



Slides are from Data 100/Data 200, Fall 2023 @ UC Berkeley



## SQL – Part II

Introduction to Data Science  
Spring 1403

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## Goals for Today's Lecture

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Continue our tour of SQL

- Introduce the ability to filter groups
- Perform EDA in SQL
- Join tables together

# Agenda

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- ❑ Filtering Groups
- ❑ EDA in SQL
- ❑ Joins
- ❑ IMDB Demo

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## SQL Query Structure

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```
SELECT <column expression list>  
FROM <table>  
[WHERE <predicate>]  
[GROUP BY <column list>]  
[ORDER BY <column list>]  
[LIMIT <number of rows>]  
[OFFSET <number of rows>];
```

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# Filtering Groups

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- ❑ **Filtering Groups**
- ❑ EDA in SQL
- ❑ Joins

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## Filtering Groups With HAVING

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What if we only want to keep groups that obey a certain condition?  
HAVING filters groups by applying some condition *across all rows* in each group.

How to interpret: “keep only the groups HAVING some condition”

```
SELECT columns  
FROM table  
GROUP BY grouping_column  
HAVING condition_applied_across_group;
```

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## Filtering Groups With HAVING

```
SELECT type, COUNT(*)  
FROM Dish  
GROUP BY type  
HAVING MAX(cost) < 8;
```

type	COUNT(*)
appetizer	3
dessert	1

similar to `groupby("type")`  
`.filter(lambda f: max(f["cost"]) < 8)`

name	type	cost
ravioli	entree	10
ramen	entree	13
taco	entree	7
edamame	appetizer	4
fries	appetizer	4
potsticker	appetizer	4
ice cream	dessert	5

Dish

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## WHERE vs. HAVING

```
SELECT type, COUNT(*)  
FROM Dish  
WHERE cost < 8  
GROUP BY type;
```

What will happen  
here?

name	type	cost
ravioli	entree	10
ramen	entree	13
taco	entree	7
edamame	appetizer	4
fries	appetizer	4
potsticker	appetizer	4
ice cream	dessert	5

Dish

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# WHERE vs. HAVING

```
SELECT type, COUNT(*)  
FROM Dish  
WHERE cost < 8  
GROUP BY type;
```

type	COUNT(*)
appetizer	3
dessert	1
entree	1

name	type	cost
ravioli	entree	10
ramen	entree	13
taco	entree	7
edamame	appetizer	4
fries	appetizer	4
potsticker	appetizer	4
ice cream	dessert	5

Dish

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## Animation: WHERE vs. HAVING

To filter:

☞ Rows, use **WHERE**.

☞ Groups, use **HAVING**.

**WHERE** precedes **HAVING**.



```
SELECT ...  
WHERE ...  
GROUP BY ...  
HAVING ...
```

```
SELECT *  
FROM Dish  
WHERE cost > 4  
GROUP BY type  
HAVING MAX(cost) < 10;
```

name	type	cost
ravioli	entree	10
ramen	entree	13
taco	entree	7
edamame	appetizer	4
fries	appetizer	4
potsticker	appetizer	4
ice cream	dessert	5

Dish

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## Animation: WHERE vs. HAVING

To filter:

☞ Rows, use **WHERE**.

☞ Groups, use **HAVING**.

**WHERE** precedes **HAVING**.

SELECT ...

➡ **WHERE** ...

GROUP BY ...

HAVING ...

```
SELECT *  
FROM Dish  
WHERE cost > 4  
GROUP BY type  
HAVING MAX(cost) < 10;
```

name	type	cost
ravioli	entree	10
ramen	entree	13
taco	entree	7
✗ edamame	appetizer	4
✗ fries	appetizer	4
✗ potsticker	appetizer	4
ice cream	dessert	5

Dish

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## Animation: WHERE vs. HAVING

To filter:

☞ Rows, use **WHERE**.

☞ Groups, use **HAVING**.

**WHERE** precedes **HAVING**.

SELECT ...

WHERE ...

➡ **GROUP BY** ...

HAVING ...

```
SELECT *  
FROM Dish  
WHERE cost > 4  
GROUP BY type  
HAVING MAX(cost) < 10;
```

name	type	cost
ravioli	entree	10
ramen	entree	13
taco	entree	7
✗ edamame	appetizer	4
✗ fries	appetizer	4
✗ potsticker	appetizer	4
ice cream	dessert	5

Dish

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## Animation: WHERE vs. HAVING

To filter:

& Rows, use **WHERE**.

& Groups, use **HAVING**.

**WHERE** precedes **HAVING**.

```
SELECT ...  
WHERE ...  
GROUP BY ...  
➡ HAVING ...
```

```
SELECT *  
FROM Dish  
WHERE cost > 4  
GROUP BY type  
HAVING MAX(cost) < 10;
```

name	type	cost
ravioli	entree	10
ramen	entree	13
taco	entree	7
edamame	appetizer	4
fries	appetizer	4
potsticker	appetizer	4
ice cream	dessert	5

Dish

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## New keywords

```
SELECT <column expression list>  
FROM <table>  
[WHERE <predicate>]  
[GROUP BY <column list>]  
[HAVING <predicate>]  
[ORDER BY <column list>]  
[LIMIT <number of rows>]  
[OFFSET <number of rows>];
```

- By convention, use **all caps** for keywords in SQL statements.
- Use **newlines** to make SQL code more readable.
- **AS** keyword: rename columns during selection process.
- **WHERE: rows; HAVING: groups. WHERE precedes HAVING.**

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## Quick Check: WHERE vs. HAVING

What will be the return relation?

```
SELECT type, MAX(name)
FROM DishDietary
WHERE notes == 'gf'
GROUP BY type
HAVING MAX(cost) <= 7;
```

name	type	cost	notes
ravioli	entree	10	dairy
ramen	entree	7	pork
taco	entree	7	gf
edamame	appetizer	4	gf
fries	appetizer	4	gf
potsticker	appetizer	4	pork
ice cream	dessert	5	dairy

DishDietary

- A. 

type
appetizer
entree

 B. 

type	MAX(name)
appetizer	None
entree	None

 C. 

type	MAX(name)
appetizer	edamame
entree	ramen
- D. 

type	MAX(name)
appetizer	fries
entree	taco

 E. 

type	MAX(name)
appetizer	fries
entree	taco
dessert	ice cream

 F. Something else



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## Quick Check: WHERE vs. HAVING

What will be the return relation?

```
SELECT type, MAX(name)
FROM DishDietary
WHERE notes == 'gf'
GROUP BY type
HAVING MAX(cost) <= 7;
```

name	type	cost	notes
ravioli	entree	10	dairy
ramen	entree	7	pork
taco	entree	7	gf
edamame	appetizer	4	gf
fries	appetizer	4	gf
potsticker	appetizer	4	pork
ice cream	dessert	5	dairy

DishDietary

- A. 

type
appetizer
entree

 B. 

type	MAX(name)
appetizer	None
entree	None

 C. 

type	MAX(name)
appetizer	edamame
entree	ramen
- D. 

type	MAX(name)
appetizer	fries
entree	taco

 E. 

type	MAX(name)
appetizer	fries
entree	taco
dessert	ice cream

 F. Something else

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# EDA in SQL

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- ❑ Filtering Groups
- ❑ **EDA in SQL**
- ❑ Joins

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## The IMDB Dataset

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IMDB = “Internet Movie Database”

Contains information about movies and actors. For example, the Title table:

tconst	titleType	primaryTitle	originalTitle	isAdult	startYear	endYear	runtimeMinutes	genres
381681	movie	Before Sunset	Before Sunset	0	2004	None	80	Drama,Romance
81846	tvMiniSeries	Cosmos	Cosmos	0	1980	1980	780	Documentary
8526872	movie	Dolemite Is My Name	Dolemite Is My Name	0	2019	None	118	Biography,Comedy,Drama
309593	movie	Final Destination 2	Final Destination 2	0	2003	None	90	Horror,Thriller
882977	movie	Snitch	Snitch	0	2013	None	112	Action,Drama,Thriller
9619798	movie	The Wrong Missy	The Wrong Missy	0	2020	None	90	Comedy,Romance
1815862	movie	After Earth	After Earth	0	2013	None	100	Action,Adventure,Sci-Fi
2800240	movie	Serial (Bad) Weddings	Qu'est-ce qu'on a fait au Bon Dieu?	0	2014	None	97	Comedy
2562232	movie	Birdman or (The Unexpected Virtue of Ignorance)	Birdman or (The Unexpected Virtue of Ignorance)	0	2014	None	119	Comedy,Drama
356910	movie	Mr. & Mrs. Smith	Mr. & Mrs. Smith	0	2005	None	120	Action,Comedy,Crime

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## Working with Text: LIKE

We can perform simple text comparisons in SQL using the `LIKE` keyword

How to interpret: “look for entries that are `LIKE` the provided example string”

```
SELECT titleType, primaryTitle
FROM Title
WHERE primaryTitle LIKE “%Star Wars%”;
```

titleType	primaryTitle
movie	Star Wars: Episode IV - A New Hope
movie	Star Wars: Episode V - The Empire Strikes Back
movie	Star Wars: Episode VI - Return of the Jedi
movie	Star Wars: Episode I - The Phantom Menace
movie	Star Wars: Episode II - Attack of the Clones
movie	Star Wars: Episode III - Revenge of the Sith

Two “wildcard” characters:

- `%` means “look for any character, any number of times”
- `_` means “look for exactly 1 character”

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## Converting Data Types: CAST

To convert a column to a different data type, use the `CAST` keyword as part of the `SELECT` statement. Returns a *column* of the new data type, which we then `SELECT` for our output.

```
SELECT primaryTitle, CAST(runtimeMinutes AS INT)
FROM Title;
```

primaryTitle	CAST(runtimeMinutes AS INT)
A Trip to the Moon	13
The Birth of a Nation	195
The Cabinet of Dr. Caligari	76
The Kid	68
Nosferatu	94
Sherlock Jr.	45

Creates a copy of the column with all values of converted to the new data type. We then `SELECT` this column to include it in the output.

Similar to `.astype` in pandas

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## Applying Conditions: CASE

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We create conditional statements (like a Python `if`) using `CASE`

```
CASE WHEN <condition> THEN <value>
      WHEN <other condition> THEN <other value>
      ...
      ELSE <yet another value>
END
```

Conceptually, very similar to `CAST` – the `CASE` statement creates a new column, which we then `SELECT` to appear in the output.

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## Applying Conditions: CASE

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We create conditional statements (like a Python `if`) using `CASE`

```
SELECT titleType, startYear,
CASE WHEN startYear < 1950 THEN "old"
      WHEN startYear < 2000 THEN "mid-aged"
      ELSE "new"
      END AS movie_age
FROM Title;
```

All of this occurs  
within the `SELECT`  
statement

titleType	startYear	movie_age
movie	2010	new
movie	2019	new
movie	1998	mid-aged
movie	1989	mid-aged
movie	2017	new
tvSeries	1982	mid-aged
movie	1940	old

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# Joins

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- ❑ Filtering Groups
- ❑ EDA in SQL
- ❑ **Joins**

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## Multidimensional Data

To minimize redundant information, databases typically store data across **fact** and **dimension tables**

**Fact table:** central table, contains raw facts that typically have pure numerical values. It has information to link its entries to records in other dimension tables. Tends to have few columns, many records.

**Dimension table:** contains more detailed information about each type of fact stored in the fact table (each column). Tends to have more columns and fewer records than fact tables.

Products | Fact Table

drink_id	topping_id	store_id
3451	a	a236
6724	b	d462
9056	c	k378

Drinks | Dimension Table

drink_id	name	ice_level	sweetness
3451	Black Milk Tea	75	75
6724	Mango Au Lait	50	100
9056	Matcha Latte	100	100

Toppings | Dimension Table

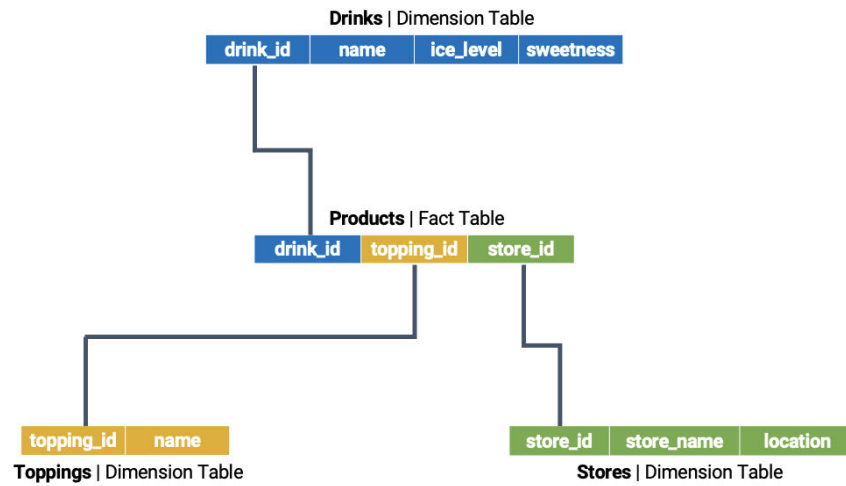
topping_id	name
a	Brown Sugar Pearl
b	Lychee Jelly
c	Custard

Stores | Dimension Table

store_id	store_name	location
a236	Sweetheart	Durant
d462	Feng Cha	Durant
k378	Yi Fang	Bancroft

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# Multidimensional Data



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# Cats



Persian



Ragdoll



Bengal

**s**

id	name
0	Apricot
1	Boots
2	Cally
4	Eugene

**t**

id	breed
1	persian
2	ragdoll
4	bengal
5	persian



Pishi\*

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# Inner Join

In an **inner join**, we combine every row from the first table with its matching entry in the second table. If a row in one table does not have a match, it is omitted

Match rows with the same ID across the tables.  
Exclude rows with no matching ID



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# JOIN Syntax

Specify joins between tables as part of the **FROM** statement

```
SELECT *  
FROM table1 INNER JOIN table2  
ON table1.key = table2.key
```

Desired type of join

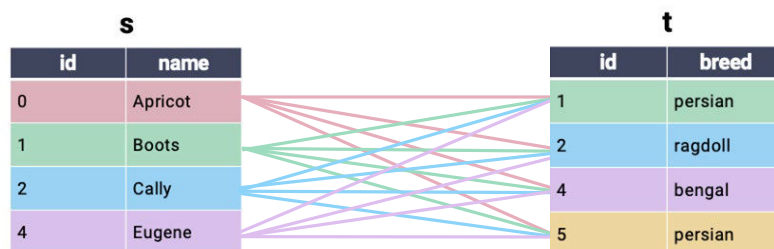
What columns to use to  
determine matching entries



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# Cross Join

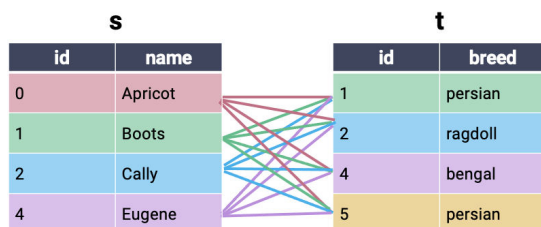
In a **cross join**, we find *every* possible combination of rows across the two tables. A cross join is also called a cartesian product.



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# Cross Join

In a **cross join**, we find *every* possible combination of rows across the two tables. A cross join is also called a cartesian product.



```
SELECT *  
FROM s  
CROSS JOIN t
```

s.id	name	t.id	breed
0	Apricot	1	persian
0	Apricot	2	ragdoll
0	Apricot	4	bengal
0	Apricot	5	persian
1	Boots	1	persian
1	Boots	2	ragdoll
1	Boots	4	bengal
1	Boots	5	persian
2	Cally	1	persian
2	Cally	2	ragdoll
2	Cally	4	bengal
2	Cally	5	persian
4	Eugene	5	persian
4	Eugene	2	ragdoll
4	Eugene	4	bengal
4	Eugene	5	persian

Notice that there is no need to specify a matching key (what columns to use for merging)

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## Inner Join: Cross Join With Filtering

Conceptually, you can imagine an inner join as a cross join filtered to include only matching rows.

```
SELECT *  
FROM s CROSS JOIN t  
WHERE s.id = t.id;
```

s.id	name	t.id	breed
0	Apricot	1	persian
0	Apricot	2	ragdoll
0	Apricot	4	bengal
0	Apricot	5	persian
1	Boots	1	persian
1	Boots	2	ragdoll
1	Boots	4	bengal
1	Boots	5	persian
2	Cally	1	persian
2	Cally	2	ragdoll
2	Cally	4	bengal
2	Cally	5	persian
4	Eugene	1	persian
4	Eugene	2	ragdoll
4	Eugene	4	bengal
4	Eugene	5	persian

Equivalent

s.id	name	t.id	breed
1	Boots	1	persian
2	Cally	2	ragdoll
4	Eugene	4	bengal

```
SELECT *  
FROM s INNER JOIN t  
ON s.id = t.id;
```

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## Left Outer Join

In a **left outer join** (or just **left join**), keep all rows from the left table and *only matching* rows from the right table. Fill NULL for any missing values.

s	
id	name
0	Apricot
1	Boots
2	Cally
4	Eugene

t	
id	breed
1	persian
2	ragdoll
4	bengal
5	persian

```
SELECT *  
FROM s LEFT JOIN t  
ON s.id = t.id;
```

s.id	name	t.id	breed
0	Apricot	-	-
1	Boots	1	persian
2	Cally	2	ragdoll
4	Eugene	4	bengal

Fill values without matching entries in the right table with NULL

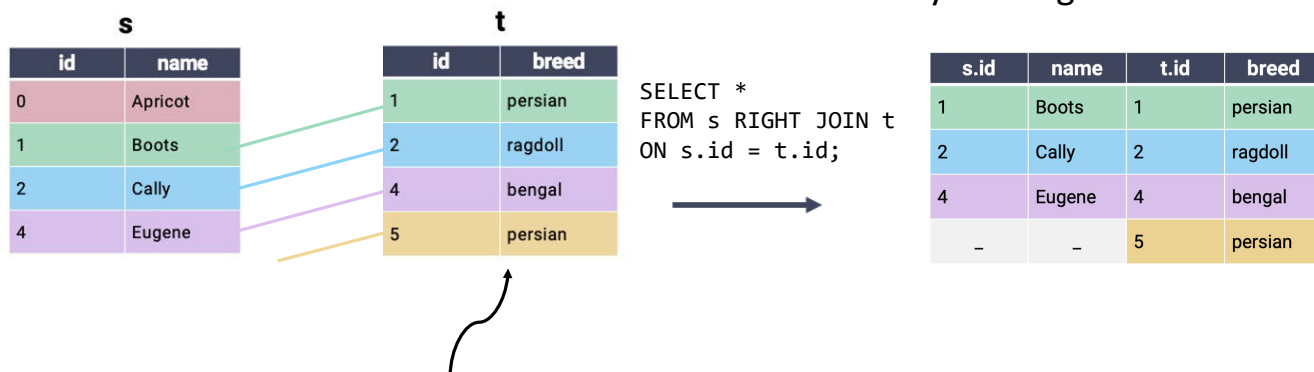
The "left table" is whichever table is referenced first in the JOIN statement.

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## Right Outer Join

In a **right outer join** (or just **right join**), keep all rows from the right table and *only matching* rows from the left table. Fill NULL for any missing values.

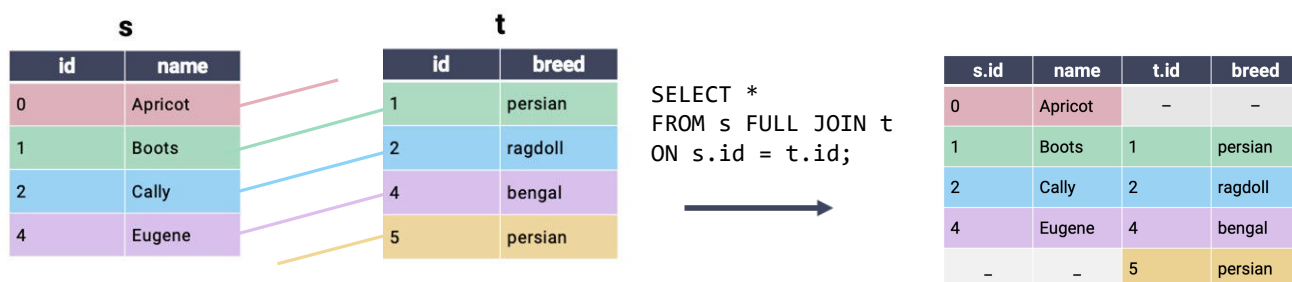


The "right table" is whichever table is referenced second in the JOIN statement.

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## Full Outer Join

In a **full outer join**, keep *all rows* from both the left and right tables. Pair any matching rows, then fill missing values with NULL. Conceptually similar to performing both left and right joins.



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# Typical Database Workflow

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- ❑ Query large amounts of data from a database using SQL. Write SQL queries to perform broad filtering and cleaning of the data
- ❑ After querying data, use pandas to perform more detailed analysis (visualization, modeling, etc.)

