



Efficient Pagination Using MySQL

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Outline

1. Overview

- Common pagination UI pattern
- Sample table and typical solution using OFFSET
- Techniques to avoid large OFFSET
- Performance comparison
- Concerns



Common Patterns

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Basics

First step toward having efficient pagination over large data set

- Use index to filter rows (resolve WHERE)
- Use same index to return rows in sorted order (resolve ORDER)

Step zero

- <http://dev.mysql.com/doc/refman/5.1/en/mysql-indexes.html>
- <http://dev.mysql.com/doc/refman/5.1/en/order-by-optimization.html>
- <http://dev.mysql.com/doc/refman/5.1/en/limit-optimization.html>



Using Index

KEY a_b_c (a, b, c)

ORDER may get resolved using Index

- ORDER BY a
- ORDER BY a,b
- ORDER BY a, b, c
- ORDER BY a DESC, b DESC, c DESC

WHERE and ORDER both resolved using index:

- WHERE a = const ORDER BY b, c
- WHERE a = const AND b = const ORDER BY c
- WHERE a = const ORDER BY b, c
- WHERE a = const AND b > const ORDER BY b, c

ORDER will not get resolved using index (file sort)

- ORDER BY a ASC, b DESC, c DESC /* mixed sort direction */
- WHERE g = const ORDER BY b, c /* a prefix is missing */
- WHERE a = const ORDER BY c /* b is missing */
- WHERE a = const ORDER BY a, d /* d is not part of index */



Sample Schema

```
CREATE TABLE `message` (  
  `id` int(11) NOT NULL AUTO_INCREMENT,  
  `title` varchar(255) COLLATE utf8_unicode_ci NOT NULL,  
  `user_id` int(11) NOT NULL,  
  `content` text COLLATE utf8_unicode_ci NOT NULL,  
  `create_time` int(11) NOT NULL,  
  `thumbs_up` int(11) NOT NULL DEFAULT '0', /* Vote Count */  
  PRIMARY KEY (`id`),  
  KEY `thumbs_up_key` (`thumbs_up`, `id`)  
) ENGINE=InnoDB
```

```
mysql> show table status like 'message' \G  
      Engine: InnoDB  
      Version: 10  
      Row_format: Compact  
        Rows: 50000040      /* 50 Million */  
  Avg_row_length: 565  
    Data_length: 28273803264 /* 26 GB */  
   Index_length: 789577728  /* 753 MB */  
     Data_free: 6291456  
   Create_time: 2009-04-20 13:30:45
```

Two use case:

- Paginate by time, recent message one page one
- Paginate by thumbs_up, largest value on page one



Typical Query

1. Get the total records

```
SELECT count(*) FROM message
```

2. Get current page

```
SELECT * FROM message  
ORDER BY id DESC LIMIT 0, 20
```

- <http://domain.com/message?page=1>
 - ORDER BY id DESC LIMIT 0, 20
- <http://domain.com/message?page=2>
 - ORDER BY id DESC LIMIT 20, 20
- <http://domain.com/message?page=3>
 - ORDER BY id DESC LIMIT 40, 20

Note: id is auto_increment, same as create_time order, no need to create index on create_time, save space

Explain

```
mysql> explain SELECT * FROM message
        ORDER BY id DESC
        LIMIT 10000, 20\G
***** 1. row *****
      id: 1
select_type: SIMPLE
      table: message
      type: index
possible_keys: NULL
      key: PRIMARY
      key_len: 4
      ref: NULL
      rows: 10020
      Extra:
1 row in set (0.00 sec)
```

- it can read rows using index scan and execution will stop as soon as it finds required rows.
- **LIMIT 10000, 20 means it has to read 10020 and throw away 10000 rows, then return next 20 rows.**



Performance Implications

- Larger OFFSET is going to increase active data set, MySQL has to bring data in memory that is never returned to caller.
- Performance issue is more visible when your have database that can't fit in main memory.
- Small percentage of request with large OFFSET would be able to hit disk I/O
Disk I/O bottleneck
- In order to display “21 to 40 of 1000,000” , some one has to count 1000,000 rows.



Simple Solution

- Do not display total records, does user really care?
- Do not let user go to deep pages, redirect him
http://en.wikipedia.org/wiki/Internet_addiction_disorder after certain number of pages



Avoid Count(*)

1. Never display total messages, let user see more message by clicking 'next'

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2. Do not count on every request, cache it, display stale count, user do not care about 324533 v/s 324633
3. Display 41 to 80 of **Thousands**
4. Use pre calculated count, increment/decrement value as insert/delete happens.



Solution to avoid offset

1. Change User Interface

- No direct jumps to Nth page

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2. LIMIT N is fine, Do not use LIMIT M,N

- Provide extra **clue** about from where to start given page
- Find the desired records using more restricted WHERE using given **clue** and ORDER BY and LIMIT N without OFFSET)



Find the clue

150

111

102

101

100

Page One

```
<a href="/page=2;last_seen=100;dir=next>Next</a>
```

98

```
<a href="/page=1;last_seen=98;dir=prev>Prev</a>
```

97

96

Page Two

95

94

```
<a href="/page=3;last_seen=94;dir=next>Next</a>
```

93

```
<a href="/page=3;last_seen=93;dir=prev>Prev</a>
```

92

91

Page Three

90

89

```
<a href="/page=4;last_seen=89;dir=prev>Next</a>
```



Solution using clue

Next Page:

http://domain.com/forum?page=2&last_seen=100&dir=next

```
WHERE id < 100 /* last_seen *  
ORDER BY id DESC LIMIT $page_size /* No OFFSET*/
```

Prev Page:

http://domain.com/forum?page=1&last_seen=98&dir=prev

```
WHERE id > 98 /* last_seen *  
ORDER BY id ASC LIMIT $page_size /* No OFFSET*/
```

Reverse given 10 rows before sending to user



Explain

```
mysql> explain
        SELECT * FROM message
        WHERE id < '49999961'
        ORDER BY id DESC LIMIT 20 \G
***** 1. row *****
      id: 1
  select_type: SIMPLE
        table: message
         type: range
possible_keys: PRIMARY
          key: PRIMARY
     key_len: 4
         ref: NULL
        Rows: 25000020 /* ignore this */
     Extra: Using where
1 row in set (0.00 sec)
```



What about order by non unique values?

99	Page One
99	
98	
98	
98	
98	Page Two
98	
97	
97	
10	

We can't do:

```
WHERE thumbs_up < 98
ORDER BY thumbs_up DESC /* It will return few seen rows */
```

Can we say this:

```
WHERE thumbs_up <= 98
AND <extra_con>
ORDER BY thumbs_up DESC
```


Add more condition

- Consider thumbs_up as major number
 - if we have additional minor number, we can use combination of major & minor as extra condition
- Find additional column (minor number)
 - we can use id primary key as minor number



Solution

First Page

```
SELECT thumbs_up, id
FROM message
ORDER BY thumbs_up DESC, id DESC
LIMIT $page_size
```

```
+-----+-----+
| thumbs_up | id |
+-----+-----+
|          99 | 14 |
|          99 |  2 |
|          98 | 18 |
|          98 | 15 |
|          98 | 13 |
+-----+-----+
```

Next Page

```
SELECT thumbs_up, id
FROM message
WHERE thumbs_up <= 98 AND (id < 13 OR thumbs_up < 98)
ORDER BY thumbs_up DESC, id DESC
LIMIT $page_size
```

```
+-----+-----+
| thumbs_up | id |
+-----+-----+
|          98 | 10 |
|          98 |  6 |
|          97 | 17 |
+-----+-----+
```



Make it better..

Query:

```
SELECT * FROM message
WHERE thumbs_up <= 98
      AND (id < 13 OR thumbs_up < 98)
ORDER BY thumbs_up DESC, id DESC
LIMIT 20
```

Can be written as:

```
SELECT m2.* FROM message m1, message m2
WHERE m1.id = m2.id
      AND m1.thumbs_up <= 98
      AND (m1.id < 13 OR m1.thumbs_up < 98)
ORDER BY m1.thumbs_up DESC, m1.id DESC
LIMIT 20;
```

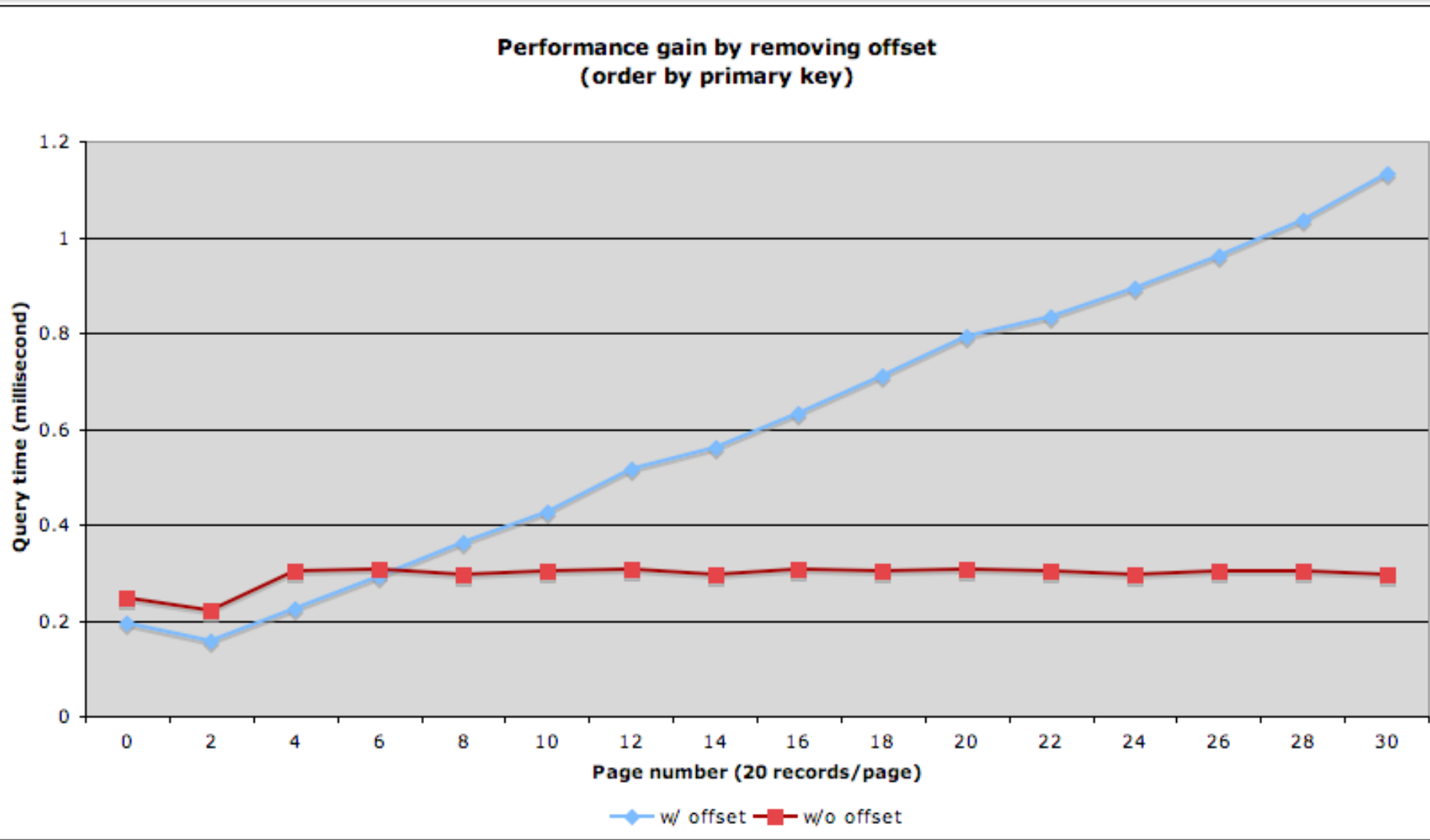


Explain

```
***** 1. row *****
  id: 1
  select_type: SIMPLE
  table: m1
  type: range
possible_keys: PRIMARY,thumbs_up_key
  key: thumbs_up_key /* (thumbs_up,id) */
  key_len: 4
  ref: NULL
  Rows: 25000020 /*ignore this, we will read just 20 rows*/
  Extra: Using where; Using index /* Cover */
***** 2. row *****
  id: 1
  select_type: SIMPLE
  table: m2
  type: eq_ref
possible_keys: PRIMARY
  key: PRIMARY
  key_len: 4
  ref: forum.m1.id
  rows: 1
  Extra:
```

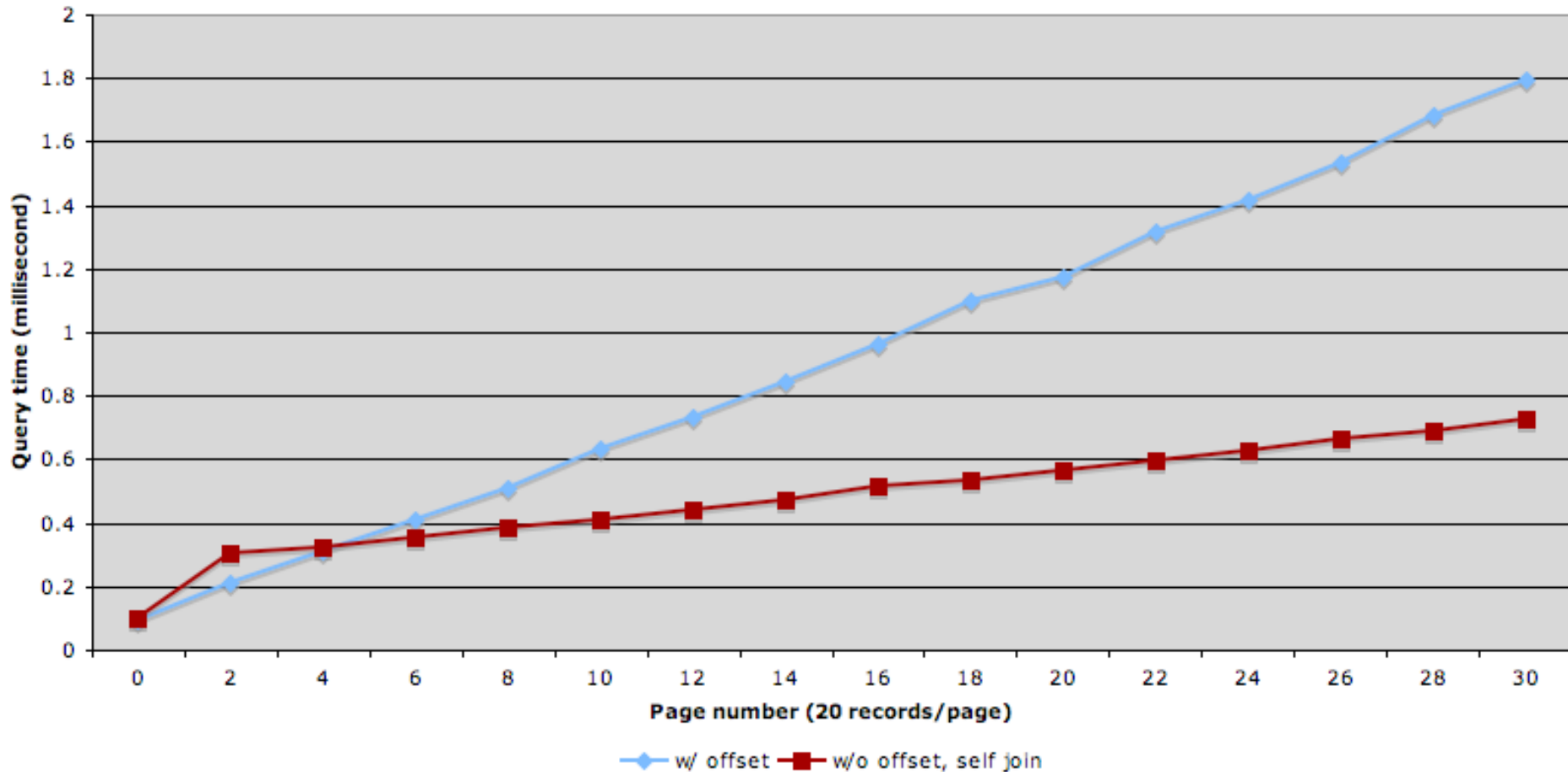


Performance Gain (Primary Key Order)



Performance Gain (Secondary Key Order)

Performance gain by removing offset, using self join
(order by secondary key)



Throughput Gain

- Throughput Gain while hitting first 30 pages:
 - Using LIMIT OFFSET, N
 - 600 query/sec
 - Using LIMIT N (no OFFSET)
 - 3.7k query/sec



Bonus Point

Product issue with LIMIT M, N

User is reading a page, in the mean time some records may be added to previous page.

Due to insert/delete pages records are going to move forward/backward as rolling window:

- User is reading messages on 4th page
- While he was reading, one new message posted (it would be there on page one), all pages are going to move one message to next page.
- User Clicks on Page 5
- One message from page got pushed forward on page 5, user has to read it again

No such issue with news approach



Drawback

Search Engine Optimization Expert says:

Let bot reach all you pages with fewer number of deep dive

Two Solutions:

- Read extra rows
 - Read extra rows in advance and construct links for few previous & next pages
- Use small offset
 - Do not read extra rows in advance, just add links for few past & next pages with required offset & `last_seen_id` on current page
 - Do query using new approach with small offset to display desired page

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Additional concern: Dynamic urls, `last_seen` is not constant over time.



Thanks

