

# Sentiment Analysis on Tweets



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Twitter

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right now

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# PROJECT GOAL



- PROCESS REAL TWITTER DATASETS
- UTILIZE TWITTER API
- EXTRACT MEANINGFUL DATA
- NLP(NATURAL LANGUAGE PROCESS)
- PERFORM SENTIMENT ANALYSIS

# USER INPUT



- A CITY NAME
- OR
- A COMPANY NAME

# SYSTEM OUTPUT



- SENTIMENT SCORE FOR
- THE CITY WEATHER IN LAST 7 DAYS
- OR
- THE COMPANY STOCK IN LAST 7 DAYS

## USER INPUT



- NOTHING  
OR
- A KEYWORD

## SYSTEM OUTPUT



- TOP 10 POPULAR HASHTAGS FROM  
UPCOMING TWITTER CONTAINING THAT  
KEYWORD IN A 5MIN WINDOW
- THE COUNT OF TWEETS AND SENTIMENT  
SCORE FOR EACH HASHTAG
- A BAR CHART SHOWING THE RESULT\*

## USER INPUT



- NOTHING  
OR
- A KEYWORD

## SYSTEM OUTPUT



- TOP 10 POPULAR LOCATIONS FROM  
UPCOMING TWITTER CONTAINING THAT  
KEYWORD IN A 10HOUR WINDOW
- THE COUNT OF TWEETS AND SENTIMENT  
SCORE FOR EACH LOCATION
- A MAP SHOWING THE RESULT\*

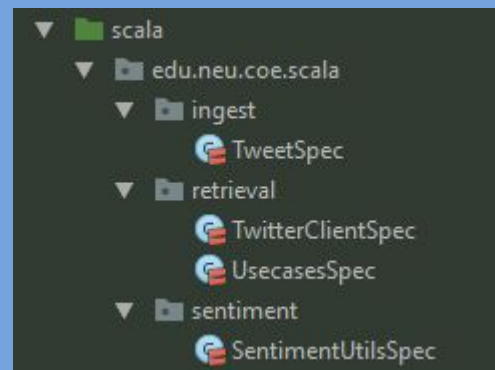
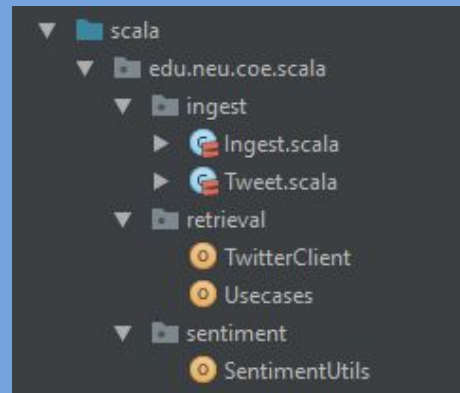


# METH- ODOLOGY

- ACQUIRING (SEARCH API & STREAMING API)
- PARSING (JSON FORMAT)
- FILTERING (LANGUAGE & GEOLOCATION)
- CLEANING (SPECIAL CHARACTERS)
- CALCULATING SENTIMENT (STANFORD NLP)
- MAPPING & REDUCING (SPARK)
- VISUALIZATION (APACHE ZEPPELIN)

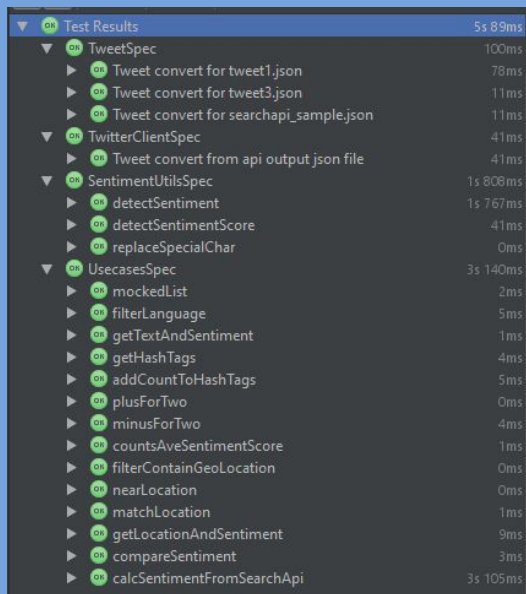
# PROGRAMMING

- Ingest.scala
- Tweet.scala
- TwitterClient
- Usecases
- SentimentUtils
- Unit Test



# UNIT TEST

- TOTAL 43 UNIT TESTS
- 74% CLASSES COVERED
- 60% LINES COVERED



Test Results	5s 89ms
▼ TweetSpec	100ms
▶ Tweet convert for tweet1.json	78ms
▶ Tweet convert for tweet3.json	11ms
▶ Tweet convert for searchapi_sample.json	11ms
▼ TwitterClientSpec	41ms
▶ Tweet convert from api output json file	41ms
▼ SentimentUtilsSpec	1s 808ms
▶ detectSentiment	1s 767ms
▶ detectSentimentScore	41ms
▶ replaceSpecialChar	0ms
▼ UsecasesSpec	3s 140ms
▶ mockedList	2ms
▶ filterLanguage	5ms
▶ getTextAndSentiment	1ms
▶ getHashTags	4ms
▶ addCountToHashTags	5ms
▶ plusForTwo	0ms
▶ minusForTwo	4ms
▶ countsAveSentimentScore	1ms
▶ filterContainGeoLocation	0ms
▶ nearLocation	0ms
▶ matchLocation	1ms
▶ getLocationAndSentiment	9ms
▶ compareSentiment	3ms
▶ calcSentimentFromSearchApi	3s 105ms





# ACCEPTANCE CRITERIA

- VERIFY ANALYSIS RESULT WITH TEST TWEETS
  - Included in unit test
  - The accuracy should reach 90%
- VERIFY ANALYSIS RESULT WITH KEYWORD RELATED TO WEATHER JUDGEMENT
  - Compare 2 city's weather in 7 days
  - The accuracy should reach 70%
- VERIFY ANALYSIS RESULT WITH KEYWORD RELATED TO STOCK ASSESSMENT
  - Compare 2 company's stock in 7 days
  - The accuracy should reach 80%



# WEATHER

Boston vs. New York



BOSTON GRADE: 1.35555556

NEW YORK GRADE: 1.41587301

PREDICTION: New York better than Boston

REAL WEATHER REPORT:

 56° 40°	 52° 45°	 57° 38°	 60° 47°	 55° 45°	 52° 44°	 57° 43°
 62° 42°	 73° 51°	 75° 58°	 75° 55°	 64° 48°	 63° 50°	 61° 48°

TRUTH: New York more pleasant than Boston

RESULT: accurate



# WEATHER

Boston vs. SF



> > >















BOSTON GRADE: 1.35555556

SF GRADE: 1.20634920

PREDICTION: Boston better than San Fran

REAL WEATHER REPORT:

 56° 40°	 52° 45°	 57° 38°	 60° 47°	 55° 45°	 52° 44°	 57° 43°
 59° 44°	 62° 47°	 64° 53°	 64° 53°	 58° 50°	 60° 47°	 66° 48°

TRUTH: San Francisco more pleasant than Boston

RESULT: in-accurate



# WEATHER ANALYSIS SUMMARY

Among 10 cities over 7 days

TOTAL PREDICTION ACCURACY:

$8/10 = 80\%$

SUCCESSFULLY ACHIEVED

① ACCEPTANCE CRITERIA reach 80%



# STOCK

## Apple Inc. vs. GNC

 > > > 

APPLE INC. GRADE: 1.09797297

GNC GRADE : 1.06976744

PREDICTION: Apple Inc. better than GNC

### REAL STOCK REPORT:

DATE	OPEN	HIGH	LOW	CLOSE	
04/17/2017	141.48	141.88	140.87	141.83	16,529,130
04/13/2017	141.91	142.38	141.05	141.05	17,775,510
04/12/2017	141.6	142.15	141.01	141.8	20,320,420
04/11/2017	142.94	143.35	140.06	141.63	30,341,520

04/17/2017	7.31	7.38	7.08	7.24	2,968,706
04/13/2017	7.26	7.33	7.015	7.3	2,624,080
04/12/2017	7.44	7.44	7.21	7.27	2,404,252
04/11/2017	7.14	7.51	7.07	7.42	3,792,926

TRUTH: GNC better than Apple Inc.

RESULT: in-accurate



# STOCK

## Apple Inc. vs. Netflix



> > >



APPLE INC. GRADE: 1.09797297

Netflix GRADE : 1.41774193

PREDICTION: Netflix better than Apple Inc.

### REAL STOCK REPORT:

DATE	OPEN	HIGH	LOW	CLOSE	
04/17/2017	141.48	141.88	140.87	141.83	16,529,130
04/13/2017	141.91	142.38	141.05	141.05	17,775,510
04/12/2017	141.6	142.15	141.01	141.8	20,320,420
04/11/2017	142.94	143.35	140.06	141.63	30,341,520
04/17/2017	144.43	147.32	144.43	147.25	15,993,460
04/13/2017	144.25	144.55	142.76	142.92	3,676,127
04/12/2017	144.85	145.74	143.55	143.83	4,383,524
04/11/2017	144.28	144.54	141.98	144.35	4,619,263

TRUTH: Netflix better than Apple Inc.

RESULT: accurate



# STOCK ANALYSIS SUMMARY

Among 10 cities over 7 days

TOTAL PREDICTION ACCURACY:

$8/10 = 80\%$

SUCCESSFULLY ACHIEVED



ACCEPTANCE CRITERIA reach 80%

# MOST POPULAR HASHTAG

5mins duration



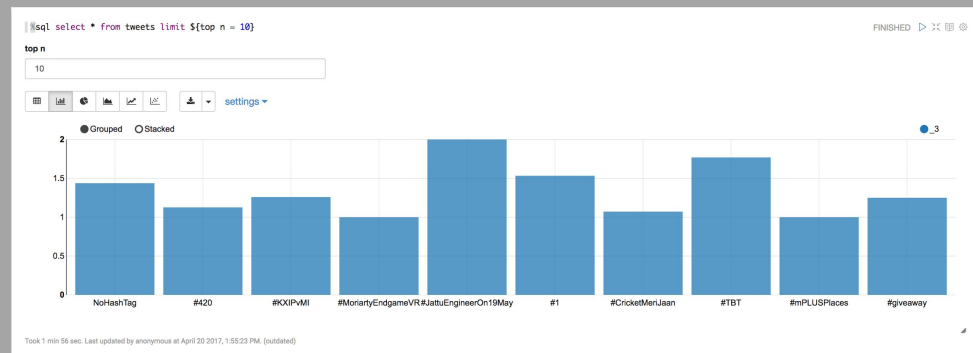
TABLE:

sql select \* from tweets limit \${top n} = 10

_1	_2	_3
NoHashTag	11914	1.437888198757764
#420	95	1.1263157894736842
#KXIPvMI	27	1.2592592592592593
#MoriartyEndgameVR	22	1.0
#JatttuEngineerOn19May	18	2.0
#1	15	1.5333333333333334
#CricketMeriJaani	14	1.0714285714285714
#TBT	13	1.7692307692307692
#mPLUSPlaces	12	1.0

Took 1 min 56 sec. Last updated by anonymous at April 20 2017, 1:55:23 PM. (outdated)

CHART:



TOTAL DIFFERENT HASHTAG COUNT: 2279





# SENTIMENT MAPPING

10 hour duration

[http://35.166.178.247:8090/#/notebook/2CFBT  
GPRZ](http://35.166.178.247:8090/#/notebook/2CFBTGPRZ)

# CODE REPOSITORY



[https://github.com/yingy4/CSYE7200\\_FinalProject\\_Team2\\_Spring2017](https://github.com/yingy4/CSYE7200_FinalProject_Team2_Spring2017)

# REFERENCE

- Course Repo
- <http://140dev.com/twitter-api-programming-tutorials/agggregating-tweets-search-api-vs-streaming-api/>
- <https://www.udemy.com/apache-spark-with-scala-hands-on-with-big-data/learn/v4/overview>
- <https://community.hortonworks.com/content/kbentry/90320/add-leaflet-map-to-zeppelin-notebook.html>
- <https://dev.twitter.com/rest/public>
- <https://github.com/vspiewak/twitter-sentiment-analysis/blob/master/src/main/scala/com/github/vspiewak/util/SentimentAnalysisUtils.scala>