In [2]:

```
# First let's read Twitter ids and screen names of the 577 US congress members
congress_members = spark.read.csv("s3://us-congress-tweets/congress_members.csv", h
eader=True)
congress_members.show()
print("Number of congress members tracked:", congress_members.count())
```

+	++
userid	screen_name
776664410	RepCartwright
240363117	RepTomMarino
837722935095930883	RepScottTaylor
1069124515	RepLaMalfa
818460870573441028	RepTomGarrett
163570705	repcleaver
19739126	GOPLeader
33563161	RepJoseSerrano
2861616083	USRepGaryPalmer
1074518754	SenatorBaldwin
305620929	Call_Me_Dutch
381152398	RepTerriSewell
834069080	RepDavidRouzer
249787913	SenatorCarper
188019606	Clyburn
217543151	SenatorTimScott
39249305	USRepMikeDoyle
33537967	amyklobuchar
249410485	SanfordBishop
23124635	TomColeOK04
+	++

Number of congress members tracked: 577

only showing top 20 rows

In [3]:

```
from pyspark.sql.types import *
import pyspark.sql.functions as F
twitter date format="EEE MMM dd HH:mm:ss ZZZZZ yyyy"
user schema = StructType([
    StructField('created_at',TimestampType(),True),
    StructField('followers_count',LongType(),True),
    StructField('id',LongType(),True),
    StructField('name',StringType(),True),
    StructField('screen_name',StringType(),True)
])
hashtag_schema = ArrayType(StructType([StructField('text',StringType(),True)]))
user mentions schema = ArrayType(StructType([StructField('id',LongType(),True),
                                              StructField('screen name', StringType
(),True)]))
entities schema = StructType([
    StructField('hashtags',hashtag schema,True),
    StructField('user_mentions',user_mentions_schema,True)
    1)
retweeted_status_schema =StructType([
        StructField("id", LongType(), True),
        StructField("in_reply_to_user_id", LongType(), True),
        StructField("in_reply_to_status_id", LongType(), True),
        StructField("created_at", TimestampType(), True),
        StructField("user", user schema)
    ])
tweet schema =StructType([
        StructField("text", StringType(), True),
        StructField("id", LongType(), True),
        StructField("in reply to user id", LongType(), True),
        StructField("in reply to status id", LongType(), True),
        StructField("created at", TimestampType(), True),
        StructField("user", user schema),
        StructField("entities", entities schema),
        StructField("retweeted status", retweeted status schema)
    1)
```

In [4]:

```
root
  -- text: string (nullable = true)
 -- id: long (nullable = true)
 -- in reply to user id: long (nullable = true)
 -- in_reply_to_status_id: long (nullable = true)
  -- created_at: timestamp (nullable = true)
  -- user: struct (nullable = true)
      |-- created_at: timestamp (nullable = true)
      |-- followers count: long (nullable = true)
      -- id: long (nullable = true)
      |-- name: string (nullable = true)
      -- screen_name: string (nullable = true)
  -- entities: struct (nullable = true)
      -- hashtags: array (nullable = true)
           |-- element: struct (containsNull = true)
                |-- text: string (nullable = true)
      -- user_mentions: array (nullable = true)
           |-- element: struct (containsNull = true)
                -- id: long (nullable = true)
                |-- screen name: string (nullable = true)
  -- retweeted status: struct (nullable = true)
      -- id: long (nullable = true)
      -- in reply to user id: long (nullable = true)
      -- in reply to status id: long (nullable = true)
      -- created at: timestamp (nullable = true)
       -- user: struct (nullable = true)
           -- created at: timestamp (nullable = true)
           -- followers count: long (nullable = true)
           -- id: long (nullable = true)
           -- name: string (nullable = true)
           -- screen name: string (nullable = true)
  -- user id: long (nullable = true)
```

```
In [5]:
```

```
root
```

```
|-- created_at: timestamp (nullable = true)
|-- followers_count: long (nullable = true)
|-- id: long (nullable = true)
|-- name: string (nullable = true)
|-- screen_name: string (nullable = true)
|-- user id: long (nullable = true)
```

id|name|screen_na

me| user_id| +-----+----+

null|1047539288705880064|null| 2018-10-03 17:30:03 11 | 1047539288705880064 | |2018-10-03 17:38:39| null | 1047541454313283585 | null | nu 11 | 1047541454313283585 | |2018-10-03 17:57:59| null|1047546320431403008|null| nu 11 | 1047546320431403008 | null | 1047550278332010496 | null | |2018-10-03 18:13:43| nu 11 | 1047550278332010496 | |2018-10-03 18:28:15| null | 1047553936780144642 | null | nu 11 | 1047553936780144642 | 2018-10-03 18:45:53 null | 1047558373435219968 | null | nu 11 | 1047558373435219968 | null | 1047562198107607041 | null | |2018-10-03 19:01:05| nu 11 | 1047562198107607041 |

|2018-10-03 19:10:25| null|1047564545177374721|null| nu 11|1047564545177374721|

|2018-10-03 19:40:09| null|1047572030097428482|null| nu

11|1047572030097428482| |2018-10-03 19:55:48| null|1047575969807183874|null| nu

--+----+ only showing top 10 rows

In [6]:

```
users.select('user_id').distinct().count()
```

```
In [7]:
```

```
root
 -- text: string (nullable = true)
 -- id: long (nullable = true)
  -- in_reply_to_user_id: long (nullable = true)
  -- in reply to status id: long (nullable = true)
  -- created at: timestamp (nullable = true)
 -- user: struct (nullable = true)
      |-- created at: timestamp (nullable = true)
      -- followers_count: long (nullable = true)
      -- id: long (nullable = true)
      -- name: string (nullable = true)
      |-- screen name: string (nullable = true)
  -- entities: struct (nullable = true)
      -- hashtags: array (nullable = true)
           |-- element: struct (containsNull = true)
                -- text: string (nullable = true)
      -- user mentions: array (nullable = true)
           |-- element: struct (containsNull = true)
                -- id: long (nullable = true)
                |-- screen name: string (nullable = true)
  -- retweeted status: struct (nullable = true)
      -- id: long (nullable = true)
       -- in reply to user id: long (nullable = true)
      -- in reply to status id: long (nullable = true)
      -- created at: timestamp (nullable = true)
      -- user: struct (nullable = true)
           -- created at: timestamp (nullable = true)
           -- followers count: long (nullable = true)
           -- id: long (nullable = true)
           -- name: string (nullable = true)
           |-- screen name: string (nullable = true)
 |-- user id: long (nullable = true)
```

9735

In [29]:

```
tweets.select('retweeted_status.id').distinct().count()
```

```
In [27]:
```

10000

In [11]:

```
### Part 1a --> Who are the ten most mentioned users in the sample?
from pyspark.sql.functions import desc

# tweets_x.groupBy('entities.user_mentions.screen_name').count().sort(desc("count")).show(11)

# tweets.groupBy('entities.user_mentions.id').count().sort(desc("count")).show(11)
tweets.groupBy('entities.user_mentions.screen_name').count().sort(desc("count")).show(11)
```

++	+	
screen_name	count	
++	+	
[1]	469	
[RepAdamSchiff]	409	
[marcorubio]	282	
[SenSchumer]	215	
[SpeakerPelosi]	200	
[ChrisMurphyCT]	170	
[SenGillibrand]	112	
[RepMattGaetz]	111	
[RandPaul] 108		
[CoryBooker]	92	
[SteveScalise]	89	
++	+	
only showing top	11 rows	

In [10]:

TrumpShutdown MaduroRegime MAGA Maduro NancyPelosi MuellerReport TrumpResign	int 102 42 29 20 20
TrumpShutdown MaduroRegime MAGA Maduro NancyPelosi MuellerReport TrumpResign	42 29 20
MaduroRegime MAGA Maduro Maduro NancyPelosi MuellerReport TrumpResign	29 20
MAGA Maduro NancyPelosi MuellerReport TrumpResign	20
Maduro NancyPelosi MuellerReport TrumpResign	
NancyPelosi MuellerReport TrumpResign	20
MuellerReport TrumpResign	
TrumpResign	19
: - :	17
	14
BuildTheWall	14
Kavanaugh	14
ForThePeople	14
GreenNewDeal	13
MyHouseMyAmerica	12
transport	12
Democrats	10
Florida	10
Cuba	10
BrowardCounty	9
EEUU	8
MaduroCrimeFamily	8

only showing top 20 rows

In [1]:

```
# Part 1b: Exploratory Data Analysis (Large Scale)¶
# your code here for unique users
trimmed_files = [x[0] for x in spark.read.csv("s3://us-congress-tweets/trimmed/file
s.txt").collect()]
tweets_all = spark.read.parquet(*trimmed_files)
tweets_all.printSchema()
```

Starting Spark application

ID YARN Application ID Kind State

0 application_1572142677721_0001 pyspark idle <u>80.ec2.internal:20888/proxy/application_157214267</u>

SparkSession available as 'spark'.

```
root
```

```
-- text: string (nullable = true)
-- id: long (nullable = true)
-- in reply to user id: long (nullable = true)
-- in reply to status id: long (nullable = true)
-- created_at: timestamp (nullable = true)
-- user: struct (nullable = true)
    -- created at: timestamp (nullable = true)
     -- followers count: long (nullable = true)
     -- id: long (nullable = true)
     -- name: string (nullable = true)
     -- screen name: string (nullable = true)
-- entities: struct (nullable = true)
     -- hashtags: array (nullable = true)
          -- element: struct (containsNull = true)
              |-- text: string (nullable = true)
     -- user mentions: array (nullable = true)
          -- element: struct (containsNull = true)
               -- id: long (nullable = true)
              |-- screen name: string (nullable = true)
-- retweeted status: struct (nullable = true)
     -- id: long (nullable = true)
     -- in reply to user id: long (nullable = true)
     -- in reply to status id: long (nullable = true)
     -- created at: timestamp (nullable = true)
     -- user: struct (nullable = true)
          -- created at: timestamp (nullable = true)
          -- followers count: long (nullable = true)
          -- id: long (nullable = true)
          -- name: string (nullable = true)
          -- screen name: string (nullable = true)
```

In [3]:

```
# your code here for unique users
tweets_all.select('user.id').distinct().count()
```

10749403

In [4]:

```
# your code here for original tweets
tweets_all.select('retweeted_status.id').distinct().count()
```

13458029

In [12]:

```
____+
        mention | count |
 _____+
     SenSchumer
                 776
realDonaldTrump
                 751
  RepAdamSchiff
                 739
     marcorubio|
                 695
                 505
  SpeakerPelosi
    NancyPelosi |
                 368
       RandPaul
                 272
  ChrisMurphyCT |
                 223
  SenGillibrand
                 220
   RepMattGaetz
                 220
     CoryBooker |
                 214
  ChuckGrassley
                 206
      JeffFlake|
                 202
   SteveScalise |
                 179
   amyklobuchar|
                 176
      GOPLeader |
                 164
 RepJerryNadler
                 162
          POTUS
                 159
SenKamalaHarris|
                 152
 SenJeffMerkley
+----+
only showing top 20 rows
```

In [13]:

```
# Top hashtags code and output here
# tweets_all.groupBy('entities.hashtags').count().sort(desc("count")).show(11)
tweets.select(F.explode("entities.hashtags.text").alias("hashtag"))\
      .groupby("hashtag").count().sort(F.desc("count")).show()
```

```
+----+
          hashtag|count|
   ____+
        Venezuela
                    102
                     42
    TrumpShutdown |
     MaduroRegime |
                     29
                     20
             MAGA
           Maduro
                     20 |
      NancyPelosi
                     19
    MuellerReport
                     17
     BuildTheWall
                     14
      TrumpResign |
                     14
                     14 |
        Kavanaugh
     ForThePeople |
                     14
     GreenNewDeal
                     13 |
 MyHouseMyAmerica |
                     12
        transport
                     12 |
          Florida
                     10
             Cuba
                     10
        Democrats |
                     10
    BrowardCounty
                      9
                      8 |
             EEUU
|MaduroCrimeFamily|
only showing top 20 rows
```

In [2]:

```
print(1)
```

In []:

```
1 1 1
1 1 1
1 1 1
1 1 1
1 1 1
1 1 1
1 1 1
1 1 1
1 1 1
1 1 1
1 1 1
(10 points) Part 2: Textual Analysis (LDA)
Using the LDA algorithm provided by the Spark Machine Learning (ML) library, find o
ut the ten most important topics.
Use s3://us-congress-tweetsddcdc for this task (you can reuse tweets_all dataframe
from Part1b).
You may want to work on a small sample first but report your results on the whole d
ataset.
Hint: for better results aggregate all tweets for a user into a single document
1 1 1
1 1 1
1 1 1
1 1 1
1 1 1
1 1 1
1 1 1
1 1 1
1 1 1
1 1 1
1 1 1
```

In [2]:

```
trimmed_files = [x[0] for x in spark.read.csv("s3://us-congress-tweets/trimmed/file
s.txt").collect()]
tweets_all = spark.read.parquet(*trimmed_files)
tweets_all.printSchema()
```

```
root
 |-- text: string (nullable = true)
  -- id: long (nullable = true)
 -- in_reply_to_user_id: long (nullable = true)
  -- in reply to status id: long (nullable = true)
  -- created at: timestamp (nullable = true)
  -- user: struct (nullable = true)
      -- created at: timestamp (nullable = true)
      -- followers count: long (nullable = true)
      -- id: long (nullable = true)
      -- name: string (nullable = true)
      |-- screen name: string (nullable = true)
  -- entities: struct (nullable = true)
      -- hashtags: array (nullable = true)
           -- element: struct (containsNull = true)
                -- text: string (nullable = true)
      |-- user mentions: array (nullable = true)
           |-- element: struct (containsNull = true)
                -- id: long (nullable = true)
                |-- screen name: string (nullable = true)
  -- retweeted status: struct (nullable = true)
      -- id: long (nullable = true)
      -- in reply to user id: long (nullable = true)
      -- in reply to status id: long (nullable = true)
      -- created at: timestamp (nullable = true)
      -- user: struct (nullable = true)
           -- created at: timestamp (nullable = true)
           -- followers count: long (nullable = true)
           -- id: long (nullable = true)
           -- name: string (nullable = true)
           |-- screen name: string (nullable = true)
```

In [3]:

```
tweets_sample = tweets_all.limit(1000)
tweets_sample.count()
```

In [4]:

```
tweets_sample.printschema
```

In [46]:

In [57]:

```
tweets sample.printSchema()
```

```
root
 |-- text: string (nullable = true)
 -- id: long (nullable = true)
  -- in reply to user id: long (nullable = true)
  -- in reply to status id: long (nullable = true)
  -- created at: timestamp (nullable = true)
  -- user: struct (nullable = true)
      |-- created at: timestamp (nullable = true)
      -- followers count: long (nullable = true)
      -- id: long (nullable = true)
      -- name: string (nullable = true)
      -- screen name: string (nullable = true)
  -- entities: struct (nullable = true)
      -- hashtags: array (nullable = true)
           |-- element: struct (containsNull = true)
                |-- text: string (nullable = true)
      -- user mentions: array (nullable = true)
           -- element: struct (containsNull = true)
                -- id: long (nullable = true)
                |-- screen name: string (nullable = true)
  -- retweeted status: struct (nullable = true)
      -- id: long (nullable = true)
      -- in reply to user id: long (nullable = true)
      -- in reply to status id: long (nullable = true)
      -- created at: timestamp (nullable = true)
      -- user: struct (nullable = true)
           |-- created at: timestamp (nullable = true)
           -- followers count: long (nullable = true)
           -- id: long (nullable = true)
            -- name: string (nullable = true)
           -- screen name: string (nullable = true)
```

```
In [45]:
```

```
# tweets_sample.select("text").show(1)
from pyspark.sql.functions import desc
import pyspark.sql.functions as F
test_agg = tweets_sample.groupby('user.id').agg(F.concat_ws(", ", F.collect_list('t
ext')).alias('features'))
test agg.show(2)
+----+
      id
                  features
  ----+
| 1408631|RT @AdyBarkan: Pl...|
|10196912|@SethAbramson @Ch...|
+----+
only showing top 2 rows
In [51]:
test_agg.show(2)
+----+
                 features
+----+
|640893|RT @DrewHolden360...|
|818186|RT @TheDemCoaliti...|
+----+
only showing top 2 rows
In [53]:
test agg.count()
test agg.write.csv("s3://aws-logs-358879944178-us-east-1/tweets sample test agg 102
5 x features", header=True)
In [50]:
test agg.printSchema()
root.
 |-- id: long (nullable = true)
 |-- features: string (nullable = false)
```

993

In [8]:

test_agg.count()

In [63]:

```
test_agg_x = spark.read.csv("s3://aws-logs-358879944178-us-east-1/tweets_sample_tes
t_agg_1025_x_features", header=True)

test_agg_x.count()

test_agg_x.printSchema()

test_agg_x.show(50)
```

```
root
```

```
|-- id: string (nullable = true)
|-- features: string (nullable = true)
```

т .	
id	features
+	h
	@seungminkim @Dea
8406492	RT @MoveOn: #MeTo
9233842	RT @JeffBezos: Th
9715012	Cecelia Corey fro \ldots
10565952	RT @PPact: .@sena
Your duty is to them	not partisan pol
12980002	RT @RBrownlowe1:
14062467	RT @SenWarren: La
14167654	RT @OTOOLEFAN: Th
14352930	@JeffFlake - Wome
15050912	@SenSanders Are y
15254388	RT @CheriJacobus:
15932264	@TalbertSwan @Lin
15985211	RT @senatemajldr:
16117237	RT @DougJones: So
16376378	@gordy shanks @Pa
•	RT @SenWarren: La
16479240	@senatemajldr @Ca
16504310	@Rep_Hunter When
	.@SenatorCollins
	RT @SteveSchmidtS
16592306	@LindseyGrahamSC
17223391	@LindseyGrahamSC
17224548	RT @DerekCressman
17230367	@d_e_mol @Gordon
17278992	RT @Fight4Change2
Glad you stood up.	null
Now continue the	null
17493647	RT @howeasyweforg
WHAT THE HELL KIN	null
17495913	@TalbertSwan @Lin
17553587	@kerrijacobi @Sen
He totally lied	several times
\"I don't care if	null
17645505	RT @Lawrence: He
·	@DrDenaGrayson @J
•	RT @SenWhitehouse
•	RT @JeffMerkley:
•	RT @TomCottonAR:
1	RT @charlescwcook
•	Senator @LisaMurk
·	RT @RepAdamSchiff
•	@SenDeanHeller
	RT @beth2_k3a: So
:	RT @TheDemCoaliti
:	@SenSanders Buy B
•	RT @kim: @SteveSc
	@FoxNews @SenJohn
	RT @SteveSchmidtS
20952040	@matthewamiller @

```
t-----t
only showing top 50 rows

In [60]:

test_agg_x.printSchema()

root
    |-- id: string (nullable = true)
    |-- features: string (nullable = true)

In [ ]:

# Remove the stop words
splitRDD_no_stop_words = splitRDD_no_stop.map(lambda w: (___, ___))

In [ ]:
```

In [64]:

```
from pyspark.ml.clustering import LDA
from pyspark.sql import SparkSession
dataset = spark.read.format("libsvm").load(test_agg_x)
# dateset = test_agg_x
# Trains a LDA model.
lda = LDA(k=10, maxIter=10)
model = lda.fit(dataset)
11 = model.logLikelihood(dataset)
lp = model.logPerplexity(dataset)
# Describe topics.
topics = model.describeTopics(3)
topics.show(truncate=False)
# Shows the result
transformed = model.transform(dataset)
transformed.show(truncate=False)
# $example off$
spark.stop()
```

```
'DataFrame' object has no attribute '_get_object_id'
Traceback (most recent call last):
  File "/usr/lib/spark/python/lib/pyspark.zip/pyspark/sql/readwriter.p
y", line 170, in load
    return self. df(self. jreader.load(self. spark. sc. jvm.PythonUtil
s.toSeq(path)))
  File "/usr/lib/spark/python/lib/py4j-0.10.7-src.zip/py4j/java gatewa
y.py", line 1248, in __call__
    args_command, temp_args = self._build_args(*args)
  File "/usr/lib/spark/python/lib/py4j-0.10.7-src.zip/py4j/java gatewa
y.py", line 1212, in build args
    (new_args, temp_args) = self._get_args(args)
  File "/usr/lib/spark/python/lib/py4j-0.10.7-src.zip/py4j/java_gatewa
y.py", line 1199, in _get_args
    temp arg = converter.convert(arg, self.gateway client)
  File "/usr/lib/spark/python/lib/py4j-0.10.7-src.zip/py4j/java collect
ions.py", line 501, in convert
    java list.add(element)
  File "/usr/lib/spark/python/lib/py4j-0.10.7-src.zip/py4j/java_gatewa
y.py", line 1248, in call
    args command, temp_args = self._build_args(*args)
  File "/usr/lib/spark/python/lib/py4j-0.10.7-src.zip/py4j/java_gatewa
y.py", line 1218, in build args
    [get command part(arg, self.pool) for arg in new args])
  File "/usr/lib/spark/python/lib/py4j-0.10.7-src.zip/py4j/java_gatewa
y.py", line 1218, in <listcomp>
    [get command part(arg, self.pool) for arg in new args])
  File "/usr/lib/spark/python/lib/py4j-0.10.7-src.zip/py4j/protocol.p
y", line 298, in get command part
    command part = REFERENCE TYPE + parameter. get object id()
  File "/usr/lib/spark/python/lib/pyspark.zip/pyspark/sql/dataframe.p
y", line 1301, in getattr
    "'%s' object has no attribute '%s'" % (self. class . name , nam
AttributeError: 'DataFrame' object has no attribute ' get object id'
In [29]:
name '__file__' is not defined
Traceback (most recent call last):
  File "<stdin>", line 32, in config
NameError: name ' file ' is not defined
```

1 at _1-2_1100cm	
In []:	
1 1 1	
111	
1.11	
(10 points) Part 3a: MapRedce In this task, design a MapReduce program in python that reads all the ts (no retweets) in the sample tweets (congress-sample-10k.json.gz) a is a reply to another tweet then output a record of the form <src_ic dst_user="" t_id,="">.</src_ic>	and if a tweet
Create a small cluster (2 or 3 nodes) as per the AWS Guide and then s ster and use Hadoop streaming to execute your mapreduce program.	sh to your clu
Note: the Hadoop streaming jar file can be found at /usr/lib/hadoop-mp-streaming.jar	napreduce/hadoo
In []:	
To 1.	
In []:	

In []: 1 (5 points) Part 3b: Going Large-Scale with MapReduce¶ Rerun the same MapReduce job above but on the whole dataset (s3://us-congress-tweet s/raw/*.snappy). All the files under s3://us-congress-tweets/raw can be read from t he following file: s3://us-congress-tweets/raw/files.txt Use shell scripting to parse this file and prepare the input to your MapReduce job as comma seperated string of all the files. (e.g. your input should be like this s 3://us-congress-tweets/raw/part-00000.snappy,s3://us-congress-tweets/raw/part-0000 1.snappy,s3://us-congress-tweets/raw/part-00002.snappy,...) Inspecting the job logs, how many files did the job operate on? how many input spli ts were there? 1 In []: In []: In []:

In	[1]:				
Starting Spark application					
ID	YARN Application ID	Kind	State		
0	application_1572499199263_0001	pyspark	idle	Link (http:// 100.ec2.internal:20888/proxy/application_157249919	
SparkSession available as 'spark'.					
2					
In	[]:				