

Hive and Impala: Performance Based Comparison

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ABSTRACT:

Big Data is a term that refers to all the data generated by human and machine across the globe, mostly five important vectors of big data define big data realm - volume, velocity, variety, value and veracity. Storing, and analyzing bigger data which is available in different formats is increasing with huge velocity to obtain values out. So queries in big data should be speedy for getting the valuable information to enhance the system performance. To go with this goal, developer of big data develop these two technologies which are respectively Hive and Impala for better querying and processing big data.

In this paper, we differentiate these two types of query tools to calculate time taken by Apache hive and Apache Impala by defining same problem statement. Basically we distinguish the comparative strength of two technologies called Hive and Impala. In efficiency and performance, total time taken by these technologies for their execution. We focus on performance analysis using Cloudera Engine Including Apache Hadoop (CDH).

KEYWORD: - Hadoop, Hive, Impala, MapReduce, Big Data, workflow

I. INTRODUCTION

Big data is a large amount of drastically increasing real world data. Data is increasing every hour, every minute and every second in a day and this larger data is used to insight knowledge from the meaningful data. Big Data is usually difficult to store and process using traditional data management systems. Apache Software Foundation introduced processing tools to solve processing challenges, which are used to solve big data related problems and used to derive the patterns and trends from data.

HIVE: Apache Hive is a data warehouse tool, which built on top of Hadoop framework. At initial phase, it was being developed by Facebook. Later it was owned to Apache Software Foundation and developed further as open-source software called as Apache Hive. Hive is mainly used for processing structured data. This processing is done in three main steps summarization, querying, and analyzing. The interaction with the Hive is done by SQL like query language called HiveQL. Due to its HiveQL, it is very familiar and user-friendly, fast, scalable, and extensible.

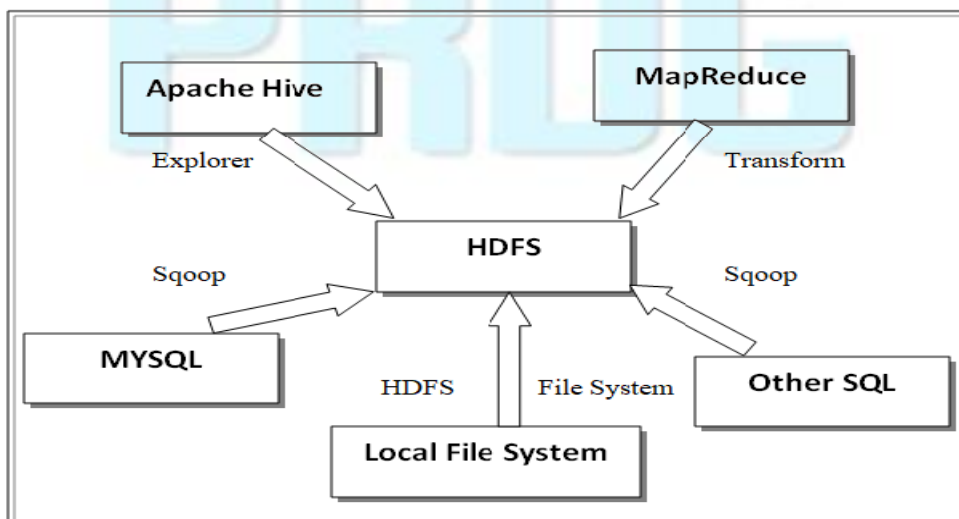


Figure 1: Hive architecture

IMPALA: Impala uses Massive Parallel Processing (MPP) SQL Query Engine and it implements a distributed architecture based on daemon processes. Impala is the best choice when the requirement is a quick result in real time. The intermediate result is stored in In-Memory. Thus, query execution is very fast when compared to other tools.

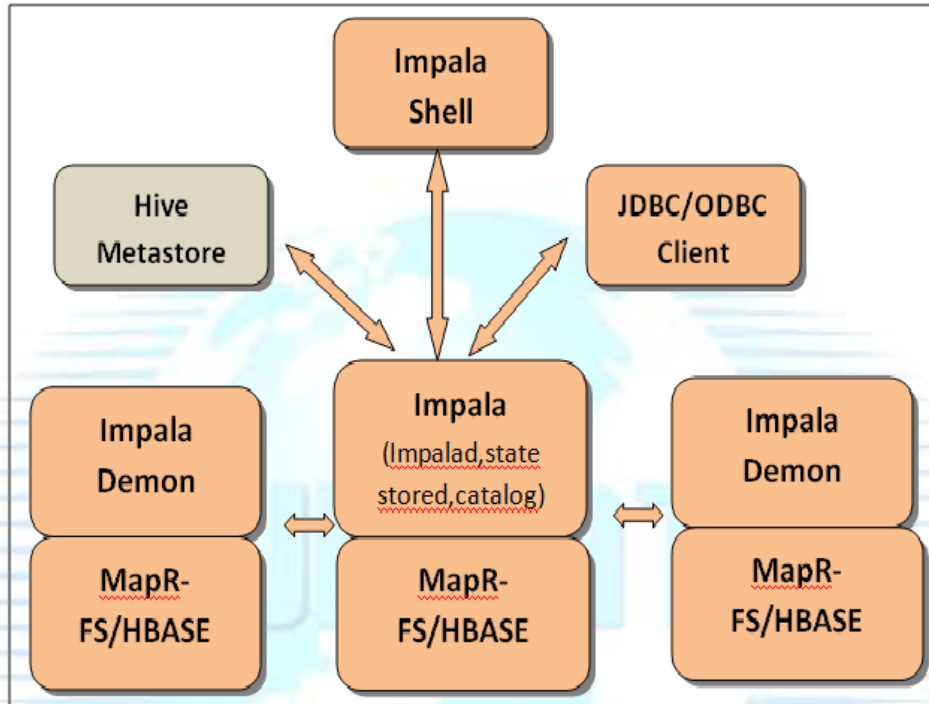


Figure 2: Impala architecture

II. HIVE AND IMPALA WORKFLOW

Cloudera's Impala's performance is more efficient in terms of execution time as well as the complexity of queries. Apache Hive is Infrastructure developed on Hadoop Framework for analyzing and processing data. Basically, Hive is the front end to parse the SQL queries, designs logical plans that execute in the background by MapReduce and Tez this takes comparatively more time than Impala.

Cloudera's Impala does not require data to be moved or transformed as it uses Hive's megastore, it can query Hive's tables directly. Impala does not use MapReduce to execute the query. The Impala daemon executes the process on each node to plan queries and, coordinates between them and query execution engine. As Impala uses parallel processing it responds to query very fast using massively parallel processing. Each node accepts query and planner maps these requests to parallel fragment after that the coordinator starts the execution on the name node of the cluster. The Network systems are highly multithreaded thus each node runs efficiently in a cluster.

Apache Hive generates queries at compile-time whereas Impala does runtime code generation for big loops. MapReduce takes more time for running at full capacity. So, in Hive's query suffers cold start problem on the other hand Impala daemon processes are started at boot time. Hive is fault tolerant whereas Impala does not support fault tolerance if query execution fails Impala needs to start again the execution.

For performance analysis of Apache Hive and Cloudera's Impala, we have used movielens dataset. These are some queries we have executed on movielens dataset. Here we have tables namely ratings and movies.

Attributes List:

movies :- movie_id: int, name: chararray, genres: chararray.

ratings :- user_id: int, movie_id: int, ratings: float, timestamp: int.

Case 1: Released list of movies in year 1997 :

SQL query is to find movie_id and its name released in 1997 from movies table. And displayed result in hive and impala.

Query:

```
SELECT DISTINCT movie_id, name  
>FROM movies  
>WHERE name LIKE '%1997%';
```

HIVE:

```
cloudera@quickstart:~/Desktop/movie_ratings/Paper Publication  
File Edit View Search Terminal Help  
155111 Noiseman Sound Insect (1997)  
156095 Beat (1997)  
156377 Strays (1997)  
156702 Joey (1997)  
157112 Praxis Dr. Hasenbein (1997)  
157146 Dial H-I-S-T-O-R-Y (1997)  
157262 Kureyon Shin-chan ankoku tamatama daitaiseiki (1997)  
157544 Motel Cactus (1997)  
157691 Tenchi the Movie 2: The Daughter of Darkness (1997)  
157765 Slayers Great (1997)  
157827 Agent Aika (1997)  
157841 Gestalt (1997)  
158060 The Unfish (1997)  
158617 How the War Started on My Island (1997)  
158705 Paws (1997)  
159141 Plastic Utopia (1997)  
159387 Barbara (1997)  
159913 UFOs: The Best Evidence Ever Caught on Tape (1997)  
160696 Solomon (1997)  
160814 The Journey (1997)  
161119 Tale About the Cat and the Moon (1997)  
161502 Soul Music (1997)  
161504 Wyrd Sisters (1997)  
161798 VeggieTales: Josh and the Big Wall (1997)  
162272 Sara (1997)  
162378 A Thousand Men and a Baby (1997)  
162820 No Budget Story (1997)  
163789 Bogart: The Untold Story (1997)  
Time taken: 48.587 seconds, Fetched: 530 row(s)  
hive>
```

IMPALA:

```
cloudera@quickstart:~/Desktop/movie_ratings/Paper Publication
File Edit View Search Terminal Help
119579 | Blast (1997)
1690 | Alien: Resurrection (1997)
1515 | Volcano (1997)
131132 | Kleines Arschloch - Der Film (1997)
100404 | Rainy Dog (Gokudō kuroshakai) (1997)
87689 | Pekko ja unissakävelijä (1997)
150554 | The Love Bug (1997)
7699 | Who the Hell Is Juliette? (¿Quién diablos es Juliette?) (1997)
1558 | Sudden Manhattan (1997)
2025 | Lolita (1997)
1645 | The Devil's Advocate (1997)
1750 | Star Kid (1997)
1889 | Insomnia (1997)
1595 | Free Willy 3: The Rescue (1997)
115021 | Alien Nation: The Udara Legacy (1997)
1793 | Welcome to Woop-Woop (1997)
132894 | Cenizas del Paraíso (1997)
1609 | 187 (One Eight Seven) (1997)
85181 | Pooh's Grand Adventure: The Search for Christopher Robin (1997)
1485 | Liar Liar (1997)
1755 | Shooting Fish (1997)
152489 | Don King: Only in America (1997)
1780 | Ayn Rand: A Sense of Life (1997)
26976 | Chicago Cab (1997)
72388 | Sunday (1997)
104629 | Back in Business (1997)
1880 | Lawn Dogs (1997)

Fetched 530 row(s) in 1.18s
[quickstart.cloudera:21000] >
```

Case 2: Exact User Ratings.	
SQL query joins two table ratings and movies on the movie_id field to find movie id, name and its rating for a specific user.	Query: SELECT r.movie_id, name, ratings > FROM movie.ratings r > JOIN movie.movies m > ON (r.movie_id=m.movie_id) > WHERE user_id=10564;

HIVE:

```

cloudera@quickstart:/home/cloudera/Desktop/movie_ratings/Paper Publication
File Edit View Search Terminal Help
1396 Sneakers (1992) 3.0
1573 Face/Off (1997) 3.5
1614 In & Out (1997) 3.5
1961 Rain Man (1988) 4.0
2013 "Poseidon Adventure 3.5
2100 Splash (1984) 3.0
2115 Indiana Jones and the Temple of Doom (1984) 4.0
2116 "Lord of the Rings 3.0
2302 My Cousin Vinny (1992) 4.0
2393 Star Trek: Insurrection (1998) 4.5
2662 "War of the Worlds 4.5
2700 "South Park: Bigger 3.5
3481 High Fidelity (2000) 5.0
4022 Cast Away (2000) 3.0
4262 Scarface (1983) 5.0
4896 Harry Potter and the Sorcerer's Stone (a.k.a. Harry Potter and the Philosopher's Stone) (2001) 5.0
4901 Spy Game (2001) 4.0
6934 "Matrix Revolutions 4.0
7361 Eternal Sunshine of the Spotless Mind (2004) 5.0
8368 Harry Potter and the Prisoner of Azkaban (2004) 5.0
8528 Dodgeball: A True Underdog Story (2004) 4.0
8529 "Terminal 4.0
8622 Fahrenheit 9/11 (2004) 0.5
8636 Spider-Man 2 (2004) 4.0
8644 "I 3.5
8665 "Bourne Supremacy 3.0
8783 "Village 3.0
8798 Collateral (2004) 3.5
Time taken: 97.669 seconds, Fetched: 48 row(s)
hive>
    
```

IMPALA:

```

cloudera@quickstart:~/Desktop/movie_ratings/Paper Publication
File Edit View Search Terminal Help
| 2100 | Splash (1984) | 3
| 2115 | Indiana Jones and the Temple of Doom (1984) | 4
| 2116 | "Lord of the Rings | 3
| 2302 | My Cousin Vinny (1992) | 4
| 2393 | Star Trek: Insurrection (1998) | 4.5
| 2662 | "War of the Worlds | 4.5
| 2700 | "South Park: Bigger | 3.5
| 3481 | High Fidelity (2000) | 5
| 4022 | Cast Away (2000) | 3
| 4262 | Scarface (1983) | 5
| 4896 | Harry Potter and the Sorcerer's Stone (a.k.a. Harry Potter and the Philosopher's Stone) (2001) | 5
| 4901 | Spy Game (2001) | 4
| 6934 | "Matrix Revolutions | 4
| 7361 | Eternal Sunshine of the Spotless Mind (2004) | 5
| 8368 | Harry Potter and the Prisoner of Azkaban (2004) | 5
| 8528 | Dodgeball: A True Underdog Story (2004) | 4
| 8529 | "Terminal | 4
| 8622 | Fahrenheit 9/11 (2004) | 0.5
| 8636 | Spider-Man 2 (2004) | 4
| 8644 | "I | 3.5
| 8665 | "Bourne Supremacy | 3
| 8783 | "Village | 3
| 8798 | Collateral (2004) | 3.5
-----
WARNINGS: Error converting column: 0 TO INT (Data is: 1)
file: hdfs://quickstart.cloudera:8020/user/hive/warehouse/movie.db/movies/movies.txt
record: 1,Toy Story (1995),Adventure|Animation|Children|Comedy|Fantasy

Fetched 48 row(s) in 5.11s
[quickstart.cloudera:21000] >
    
```

CASE 3: Finding MAX and MIN ratings from 663452198 records.	
The query finds maximum and minimum rating from entire ratings table which contain 663452198 records.	Query: SELECT MAX(ratings),MIN(ratings) >from ratings;

HIVE:

```

cloudera@quickstart:~/Desktop/movie_ratings/Paper Publication
File Edit View Search Terminal Help
Query ID = cloudera_20170813095353_d6a7ff28-d169-4a65-8ceb-cb97fce63091
Total jobs = 1
Launching Job 1 out of 1
Number of reduce tasks determined at compile time: 1
In order to change the average load for a reducer (in bytes):
  set hive.exec.reducers.bytes.per.reducer=<number>
In order to limit the maximum number of reducers:
  set hive.exec.reducers.max=<number>
In order to set a constant number of reducers:
  set mapreduce.job.reduces=<number>
Starting Job = job_1502526726007_0001, Tracking URL = http://quickstart.cloudera:8088/proxy/application_1502526726007_0001/
Kill Command = /usr/lib/hadoop/bin/hadoop job -kill job_1502526726007_0001
Hadoop job information for Stage-1: number of mappers: 3; number of reducers: 1
2017-08-13 09:54:17,512 Stage-1 map = 0%, reduce = 0%
2017-08-13 09:55:02,462 Stage-1 map = 33%, reduce = 0%, Cumulative CPU 20.22 sec
2017-08-13 09:55:03,567 Stage-1 map = 44%, reduce = 0%, Cumulative CPU 21.21 sec
2017-08-13 09:55:06,001 Stage-1 map = 56%, reduce = 0%, Cumulative CPU 23.43 sec
2017-08-13 09:55:31,076 Stage-1 map = 78%, reduce = 0%, Cumulative CPU 30.57 sec
2017-08-13 09:55:32,210 Stage-1 map = 78%, reduce = 22%, Cumulative CPU 30.92 sec
2017-08-13 09:55:33,327 Stage-1 map = 100%, reduce = 22%, Cumulative CPU 31.56 sec
2017-08-13 09:55:35,523 Stage-1 map = 100%, reduce = 100%, Cumulative CPU 32.92 sec
MapReduce Total cumulative CPU time: 32 seconds 920 msec
Ended Job = job_1502526726007_0001
MapReduce Jobs Launched:
Stage-Stage-1: Map: 3 Reduce: 1 Cumulative CPU: 32.92 sec HDFS Read: 663452206 HDFS Write: 8 SUCCESS
Total MapReduce CPU Time Spent: 32 seconds 920 msec
OK
5.0 0.5
Time taken: 102.226 seconds, Fetched: 1 row(s)
hive>
    
```

IMPALA:

```

cloudera@quickstart:~/Desktop/movie_ratings/Paper Publication
File Edit View Search Terminal Help
+-----+
| name   | type | comment |
+-----+
| user_id | int  |          |
| movie_id | int  |          |
| ratings | float |          |
| timestamp | int  |          |
+-----+
Fetched 4 row(s) in 0.29s
[quickstart.cloudera:21000] > SELECT MAX(ratings)
> from ratings;
Query: select MAX(ratings)
from ratings
+-----+
| max(ratings) |
+-----+
| 5            |
+-----+
Fetched 1 row(s) in 12.35s
[quickstart.cloudera:21000] > SELECT MAX(ratings),MIN(ratings)
> from ratings;
Query: select MAX(ratings),MIN(ratings)
from ratings
+-----+
| max(ratings) | min(ratings) |
+-----+
| 5            | 0.5          |
+-----+
Fetched 1 row(s) in 13.20s
[quickstart.cloudera:21000] >
    
```

Case 4: Movies by Genres

The query is to find the total number of count of the highest rating.

Query:
 SELECT COUNT(ratings)
 >FROM ratings
 >WHERE ratings=5;

HIVE:


```

cloudera@quickstart:/home/cloudera/Desktop/movie_ratings/Paper Publication
File Edit View Search Terminal Help
Total jobs = 1
Launching Job 1 out of 1
Number of reduce tasks determined at compile time: 1
In order to change the average load for a reducer (in bytes):
  set hive.exec.reducers.bytes.per.reducer=<number>
In order to limit the maximum number of reducers:
  set hive.exec.reducers.max=<number>
In order to set a constant number of reducers:
  set mapreduce.job.reduces=<number>
Starting Job = job_1502273504646_0006, Tracking URL = http://quickstart.cloudera:8088/proxy/application_1502273504646_0006/
Kill Command = /usr/lib/hadoop/bin/hadoop job -kill job_1502273504646_0006
Hadoop job information for Stage-1: number of mappers: 3; number of reducers: 1
2017-08-11 23:21:11,173 Stage-1 map = 0%, reduce = 0%
2017-08-11 23:22:12,254 Stage-1 map = 0%, reduce = 0%, Cumulative CPU 18.64 sec
2017-08-11 23:22:18,887 Stage-1 map = 22%, reduce = 0%, Cumulative CPU 20.63 sec
2017-08-11 23:22:29,423 Stage-1 map = 44%, reduce = 0%, Cumulative CPU 25.22 sec
2017-08-11 23:22:34,153 Stage-1 map = 56%, reduce = 0%, Cumulative CPU 25.28 sec
2017-08-11 23:22:43,488 Stage-1 map = 78%, reduce = 0%, Cumulative CPU 29.59 sec
2017-08-11 23:22:44,544 Stage-1 map = 100%, reduce = 0%, Cumulative CPU 30.01 sec
2017-08-11 23:23:06,282 Stage-1 map = 100%, reduce = 67%, Cumulative CPU 31.79 sec
2017-08-11 23:23:08,439 Stage-1 map = 100%, reduce = 100%, Cumulative CPU 33.4 sec
MapReduce Total cumulative CPU time: 33 seconds 400 msec
Ended Job = job_1502273504646_0006
MapReduce Jobs Launched:
Stage-Stage-1: Map: 3 Reduce: 1 Cumulative CPU: 33.4 sec HDFS Read: 663452523 HDFS Write: 8 SUCCESS
Total MapReduce CPU Time Spent: 33 seconds 400 msec
OK
3580058
Time taken: 137.997 seconds, Fetched: 1 row(s)
hive>
    
```

IMPALA:

```

cloudera@quickstart:~/Desktop/movie_ratings/Paper Publication
File Edit View Search Terminal Help
[quickstart.cloudera:21000] > SELECT COUNT(ratings)
FROM ratings
WHERE ratings=5;
Query: select COUNT(ratings)
FROM ratings
WHERE ratings=5
+-----+
| count(ratings) |
+-----+
| 3580058        |
+-----+
Fetched 1 row(s) in 6.35s
[quickstart.cloudera:21000] >
    
```

Case 5: Pure Comedy Movies With Lowest Ratings.	
<p>The query is to find movies having genres as ‘Comedy’ with the lowest rating. It joins two tables ratings and movies on the movie_id field that displays movie id, name, ratings and genres.</p>	<p>Query: >SELECT r.movie_id, name,ratings,genres >FROM movie.ratings r >JOIN movie.movies m >ON (r.movie_id=m.movie_id) >WHERE genres LIKE 'Comedy' AND ratings=0.5;</p>

HIVE:

```

cloudera@quickstart:/home/cloudera/Desktop/movie_ratings/Paper Publication
File Edit View Search Terminal Help
223 Clerks (1994) 0.5 Comedy
4718 American Pie 2 (2001) 0.5 Comedy
216 Billy Madison (1995) 0.5 Comedy
520 Robin Hood: Men in Tights (1993) 0.5 Comedy
1485 Liar Liar (1997) 0.5 Comedy
1911 Dr. Dolittle (1998) 0.5 Comedy
2567 EDTV (1999) 0.5 Comedy
2694 Big Daddy (1999) 0.5 Comedy
2770 Bowfinger (1999) 0.5 Comedy
5283 National Lampoon's Van Wilder (2002) 0.5 Comedy
5308 Three Men and a Baby (1987) 0.5 Comedy
5500 Top Secret! (1984) 0.5 Comedy
3042 Meatballs III (1987) 0.5 Comedy
4215 Revenge of the Nerds II: Nerds in Paradise (1987) 0.5 Comedy
3821 Nutty Professor II: The Klumps (2000) 0.5 Comedy
6482 Dumb and Dumberer: When Harry Met Lloyd (2003) 0.5 Comedy
104 Happy Gilmore (1996) 0.5 Comedy
216 Billy Madison (1995) 0.5 Comedy
3421 Animal House (1978) 0.5 Comedy
3979 Little Nicky (2000) 0.5 Comedy
8859 SuperBabies: Baby Geniuses 2 (2004) 0.5 Comedy
54290 Bratz: The Movie (2007) 0.5 Comedy
54503 Superbad (2007) 0.5 Comedy
4718 American Pie 2 (2001) 0.5 Comedy
5481 Austin Powers in Goldmember (2002) 0.5 Comedy
7451 Mean Girls (2004) 0.5 Comedy
4013 Mr. Accident (2000) 0.5 Comedy
65 Bio-Dome (1996) 0.5 Comedy
Time taken: 122.397 seconds, Fetched: 30423 row(s)
hive>
    
```

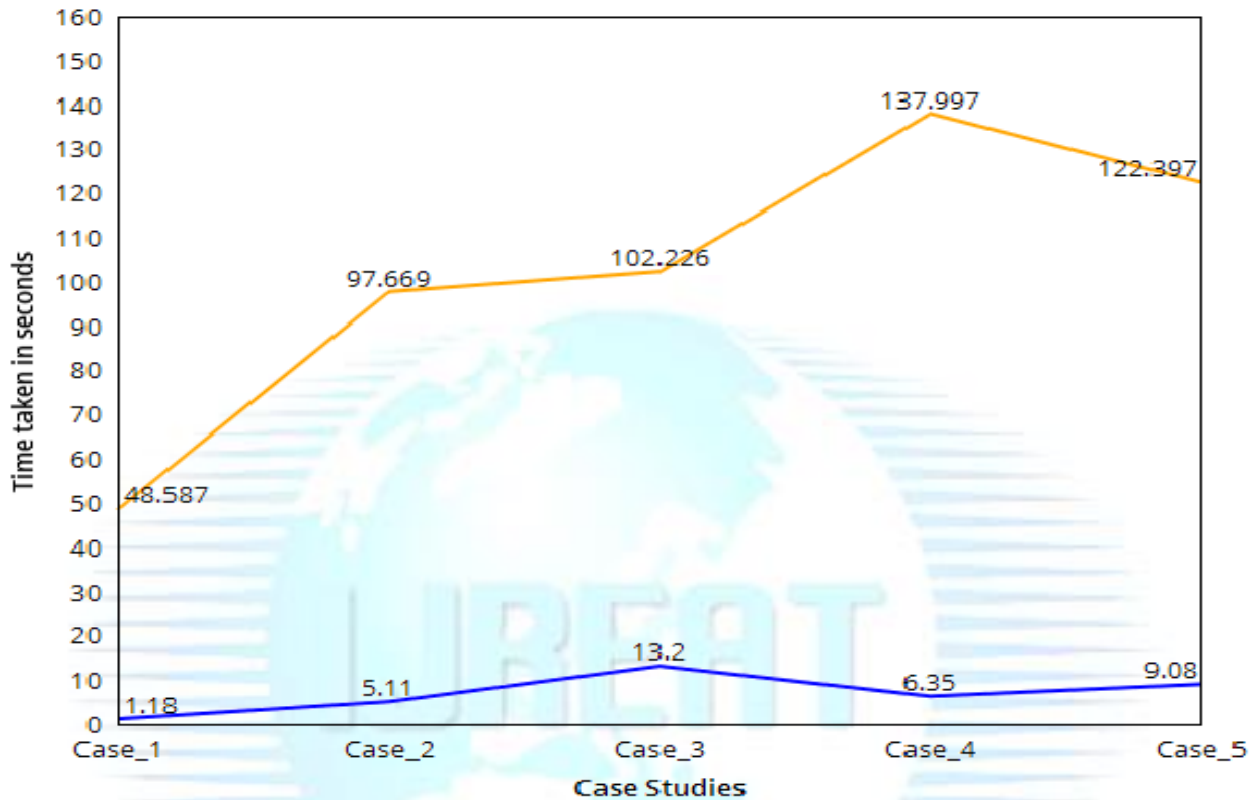
IMPALA:

```

cloudera@quickstart:~/Desktop/movie_ratings/Paper Publication
File Edit View Search Terminal Help
4718 | American Pie 2 (2001) | 0.5 | Comedy |
216 | Billy Madison (1995) | 0.5 | Comedy |
520 | Robin Hood: Men in Tights (1993) | 0.5 | Comedy |
1485 | Liar Liar (1997) | 0.5 | Comedy |
1911 | Dr. Dolittle (1998) | 0.5 | Comedy |
2567 | EDTV (1999) | 0.5 | Comedy |
2694 | Big Daddy (1999) | 0.5 | Comedy |
2770 | Bowfinger (1999) | 0.5 | Comedy |
5283 | National Lampoon's Van Wilder (2002) | 0.5 | Comedy |
5308 | Three Men and a Baby (1987) | 0.5 | Comedy |
5500 | Top Secret! (1984) | 0.5 | Comedy |
3042 | Meatballs III (1987) | 0.5 | Comedy |
4215 | Revenge of the Nerds II: Nerds in Paradise (1987) | 0.5 | Comedy |
3821 | Nutty Professor II: The Klumps (2000) | 0.5 | Comedy |
6482 | Dumb and Dumberer: When Harry Met Lloyd (2003) | 0.5 | Comedy |
104 | Happy Gilmore (1996) | 0.5 | Comedy |
216 | Billy Madison (1995) | 0.5 | Comedy |
3421 | Animal House (1978) | 0.5 | Comedy |
3979 | Little Nicky (2000) | 0.5 | Comedy |
8859 | SuperBabies: Baby Geniuses 2 (2004) | 0.5 | Comedy |
54290 | Bratz: The Movie (2007) | 0.5 | Comedy |
54503 | Superbad (2007) | 0.5 | Comedy |
4718 | American Pie 2 (2001) | 0.5 | Comedy |
5481 | Austin Powers in Goldmember (2002) | 0.5 | Comedy |
7451 | Mean Girls (2004) | 0.5 | Comedy |
4013 | Mr. Accident (2000) | 0.5 | Comedy |
65 | Bio-Dome (1996) | 0.5 | Comedy |
-----
Fetched 30423 row(s) in 9.08s
[quickstart.cloudera:21000] >
    
```

III. PERFORMANCE ANALYSIS OF HIVE WITH IMPALA FOR ABOVE CASES

Performance Analysis of Impala and Hive



Impala	1.18	5.11	13.20	6.35	9.08
Hive	48.587	97.669	102.226	137.997	122.397

IV. CONCLUSION

Cloudera's Impala has many advantages over Apache Hive. Considering the performance of both, Cloudera's Impala is always preferable to developers when it comes to analyzing HDFS or HBase data because it does not require moving this data, Impala uses Hive's metastore. As Cloudera's Impala is written in C/C++ the advantage is it takes less time to execute the query but it has one demerit that it is not suitable for every file format especially for a file written in java. Although Cloudera's Impala is fast when it comes to upgradation project where compatibility is as important as speed, Apache Hive would nudge. Thus we conclude that Cloudera's Impala's performance is better, time efficient than Apache Hive.

V. REFERENCES

- [1]. https://www.cloudera.com/documentation/enterprise/5-8-x/topics/impala_file_formats.html
- [2]. <https://www.linkedin.com/pulse/20140910142911-22744472-why-is-impala-faster-than-hive>
- [3]. <https://www.slideshare.net/hadooparchbook/impala-architecture-presentation>
- [4]. <https://www.dezyre.com/article/impala-vs-hive-difference-between-sql-on-hadoop-components/180>
- [5]. <https://grouplens.org/datasets/movielens>
- [6]. Big Data: An Introduction, ARD-IJEET, ISSN- 2320-8821, Volume 5, Issue 1
- [7]. https://en.wikipedia.org/wiki/Apache_Hive
- [8]. <https://impala.apache.org/>