ASSIGNMENT-3 BIG DATA (CSP 554)

1.

HaRD: A Heterogeneity-Aware Replica Deletion Algorithm for HDFS

Introduction

The Hadoop Distributed File System (HDFS) is widely used for storing large datasets reliably on clusters of commodity machines. Data replication in HDFS improves availability and performance but comes at the cost of increased storage usage. Recent studies have proposed dynamic replication management frameworks that adjust the replication factor based on data popularity. However, reducing the replication factor can lead to unbalanced data distribution, causing performance issues.

This paper identifies that existing replica deletion approaches, including Hadoop's default algorithm and the authors' previous WBRD (Workload-aware Balanced Replica Deletion) algorithm, perform sub-optimally on heterogeneous clusters. To address this limitation, the authors propose HaRD (Heterogeneity-aware Replica Deletion), a novel algorithm for deleting replicas in heterogeneous HDFS clusters.

Key Contributions

- 1. Extension of the formal definition of the replica deletion problem to heterogeneous clusters.
- 2. Proposal of HaRD, which considers nodes' processing capabilities when deleting replicas.
- 3. Implementation of HaRD on top of HDFS and extensive experiments on a 23-node heterogeneous cluster.

Methodology

HaRD aims to balance the ratio of block distribution to computing capabilities for each node. It determines a node's computing capability by calculating how many containers it can run simultaneously. This approach provides flexibility and minimal overhead.

The authors evaluated HaRD against Hadoop's default deletion algorithm and WBRD using various benchmarks:

- TestDFSIO
- Grep
- Terasort
- Concurrency test with TPC-H

Results

Key findings from the experiments include:

- HaRD reduced execution time by up to 60% compared to Hadoop and 17% compared to WBRD.
- HaRD achieved better data locality (85% vs 81% for WBRD and 73% for Hadoop).
- HaRD reduced network utilization by 6.9% compared to WBRD.
- Performance improvements were more significant under heavy loads with concurrent users.

Block Distribution Analysis

The authors analyzed the block distribution after reducing the replication factor from 10 to 3 using different deletion algorithms. They found that:

- Hadoop's deletion algorithm resulted in a skewed data distribution with high standard deviation.
- WBRD achieved an evenly balanced block distribution but did not consider node processing capabilities.
- HaRD stored more blocks on more powerful computers, creating three distinct groups in the block distribution corresponding to the three types of machines in the cluster

Performance Evaluation

The authors conducted experiments using TestDFSIO, Terasort, and Grep benchmarks with different replication factors:

- With RF=3, HaRD reduced average execution time by 7% for TestDFSIO, 6.1% for Terasort, and 9.4% for Grep compared to WBRD.
- With RF=1, HaRD's performance improvements were even more significant: 18.1% for TestDFSIO, 9.2% for Terasort, and 30.6% for Grep compared to WBRD

Concurrency Test

Using TPC-H Q6 with varying numbers of concurrent users (25 to 125), the authors found that:

- HaRD consistently outperformed both WBRD and Hadoop.
- Performance improvements became more significant as the number of concurrent users increased.
- With 125 concurrent users, HaRD reduced execution time by 17% compared to WBRD and 60% compared to Hadoop

Analysis

- For the 125 concurrent users test, the authors observed:
 - HaRD achieved 85% data locality, compared to 81% for WBRD and 73% for Hadoop.
 - HaRD reduced average network utilization by 6.9% compared to WBRD.
 - HaRD balanced network bandwidth usage across nodes, while Hadoop's usage was unbalanced due to "hot spots"
- ➤ The authors measured HaRD's implementation overhead:
 - HaRD introduced a 10.8 millisecond overhead for decreasing the replication factor from 10 to 3 for a 50 GB dataset
 - The overhead scaled linearly with increasing data size and number of nodes, proving HaRD's scalability

Conclusion

HaRD offers a cost-effective solution for replica deletion in heterogeneous Hadoop clusters, significantly improving performance over existing approaches. The authors suggest future work could involve developing an adaptive replication management framework using HaRD.

2.

• Created a "/user/hadoop"



• Loaded WordCount.py from local to "/user/hadoop" and have listed them

• Performed given operation, and tested WordCount.py to print 10 head values

```
SSH-in-browser

***Parapus*20561884-n2-n:-$ python Wordcount.py -r hadoop hdfs://user/hadoop/w.data | head -n 10

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temp directory /tmp/WordCount.cnynavarapu.20240921.042934.630679...
```

Introduced vim command and modified the code for desired output

```
SSH-in-browser
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vim WordCount2.py
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Job Councers
HDFS: Number of write operations=9
Job Councers
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```

• Uploaded Salaries.py and Salaries.tsv

Tested that Salaries.py file and printed 10 values

```
ymavarapus20561894-n2-m:-5 python Salaries.py -r hadoop hdfs://user/hadoop/Salaries.tav | head -n 10
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cctory /tmp/Salaries.cnynavarapu.20240921.044218.524436...
```

Now edited the code using vim and named it as Salaries2.py

```
PacOS61894-n2-m:-5 vim Salaries2.py

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Map-Reduce Pramework

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Combine output records=3818
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5312

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Gailer
```

3. Loaded u.data file

```
cnynavarapu@a20561894-n2-m:~$ vim MovieReviewCount.py
 cnynavarapu@a20561894-n2-m:~$ hdfs dfs -copyFromLocal u.data /user/hadoop
copyFromLocal: `/user/hadoop/u.data': File exists
cnynavarapu@a20561894-n2-m:~$ hdfs dfs -ls /user/hadoop
Found 5 items
Found 5 Items
-rw-r-r-- 2 cnynavarapu hadoop 408 2024-09-21 04:20 /user/hadoop/Salaries.py
-rw-r--- 2 cnynavarapu hadoop 1538148 2024-09-21 04:20 /user/hadoop/Salaries.tsv
-rw-r--- 2 cnynavarapu hadoop 399 2024-09-21 04:15 /user/hadoop/WordCount.py
-rw-r--- 2 cnynavarapu hadoop 2438233 2024-09-21 04:52 /user/hadoop/w.data
cnynavarapu@a20561894-n2-m:~$
```

mavarapu@a20561894-n2-m:~\$ hdfs dfs -copyFromLocal u.data /user/hadoop

4. Written the required code in VIM to get the desired results output

```
SSH-in-browser

| Sympactic | 
SSH-in-browser
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Combine output records=100004

Failed Shuffles=0

GC time elapsed (ms)=1077

Input split bytes=788

Map input records=100004

Map output bytes=784019

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Pack Map Virtual semonry (bytes)=645308720

Pack Map Outputs=20

Pack Map Outputs=20

Pack Map Outputs=30

Pack Map Ou
                                                                                                                                                                          peak Meduce Virtual meMonty (bytes) 1978

Faduce input proups=671

Reduce output records=679

Reduce output records=679

Reduce output records=679

Reduce output records=618

Reduce input proups=680

Reduce output records=618

Reduce output records=618

Reduce output records=618

Reduce output records=679

Reduce output records=679

Reduce output records=6188

Reduce output memory (bytes) snapshot=544769408

Virtual memory (bytes) snapshot=54490513408

Errors

BAD ID=0

CORRECTION=0

REDUCE OUTPUT

REDUC
                                                                                                              DFS temp directory hdfs:///user/cnynavarapu/tmp/mrjob/MovieReviewCount.cnynavarapu.20240921.045542.918258...
emp directory /tmp/MovieReviewCount.cnynavarapu.20240921.045542.918258...
```

Code Screenshots which are used:

• WordCount2.py

• Salaries2.py

• MovieReviewCount.py