BITMAP INDEXES

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WHAT IS THIS LECTURE ABOUT?

- Bitmap Indexes
- Bitslice Indexes

MOTIVATION

Consider the following table:

```
CREATE TABLE Tweets (
    uniqueMsgID INTEGER,        -- unique message id
    tstamp      TIMESTAMP,      -- when was the tweet posted
    uid         INTEGER,        -- unique id of the user
    msg         VARCHAR (140), -- the actual message
    zip          INTEGER,        -- zipcode when posted
    retweet      BOOLEAN       -- retweeted?
    );
```

How can we speed up the following query?

```
SELECT * FROM Tweets
WHERE zip BETWEEN 53000 AND 54999 ;
```

B+ tree on attribute zip

MOTIVATION

Consider the following table:

```
CREATE TABLE Tweets (
    uniqueMsgID INTEGER,        -- unique message id
    tstamp      TIMESTAMP,      -- when was the tweet posted
    uid         INTEGER,        -- unique id of the user
    msg         VARCHAR (140), -- the actual message
    zip          INTEGER,        -- zipcode when posted
    retweet      BOOLEAN       -- retweeted?
    );
```

How many bytes does a B+ tree use for each record?

- at least key + rid, so: key-size + rid-size

Can we do better than that (in terms of storage overhead)?

- **yes!** especially when the attribute domain is small

BITMAP INDEX

THE BITMAP INDEX

- Consider building an index to answer *equality* queries on the retweet attribute
- Issues with building a B+ tree:
  - three distinct values: `yes`, `no`, `NULL`
  - many duplicates for each distinct value
  - a weird B+ tree with three long rid lists
- **bitmap index**: build three *bitmap arrays* (stored on disk), one for each value
  - the i^{th} bit in each bitmap corresponds to the i^{th} tuple

    (we need to map the i^{th} position to a rid!)

BITMAP: EXAMPLE

table (stored in heapfile)

uniqueMsgID	…	zip	retweet
1	…	11324	yes
2	…	53705	yes
3	…	53706	no
4	…	53705	NULL
5	…	90210	no
…	…	…	…
1,000,000,000	…	53705	yes

bitmap index (on retweet)

yes	no	null
1	0	0
1	0	0
0	1	0
0	0	1
0	1	0
…	…	…
1	0	0

```
SELECT * FROM Tweets WHERE retweet = “no” ;
```

- scan the “no” bitmap file
- for each bit set to 1, compute the tuple rid
- fetch the tuple

A CRITICAL ISSUE

- We need an efficient way to compute a bit position:
  - layout the bitmap in page-id order
- We need an efficient way to map a bit position to a rid:
  - fix the # records per page in the heapfile
  - lay the pages out so that page-ids are sequential and increasing
  - then construct rid (page-id, slot#)
    - page-id = bit-position / #records-per-page
    - slot# = bit-position % #records-per-page

With variable length records, we have to set the limit based on the size of the largest record, which may result in under-filled pages!

BITMAP: OTHER QUERIES

table (stored in heapfile)

uniqueMsgID	…	zip	retweet
1	…	11324	yes
2	…	53705	yes
3	…	53706	no
4	…	53705	NULL
5	…	90210	no
…	…	…	…
1,000,000,000	…	53705	yes

bitmap index (on retweet)

yes	no	null
1	0	0
1	0	0
0	1	0
0	0	1
0	1	0
…	…	…
1	0	0

```
SELECT COUNT(*) FROM Tweets WHERE retweet = “no” ;

SELECT * FROM Tweets WHERE retweet IS NOT NULL ;
```

STORING A BITMAP INDEX

- One bitmap for each value, and one for NULL
- to store each bitmap, use one file for each
- Bitmaps can be compressed!

index size = #tuples * (domain size + 1) *bits*

When is a bitmap more space efficient than a B+ tree?

#distinct values < data entry size in the B+ tree

BITSLICE INDEX

MOTIVATION

Reconsider the following table:

```
CREATE TABLE Tweets (
    uniqueMsgID INTEGER,        -- unique message id
    tstamp      TIMESTAMP,      -- when was the tweet posted
    uid         INTEGER,        -- unique id of the user
    msg         VARCHAR (140), -- the actual message
    zip          INTEGER,        -- zipcode when posted
    retweet      BOOLEAN       -- retweeted?
    );
```

with the following query:

```
SELECT * FROM Tweets WHERE zip = 53706 ;
```

Building a bitmap index on zip is not a good idea!

BITSLICE INDEX

table (stored in heapfile)

convert to binary

bitslice index

uniqueMsgID	...	zip	retweet
1	...	11324	yes
2	...	53705	yes
3	...	53706	no
4	...	53705	NULL
5	...	90210	no
...	...	...	...
1,000,000,000	...	53705	yes

0001011000011110 0
0110100011100100 1
0110100011100101 0
0110100011100100 1
1011000000110001 0
...
0110100011100100 1

slice 16

higher bit

slice 0

lower bit

1 slice per bit
+ (possibly) one more slice for NULL

BITSLICE INDEX: QUERIES

...	zip
...	11324
...	53705
...	53706
...	53705
...	90210
...	...
...	53705

0001011000011110 0
0110100011100100 1
0110100011100101 0
0110100011100100 1
1011000000110001 0
...
0110100011100100 1
0001011101110000 0

```
SELECT * FROM Tweets
WHERE zip <= 12000 ;
```

1
0
0
0
0
...
0

= **12000** in binary

slice 16 slice 0

walk through each slice constructing a **result bitmap**

- If we look for 0 and have 1, put 0 in the result
- If we look for 1 and have 0, put 1 in the result
- Else we need to consider the next bitslice

OTHER QUERIES

- We can also do aggregates with bitslice indices:
  - e.g. `SUM(attr)`: add bitslice by bitslice
    - count the number of 1s in slice 16 and multiply the count by 2^{16}
    - count the number of 1s in slice 15 and multiply the count by 2^{15}
    - ...
- We can store each slice using methods like what we have for a bitmap (we can compress again!)

BITMAP VS BITSLICE INDEX

- Bitmaps are better for low cardinality domains
- Bitslices are better for high cardinality domains

- It is generally easier to “do the math” with bitmap indices