

# Indexing and Query optimization

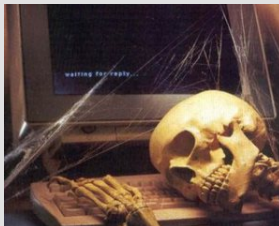
Hogeschool Rotterdam  
Rotterdam, Netherlands

## Lecture topics

- Query optimization.
- Examples of slow query operations.
- Hashing.
- Trees.

## Reasons

- Query needs to be fast.
- Sometimes they are not.
- You do not want to see your nephew born before retrieving the book you are looking for from Amazon.



## Causes

- Too much data (Big data analysis).
  - Data clustering.
  - Better hardware. (arrays of disks, caching, ...)
- Too complex queries (DBMS optimization)
  - Refactor query. (Access planner)
  - Refactor data. (Indexing)

## Indexes

- Query refactoring not always possible.
- Build additional data to speed up the data retrieval.

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- **Answer:** 29 (from page 3 to 32).
- Do the same using the index. How many pages have you looked? **Answer:** 2 (1 in the index, 1 in the text).

```
SELECT name
FROM ships
WHERE firepower = 1500
```

ships				
name	type	firepower	speed	position
Red 1	X-Wing	10	300	(1,3,1)
Red 2	X-Wing	10	300	(1,2,1)
Red 3	X-Wing	10	300	(0,2,5,1)
Red 4	X-Wing	10	300	(2,2,5,1)
Red 5	X-Wing	10	300	(2,2,5,0)
Red 6	X-Wing	10	300	(1,2,5,0)
Tantine IV	Corellian Corvette	60	300	(4,2,5,0)
Tyranny	Imperial Star Destroyer	1500	100	(12,0,0)
Accuser	Imperial Star Destroyer	1500	100	(-12,0,0)
Bombard	Victory Star Destroyer	1500	175	(-6,1,0)

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- **$R$  comparisons**
- Selection always requires to scan the entire table.



- Sorting and grouping requires to sort the column values.
- The best sorting algorithm requires about  $R \log R$  operations, where  $R$  is the number of records.
- Running the query below requires about  $10 * \log 10 \simeq 23$  operations.

```
SELECT type
FROM ships
WHERE firepower = 500
ORDER BY name DESC
```

- Generate pairs with one element from the first table and the second from the other followed by a selection.
- Same problem of the selection.
- Consider the following query applied to ship and the table below.

```
SELECT s.name,p.damage  
FROM ships s,projectiles p  
WHERE s.position = p.position AND  
       s.name = p.target
```

Projectiles		
target	position	damage
Red 3	(0,1,0)	30
Red 3	(3,1,-2)	50
Red 3	(0,2.5,1)	100

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- **How many comparisons does the join make?**
- Each entity of the first table must be compared.
- For each entity of the first table there is a comparison with each entity of the second for each selection condition.
- **Total comparisons:**  $2 \cdot 10 \cdot 3 = 60$ .
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- **What if there are  $C$  conditions?**

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- **What if there are  $C$  conditions?**
- $C \cdot N \cdot M$ .

## Dictionaries and Indices

- A *Dictionary* is a collection of *entries*.
- An *entry* is a pair  $\langle key, value \rangle$ .
- An index can be thought as a dictionary. The key is the search parameter in the index.

## Hash table

- It is an array of *buckets*. Each element of the array is a pointer to a specific bucket.
- A *bucket* is an array used to contain data.
- Insertion uses a *hash function* to map a key to a position in the array.
- The *hash function* always returns a value between 0 and `array.length - 1`.
- Use the hash function to search for a key and go to the corresponding bucket.



# Hash table

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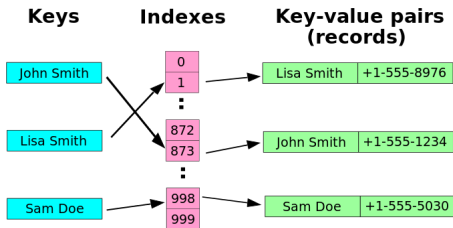
SORTING

JOIN

Indexing

Hashing

Trees



**Figure:** Example of data insertion in a hash table

## Collisions

- The hash function might return duplicate values for two different keys, or for duplicate keys.
- We add an element to the bucket for each collision.
- **What happens if the bucket is full? (*overflow*)**

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- The hash function might return duplicate values for two different keys, or for duplicate keys.
- We add an element to the bucket for each collision.
- **What happens if the bucket is full?** (*overflow*)
- Add a list as overflow bucket. All overflowing entries are stored in the overflow bucket.
- Extend the bucket array when needed.

## Performance (WHERE)

- Consider the query on ships presented in the WHERE slides. Suppose we have a hash table on firepower.
- **How many operations does the selection require?**
- 1 to access the correct bucket, plus 3 operations to read the query in the same bucket = 4 operations vs 10 of non-indexed implementation.

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- **How can the join be implemented?**

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```
for (s : ships)
  for (p : projectiles)
    if (s.name = p.target &&
        s.position = p.position)
      add <s.name,p.damage> to result
```

- We can index one of the tables and put the indexed query as inner query.

## Performance (WHERE)

- What is the cost of the join with a hash index on target<sup>a</sup>?

## Performance (WHERE)

- **What is the cost of the join with a hash index on target<sup>a</sup>?**
- for each record in `ships` we need to access the bucket in the other table
- The only record which matches is 'Red 4'.
- We apply the hash function for 9 out of 10 records in the `ships` table (those which do not match).

---

<sup>a</sup>Assume that the index maps the starting letter of its position in the alphabet order and no collisions



## Performance (WHERE)

- We apply the hash function for 1 out of 10 records in the ships table plus we access 3 records in the projectile table. (that which matches).
- In total  $9 + 3 = 12$  operations. If there is no index on position then we have in total  $12 + 30 = 42$  operations (30 for the non-indexed attribute).

## Performance (WHERE)

- What if we also have an index on position?

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- **What if we also have an index on position?**
- There is one entity in the ships table which matches the condition.
- 9 out of 10 records will not match the condition. So we have only to apply 9 times the hash function.
- 1 record matches the condition (for position = (0,2.5,1)) and we access 1 entry in projectile.
- We have  $9 + 1 = 10$  operations. So if we have both an index on target and one in position we need  $12 + 10 = 22$  operations for the join.
- About 1/3 of the operations required to perform the join without an index.

## Drawbacks of hash tables

- Useless if the condition is not an equality but an inequality (conditions on intervals).
- Useless with ordering/grouping commands.
- A lot of collisions require to extend the buckets/slow down the search if overflow buckets are used.

## Balanced trees

- A graph is a set of vertices connected by edges.
- A tree is a graph without cycles and connected (all nodes can be reached following connections from a starting node).
- The top node is called root.
- The nodes that are directly connected to a node and at a deeper level are called children. The children shares the same parent.
- A node which does not have children is called *leaf*.
- A balanced tree is a tree where the leaves are all at the same level.

## 2-3 Trees

- Balanced tree.
- Every node contains at most 2 entries
- Every node has 2 or 3 children.
- The keys in the left child are less than or equal to the keys in the parent.
- The keys in the middle child are between the min and the max keys stored in the parent.
- The keys in the right child are greater than or equal to the keys in the parent.

## 2-3 tree for an index on name of table ships

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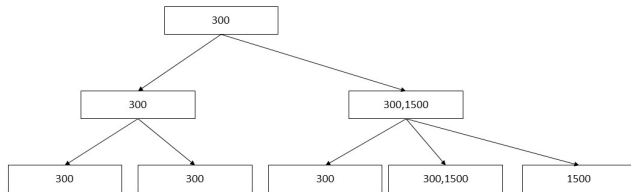


Figure: Index on firepower

## Performance (WHERE)

- Consider the query on ships presented in the WHERE slides. Suppose we have a 2-3 tree index on firepower.
- **How many operations does the selection require?**



## Performance (WHERE)

- Consider the query on ships presented in the WHERE slides. Suppose we have a 2-3 tree index on firepower.
- **How many operations does the selection require?**
- We follow the index and we find 3 entries, reading 4 nodes. We need 4 operations vs 10 operations without an index.

## Performance (JOIN)

- **What is the cost of the join with a 2-3 tree index on name in table ships (see the next slide for the index) <sup>a</sup>?**

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- **What is the cost of the join with a 2-3 tree index on name in table ships (see the next slide for the index) <sup>a</sup>?**
- This time the inner table in the for-loop is ships.
- We need to find 'Red 3' three times in the index. This requires to traverse the whole tree 3 times, for a total of 9 operations.
- We have 9 operations vs the required 30 without indexing.
- In total we have 39 operations vs 60 (position is not indexed).
- This is a very unlucky case, since the entry is stored in a leaf. Imagine we were looking for "Red 4", we would need just 1 operation to get it.

---

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# Performance (JOIN)

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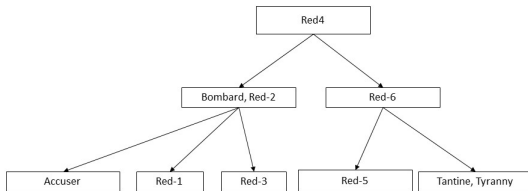


Figure: Index on name

## Performance (JOIN)

- Can you guess what is the generalized formula for the number of operations to search for a key in a 2-3 tree?

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- Can you guess what is the generalized formula for the number of operations to search for a key in a 2-3 tree?
- $\log_2 N$  where  $N$  is the number of entries.

- **What if we also have an index on position** (see the next slide for the index)<sup>1</sup>?

---

<sup>1</sup>Imagine that the key is generated by summing the components of the position

- **What if we also have an index on position** (see the next slide for the index)<sup>1</sup>?
- The position will not match for 2 out of 3 records in projectile. So we have to traverse 3 nodes in the tree twice for a total of 6 operations.
- The last position will match and the entry is stored in the root so we need just 1 operation.
- In total we have 7 operations.
- With both indices we need 16 vs 60 operations without indices.

---

<sup>1</sup>Imagine that the key is generated by summing the components of the position



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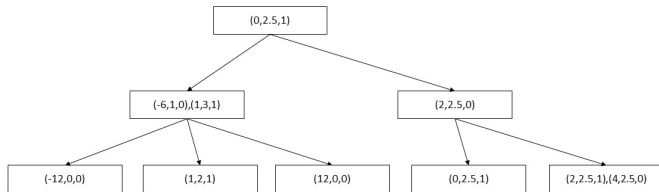


Figure: Index on position

## Ordering/grouping with trees

- A clustered index is an index where the record order in a file is the same in the index.
- If the tree index is clustered we can use the tree for ordering/grouping.
- Just traverse the tree. If the ordering is ascending then visit all the nodes starting from the leftmost and then moving to the rightmost.
- This requires  $N$  steps where  $N$  is the number of entries in the index (vs  $N \log N$  of a traditional ordering algorithm).

**Exercise:** order the `name` attributes in ascending order.

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## Overall evaluation of trees

- Fast with conditions on intervals.
- Fast with ordering/group by.
- The worst case requires to scan  $\log N$  entries before finding our entries (with Hash tables it is at most the size of the largest bucket).

## Golden rules of indexing

- If most of the queries have selections/joins with equalities choose hash tables.
- If most of the queries have selections/joins with inequalities choose trees.
- If you can anticipate there will be a lot of mismatches in the comparisons choose hash tables.
- If you anticipate there will be a lot of collisions (a lot of duplicate values) choose trees.
- If you have a lot of queries with ordering/group by use clustered trees (otherwise do not use clustering).