## An adaptive read/write optimized algorithm for Ceph heterogeneous systems via performance prediction and multi-attribute decision making

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02/05/2025





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#### Introduction

- Ceph is a reliable, self-balancing, self-recovering distributed storage system that eliminates traditional metadata nodes. This is possible
  because it can map data to storage nodes through a pseudo-random data mapping function called Controlled Replication Under Scalable
  Hashing (CRUSH)
- The Ceph cloud storage system only selects data storage nodes based on node storage capacity.
   This node selection method results in load imbalance and limited storage scenarios in heterogeneous storage systems.
   (It is necessary to manually edit the CRUSH Map to adapt to different storage performance requirements)
- This paper designs a system architecture: Combines the Ceph with Software Defined Network (SDN), based on the Ceph distributed file system
  - The SDN controller **collects information** on heterogeneity, network state, and load for each type of OSD
  - Establish the OSD read/write performance prediction model with OSD load state
    - → Dynamically adjust the relationship between OSD performance weights and load factors
  - Propose TOPSIS\_PA/TOPSIS\_CW/TOPSIS\_PACW algorithms
     (TOPSIS series algorithms adaptively optimize the read/write performance of the cluster through a mathematical model)



- When storing data:
  - Client data is cut and numbered according to fixed-size objects
    - → Objects mapped evenly to each PG (Placement Group)
    - → PG mapped to OSD groups by the CRUSH algorithm
- The most impact on data selection OSD in the system's data mapping path
  - Mapping data objects to PGs
  - Mapping PGs to OSDs
- HASH(oid) & mask = pgid
  - The hash function takes *oid* as input to generate a random value
  - The hashed value and "mask" value are processed to get the PG number pg\_id
- CRUSH (pgid, CRUSH\_Map, ruleno) =  $(OSD_0, OSD_1, ..., OSD_i)$ 
  - *i*: # of replicas
  - CRUSH\_Map denotes a cluster map containing information such as cluster topology

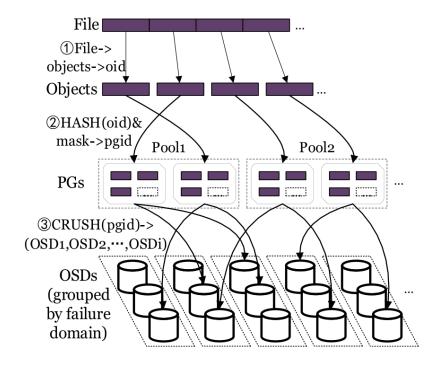


Fig. 1 Ceph cloud storage system data mapping process

- CRUSH algorithm limitations
- Load balancing
- On-demand allocation of heterogeneous resources
- Ceph's CRUSH algorithm calculates data distribution using storage capacity as the only determinant to obtain OSD weights
- This mapping method can satisfy the uniformity of spatial data distribution in the cluster, but ignores the impact of:
  - The underlying **network**
  - **OSD load** on the cluster's read/write performance
- Necessary to establish an adaptive OSD selection strategy to optimize the read/write performance of the system
  - Node's network state information
  - Load information

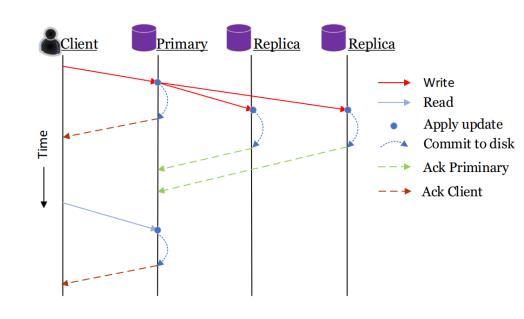




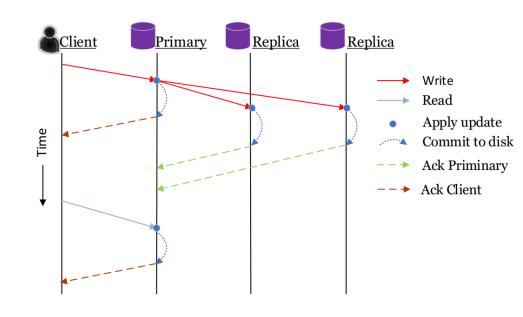
- CRUSH algorithm limitations
- Load balancing
- On-demand allocation of heterogeneous resources



- The primary OSD first writes the data object → Sends the data object to subordinate OSDs
- Only sends success feedback to the client after receiving success feedback from subordinate OSDs
- When performing read operations:
  - Only the primary OSD performs read operations
  - Subordinate OSDs are not selected to perform read operations → resulting in high I/O on the primary OSD
- Some OSDs may become overloaded (especially without a strategy for allocating heterogeneous resources)



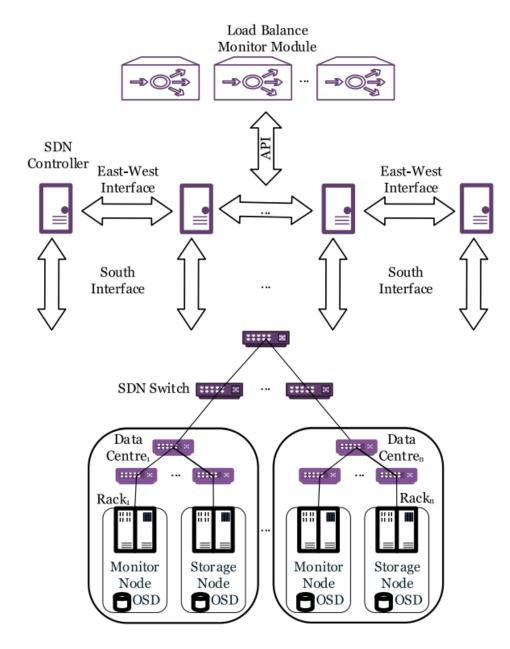
- CRUSH algorithm limitations
- Load balancing
- On-demand allocation of heterogeneous resources
- To address
  - In storage pools with the same class of OSDs
    - Dynamically concentrate read and write requests on lower-loaded OSDs
  - In storage pools with different OSDs
    - Dynamically concentrate client read and write requests on higher-performing OSDs or lower-loaded OSDs
- Additionally, need to reduce the cost of manually rewriting the CRUSH Map



- Present an adaptive read/write optimization model for Ceph heterogeneous storage systems
- 1. Integration of SDN technology architecture
  - Incorporating Software Defined Network technology into the system design
- 2. Combination of OSD host node information
  - Network state information
  - Load information
- 3. Optimize cluster read/write performance from three aspects
  - Limitations of the CRUSH algorithm
  - Load imbalance
  - Storage service scenarios



- System Architecture
- Bottom Layer
  - Consists of monitor nodes and storage nodes
  - Each storage node can contain multiple OSDs
  - Monitor node maintains global configuration information for all nodes in the cluster
  - OpenFlow switch connects all servers and is responsible for data transfer
- Top Layer
  - Contains LBMM (Load Balancing Monitor Module)
  - Monitors required OSD information using the SDN controller
  - Monitor node builds OSD performance prediction model
    - → Decide OSD selection on storage nodes based on information collected by SDN controller
- Data Flow
  - Integrates collected OSD load state information and bandwidth information
  - Transmits to the Monitor node of the Ceph system



- OSD Performance Impact Factors
  - Determine read/write performance weights of OSDs
  - Performance Metric 1 (Node Resources)
    - Bandwidth (B)
    - Number of CPUs (C)
    - Memory size (M)
  - Performance Metric 2 (Load Status)
    - OSD's I/O load (L)
    - I/O load of the OSD disk
  - Performance Metric 3 (Node Heterogeneity)
    - Number of OSDs on heterogeneous nodes (H)
    - OSD type on heterogeneous nodes (T)
  - Performance Metric 4 (PG Distribution)
    - Number of PGs occupied by the OSD (P)





- Node Heterogeneous Resource Division Strategy (Algorithm 1: OSD hetero- Resource Partionning)
  - Line 1:
    - Obtain heterogeneous **OSD information** of nodes in the Ceph system
  - Line 2:
    - Select i  $(1 \le i \le 7)$  **performance metrics** according to performance requirements
    - Traverse initial heterogeneous performance set a<sub>i</sub> = {e<sub>1</sub>, e<sub>2</sub>, ..., e<sub>i</sub>}
      - e<sub>i</sub>: initial value of jth OSD performance metric
      - t is total number of OSDs in Ceph
    - Generate  $a = \{a_1, a_2, ..., a_j\}, 1 \le j \le t$
  - Line 9:
    - Initialize OSD minimal performance set  $\beta = \{a_1\}$ , Initialize OSD minimal classification set  $\chi = \{\}$
    - If  $\beta \cup \alpha_j \neq \beta$ , then  $\beta = \beta \cup \alpha_j$  and  $\chi = \chi \cup \text{osd}$  (Otherwise  $\beta$  remains unchanged)
  - Final Output:
    - Generates OSD performance set  $\beta = \{\alpha_1, \alpha_2, ..., \alpha_l\}$
    - Generates OSD classification set  $\chi = \{ osd_1, osd_2, ..., osd_l \}$
    - where  $1 \le l \le t$ , osd<sub>l</sub> is number of OSDs corresponding to  $a_l$
  - Storage Pool Performance Hierarchy: Pool<sub>n</sub> > ... > Pool<sub>2</sub> > Pool<sub>1</sub>



**Algorithm 1:** OSD heterogeneous resource partitionning algorithm

**Input:** OSD information (OSD\_*Info*)

**Output:** OSD Minimal Classification Set  $(\chi)$ 

 $\alpha = \{\}$ 

4: for osd in OSD\_*Info* do

5: for  $e_i$  in OSD\_Info[osd] do

6: if  $e_i$  is 'expect' then

7:  $\alpha[osd][e_i] = OSD\_Info[osd][e_i]$ 

8: end procedur

9: **procedure** GetOSDMiniClassifiSet  $(\alpha)$ 

10: 
$$\beta = \{\alpha_1\}, \chi = \{\}$$

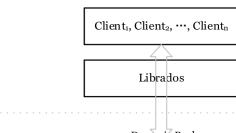
11: for osd in  $\alpha$  do

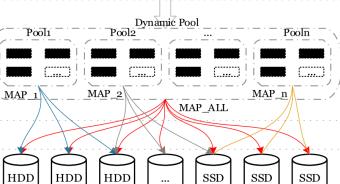
12: if  $\beta \cup \alpha[osd] \neq \beta$  then

13:  $\beta = \beta \cup \alpha[osd]$ 

14:  $\chi = \chi \cup osd$ 

15: end procedure





- OSD Load Monitoring Strategy (Algorithm 2: OSD load collection)
  - Purpose
    - Responsible for obtaining OSD load status (Runs on cluster's OSD nodes)
    - Passively receives messages forwarded from switch via SDN controller
    - Collects OSD status by analyzing message packets
  - Line 1:
    - Input parameter: host IP of all nodes
    - Forms dictionary OSD {osd: host\_ip} to record mapping relationships
  - Line 4:
    - Node's CPU usage
    - Memory usage size
    - Number of OSDs
    - OSD type
    - Number of occupied PGs
    - I/O load Records in dictionary OSD\_Load\_Info{}
  - Line 14:
    - Sends load data to switch via UDP message



```
Algorithm 2: OSD load collection algorithm
```

```
Input: All host IP information in Ceph (Host IP)
Output: OSD load information (OSD_Load_Info)
  1: Procedure GetOSD (Host_IP)
        OSD < -Host IP
     end procedure
     procedure GetOSDInfo (OSD)
        OSD\_Load\_Info = \{\}
          for i in OSD do
  6:
          OSD\_Load\_Info[i] < -cpu[Host\_IP[i]]
          OSD\_Load\_Info[i] < -mem[Host\_IP[i]]
           OSD\_Load\_Info[i] < -host[Host\_IP[i]]
  9:
 10:
          OSD_Load_Info[i]<- type[Host_IP[i]]
           OSD\_Load\_Info[i] < -pgs[Host\_IP[i]]
 11:
           OSD\_Load\_Info[i] < -io[Host\_IP[i]]
 12:
     end procedure
     procedure SendData(OSD_Load_Info)
        send(IP(src = 'src\_ip', dst = 'dst\_ip')/
        UDP(dst\_port) / Raw(OSD\_load\_Info))
```

16: end procedure

- OSD Load Monitoring Strategy (Algorithm 3: Sending OSD load Information)
  - Purpose
    - Process by which Ryu controller packages OSD load information
    - Sends it to Ceph monitor node via Packet-Out packets
  - Line 1:
    - Ryu controller integrates data containing:
      - OSD load information
      - Bandwidth information
    - Combines into Data dictionary

- Subsequent Steps:
  - Calls add\_protocol() function to construct UDP packets
  - Sends out Packet\_Out messages based on dictionary ip\_to\_port {}



Algorithm 3: Sending OSD load information via Packet-Out packets Input: OSD load information received via Packet-In packets Output: Packet-Out packets with OSD load information procedure: send\_packet\_out(msg, Data) datapath < -msg.datapathofproto < -datapath.ofproto 3: ofp\_parser < -datapath.ofproto\_parser 4: pkt < -packet.Packet(msg.data) $eth\_header < -pkt.get\_protocols$ (ethernet.ethernet)[0]  $dst\_mac < -eth\_header.src$  $arp\_header = pkt.get\_protocols(arp.arp)$  $dst\_ip = arp.header.src\_ip$ out \_ port = msg.match[in \_ port] 10: ether instance = ethernet.ethernet(dst\_mac, 11: src = controler \_mac,eth \_header.ethertype)  $ipv4\_instance = ipv4.ipv4$ 12:  $(src = controller\_ip, dst = dst\_ip, proto = 17)$  $udp\_instance = udp.udp(src\_port = 12345,$ 13:  $dst\_port = 10086$ ) pkt = packet.Packet()14: pkt.add\_protocol(ether\_instance) 15: 16: pkt.add\_protocol(ipv4\_instance) 17: pkt.add\_protocol(udp\_instance) 18: pkt.add\_protocol(data)  $actions = [ofp\_parser.OFPActionOutput]$ 19:  $(out\_port)$ ] req = ofp\_parser.OFPPacketOut(datapath, buffer\_id = ofproto.OFP\_NO\_BUFFER, actions, in\_port = ofproto.OFPP\_CONTROLLER,data)  $datapath.send\_msg(req)$ 22: end procedure

- Adaptive Read/Write Optimization Algorithm Based on Performance Prediction & TOPSIS Model
  - OSD Read/Write Performance Prediction Model (Random Forest)
    - Step 1: Heterogeneous Resource Classification
      - Based on Node Heterogeneous Resource Partitioning Strategy
      - Obtain OSD minimal classification set χ = {osd<sub>1</sub>, osd<sub>2</sub>, ..., osd<sub>l</sub>}
      - Where  $1 \le l \le t$ , osdl is number of OSDs

- Adaptive Read/Write Optimization Algorithm Based on Performance Prediction & TOPSIS Model
  - OSD Read/Write Performance Prediction Model (Random Forest)
    - Step 2: OSD Load Information Collection
      - 1. Initialize uniform distribution:
        - Set Crush Weight (CW) value of all OSDs to 1
        - Reset counter n (range [1, l])
        - Ensures read/write performance loads converge
      - 2. Data Collection:
        - Set CW step size as s
        - Set acquisition time interval as t
        - For each OSD in set χ:
          - Gradually increase CW value by s until:
            - Cluster IOPS stops growing
            - Expected performance requirements are met
        - · Periodically acquire network bandwidth usage using SDN controller
        - Generate parameter sets: consume<sub>i</sub> = {bw<sub>i1</sub>, cpu<sub>i2</sub>, mem<sub>i3</sub>, pgs<sub>i4</sub>, r/w\_io<sub>i5</sub>} + w/r\_io
        - Create vector set S for nth OSD: S = {{consume<sub>1</sub>, r/w\_io<sub>1</sub>, IOPS<sub>1</sub>}, ..., {consume<sub>p</sub>, r/w\_io<sub>p</sub>, IOPS<sub>p</sub>}}
           (p is number of elements in vector set S)
      - 3. Data Transmission:
      - SDN controller sends load information in vector set S to Monitor node via Packet-Out
      - Monitor node builds performance prediction model using Random Forest





- Adaptive Read/Write Optimization Algorithm Based on Performance Prediction & TOPSIS Model
  - OSD Read/Write Performance Prediction Model (Random Forest)
    - Step 3: Building OSD Performance Prediction Model
      - Bootstrap Sampling
        - Use vector S as input
        - Select size B bootstrap samples from entire sample
        - Store in Ti
      - 2. Feature Selection
        - Set number of sample features to 5
        - Select k features out of 5 feature numbers for B bootstrap samples
        - Build decision tree to obtain best segmentation points
      - 3. Model Building and Prediction
        - Formulate model rf\_reg with best-effect parameters
        - Perform feature importance analysis on OSD performance indicators
        - Obtain corresponding feature weights
        - Aggregate predictions of B bootstrap sample trees
        - Predict new performance pre\_ioi (either r\_ioi or w\_ioi)





- Adaptive Read/Write Optimization Algorithm Based on Performance Prediction and TOPSIS Model
  - Multi-Attribute Decision Model Based on TOPSIS
    - Performance Model Integration
      - When rf\_reg prediction model reaches desired accuracy
      - Obtain OSD feature weights through feature importance analysis
      - · Model accurately reflects impact of network state and load factors on performance
    - Decision Making Process
      - Obtain integrated performance weights based on feature weights
      - Select optimal OSD or OSD set → multi-attribute decision problem
      - Use Technique for Order Preference by Similarity to Ideal Solution (TOPSIS)
    - Implementation Steps
      - 1. Classify OSDs in Ceph system
      - 2. Build and solve TOPSIS model to optimize performance of different storage pools
    - Positive Indicators
      - Bandwidth (B)
      - CPU remaining size (C)
      - Memory remaining size (M)
      - PG ratio (P)
    - Negative Indicator
      - I/O load (L)





- Adaptive Read/Write Optimization Model Based on Performance Prediction and TOPSIS Model
  - Adaptive Read/Write Optimization Model
    - Uniform data distribution and efficient read/write performance
      - Step 1: To meet balanced storage requirements in the cluster, Ceph selects an OSD set for Placement Groups (PG) based on the storage capacity as weight
      - Step 2: After all PGs select their OSDs, the TOPSIS model is used to calculate the relative read proximity of each
         OSD (Each OSD is scored based on its read performance → stored in a dictionary)
    - PA(Primary Affinity): Probability of an OSD becoming the primary OSD
    - CW(CRUSH Weight): Weight used to distribute PGs to OSDs (0~1)
      - The higher the CW value, the more PGs are assigned to that OSD → handles a higher read/write workload
      - Traditional Ceph only considers storage capacity → Considers: network state, node load, heterogeneity
    - TOPSIS\_PACW
      - PA: Optimizes primary OSD selection for read operations
      - CW: Optimizes actual storage distribution of data objects



```
Algorithm 4: TOPSIS series of algorithms
Input: OSD_INFO_Map
Output: OSD_Perf_Set
     procedure GetOSDPerf(OSD_INFO_Map)
       OSD_Perf_Set[osd]=
       TOPSIS(OSD INFO Map)
       for osd in OSD Perf Set do
          if osd is 'down' then
            remove osd from osd addr
      end procedure
      procedure SetOSDPaCw(OSD_Perf_Set)
       Select = get_optimize_algorithm()
       if Optimize_Pool is 'o' then
         for osd in OSD Perf Set do
 10:
            If Select is 'o' then
 11:
              osd_primary_affinity=
 12:
              OSD Perf Set[osd]
              update {osd: primary affinity}
 13:
            elif Select is '1' then
 14:
              osd_crush_weight=
 15:
              OSD_Perf_Set[osd]
              update {osd: crush weight}
 16:
 17:
              osd primary affinity=
 18:
              OSD_Perf_Set[osd]
              osd_crush_weight=
 19:
              OSD Perf Set[osd]
              update (osd: primary affinity,
20:
              crush weight }
       else
 21:
          OSD_Type = get_osd_type()
 22:
          for osd in OSD_Perf_Set do
 23:
            if Type[osd] is Optimize_Pool then
 24:
              If Select is 'o' then
 25:
                osd_primary_affinity += s
 26:
                update {osd: primary affinity}
 27:
              elif Select is '1' then
28:
                osd_crush_weight += s
 29:
                update {osd: crush weight}
30:
              elif
 31:
                osd_primary_affinity += s
32:
                osd crush weight += s
 33:
                update {osd: primary affinity,
 34:
                crush weight}
35: end procedure
```

- Adaptive Read/Write Optimization Model Based on Performance Prediction and TOPSIS Model
  - Adaptive Read/Write Optimization Model
    - TOPSIS series algorithms
      - Line 1: The GetOSDPerf() function is called to obtain the relative proximity of each OSD using the TOPSIS model

```
osd_primary_affinity=
                                                                                                                                                            12:
                                Relative Proximity: An indicator calculated by the TOPSIS model representing the distance of each OSD to the
                                                                                                                                                                         OSD Perf Set[osd]
                                                                                                                                                                         update {osd: primary affinity}
                                                                                                                                                            13:
                                 optimal performance. A higher value indicates better performance for that OSD
                                                                                                                                                                       elif Select is '1' then
                                                                                                                                                            14:
                                                                                                                                                                         osd_crush_weight=
                                                                                                                                                            15:
                                Parameters (metrics): Remaining bandwidth (B), remaining CPU capacity (C), remaining memory capacity (M),
                                                                                                                                                                         OSD_Perf_Set[osd]
                                PG ratio (P), I/O load (L)
                                                                                                                                                                         update {osd: crush weight}
                                                                                                                                                            16:
                                                                                                                                                            17:
                                                                                                                                                                         osd primary affinity=
                                                                                                                                                            18:
                                                                                                                                                                         OSD_Perf_Set[osd]
                                                                                                                                                                         osd_crush_weight=
                        Line 7: The SetOSDPaCw() function is called to update PA or CW values of the OSD
                                                                                                                                                            19:
                                                                                                                                                                         OSD Perf Set[osd]
                                                                                                                                                                         update (osd: primary affinity,
                                An OSD performance prediction model is called to predict whether the IOPS value of an OSD is optimized
                                                                                                                                                           20:
                                                                                                                                                                         crush weight }
                                 → Make adjustment decisions accordingly
                                                                                                                                                                   else
                                                                                                                                                            21:
                                                                                                                                                                     OSD_Type = get_osd_type()
                                                                                                                                                            22:
                                                                                                                                                                     for osd in OSD_Perf_Set do
                                                                                                                                                           23:
                                                                                                                                                                       if Type[osd] is Optimize_Pool then
                                                                                                                                                            24:
                                                                                                                                                                         If Select is 'o' then
                                                                                                                                                            25:
                                                                                                                                                                           osd_primary_affinity += s
                                                                                                                                                            26:
                                                                                                                                                                           update {osd: primary affinity}
                                                                                                                                                            27:
                                                                                                                                                                         elif Select is '1' then
                                                                                                                                                           28:
                                                                                                                                                                           osd_crush_weight += s
                                                                                                                                                            29:
                                                                                                                                                                           update {osd: crush weight}
                                                                                                                                                           30:
                                                                                                                                                                         elif
                                                                                                                                                            31:
                                                                                                                                                                           osd_primary_affinity += s
                                                                                                                                                           32:
                                                                                                                                                                           osd crush weight += s
                                                                                                                                                           33:
                                                                                                                                                                           update {osd: primary affinity,
                                                                                                                                                           34:
                                                                                                                                                                           crush weight}
DANKOOK UNIVERSITY
                                                                                                19
                                                                                                                                                           35: end procedure
```



#### **Evaluation**

#### Experimental Setup

- Ceph Cluster (6 machines)
  - 1. Monitor + Storage Nodes (3 machines)
  - 2. Pure Storage Nodes (3 machines):
    - Node 1: 1 OSD (SSD)
    - Node 2: 2 OSDs (1 SSD + 1 HDD)
    - Node 3: 3 OSDs (all HDD)
- OSD Configuration
  - Total: 12 OSDs
  - Classified 4 OSD\_Types
  - Classification based on Host and Type (HDD/SSD)
- OSD Distribution by Host
  - Host 1: 2 SSDs
  - Host 2: 2 HDDs + 2 SSDs
  - Host 3: 6 HDDs

OSD	bw	cpu	mem	Host	Type	Set β <sub>i</sub>	OSD_Type
{4, 6, 12, 17, 18, 23}	1	8	8	3	1	{1, 8, 8, 3, 1}	1
{8, 9}	1	16	8	1	2	{1, 16, 8, 1, 2}	2
{10, 16}	1	16	8	2	1	{1, 16, 8, 2, 1}	3
{7, 30}	1	16	8	2	2	$\{1, 16, 8, 2, 2\}$	4

#### Storage Pool Settings

Number of replicas: 2

• Number of PGs: 512

#### - Performance Test Configuration

Test data size: 4KB ~ 1024KB

Workloads: Random/Sequential, Read/Write

• FIO settings: iodepth=128, numjobs=8

#### - Network Configuration

- 1. Public Network
  - For client-cluster communication
- 2. Cluster Network
  - For data recovery and migration between OSDs





#### Evaluation

#### Model accuracy

**Table 4** OSD performance prediction model accuracy

Table 4   OSD performance	rmance prediction model ac	ecuracy		$\left( \sum_{i=1}^{n} (\widehat{pre\_io_i} - io_i)^2 \right)$
Vector Set:{S}	Precision(r_io)	Precision(w_io)	$\longrightarrow$ precision =	$1 - \frac{i=1}{\sum_{n=0}^{n} (1 - i)^2} \times 100\%$
$\{S_6\}$	96.31	99.34		$\left( \sum_{i=1}^{n} (io_i - io)^2 \right)$
$\{S_9\}$	96.10	93.55		
$\{S_{10}\}$	94.93	92.19		
${S_{30}}$	95.68	96.20		

#### OSD predictive read/write performance weight

**Table 5** OSD predictive read performance weights

Weight set	bw	cpu	mem	pgs	w_io
$\{R_6\}$	0.42	0.17	0.12	0.18	0.11
$\{R_9\}$	0.63	0.16	0.05	0.10	0.06
$\{R_{10}\}$	0.20	0.08	0.15	0.26	0.31
$\{R_{30}\}$	0.07	0.02	0.19	0.44	0.28

**Table 6** OSD predictive write performance weights

	Weight Set	bw	cpu	mem	pgs	r_io
	$\{W_6\}$	0.21	0.08	0.22	0.31	0.18
,	$\{W_9\}$	0.11	0.02	0.19	0.57	0.12
	$\{W_{10}\}$	0.28	0.01	0.14	0.37	0.20
1	$\{W_{30}\}$	0.25	0.07	0.18	0.39	0.11





**HDD-Type OSD** 

SSD-Type OSD

#### **Evaluation**

- Performance Evaluation
  - TOPSIS\_PACW
    - TOPSIS\_PA (Primary Affinity)
      - PA: Dynamically adjusts primary OSD selection for read operations
         → Places operations on (better reading performance & lower load) OSDs
      - · Optimize read performance
    - TOPSIS\_CW (CRUSH Weight)
      - CW: Weight used for distributing PGs to OSDs
        - → Adaptively migrates PGs carrying data objects to OSDs
      - · Optimize write performance and data distribution
  - Limitations of the TOPSIS series algorithms
    - "hot spot" on the best-performing OSDs

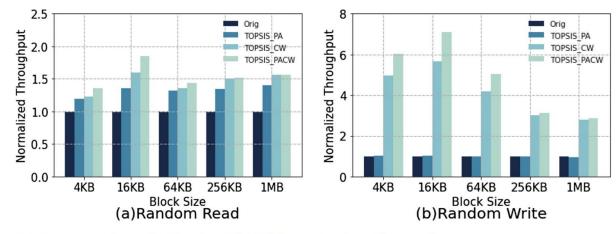


Fig. 8 Comparison of the normalized throughput of the TOPSIS series algorithm at different workloads

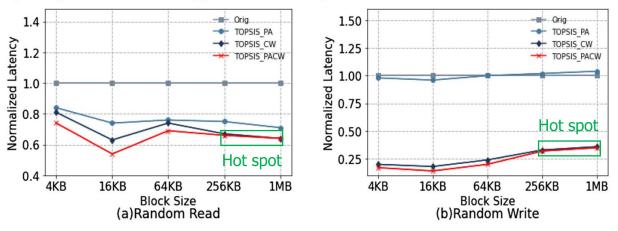


Fig. 9 Comparison of the normalized latency of the TOPSIS series algorithm at different workloads





#### Conclusion

• To build a large-scale distributed storage system, it is essential to consider heterogeneous distributed storage.

However, Ceph's design does not account for factors such as network conditions, node load, and heterogeneity

- To improve the CRUSH algorithm, an adaptive read/write optimization algorithm for Ceph heterogeneous systems is proposed through performance prediction and multi-attribute decision-making
  - OSDs are classified based on a node **heterogeneous resource division strategy**
  - A **prediction model** is established by combining the load states of OSDs
  - An optimal OSD is selected by solving the mathematical model for multi-attribute decision-making

■ Experimental results show that the TOPSIS\_PACW algorithm improves write performance by 180% to 468% and read performance by 23% to 60%, while ensuring system reliability and high availability



## Thank you

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- SDN Controller Process
  - 1. Delivers UDP packets with OSD load information via Packet-In messages
  - 2. Ryu controller
    - Receives Packet-In message
    - Determines if sent by Ceph Monitor node
    - Records packet information as Packet Out message path
  - 3. Protocol Processing
    - Parses IPv4 and UDP packet header protocols via get\_protocols()
    - Verifies specified ADDR and port number
  - 4. Packet Content Processing
    - · Decodes packet content
    - · Identifies sending host based on message input port and dpid
    - Transcribes host bandwidth and load information into OSD bandwidth and load information



```
Algorithm 2: OSD load collection algorithm
Input: All host IP information in Ceph (Host_IP)
Output: OSD load information (OSD_Load_Info)
  1: Procedure GetOSD (Host_IP)
         OSD < -Host IP
      end procedure
      procedure GetOSDInfo (OSD)
         OSD\_Load\_Info = \{\}
          for i in OSD do
  6:
           OSD\_Load\_Info[i] < -cpu[Host\_IP[i]]
           OSD\_Load\_Info[i] < -mem[Host\_IP[i]]
           OSD\_Load\_Info[i] < -host[Host\_IP[i]]
 10:
           OSD_Load_Info[i]<- type[Host_IP[i]]
           OSD\_Load\_Info[i] < -pgs[Host\_IP[i]]
 11:
           OSD\_Load\_Info[i] < -io[Host\_IP[i]]
 12:
      end procedure
      procedure SendData(OSD_Load_Info)
        send(IP(src = 'src\_ip', dst = 'dst\_ip')/
```

 $UDP(dst\_port) / Raw(OSD\_load\_Info))$ 

16: end procedure