Notebook:

• Link

Cluster:

• N2-highmem-4, 2 - 8 autoscaling. 16.4 LTS

Query Without Materialization:

Query:

```
WITH joined_files AS (
SELECT
  f.repo_name,
  f.ref,
  f.path,
  f.mode,
  f.id,
  f.symlink_target,
   c.size,
  c.content,
  c.binary,
  c.copies
 FROM
   files f
  INNER JOIN contents c
     ON f.id = c.id
)
SELECT
repo_name,
 path,
 size,
 RANK() OVER (PARTITION BY repo_name ORDER BY size DESC) AS size_rank,
 copies,
 binary
```

```
joined_files
ORDER BY
repo_name,
size_rank;
```

Explain Plan:

```
== Physical Plan ==
AdaptiveSparkPlan (26)
+- == Initial Plan ==
  ColumnarToRow (25)
  +- PhotonResultStage (24)
     +- PhotonSort (23)
         +- PhotonShuffleExchangeSource (22)
           +- PhotonShuffleMapStage (21)
               +- PhotonShuffleExchangeSink (20)
                  +- PhotonWindow (19)
                     +- PhotonSort (18)
                        +- PhotonShuffleExchangeSource (17)
                           +- PhotonShuffleMapStage (16)
                              +- PhotonShuffleExchangeSink (15)
                                 +- PhotonProject (14)
                                    +- PhotonShuffledHashJoin Inner (13)
                                       :- PhotonShuffleExchangeSource (6)
                                       : +- PhotonShuffleMapStage (5)
                                             +- PhotonShuffleExchangeSink
(4)
                                               +- PhotonFilter (3)
                                                   +- PhotonRowToColumnar
(2)
                                                      +- Scan
BigQueryV1RelationFromV2ScanWithNoMaterialization(org.apache.spark.sql.SQLC
ontext@934053c,StructType(StructField(repo_name,StringType,true),StructFiel
d(path,StringType,true),StructField(id,StringType,true)),BigQueryScanPushDo
wns(Some(StructType(StructField(repo_name,StringType,true),StructField(path
,StringType,true),StructField(id,StringType,true))),[Lorg.apache.spark.sql.
connector.expressions.filter.Predicate;@5e71c3dd,None,None,[Ljava.lang.Stri
ng;@7b8a780a,[Ljava.lang.String;@7b8a780a,[Ljava.lang.String;@7b8a780a,[Lor
g.apache.spark.sql.sources.Filter;@208d329b),DirectBigQueryRelation[fe-dev-
```

```
sandbox.dkushari ds.files]) dkushari bq test.dkushari ds.files (1)
                                       +- PhotonShuffleExchangeSource (12)
                                          +- PhotonShuffleMapStage (11)
                                             +- PhotonShuffleExchangeSink
(10)
                                                +- PhotonFilter (9)
                                                   +- PhotonRowToColumnar
(8)
                                                      +- Scan
BigQueryV1RelationFromV2ScanWithNoMaterialization(org.apache.spark.sql.SQLC
ontext@934053c,StructType(StructField(id,StringType,true),StructField(size,
LongType,true),StructField(binary,BooleanType,true),StructField(copies,Long
Type,true)),BigQueryScanPushDowns(Some(StructType(StructField(id,StringType
,true),StructField(size,LongType,true),StructField(binary,BooleanType,true)
,StructField(copies,LongType,true))),[Lorg.apache.spark.sql.connector.expre
ssions.filter.Predicate;@1b872ece,None,None,[Ljava.lang.String;@7b8a780a,[L
java.lang.String;@7b8a780a,[Ljava.lang.String;@7b8a780a,[Lorg.apache.spark.
sql.sources.Filter;@73415c2d),DirectBigQueryRelation[fe-dev-sandbox.dkushar
i_ds.contents]) dkushari_bq_test.dkushari_ds.contents (7)
(1) Scan
BigQueryV1RelationFromV2ScanWithNoMaterialization(org.apache.spark.sql.SQLC
ontext@934053c,StructType(StructField(repo name,StringType,true),StructFiel
d(path,StringType,true),StructField(id,StringType,true)),BigQueryScanPushDo
wns(Some(StructType(StructField(repo_name,StringType,true),StructField(path
,StringType,true),StructField(id,StringType,true))),[Lorg.apache.spark.sql.
connector.expressions.filter.Predicate;@5e71c3dd,None,None,[Ljava.lang.Stri
ng;@7b8a780a,[Ljava.lang.String;@7b8a780a,[Ljava.lang.String;@7b8a780a,[Lor
g.apache.spark.sql.sources.Filter;@208d329b),DirectBigQueryRelation[fe-dev-
sandbox.dkushari_ds.files]) dkushari_bq_test.dkushari_ds.files
Output [3]: [repo_name#217, path#219, id#221]
Arguments: [repo name#217, path#219, id#221],
[StructField(repo_name,StringType,true), StructField(path,StringType,true),
StructField(id,StringType,true)],
PushedDownOperators(None,None,None,List(),List()),
PreScala213BigQueryRDD[54] at RDD at PreScala213BigQueryRDD.java:40,
BigQueryV1RelationFromV2ScanWithNoMaterialization(org.apache.spark.sql.SQLC
ontext@934053c,StructType(StructField(repo_name,StringType,true),StructFiel
d(path,StringType,true),StructField(id,StringType,true)),BigQueryScanPushDo
wns(Some(StructType(StructField(repo_name,StringType,true),StructField(path
,StringType,true),StructField(id,StringType,true))),[Lorg.apache.spark.sql.
connector.expressions.filter.Predicate;@5e71c3dd,None,None,[Ljava.lang.Stri
```

```
ng;@7b8a780a,[Ljava.lang.String;@7b8a780a,[Ljava.lang.String;@7b8a780a,[Lor
g.apache.spark.sql.sources.Filter;@208d329b),DirectBigQueryRelation[fe-dev-
sandbox.dkushari_ds.files]), `dkushari_bq_test`.`dkushari_ds`.`files`,
Statistics(sizeInBytes=8.0 EiB, ColumnStat: N/A)
(2) PhotonRowToColumnar
Input [3]: [repo_name#217, path#219, id#221]
(3) PhotonFilter
Input [3]: [repo_name#217, path#219, id#221]
Arguments: isnotnull(id#221)
(4) PhotonShuffleExchangeSink
Input [3]: [repo name#217, path#219, id#221]
Arguments: hashpartitioning(id#221, 200)
(5) PhotonShuffleMapStage
Input [3]: [repo_name#217, path#219, id#221]
Arguments: ENSURE_REQUIREMENTS, [id=#629]
(6) PhotonShuffleExchangeSource
Input [3]: [repo_name#217, path#219, id#221]
(7) Scan
BigQueryV1RelationFromV2ScanWithNoMaterialization(org.apache.spark.sql.SQLC
ontext@934053c,StructType(StructField(id,StringType,true),StructField(size,
LongType, true), StructField(binary, BooleanType, true), StructField(copies, Long
Type,true)),BigQueryScanPushDowns(Some(StructType(StructField(id,StringType)))
,true),StructField(size,LongType,true),StructField(binary,BooleanType,true)
,StructField(copies,LongType,true))),[Lorg.apache.spark.sql.connector.expre
ssions.filter.Predicate;@1b872ece,None,None,[Ljava.lang.String;@7b8a780a,[L
java.lang.String;@7b8a780a,[Ljava.lang.String;@7b8a780a,[Lorg.apache.spark.
sql.sources.Filter;@73415c2d),DirectBigQueryRelation[fe-dev-sandbox.dkushar
i_ds.contents]) dkushari_bq_test.dkushari_ds.contents
Output [4]: [id#228, size#229L, binary#231, copies#232L]
Arguments: [id#228, size#229L, binary#231, copies#232L],
[StructField(id,StringType,true), StructField(size,LongType,true),
StructField(binary,BooleanType,true), StructField(copies,LongType,true)],
PushedDownOperators(None, None, None, None, List(), List()),
PreScala213BigQueryRDD[55] at RDD at PreScala213BigQueryRDD.java:40,
BigQueryV1RelationFromV2ScanWithNoMaterialization(org.apache.spark.sql.SQLC
ontext@934053c,StructType(StructField(id,StringType,true),StructField(size,
LongType,true),StructField(binary,BooleanType,true),StructField(copies,Long
```

```
Type,true)),BigQueryScanPushDowns(Some(StructType(StructField(id,StringType))
,true),StructField(size,LongType,true),StructField(binary,BooleanType,true)
,StructField(copies,LongType,true))),[Lorg.apache.spark.sql.connector.expre
ssions.filter.Predicate;@1b872ece,None,None,[Ljava.lang.String;@7b8a780a,[L
java.lang.String;@7b8a780a,[Ljava.lang.String;@7b8a780a,[Lorg.apache.spark.
sql.sources.Filter;@73415c2d),DirectBigQueryRelation[fe-dev-sandbox.dkushar
i ds.contents]), `dkushari bg test`.`dkushari ds`.`contents`,
Statistics(sizeInBytes=8.0 EiB, ColumnStat: N/A)
(8) PhotonRowToColumnar
Input [4]: [id#228, size#229L, binary#231, copies#232L]
(9) PhotonFilter
Input [4]: [id#228, size#229L, binary#231, copies#232L]
Arguments: isnotnull(id#228)
(10) PhotonShuffleExchangeSink
Input [4]: [id#228, size#229L, binary#231, copies#232L]
Arguments: hashpartitioning(id#228, 200)
(11) PhotonShuffleMapStage
Input [4]: [id#228, size#229L, binary#231, copies#232L]
Arguments: ENSURE_REQUIREMENTS, [id=#636]
(12) PhotonShuffleExchangeSource
Input [4]: [id#228, size#229L, binary#231, copies#232L]
(13) PhotonShuffledHashJoin
Left keys [1]: [id#221]
Right keys [1]: [id#228]
Join type: Inner
Join condition: None
(14) PhotonProject
Input [7]: [repo_name#217, path#219, id#221, id#228, size#229L, binary#231,
copies#232L]
Arguments: [repo name#217, path#219, size#229L, copies#232L, binary#231]
(15) PhotonShuffleExchangeSink
Input [5]: [repo name#217, path#219, size#229L, copies#232L, binary#231]
Arguments: hashpartitioning(repo_name#217, 200)
(16) PhotonShuffleMapStage
```

```
Input [5]: [repo name#217, path#219, size#229L, copies#232L, binary#231]
Arguments: ENSURE_REQUIREMENTS, [id=#644]
(17) PhotonShuffleExchangeSource
Input [5]: [repo_name#217, path#219, size#229L, copies#232L, binary#231]
(18) PhotonSort
Input [5]: [repo name#217, path#219, size#229L, copies#232L, binary#231]
Arguments: [repo_name#217 ASC NULLS FIRST, size#229L DESC NULLS LAST]
(19) PhotonWindow
Input [5]: [repo_name#217, path#219, size#229L, copies#232L, binary#231]
Arguments: [repo_name#217, path#219, size#229L, rank(size#229L)
windowspecdefinition(repo name#217, size#229L DESC NULLS LAST,
specifiedwindowframe(RowFrame, unboundedpreceding$(), currentrow$())) AS
size rank#193, copies#232L, binary#231]
(20) PhotonShuffleExchangeSink
Input [6]: [repo_name#217, path#219, size#229L, size_rank#193, copies#232L,
binary#231]
Arguments: rangepartitioning(repo name#217 ASC NULLS FIRST, size rank#193
ASC NULLS FIRST, 200)
(21) PhotonShuffleMapStage
Input [6]: [repo_name#217, path#219, size#229L, size_rank#193, copies#232L,
binary#231]
Arguments: ENSURE_REQUIREMENTS, [id=#652]
(22) PhotonShuffleExchangeSource
Input [6]: [repo_name#217, path#219, size#229L, size_rank#193, copies#232L,
binary#231]
(23) PhotonSort
Input [6]: [repo name#217, path#219, size#229L, size_rank#193, copies#232L,
binary#231]
Arguments: [repo_name#217 ASC NULLS FIRST, size_rank#193 ASC NULLS FIRST]
(24) PhotonResultStage
Input [6]: [repo_name#217, path#219, size#229L, size_rank#193, copies#232L,
binary#231]
(25) ColumnarToRow
Input [6]: [repo_name#217, path#219, size#229L, size_rank#193, copies#232L,
```

```
binary#231]

(26) AdaptiveSparkPlan
Output [6]: [repo_name#217, path#219, size#229L, size_rank#193,
copies#232L, binary#231]
Arguments: isFinalPlan=false

== Photon Explanation ==
The query is fully supported by Photon.
```

Observation:

- Took around 11 minutes to run
- Pushdown to BQ did not happen

Query With Materialization:

Query:

```
WITH joined_files AS (
SELECT
  f.repo_name,
  f.ref,
  f.path,
  f.mode,
  f.id,
  f.symlink_target,
   c.size,
  c.content,
   c.binary,
   c.copies
 FROM
   files WITH ('materializationEnabled' 'true') AS f
  INNER JOIN contents WITH ('materializationEnabled' 'true') AS c
     ON f.id = c.id
SELECT
```

```
repo_name,
path,
size,
RANK() OVER (PARTITION BY repo_name ORDER BY size DESC) AS size_rank,
copies,
binary
FROM
joined_files
ORDER BY
repo_name,
size_rank;
```

Explain Plan:

```
== Physical Plan ==
AdaptiveSparkPlan (7)
+- == Initial Plan ==
  Sort (6)
   +- Exchange (5)
      +- RunningWindowFunction (4)
         +- Sort (3)
            +- Exchange (2)
               +- EdgeBigQueryPushdownPlan (1)
(1) EdgeBigQueryPushdownPlan
Arguments: [SUBQUERY_46_COL_0#273, SUBQUERY_46_COL_1#275,
SUBQUERY 46 COL 2#285L, SUBQUERY 46 COL 3#288L, SUBQUERY 46 COL 4#287],
PreScala213BigQueryRDD[7] at RDD at PreScala213BigQueryRDD.java:40
External engine query: SELECT ( SUBQUERY_45.SUBQUERY 45 COL 0 ) AS
SUBQUERY 46 COL 0 , ( SUBQUERY 45.SUBQUERY 45 COL 1 ) AS SUBQUERY 46 COL 1
, ( SUBQUERY_45.SUBQUERY_45_COL_4 ) AS SUBQUERY_46_COL_2 , (
SUBQUERY 45.SUBQUERY 45 COL 6 ) AS SUBQUERY 46 COL 3 , (
SUBQUERY_45.SUBQUERY_45_COL_5 ) AS SUBQUERY_46_COL_4 FROM ( SELECT (
SUBQUERY 42.REPO NAME ) AS SUBQUERY 45 COL 0 , ( SUBQUERY 42.PATH ) AS
SUBQUERY_45_COL_1 , ( SUBQUERY_42.ID ) AS SUBQUERY_45_COL_2 , (
SUBQUERY_44.ID ) AS SUBQUERY_45_COL_3 , ( SUBQUERY_44.SIZE ) AS
SUBQUERY 45 COL 4 , ( SUBQUERY 44.BINARY ) AS SUBQUERY 45 COL 5 , (
SUBQUERY_44.COPIES ) AS SUBQUERY_45_COL_6 FROM ( SELECT * FROM ( SELECT *
```

```
FROM (SELECT `repo name`, `path`, `id` FROM
`fe-dev-sandbox`.`dkushari_ds`.`files` WHERE (`id` IS NOT NULL) ) AS
BQ_CONNECTOR_QUERY_ALIAS ) AS SUBQUERY_41 WHERE ( SUBQUERY 41.ID IS NOT
NULL ) ) AS SUBQUERY 42 INNER JOIN ( SELECT * FROM ( SELECT * FROM (SELECT
`id`, `size`, `binary`, `copies` FROM
`fe-dev-sandbox`.`dkushari_ds`.`contents` WHERE (`id` IS NOT NULL) ) AS
BO CONNECTOR QUERY ALIAS ) AS SUBQUERY 43 WHERE ( SUBQUERY 43.ID IS NOT
NULL ) ) AS SUBQUERY 44 ON ( SUBQUERY 42.ID = SUBQUERY 44.ID ) ) AS
SUBQUERY 45
(2) Exchange
Input [5]: [SUBQUERY_46_COL_0#273, SUBQUERY_46_COL_1#275,
SUBQUERY 46 COL 2#285L, SUBQUERY 46 COL 3#288L, SUBQUERY 46 COL 4#287]
Arguments: hashpartitioning(repo_name#273, 200), ENSURE_REQUIREMENTS,
[plan_id=113]
(3) Sort
Input [5]: [SUBQUERY_46_COL_0#273, SUBQUERY_46_COL_1#275,
SUBQUERY 46 COL 2#285L, SUBQUERY 46 COL 3#288L, SUBQUERY 46 COL 4#287]
Arguments: [repo_name#273 ASC NULLS FIRST, size#285L DESC NULLS LAST],
false, 0
(4) RunningWindowFunction
Input [5]: [SUBQUERY 46 COL 0#273, SUBQUERY 46 COL 1#275,
SUBQUERY 46 COL 2#285L, SUBQUERY 46 COL 3#288L, SUBQUERY 46 COL 4#287]
Arguments: [repo_name#273, path#275, size#285L, rank(size#285L)
windowspecdefinition(repo name#273, size#285L DESC NULLS LAST,
specifiedwindowframe(RowFrame, unboundedpreceding$(), currentrow$())) AS
size rank#249, copies#288L, binary#287], [repo name#273], [size#285L DESC
NULLS LAST], false
(5) Exchange
Input [6]: [repo name#273, path#275, size#285L, size rank#249, copies#288L,
binary#287]
Arguments: rangepartitioning(repo_name#273 ASC NULLS FIRST, size_rank#249
ASC NULLS FIRST, 200), ENSURE_REQUIREMENTS, [plan_id=117]
(6) Sort
Input [6]: [repo_name#273, path#275, size#285L, size_rank#249, copies#288L,
binary#2871
Arguments: [repo_name#273 ASC NULLS FIRST, size_rank#249 ASC NULLS FIRST],
true, 0
```

Observation:

- Took around 23 minutes to run
- Pushdown to BQ did happen

Appendix:

Things to try -

- SLA breach is the workflow finishing within SLA?
- Try with materialization
- Check with different cluster configurations
 - Cluster DBR version (16.4 LTS+)
 - o Cluser sizing