

# Apache Hive Performance Tuning

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# Contents

|  |          |
|--|----------|
| <b>Query results cache.....</b>                      | <b>4</b> |
| <b>Best practices for performance tuning.....</b>    | <b>4</b> |
| <b>ORC file format.....</b>                          | <b>4</b> |
| Advanced ORC properties.....                         | 6        |
| <b>Performance improvement using partitions.....</b> | <b>6</b> |
| <b>Apache Tez and Hive LLAP.....</b>                 | <b>7</b> |
| <b>Bucketed tables in Hive.....</b>                  | <b>7</b> |

## Query results cache

Hive filters and caches similar or identical queries in the query results cache. Caching repetitive queries can reduce the load substantially when hundreds or thousands of users of BI tools and web services query Hive.

Some operations support vast user populations, who connect to Hive using BI systems such as Tableau. In these situations, repetitious queries are inevitable. The query results cache, which is on by default, filters and stores common queries in a cache. When you issue the query again, Hive retrieves the query result from a cache instead of recomputing the result, which takes a load off the backend system.

Every query that runs in Hive 3 stores its result in a cache. Hive evicts invalid data from the cache if the input table changes. For example, if you perform aggregation and the base table changes, queries you run most frequently stay in cache, but stale queries are evicted. The query results cache works with managed tables only because Hive cannot track changes to an external table. If you join external and managed tables, Hive falls back to executing the full query. The query results cache works with ACID tables. If you update an ACID table, Hive reruns the query automatically.

### Configuring the query results cache

You can enable and disable the query results cache from the command line. You might want to do so to debug a query. You disable the query results cache in HiveServer by setting the following parameter to false: `SET hive.query.results.cache.enabled=false;`

By default, Hive allocates 2GB for the query results cache. You can change this setting by configuring the following parameter in bytes: `hive.query.results.cache.max.size`

## Best practices for performance tuning

Review certain performance tuning guidelines related to configuring the cluster, storing data, and writing queries so that you can protect your cluster and dependent services, automatically scale resources to handle queries, and so on.

### Best practices

- Use Ranger security service to protect your cluster and dependent services.
- Store data using the ORC File format. Others, such as Parquet are supported, but not as fast for Hive queries.
- Ensure that queries are fully vectorized by examining explain plans.

### Related Information

[Custom Configuration \(about Cloudera Manager Safety Valve\)](#)

[Example of using the Cloudera Manager Safety Valve](#)

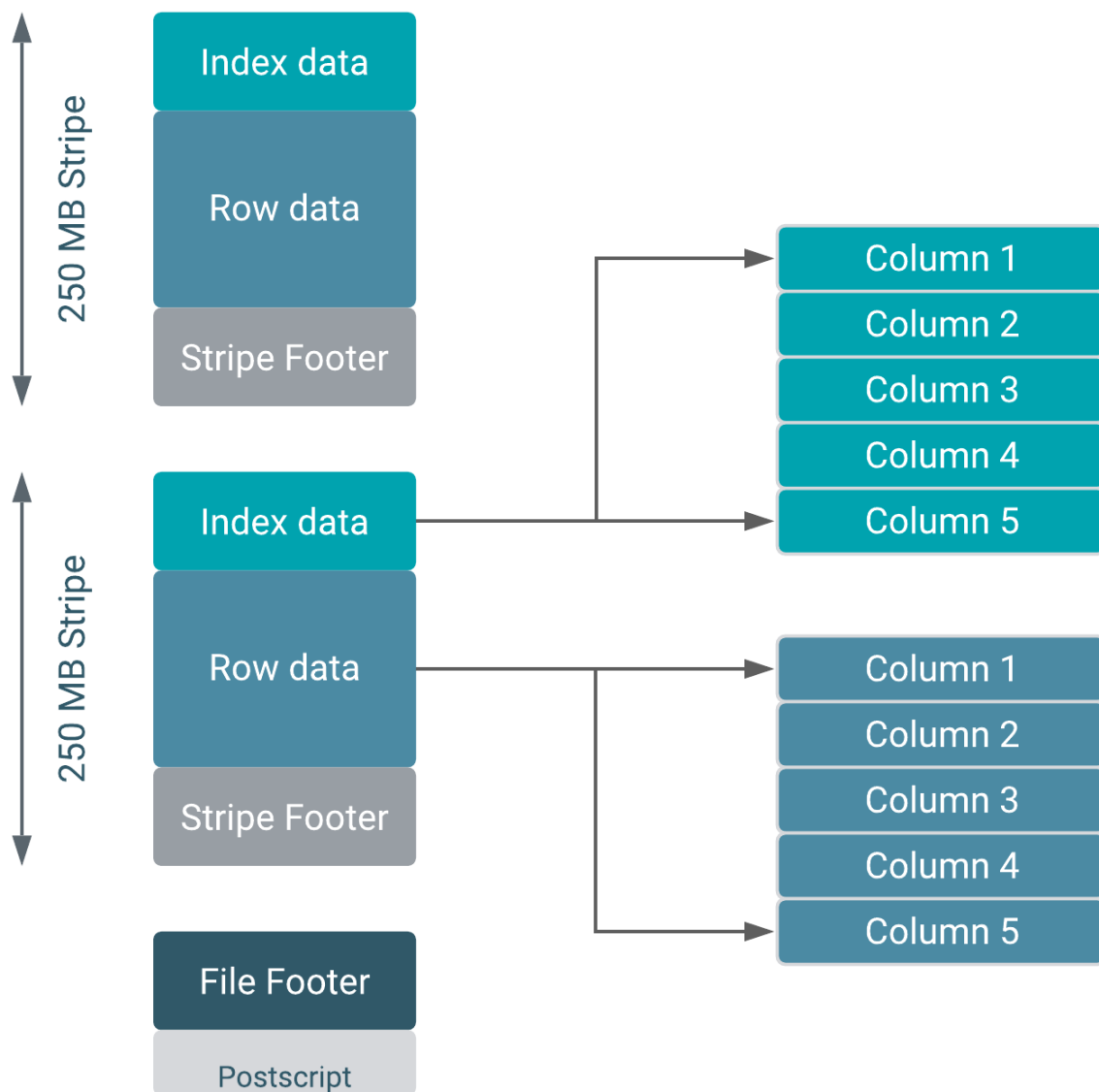
## ORC file format

You can conserve storage in a number of ways, but using the Optimized Row Columnar (ORC) file format for storing Apache Hive data is most effective. ORC is the default storage for Hive data.

The ORC file format for Hive data storage is recommended for the following reasons:

- Efficient compression: Stored as columns and compressed, which leads to smaller disk reads. The columnar format is also ideal for vectorization optimizations.
- Fast reads: ORC has a built-in index, min/max values, and other aggregates that cause entire stripes to be skipped during reads. In addition, predicate pushdown pushes filters into reads so that minimal rows are read. And Bloom filters further reduce the number of rows that are returned.

- Proven in large-scale deployments: Meta (aka Facebook) uses the ORC file format for a 300+ PB deployment.



ORC provides the best Hive performance overall. In addition, to specifying the storage format, you can also specify a compression algorithm for the table, as shown in the following example:

```
CREATE TABLE addresses (
  name string,
  street string,
  city string,
  state string,
  zip int
) STORED AS orc TBLPROPERTIES ("orc.compress"="Zlib");
```

Setting the compression algorithm is usually not required because your Hive settings include a default algorithm. Using ORC advanced properties, you can create bloom filters for columns frequently used in point lookups.

Hive supports Parquet and other formats for insert-only ACID tables and external tables. You can also write your own SerDes (Serializers, Deserializers) interface to support custom file formats.

## Advanced ORC properties

Usually, you do not need to modify Optimized Row Columnar (ORC) properties, but occasionally, Cloudera Support advises making such changes. Review the property keys, default values, and descriptions you can configure ORC to suit your needs.

### Property keys and defaults

You use the Safety Valve feature in Cloudera Manager to change ORC properties.

| Key                      | Default Setting | Description  |
|--------------------------|-----------------|--|
| orc.compress             | ZLIB            | Compression type (NONE, ZLIB, SNAPPY).   |
| orc.compress.size        | 262,144         | Number of bytes in each compression block.   |
| orc.stripe.size          | 268,435,456     | Number of bytes in each stripe.  |
| orc.row.index.stride     | 10,000          | Number of rows between index entries ( $\geq 1,000$ ).                                     |
| orc.create.index         | true            | Sets whether to create row indexes.  |
| orc.bloom.filter.columns | --              | Comma-separated list of column names for which a Bloom filter must be created.             |
| orc.bloom.filter.fpp     | 0.05            | False positive probability for a Bloom filter. Must be greater than 0.0 and less than 1.0. |

### Related Information

[Custom Configuration \(about Cloudera Manager Safety Valve\)](#)

[Example of using the Cloudera Manager Safety Valve](#)

## Performance improvement using partitions

You must be aware of partition pruning benefits, how to enable dynamic partitioning, and the configuration required for bulk-loading of data to ensure significant improvements in performance. You can use partitions to significantly improve performance.

You can design Hive table and materialized views partitions to map to physical directories on the file system/object store. For example, a table partitioned by date-time can organize data loaded into Hive each day. Large deployments can have tens of thousands of partitions. Partition pruning occurs indirectly when Hive discovers the partition key during query processing. For example, after joining with a dimension table, the partition key might come from the dimension table. A query filters columns by partition, limiting scanning that occurs to one or a few matching partitions. Partition pruning occurs directly when a partition key is present in the WHERE clause. Partitioned columns are virtual, not written into the main table because these columns are the same for the entire partition.

You do not need to specify dynamic partition columns. Hive generates a partition specification if you enable dynamic partitions.

### Configuration for loading 1 to 9 partitions:

```
SET hive.exec.dynamic.partition.mode=nonstrict;  
SET hive.exec.dynamic.partition=true;
```

For bulk-loading data into partitioned ORC tables, you use the following property, which optimizes the performance of data loading into 10 or more partitions.

**Configuration for loading 10 or more partitions:**

```
hive.optimize.sort.dynamic.partition=true
```

## Apache Tez and Hive LLAP

Cloudera Data Warehouse supports low-latency analytical processing (LLAP) of Hive queries.

Hive uses Apache Tez to execute queries internally. Apache Tez provides the following execution modes:

- Container mode

Every time you run a Hive query, Tez requests a container from YARN.

- LLAP mode

Every time you run a Hive query, Tez asks the LLAP daemon for a free thread, and starts running a fragment.

Apache Tez provides the framework to run a job that creates a graph with vertexes and tasks. SQL semantics for deciding the query physical plan, which identifies how to execute the query in a distributed fashion, is based on Apache Tez. The entire execution plan is created under this framework. SQL syntax in Hive is the same irrespective of execution engine (mode) used in Hive.

Apache Tez does not have to start from the ground up, requesting a container and waiting for a JVM, to run a fragment in LLAP mode. LLAP mode provides dedicated capacity. Caching is automated. The primary difference between LLAP mode and container mode, is that in LLAP mode the LLAP executors are used to run query fragments.

In Cloudera Data Warehouse (CDW), the Hive execution mode is LLAP. In Cloudera Data Hub on CDP Public Cloud and CDP Private Cloud Base, the Hive execution mode is container, and LLAP mode is not supported. When Apache Tez runs Hive in container mode, it has traditionally been called Hive on Tez.

## Bucketed tables in Hive

If you migrated data from earlier Apache Hive versions to Hive 3, you might need to handle bucketed tables that impact performance. Review how CDP simplifies handling buckets. You learn about best practices for handling dynamic capabilities.

You can divide tables or partitions into buckets, which are stored in the following ways:

- As files in the directory for the table.
- As directories of partitions if the table is partitioned.

Specifying buckets in Hive 3 tables is not necessary. In CDP, Hive 3 buckets data implicitly, and does not require a user key or user-provided bucket number as earlier versions (ACID V1) did. For example:

V1:

```
CREATE TABLE hello_acid (load_date date, key int, value int)
CLUSTERED BY(key) INTO 3 BUCKETS
STORED AS ORC TBLPROPERTIES ('transactional'='true');
```

V2:

```
CREATE TABLE hello_acid_v2 (load_date date, key int, value int);
```

Performance of ACID V2 tables is on a par with non-ACID tables using buckets. ACID V2 tables are compatible with native cloud storage.

A common challenge related to using buckets in tables migrated from earlier versions is maintaining query performance while the workload or data scales up or down. For example, you could have an environment that operates smoothly using 16 buckets to support 1000 users, but a spike in the number of users to 100,000 for a day or two creates problems if you do not promptly tune the buckets and partitions. Tuning the buckets is complicated by the fact that after you have constructed a table with buckets, the entire table containing the bucketed data must be reloaded to reduce, add, or eliminate buckets.

In CDP, you only need to deal with the buckets of the biggest table. If workload demands change rapidly, the buckets of the smaller tables dynamically change to complete table JOINS.

### Bucket configurations

You can enable buckets as follows:

```
SET hive.tez.bucket.pruning=true
```

When you load data into tables that are both partitioned and bucketed, set the `hive.optimize.sort.dynamic.partition` property to optimize the process:

```
SET hive.optimize.sort.dynamic.partition=true
```

If you have 20 buckets on `user_id` data, the following query returns only the data associated with `user_id = 1`:

```
SELECT * FROM tab WHERE user_id = 1;
```

To best leverage the dynamic capability of table buckets, adopt the following practices:

- Use a single key for the buckets of the largest table.
- Usually, you need to bucket the main table by the biggest dimension table. For example, the sales table might be bucketed by customer and not by merchandise item or store. However, in this scenario, the sales table is sorted by item and store.
- Normally, do not bucket and sort on the same column.
- A table that has more bucket files than the number of rows is an indication that you should reconsider how the table is bucketed.