PAPER SHARE: Optimizing Flash-based Key-value Cache Systems

2025.02.28 Jun

Background:Slab Allocator

PAPER: The slab allocator: An object-caching kernel memory allocator.

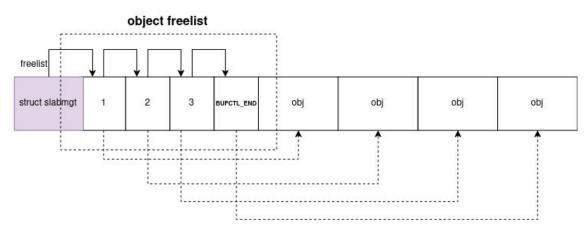
Slab allocator is self-tuning segregatted list allocator in some sense.

Slab: The basic memory management unit(A continuous memory area)

Slot: A slot is an equally-sized memory block within a slab, used for storing object.

Freelist: Freelist manages all free slots. The core of allocation/deallocation is to remove objects from

or return objects back to the freelist.



Background: KV Cache On SSD

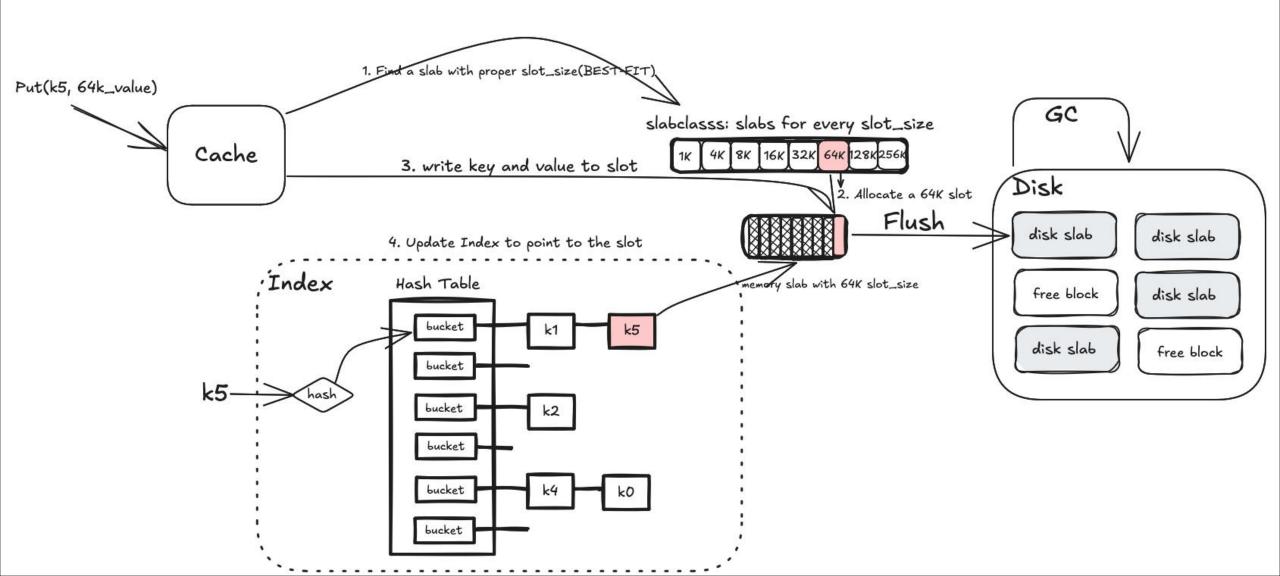
Two key differences:

- 1. Single layer memory slab allocator -> Two layers(memory and disk) slab allocator
- 2. KV Cache has to manage indexes of objects, while kernel slab allcoator doesn't.

Key ideas:

- 1. Buffer writes in memory slab(mslab) and flush them into disk slab(dslab) later.
- 2. Index objects using hash table for fast query.

Background: KV Cache On SSD



Issues: Redundency

Issues:

- 1. Redundent mapping
 - 1. Cache index and SSD FTL mapping
 - 2. Redundent SSD page level mapping
- 2. Double garbage collection(GC)
 - 1. Cache GC and SSD GC
 - 2. SSD GC can't free blocks even the data lock doesn't hold any valid objects.
- 3. Wasted over-provisioning space(OPS)

Solutions: Bypass SSD

Application Layer: Manage SSD at Aplication Level

- 1. Redundent mapping -> application level slab/block mapping
- 2. Double garbage collection(GC) -> application level slab/block GC
- 3. Wasted over-provisioning space(OPS) -> application level self-tuning OPS

SSD Layer: Customed SSD

- 1. Bypass redundent FTL functions: mapping, wear-leveling and GC.
- 2. Retain few FTL functions: error handling, flash control and etc.

Implementation: SSD

- 1. Simulate Open-Channel SSD by RocksDV KV pair: BlockID -> BlockData
- 2. Simulate Open-Channel SSD by Linux disk device read/write API for benchmark
- 3. Implement channel load balancing at application level

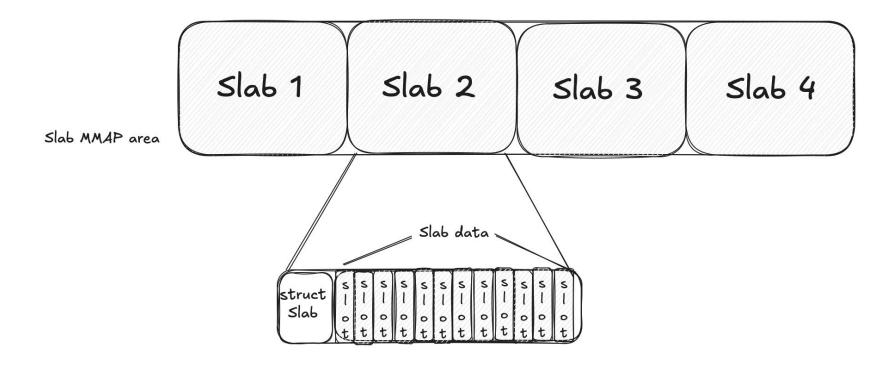
```
1 // RocksDB keys
2 /nr_blocks
3 /blocks_per_channel
4 /nr_channels
5 /blocks/<channel-id>/<block-id> -> Block Data
```

```
1 // Open disk device, such as /dev/loopO.
2 fd_ = open(device, O_RDWR | O_DIRECT, 0644);
3
4 // The block is located at the disk device offset of block_id * block_size.
5 offset = block_id * block_size;
6 // Read block to read_buffer.
7 nread = pread(fd_, read_buffer, block_size, block_id*block_size);
8 // Write new block_data to the block
9 nwrite = pwrite(fd_, block_data, block_size, offset);
```

Implementation: Mapping

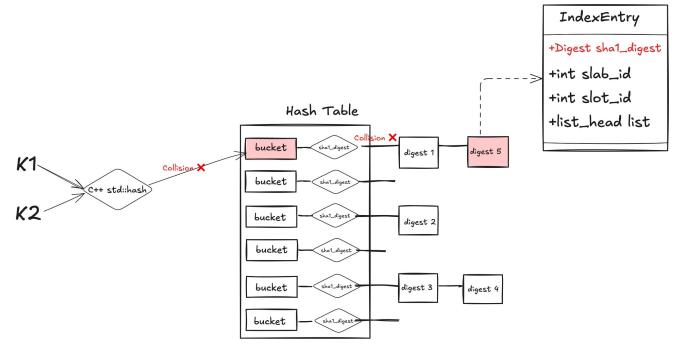
Mapping:

- 1. A slab occupies a block, so a slab is equivalent to a disk block.
- 2. SSD page level mapping -> application level slab/block mapping



Implementation: Index

- 1. Store SHA1 digest(20 bytes) instead of the original key to reduce index size.
- 2. It is possible to map two different keys in a same index entry due to hash collision.
- 3. PUT overwites the index entry with the same hash value.
- 4. GET compares the key after reading the KV pair, thereby avoiding returning the conflicting key.



Implementation: Index Efficiency

Efficiency:

- 1. Current index entry size: 20B SHA1 digest + 8B slab_8 id + 8B slot_id + 8B list pointer = 36B
- 2. The index entry size can be further reduced.
 - 1. SHA1 digest -> MD5 digest or other algorithms with shorter length
 - 2. Store the original key when the key length is less than the hash digest length.
 - 3. Reduce the linked list pointer to 4 bytes (capable of indexing 4G entries) or even smaller.

Implementation: Concurrency

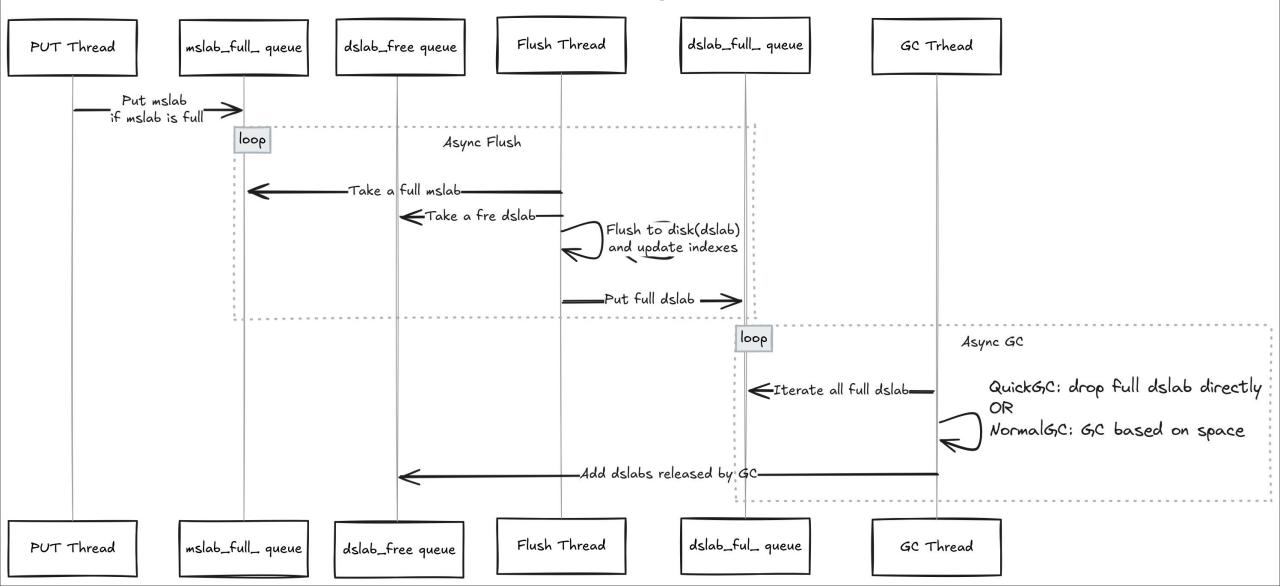
API:

- 1. PUT and DELETE are serialized through locks.
- 2. GET can be executed concurrently with PUT/DELETE.

Internals:

- 1. The critical section mainly involves reading and writing the index.
- 2. Both flush and GC are executed by background threads.
- 3. Critical sections do not involve disk IO.

Implement: Concurrency



Implementation: Self-Tuning OPS

Goal: Increase OPS under high write pressure and decrease OPS under low write pressure.

Key Ideas: Tune OPS based on the number of free blocks and watermarks

- 1. [low_watermark, high_watermark]: system is under light write presure.
- 2. [0, low_watermark]: system is under high write pressure.
- 3 [high_watermark, nr_blocks]: system has no write pressure.

Implementation: GC

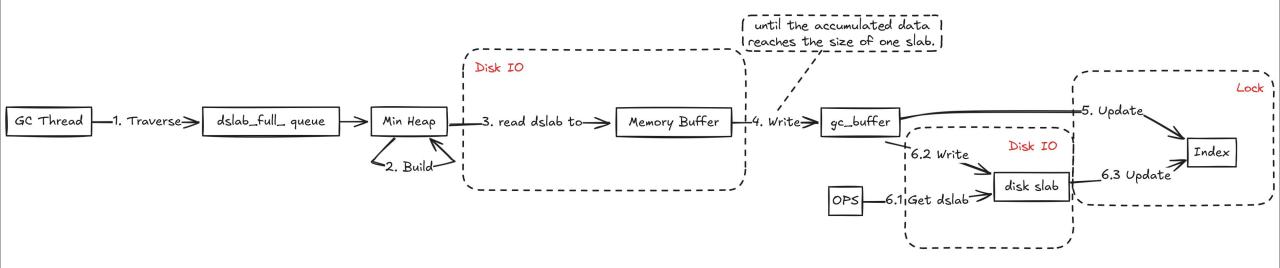
- 1. Run self-tuning OPS algorithm in every rounds of GC.
- 2. NormalGC: Space-based GC to reclaim as much disk space and index entries as possible.
- 2. QuickGC: Drop slabs directly to response write pressure quickly.

Implementation: QuickGC

- 1. Drop 1.8*low_watermark full dslabs.
- 2. Return a portion of the dslab to OPS, doubling the OPS size.
- 3. The remainning portion is returned to dslab_free_ queue(free blocks).
- 4. Increase low_watermark/high_watermark to 1.5X.

Implementation: NormalGC

- 1. GC the full dslabs containing the largest number of obsolete value items.
- 2. Decrease watermark and OPS linearly.
- 3. The critical section only involves index modification without disk IO.



Evaluation: Method

- 1. Google Test benchmark framework
 - 1. Unit tests: Basic operations, edge cases, concurrency tests and etc.
 - 2. Benchmark: PUT, GET and DELETE 4*ssd_SIZE data on local SSD.
- 2. Twitter's twemperf: A memcached benchmark tool
 - 1. Use Twitter's fatcache as the baseline of performance benchmark.
 - 2. Replace fatcache's PUT/GET implementation with my own implementation.

Evaluation: Tool

- 1. /dev/loop: I mounted the file as /dev/loop because fatcache needs to directly open the disk device and read/write to it.
- 2. twemperf: Send SET/GET commands to Memcached at a specific rate.

Evaluation: Local SSD

Workload: Put and Get 4 SSDs with random key and value size single-threadedly.

Simulated SSD configuration: 200MiB SSD with 200KiB block size.

KVCache configuration: 10MiB Slab memory, 1Mib index memory and 512K hash buckets.

Local SSD:970MiB/s seqwrite and 694MiB/s for 200KiB block size

\$make benchmark

write_seconds: 1.6887 read_seconds: 0.446772

Write: 4913.83 ops/s, actual write **473.80** MiB/s

Read: 111314.07 ops/s, actual read 2062.72 MiB/s

Evaluation: Heavy Write load with zero garbage

fatcache configuration: 4KiB slab_size, 64MiB index memory, 64MiB slab memory and **1GiB** SSD.

Workload: object_size 1K, total_data_size **1GiB**, request_rate 100MiB/s, garbage rate 0%.

\$ src/mcperf --sizes=u1000,1000 --num-calls=10000 --num-conns=100 --call-rate=1000 --conn-rate=10000 --method=set

| | KVCache(RocksDB) | KVCache(dev) | fatcache |
|----------------|------------------|---------------|---------------|
| Put | 99871.7 rsq/s | 99860.1 rsq/s | 99831.8 rsq/s |
| Get | 97751.2 rsq/s | 90967.3 rsq/s | 65229.4 rsq/s |
| Cache-Hit Rate | 68.7% | 68.1% | 84.3% |

Evaluation: Heavy Write load with zero garbage

- 1. KVCache achieves better GET performance because a lot of keys are NOT-FOUND.
- 2. KVCache has a lower cache-hit rate because QuickGC drops disk slab too aggressively under high write pressure.
- 3. FatCache drops one disk slab when the disk is full.
- 4. If the data set is bigger than SSD size, KVCache and FatCache have the same cache hit rate.

| | KVCache(RocksDB) | KVCache(dev) | fatcache |
|----------------|------------------|---------------|---------------|
| Put | 99871.7 rsq/s | 99860.1 rsq/s | 99831.8 rsq/s |
| Get | 97751.2 rsq/s | 90967.3 rsq/s | 65229.4 rsq/s |
| Cache-Hit Rate | 68.7% | 68.1% | 84.3% |

Evaluation: Heavy Write load with 50% garbage

fatcache configuration: 4KiB slab_size, 64MiB index memory, **64MiB** slab memory and **1GiB** SSD.

Workload: object_size 1K, total_data_size **2GiB**, request_rate **10MiB/s**, garbage ratio **50%**.

\$ for i in {0..4}; do echo \$i; src/mcperf --sizes=u1000,1000 --num-calls=5000 --num-conns=100 --call-rate=100 --conn-rate=10000 --method=set --server=0.0.0.0 --port=11211; done

| | KVCache(RocksDB) | fatcache |
|----------------|------------------|--------------|
| Put | 9999.5 rsq/s | 9999.5 rsq/s |
| Get | 9999.9 rsq/s | 9999. rsq/s |
| Cache-Hit Rate | 100% | 6.88% |

Evaluation: Heavy Write load with 50% garbage

- 1. KVCache NormalGC effectively reclaimed garbage, ensuring that the system always has sufficient free blocks.
- 2. FatCache directly discards slabs when it runs out of capacity, which results in a lower cache hit rate.
- 3. FatCache has an unbelievably low cache hit ratebecause it always drops the most recently written disk slab.

| | KVCache(RocksDB) | FatCache |
|----------------|------------------|--------------|
| Put | 9999.5 rsq/s | 9999.5 rsq/s |
| Get | 9999.9 rsq/s | 9999.9 rsq/s |
| Cache-Hit Rate | 100% | 6.88% |

Evaluation: Async Flush and GC

1. background_flush=false triggers QuickGC, causing low cache hit.

2.

| | flush = 0 gc = 0 | flush = 0 gc = 1 | flush = 1 gc = 0 | flush = 1 gc = 1 |
|----------------|---------------------|---------------------|---------------------|---------------------|
| Put | 9999.9 rsp/ | 9999.9 rsp/ | 9999.9 rsp/s | 9999.9 req/s |
| Get | 9999.9 rsp/s | 9999.9 rsp/s | 9999.9 rsp/s | 9999.9 req/s |
| Cache Hit Rate | 21.4% | 100% | 21.4% | 100% |