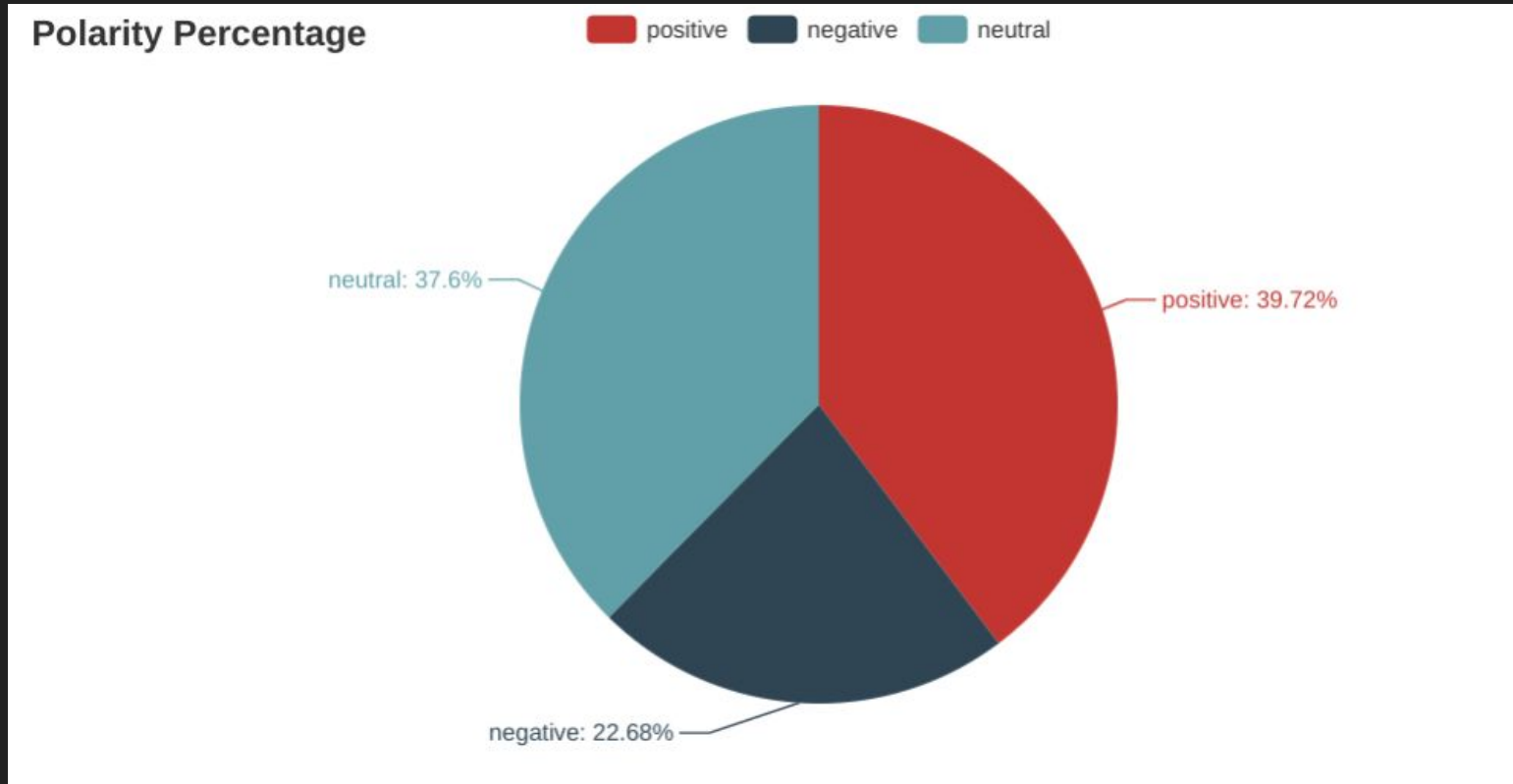


Tweets Analysis with Spark

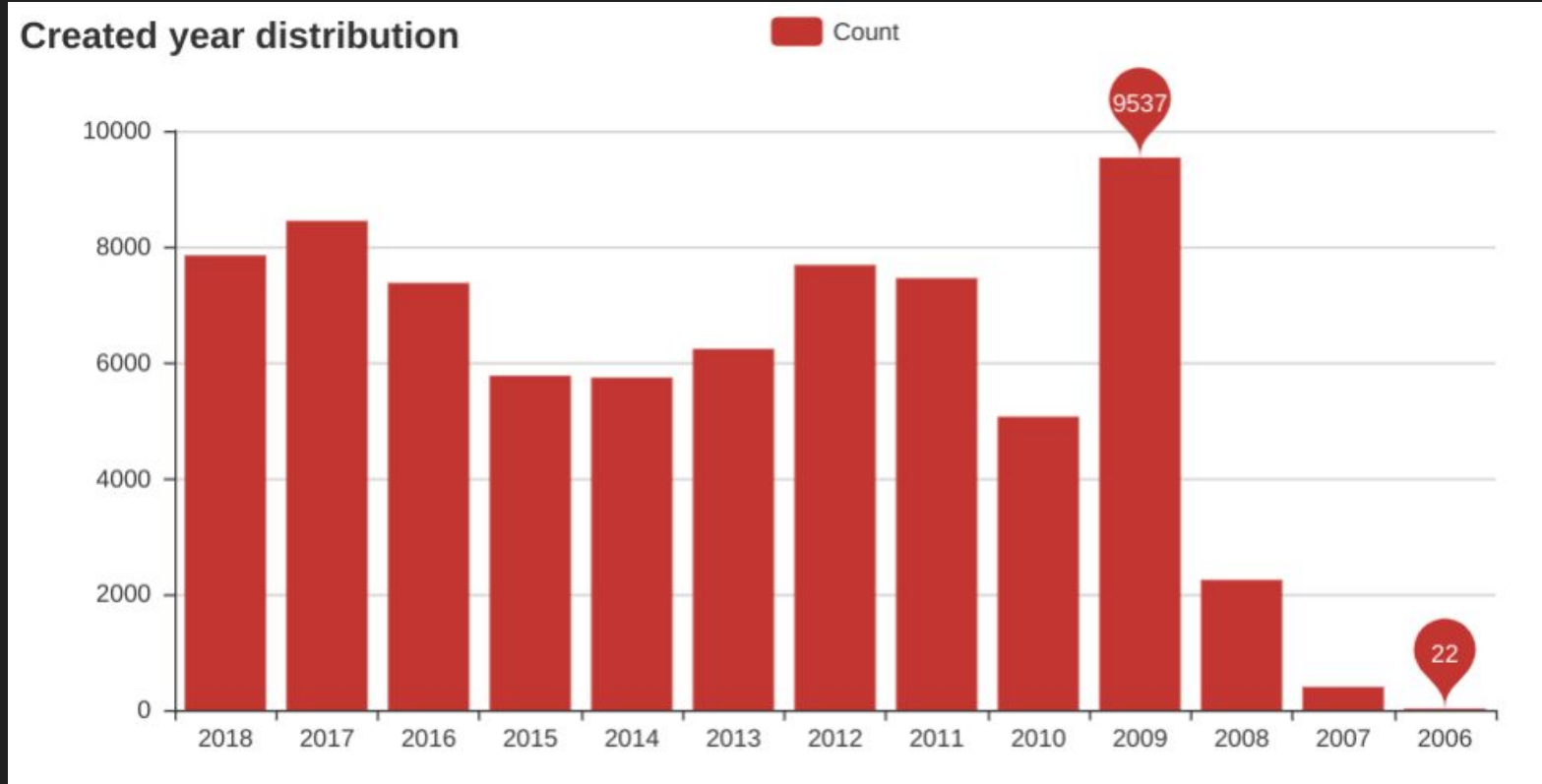
Harshil Patel (8), Matthew Boerner (1), Stephanie Retzke (10) and Yong Zheng (14)

Yong

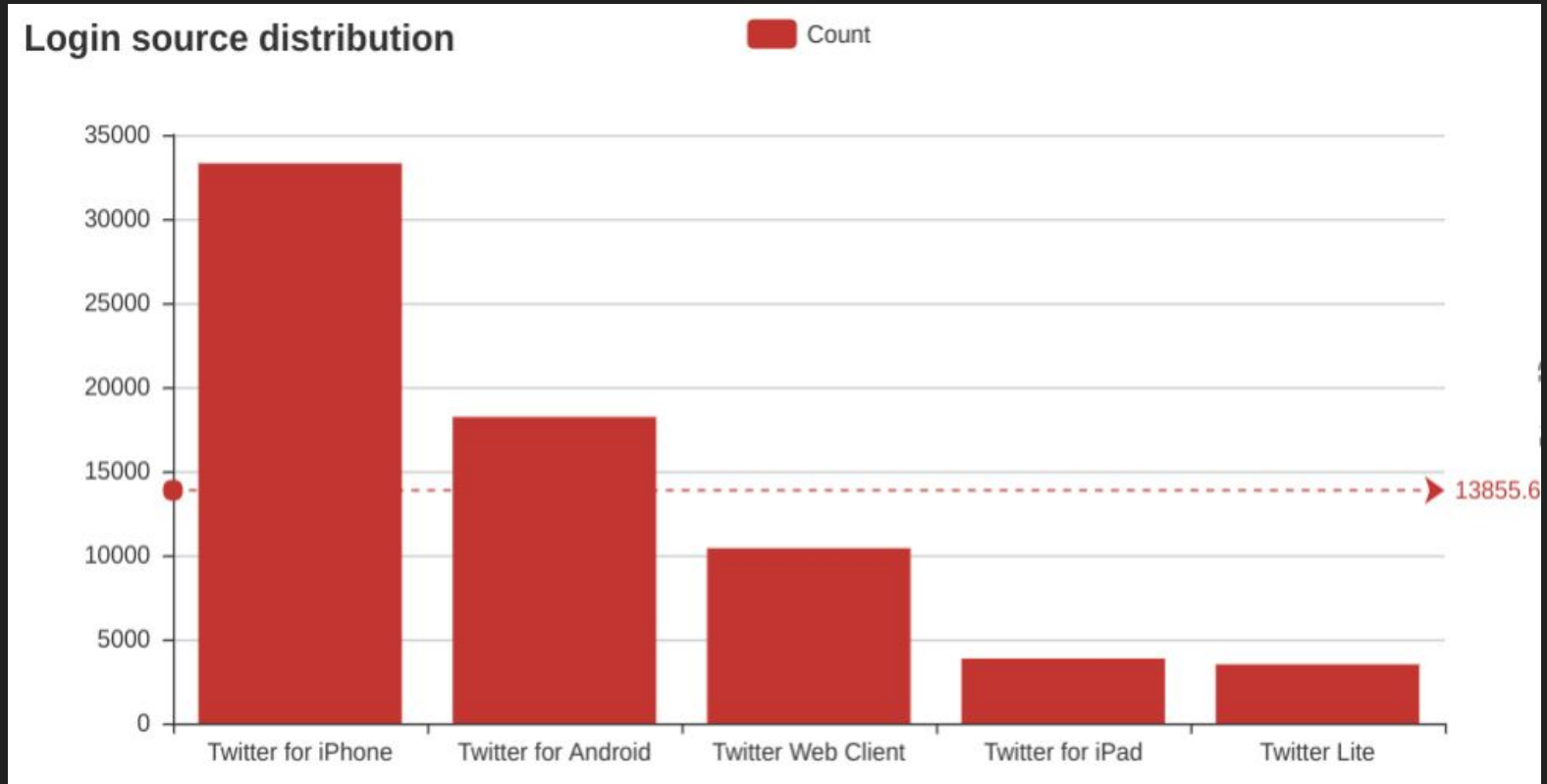
Increment 1 - Query 1 - Polarity Percentage



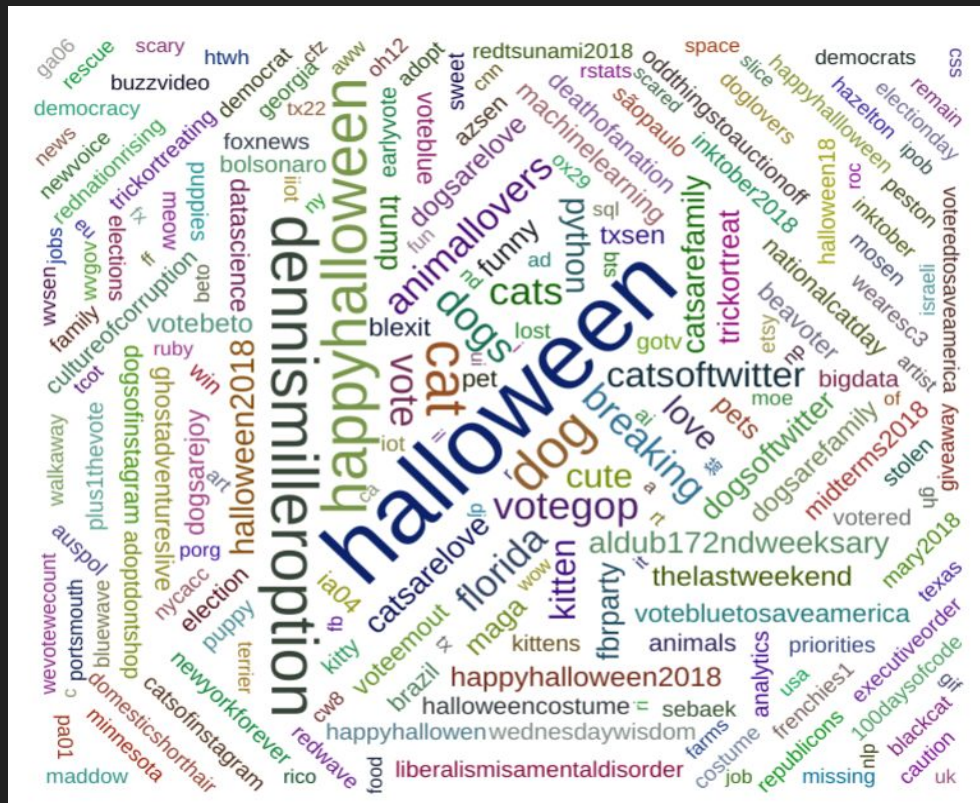
Increment 1 - Query 2 - Created Year Distribution



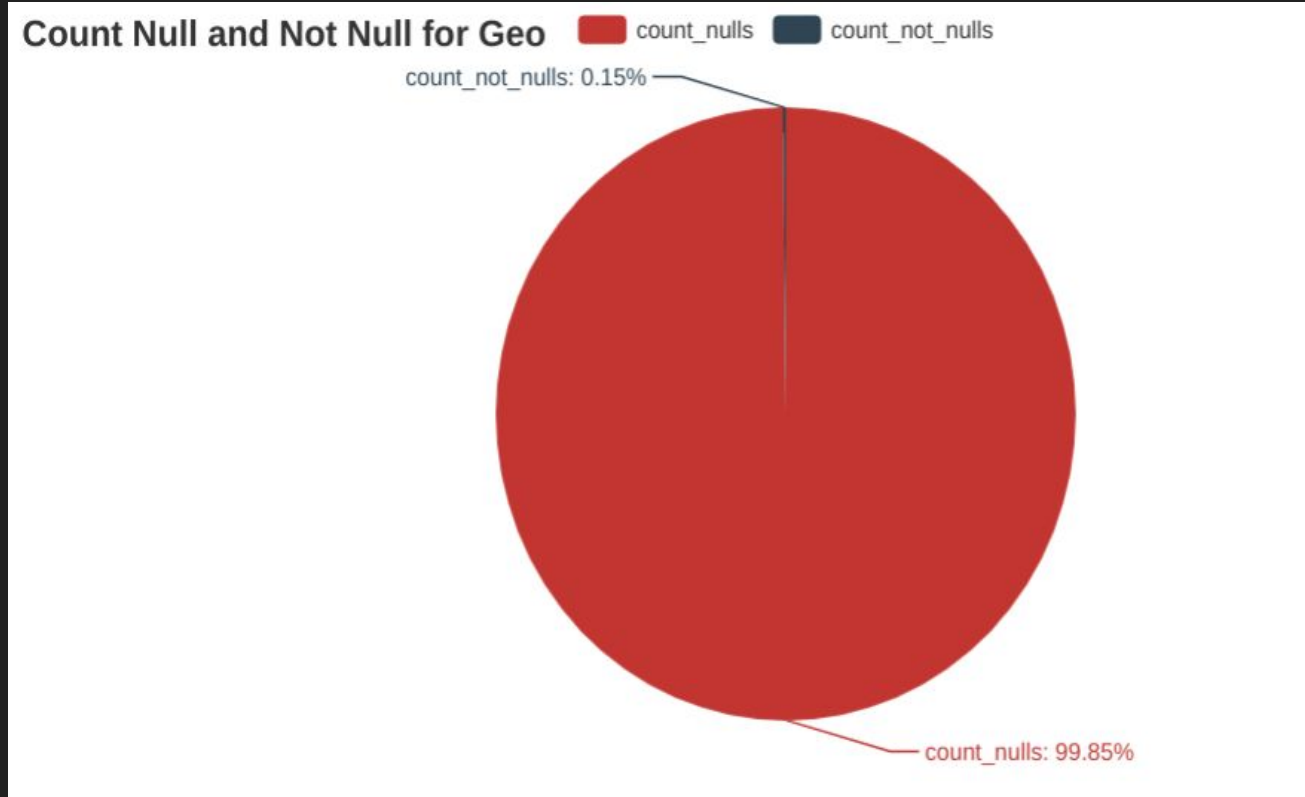
Increment 1 - Query 3 - Login Source Distribution



Increment 1 - Query 4 - Word Cloud



Increment 1 - Query 5 - With/Without Geo



Increment 1 - Query 6 - Country Distribution (Geo)

| | Count |
|----------------------|-------|
| USA | 119 |
| Canada | 11 |
| New Zealand/Aotearoa | 3 |
| UK | 3 |
| Brasil | 2 |
| Philippines | 2 |
| ประเทศไทย | 1 |
| Chile | 1 |
| Ireland | 1 |
| Australia | 1 |
| 대한민국 | 1 |
| India | 1 |

Increment 1 - Query 7 - Country Distribution (Placed)

| country_code | | count |
|--------------|--|-------|
| US | | 1147 |
| CA | | 49 |
| GB | | 47 |
| AU | | 17 |
| PH | | 10 |
| BR | | 6 |
| IN | | 6 |
| JP | | 5 |
| NZ | | 4 |
| MY | | 4 |

Increment 1 - Query 8 - Long Message Percentage

Message truncated percentage



Increment 1 - Query 9 - With/Without Verified

```
+-----+-----+
|verified|count|
+-----+-----+
|    true| 1221|
|   false|98779|
+-----+-----+
```

```
+-----+-----+
|default_profile|count|
+-----+-----+
|             true|  218|
|             false| 1003|
+-----+-----+
```

Verified Accounts

```
+-----+-----+
|default_profile|count|
+-----+-----+
|             true|55598|
|             false|43181|
+-----+-----+
```

Unverified Accounts

Increment 1 - Query 10 - Friends VS. Followers

```
# Users count where the number of friends_count is greater than followers_count  
data_df.where('user.friends_count > user.followers_count').count()
```

61730

```
# Users count where the number of friends_count is less than followers_count  
data_df.where('user.friends_count < user.followers_count').count()
```

37952

```
# Users count where the number of friends_count is the same as followers_count  
data_df.where('user.friends_count = user.followers_count').count()
```

318

Increment 2 - ML - Features

```
# Generate new data list for ML
ml_data_list = []
index = 0

for row in data_list:
    temp_data_list = []
    if row[0] == 1:
        temp_data_list.append('truncated')
    if row[1] == 1:
        temp_data_list.append('verified')
    if row[2] == 1:
        temp_data_list.append('geo_enabled')
    if row[3] == 1:
        temp_data_list.append('profile_background_tile')
    if row[4] == 1:
        temp_data_list.append('profile_use_background_image')
    if row[5] == 1:
        temp_data_list.append('default_profile')
    if temp_data_list:
        ml_data_list.append((index, temp_data_list))
        index += 1
```

Increment 2 - ML - Model

```
# Generate analysis dataframe  
analysis_df = spark.createDataFrame(ml_data_list, ['id', 'items'])
```

```
# Create the model and fit the dataframe into the model  
fp_growth = FPGrowth(itemsCol="items", minSupport=0.50, minConfidence=0.6)  
model = fpGrowth.fit(analysis_df)
```

```
# Display frequent itemsets  
model.freqItemsets.show(truncate=False)
```

```
+-----+-----+  
|items                                     |freq |  
+-----+-----+  
|[profile_use_background_image]          |80317|  
|[default_profile]                        |55816|  
|[default_profile, profile_use_background_image]|55816|  
+-----+-----+
```

Increment 2 - ML - Result

```
# Generate analysis dataframe
analysis_df = spark.createDataFrame(ml_data_list, ['id', 'items'])
```

```
# Create the model and fit the dataframe into the model
fp_growth = FPGrowth(itemsCol="items", minSupport=0.50, minConfidence=0.6)
model = fpGrowth.fit(analysis_df)
```

```
# Display frequent itemsets
model.freqItemsets.show(truncate=False)
```

| items | freq |
|---|-------|
| [profile_use_background_image] | 80317 |
| [default_profile] | 55816 |
| [default_profile, profile_use_background_image] | 55816 |

Increment 2 - ML - Recommendations

```
# Display prediction
model.transform(analysis_df).show(tdruncate=False)
```

| id | items | prediction |
|----|---|--------------------|
| 0 | [profile_use_background_image, default_profile] | [[|
| 1 | [geo_enabled, profile_use_background_image, default_profile] | [[|
| 2 | [profile_use_background_image] | [[default_profile] |
| 3 | [truncated, profile_use_background_image, default_profile] | [[|
| 4 | [profile_use_background_image, default_profile] | [[|
| 5 | [profile_use_background_image, default_profile] | [[|
| 6 | [profile_use_background_image, default_profile] | [[|
| 7 | [geo_enabled, profile_use_background_image] | [[default_profile] |
| 8 | [geo_enabled, profile_use_background_image, default_profile] | [[|
| 9 | [profile_use_background_image, default_profile] | [[|
| 10 | [profile_use_background_image, default_profile] | [[|
| 11 | [truncated, geo_enabled, profile_use_background_image, default_profile] | [[|
| 12 | [truncated, profile_use_background_image] | [[default_profile] |
| 13 | [geo_enabled, profile_background_tile, profile_use_background_image] | [[default_profile] |
| 14 | [profile_use_background_image, default_profile] | [[|
| 15 | [profile_background_tile, profile_use_background_image] | [[default_profile] |
| 16 | [profile_use_background_image, default_profile] | [[|
| 17 | [profile_use_background_image, default_profile] | [[|
| 18 | [profile_use_background_image, default_profile] | [[|
| 19 | [profile_use_background_image, default_profile] | [[|

only showing top 20 rows

Increment 2 - Graph - Graph Creation

```
# Create edges
e = data_df.select(
    col("user.id").alias("src"),
    col("retweeted_status.user.id").alias("dst"),
    lit("retweet").alias("relationship")
).where(
    col("retweeted_status.user.id").isNotNull()
).distinct()

# Create vertices
v = data_df.select(
    col("user.id"),
    col("user.screen_name")
).union(
    data_df.select(
        col("retweeted_status.user.id"),
        col("retweeted_status.user.name"),
    ).where(
        col("retweeted_status.user.id").isNotNull()
    )
).distinct()

# Create graph
g = GraphFrame(v, e)
```

Increment 2 - Graph - In-degree

```
# Get top 10 id with highest in degree  
g.inDegrees.sort("inDegree", ascending=False).show(10, False)
```

| id | inDegree |
|---------------------|----------|
| 1604444052 | 2201 |
| 487297085 | 1979 |
| 130496027 | 1579 |
| 4196983835 | 1359 |
| 1008440487915720708 | 1319 |
| 16989178 | 1110 |
| 19697415 | 1070 |
| 150078976 | 1056 |
| 2828212668 | 984 |
| 3267456386 | 930 |

only showing top 10 rows

Increment 2 - Graph - In-degree (sorted)

```
# Get top 10 id with lowest in degree  
g.inDegrees.sort("inDegree").show(10, False)
```

| id | inDegree |
|--------------------|----------|
| 3358687222 | 1 |
| 18611344 | 1 |
| 2859622263 | 1 |
| 20813564 | 1 |
| 179176923 | 1 |
| 948171093818343425 | 1 |
| 540321025 | 1 |
| 72954856 | 1 |
| 95755482 | 1 |
| 135138678 | 1 |

only showing top 10 rows

Increment 2 - Graph - Out-degree

```
# Get top 10 id with highest out degree  
g.outDegrees.sort("outDegree", ascending=False).show(10, False)
```

| id | outDegree |
|---------------------|-----------|
| 988374538491777025 | 48 |
| 1053011875007483905 | 24 |
| 824216698551209984 | 18 |
| 822210115784806400 | 18 |
| 80602426 | 17 |
| 2905278738 | 16 |
| 62147616 | 16 |
| 4053477192 | 16 |
| 954454874665771013 | 16 |
| 2874358611 | 15 |

only showing top 10 rows

Increment 2 - Graph - Shortest Paths - Less Popular Landmarks

```
# Compute shortest paths from each vertex to the given set of landmark vertices
# For one id with low number of in degree
g.shortestPaths(
  landmarks=["3358687222"]
).select("id", "distances").where(
  size(col("distances")) > 0
).show(10, False)
```

| | |
|--------------------|-------------------|
| id | distances |
| 885245073813798912 | [3358687222 -> 1] |
| 3358687222 | [3358687222 -> 0] |

Increment 2 - Graph - Shortest Paths - Popular Landmarks

```
# Compute shortest paths from each vertex to the given set of landmark vertices
# For one id with high number of in degree
g.shortestPaths(
  landmarks=["150078976"]
).select("id", "distances").where(
  size(col("distances")) > 0
).show(10, False)
```

| id | distances |
|--------------------|------------------|
| 740005760801726465 | [150078976 -> 1] |
| 334776400 | [150078976 -> 1] |
| 849374799868637185 | [150078976 -> 1] |
| 935707527580397569 | [150078976 -> 1] |
| 3424129696 | [150078976 -> 1] |
| 827544166624325632 | [150078976 -> 1] |
| 303950400 | [150078976 -> 1] |
| 498077600 | [150078976 -> 2] |
| 241941600 | [150078976 -> 1] |
| 1566650000 | [150078976 -> 1] |

only showing top 10 rows

Increment 2 - Graph - Shortest Paths - Triangle Count

```
# Computes the number of triangles passing through each vertex  
g.triangleCount().select("id", "count").where(col("count") > 0).show(10, False)
```

| id | count |
|---------------------|-------|
| 908149255654854656 | 104 |
| 883855148136763392 | 4 |
| 883855148136763392 | 4 |
| 1003631763133001729 | 4 |
| 719662077934243840 | 12 |
| 197111814 | 4 |
| 862106769862078464 | 2 |
| 909519301299892225 | 40 |
| 909519301299892225 | 40 |
| 3100613023 | 4 |

only showing top 10 rows

Harshil

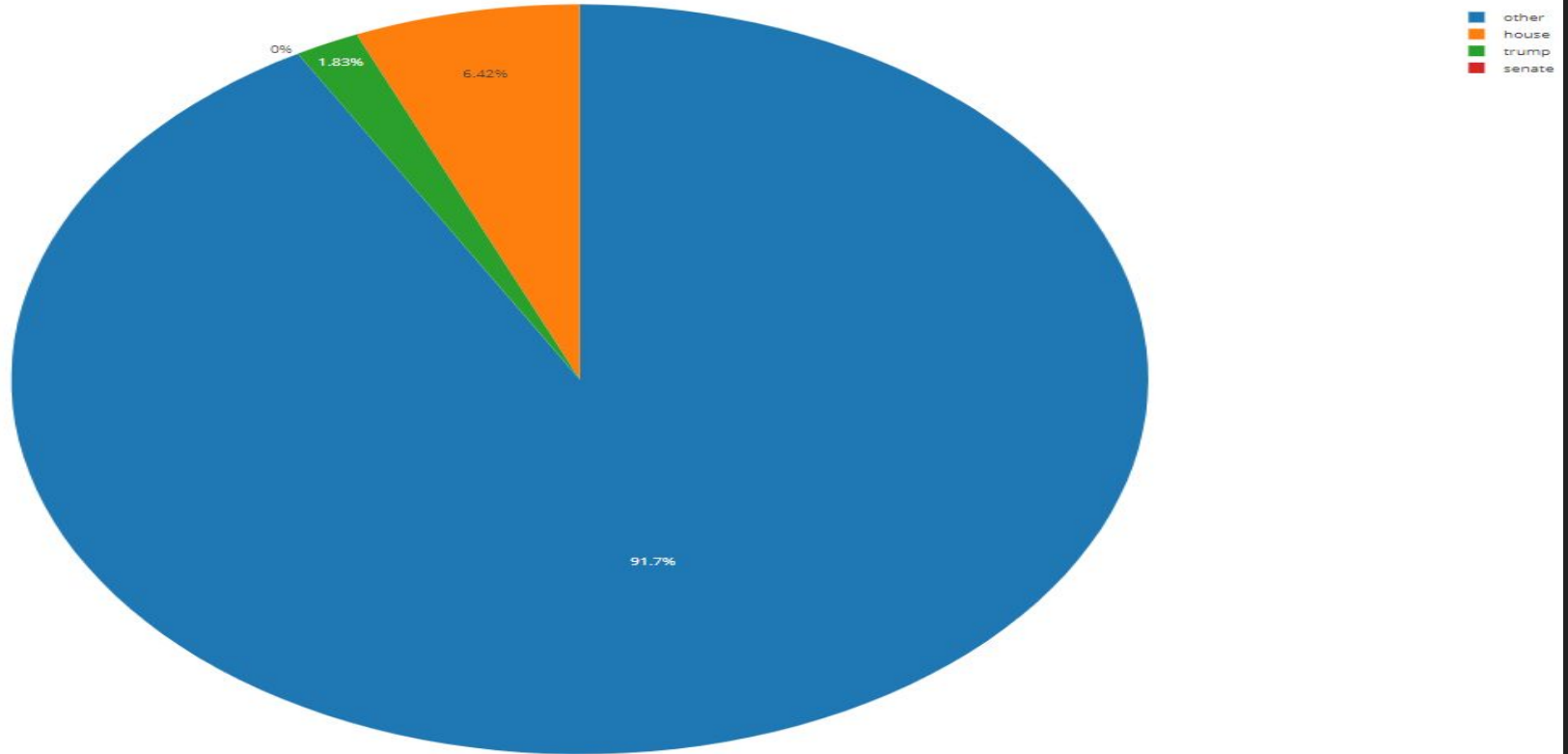
Model



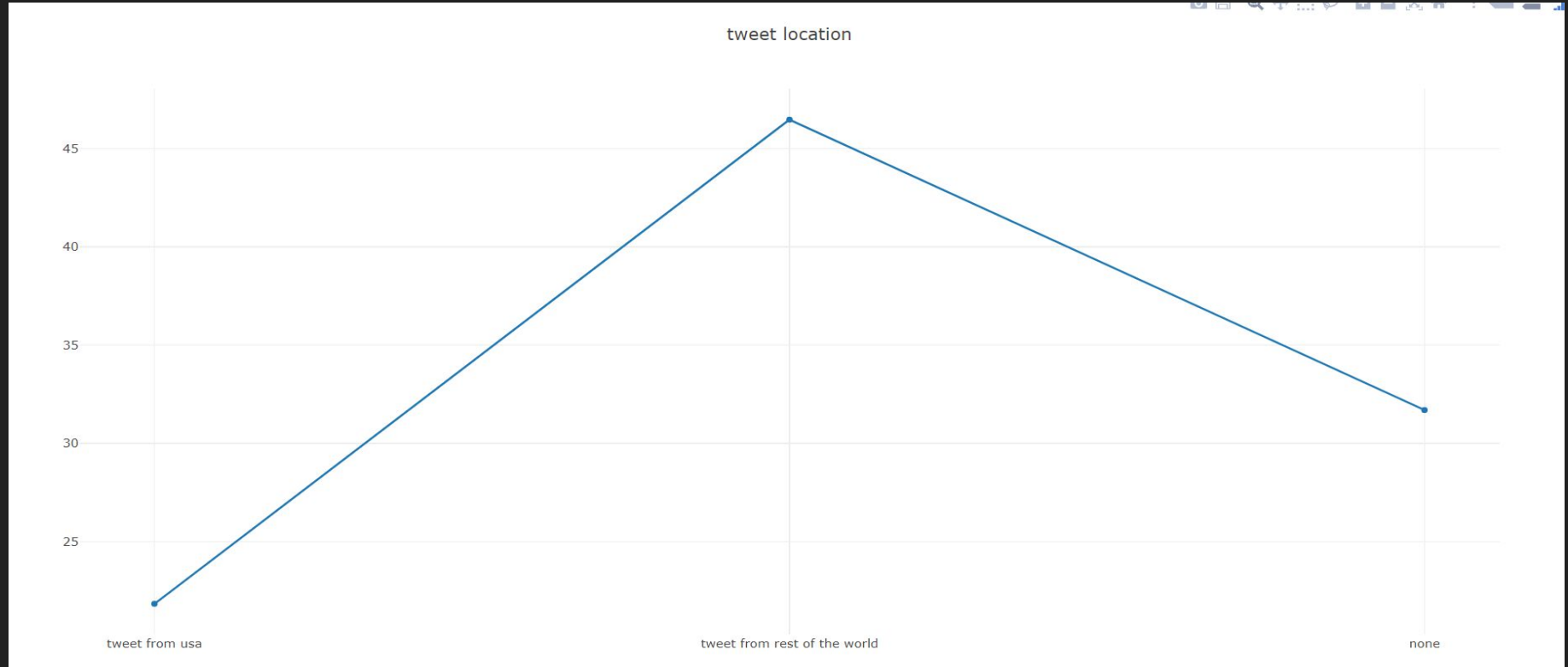
Get top 10 user which have most favourites count

```
C:\Users\harsh\AppData\Local\Programs\Python\Python36-32\pyth
-----favourites_count-----
meh
1073419
Brian D.
965279
EnigMAA
851456
Madana Bhat-Khandige
823206
Monica Cates
821897
DerekPlatt
815322
rebecca lauren
812977
Brennen Burleson
800649
Jeanette Baratta
799905
Grand Moff Snarkin, Surefire Intelligence CFO
772169
```

Find the tracks in the tweet and shows its distribution



Show tweets generated from united state and other than united states



Get the count of the user which have account verified

```
-----account verified-----  
1319
```

Get top 10 tweet that are retweeted the most

-----tweet that are retweeted the most-----

Rylie Geraci

633089

c h i e f

178413

BAYU ARISANDY

125011

monika bielskyte

125010

Rihanna

125009

Nasir Shakur

125007

shay

125007

RichFanAcc

118884

SaltSaltSalt

110527

rory miller

107464

Get top 10 user which have most followers count

-----followers_count-----

Donald J. Trump

55525198

President Trump

24414561

The Economist

23428140

Reuters Top News

19957413

The White House

17502570

The Washington Post

13010477

The Washington Post

13010416

China Xinhua News

11550188

Jimmy Kimmel

11427575

HuffPost

11389165

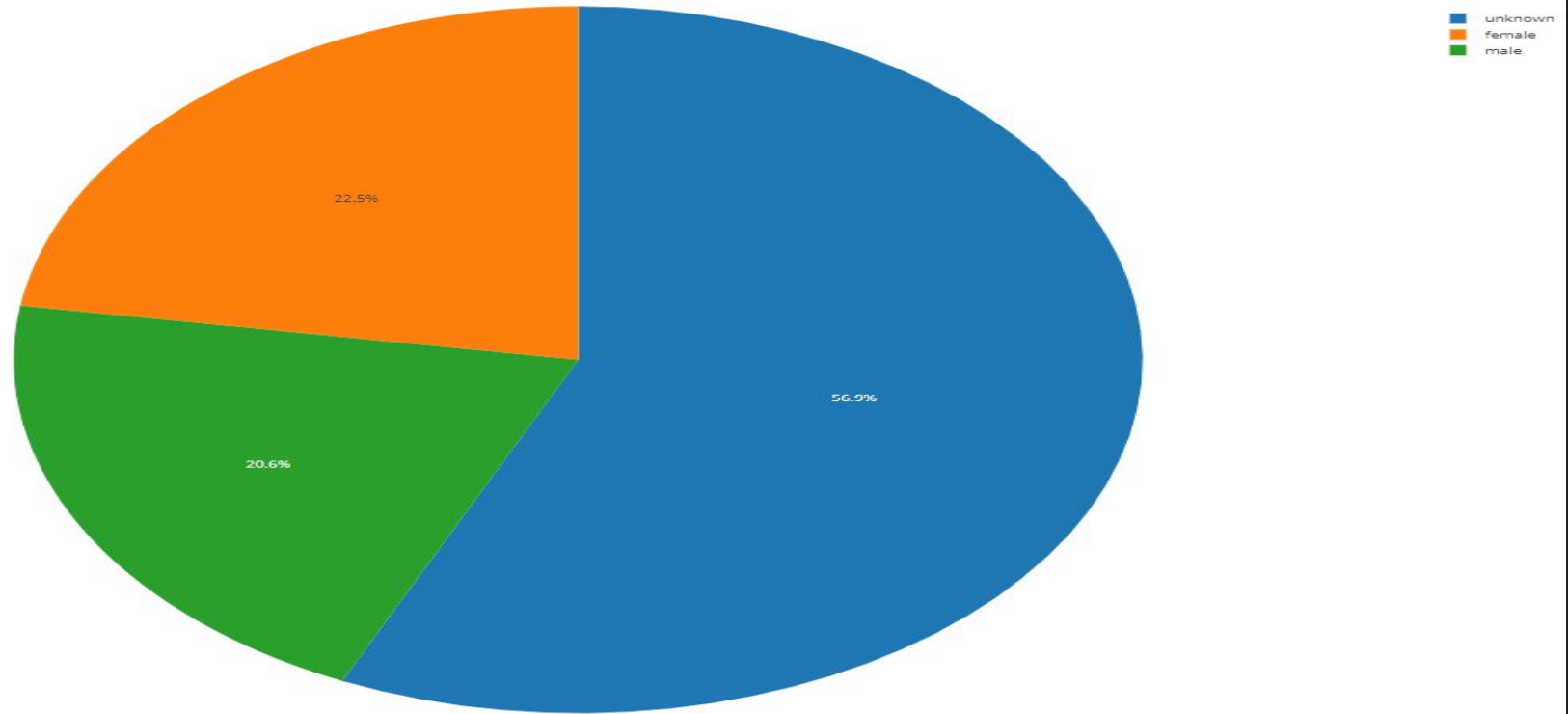
Get top 10 user which have most friends count

```
-----friends_count-----  
Ed Krassenstein  
641614  
Travel  
572779  
Jeffrey Levin  
428351  
Jeffrey Levin  
428351  
Music Lovers Fans♪  
306347  
® MonsterFunder  
305853  
Tina Stull  
236552  
Reg Saddler  
229134  
Reg Saddler  
229134  
Dorian Sage ©  
227725  
-----
```


Get percentage of tweet based on negative, positive, neutral

```
-----negative postive tweet-----  
negative:27.449725502744972  
positive:34.229657703422966  
neutral:38.31961680383196
```

Find gender of the user based on their name



Get the count of tweets

```
-----count-----  
100000
```

HashingTF + IDF + Logistic Regression

| _c0 | text | target | words | tf | features | label |
|-----|----------------------|--------|------------------------|--------------------------|--------------------------|-------|
| 0 | RT Trump's press ... | 1 | [rt, trump's, pre... | (65536, [312, 7752, ...] | (65536, [312, 7752, ...] | 0.0 |
| 1 | RT What is tweeti... | 0 | [rt, what, is, tw... | (65536, [12716, 158... | (65536, [12716, 158... | 1.0 |
| 2 | RT Go to a hand r... | 0 | [rt, go, to, a, h... | (65536, [1038, 1354... | (65536, [1038, 1354... | 1.0 |
| 3 | RT I'm moving to ... | 1 | [rt, i'm, moving, ...] | (65536, [1197, 8436... | (65536, [1197, 8436... | 0.0 |
| 4 | RT Little-known f... | 1 | [rt, little-known... | (65536, [19996, 290... | (65536, [19996, 290... | 0.0 |
| 5 | RT FACT funded th... | 0 | [rt, fact, funded... | (65536, [20464, 217... | (65536, [20464, 217... | 1.0 |
| 6 | RT Trump's firing... | 1 | [rt, trump's, fir... | (65536, [9639, 1553... | (65536, [9639, 1553... | 0.0 |
| 7 | RT _hooty _regula... | 1 | [rt, _hooty, _reg... | (65536, [3811, 7612... | (65536, [3811, 7612... | 0.0 |

only showing top 8 rows

18/11/28 19:51:04 WARN BLAS: Failed to load implementation from: com.github.fommil.netlib.NativeSystemBLAS

18/11/28 19:51:04 WARN BLAS: Failed to load implementation from: com.github.fommil.netlib.NativeRefBLAS

0.9415204678362573

CountVectorizer + IDF + Logistic Regression

```
Accuracy Score: 0.9181
```

```
ROC-AUC: 0.9544
```

```
Process finished with exit code 0
```

Graph

```
g.degrees.show(5)
```

| | id | degree |
|--|--------------------|--------|
| | 133938408 | 13 |
| | 2896675593 | 1 |
| | 823651149823688705 | 4 |
| | 883855148136763392 | 2 |
| | 818632400641097733 | 1 |

only showing top 5 rows

| src | dst | relationship |
|--------------------|---------------------|--------------|
| 963967475875500033 | 395674143 | retweet |
| 320908938 | 1034665733005959168 | retweet |
| 789588266198700036 | 232901331 | retweet |
| 385689121 | 4731701624 | retweet |
| 879531117811965953 | 988960980548931585 | retweet |

only showing top 5 rows

```
+-----+-----+
|          id|  screen_name|
+-----+-----+
|      210185175| emmaburnsapp|
|      822926826|      kjtc1979|
|943892654160531457|    aesopgalt|
|767072603278159872|m8nkey2chm00n|
|      215441260|      LPWhitt|
+-----+-----+
only showing top 5 rows
```



```
g.inDegrees.sort("inDegree").show(5, False)
```

| | | | | |
|---|---------------------|---|----------|---|
| + | ----- | + | ----- | + |
| | id | | inDegree | |
| + | ----- | + | ----- | + |
| | 15469000 | | 1 | |
| | 577432615 | | 1 | |
| | 864068108 | | 1 | |
| | 1038512907120779264 | | 1 | |
| | 53190110 | | 1 | |
| + | ----- | + | ----- | + |

only showing top 5 rows

```
g.inDegrees.sort("inDegree", ascending=False).show(5, False)
```

| id | inDegree |
|--------------------|----------|
| 25073877 | 105 |
| 21728303 | 44 |
| 822215673812119553 | 34 |
| 18643437 | 32 |
| 91386979 | 31 |

only showing top 5 rows

```
g.shortestPaths(landmarks=["25073877"]).select("id", "distances").where(size(col("distances")) > 0).show(10, False)
```

| id | distances |
|--------------------|--------------------|
| 954609953087553536 | Map(25073877 -> 1) |
| 733279356492079106 | Map(25073877 -> 1) |
| 877879587493085184 | Map(25073877 -> 1) |
| 43870406 | Map(25073877 -> 1) |
| 977695071096262658 | Map(25073877 -> 1) |
| 2880381305 | Map(25073877 -> 1) |
| 2370953706 | Map(25073877 -> 1) |
| 976262602421448705 | Map(25073877 -> 1) |
| 227835612 | Map(25073877 -> 1) |
| 2149493108 | Map(25073877 -> 1) |

only showing top 10 rows

Stephanie

Increment 1

Query 1: Count how many tweets were favorited and those that were not

```
//1
val favTweets = sqlContext
  .sql( sqlText = "SELECT favorited, count(*) as count FROM EntertainmentTable where favorited is not null group by favorited order by count desc limit 10" )
favTweets.show
```

```
+-----+-----+
|favorited|count|
+-----+-----+
|      false| 1000|
+-----+-----+
```

Increment 1

Query 2: Count how many tweets were retweeted and those that were not

```
//2
val reTweets = sqlContext
  .sql( sqlText = "SELECT retweeted, count(*) as count FROM EntertainmentTable where retweeted is not null group by retweeted order by count desc limit 10")
reTweets.show
```

```
+-----+-----+
|retweeted|count|
+-----+-----+
|      false| 1000|
+-----+-----+
```

Increment 1

Query 3: Count how many tweets were quotes and those that were not

//3

```
val quoteTweets = sqlContext
  .sql( sqlText = "SELECT is_quote_status, count(*) as count FROM EntertainmentTable where is_quote_status is not null group by is_quote_status order by count")
quoteTweets.show
```

```
+-----+-----+
|is_quote_status|count|
+-----+-----+
|           false|   802|
|           true|   198|
+-----+-----+
```

Increment 1

Query 4: See what filter levels people use and how many

```
//4
val filterTweets = sqlContext
  .sql( sqlText = "SELECT filter_level, count(*) as count FROM EntertainmentTable where filter_level is not null group by filter_level order by count desc limit 10")
filterTweets.show
```

```
+-----+-----+
|filter_level|count|
+-----+-----+
|          low| 1000|
+-----+-----+
```


Increment 1

Query 5: Count how many tweets were truncated and those that were not

```
//5
val truncatedTweets = sqlContext
  .sql( sqlText = "SELECT truncated, count(*) as count FROM EntertainmentTable where truncated is not null group by truncated order by count desc limit 10")
truncatedTweets.show
```

```
+-----+-----+
|truncated|count|
+-----+-----+
|      false|   905|
|       true|    95|
+-----+-----+
```

Increment 1

Query 6: Count how many tweets were quotes and truncated

```
//6
val tqTweets = sqlContext
  .sql( sqlText = "SELECT id, truncated, is_quote_status, count(*) as count FROM EntertainmentTable where truncated = true AND is_quote_status = true group by id")
tqTweets.show
```

| id | truncated | is_quote_status | count |
|---------------------|-----------|-----------------|-------|
| 1057777525441679361 | true | true | 1 |
| 1057777569389436928 | true | true | 1 |
| 1057777296055119872 | true | true | 1 |
| 1057777564482240516 | true | true | 1 |
| 1057777322135191553 | true | true | 1 |
| 1057777304359686144 | true | true | 1 |
| 1057777353340928000 | true | true | 1 |
| 1057777303285989376 | true | true | 1 |

Increment 1

Query 7: Count how many tweets were created at the same time

```
//7
val createdTweets = sqlContext
  .sql( sqlText = "SELECT created_at, count(*) as count FROM EntertainmentTable where created_at is not null group by created_at order by count desc limit 15")
createdTweets.show
```

| created_at | count |
|----------------------|-------|
| Wed Oct 31 23:32:... | 24 |
| Wed Oct 31 23:33:... | 23 |
| Wed Oct 31 23:33:... | 21 |
| Wed Oct 31 23:32:... | 21 |
| Wed Oct 31 23:33:... | 20 |
| Wed Oct 31 23:32:... | 20 |
| Wed Oct 31 23:32:... | 19 |
| Wed Oct 31 23:33:... | 19 |
| Wed Oct 31 23:32:... | 19 |
| Wed Oct 31 23:32:... | 18 |
| Wed Oct 31 23:32:... | 18 |
| Wed Oct 31 23:32:... | 18 |
| Wed Oct 31 23:32:... | 18 |
| Wed Oct 31 23:32:... | 17 |
| Wed Oct 31 23:33:... | 17 |

Increment 1

Query 8: Find the max replies a tweet had at a certain time

```
val replyCountTweets = sqlContext
  .sql( sqlText = "SELECT created_at, max(reply_count) as max_reply FROM EntertainmentTable where created_at is not null group by created_at order by max_reply desc")
replyCountTweets.show
```

| created_at | max_reply |
|----------------------|-----------|
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:33:... | 0 |
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:33:... | 0 |
| Wed Oct 31 23:33:... | 0 |
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:33:... | 0 |
| Wed Oct 31 23:32:... | 0 |

Increment 1

Query 9: Find the max quotes a tweet had at a certain time

```
val quoteCountTweets = sqlContext
  .sql( sqlText = "SELECT created_at, max(quote_count) as max_quote FROM EntertainmentTable where created_at is not null group by created_at order by max_quote d
quoteCountTweets.show
```

| created_at | max_quote |
|----------------------|-----------|
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:33:... | 0 |
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:33:... | 0 |
| Wed Oct 31 23:33:... | 0 |
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:32:... | 0 |
| Wed Oct 31 23:33:... | 0 |
| Wed Oct 31 23:32:... | 0 |

Increment 1

Query 10: Count how many users are protected and those that are not

```
//10
val protectedTweets = sqlContext
  .sql( sqlText = "SELECT user.protected, count(*) as count FROM EntertainmentTable where user.protected = false group by user.protected order by count desc limit 1")
protectedTweets.show
```

```
+-----+-----+
|protected|count|
+-----+-----+
|      false| 1000|
+-----+-----+
```

Increment 2 - Machine Learning

```
//We'll split the set into training and test data
val Array(trainingData, testData) = child.randomSplit(Array(0.8, 0.2))

val labelColumn = "id"

//We define two StringIndexers for the categorical variables

val countryIndexer = new StringIndexer()
    .setInputCol("lang")
    .setOutputCol("replyIndex")

//We define the assembler to collect the columns into a new column with a single vector - "features"
val assembler = new VectorAssembler()
    .setInputCols(Array("reply_count", "replyIndex"))
    .setOutputCol("features")

//For the regression we'll use the Gradient-boosted tree estimator
val gbt = new GBRegressor()
    .setLabelCol(labelColumn)
    .setFeaturesCol("features")
    .setPredictionCol("Predicted " + labelColumn)
    .setMaxIter(50).setMaxBins(100)
```

Increment 2 - Machine Learning

```
//Construct the pipeline
val pipeline = new Pipeline().setStages(stages)

//We fit our DataFrame into the pipeline to generate a model
val model = pipeline.fit(trainingData)

//We'll make predictions using the model and the test data
val predictions = model.transform(testData)
predictions.show()
```

| t | id | in_reply_to_screen_name | is_quote_status | reply_count | retweeted | text | lang | replyIndex | features | Predicted id |
|---|---------------------|-------------------------|-----------------|-------------|-----------|----------------------|------|------------|-------------|----------------------|
| 0 | 1057777287033171975 | VonnieCalland | false | 0 | false | @VonnieCalland Th... | en | 0.0 | (2, [], []) | 1.057777426920863... |
| 0 | 1057777351533228032 | molly_knight | false | 0 | false | @molly_knight My ... | en | 0.0 | (2, [], []) | 1.057777426920863... |
| 0 | 1057777359221374982 | WhenWeAllVote | false | 0 | false | @WhenWeAllVote @M... | en | 0.0 | (2, [], []) | 1.057777426920863... |
| 0 | 1057777379047690240 | realDonaldTrump | false | 0 | false | @realDonaldTrump ... | en | 0.0 | (2, [], []) | 1.057777426920863... |
| 0 | 1057777436409163776 | Twitter | true | 0 | false | @Twitter u r not ... | en | 0.0 | (2, [], []) | 1.057777426920863... |
| 0 | 1057777441501052928 | littlefonty | false | 0 | false | @littlefonty @tay... | en | 0.0 | (2, [], []) | 1.057777426920863... |
| 0 | 1057777461021290497 | JulieAnnLily | false | 0 | false | @JulieAnnLily @Le... | en | 0.0 | (2, [], []) | 1.057777426920863... |
| 0 | 1057777534924918786 | Need2Impeach | false | 0 | false | @Need2Impeach @Da... | en | 0.0 | (2, [], []) | 1.057777426920863... |
| 0 | 1057777544827551744 | Attractivepup | false | 0 | false | @Attractivepup He... | en | 0.0 | (2, [], []) | 1.057777426920863... |
| 0 | 1057777553312632832 | tomezine | false | 0 | false | @tomezine @Verita... | en | 0.0 | (2, [], []) | 1.057777426920863... |
| 0 | 1057777572908433408 | KevinMKruse | false | 0 | false | @KevinMKruse My f... | en | 0.0 | (2, [], []) | 1.057777426920863... |

Increment 2 - Machine Learning

```
//This will evaluate the error/deviation of the regression using the Root Mean Squared deviation  
val evaluator = new RegressionEvaluator()  
    .setLabelCol(labelColumn)  
    .setPredictionCol("Predicted " + labelColumn)  
    .setMetricName("rmse")  
  
//We compute the error using the evaluator  
val error = evaluator.evaluate(predictions)  
  
println("The Root Mean Square Deviation error: " + error + "\n")
```

```
The Root Mean Square Deviation error: 9.363686403376337E10
```

Increment 2 - GraphFrame

```
val verticesTweets = df
  .select( col = "id", cols = "user.screen_name" )
  .where( conditionExpr = "user.screen_name is not null " +
    "and id is not null " )
```

```
val edgesPrototype = df
  .select( col = ("id"), cols = "in_reply_to_screen_name", "in_reply_to_user_id" )
  .where( conditionExpr = "in_reply_to_screen_name is not null " +
    "and in_reply_to_user_id is not null " +
    "and id is not null " )

val e = edgesPrototype.withColumnRenamed( existingName = "id", newName = "src")
val ed = e.withColumnRenamed( existingName = "in_reply_to_screen_name", newName = "dst")
val edgesTweets = ed.withColumnRenamed( existingName = "in_reply_to_user_id", newName = "relationship")
```

```
val tweetGraph = GraphFrame(verticesTweets, edgesTweets)
```

Increment 2 - GraphFrame

```
val triCount = tweetGraph.triangleCount.run()
triCount.select(col = "id", cols = "count").show()
```

| id | count |
|---------------------|-------|
| 1057777280309706752 | 0 |
| 1057777336354041856 | 0 |
| 1057777348135829504 | 0 |
| 1057777441551409152 | 0 |
| 1057777569389436928 | 0 |
| 1057777361406455809 | 0 |
| 1057777400145174529 | 0 |
| 1057777419015208960 | 0 |
| 1057777480717819904 | 0 |
| 1057777283572805632 | 0 |
| 1057777324941369344 | 0 |
| 1057777335825506305 | 0 |
| 1057777386945691648 | 0 |
| 1057777468797583360 | 0 |
| 1057777536250400768 | 0 |
| 1057777562359906304 | 0 |
| 1057777567019778048 | 0 |
| 1057777280079065088 | 0 |
| 1057777357656899584 | 0 |
| 1057777409607589888 | 0 |

Increment 2 - GraphFrame

```
println("Out Degrees: ")  
tweetGraph.outDegrees.sort(sortCol = "outDegree").show()
```

| id | outDegree |
|---------------------|-----------|
| 1057777441551409152 | 1 |
| 1057777419015208960 | 1 |
| 1057777283572805632 | 1 |
| 1057777338564440064 | 1 |
| 1057777395900526592 | 1 |
| 1057777384663977984 | 1 |
| 1057777482651201536 | 1 |
| 1057777436409163776 | 1 |
| 1057777401244106753 | 1 |
| 1057777461021290497 | 1 |
| 1057777467455234048 | 1 |
| 1057777286970142720 | 1 |
| 1057777288433958912 | 1 |
| 1057777372068483074 | 1 |
| 1057777557553250306 | 1 |
| 1057777304359686144 | 1 |
| 1057777546421587968 | 1 |
| 1057777543674322946 | 1 |
| 1057777379865755648 | 1 |
| 1057777351533228032 | 1 |

Increment 2 - GraphFrame

```
println("In Degrees: ")
tweetGraph.inDegrees.sort( sortCol = "inDegree" ).show()
```

| id | inDegree |
|-----------------|----------|
| Annaleen | 1 |
| adnilxa | 1 |
| GraceOM1967 | 1 |
| kzannarbor | 1 |
| FlatEarthGang | 1 |
| GROGParty | 1 |
| MakedaIsRight | 1 |
| TrollTerrific | 1 |
| sallyacb275 | 1 |
| schneiderleonid | 1 |
| LouDobbs | 1 |
| jjbittenbinders | 1 |
| natvanlis | 1 |
| AyyBates | 1 |
| WhenWeAllVote | 1 |
| _BenMonroe_ | 1 |
| grantwarkentin | 1 |
| SoulSolaris23 | 1 |
| molly_knight | 1 |
| HawaiianTrash | 1 |

Shaun

Increment 1 - Query 1 - Favorites All Tweet

```
cloudera@quickstart:~/Downloads
File Edit View Search Terminal Help
set hive.exec.reducers.bytes.per.reducer=<number>
In order to limit the maximum number of reducers:
set hive.exec.reducers.max=<number>
In order to set a constant number of reducers:
set mapreduce.job.reduces=<number>
Starting Job = job_1541805655545_0005, Tracking URL = http://quickstart.cloudera:8088/proxy/application\_1541805655545\_0005/
Kill Command = /usr/lib/hadoop/bin/hadoop job -kill job_1541805655545_0005
Hadoop job information for Stage-1: number of mappers: 1; number of reducers: 1
2018-11-09 19:06:34,989 Stage-1 map = 0%, reduce = 0%
2018-11-09 19:06:44,909 Stage-1 map = 100%, reduce = 0%, Cumulative CPU 2.39 sec
2018-11-09 19:06:54,648 Stage-1 map = 100%, reduce = 100%, Cumulative CPU 4.01 sec
MapReduce Total cumulative CPU time: 4 seconds 10 msec
Ended Job = job_1541805655545_0005
MapReduce Jobs Launched:
Stage-Stage-1: Map: 1 Reduce: 1 Cumulative CPU: 4.01 sec HDFS Read: 3225976
5 HDFS Write: 6 SUCCESS
Total MapReduce CPU Time Spent: 4 seconds 10 msec
OK
36852
Time taken: 30.182 seconds, Fetched: 1 row(s)
hive>
```


Increment 1 - Query 2 - Tweets Containing Trump

```
cloudera@quickstart:~/Downloads
File Edit View Search Terminal Help
  set hive.exec.reducers.bytes.per.reducer=<number>
In order to limit the maximum number of reducers:
  set hive.exec.reducers.max=<number>
In order to set a constant number of reducers:
  set mapreduce.job.reduces=<number>
Starting Job = job_1541805655545_0007, Tracking URL = http://quickstart.cloudera
:8088/proxy/application_1541805655545_0007/
Kill Command = /usr/lib/hadoop/bin/hadoop job -kill job_1541805655545_0007
Hadoop job information for Stage-1: number of mappers: 1; number of reducers: 1
2018-11-09 19:11:34,363 Stage-1 map = 0%, reduce = 0%
2018-11-09 19:11:44,401 Stage-1 map = 100%, reduce = 0%, Cumulative CPU 2.85 se
c
2018-11-09 19:11:56,258 Stage-1 map = 100%, reduce = 100%, Cumulative CPU 4.5 s
ec
MapReduce Total cumulative CPU time: 4 seconds 500 msec
Ended Job = job_1541805655545_0007
MapReduce Jobs Launched:
Stage-Stage-1: Map: 1 Reduce: 1 Cumulative CPU: 4.5 sec HDFS Read: 32259979
HDFS Write: 3 SUCCESS
Total MapReduce CPU Time Spent: 4 seconds 500 msec
OK
29
Time taken: 32.686 seconds, Fetched: 1 row(s)
hive>
```

Increment 1 - Query 3 - Tweets from Northern Hemisphere

```
cloudera@quickstart:~/Downloads
File Edit View Search Terminal Help
set hive.exec.reducers.bytes.per.reducer=<number>
In order to limit the maximum number of reducers:
set hive.exec.reducers.max=<number>
In order to set a constant number of reducers:
set mapreduce.job.reduces=<number>
Starting Job = job_1541805655545_0008, Tracking URL = http://quickstart.cloudera:8088/proxy/application_1541805655545_0008/
Kill Command = /usr/lib/hadoop/bin/hadoop job -kill job_1541805655545_0008
Hadoop job information for Stage-1: number of mappers: 1; number of reducers: 1
2018-11-09 19:17:59,947 Stage-1 map = 0%, reduce = 0%
2018-11-09 19:18:10,890 Stage-1 map = 100%, reduce = 0%, Cumulative CPU 3.13 sec
2018-11-09 19:18:21,791 Stage-1 map = 100%, reduce = 100%, Cumulative CPU 5.09 sec
MapReduce Total cumulative CPU time: 5 seconds 90 msec
Ended Job = job_1541805655545_0008
MapReduce Jobs Launched:
Stage-Stage-1: Map: 1 Reduce: 1 Cumulative CPU: 5.09 sec HDFS Read: 3226059
1 HDFS Write: 5 SUCCESS
Total MapReduce CPU Time Spent: 5 seconds 90 msec
OK
3785
Time taken: 32.849 seconds, Fetched: 1 row(s)
hive>
```

Increment 1 - Query 4 - Tweets from Southern Hemisphere

```
cloudera@quickstart:~/Downloads
File Edit View Search Terminal Help
set hive.exec.reducers.bytes.per.reducer=<number>
In order to limit the maximum number of reducers:
set hive.exec.reducers.max=<number>
In order to set a constant number of reducers:
set mapreduce.job.reduces=<number>
Starting Job = job_1541805655545_0009, Tracking URL = http://quickstart.cloudera:8088/proxy/application_1541805655545_0009/
Kill Command = /usr/lib/hadoop/bin/hadoop job -kill job_1541805655545_0009
Hadoop job information for Stage-1: number of mappers: 1; number of reducers: 1
2018-11-09 19:20:39,587 Stage-1 map = 0%, reduce = 0%
2018-11-09 19:20:50,903 Stage-1 map = 100%, reduce = 0%, Cumulative CPU 3.13 sec
2018-11-09 19:21:00,722 Stage-1 map = 100%, reduce = 100%, Cumulative CPU 4.82 sec
MapReduce Total cumulative CPU time: 4 seconds 820 msec
Ended Job = job_1541805655545_0009
MapReduce Jobs Launched:
Stage-Stage-1: Map: 1 Reduce: 1 Cumulative CPU: 4.82 sec HDFS Read: 32260579 HDFS Write: 2 SUCCESS
Total MapReduce CPU Time Spent: 4 seconds 820 msec
OK
0
Time taken: 32.725 seconds, Fetched: 1 row(s)
hive>
```

Increment 1 - Query 5 - Contain “the”

```
cloudera@quickstart:~/Downloads
File Edit View Search Terminal Help
set hive.exec.reducers.bytes.per.reducer=<number>
In order to limit the maximum number of reducers:
set hive.exec.reducers.max=<number>
In order to set a constant number of reducers:
set mapreduce.job.reduces=<number>
Starting Job = job_1541805655545_0010, Tracking URL = http://quickstart.cloudera:8088/proxy/application_1541805655545_0010/
Kill Command = /usr/lib/hadoop/bin/hadoop job -kill job_1541805655545_0010
Hadoop job information for Stage-1: number of mappers: 1; number of reducers: 1
2018-11-09 19:26:42,716 Stage-1 map = 0%, reduce = 0%
2018-11-09 19:26:55,052 Stage-1 map = 100%, reduce = 0%, Cumulative CPU 2.78 sec
2018-11-09 19:27:05,778 Stage-1 map = 100%, reduce = 100%, Cumulative CPU 4.42 sec
MapReduce Total cumulative CPU time: 4 seconds 420 msec
Ended Job = job_1541805655545_0010
MapReduce Jobs Launched:
Stage-Stage-1: Map: 1 Reduce: 1 Cumulative CPU: 4.42 sec HDFS Read: 3225967
6 HDFS Write: 6 SUCCESS
Total MapReduce CPU Time Spent: 4 seconds 420 msec
OK
19053
Time taken: 33.608 seconds, Fetched: 1 row(s)
hive>
```

Increment 1 - Query 6 - Average Lat.

```
cloudera@quickstart:~/Downloads
File Edit View Search Terminal Help
set hive.exec.reducers.bytes.per.reducer=<number>
In order to limit the maximum number of reducers:
set hive.exec.reducers.max=<number>
In order to set a constant number of reducers:
set mapreduce.job.reduces=<number>
Starting Job = job_1541805655545_0011, Tracking URL = http://quickstart.cloudera:8088/proxy/application_1541805655545_0011/
Kill Command = /usr/lib/hadoop/bin/hadoop job -kill job_1541805655545_0011
Hadoop job information for Stage-1: number of mappers: 1; number of reducers: 1
2018-11-09 19:31:32,048 Stage-1 map = 0%, reduce = 0%
2018-11-09 19:31:41,933 Stage-1 map = 100%, reduce = 0%, Cumulative CPU 2.56 sec
2018-11-09 19:31:52,685 Stage-1 map = 100%, reduce = 100%, Cumulative CPU 4.22 sec
MapReduce Total cumulative CPU time: 4 seconds 220 msec
Ended Job = job_1541805655545_0011
MapReduce Jobs Launched:
Stage-Stage-1: Map: 1 Reduce: 1 Cumulative CPU: 4.22 sec HDFS Read: 3226004
5 HDFS Write: 18 SUCCESS
Total MapReduce CPU Time Spent: 4 seconds 220 msec
OK
4.037770734284205
Time taken: 31.384 seconds, Fetched: 1 row(s)
hive> ;
```

Increment 1 - Query 7 - Average Longitude

```
cloudera@quickstart:~/Downloads
File Edit View Search Terminal Help
  set hive.exec.reducers.bytes.per.reducer=<number>
In order to limit the maximum number of reducers:
  set hive.exec.reducers.max=<number>
In order to set a constant number of reducers:
  set mapreduce.job.reduces=<number>
Starting Job = job_1541805655545_0012, Tracking URL = http://quickstart.cloudera
:8088/proxy/application_1541805655545_0012/
Kill Command = /usr/lib/hadoop/bin/hadoop job -kill job_1541805655545_0012
Hadoop job information for Stage-1: number of mappers: 1; number of reducers: 1
2018-11-09 19:33:15,972 Stage-1 map = 0%, reduce = 0%
2018-11-09 19:33:25,797 Stage-1 map = 100%, reduce = 0%, Cumulative CPU 2.51 se
c
2018-11-09 19:33:37,654 Stage-1 map = 100%, reduce = 100%, Cumulative CPU 4.21
sec
MapReduce Total cumulative CPU time: 4 seconds 210 msec
Ended Job = job_1541805655545_0012
MapReduce Jobs Launched:
Stage-Stage-1: Map: 1 Reduce: 1 Cumulative CPU: 4.21 sec HDFS Read: 3226004
7 HDFS Write: 19 SUCCESS
Total MapReduce CPU Time Spent: 4 seconds 210 msec
OK
3.9695155902004453
Time taken: 32.373 seconds, Fetched: 1 row(s)
hive>
```


Increment 1 - Query 8 - Contain “User” and “Generated”

```
cloudera@quickstart:~/Downloads
File Edit View Search Terminal Help
In order to change the average load for a reducer (in bytes):
  set hive.exec.reducers.bytes.per.reducer=<number>
In order to limit the maximum number of reducers:
  set hive.exec.reducers.max=<number>
In order to set a constant number of reducers:
  set mapreduce.job.reduces=<number>
Starting Job = job_1541805655545_0013, Tracking URL = http://quickstart.cloudera:8088/proxy/application_1541805655545_0013/
Kill Command = /usr/lib/hadoop/bin/hadoop job -kill job_1541805655545_0013
Hadoop job information for Stage-1: number of mappers: 1; number of reducers: 1
2018-11-09 19:38:10,781 Stage-1 map = 0%, reduce = 0%
2018-11-09 19:38:20,812 Stage-1 map = 100%, reduce = 0%, Cumulative CPU 2.8 sec
2018-11-09 19:38:31,666 Stage-1 map = 100%, reduce = 100%, Cumulative CPU 4.49 sec
MapReduce Total cumulative CPU time: 4 seconds 490 msec
Ended Job = job_1541805655545_0013
MapReduce Jobs Launched:
Stage-Stage-1: Map: 1 Reduce: 1 Cumulative CPU: 4.49 sec HDFS Read: 3225998
9 HDFS Write: 2 SUCCESS
Total MapReduce CPU Time Spent: 4 seconds 490 msec
OK
0
Time taken: 32.799 seconds, Fetched: 1 row(s)
hive>
```

Increment 1 - Query 9 - Total Retweets

```
cloudera@quickstart:~/Downloads
File Edit View Search Terminal Help
  set hive.exec.reducers.bytes.per.reducer=<number>
In order to limit the maximum number of reducers:
  set hive.exec.reducers.max=<number>
In order to set a constant number of reducers:
  set mapreduce.job.reduces=<number>
Starting Job = job_1541805655545_0014, Tracking URL = http://quickstart.cloudera
:8088/proxy/application_1541805655545_0014/
Kill Command = /usr/lib/hadoop/bin/hadoop job -kill job_1541805655545_0014
Hadoop job information for Stage-1: number of mappers: 1; number of reducers: 1
2018-11-09 19:39:56,156 Stage-1 map = 0%, reduce = 0%
2018-11-09 19:40:05,960 Stage-1 map = 100%, reduce = 0%, Cumulative CPU 2.64 se
c
2018-11-09 19:40:16,739 Stage-1 map = 100%, reduce = 100%, Cumulative CPU 4.32
sec
MapReduce Total cumulative CPU time: 4 seconds 320 msec
Ended Job = job_1541805655545_0014
MapReduce Jobs Launched:
Stage-Stage-1: Map: 1 Reduce: 1 Cumulative CPU: 4.32 sec HDFS Read: 3225976
2 HDFS Write: 7 SUCCESS
Total MapReduce CPU Time Spent: 4 seconds 320 msec
OK
426624
Time taken: 31.288 seconds, Fetched: 1 row(s)
hive>
```


Increment 1 - Query 10 - Longest Tweet

```
cloudera@quickstart:~/Downloads
File Edit View Search Terminal Help
In order to change the average load for a reducer (in bytes):
  set hive.exec.reducers.bytes.per.reducer=<number>
In order to limit the maximum number of reducers:
  set hive.exec.reducers.max=<number>
In order to set a constant number of reducers:
  set mapreduce.job.reduces=<number>
Starting Job = job_1541805655545_0015, Tracking URL = http://quickstart.cloudera:8088/proxy/application_1541805655545_0015/
Kill Command = /usr/lib/hadoop/bin/hadoop job -kill job_1541805655545_0015
Hadoop job information for Stage-1: number of mappers: 1; number of reducers: 1
2018-11-09 19:45:06,715 Stage-1 map = 0%, reduce = 0%
2018-11-09 19:45:18,573 Stage-1 map = 100%, reduce = 0%, Cumulative CPU 2.9 sec
2018-11-09 19:45:29,326 Stage-1 map = 100%, reduce = 100%, Cumulative CPU 4.52 sec
MapReduce Total cumulative CPU time: 4 seconds 520 msec
Ended Job = job_1541805655545_0015
MapReduce Jobs Launched:
Stage-Stage-1: Map: 1 Reduce: 1 Cumulative CPU: 4.52 sec HDFS Read: 3226015
2 HDFS Write: 4 SUCCESS
Total MapReduce CPU Time Spent: 4 seconds 520 msec
OK
820
Time taken: 33.2 seconds, Fetched: 1 row(s)
hive>
```

Increment 2 - Code

```
val tweets = spark.read.format(source = "csv").option("header", "true").load(path = "C:\\Users\\calcalocalo\\Documents\\food")
tweets.createOrReplaceTempView(viewName = "tweet")
val v = spark.sql(sqlText = "select id, text, retweetCount from tweet where replyToSID <> 'NA'")
val e = spark.sql(sqlText = "select id as src, replyToSID as dst from tweet where replyToSID <> 'NA'")

val g = GraphFrame(v, e)
g.vertices.show()
g.edges.show()
```

Increment 2 - Edges

| +-----+-----+-----+ | | |
|---------------------|---------------------------------|--------------|
| id | text | retweetCount |
| +-----+-----+-----+ | | |
| NA | FALSE | TRUE |
| NA | FALSE | FALSE |
| NA | FALSE | FALSE |
| NA | FALSE | FALSE |
| NA | FALSE | TRUE |
| NA | FALSE | FALSE |
| NA | FALSE | TRUE |
| NA | FALSE | FALSE |
| 1067919125257818112 | @nova_meat @Moeda... | 0 |
| NA | FALSE | TRUE |
| NA | FALSE | FALSE |
| NA | FALSE | FALSE |
| NA | FALSE | FALSE |
| NA | FALSE | TRUE |
| NA | ""But #Daniel #r...firstseekHim | |
| NA | FALSE | FALSE |
| NA | FALSE | TRUE |
| NA | FALSE | FALSE |
| NA | FALSE | TRUE |
| NA | FALSE | TRUE |
| +-----+-----+-----+ | | |

only showing top 20 rows

Increment 2 - Vertices

```
18/11/28 19:38:57 INFO DAGScheduler: ResultStage 2 (show at SparkGraphFrame.scala:39) finished in 0.037 s
+-----+
18/11/28 19:38:57 INFO DAGScheduler: Job 2 finished: show at SparkGraphFrame.scala:39, took 0.039184 s
|          src|          dst|
+-----+
|          NA|1067920754518437888|
|          NA|1067920694263070720|
|          NA|1067920419930480640|
|          NA|1067920021735817216|
|          NA|1067919970221346818|
|          NA|1067919789648162816|
|          NA|1067919734211923968|
|          NA|1067919495262597126|
|1067919125257818112|1067887026190655491|
|          NA|1067919029522841600|
|          NA|1067918989727154176|
|          NA|1067918692120444930|
|          NA|1067918586482737156|
|          NA|1067918461869809665|
|          NA|          TRUE|
|          NA|1067918239747911680|
|          NA|1067917706199007233|
|          NA|1067917679300960257|
|          NA|1067917632446320640|
|          NA|1067917507472822273|
+-----+
only showing top 20 rows
```