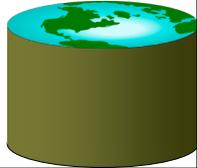


SQL and Query Execution for Aggregation



Example Instances

sid	bid	day
22	101	10/10/96
95	103	11/12/96

sid	sname	rating	age
22	Dustin	7	45.0
31	Lubber	8	55.5
95	Bob	3	63.5

bid	bname	color
101	Interlake	blue
102	Interlake	red
103	Clipper	green
104	Marine	red

Queries With GROUP BY

To generate values for a column based on groups of rows, use **aggregate** functions in SELECT statements with the **GROUP BY** clause

```
SELECT [DISTINCT] target-list
FROM relation-list
[WHERE qualification]
GROUP BY grouping-list
```

- The **target-list** contains
 - (i) list of column names &
 - (ii) terms with aggregate operations (e.g., MIN (S.age)).
- column name list (i) can contain only attributes from the grouping-list.

Group By Examples

For each rating, find the average age of the sailors

```
SELECT S.rating, AVG (S.age)
FROM Sailors S
GROUP BY S.rating
```

For each rating find the age of the youngest sailor with age ≥ 18

```
SELECT S.rating, MIN (S.age)
FROM Sailors S
WHERE S.age  $\geq$  18
GROUP BY S.rating
```

Conceptual Evaluation

```
SELECT [DISTINCT] target-list
FROM relation-list
[WHERE qualification]
GROUP BY grouping-list
```

- The cross-product of **relation-list** is computed, tuples that fail **qualification** are discarded, 'unnecessary' fields are deleted, and the remaining tuples are partitioned into groups by the value of attributes in **grouping-list**.
- One answer tuple is generated per qualifying group.
- If **DISTINCT** is specified: drop duplicate answer tuples.

SELECT S.rating, MIN (S.age)
FROM Sailors S
WHERE S.age \geq 18
GROUP BY S.rating

Answer Table

3. Perform Aggregation

sid	sname	rating	age
22	dustin	7	45.0
31	lubber	8	55.5
71	zorba	10	16.0
64	horatio	7	35.0
29	brutus	1	33.0
58	rusty	10	35.0

rating	age
1	33.0
7	45.0
7	35.0
8	55.5
10	35.0

rating	age
1	33.0
7	35.0
8	55.0
10	35.0

1. Form cross product

2. Delete unneeded columns, rows; form groups

3. Perform Aggregation



Find the number of reservations for each red boat.

```
SELECT B.bid, COUNT(*) AS numres
FROM Boats B, Reserves R
WHERE R.bid=B.bid
      AND B.color='red'
GROUP BY B.bid
```

- Grouping over a join of two relations.



```
SELECT B.bid, COUNT (*) AS scount
FROM Boats B, Reserves R
WHERE R.bid=B.bid AND B.color='red'
GROUP BY B.bid
```

b.bid	b.color	r.bid
101	blue	101
102	red	101
103	green	101
104	red	101
101	blue	102
102	red	102
103	green	102
104	red	102

b.bid	b.color	r.bid
102	red	102

b.bid	scount	answer
102	1	



Queries With GROUP BY and HAVING

```
SELECT [DISTINCT] target-list
FROM relation-list
WHERE qualification
GROUP BY grouping-list
HAVING group-qualification
```

- Use the HAVING clause with the GROUP BY clause to restrict which group-rows are returned in the result set



Conceptual Evaluation

- Form groups as before.
- The group-qualification is then applied to eliminate some groups.
 - Expressions in group-qualification must have a single value per group!
 - That is, attributes in group-qualification must be arguments of an aggregate op or must also appear in the grouping-list. (SQL does not exploit primary key semantics here!)
- One answer tuple is generated per qualifying group.



Find the age of the youngest sailor with age ≥ 18, for each rating with at least 2 such sailors

```
SELECT S.rating, MIN (S.age)
FROM Sailors S
WHERE S.age >= 18
GROUP BY S.rating
HAVING COUNT (*) > 1
```

sid	sname	rating	age
22	Dustin	7	45.0
31	lubber	8	55.5
71	zorba	10	16.0
64	horatio	7	35.0
29	brutus	1	33.0
58	rusty	10	35.0

rating	age
1	33.0
7	45.0
7	35.0
8	55.5
10	35.0

rating	m-age	count
1	33.0	1
7	35.0	2
8	55.5	1
10	35.0	1

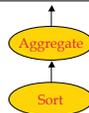
rating	age
7	35.0

Answer relation



Sort GROUP BY: Naïve Solution

- The Sort iterator ensures that all tuples are output in sequence
- The Aggregate iterator keeps running info ("transition values") on agg functions in the SELECT list, per group
 - E.g., for COUNT, it keeps count-so-far
 - For SUM, it keeps sum-so-far
 - For AVERAGE it keeps sum-so-far and count-so-far
- As soon as the Aggregate iterator sees a tuple from a new group:
 - It produces an output for the old group based on the agg function
 - E.g. for AVERAGE it returns (sum-so-far/count-so-far)
 - It resets its running info.
 - It updates the running info with the new tuple's info





An Alternative to Sorting: Hashing!

- **Idea:**
 - Many of the things we use sort for don't exploit the *order* of the sorted data
 - E.g.: forming groups in **GROUP BY**
 - E.g.: removing duplicates in **DISTINCT**
- Often good enough to match all tuples with equal field-values
- Hashing does this!
 - And may be cheaper than sorting! (Hmmm...!)
 - But how to do it for data sets bigger than memory??

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General Idea

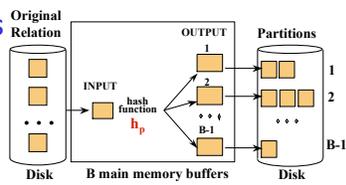
- **Two phases:**
 - **Partition:** use a hash function h_p to split tuples into partitions on disk.
 - We know that all matches live in the same partition.
 - Partitions are "spilled" to disk via output buffers
 - **ReHash:** for each partition on disk, read it into memory and build a main-memory hash table based on a hash function h_r .
 - Then go through each bucket of this hash table to bring together matching tuples

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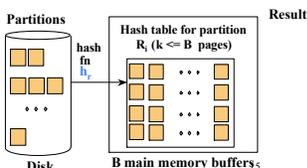


Two Phases

• Partition:



• Rehash:



Analysis

- How big of a table can we hash in two passes?
 - B-1 "spill partitions" in Phase 1
 - Each should be no more than B blocks big
 - Answer: B(B-1).
 - Said differently: We can hash a table of size N blocks in about \sqrt{N} space
 - Much like sorting!
- Have a bigger table? **Recursive partitioning!**
 - In the ReHash phase, if a partition b is bigger than B, then recurse:
 - pretend that b is a table we need to hash, run the Partitioning phase on b , and then the ReHash phase on each of its (sub)partitions

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Hash GROUP BY: Naïve Solution (similar to the Sort GROUPBY)

- The Hash iterator permutes its input so that all tuples are output in groups
- The Aggregate iterator keeps running info ("transition values") on agg functions in the SELECT list, per group
 - E.g., for COUNT, it keeps count-so-far
 - For SUM, it keeps sum-so-far
 - For AVERAGE it keeps sum-so-far and count-so-far
- When the Aggregate iterator sees a tuple from a new group:
 1. It produces an output for the old group based on the agg function
 - E.g. for AVERAGE it returns (sum-so-far/count-so-far)
 2. It resets its running info.
 3. It updates the running info with the new tuple's info

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We Can Do Better!

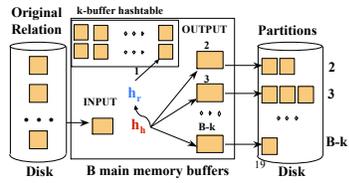
- Combine the summarization into the hashing process
 - During the ReHash phase, don't store tuples, store pairs of the form $\langle \text{GroupVals}, \text{TransVals} \rangle$
 - When we want to insert a new tuple into the hash table
 - If we find a matching GroupVals, just update the TransVals appropriately
 - Else insert a new $\langle \text{GroupVals}, \text{TransVals} \rangle$ pair
- What's the benefit?
 - Q: How many pairs will we have to handle?
 - A: Number of **distinct values** of GroupVals columns
 - Not the number of tuples!
 - Also probably "narrower" than the tuples
- Can we play the same trick during sorting?

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Even Better: Hybrid Hashing

- What if the set of <GroupVals,TransVals> pairs fits in memory
 - It would be a waste to spill it to disk and read it all back!
 - Recall this could be true even if there are *tons* of tuples!
- Idea: keep a smaller 1st partition in memory during phase 1!
 - Output its stuff at the end of Phase 1.
 - Q: how do we choose the number k?



A Hash Function for Hybrid Hashing

- Assume we like the hash-partition function h_p
- Define h_p operationally as follows:
 - $h_p(x) = 1$ if in-memory hashtable is not yet full
 - $h_p(x) = 1$ if x is already in the hashtable
 - $h_p(x) = h_p(x)$ otherwise
- This ensures that:
 - Bucket 1 fits in k pages of memory
 - If the entire set of distinct hashtable entries is smaller than k, we do *no spilling!*

