

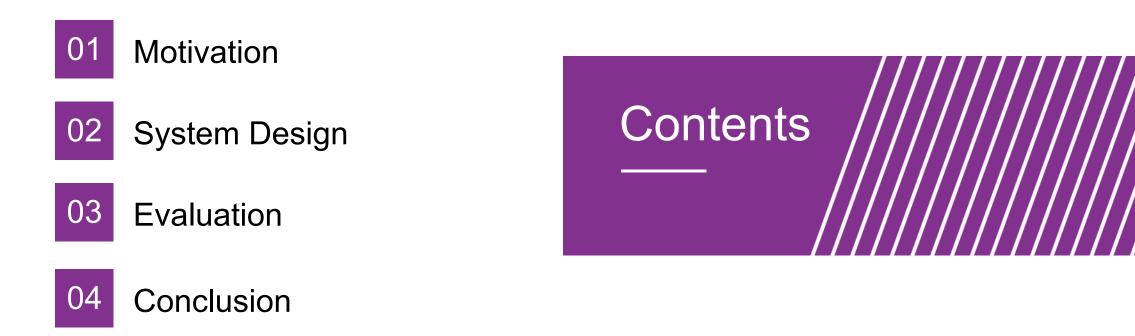


# CableCache: In-Network Request Deduplication for Key-Value Stores

Jiawei Huang<sup>1</sup>, Junru Li<sup>1</sup>, Qing Wang<sup>1</sup>, Lijie Wen<sup>1</sup>, Youyou Lu<sup>1</sup>, Erci Xu<sup>2</sup>

<sup>1</sup>Tsinghua University; <sup>2</sup>SJTU







#### The load imbalance problem in key-value stores

- Key-value stores are widely deployed in modern data centers.
- Key-value stores face a key challenge posed by skewed dynamic workloads, which can lead to load imbalances.
  - Facebook: 10% of objects account for 60%~90% of requests.
  - Alibaba: The Zipfian parameter reaches 0.9~0.99 in daily scenarios and 1~1.22 in extreme cases.



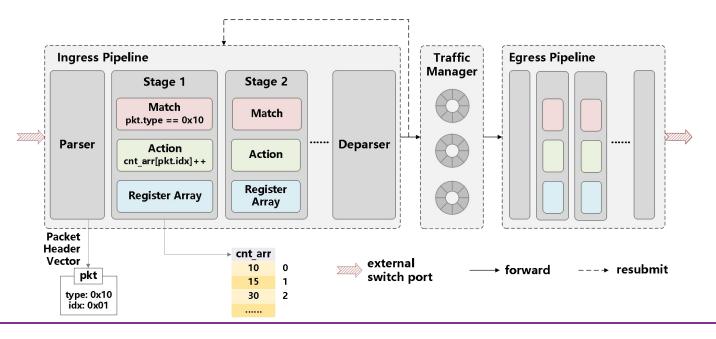






#### A novel network hardware — programmable switch

- Programmable switches utilize programmable acceleration chips to support userdefined network protocols and packet forwarding logic.
- Current programmable switches contain multiple ingress and egress pipelines.
- A single pipeline consists of multiple stages.







#### Two advantages of the programmable switch

#### Position:

processes network packets in the transfer path between clients and storage servers.



### Performance:

enables line-rate packet forwarding with throughput on the order of Tbps.



Existing methods' limitations

**NetCache / FarReach:** caches hot objects

directly in programmable switches

- The size of object values cannot exceed 128 B.
- NetCache does not support write caching.
- FarReach supports write caching but needs complex measures to handle switch failure.

**Pegasus**: ransfers the directory of selective replication to programmable switches

- The size of object values cannot exceed MTU.
- Directing all requests to storage servers results in longer access paths.
- A complex chain replication protocol is required to prevent data inconsistency caused by switch failure.



#### Real workloads analysis

- **Twitter**: the top 1% hot objects in 54 workloads of different clusters
  - 35 workloads contain hot objects >128B.
  - 18 workloads contain hot objects >1500 B (Ethernet MTU).
  - 10 workloads contain hot objects >9000 B (jumbo frame max).
  - 25 workloads show median hot object sizes >128 B.
  - 16 workloads include read-modify-write requests (not supported by previous work).
- Facebook: the top 1% hot objects in October 2022 sampled workloads
  - 19.35% of top 1% hot objects exceed 128B, yet they generate 86.99% of network traffic.



#### Request collision analysis

- processing latency: refers to the time interval between a switch receiving a request and its corresponding reply.
- **request collision**: occurs when the processing latency periods of requests for the same object overlap.

| ~    | <i>L</i> (μs) |        |        |        |        |  |  |  |  |  |
|------|---------------|--------|--------|--------|--------|--|--|--|--|--|
| α    | 10            | 25     | 50     | 75     | 100    |  |  |  |  |  |
| 0.99 | 41.67%        | 49.56% | 55.56% | 59.09% | 61.59% |  |  |  |  |  |
| 1.11 | 61.66%        | 67.86% | 72.53% | 75.12% | 76.90% |  |  |  |  |  |
| 1.22 | 72.41%        | 79.41% | 82.81% | 84.61% | 85.81% |  |  |  |  |  |

The weighted probability of request collisions for the top 65536 objects.

keyspace: 250 M, system-wide throughput: 100 MRPS

**a**: Zipfian parameter, **L**: processing latency





#### Comparison of Different Methods

| Name       | Operation                        | <b>Object Size</b>              | Access Path | Switch Failure<br>Handling |  |
|------------|----------------------------------|---------------------------------|-------------|----------------------------|--|
| NetCache   | read                             | $\leq$ 128 B                    | short       | simple                     |  |
| FarReach   | read & write                     | read & write $\leq 128$ B shows |             | complex                    |  |
| Pegasus    | read & write                     | $\leq 1 \text{ MTU}$            | long        | complex                    |  |
| CableCache | read & write & read-modify-write | $\leq$ 32 MTU                   | medium      | simple                     |  |

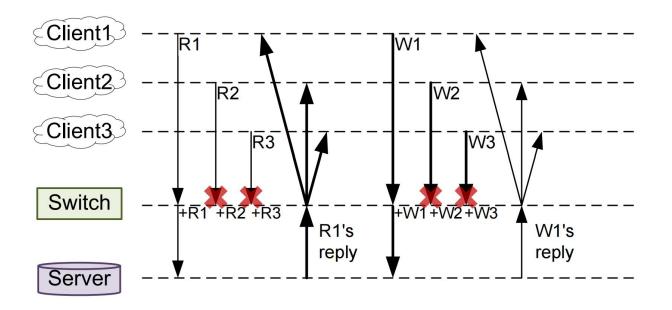
**CableCache's core idea:** Maintaining an object request information directory in the programmable switch to avoid repeated requests for hot objects.





## Packet flow

- CableCache separates the deduplication processing of read and write requests.
- The first read request R1 will be recorded in the switch and sent to the storage server.
- The read request R2 and R3 will be recorded and then dropped.
- The write packet flow is similar.







#### Packet header format

- We propose the In-Network Request Deduplication (INRD) protocol, an applicationlayer protocol using a specific UDP source port.
  - n\_id: the target node ID
  - **c\_map**: the one-hot encoding of the client ID
  - t\_map: the one-hot encoding o the thread ID
  - **op**: the operation type (e.g. read request, read reply, write request, write reply)

| Existing Protocols |    |       |      | INRD Protocol |       |    |     |     |      |                                |
|--------------------|----|-------|------|---------------|-------|----|-----|-----|------|--------------------------------|
| ETH                | IP | UDP   | n_id | c_map         | t_map | ор | key | idx | flag | multi-packet<br>related fields |
| L2/L3 Routing      |    | srcPo |      |               |       |    |     | pł  |      | it, pkt_idx,<br>obj_ver, etc.  |





#### Packet header format

- We propose the In-Network Request Deduplication (INRD) protocol, an applicationlayer protocol using a specific UDP source port.
  - **key**: the target key (fixed length, 32 bits)
  - **idx**: the record index within the switch (hash the 32-bit key to 16 bits)
  - **flag**: "0": direct forwarding; "1": executing deduplication logic (client default value)
  - multi-packet related fields: to handle multi-packet objects' requests

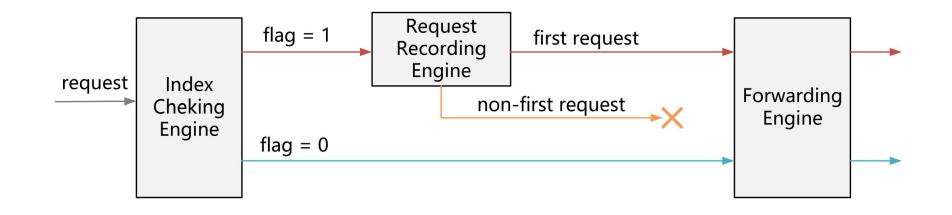
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#### Switch request processing

- **index checking engine**: state register array + key register array
  - If the state register value is "0", set the state register to "1", set the key register to the key field value, and mark the request as "first request".
  - If the state register value is "1", when the key register value mismatches the key field, set the flag field to "0" and forward the request packet directly.

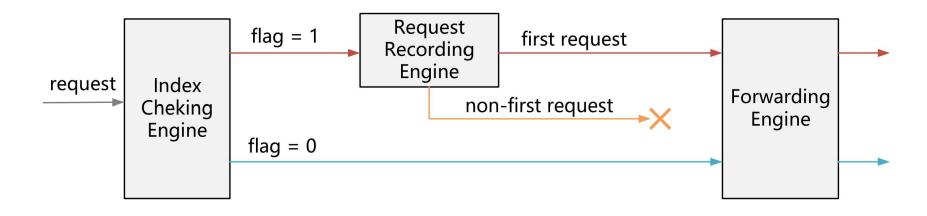






#### Switch request processing

- request recording engine: client bitmap register array + thread bitmap register array
  - The client bitmap register and the corresponding thread bitmap register are updated with the c\_map and t\_map fields using the bitwise OR operation.
  - If the request is marked as "first request", forward it to the storage server.
  - If the request is not marked as "first request", drop it directly.
- **forwarding engine**: set forwarding information for the packet

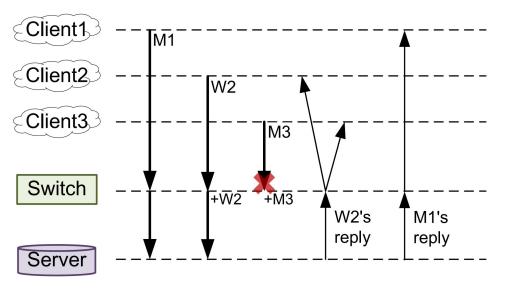






#### Complex scenario #1: read-modify-write request

- CableCache integrates RMW requests into the write request deduplication module.
- RMW requests can't be marked as "first request" to guarantee linearizability.
- The switch will set the flag field to "0" and directly forward the RMW request M1.
- The first write request W2 will be recorded in the switch and sent to the storage server.
- The RMW request M3 will be recorded and then dropped.

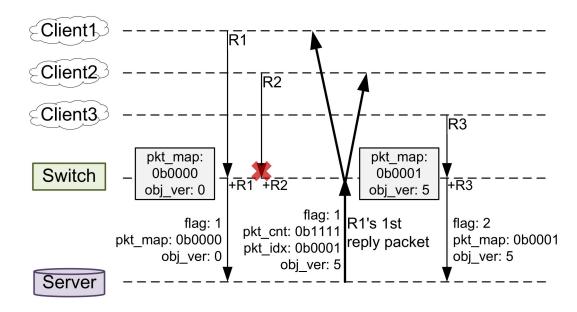






#### Complex scenario #2: multi-packet object

- CableCache employs a compensatory read mechanism to handle multi-packet objects' read requests.
- The switch maintains a **pkt\_map register array** and an **obj\_ver register array**, representing received reply packet IDs' bitmap and the object version number.

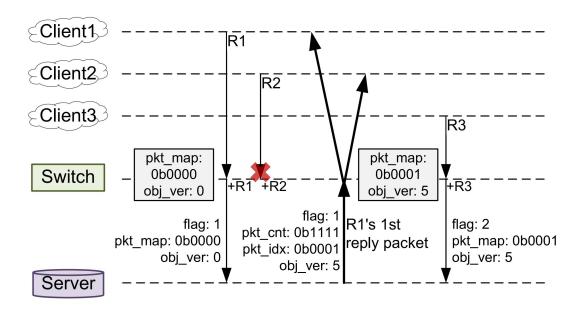






#### Complex scenario #2: multi-packet object

- When the non-first read request arrives, if the pkt\_map register value is "0", the request will be recorded and dropped (e.g., R2).
- Otherwise, the pkt\_map and obj\_ver registers will be set, and the flag field will be set to "2", which means the compensatory read mechanism should be used (e.g., R3).

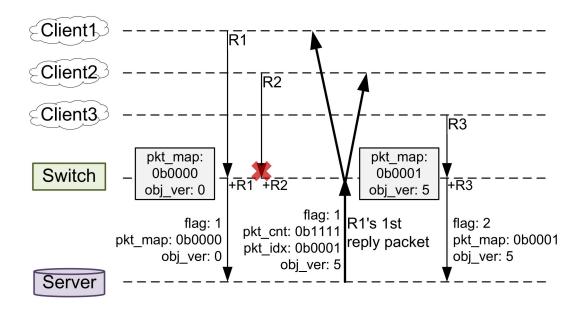






#### Complex scenario #2: multi-packet object

- The storage server checks whether its recorded object version number is ahead of the packet's obj\_ver field.
- If not, the server only returns the reply packets indicated by the pkt\_map field.
- Otherwise, the server must return all reply packets.







#### Discussion #1: variable-length key

- The variable-length key needs to be mapped to 32 bits using a hash function.
- The original key must be included after the header.
- If a client receives the reply packet mismatching its target key, it should resend the request while bypassing the request deduplication logic.

## Discussion #2: packet loss

- A timeout mechanism can be used by clients to address packet loss issues.
- A timestamp checking mechanism can be introduced to prevent the issue of record indexes being continuously occupied.





## Methodology

- Testbed
  - 6 hosts are connected by a Barefoot Tofino Wedge 100BF-32X switch.
  - 4 hosts act as clients, each running 12 threads.
  - 2 hosts each run 12 threads to simulate 24 storage servers.
- Default workload
  - keyspace: 100 MB, Zipfian parameter: 0.99
  - proportion of request types: 90% (read) : 8% (write) : 2% (CAS)
- Default configuration
  - MTU: 1092 B, storage backend: Redis, cache record count: 65536
  - **object value size**: 512 B (single-packet) and 4096 B (multi-packet)
  - coroutine count per client thread: 16

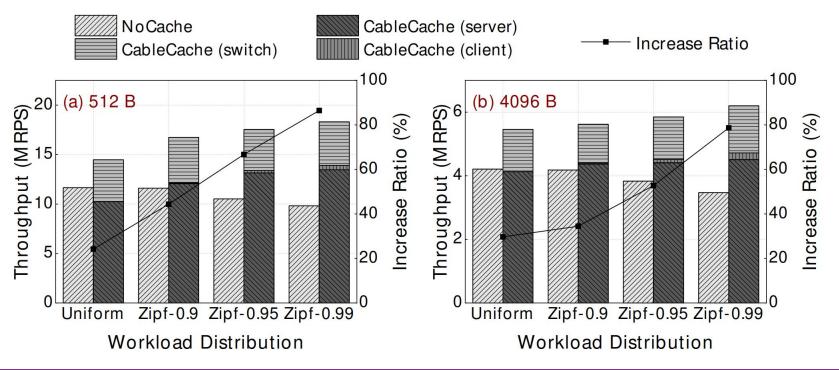




### Throughput analysis

- The increase ratio of throughput grows significantly as the workload skew intensifies.
- Higher workload skew exacerbates load imbalance across storage servers, leading to

more frequent request collisions.

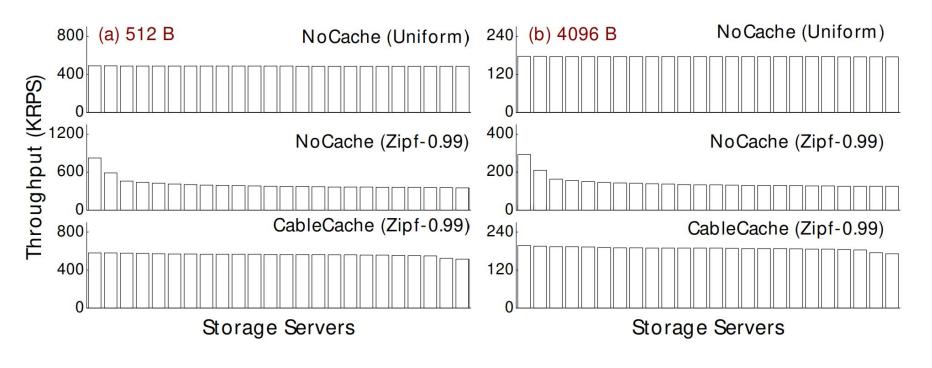






### Throughput analysis

- The figure presents the load distribution across different storage servers, sorted in descending order.
- CableCache significantly improves load balancing across storage servers.

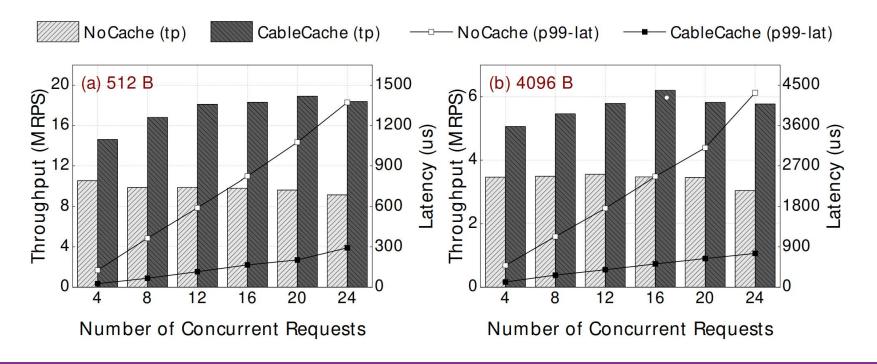






#### Latency analysis

- The number of concurrent requests equals to the number of coroutines per thread.
- CableCache can mitigate tail latency escalation caused by higher concurrency levels effectively.

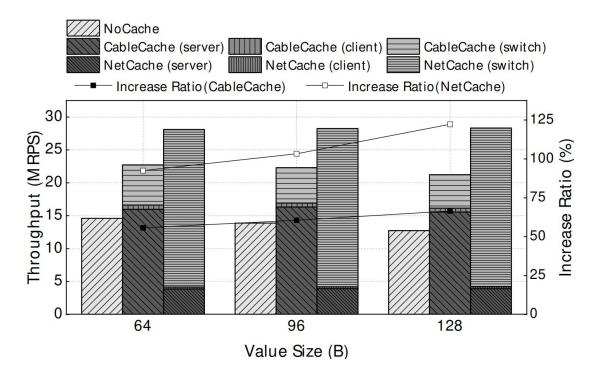


## 03 Evaluation



## Handling small objects

- Employ a read-only workload to conduct a comparison between CableCache and NetCache.
- NetCache enables the majority of small objects to be cached within switches.
- CableCache still requires forwarding most requests to storage servers, resulting in a lower increase ratio of throughput.



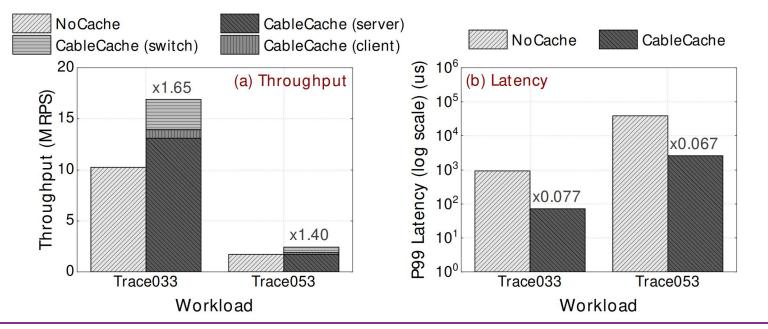
## 03 Evaluation



## Handling real workloads

- Select Trace033 (average value size: 1118 B) and Trace053 (average value size: 9213 B) from two different clusters in Twitter's workload.
- CableCache improves system-wide throughput and reduces the P99 latency

effectively under real workloads.



# 04 Conclusion



#### CableCache: an in-network request deduplication system

- Leverages programmable switches to maintain a directory of object request information.
- Introduces the INRD protocol to deduplicate hot object requests.
- Effectively handles complex scenarios such as the presence of read-modify-write requests and multi-packet target objects.

#### Experimental results show CableCache's effectiveness

- Alleviates load imbalance under both synthetic and real workloads.
- Improves system-wide throughput, and reduces tail latency of requests.



Contact: huangjw22@mails.tsinghua.edu.cn