

ADMINISTRIVIA



Project #0 is due Sunday Sept 7th @ 11:59pm

Homework #1 is due Sunday Sept 7th @ 11:59pm

No in-class lecture next Wednesday Sept 3rd

LAST CLASS

5 3

We introduced the Relational Model as the superior data model for databases.

We then showed how Relational Algebra is the building blocks that will allow us to query and modify a relational database.



In 1971, IBM created its first relational query language called <u>SQUARE</u>.

IBM then created "SEQUEL" in 1972 for <u>IBM System R</u> prototype DBMS.

→ <u>Structured English Query Language</u>

IBM releases commercial SQL-based DBMSs:

→ System/38 (1979), SQL/DS (1981), and DB2 (1983).

S_A

In 1971, IBM created its called <u>SQUARE</u>.

IBM then created "SEQU prototype DBMS.

 \rightarrow Structured English Query

IBM releases commercia

→ System/38 (1979), SQL/1

Q2. Find the average salary of employees in the Shoe Department.

Mappings may be *composed* by applying one mapping to the result of another, as illustrated by Q3.

Q3. Find those items sold by departments on the second floor.

The floor '2' is first mapped to the departments located there, and then to the items which they sell. The range of the inner mapping must be compatible with the domain of the outer mapping, but they need not be identical, as illustrated by Q4.



ANSI Standard in 1986. ISO in 1987

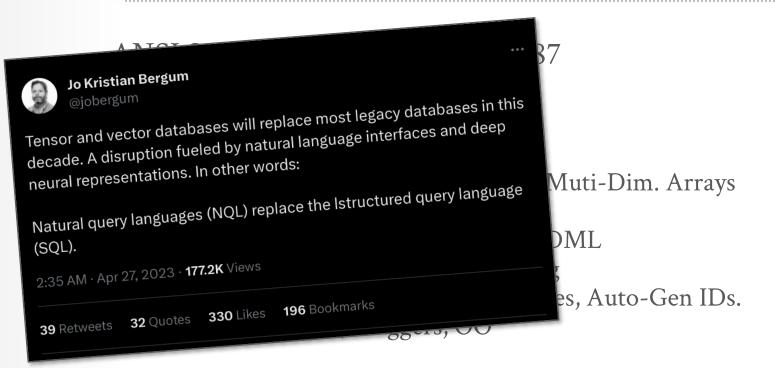
 \rightarrow Structured Query Language

Current standard is SQL:2023

- → **SQL:2023** → Property Graph Queries, Muti-Dim. Arrays
- \rightarrow **SQL:2016** \rightarrow JSON, Polymorphic tables
- \rightarrow **SQL:2011** \rightarrow Temporal DBs, Pipelined DML
- → **SQL:2008** → Truncation, Fancy Sorting
- → **SQL:2003** → XML, Windows, Sequences, Auto-Gen IDs.
- \rightarrow **SQL:1999** \rightarrow Regex, Triggers, OO

The minimum language syntax a system needs to say that it supports SQL is **SQL-92**.





The minimum language syntax a system needs to say that it supports SQL is **SQL-92**.







Jo Kristian Bergum

@jobergum

Tensor and vector databases will replace most legar decade. A disruption fueled by natural language int neural representations. In other words:

Natural query languages (NQL) replace the Istruct (SQL).

2:35 AM · Apr 27, 2023 · **177.2K** Views

196 Bookmark 330 Likes 39 Retweets 32 Quotes

> The minimum langu that it supports SQL



Gagan Biyani 🏛 🤣 @gaganbiyani



SQL is going to die at the hands of an Al. I'm serious.

@mayowaoshin is already doing this. Takes your company's data and ingests it into ChatGPT. Then, you can create a chatbot for the data and just ask it questions using natural language.

This video demoes the output.



10:30 AM · May 18, 2023 · **2.6M** Views

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Sal S

The Rise of SQL > It's become the second programming language everyone needs to know

BY RINA DIANE CABALLAR \mid 23 AUG 2022 \mid 3 MIN READ \mid \square

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TOP PROGRAMMING LANGUAGES

TAGS

2.25 AM · Apr 27, 202

Jo Kristian Bergu

@jobergum

Tensor and vector dadecade. A disruption

neural representatio

Natural query langu

(SQL).

39 Retweets **32** Q

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SQL dominated the jobs ranking in *IEEE Spectrum*'s interactive rankings of the top programming languages this year. Normally, the top position is occupied by Python or other mainstays, such as C, C++, Java, and JavaScript, but the sheer number of times employers said they wanted developers with SQL skills, albeit in addition to a more general-purpose language, boosted it to No. 1.

So what's behind SQL's soar to the top? The ever-increasing use of databases, for one. SQL has become the primary query language for accessing and managing data stored in such databases—specifically relational databases, which represent data in table form with rows and columns. Databases serve as the foundation of many enterprise applications and are increasingly found in other places as well, for example taking the place of traditional file systems in smartphones.

"This ubiquity means that every software developer will have to interact with databases no matter the field, and SQL is the de facto standard for interacting with databases," says Andy Pavlo, a professor specializing in database management at the Carnegie Mellon University (CMU) School of Computer Science and a member of the CMU database group.

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RELATIONAL LANGUAGES



Data Manipulation Language (DML)
Data Definition Language (DDL)
Data Control Language (DCL)

Also includes:

- → View definition
- → Integrity & Referential Constraints
- → Transactions

Important: SQL is based on **bags** (duplicates) not **sets** (no duplicates).

TODAYS AGENDA



Aggregations + Group By

String / Date / Time Operations

Output Control + Redirection

Nested Queries

Lateral Joins

Common Table Expressions

Window Functions

≯DB Flash Talk: dbt

EXAMPLE DATABASE



student(sid,name,login,gpa)

sid	name	login	age	gpa
53666	RZA	rza@cs	56	4.0
53688	Taylor	swift@cs	35	3.9
53655	Tupac	shakur@cs	25	3.5

course(cid, name)

cid	name
15-445	Database Systems
15-721	Advanced Database Systems
15-826	Data Mining
15-799	Special Topics in Databases

enrolled(sid,cid,grade)

sid	cid	grade
53666	15-445	С
53688	15-721	Α
53688	15-826	В
53655	15-445	В
53666	15-721	С

Functions that return a single value from a bag of tuples:

- \rightarrow AVG(col) \rightarrow Return the average col value.
- → MIN(col)→ Return minimum col value.
- → MAX(col) → Return maximum col value.
- \rightarrow **SUM(col)** \rightarrow Return sum of values in col.
- \rightarrow **COUNT(col)** \rightarrow Return # of values for col.



Aggregate functions can (almost) only be used in the **SELECT** output list.

```
SELECT COUNT(login) AS cnt
FROM student WHERE login LIKE '%@cs'
```



Aggregate functions can (almost) only be used in the **SELECT** output list.

```
SELECT COUNT(*) AS cnt

SELECT COUNT(*) AS cnt

FROM student WHERE login LIKE '%@cs'
```



Aggregate functions can (almost) only be used in the **SELECT** output list.

```
SELECT COUNT(*) AS cnt

SELECT COUNT(1) AS cnt

FROM student WHERE login LIKE '%@cs'
```



Aggregate functions can (almost) only be used in the **SELECT** output list.

```
SELECT COUNT(*) AS cnt

SELECT COUNT(1) AS cnt

SELECT COUNT(1+1+1) AS cnt
FROM student WHERE login LIKE '%@cs'
```



Output of other columns outside of an aggregate is undefined.

Get the average GPA of students enrolled in each course.

		AVG(s.gpa)	e.cid
SELECT	AVG(s.gpa), e.cid	3.86	???
FROM	enrolled AS e JOIN student AS s		
ON	e.sid = s.sid		



Output of other columns outside of an aggregate is undefined.

Get the average GPA of students enrolled in each course.

		AVG(s.gpa)	e.cid
SELECT	AVG(s.gpa), e d	3.86	???
FROM	AVG(s.gpa), e d enrolled AS Jun student AS s		
ON	e.sid = s.sid		

		AVG(s.gpa)	e.cid
SELECT	AVG(s.gpa), ANY_VALUE(e.cid)	3.86	15-445
FROM	enrolled AS e JOIN student AS s		
ON	e.sid = s.sid		

GROUP BY



Project tuples into subsets and calculate aggregates against each subset.

e.sid	s.sid	s.gpa	e.cid
53435	53435	2.25	15-721
53439	53439	2.70	15-721
56023	56023	2.75	15-826
59439	59439	3.90	15-826
53961	53961	3.50	15-826
58345	58345	1.89	15-445

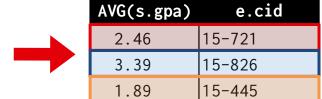
GROUP BY



Project tuples into subsets and calculate aggregates against each subset.

SELECT AVG(s.gpa), e.cid
FROM enrolled AS e JOIN student AS s
ON e.sid = s.sid
GROUP BY e.cid

e.sid	s.sid	s.gpa	e.cid
53435	53435	2.25	15-721
53439	53439	2.70	15-721
56023	56023	2.75	15-826
59439	59439	3.90	15-826
53961	53961	3.50	15-826
58345	58345	1.89	15-445



34 34

GROUPING SETS

Specify multiple groupings in a single query instead of using UNION ALL to combine the results of several individual GROUP BY queries.

```
SELECT c.name AS c_name, e.grade,
       COUNT(*) AS num_students
  FROM enrolled AS e
  JOIN course AS c ON e.cid = c.cid
 GROUP BY GROUPING SETS (
  (c.name, e.grade), -- By course and grade
  (c.name),
                     -- By course only
                     -- Overall total
```

GROUPING SETS



grade num_students

Specify multiple groupings in a single query instead of using UNION ALL to combine the results of several individual **GROUP BY** queries.

		8	
	nu11	nul1	5
SELECT c.name AS c_name, e.grade,	15-721	С	1
<pre>COUNT(*) AS num_students</pre>	15-826	В	1
FROM enrolled AS e	15-445	В	1
JOIN course AS c ON e.cid = c.cid	15-445	С	1
GROUP BY GROUPING SETS (15-721	Α	1
(a nama a granda) Div accuraci		nul1	2
(c.name, e.grade), By course a	15-826	nul1	1
(c.name), ————————————————————————————————————		null	2
() Overall tot	tal		
);			

cid

GROUPING SETS



grade num_students

Specify multiple groupings in a single query instead of using UNION ALL to combine the results of several individual **GROUP BY** queries.

	null	nu11	5
SELECT c.name AS c_name, e.grade,	15-721	С	1
<pre>COUNT(*) AS num_students</pre>	15-826	В	1
FROM enrolled AS e	15-445	В	1
JOIN course AS c ON e.cid = c.cid	15-445	С	1
GROUP BY GROUPING SETS (15-721	Α	1
(December 1987)	15-445	nu11	2
(c.name, e.grade) By course a	15-826	nu11	1
	15-721	nu11	2
() Overall to	tal		
);			

cid

Filters results based on aggregation computation. Like a WHERE clause for a GROUP BY

```
SELECT AVG(s.gpa) AS avg_gpa, e.cid
  FROM enrolled AS e, student AS s
WHERE e.sid = s.sid
  AND avg_gpa > 3.9
GROUP BY e.cid
```

5 15

Filters results based on aggregation computation. Like a WHERE clause for a GROUP BY

SELECT AVG(s.gpa) AS avg_gpa, e.cid
FROM enrolled AS e, student AS s
WHERE e.sid = s.sid
AND avg_gpa > 3.9
GROUP BY e.cid

Filters results based on aggregation computation.

Like a WHERE clause for a GROUP BY

```
SELECT AVG(s.gpa) AS avg_gpa, e.cid
  FROM enrolled AS e, student AS s
WHERE e.sid = s.sid
GROUP BY e.cid
HAVING avg_gpa > 3.9;
```

Filters results based on aggregation computation.

Like a WHERE clause for a GROUP BY

```
SELECT AVG(s.gpa) AS avg_gpa, e.cid
FROM enrolled AS e, student AS s
WHERE e.sid = s.sid
GROUP BY e.cid
HAVING AVG(s.gpa) > 3.9;
```

AVG(s.gpa)	e.cid
3.75	15-415
3.950000	15-721
3.900000	15-826



e.cid
15-721

16 341

STRING OPERATIONS

	String Case	String Quotes
SQL-92	Sensitive	Single Only
Postgres	Sensitive	Single Only
MySQL	Insensitive	Single/Double
SQLite	Sensitive	Single/Double
MSSQL	Sensitive	Single Only
Oracle	Sensitive	Single Only
<pre>WHERE UPPER(name) = UPPER('TuPaC')</pre> <pre>SQL-92</pre>		
WHERE name = "TuPaC" MySC		

DATABASE SYSTEMS (FALL 2025)

STRING OPERATIONS



LIKE provides string matching with special match operators:

- → '%' Matches any substring (including empty strings).
- → '_' Match any one character

SIMILAR TO allows for regular expression matching.

- → In the SQL standard but not all systems support it.
- → Other systems also support POSIX-style regular expressions.

```
SELECT * FROM enrolled AS e
WHERE e.cid LIKE '15-%';
```

```
SELECT * FROM student AS s
WHERE s.login LIKE '%@c_';
```

```
SELECT * FROM student AS s
WHERE login SIMILAR TO
'[\w]{3}@cs';
```

S 18

STRING OPERATIONS

SQL-92 defines string functions.

→ Many DBMSs also have their own unique functions

Can be used in either output and predicates:

```
SELECT SUBSTRING(name,1,5) AS abbrv_name
FROM student WHERE sid = 53688
```

```
SELECT * FROM student AS s
WHERE UPPER(s.name) LIKE 'KAN%'
```



5 19

STRING OPERATIONS

SQL standard defines the | operator for concatenating two or more strings together.

```
SELECT name FROM student
WHERE login = LOWER(name) | '@cs'

SELECT name FROM student
WHERE login = LOWER(name) + '@cs'

SELECT name FROM student
WHERE login = CONCAT(LOWER(name), '@cs')
```

20

DATE/TIME OPERATIONS

Operations to manipulate and modify **DATE/TIME** attributes.

Can be used in both output and predicates.

Support/syntax varies wildly...

Demo: Compute the number of days since the beginning of the year.

OUTPUT CONTROL



ORDER BY <column*> [ASC|DESC]

→ Sort tuples by the values in one or more of their columns.

SELECT sid, name FROM student
WHERE login LIKE '%@cs'
FETCH FIRST 10 ROWS ONLY;

FETCH {FIRST|NEXT} <#> ROWS OFFSET <#> ROWS

- → Limit # of tuples returned in output.
- → Can set an offset to return a "range"

```
SELECT sid, name FROM student
WHERE login LIKE '%@cs'
ORDER BY gpa
OFFSET 5 ROWS
FETCH FIRST 5 ROWS WITH TIES;
```

```
SELECT TOP 10 sid, name MSSQL
FROM student
WHERE login LIKE '%@cs';
```

22 34

OUTPUT REDIRECTION

Store query results in another table:

- \rightarrow Table must not already be defined.
- \rightarrow Table will have the same # of columns with the same types as the input.

```
SELECT DISTINCT cid INTO CourseIds FROM enrolled;
```

```
CREATE TABLE CourseIds (
SELECT DISTINCT cid FROM enrolled);
```

22 34

OUTPUT REDIRECTION

Store query results in another table:

- \rightarrow Table must not already be defined.
- \rightarrow Table will have the same # of columns with the same types as the input.

```
SELECT DISTINCT cid INTO CourseIds
FROM enrolled;

SELECT DISTINCT cid
INTO TEMPORARY CourseIds
FROM enrolled;

CREATE TABLE CourseIds (
SELECT DISTINCT cid FROM enrolled);
```

Invoke a query inside of another query to compose more complex computations.

→ Inner queries can appear (almost) anywhere in query.

SELECT name FROM student WHERE sid IN (SELECT sid FROM enrolled)

Invoke a query inside of another query to compose more complex computations.

→ Inner queries can appear (almost) anywhere in query.

```
SELECT name FROM student WHERE
sid IN (SELECT sid FROM enrolled)

SELECT sid,

(SELECT name FROM student AS s

WHERE s.sid = e.sid) AS name
FROM enrolled AS e;
```

24 AJ

```
SELECT name FROM student
WHERE ...

sid in the set of people that take 15-445
```

NESTED QUERIES

```
SELECT name FROM student
WHERE ...
SELECT sid FROM enrolled
WHERE cid = '15-445'
```



NESTED QUERIES

```
SELECT name FROM student
WHERE sid IN (
   SELECT sid FROM enrolled
   WHERE cid = '15-445'
)
```



NESTED QUERIES

```
SELECT name FROM student
WHERE sid IN (
   SELECT sid FROM enrolled
   WHERE cid = '15-445'
)
```



ALL→ The expression must be true for all rows in the sub-query.

ANY→ The expression must be true for at least one row in the sub-query.

IN→ Equivalent to '=ANY()'.

EXISTS→ At least one row is returned without comparing it to an attribute in outer query.

Find student record with the highest id that is enrolled in at least one course.

```
SELECT sid, name FROM student
WHERE ...
```

"Is the highest enrolled sid"



```
SELECT sid, name FROM student
WHERE sid =
   SELECT MAX(sid) FROM enrolled
```

```
SELECT sid, name FROM student
WHERE sid IN (
SELECT MAX(sid) FROM enrolled
);
```

```
SELECT sid name FROM student

WHERE sid IN (

SELECT sid FROM enrolled

ORDER BY sid DESC FETCH FIRST 1 ROW ONLY

);
```

```
SELECT sid name FROM student
WHERE sid TN (
SI SELECT student.sid, name
FROM student
);
JOIN (SELECT MAX(sid) AS sid
FROM enrolled) AS max_e
ON student.sid = max_e.sid;
```

Find all courses that have no students enrolled in it.

```
SELECT * FROM course
WHERE ...
```

"with no tuples in the enrolled table"

cid	name	
15-445	Database Systems	
15-721	Advanced Database Systems	
15-826	Data Mining	
15-799	Special Topics in Databases	

sid	cid	grade
53666	15-445	С
53688	15-721	Α
53688	15-826	В
53655	15-445	В
53666	15-721	С

Find all courses that have no students enrolled in it.

```
SELECT * FROM course
WHERE NOT EXISTS(
   tuples in the enrolled table
);
```

27 Pal

NESTED QUERIES

Find all courses that have no students enrolled in it.

```
SELECT * FROM course
WHERE NOT EXISTS(
    SELECT * FROM enrolled
    WHERE course.cid = enrolled.cid
);
```

cid	name
15-799	Special Topics in Databases

Find all courses that have no students enrolled in it.

```
SELECT * FROM course
WHERE NOT EXIST
(
    SELECT * FROM enrolled
    WHERE course.cid = enrolled.cid
);
```

cid	name
15-799	Special Topics in Databases

LATERAL JOINS

The LATERAL operator allows a nested query to reference attributes in other nested queries that precede it (according to position in the query).

→ You can think of it like a **for** loop that allows you to invoke another query for each tuple in a table.

```
SELECT * FROM

(SELECT 1 AS x) AS t1,

LATERAL (SELECT t1.x+1 AS y) AS t2;
```

```
for x in [1]:
  for y in [x+1]:
    print(x,y)
```

LATERAL JOIN

Calculate the number of students enrolled in each course and the average GPA. Sort output by the courses' enrollment count in ascending order.

SELECT * **FROM** course **AS** c,

For each course:

→ Compute the # of enrolled students

For each course:

→ Compute the average gpa of enrolled students

LATERAL JOIN

LATERAL JOIN

```
SELECT * FROM course AS c,

LATERAL (SELECT COUNT(*) AS cnt FROM enrolled

WHERE enrolled.cid = c.cid) AS t1,

LATERAL (SELECT AVG(gpa) AS avg FROM student AS s

JOIN enrolled AS e ON s.sid = e.sid

WHERE e.cid = c.cid) AS t2

ORDER BY cnt ASC;
```

LATERAL JOIN

```
SELECT * FROM course AS c,

LATERAL (SELECT COUNT(*) AS cnt FROM errolled

WHERE enrolled.cid = c.cid) S t1,

LATERAL (SELECT AVG(gpa) AS avg FROM student AS s

JOIN enrolled AS e ON s.sid = e.sid

WHERE e.cid = c.cid) AS t2

ORDER BY cnt ASC;
```

LATERAL JOIN

```
SELECT * FROM course AS c,

LATERAL (SELECT COUNT(*) AS cnt FROM enrolled

WHERE enrolled.cid = c.cid) AS t1,

LATERAL (SELECT AVG(gpa) AS avg FROM student AS s

JOIN enrolled AS e ON s.sid = e.sid

WHERE e.cid = c.cid) AS t2

ORDER BY cnt ASC;
```

LATERAL JOIN

	Cla	name	cnt	avg
	15-799	Special Topics in Databases	0	null
CELECT EDOM AC	15-826	Data Mining	1	3.9
SELECT * FROM course AS c,	15-445	Database Systems	2	3.75
LATERAL (SELECT COUNT (*)	15-721	Advanced Database Systems	2	3.95
WHERE enrolled.o	cid =	c.cid) AS t1,		
LATERAL (SELECT AVG(gpa) /				
		ON s.sid = e.sid		
WHERE e.cid = c.cid AS t2				
ORDER BY cnt ASC;				

COMMON TABLE EXPRESSIONS

Specify a temporary result set that can then be referenced by another part of that query.

→ Bind/alias output columns to names before the **AS** keyword.

Alternative to nested queries, views, and explicit temp tables.

```
WITH cteName (col1, col2) AS (
    SELECT 1, 2
)
SELECT col1 + col2 FROM cteName
```

COMMON TABLE EXPRESSIONS

Specify a temporary result set that can then be referenced by another part of that query.

→ Bind/alias output columns to names before the **AS** keyword.

Alternative to nested queries, views, and explicit temp tables.

```
WITH cteName (col1, col2) AS (
    SELECT 1, 2
)
SELECT col1 + col2 FROM cteName
```

S 31

COMMON TABLE EXPRESSIONS

```
WITH maxCTE (maxId) AS (
    SELECT MAX(sid) FROM enrolled
)
SELECT name FROM student AS s
    JOIN maxCTE ON s.sid = maxCTE.maxId;
```

COMMON TABLE EXPRESSIONS

```
WITH maxCTE (maxId) AS
SELECT MAX(sid) FROM enrolled
)
SELECT name FROM student AS s
JOIN maxCTE ON s.sid = maxCTE.maxId;
```

WINDOW FUNCTIONS



Performs a calculation across a set of tuples that are related to the current tuple, without collapsing them into a single output tuple, to support running totals, ranks, and moving averages.

→ Like an aggregation but tuples are not grouped into a single output tuples.

How to "slice" up data Can also sort tuples

```
SELECT FUNC-NAME(...) OVER (...)
FROM tableName;
```

Aggregation Functions Special Functions

WINDOW FUNCTIONS



Aggregation functions:

→ Anything that we discussed earlier

Special window functions:

- \rightarrow **ROW_NUMBER()** \rightarrow # of the current row
- → RANK()→ Order position of the current row.

sid	cid	grade	row_num
53666	15-445	С	1
53688	15-721	Α	2
53688	15-826	В	3
53655	15-445	В	4
53666	15-721	С	5

```
SELECT *, ROW_NUMBER() OVER () AS row_num
FROM enrolled;
```

WINDOW FUNCTIONS

Aggregation functions:

→ Anything that we discussed earlier

Special window functions:

- \rightarrow **ROW_NUMBER()** \rightarrow # of the current row
- → RANK()→ Order position of the current row.

sid	cid	grade	row_num
53666	15-445	С	1
53688	15-721	Α	2
53688	15-826	В	3
53655	15-445	В	4
53666	15-721	С	5

```
SELECT *, ROW_NUMBER() OVER () AS row_num
FROM enrolled;
```

WINDOW FUNCTIONS

The **OVER** keyword specifies how to group together tuples when computing the window function.

Use **PARTITION BY** to specify group.

```
SELECT cid, sid,
ROW_NUMBER() OVER (PARTITION BY cid)
FROM enrolled
ORDER BY cid;
```

WINDOW FUNCTIONS

The **OVER** keyword specifies how to group together tuples when computing the window function.

Use **PARTITION BY** to specify group.

cid	sid	row_number
15-445	53666	1
15-445	53655	2
15-721	53688	1
15-721	53666	2
15-826	53688	1

```
SELECT cid, sid,
ROW_NUMBER() OVER (PARTITION BY cid)
FROM enrolled
ORDER BY cid;
```

WINDOW FUNCTIONS

You can also include an **ORDER BY** in the window grouping to sort entries in each group.

```
SELECT *,
    ROW_NUMBER() OVER (ORDER BY cid)
    FROM enrolled
    ORDER BY cid;
```

Group tuples by cid

WINDOW FUNCTIONS

Find the student with <u>second</u> highest grade for each course.

```
SELECT * FROM (
SELECT *, RANK() OVER (PARTITION BY cid
ORDER BY grade ASC) AS rank
FROM enrolled) AS ranking
WHERE ranking.rank 2
```

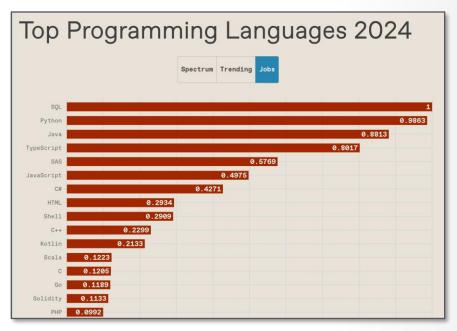
CONCLUSION



SQL is a hot language.

→ Lots of NL2SQL tools, but writing SQL is not going away.

You should (almost) always strive to compute your answer as a single SQL statement.



https://spectrum.ieee.org/top-programming-languages-2024

HOMEWORK



Write SQL queries to perform basic data analysis.

- → Write the queries locally using DuckDB.
- → Submit them to Gradescope
- → You can submit multiple times and use your best score.

Due: Sunday Sept 7th @ 11:59pm

https://15445.courses.cs.cmu.edu/fall2025/homework1

NEXT CLASS



We will begin our journey to understanding the internals of database systems starting with Storage!

No In-Class Lecture!