

The TPC-DS Benchmark of CarbonData 2.1.0 and Parquet 1.10.1 on Spark 2.4.5

TPC-DS is the industry standard benchmark for measuring the performance of decision support solutions. We used this TPCDS to compare CarbonData (2.1.0 version) and Parquet on Spark 2.4.5 execution engine with Data of 500 GB Scala Factor.

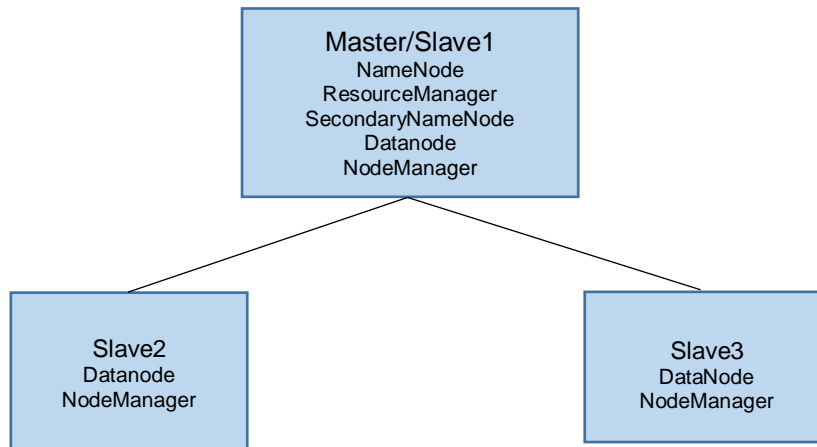
Hardware

CPU: Intel(R) Xeon(R) CPU E5-2690 v3 @ 2.60GHz - 48 CPU

Memory: 378 GB DDR4 RAM

Hard Disk: 12 x 4 TB SATA 7200 RPM HDD

Total Nodes: 3



Configurations

CarbonData Properties

```
# Number of cores used while loading per executor, Used 20 cores while loading the data.
carbon.number.of.cores.while.loading = 20

#carbon sort size
carbon.sort.size = 500000

#compressor for writing/reading CarbonData file
carbon.column.compressor = snappy

#System property to enable or disable local dictionary generation
carbon.local.dictionary.enable = true

#when enabled complete row filters will be handled by carbon in case of vector. If it is disabled then only page level pruning
will be done by carbon and row level filtering will be done by spark for vector. There is no change in flow for non-vector
based queries.
carbon.push.rowfilters.for.vector = false

#this property defines how the tasks are split/combined and launch spark tasks during query
carbon.task.distribution = blocklet

#Unsafe Memory
carbon.unsafe.working.memory.in.mb=2048

#property to be specified for caching level (Block/Blocklet)
'CACHE_LEVEL'='BLOCKLET'

#table blocklet size in MB
'table_blocklet_size'='64'

#table block size in MB
'table_blocksize'='64'
```

Spark Properties

Data Loading Properties

```
spark.master=yarn-client
spark.executor.instances=3
spark.executor.cores=20
spark.executor.memory =180G
spark.yarn.am.memory = 5G
spark.yarn.driver.memoryOverhead =10G
spark.yarn.executor.memoryOverhead = 5G
spark.driver.memory = 50G
```

Query Execution Properties

```
spark.master=yarn-client
spark.executor.instances = 20
spark.executor.cores=4
spark.executor.memory = 30G
spark.yarn.am.memory = 5G
spark.yarn.driver.memoryOverhead = 3G
spark.yarn.executor.memoryOverhead = 4G
spark.driver.memory = 40G
```

Common Properties for Data Loading and Query Execution

```
spark.scheduler.mode = FIFO
spark.shuffle.statistics.verbose = TRUE
spark.sql.authorization.enabled = TRUE
spark.sql.crossJoin.enabled = TRUE
spark.thriftserver.proxy.enabled = TRUE
spark.sql.innerjoin.addNullFilter = TRUE
spark.acls.enable = FALSE
spark.sql.shuffle.partitions = 200
spark.sql.parquet.filterPushdown=true
spark.hadoop.datanucleus.schema.autoCreateAll=true
spark.sql.hive.convertMetastoreCtas=false
spark.sql.optimizer.bloomFilterPruning.enabled=false
spark.io.compression.codec=snappy
```

Compression Ratio

The following depicts the compression ratio between Carbon and Parquet.

Formula

Compression Ratio = $((O - S)/S) * 100$

O = Raw Data Size

S = Store size (Parquet or Carbon)

TPCDS Scala Factor: 500 GB

Parquet Store Size = 155.7 GB

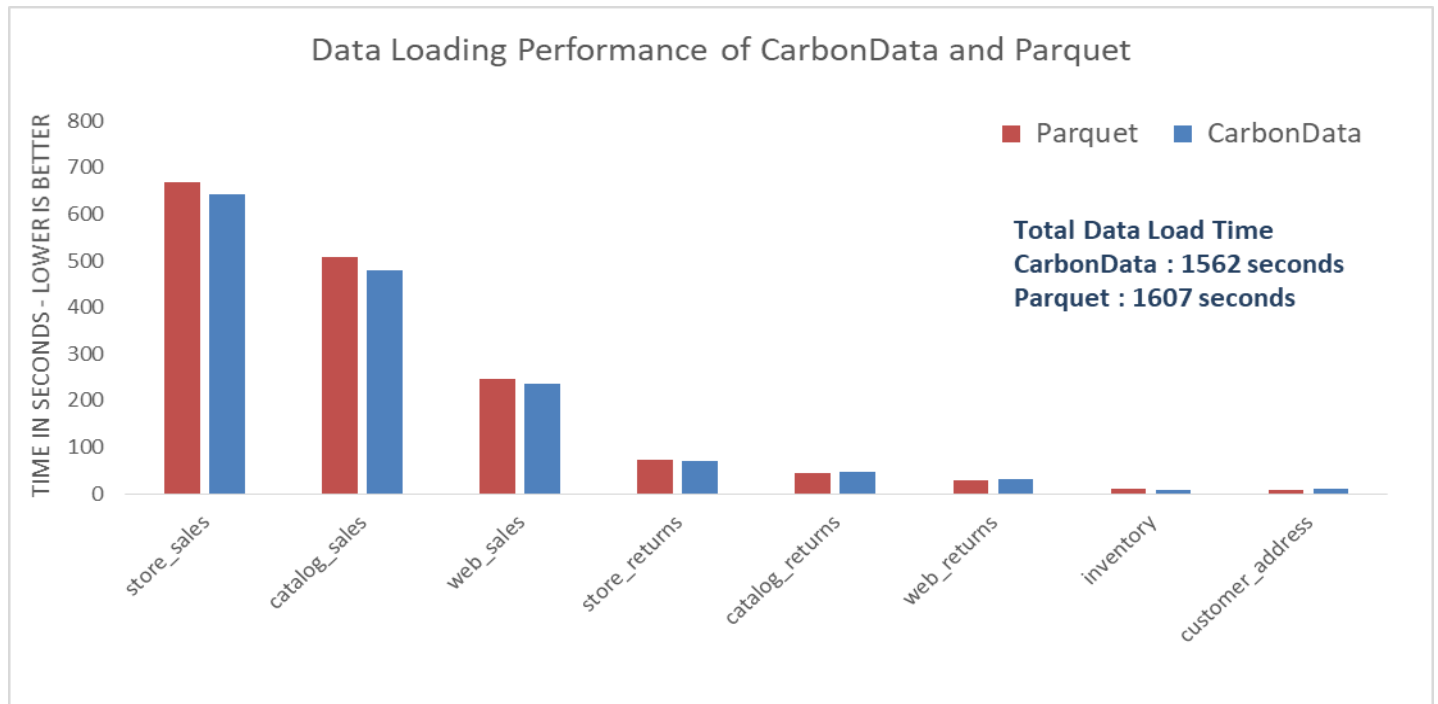
CarbonData Store Size = 127.0 GB

Parquet Compression Ratio: 180.65

CarbonData Compression Ratio: 244.00

Loading Performance

The below chart depicts the data loading performance of CarbonData 2.1.0 (no_sort) and parquet.



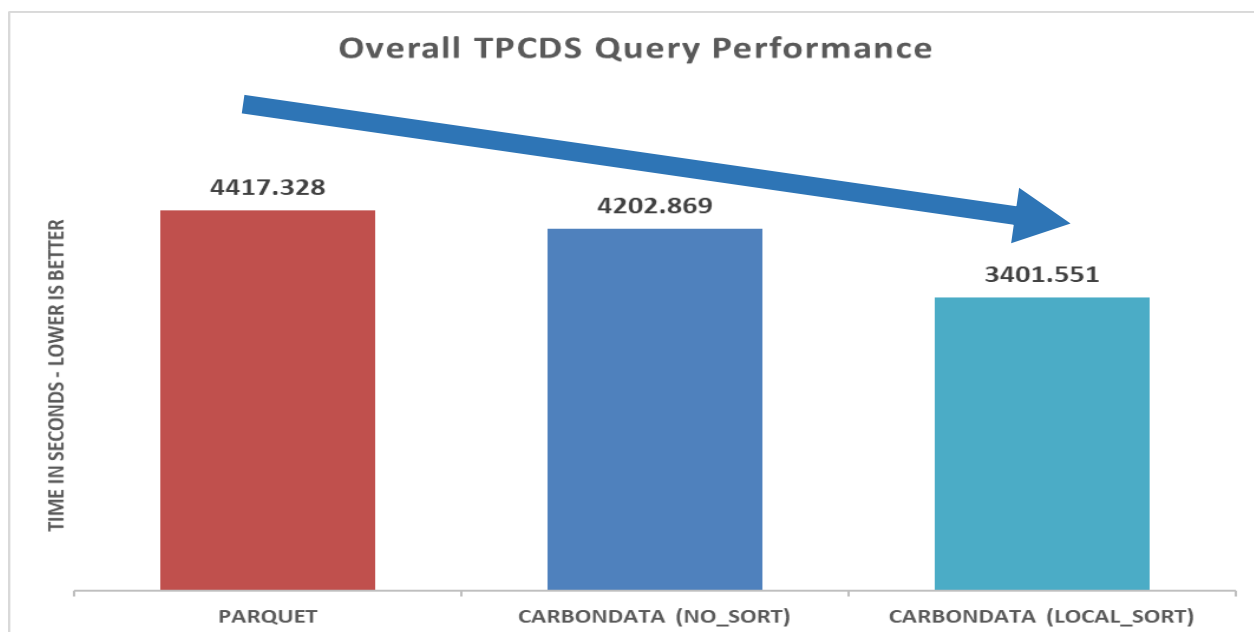
Summary:

CarbonData 2.1.0 (no_sort) has better performance in data loading compared to parquet.

Query Performance

TPCDS Query Performance of CarbonData 2.1.0 with no_sort and local_sort compared to Parquet on Data Size of 500GB Scala Factor.

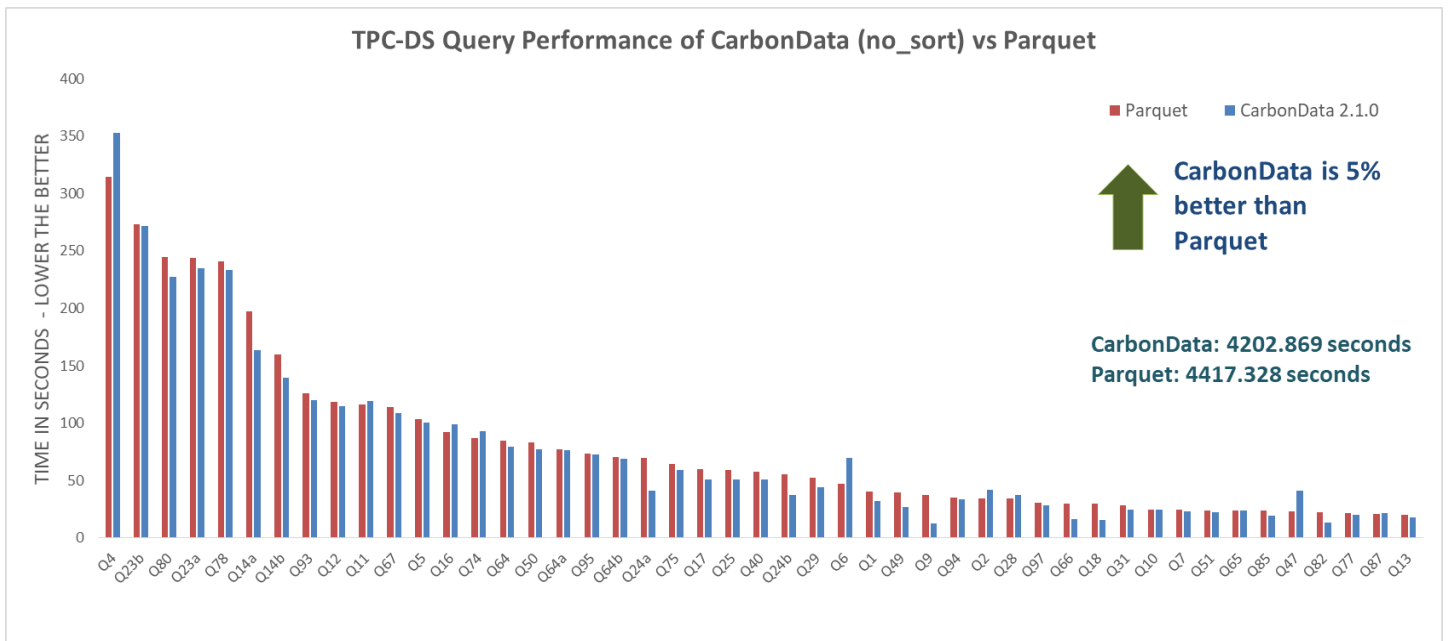
1. Overall Query Performance of CarbonData 2.1.0 compared to Parquet



Summary:

1. CarbonData query performance is better than Parquet with default configurations.
2. Carbondata has multiple performance optimizations to suite various scenarios.
3. CarbonData query performance with local_sort has improved by 23% compared to parquet.

2. The below chart depicts the performance of CarbonData 2.1.0 and Parquet. We have loaded Carbon with `sort_scope as no_sort` option and Parquet loaded directly.

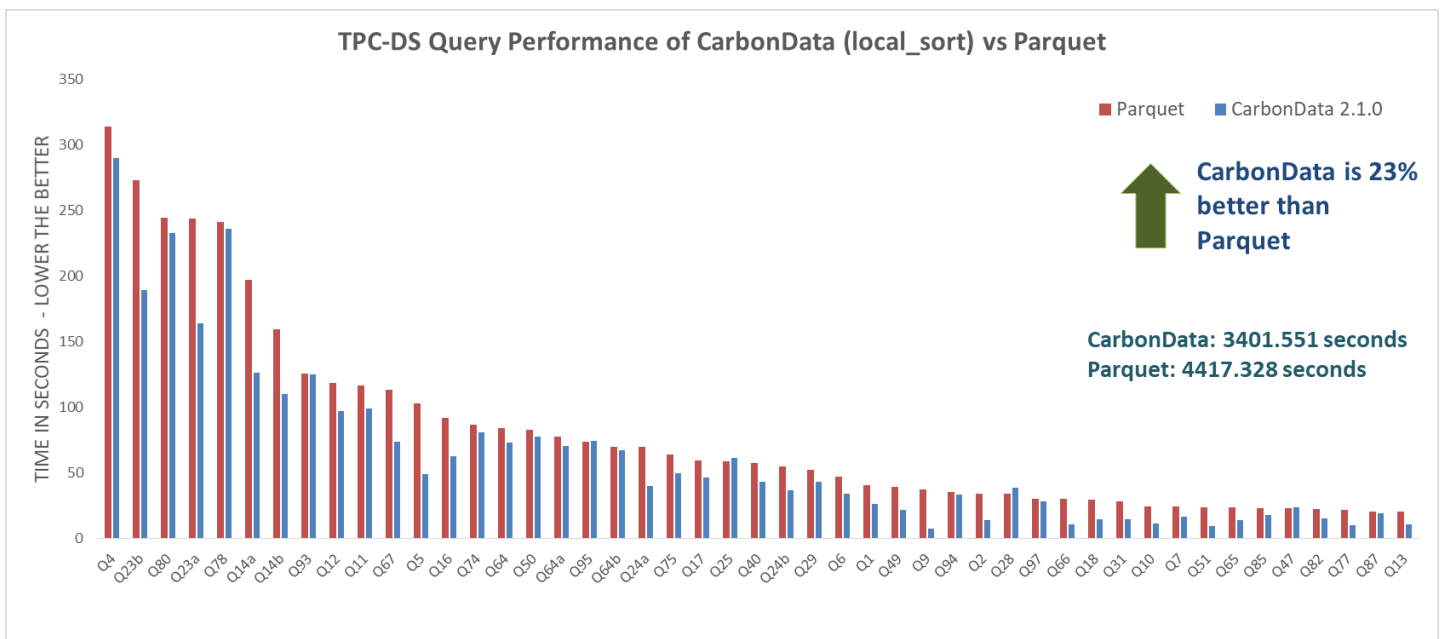


Summary:

CarbonData 2.1.0 query performance is 5% better compared to Parquet.

3. The below chart depicts the performance of CarbonData 2.1.0 and Parquet. We have loaded Carbon with `sort_scope as local_sort` option and Parquet loaded directly.

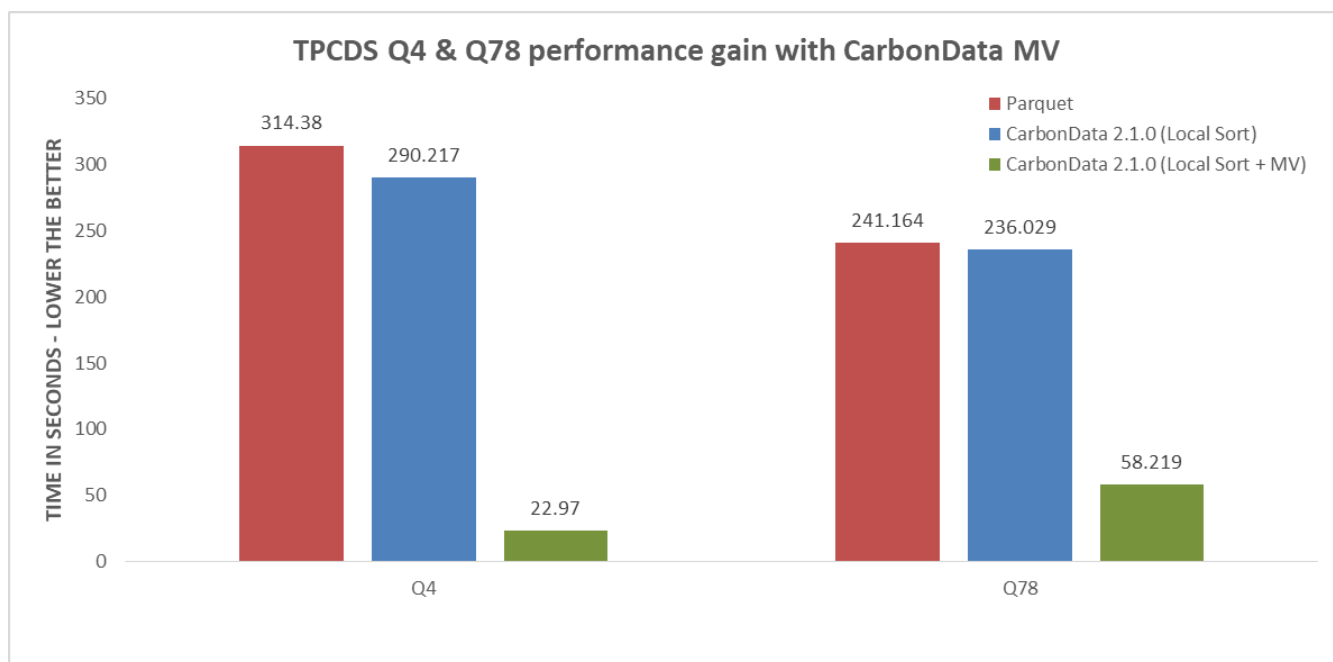
TPCDS Query Performance of CarbonData 2.1.0 (sort_scope='local_sort') compared to Parquet.



Summary:

CarbonData 2.1.0 query performance is 23% better compared to Parquet.

4. The below chart depicts the performance gain in CarbonData with MV enabled for Q4 and Q78 compared to parquet and CarbonData without MV



Summary:

CarbonData MV is configured for 2 queries and is having significant query performance improvement compared to parquet.

Note: If MV is configured for all the slow TPCDS Queries, Overall query performance can be improved by huge factor compared to parquet and carbondata without MV.

Query Performance Readings

| Database Name | Parquet | CarbonData 2.1.0 | CarbonData 2.1.0 Local Sort |
|----------------------------|--|---|-----------------------------|
| Options/Table properties | spark.sql.parquet.compression.codec=snappy | carbon.column.compressor = snappy carbon.local.dictionary.enable = true carbon.push.rowfilters.for.vector = false sort_scope=no_sort | sort_scope=local_sort |
| Load Performance | 1607 seconds | 1563 seconds | 3721 seconds |
| TPCDS Raw Data Size | 436.9 GB | 436.9 GB | 436.9 GB |
| Table Format Database Size | 155.7 GB | 127.0 GB | 127.1 GB |
| Query ID | Time in Seconds | Time in Seconds | Time in Seconds |
| tpcds_query1 | 40.562 | 32.092 | 26.771 |
| tpcds_query2 | 34.238 | 41.988 | 14.121 |
| tpcds_query3 | 5.192 | 37.031 | 4.83 |
| tpcds_query4 | 314.38 | 352.74 | 290.217 |
| tpcds_query5 | 103.429 | 100.32 | 49.525 |
| tpcds_query6 | 46.993 | 69.965 | 34.604 |
| tpcds_query7 | 24.369 | 23.176 | 16.506 |
| tpcds_query8 | 11.337 | 15.719 | 5.588 |
| tpcds_query9 | 37.34 | 12.637 | 8.006 |

| | | | |
|----------------|---------|---------|---------|
| tpcds_query10 | 24.672 | 24.703 | 11.499 |
| tpcds_query11 | 116.603 | 118.949 | 99.341 |
| tpcds_query12 | 118.641 | 114.723 | 97.239 |
| tpcds_query13 | 20.375 | 17.664 | 10.855 |
| tpcds_query14a | 197.17 | 163.259 | 126.462 |
| tpcds_query14b | 159.801 | 139.51 | 109.972 |
| tpcds_query15 | 12.501 | 7.914 | 5.435 |
| tpcds_query16 | 92.064 | 99.069 | 62.614 |
| tpcds_query17 | 59.784 | 51.008 | 46.512 |
| tpcds_query18 | 29.86 | 15.298 | 14.65 |
| tpcds_query19 | 17.396 | 8.892 | 6.644 |
| tpcds_query20 | 9.007 | 3.7 | 2.995 |
| tpcds_query21 | 2.871 | 2.02 | 1.964 |
| tpcds_query22 | 2.794 | 2.945 | 2.822 |
| tpcds_query23a | 243.926 | 234.644 | 164.389 |
| tpcds_query23b | 273.414 | 271.768 | 189.62 |
| tpcds_query24a | 70.013 | 40.886 | 40.128 |
| tpcds_query24b | 55.094 | 37.355 | 36.761 |
| tpcds_query25 | 59.192 | 50.832 | 61.476 |
| tpcds_query26 | 16.754 | 9.494 | 5.527 |
| tpcds_query27 | 15.372 | 9.249 | 5.684 |
| tpcds_query28 | 34.182 | 37.113 | 39.064 |
| tpcds_query29 | 52.625 | 43.978 | 43.588 |
| tpcds_query30 | 14.314 | 10.144 | 10.81 |
| tpcds_query31 | 28.355 | 24.724 | 14.932 |
| tpcds_query32 | 9.471 | 6.006 | 4.904 |
| tpcds_query33 | 17.155 | 9.173 | 6.248 |
| tpcds_query34 | 6.018 | 5.215 | 5.596 |
| tpcds_query35 | 15.659 | 12.685 | 10.872 |
| tpcds_query36 | 10.695 | 9.291 | 6.247 |
| tpcds_query37 | 10.646 | 6.547 | 8.124 |
| tpcds_query38 | 17.283 | 18.505 | 17.076 |
| tpcds_query39a | 3.167 | 3.199 | 3.939 |
| tpcds_query39b | 2.285 | 2.767 | 2.736 |
| tpcds_query40 | 57.777 | 51.107 | 43.196 |
| tpcds_query41 | 1.55 | 1.57 | 1.468 |
| tpcds_query42 | 6.239 | 4.517 | 2.283 |
| tpcds_query43 | 4.799 | 5.016 | 7.565 |
| tpcds_query44 | 8.876 | 8.736 | 8.936 |
| tpcds_query45 | 9.056 | 6.058 | 6.119 |
| tpcds_query46 | 9.144 | 9.84 | 7.193 |
| tpcds_query47 | 23.095 | 40.913 | 23.614 |
| tpcds_query48 | 10.464 | 12.246 | 9.296 |
| tpcds_query49 | 39.458 | 26.969 | 21.833 |
| tpcds_query50 | 82.944 | 77.545 | 77.937 |
| tpcds_query51 | 24.175 | 22.67 | 9.901 |
| tpcds_query52 | 5.357 | 4.57 | 2.332 |
| tpcds_query53 | 5.388 | 5.608 | 3.76 |
| tpcds_query54 | 19.503 | 11.839 | 10.946 |
| tpcds_query55 | 4.51 | 5.364 | 2.381 |
| tpcds_query56 | 17.153 | 9.822 | 6.401 |

| | | | |
|----------------|-----------------|-----------------|-----------------|
| tpcds_query57 | 11.017 | 14.874 | 14.304 |
| tpcds_query58 | 13.094 | 9.204 | 6.064 |
| tpcds_query59 | 12.823 | 13.12 | 14.265 |
| tpcds_query60 | 12.776 | 9.159 | 6.053 |
| tpcds_query61 | 11.8 | 13.088 | 9.171 |
| tpcds_query62 | 4.624 | 3.135 | 3.473 |
| tpcds_query63 | 5.237 | 5.491 | 3.77 |
| tpcds_query64 | 84.593 | 79.527 | 73.208 |
| tpcds_query64a | 77.532 | 76.384 | 70.388 |
| tpcds_query64b | 70.225 | 68.86 | 67.173 |
| tpcds_query65 | 23.934 | 23.73 | 14.096 |
| tpcds_query66 | 30.257 | 16.73 | 10.711 |
| tpcds_query67 | 113.828 | 109.023 | 74.055 |
| tpcds_query68 | 14.866 | 17.806 | 6.517 |
| tpcds_query69 | 13.944 | 11.8 | 9.089 |
| tpcds_query70 | 10.848 | 15.303 | 11.091 |
| tpcds_query71 | 12.218 | 10.676 | 5.889 |
| tpcds_query72 | 14.467 | 11.36 | 11.475 |
| tpcds_query73 | 5.4 | 7.337 | 4.351 |
| tpcds_query74 | 87.164 | 93.155 | 81.007 |
| tpcds_query75 | 64.272 | 59.362 | 49.792 |
| tpcds_query76 | 12.295 | 11.617 | 9.6 |
| tpcds_query77 | 22.03 | 19.978 | 9.981 |
| tpcds_query78 | 241.164 | 233.612 | 236.029 |
| tpcds_query79 | 8.647 | 22.757 | 5.932 |
| tpcds_query80 | 244.786 | 227.663 | 232.866 |
| tpcds_query81 | 11.211 | 10.713 | 10.942 |
| tpcds_query82 | 22.601 | 13.654 | 15.488 |
| tpcds_query83 | 9.022 | 7.081 | 4.53 |
| tpcds_query84 | 7.395 | 6.879 | 6.07 |
| tpcds_query85 | 23.564 | 19.44 | 18.031 |
| tpcds_query86 | 6.954 | 9.319 | 4.201 |
| tpcds_query87 | 20.748 | 21.572 | 19.081 |
| tpcds_query88 | 16.432 | 23.251 | 16.923 |
| tpcds_query89 | 6.23 | 10.597 | 4.557 |
| tpcds_query90 | 4.052 | 3.717 | 2.529 |
| tpcds_query91 | 4.688 | 4.828 | 3.605 |
| tpcds_query92 | 6.568 | 4.816 | 3.295 |
| tpcds_query93 | 125.918 | 120.008 | 125.35 |
| tpcds_query94 | 35.403 | 33.847 | 33.555 |
| tpcds_query95 | 73.797 | 72.489 | 74.654 |
| tpcds_query96 | 2.411 | 4.257 | 2.401 |
| tpcds_query97 | 30.621 | 28.402 | 28.728 |
| tpcds_query98 | 6.509 | 14.722 | 3.645 |
| tpcds_query99 | 12.876 | 5.239 | 11.562 |
| Total | 4417.328 | 4202.869 | 3401.551 |