Q1.

Three steps:

1). Collect tweets using twitter streaming

```
System.setProperty("twitter4j.oauth.consumerKey", "R2v2WMKrF7UGipifRcMkOyjT1"
System.setProperty("twitter4j.oauth.consumerSecret", "InkVklJfUsJPQyA17GzGks9
System.setProperty("twitter4j.oauth.accessToken", "3630687739-9y2qw6YKOMgeApm
System.setProperty("twitter4j.oauth.accessTokenSecret", "IBjoDz21BTBaXwnJ13jy

//Create a spark configuration with a custom name and master
// For more master configuration see https://spark.apache.org/docs/1.2.0/sub.
val sparkConf = new SparkConf().setAppName("STweetsApp").setMaster("local[*]"
//Create a Streaming Context with 2 second window
val ssc = new StreamingContext(sparkConf, Seconds(2))
//Using the streaming context, open a twitter stream (By the way you can also
//Stream generates a series of random tweets
val stream = TwitterUtils.createStream(ssc, None, filters)
stream.print()
//Map : Retrieving text
val getText = stream.flatMap(status => status.getText.split(" "))
```

2). Do MapReduce on the collected data.

```
//Finding the top word used on 6 second window
val topCounts3 = getText.map((_, 1)).reduceByKeyAndWindow(_ + _, Seconds(6))
.map{case (word, count) => (count, word)}
.transform(_.sortByKey(false))
```

3). Store results in a string and send it to Android phone.

Just get the top 20 results

```
// Print popular words
topCounts3.foreachRDD(rdd => {
  val topList = rdd.take(20)
  println("\nPopular words used in last 6 seconds (%s total):".format(rdd.count()))
  topList.foreach{case (count, word) => println("%s (%s times)".format(word, count))}

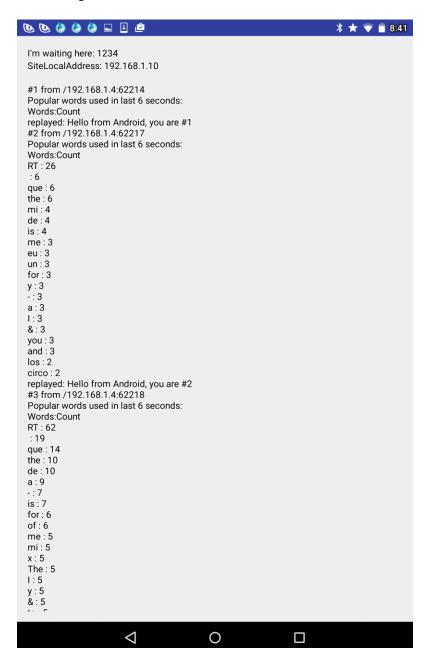
var s:String="Popular words used in last 6 seconds (%s total): \nWords:Count \n"
  topList.foreach{case(count,word)=>{
    s+=word+" : "+count+"\n"
  }}
  SocketClient.sendCommandToRobot(s)
})
```

Screenshots:

Run log:

```
16/02/27 20:41:16 INFO DAGScheduler: Job 9 finished: count
Popular words used in last 6 seconds (415 total):
RT (26 times)
 (6 times)
que (6 times)
the (6 times)
mi (4 times)
de (4 times)
is (4 times)
me (3 times)
eu (3 times)
un (3 times)
for (3 times)
y (3 times)
- (3 times)
a (3 times)
I (3 times)
& (3 times)
you (3 times)
and (3 times)
los (2 times)
circo (2 times)
16/02/27 20:41:17 INFO MemoryStore: Block input-0-1456627.
```

Android phone:



Three steps:

1) Get the training data from twitter using object: GetTrainingData.

In order to do the category analysis, here I define three different hashtag categories: food, sport, and others. Others means hashtag is not food or sport. Tweets belong to the three different categories will be stored in different folders: hashtag.food, hashtag.sport, hashtag.other. (Only the non-empty data will be stored)

2) Get the testing data from twitter.

Testing data will be stored when the program is running.

```
val stream = TwitterUtils.createStream(ssc, None, filters)
    stream.print()

//Testing data
val testing = stream.filter(!_.getHashtagEntities.isEmpty).map(_.getText)

val testingData = testing.foreachRDD(rdd => {
    val count = rdd.count()
    if (count > 0){
        rdd.saveAsTextFile("data/testing/")
      }
})

ssc.start()
ssc.awaitTerminationOrTimeout(10)
```

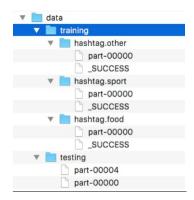
- 3) Do machine learning algorithm to category the upcoming testing tweets.
- a) Train the training data
- b) Do the prediction on the testing data.

```
//Train tweets datasets
val sc = ssc.sparkContext
val stopWords = sc.broadcast(loadStopWords("/stopwords.txt")).value
val labelToNumeric = createLabelMap("data/training/")
println(labelToNumeric)
var model: NaiveBayesModel = null
val training = sc.wholeTextFiles("data/training/*")
 .map(rawText => createLabeledDocument(rawText, labelToNumeric, stopWords))
val X_train = tfidfTransformer(training)
X_train.foreach(vv => println(vv))
model = NaiveBayes.train(X_train, lambda = 1.0)
val lines=sc.wholeTextFiles("data/testing/*")
val data = lines.map(line => {
  val test = createLabeledDocumentTest(line._2, labelToNumeric, stopWords)
 println(test.body)
  test
})
val X_test = tfidfTransformerTest(sc, data)
val predictionAndLabel = model.predict(X_test)
println("PREDICTION")
predictionAndLabel.foreach(x => {
  labelToNumeric.foreach { y \Rightarrow if (y._2 == x)  {
   println(y._1)
})
```

2) and 3) are done in one object.

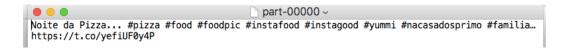
Screenshots:

Folder structure



Example of training data:

Food



Sport

part-00000 ~

#tickets #deals NASCAR SPRINT CUP SERIES/ AUTO CLUB 400, 2 tickets 3/20/2016 https://t.co/arnMMUG8Cg #sports #cheap #ebay

Other

```
part-00000 ~
RT @ethiopianpeter: If it comes between @realDonaldTrump vs @HillaryClinton for president, I
will chose not to vote #SouthCarolinaPrimary
I'm trying to binge watch all of Fuller House since we're getting rid of Netflix tomorrow but
the wifi decided to die. 00
RT @la_iquanatv: Muere niña víctima del hambre en Colombia https://t.co/nNMAXU9S0L https://
t.co/sEZtw8Wwix
RT @EthanDolan: So close to meeting you all 🐨 😁 😊
RT @SyahmirulAmir: Drama melayu..asal budak u je kehulu hilir pegang buku kat tangan..dia xtau
ke real life student g class kertas pon mint...
RT @EthanDolan: So close to meeting you all 🐷 🕾 😊
RT @sorelatabIe: When your phone autocorrects to its ducking lit https://t.co/pLbFMaIMQv
@MEI_KMYD
おはよぉ!
RT @EthanDolan: So close to meeting you all 🐨 🕾 😊
RT @oh_jessJessJESS: RT @iDntWearCondoms Ladies u just won 10 MILL... Your man in jail, bail 6
mill... How much do u have? https://t.co/Dhe...
I have really bad taste in guys sometimes
@sweet_mingal KKKKKKK ja perdoou?
RT @kplove8226: These Things that Mean More to Men Than "I Love You" https://t.co/WuKJ1zyQ9j
https://t.co/BnmAtVPVFn
En un rato a lo de Rodri
RT @HmadiFatma: #ihabamir
#ایهاب_مغربی_حتی_النخاع
مغربی حر بحبه وأخلاقه جعل علم المغرب
يرفع في الجزائر والجزائري يرفع في المغرب
  ** https:
```

Example of testing data

```
*LIVE NOW*
*Husband & WIFEY! play RL*

https://t.co/TSEKWPRpkE

#RocketLeague #twitch @dirkened @RocketLeague https://t.co/Va06xixmq0
```

Run log (prediction results):

```
16/02/27 21:01:07 INFO MemoryStore: Block input-0-1456628467000 stored as bytes in mem
16/02/27 21:01:07 INFO BlockManagerInfo: Added input-0-1456628467000 in memory on loca
16/02/27 21:01:07 WARN BlockManager: Block input-0-1456628467000 replicated to only 0
16/02/27 21:01:07 INFO BlockGenerator: Pushed block input-0-1456628467000
16/02/27 21:01:07 INFO SparkContext: Starting job: foreach at TwitterCategoryAnalysis. 16/02/27 21:01:07 INFO DAGScheduler: Got job 31 (foreach at TwitterCategoryAnalysis.sc
16/02/27 21:01:07 INFO DAGScheduler: Final stage: ResultStage 30 (foreach at TwitterCa
16/02/27 21:01:07 INFO DAGScheduler: Parents of final stage: List()
16/02/27 21:01:07 INFO DAGScheduler: Missing parents: List()
16/02/27 21:01:07 INFO DAGScheduler: Submitting ResultStage 30 (MapPartitionsRDD[74] a 16/02/27 21:01:07 INFO MemoryStore: Block broadcast_36 stored as values in memory (est
16/02/27 21:01:07 INFO MemoryStore: Block broadcast_36_piece0 stored as bytes in memor
16/02/27 21:01:07 INFO BlockManagerInfo: Added broadcast_36_piece0 in memory on localh
16/02/27 21:01:07 INFO SparkContext: Created broadcast 36 from broadcast at DAGSchedul
16/02/27 21:01:07 INFO DAGScheduler: Submitting 2 missing tasks from ResultStage 30 (M
16/02/27 21:01:07 INFO TaskSchedulerImpl: Adding task set 30.0 with 2 tasks
16/02/27 21:01:07 INFO TaskSetManager: Starting task 0.0 in stage 30.0 (TID 131, local 16/02/27 21:01:07 INFO TaskSetManager: Starting task 1.0 in stage 30.0 (TID 132, local
16/02/27 21:01:07 INFO Executor: Running task 0.0 in stage 30.0 (TID 131)
16/02/27 21:01:07 INFO Executor: Running task 1.0 in stage 30.0 (TID 132)
16/02/27 21:01:07 INFO BlockManager: Found block rdd_65_1 locally 16/02/27 21:01:07 INFO BlockManager: Found block rdd_65_1 locally
16/02/27 21:01:07 INFO BlockManager: Found block rdd_65_0 locally
16/02/27 21:01:07 INFO BlockManager: Found block rdd_65_0 locally 16/02/27 21:01:07 INFO JniLoader: successfully loaded /var/folders/_n/x33gb1l54b132v0p
16/02/27 21:01:07 INFO Executor: Finished task 1.0 in stage 30.0 (TID 132). 2044 bytes 16/02/27 21:01:07 INFO Executor: Finished task 0.0 in stage 30.0 (TID 131). 2044 bytes
16/02/27 21:01:07 INFO TaskSetManager: Finished task 1.0 in stage 30.0 (TID 132) in 82
16/02/27 21:01:07 INFO TaskSetManager: Finished task 0.0 in stage 30.0 (TID 131) in 84
16/02/27 21:01:07 INFO TaskSchedulerImpl: Removed TaskSet 30.0, whose tasks have all c
16/02/27 21:01:07 INFO DAGScheduler: ResultStage 30 (foreach at TwitterCategoryAnalysi
16/02/27 21:01:07 INFO DAGScheduler: Job 31 finished: foreach at TwitterCategoryAnalys
hashtag, food
hashtag.other
hashtag.food
hashtag.other
hashtag.food
hashtag.food
hashtag.food
hashtag.food
16/02/27 21:01:07 INFO StreamingContext: Invoking stop(stopGracefully=false) from shut
```