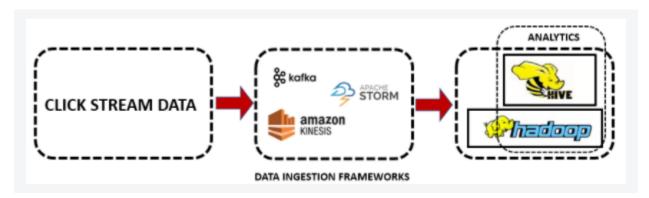
Public Clickstream Data Analysis

Manaswi Kamila

Problem Statement

With online sales gaining popularity, tech companies are exploring ways to improve their sales by analyzing customer behavior and gaining insights about product trends. Furthermore, the websites make it easier for customers to find the products they require without much scavenging.

The objective of this case study is to extract data and gather insights from a reallife public clickstream dataset of a cosmetics store for the months of October and November 2019 which generally data engineers come up within an e-retail company by executing queries using Hive Query Language (HQL).



Clickstream data

Data which is collected by tracking our clicks on websites and searching for patterns within them. E-commerce companies make use of the data to give product recommendations.

Datasets provided

- 2019-Oct.csv- https://e-commerce-events-ml.s3.amazonaws.com/2019-0ct.csv
- 2019-Nov.csv https://e-commerce-events-ml.s3.amazonaws.com/2019-Nov.csv
- Attribute description Excel file which contains attribute details

Implementation

Task 1: Importing the data from S3 to HDFS

Launched an EMR 5.29.0 cluster that utilizes the Hive services.

Created a HDFS directory "cosmetics_store" and imported data from public S3 bucket to HDFS directory using distcp command.

hadoop fs -mkdir /cosmetics_store hadoop distcp s3n://e-commerce-events-ml/* /cosmetics_store hadoop fs -ls /cosmetics_store

```
Authenticating with public key "imported-openssh-key"
                    Amazon Linux AMI
https://aws.amazon.com/amazon-linux-ami/2018.03-release-notes/
88 package(s) needed for security, out of 107 available
un "sudo yum update" to apply all updates.
EEEEEEEEEEEEEEEEE MMMMMMM
                                      M:::::: M R:::::::::R
                                 M::::::M R::::::R
M:::::::M R:::::RRRRRR:::::R
EE:::::EEEEEEEEE:::E M:::::::M
            EEEEE M:::::::M
                                   M:::::::: M RR::::R
                                                            R::::R
                   R::::R
 E::::EEEEEEEEEE M::::M M:::M M:::M M:::RRRRRR:::R

E:::::EEEEEEEEEE M::::M M:::M M:::M R:::RRRRRR:::R

E::::EEEEEEEEEE M::::M M::::M M::::M R:::RRRRRR:::R

E:::E M::::M M:::M M::::M R:::R R:::F
          EEEEE M:::::M
                                                             R::::R
E:::::EEEEEEEE::::E M:::::M
                                                 R:::R
                                                            R::::R
M:::::M RR::::R
EEEEEEEEEEEEEEEEEE MMMMMM
                                       MMMMMMM RRRRRRR
                                                             RRRRRR
[hadoop@ip-172-31-18-44 ~]$ hadoop fs -mkdir /cosmetics_store
hadoop@ip-172-31-18-44 ~]$
```

```
Bandwidth in Btyes=31719532
Bytes Copied=1028381690
Bytes Expected=1028381690
Files Copied=2
[hadoop@ip-10-21-80-62 ~]$ hadoop fs -ls /cosmetics_store
Found 2 items
-rw-r--r-- 2 hadoop hadoop 545839412 2021-09-06 16:00 /cosmetics_store/2019-Nov.csv
-rw-r--r-- 2 hadoop hadoop 482542278 2021-09-06 16:00 /cosmetics_store/2019-Oct.csv
[hadoop@ip-10-21-80-62 ~]$
```

Task 2: Creating database and Hive tables

Logged in to Hive CLI and created database "cosmetics_clickstream_data"

```
[hadoop@ip-172-31-18-44 ~]$ hive

Logging initialized using configuration in file:/etc/hive/conf.dist/hive-log4j2.properties Async: false nive> create schema cosmetics_clickstream_data;

OK

Time taken: 0.901 seconds nive> show databases;

OK

Cosmetics_clickstream_data
default

Time taken: 0.163 seconds, Fetched: 2 row(s)
nive>
```

```
inve>
> use cosmetics_clickstream_data;

OK
Filme taken: 0.021 seconds
nive> show tables;

OK
Filme taken: 0.03 seconds
nive> describe database cosmetics_clickstream_data;

OK
Filme taken: 0.03 seconds
nive> describe database cosmetics_clickstream_data;

OK
Filme taken: 0.025 seconds, Fetched: 1 row(s)
```

Created a table "OctNov2019_data" using CSV Serde and loaded data from the CSV files on HDFS into the tables.

```
hive> create external table OctNov2019 data(
   > event time timestamp,
   > event type string,
   > product_id string,
   > category_id string,
   > category_code string,
   > brand string,
   > price float,
   > user id bigint,
   > user session string)
   > ROW FORMAT
   > SERDE 'org.apache.hadoop.hive.serde2.OpenCSVSerde'
   > WITH SERDEPROPERTIES
   > ("separatorChar" = ",","quoteChar" = "\"")
    > TBLPROPERTIES ("skip.header.line.count"="1");
Time taken: 0.921 seconds
hive>
    > LOAD DATA INPATH '/cosmetics_store' INTO table OctNov2019_data;
Loading data to table cosmetics clickstream data.octnov2019 data
Time taken: 7.506 seconds
```

```
event time
                                                  from deserializer
                        string
event_type
                         string
                                                   from deserializer
product id
                        string
                                                   from deserializer
ategory id
                                                   from deserializer
ategory_code
                        string
                         string
                                                   from deserializer
                                                   from deserializer
rice
                         string
ıser id
                        string
                                                  from deserializer
ser session
                         string
                                                  from deserializer
ime taken: 0.453 seconds, Fetched: 9 row(s)
```

Created tables "cosmetic_OctNov2019_data", "part_cosmetic_OctNov2019_data", "bucket_part_cosmetic_OctNov2019_data"

- Derived a new column, "month", by extracting month from event time column.
- Handled timestamp data by using SUBSTR function (to_date function caused loss of data time of transaction was lost)

To create dynamic partitioned and bucketed tables, set the below properties in hive CLI. set hive.exec.dynamic.partition=true; set hive.exec.dynamic.partition.mode=nonstrict; set hive.enforce.bucketing=true;

```
nive>
   > set hive.exec.dynamic.partition=true;
nive> set hive.exec.dynamic.partition.mode=nonstrict;
hive> set hive.enforce.bucketing=true;
nive>
   > create table part cosmetic OctNov2019 data(
   > event time timestamp,
   > product id string,
   > category id string,
   > category code string,
   > brand string,
   > price float,
   > user id bigint,
   > user_session string,
> month int)
   > PARTITIONED BY (event type string)
   > ROW FORMAT DELIMITED
   > FIELDS TERMINATED BY ',';
OK
Time taken: 4.593 seconds
nive>
   > create external table bucket part cosmetic OctNov2019 data(
   > event time timestamp,
   > product id string,
   > category id string,
   > category_code string,
   > brand string,
   > price float,
   > user id bigint,
   > user session string)
   > PARTITIONED BY (month int, event_type string )
   > CLUSTERED BY (brand) INTO 20 BUCKETS
   > ROW FORMAT DELIMITED
   > FIELDS TERMINATED BY ',';
Time taken: 1.008 seconds
nive>
```

Inserted records from OctNov2019_data and cosmetic_OctNov2019_data tables.

Checked the table data and the data format.

Checked the count of rows in each table.

Datatype of columns

```
> describe bucket_part_cosmetic_0ctNov2019_data;
vent time
                         timestamp
roduct_id
                         string
ategor<mark>y</mark>_id
                         string
ategory_code
                         string
rand
                         string
                         float
rice
ser id
                         bigint
ser_session
onth
                         string
                         int
vent_type
                         string
 Partition Information
col_name
                         data_type
                                                   comment
onth
                         int
                         string
vent_type
ime taken: 1.703 seconds, Fetched: 15 row(s
```

Checked the partitions in the tables created and the HDFS location of the database and the tables.

Partitions and sub-partitions

"part_cosmetic_OctNov2019_data" – There are 4 partitions with respect to event_type "bucket_part_cosmetic_OctNov2019_data" – There are 8 partitions with respect to event_type and month columns.

```
inve> snow partitions part_cosmetic_uctNov2019_data;

incomplete type=view
event_type=cart
event_type=purchase
event_type=remove_from_cart
ime taken: 1.899 seconds, Fetched: 4 row(s)
nive> show partitions bucket_part_cosmetic_0ctNov2019_data;

incomplete type=remove_from_cart
nonth=11/event_type=remove_from_cart
nonth=11/event_type=view
nonth=10/event_type=purchase
nonth=10/event_type=purchase
nonth=10/event_type=purchase
nonth=10/event_type=cart
nonth=11/event_type=cart
ime taken: 1.612 seconds, Fetched: 8 row(s)
nive>
```

HDFS location of partitioned table

There are 4 directories, one for each partition and each partition has a single file.

HDFS location of bucketed table

There are 2 directories, one for each month. Inside each directory, there are 4 directories for each event_type. The directory has 20 files within since the rows are bucketed into 20 files.

Task 3: Query Optimization

Used optimization techniques such as partitioning and bucketing and compared the query execution time on the three tables created.

Query: Check the total revenue generated due to purchases made in October

Set the below properties to execute the queries in "tez" mode and to display column headers in the queries being executed.

Non-bucketed table

Partitioned table

```
> select ROUND(sum(price),2) as TotalRevenue, month as purchaseMonth
  > from part cosmetic OctNov2019 data
  > where month=10 and event_type="purchase"
  > group by month;
Query ID = hadoop_20210905095408_b7a70144-94e9-46e6-880c-ac6ee58886ad
Total jobs = 1
aunching Job 1 out of 1
status: Kunning (Executing on YARN cluster with App id application_1630501538063_0096)
     VERTICES MODE STATUS TOTAL COMPLETED RUNNING PENDING FAILED KILLED
   Map 1 ...... container SUCCEEDED 4 4 0 0 0 0 Reducer 2 ..... container SUCCEEDED 2 2 0 0 0 0
purchasemonth
totalrevenue
1211538.43
Fime taken: 9.818 seconds, Fetched: 1 row(s)
```

Bucketed+ partitioned table

As seen from the above screenshots, the query executed faster for bucketed+ partitioned table followed by partitioned table and non-bucketed table.

Hence, the queries are executed on bucket_part_cosmetic_OctNov2019_data and the other tables created to check and compare the query optimization are deleted.

Task 4: Analysis using hive queries

Query: Find the total revenue generated due to purchases made in October.

Total revenue generated due to purchases made in October is 1211538.43

Query: Write a query to yield the total sum of purchases per month in a single output.

```
select ROUND(sum(price),2) as TotalRevenue, month as purchaseMonth
  > from bucket_part_cosmetic_OctNov2019 data
  > where event_type="purchase"
  > group by month;
uery ID = hadoop_20210905102722_d6fe036c-6ec2-498e-bec0-e2fe0df4cda5
otal jobs = 1
aunching Job 1 out of 1
tatus: Running (Executing on YARN cluster with App id application_1630501538063_0100)
     VERTICES MODE STATUS TOTAL COMPLETED RUNNING PENDING FAILED KILLED
   Θ
                                                                    Θ
                          ======>>] 100% ELAPSED TIME: 2.86 s
ERTICES: 02/02 [======
otalrevenue
           purchasemonth
211538.43 10
531016.9 11
531016.9
ime taken: 5.058 seconds, Fetched: 2 row(s)
```

Total revenue generated due to purchases made in October is 1211538.43 and that in November is 1531016.9.

Query: Write a query to find the change in revenue generated due to purchases from October to November.

```
WITH octrevenue
     AS (SELECT Round (Sum (price), 2) AS OctRevenue,
                                    AS purchaseMonth
         FROM bucket part cosmetic octnov2019 data
        WHERE month = 10
               AND event type = "purchase"
        GROUP BY month),
     novrevenue
     AS (SELECT Round (Sum (price), 2) AS NovRevenue,
                                    AS purchaseMonth
        FROM bucket part cosmetic octnov2019 data
        WHERE month = 11
               AND event type = "purchase"
         GROUP BY month)
SELECT novrevenue - octrevenue AS ChangeInRevenue
FROM octrevenue, novrevenue;
```

```
select ROUND(sum(price),2) as OctRevenue, month as purchaseMonth
from bucket_part_cosmetic_OctNov2019_data
    > where month =10 and event_type="purchase"
    > group by month
       NovRevenue as
    > select ROUND(sum(price),2) as NovRevenue, month as purchaseMonth
> from bucket_part_cosmetic_0ctNov2019_data
    > where month =11 and event_type="purchase"
      group by month
    > select NovRevenue-OctRevenue as ChangeInRevenue
> from OctRevenue, NovRevenue;
arning: Map Join MAPJOIN[23][bigTable=?] in task 'Reducer 4' is a cross product
uery ID = hadoop_20210906115307_ff0efb83-f7b9-4822-9f7b-e90c1761175b
otaĺ jobs = 1
aunching Job 1 out of 1
tatus: Running (Executing on YARN cluster with App id application 1630501538063 0188)
                        MODE STATUS TOTAL COMPLETED RUNNING PENDING FAILED KILLED

      ap 3 ............ container
      SUCCEEDED
      3
      3
      0
      0
      0

      ap 1 ........ container
      SUCCEEDED
      3
      3
      0
      0
      0

      educer 2 ...... container
      SUCCEEDED
      2
      2
      0
      0
      0

      educer 4 ..... container
      SUCCEEDED
      2
      2
      0
      0
      0

                                                                                                                        0
                                                                                                            0
                                                                                                                        0
                                                                                                                        0
                                                                                                                        0
ERTICES: 04/04 [=======
                                              ======>>] 100% ELAPSED TIME: 2.36 s
19478.47
ime taken: 5.351 seconds, Fetched: 1 row(s)
```

The change in revenue generated due to purchases from October to November is 319478.47.

Query: Find distinct categories of products. Categories with null category code can be ignored.

```
> select DISTINCT(category_code)
> from bucket_part_cosmetic_0ctNov2019_data
   > where category_code IS NOT NULL AND category_code!= "";
Query ID = hadoop_20210905105724_b7aeff7a-2e8c-48be-92fb-92459dffdb1c
Fotal jobs = 1
aunching Job 1 out of 1
status: Running (Executing on YARN cluster with App id application_1630501538063_0101)
       VERTICES MODE STATUS TOTAL COMPLETED RUNNING PENDING FAILED KILLED
Map 1 ...... container SUCCEEDED 66 66 0 0 0 0 Reducer 2 ..... container SUCCEEDED 1 1 0 0 0
 category_code
accessories.bag
accessories.cosmetic_bag
apparel.glove
appliances.environment.air conditioner
appliances.environment.vacuum
appliances.personal.hair_cutter
furniture.bathroom.bath
furniture.living room.cabinet
furniture.living room.chair
sport.diving
stationery.cartrige
Time taken: 10.35 seconds, Fetched: 11 row(s)
```

There are 11 distinct categories of products.

Query: Find the total number of products available under each category.

```
> select count(*),category_code
> from bucket_part_cosmetic_0ctNov2019_data
   > group by category_code;
Query ID = hadoop_20210905111947_ffe5618f-7aa3-4b5d-913c-b3f28486b722
Total jobs = 1
Launching Job 1 out of 1
Status: Running (Executing on YARN cluster with App id application_1630501538063_0102)
      VERTICES MODE STATUS TOTAL COMPLETED RUNNING PENDING FAILED KILLED
Map 1 ...... container SUCCEEDED 66 66 0 0 0 0 Reducer 2 ..... container SUCCEEDED 1 1 0 0 0
 ......
c<sub>0</sub>
      category_code
3594895
11681 accessories.bag
1248 accessories.cosm
      accessories.cosmetic_bag
18232 apparel.glove
     appliances.environment.air conditioner
332
59761 appliances.environment.vacuum
1643
      appliances.personal.hair_cutter
      furniture.bathroom.bath
13439 furniture.living_room.cabinet
      furniture.living_room.chair
308
      sport.diving
26722 stationery.cartrige
Time taken: 9.562 seconds, Fetched: 12 row(s)
```

There are 8594895 entries with blank category code in the data.

Query: Which brand had the maximum sales in October and November combined?

```
WITH maxsalesoct
AS
  (
          SELECT brand,
                   sum(price) AS total sales
          FROM bucket_part_cosmetic_octnov2019_data
                  month=10
          WHERE
                   event type="purchase"
          AND
          GROUP BY brand
          ORDER BY (total sales) DESC
          LIMIT 10),
 maxsalesnov
AS
  (
          SELECT brand,
```

```
sum(price) AS total sales
          FROM
                   bucket part cosmetic octnov2019 data
          WHERE
                   month=11
          AND
                   event type="purchase"
          GROUP BY brand
          ORDER BY (total sales) DESC
          LIMIT
                   10)
                 maxsalesnov.brand
SELECT
FROM
                 maxsalesoct
LEFT OUTER JOIN maxsalesnov
                 maxsalesoct.brand =maxsalesnov.brand
ON
                 maxsalesnov.brand!= ""
WHERE
ORDER BY
                 maxsalesnov.total sales+maxsalesoct.total sales
DESC
LIMIT
                 1;
```

```
select brand, sum(price) as total_sales
from bucket_part_cosmetic_0ctNov2019_data
      where month=10
      and event_type="purchase"
      group by brand
order by (total_sales) DESC
limit 10),
      maxSalesNov as
      select brand, sum(price) as total_sales
from bucket_part_cosmetic_OctNov2019_data
where month=11
      and event_type="purchase"
group by brand
order by (total_sales) DESC
limit 10)
      select maxSalesNov.brand
from maxSalesOct left outer join maxSalesNov
on maxSalesOct.brand =maxSalesNov.brand
      where maxSalesNov.brand!= ""
      order by maxSalesNov.total_sales+maxSalesOct.total_sales DESC
      limit 1;
uery ID = hadoop_20210905115003_c200b8dc-75b8-4b6f-ae80-70da4980a004
otal jobs = 1
ounching Job 1 out of 1
tatus: Running (Executing on YARN cluster with App id application_1630501538063_0105)
        VERTICES MODE STATUS TOTAL COMPLETED RUNNING PENDING FAILED KILLED
                                    SUCCEEDED
ap 4 ..... container
educer 5 ..... container
                                        SUCCEEDED
                                                                                                                 0
                                                                                                                            0000
ap 1 ...... container educer 2 .... container educer 3 .... container
                                     SUCCEEDED
                                                                                                     Θ
                                                                                         Θ
                                        SUCCEEDED
                                        SUCCEEDED
educer 6 ..... container
educer 7 ..... container
                                        SUCCEEDED
                                                           =>>] 100% ELAPSED TIME: 3.21 s
 RTICES: 07/07 [===
axsalesnov.brand
```

Runail had the maximum sales in October and November combined

Query: Which brands increased their sales from October to November?

```
WITH maxsalesoct
    AS (SELECT brand,
               Sum(price) AS total sales
        FROM bucket part cosmetic octnov2019 data
        WHERE month = 10
               AND event type = "purchase"
        GROUP BY brand),
    maxsalesnov
    AS (SELECT brand,
               Sum(price) AS total sales
        FROM bucket part cosmetic octnov2019 data
        WHERE month = 11
               AND event type = "purchase"
        GROUP BY brand)
SELECT maxsalesnov brand
FROM maxsalesoct
      JOIN maxsalesnov
        ON maxsalesoct.brand = maxsalesnov.brand
WHERE maxsalesnov.total sales - maxsalesoct.total sales > 0
      AND maxsalesnov.brand != "";
```

There are 152 brands which have increased their sales from October to November. First few and last few brands of the list are displayed in the screenshot



```
ıno
ıskusi
veraclara
vilenta
voko
zeitun
Fime taken: 6.544 seconds, Fetched: 152 row(s)
nive>
   > With maxSalesOct as
   > select brand, sum(price) as total sales
   > from bucket_part_cosmetic_OctNov2019_data
   > where month=10
   > and event_type="purchase"
   > group by brand),
   > maxSalesNov as
   > select brand, sum(price) as total_sales
   > from bucket_part_cosmetic_OctNov2019_data
   > where month=11
   > and event_type="purchase"
> group by brand)
   > select maxSalesNov.brand
   > from maxSalesOct join maxSalesNov
   > on maxSalesOct.brand = maxSalesNov.brand
> where maxSalesNov.total_sales-maxSalesOct.total_sales >0
> and maxSalesNov.brand!="";
Query ID = hadoop_20210905115252_f6a154a1-3ed6-40b6-a03a-c07a5de58760
Total jobs = 1
aunching Job 1 out of 1
Status: Running (Executing on YARN cluster with App id application_1630501538063_0105)
      VERTICES MODE STATUS TOTAL COMPLETED RUNNING PENDING FAILED KILLED
 Θ
                                                                                    Θ
                                                                                    Θ
/ERTICES: 04/04 [===
                                 ======>>] 100% ELAPSED TIME: 4.20 s
naxsalesnov.brand
patiste
peautyblender
podyton
opw.style
coifin
concept
ristalinas
deoproce
domix
ecolab
elizavecca
```

Query: Your company wants to reward the top 10 users of its website with a Golden Customer plan. Write a query to generate a list of top 10 users who spend the most.

```
WITH user summary
AS
   (
                 SELECT user id,
                              sum(price)
                        AS total,
                              rank() over (partition BY user id ORDER BY su
m(price) DESC ) AS user rank
                 FROM
                              bucket part cosmetic octnov2019 data
                               event type='purchase'
                 GROUP BY user id )
             user id
   SELECT
               user summary
   FROM
   ORDER BY total DESC
                 10:
   LIMIT
     > With user_summary as
     > select user_id , sum(price) as total, rank() over (partition by user_id order by sum(price) DESC ) as user_rank
> from bucket_part_cosmetic_OctNov2019_data
> where event_type='purchase'
> group by user_id
     > select user_id from user_summary
> order by total DESC
> limit 10;
   uery ID = hadoop_20210905115915_c283e483-6f65-4fc9-9219-50a1fb9b3c39
otal jobs = 1
aunching Job 1 out of 1
   tatus: Running (Executing on YARN cluster with App id application_1630501538063_0105)
        VERTICES MODE STATUS TOTAL COMPLETED RUNNING PENDING FAILED KILLED
   >>] 100% ELAPSED TIME: 2.20 s
   ser_id
   57790271
```

The user ids of top 10 users of the website who spend the most is displayed.

ime taken: 4.519 seconds, Fetched: 10 row(s)