Project Goals

Build a big data storage, retriveal and analytic pipeline with Twitter data

- End to end Twitter data storage and retrival process
- Demo various data sources: online restful, batch, and streaming
- Apply basic sentiment analysis on the data
- Scraping online data to enrich analytics and data serving
- Use tableau to visualized analytics



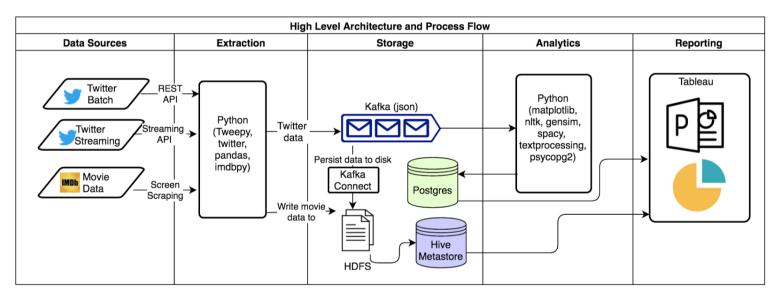






Architecture

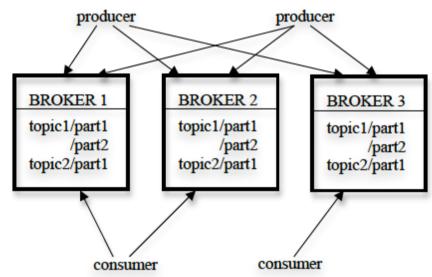
Use Kafka as ingest layer to interface Twitter restful API and streaming API; Store persist data to Hadoop HDFS. Use python to analysis streaming data and store analytic results in postgres for Tableau to consume and visualize



Implementation Notes

Why Kafka?

- Kafka is designed for scale-out distributed messagin system for log
- Kafka cluster can store large dataset for longer period
- Allow clients to read in different orders
- Internal zookeeper allow producers and consumers to work at different speeds
- Handle data bursts and fault tolerance



How is Kafka different from other real time data tools

- Zookeeper: order messages within a partition
- Scale-out: for distributed across machines
- Persistence: hold a lot of data
- Schema: do not apply schema, trade-off complexity with speed

Kafak Producer Example: A listener to tweet streams

Language Python

```
from tweepy.streaming import StreamListener
from tweepy import OAuthHandler
from tweepy import Stream
from kafka import KafkaProducer
from kafka.client import SimpleClient
from kafka.consumer import SimpleConsumer
from kafka.producer import SimpleProducer
client = SimpleClient("localhost:9092")
producer = SimpleProducer(client)
consumer key = "cW3RTKoG5kiNkzfdbSb8aBMyY"
consumer secret = "iwj5u0ncngUMYk2BMNkF3WwL9VR7FXCPvXJVYwbDNDmuy8yRkH
access token = "4175914697-j5Ghb209PGZ0kobm0cnh9nZ2zMwrrigfVGczYbA"
access token secret = "01K2XYfh1oksmpymqgTRBLrhR5nGLMUr84N0yhicWuUq2"
class StdOutListener(StreamListener):
""" A listener handles tweets that are received from the stream.
This is a basic listener that just prints received tweets to stdout.
  def on data(self, data):
    producer.send messages('movies', str(data))
    print(data)
    return True
  def on error(self, status):
    print(status)
  if __name__ == '__main__':
    1 = StdOutListener()
    auth = OAuthHandler(consumer_key, consumer_secret)
    auth.set access token(access token, access token secret)
    stream = Stream(auth, 1)
```

```
stream.filter(track=['#moana'],languages=["en"])
```

Kafak Consumer Example: A client consumes records from the kafka cluster

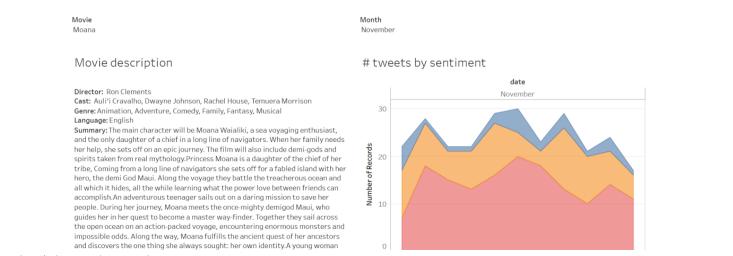
```
Language Python
               from kafka import KafkaConsumer
               import pandas as pd
               import json
               import pandas as pd
               import nltk
               import spacy
               import textprocessing
               import re
               from nltk.sentiment.vader import SentimentIntensityAnalyzer as Vade
               def main():
                   100
                   main function initiates a kafka consumer, initialize the tweetd
                   Consumer consumes tweets from producer extracts features, clean
                   calculates sentiments and loads the data into postgres database
                   111
                   # set-up a Kafka consumer
                   consumer = KafkaConsumer('movies')
                   tweets,conn, dbcur = initialize(db_name = "tweetdata")
                   for msg in consumer:
                       output = []
                       output.append(json.loads(msg.value))
                       print output
```

```
print '\n'
        # Function to extract features from tweets
        extracttweetfeatures(tweets, output)
        # Text cleaning
        cleantweettext(tweets)
        # Calculate sentiment using nltk vader sentiment library
        calculatesentiments(tweets)
        # Create data frame
        cleanse_dataframe_and_load(tweets, conn, dbcur)
if __name__ == "__main__":
 main()
```

Twitter DataFrame for Analytics

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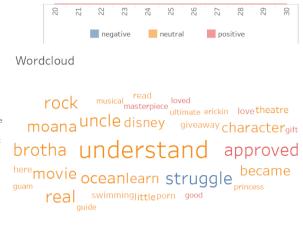
Tableau Analytics Dashbroad



uses her navigational talents to set sail for a fabled island. Joining her on the adventure is her hero, the legendary demi-god Maui.

Top positive tweets

- 1: Moana is so brave, smart, strong, crafty, athletic, heroic, incredible, amazing, never been done before. I'm not exaggerating. #Moana
- 2: When Te Fiti was revealed I was like "WOW. OH WOW. OH MY GOD! WOW! OH... OH... OH MY GOD!" #Moana
- 3: RT @Simszter: Ended up watching #Moana again lol best choice! It motivated me again to be awesome. "It's who I am. Who I truly am" :) @TheRŠ-_ 4: Just finished watching #moana, it was a beautiful movie, amazing story and just
- awesome. GreatŠ—_ https://t.co/gFVmBn1oyo 5: Just saw #Moana with my 3 year old sister and we loved it. Very beautiful and
- detailed_™... Great job and I loved @TheRock 's character!



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