  | 70 | 7 |  |

- $R(A, B) \bowtie S(C, D)$
- $R(A, B) \bowtie S(A, B)$


## Natural Join

What do these natural joins output?

- $R(A, B) \bowtie S(B, C)$ equjoin on attribute $B$ (5 tuples)

| $R$ | $A$ | $B$ |
| :--- | :--- | :--- |
|  | 1 | 10 |
| 2 | 10 |  |
|  | 2 | 20 |


| $S$ | $B$ | $C$ |
| :---: | :---: | :---: |
| 10 | 8 |  |
| 10 | 9 |  |
| 20 | 8 |  |
| 50 | 7 |  |

- $R(A, B) \bowtie S(C, D)$
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- $R(A, B) \bowtie S(B, C)$ equjoin on attribute $B$ (5 tuples)

| $R$ | $A$ | $B$ |
| :---: | :---: | :---: |
|  | 1 | 10 |
|  | 2 | 10 |
|  | 2 | 20 |


| $S$ | $B$ | $C$ |
| :--- | :--- | :--- |
| 10 | 8 |  |
| 10 | 9 |  |
| 20 | 8 |  |
| 50 | 7 |  |

- $R(A, B) \bowtie S(C, D)$

| $R$ | $A$ | $B$ |
| :---: | :---: | :---: |
|  | 1 | 10 |
|  | 2 | 10 |
|  | 2 | 20 |


| S | C | D |
| :--- | :--- | :--- |
|  | 8 | $u$ |
| 9 | $v$ |  |
| 8 | $v$ |  |
| 7 | $w$ |  |

- $R(A, B) \bowtie S(A, B)$


## Natural Join

What do these natural joins output?

- $R(A, B) \bowtie S(B, C)$ equjoin on attribute $B$ (5 tuples)

| $\mathbf{R}$ | $\mathbf{A}$ | $\mathbf{B}$ |
| :---: | :---: | :---: |
| $\mathbf{1}$ | 10 |  |
| 2 | 10 |  |
| 2 | 20 |  |


| S | $B$ | $C$ |
| :--- | :--- | :--- |
| 10 | 8 |  |
| 10 | 9 |  |
| 20 | 8 |  |
| 50 | 7 |  |

- $R(A, B) \bowtie S(C, D)$
cross product (12 tuples)

- $R(A, B) \bowtie S(A, B)$


## Natural Join

What do these natural joins output?

- $R(A, B) \bowtie S(B, C)$
equjoin on attribute $B$ (5 tuples)

| $R$ | $A$ | $B$ |
| :---: | :---: | :---: |
| 1 | 10 |  |
| 2 | 10 |  |
| 2 | 20 |  |


| $S$ | $B$ | $C$ |
| :--- | :--- | :--- |
|  | 10 | 8 |
| 10 | 9 |  |
| 20 | 8 |  |
|  | 50 | 7 |

- $R(A, B) \bowtie S(C, D)$
cross product (12 tuples)

| $R$ | $A$ | $B$ | $S$ | $C$ | $D$ |
| :--- | :--- | :--- | :--- | :--- | :--- |
| 1 | 10 |  | 8 | $u$ |  |
| 2 | 10 |  | 9 | $v$ |  |
| 2 | 20 |  | 8 | $v$ |  |
|  |  | 7 | $w$ |  |  |

- $R(A, B) \bowtie S(A, B)$

| $R$ | $A$ | $B$ |
| :---: | :---: | :---: |
| 1 | 10 |  |
| 2 | 10 |  |
| 2 | 20 |  |

S

| $\mathbf{A}$ | $\mathbf{B}$ |
| :--- | :--- |
| 1 | 10 |
| 2 | 20 |

## Natural Join

What do these natural joins output?

- $R(A, B) \bowtie S(B, C)$
equjoin on attribute $B$ (5 tuples)

| $\mathbf{R}$ | $\mathbf{A}$ | $\mathbf{B}$ |
| :---: | :---: | :---: |
| $\mathbf{1}$ | 10 |  |
| 2 | 10 |  |
| 2 | 20 |  |


| $S$ | $B$ | $C$ |
| :--- | :--- | :--- |
| 10 | 8 |  |
| 10 | 9 |  |
| 20 | 8 |  |
| 50 | 7 |  |

- $R(A, B) \bowtie S(C, D)$
cross product (12 tuples)

| $R$ | $A$ | $B$ |
| :---: | :---: | :---: |
| 1 | 10 |  |
| 2 | 10 |  |
| 2 | 20 |  |


| S | C | D |
| :--- | :--- | :--- |
| 8 | u |  |
| 9 | v |  |
| 8 | v |  |
| 7 | w |  |

- $R(A, B) \bowtie S(A, B)$
intersection (2 tuples)

| $S$ | $A$ | $B$ |
| :--- | :--- | :--- |
|  | 1 | 10 |
| 2 | 20 |  |


| $R$ | $A$ | $B$ |
| :---: | :---: | :---: |
| 1 | 10 |  |
| 2 | 10 |  |
|  | 2 | 20 |

## Even More Joins

- Inner join $\bowtie$
- Eq-join, theta-join, cross product, natural join
- Outer join
- Left outer join $\bowtie$
- Right outer join $\ltimes$
- Full outer join $D<$
- Semi join $\ltimes$


## 4. Union

## S U T

The union of $S$ and $T$

## 4. Union

## S U T

## The union of $S$ and $T$

## Regist U Bicycle =

## S UNION T;

| Regist |  | Bicycle |  |  |
| :--- | :--- | :--- | :--- | :---: |
| UserID | Model | UserID | Model |  |
| 123 | Charger | 345 | Schwinn |  |
| 567 | Civic | 567 | Sirrus |  |
| 567 | Pinto |  |  |  |

## 4. Union

## S U T

## The union of $S$ and $T$

Regist $\cup$ Bicycle $=$

## S UNION T;


## 4. Union

## S U T

## The union of $S$ and $T$

| UserID | Model |
| :--- | :--- |
| 123 | Charger |
| 567 | Civic |
| 567 | Pinto |
| 345 | Schwinn |
| 567 | Sirrus |

Regist $\cup$ Bicycle $=$

## S UNION T;


## 5. Difference

## S - T

The set difference of $S$ and $T$

```
S EXCEPT T;
```


## 5. Difference

## $S-T$

## The set difference of $S$ and $T$

Regist - Bicycle $=$

S EXCEPT T;


## 5. Difference

## S - T

| UserID | Model |
| :--- | :--- |
| 123 | Charger |
| 567 | Pinto |

The set difference of $S$ and $T$


## S EXCEPT T;

|  Must have <br> same schema  |  |
| :--- | :--- |
| Bicycle |  |
| UserID | Model |
| 345 | Schwinn |
| 567 | Civic |

## Renaming

## $\rho_{a t t r s^{\prime}}(T)$

## Rename attributes

SELECT | a1 as a1', |
| :---: |
| a2 as a2', |
| $\ldots$ |,$\quad$.

FROM T;

## Renaming

$\rho_{\text {attrs }}(T)$

Rename attributes

$\rho_{\text {UserID,Model }}($ Regist $)=$
Regist

| UserID | Car |
| :--- | :--- |
| 123 | Charger |
| 567 | Civic |
| 567 | Pinto |

## Renaming

$\rho_{a t t r s^{\prime}}(T)$

Rename attributes

SELECT al as a1',<br>a2 as a2',<br>-••

FROM T;

## Renaming

$\rho_{a t t r s^{\prime}}(T)$

Rename attributes
SELECT al as a1',

\[\)|  a2 as $a 2^{\prime},$ |
| :--- |
|  |
|  FROM $T ;$ |

\]

| UserlD | Model |
| :--- | :--- |
| 123 | Charger |
| 567 | Civic |
| 567 | Pinto |

$\rho_{\text {UserID,Model }}($ Regist $)=$

| Regist |  |
| :--- | :--- |
| UserID | Car |
| 123 | Charger |
| 567 | Civic |
| 567 | Pinto |

Corrected union:
$\rho_{\text {UserID,Model }}($ Regist $) \cup$ Bicycle

## The Five Basic Relational Operators

1. Selection $\sigma_{\text {condition }}(S)$
2. Projection $\Pi_{\text {attrs }}(S)$
3. Join $R \bowtie_{\theta} S=\sigma_{\theta}(R \times S)$
4. Union U
5. Set difference -

- Rename $\rho$

Which operators are monotone?

## The Five Basic Relational Operators

1. Selection $\sigma_{\text {condition }}(\mathrm{S})$
2. Projection $\Pi_{\text {attrs }}(S)$
3. Join $R \bowtie_{\theta} S=\sigma_{\theta}(R \times S)$
4. Union U
5. Set difference -

## Monotone

Non-monotone

- Rename $\rho$ Monotone, but doesn't do anything

Which operators are monotone?

## Query Plans

## Relational Algebra Plan, or Query Plan

SELECT P.Name<br>FROM Payroll P, Regist R<br>WHERE P.UserID = R.UserID and P.Job = 'TA';

| Payroll |  |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| UserID | Name | Job | Salary | Regist |  |  |
| 123 | Jack | TA | 50000 | UserID | Car |  |
| 345 | Allison | TA | 60000 | 123 | Charger |  |
| 567 | Magda | Prof | 90000 | 567 | Civic |  |
| 789 | Dan | Prof | 100000 | 567 | Pinto |  |

## Relational Algebra Plan, or Query Plan

```
SELECT P.Name
FROM Payroll P, Regist R
WHERE P.UserID = R.UserID
and P.Job = 'TA';
```


$\Pi_{\text {Name }}\left(\sigma_{\mathrm{Job}={ }^{\prime} \mathrm{TA}^{\prime}}(\right.$ Payroll $\bowtie$ Regist $\left.)\right)$

| Payroll |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| UserID | Name | Job | Salary | Regist |  |
| 123 | Jack | TA | 50000 | UserlD | Car |
| 345 | Allison | TA | 60000 | 123 | Charger |
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| 789 | Dan | Prof | 100000 | 567 | Pinto |

## Relational Algebra Plan, or Query Plan

```
SELECT P.Name
FROM Payroll P, Regist R
WHERE P.UserID = R.UserID
and P.Job = 'TA';
```



We write it as

$\Pi_{\text {Name }}\left(\sigma_{\mathrm{Job}={ }^{\prime} \mathrm{TA}^{\prime}}(\right.$ Payroll $\bowtie$ Regist $\left.)\right)$

| Payroll |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- |
| UserID | Name | Job | Salary | Regist |  |
| 123 | Jack | TA | 50000 | UserID | Car |
| 345 | Allison | TA | 60000 | 123 | Charger |
| 567 | Magda | Prof | 90000 | 567 | Civic |
| 789 | Dan | Prof | 100000 | 567 | Pinto |

## Relational Algebra Plan, or Query Plan

SELECT P.Name<br>FROM Payroll P, Regist R WHERE P.UserID = R.UserID and P.Job = 'TA';

$$
\Pi_{\text {Name }}
$$

$\sigma_{\text {Job='TA' }}^{\Pi_{\text {Name }}}$

$\downarrow$

## We write it as



Payroll

Data flows this way
$\Pi_{\text {Name }}\left(\sigma_{\mathrm{Job}={ }^{\prime} \mathrm{TA}^{\prime}}(\right.$ Payroll $\bowtie$ Regist $\left.)\right)$

| UserID | Name | Job | Salary | Regist |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 123 | Jack | TA | 50000 | UseriD | Car |
| 345 | Allison | TA | 60000 | 123 | Charger |
| 567 | Magda | Prof | 90000 | 567 | Civic |
| 789 | Dan | Prof | 100000 | 567 | Pinto |

## Query Plan: Attribute Names

Managing attribute names correctly is tedious


Regist

Better: use aliases, much like in SQL


## Query Plan: Execution Order

SELECT P.Name FROM Payroll P, Regist R WHERE P.UserID = R.UserID and P.Job = 'TA';

We say what we want, not how to get it

## Query Plan: Execution Order

```
SELECT P.Name
FROM Payroll P, Regist R
WHERE P.UserID = R.UserID
    and P.Job = 'TA';
```


## Payroll P

## Regist $R$



We say what we want, not how to get it

## Query Plan: Execution Order

```
SELECT P.Name
FROM Payroll P, Regist R
WHERE P.UserID = R.UserID
    and P.Job = 'TA';
```

We say what we want, not how to get it

Another way
how to get it
$\Pi_{\text {P.Name }}$
$\bowtie_{\text {P.UserID }}=$ R.UserID
$\sigma_{\mathrm{P} . \mathrm{Job}}={ }^{\prime} \mathrm{TA}{ }^{\prime}$

Payroll P

## Query Plan: Execution Order

SELECT P.Name
FROM Payroll P, Regist R
WHERE P.UserID = R.UserID
and P.Job = 'TA';

We say what we want, not how to get it


Payroll P


Another way how to get it

$\bowtie_{\text {P.UserID=R.UserID }}$

## Query Plan: Execution Order

SELECT P.Name
FROM Payroll P, Regist R
WHERE P.UserID = R.UserID
and P.Job = 'TA';

We say what we want, not how to get it


Payroll P


Another way how to get it


Regist R


Payroll P

## Discussion

- Database system converts a SQL query to a Relational Algebra Plan


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- Database system converts a SQL query to a Relational Algebra Plan
- Then it optimizes the plan by exploring equivalent plans, using simple algebraic identities:

$$
R \bowtie S=S \bowtie R
$$

$R \bowtie(S \bowtie T)=(R \bowtie S) \bowtie T$
$\sigma_{\theta}(R \bowtie S)=\sigma_{\theta}(R) \bowtie S$
... many others*

## Discussion

- Database system converts a SQL query to a Relational Algebra Plan
- Then it optimizes the plan by exploring equivalent plans, using simple algebraic identities:

$$
\begin{aligned}
& R \bowtie S=S \bowtie R \\
& R \bowtie(S \bowtie T)=(R \bowtie S) \bowtie T \\
& \sigma_{\theta}(R \bowtie S)=\sigma_{\theta}(R) \bowtie S \\
& \ldots \text { many others*}
\end{aligned}
$$

- Next lecture: how to convert SQL to RA plan

