



zalando

an overview of table formats for large scale storage and analytics

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wssbck







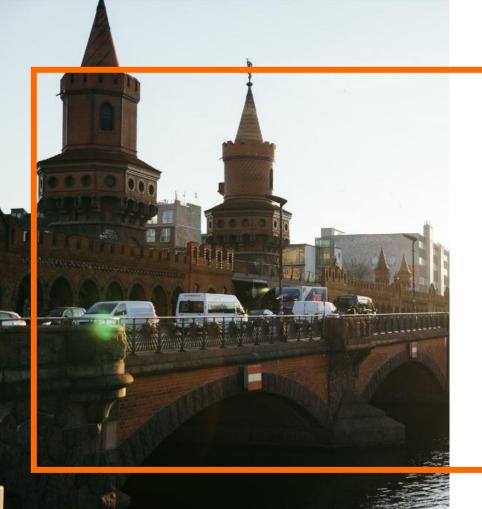
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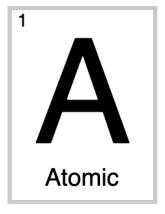
This Is How We Do It

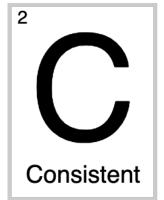
Moving Forward

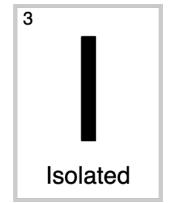


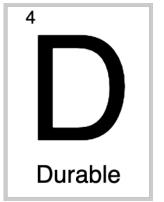
All Is Not Well In The Land Of Big Data

ACID Properties

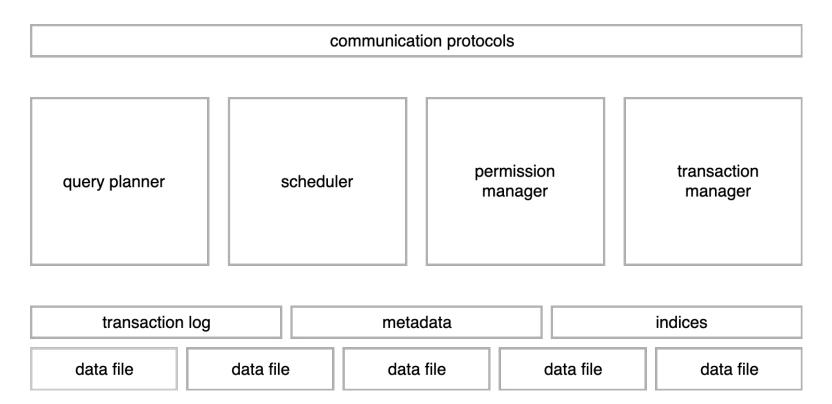






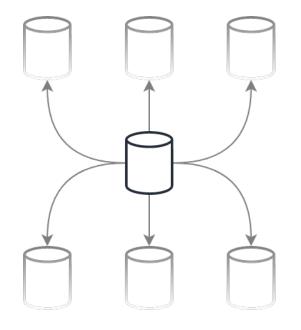


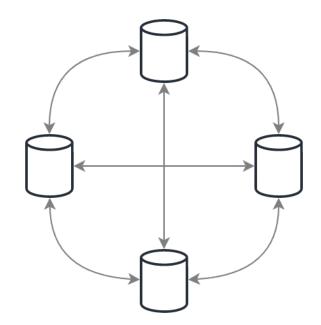
Single Node Database





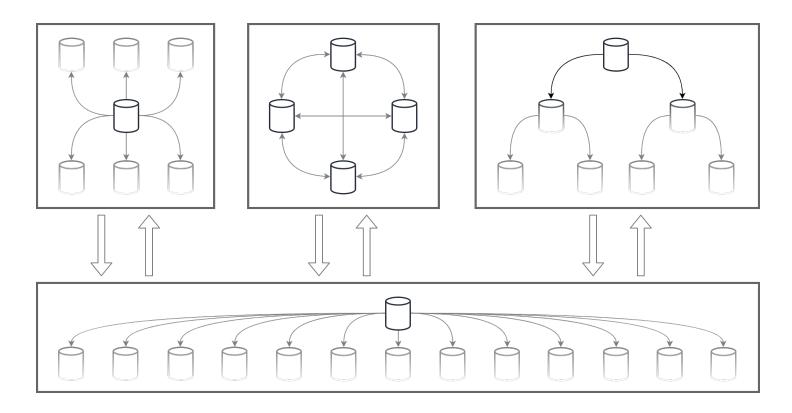
Distributed Database





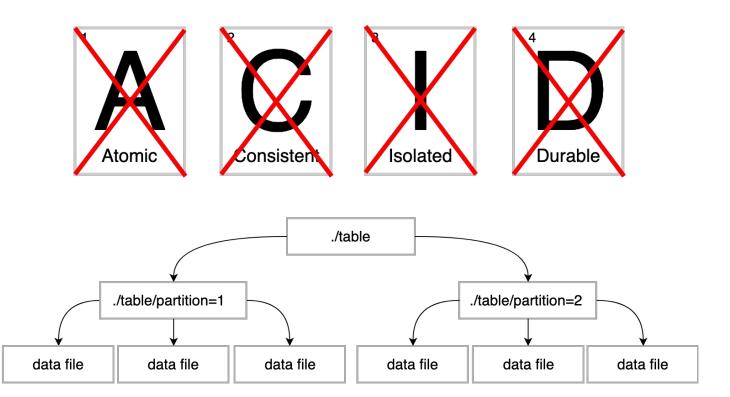


Distributed Data Infrastructure





Lost ACID





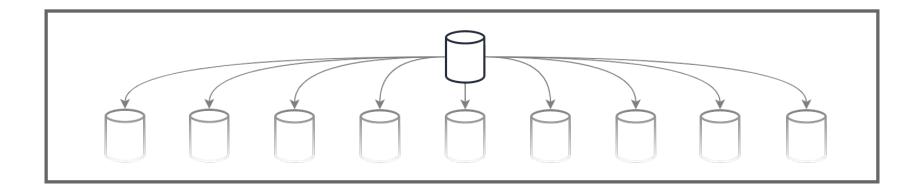


There Is Hope, However

A Table Format?

transaction log schema definition statistics indices

data file data file data file data file data file





ACID ORC





ACID ORC

```
CREATE TABLE d_manufacturers (id int, name string)
PARTITIONED BY (country string)
STORED AS ORC
TBLPROPERTIES ('transactional'='true');
```



ACID ORC



- Fast updates / upserts (no file rewrite)
- Hive 2.x ACID ORC tables can be converted to Hive 3.x ACID ORC tables
- Commercial Support (Cloudera)

- Limited support for Spark (being worked on by Qubole)
- Slow listing and metadata discovery
- Potentially slower read due to ad-hoc compaction
- ❖ ORC only
- Mandatory S3Guard or EMR with consistent view enabled





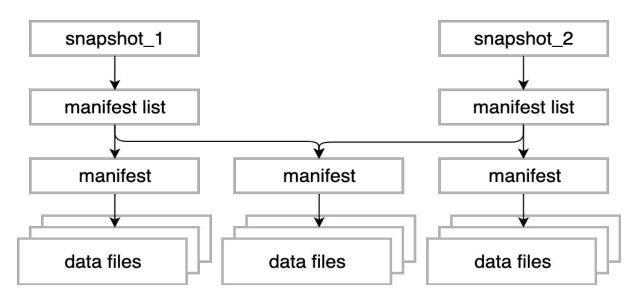
Apache Iceberg





Apache Iceberg







Apache Iceberg

- Parquet, Avro, ORC supported as file formats
- Robust schema and partitioning changes
- Fast query planning
- Presto connector
- Time travel with snapshot id listing
- No dependency on Spark
 public List<Snapshot> snapshots() {
 return snapshots;
 }
- Spark support
- Sparse documentation
- No commercial support
- Not as mature as other formats





Delta Lake





Delta Lake





Delta Lake



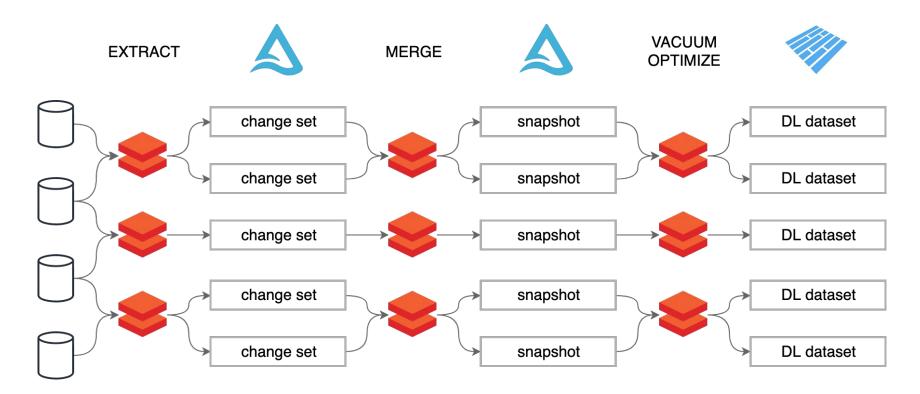
- Great integration with Spark, including Structured Streaming
- Merge syntax in Spark SQL
- Time travel
- Comprehensive, well written documentation
- Fast development backed by a commercial entity
- VACUUM + OPTIMIZE
- Incoming Presto reader (Starburst)

- Parquet only
- Multicluster writes outside of Databricks only on HDFS



This Is How We Do It

Delta Lake @Zalando





Moving Forward

The Future is Bright







cloudera

















Further Reading

ACID ORC

https://orc.apache.org/docs/acid.html

https://cwiki.apache.org/confluence/display/Hive/Hive+Transactions

http://shzhangji.com/blog/2019/06/10/understanding-hive-acid-transactional-table/

https://docs.cloudera.com/HDPDocuments/HDP3/HDP-3.0.0/using-hivegl/content/hive_3_internals.html

Iceberg

https://iceberg.apache.org/

https://iceberg.apache.org/spec/

https://github.com/apache/incubator-iceberg

https://www.youtube.com/watch?v=z7p_m17BXs8

https://www.youtube.com/watch?v=nWwQMlrjhy0

Delta Lake

https://delta.io/

https://github.com/delta-io

https://github.com/delta-io/delta/blob/master/PROTOCOL.md

https://databricks.com/blog/2019/08/21/diving-into-delta-lake-unpacking-the-transaction-log.html

https://databricks.com/blog/2019/09/24/diving-into-delta-lake-schema-enforcement-evolution.html



Further Reading

Engine Support

https://github.com/prestosql/presto/issues/576

https://github.com/prestosql/presto/issues/1324

https://github.com/prestosql/presto/pull/1067

https://docs.databricks.com/delta/presto-compatibility.html

https://www.starburstdata.com/technical-blog/starburst-presto-databricks-delta-lake-support/

https://www.qubole.com/blog/qubole-open-sources-multi-engine-support-for-updates-and-deletes-in-data-lakes/

https://github.com/qubole/spark-acid

S3 Consistency

https://issues.apache.org/jira/browse/HADOOP-13345

https://hadoop.apache.org/docs/r3.0.3/hadoop-aws/tools/hadoop-aws/s3guard.html

Other

https://www.postgresql.org/docs/current/storage.html

https://www.postgresql.org/docs/current/routine-vacuuming.html

https://dev.mysql.com/doc/refman/8.0/en/optimize-table.html

https://medium.com/@brunocrt/the-distributed-architecture-behind-cassandra-database-fba8b5cc4785

https://github.com/delta-io/delta/issues/41





ACID ORC, Iceberg and Delta Lake

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