TWITTER SENTIMENT ANALYSIS

Submitted in Partial fulfillment of the requirements for the degree of **BACHELOR OF TECHNOLOGY** in Computer Science and Engineering

Six Weeks Industrial

Training Report

Submitted by

Kushagra Mittal 1731842



I.K. GUJRAL PUNJAB TECHNICAL UNIVERSITY, JALANDHAR

DEPARTMENT OF COMPUTER SCIENCE AND ENGINEERING, IKGPTU Main Campus, JALANDHAR

Page 2: Certificate from the Industry (Should be on the Industry's letterhead)
COMPANY CERTIFICATE PHOTOCOPY

Acknowledgement

"Gratitude is not a thing of expression; it is more matters of feeling."

There is always a sense of gratitude which one express towards others for their help and supervision in achieving the goals.

I would like to express my deep gratitude to Mr. Bipul Shahi, my training mentor for their constant co-operation. He was always there with his competent guidance and valuable suggestions throughout the pursuance of this research project.

Signature of the student

Table of Contents

Chapter	Contents	Page No.
1	Introduction to the Industry / Institution	
	1.1 Nature of business of the Industry / Institution	
	1.2 Different products / activities of the Industry / Institution	
2	Industrial Training	
	2.1 Industrial Training at a Glance (brief about fields chosen)	
	2.2 Details about important areas (self assessment report – 2 / 3 important points maximum)	
	2.3 Observations, Results and Conclusions	
3	What I learned from Industrial Training / my Industry?	

Annexure A: Coding, Data Sheets, Data Flow Diagrams,	
Drawings (If any) etc	
Annexure B: Awards / Certificates	
Annexure C: References	

INTRODUCTION TO COMPANY

Diginique TechLabs, an IIT Roorkee alumni venture, is one of India's leading organizations in the field of modern age technologies. Team Diginique has been working day and night towards the betterment of students in the field of technology and management and provides a steady source of highly skilled talent to the nation as well as overseas.

We constantly evolve our teaching methods, and provide quality workshops, excellent trainings and smart services to our students/clients, whom we see as unique individuals with different interests and aspirations. We keep the quality of our course content and trainers unparaDiginique TechLabs, an IIT Roorkee alumni venture, is one of India's leading organizations in the field of modern age technologies. Team Diginique has been working day and night towards the betterment of students in the field of technology and management and provides a steady source of highly skilled talent to the nation as well as overseas.





INDUSTRIAL TRAINING

INDUSTRIAL TRAINING AT GLANCE:

DATA SCIENCE: Data science is an interdisciplinary field of scientific methods, processes, algorithms and systems to extract knowledge or insights from data in various forms, either structured or unstructured, similar to data mining.

Big Data Analytics or Data Science is a very common term in IT industry because everyone knows this is some fancy term which is gonna help us to deal with this huge amount of data we are generating these days.

Without the expertise of professionals who turn cutting-edge technology into actionable insights, Big Data is nothing. Today, more and more organizations are opening up their doors to big data and unlocking its power—increasing the value of a data scientist who knows how to tease actionable insights out of gigabytes of data.

A data scientist examines and explores the organization's data, after which they recommend and prescribe certain actions that will help improve the institution's performance, better engage customers, and ultimately increase profitability.

Most data scientists in the industry have advanced and training in statistics, math, and computer science. Their experience is a vast horizon that also extends to data visualization, data mining, and information management. It is fairly common for them to have previous experience in infrastructure design, cloud computing, and data warehousing.

Data science can add value to any business who can use their data well. From statistics and insights across workflows and hiring new candidates, to helping senior staff make better-informed decisions, data science is valuable to any company in any industry.

MACHINE LEARNING: Machine Learning is the field of study that gives computers the capability to learn without being explicitly programmed. ML is one of the most exciting technologies that one would have ever come across. As it is evident from the name, it gives the computer that which makes it more similar to humans: *The ability to learn*. Machine learning is actively being used today, perhaps in many more places than one would expect.

- Prediction Machine learning can also be used in the prediction systems.
 Considering the loan example, to compute the probability of a fault, the system will need to classify the available data in groups.
- **Image recognition** Machine learning can be used for face detection in an image as well. There is a separate category for each person in a database of several people.
- Speech Recognition It is the translation of spoken words into the text. It is used in voice searches and more. Voice user interfaces include voice dialing, call routing, and appliance control. It can also be used a simple data entry and the preparation of structured documents.

DEPARTMENT OF COMPUTER SCIENCE AND ENGINEERING, IKGPTU Main Campus, JALANDHAR

9

Medical diagnoses — ML is trained to recognize cancerous tissues.

Financial industry and trading — companies use ML in fraud investigations and

credit checks

ARTIFICIAL INTELLIGENCE: Artificial Intelligence is no longer a term one should treat to

be non-pervasive in its impacts. To some extent, many including myself have stayed aloof of the

whole concept of a world takes over by automation and simulations. The reality is it will happen

and what is more alarming is that it is happening as we speak.

There are predictions and theories that suggest that by 2050, circa 50% of human jobs in

developed countries would be taken over by robots. Technological singularity, which is defined

as the point when AI surpasses human intelligence will in fact occur for real and our generation

will actually get to see how technology has disrupted the world around us.

But beyond the general euphoria around AI, it is important to understand what it actually means.

Artificial Intelligence is when machines perform things for you. As machines these are not

necessarily physical robots but computational codes that resemble the way human brain operates.

Similar to how our brain

AI is a broad term for describing anything that is done by computers that humans could do. As a

starter, data storage (floppys, storage buses etc) back in the days was one of the first versions of

ΑI

I take the analogy of Science: Algorithms = AI: Machine learning.

DEPARTMENT OF COMPUTER SCIENCE AND ENGINEERING, IKGPTU Main Campus, **JALANDHAR**

DETAILS ABOUT IMPORTANT AREAS

Sentiment Analysis is the process of 'computationally' determining whether a piece of writing is positive, negative or neutral. It's also known as opinion mining, deriving the opinion or attitude of a speaker. Sentiment analysis is a type of data mining that measures the inclination of people's opinions through natural language processing (NLP), computational linguistics and text analysis, which are used to extract and analyze subjective information from the Web - mostly social media and similar sources. The analyzed data quantifies the general public's sentiments or reactions toward certain products, people or ideas and reveal the contextual polarity of the information. Sentiment analysis is also known as opinion mining.

Sentiment analysis is contextual mining of text which identifies and extracts subjective information in source material, and helping a business to understand the social sentiment of their brand, product or service while monitoring online conversations. However, analysis of social media streams is usually restricted to just basic sentiment analysis and count based metrics. This is akin to just scratching the surface and missing out on those high value insights that are waiting to be discovered. So what should a brand do to capture that low hanging fruit?

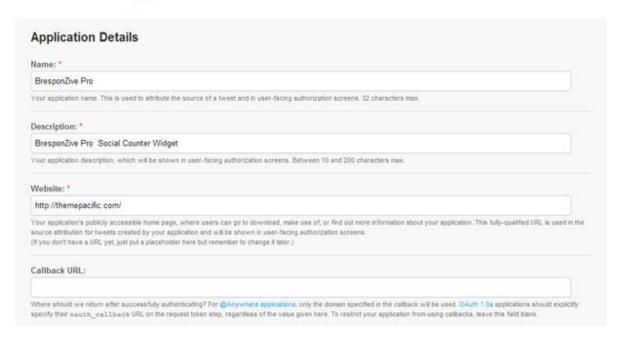
With the recent advances in deep learning, the ability of algorithms to analyse text has improved considerably. Creative use of advanced artificial intelligence techniques can be an effective tool for doing in-depth research. We believe it is important to classify incoming customer conversation about a brand based on following lines:

- 1. Key aspects of a brand's product and service that customers care about.
- 2. Users' underlying intentions and reactions concerning those aspects.

These basic concepts when used in combination, become a very important tool for analyzing millions of brand conversations with human level accuracy.

In this project, we will analyse each tweet of particular twitter handle. With the help of Twitter API, we will able to get tweets. First of all, we will setup Twitter API:

Create an application



To use Twitter counter widget and other Twitter related widgets, you need OAuth access keys.

To get Twitter Access keys, you need to create Twitter Application which is mandatory to access

Twitter

- 1. Go to https://dev.twitter.com/apps/new and log in, if necessary
- 2. Enter your Application Name, Description and your website address. You can leave the callback URL empty.
- 3. Accept the TOS, and solve the CAPTCHA.
- 4. Submit the form by clicking the Create your Twitter Application
- 5. Copy the consumer key (API key) and consumer secret from the screen into your application

DEPARTMENT OF COMPUTER SCIENCE AND ENGINEERING, IKGPTU Main Campus, JALANDHAR

Create Your Access Token for OAuth

Access level	Read-only About the application permission model
Consumer key	
Consumer secret	
Request token URL	https://api.twitter.com/oauth/request_token
Authorize URL	https://api.twitter.com/oauth/authorize
Access token URL	https://api.twltter.com/oauth/access_token
Callback URL	None
Sign in with Twitter	No
Your access token	
Tour access token	

After creating your Twitter Application, you have to give the access to your Twitter Account to use this Application. To do this, click the **Create my Access Token.**

TextBlob: Simplified Text Processing : *TextBlob* is a Python (2 and 3) library for processing textual data. It provides a simple API for diving into common natural language processing (NLP) tasks such as part-of-speech tagging, noun phrase extraction, sentiment analysis, classification, translation, and more.

Features

- Noun phrase extraction
- Part-of-speech tagging

DEPARTMENT OF COMPUTER SCIENCE AND ENGINEERING, IKGPTU Main Campus, JALANDHAR

- Sentiment analysis
- Classification (Naive Bayes, Decision Tree)
- Language translation and detection powered by Google Translate
- Tokenization (splitting text into words and sentences)
- Word and phrase frequencies
- Parsing
- **n**-grams
- Word inflection (pluralization and singularization) and lemmatization
- Spelling correction
- Add new models or languages through extension

REGULAR EXPRESSION: Module Regular Expressions(RE) specifies a set of strings(pattern) that matches it. To understand the RE analogy, MetaCharacters are useful, important and will be used in functions of module re.

There are a total of 14 metacharacters and will be discussed as they follow into functions:

- \ Used to drop the special meaning of characters following it (discussed below)
- [] Represent a character class
- ^ Matches the beginning
- \$ Matches the end
- Matches any character except newline
- ? Matches zero or one occurrence.
- Means OR (Matches with any of the characters separated by it.
- * Any number of occurrences (including 0 occurrences)
- + One more more occurrences
- {} Indicate number of occurrences of a preceding RE to match.
- () Enclose a group of REs

PANDAS: Pandas stands for "Python Data Analysis Library". According to the Wikipedia page on Pandas, "the name is derived from the term "panel data", an econometrics term for multidimensional structured data sets." But I think it's just a cute name to a super-useful Python library! Panda takes data (like a CSV or TSV file, or a SQL database) and creates a Python object with rows and columns called data frame that looks very similar to table in a statistical software (think Excel or SPSS for example.

- Convert a Python's list, dictionary or Numpy array to a Pandas data frame
- Open a local file using Pandas, usually a CSV file, but could also be a delimited text file (like TSV), Excel, etc
- Open a remote file or database like a CSV or a JSONon a website through a URL or read from a SQL table/database

Goals of my project:

- Authorize twitter API client.
- Make a GET request to Twitter API to fetch tweets for a particular query.
- Parse the tweets. Classify each tweet as positive, negative or neutral.

DETAILS OF STUDY

Machine Learning is subcategory or subset of Artificial Intelligence. But

Machine Learning = building blocks/ model of data

We have a lot of Data; i.e, structured or Unstructured data. But these data will have no meaning until without these models. ML involves building mathematical models to help data. Once these

DEPARTMENT OF COMPUTER SCIENCE AND ENGINEERING, IKGPTU Main Campus, JALANDHAR

models fit on previous or current data then we can predict and understand aspects of new data observed

There are two types of machine learning apparently,

i) **Supervised Learning**: It involves some modelling the relationship between features of data and label associated with data. Once model is recognized, it can be apply labels to new data. Models that can predicts labels based on labeled training data.

Supervised learning is divided into two parts:

- a) Classifications: In which, labels are discrete categories.
- b) Regression: In this, labels are continuous
- ii) **Unsupervised Learning**: It involves modelling the features of dataset without reference to any label, and is often described as 'Letting the dataset speaks for itself.'
- a) Clustering: It is the task of dividing the population or data points into a number of groups such that data points in the same groups are more similar to other data points in the same group and dissimilar to the data points in other groups. It is basically a collection of objects on the basis of similarity and dissimilarity between them.
- b) **Dimensionality Reduction**: It is the process of reducing the number of random variables under consideration, by obtaining a set of principal variables. It can be divided into feature selection and feature extraction.

Now, we will study some of the libraries -

1. NumPY: NumPy is a general-purpose array-processing package. It provides a high-performance multidimensional array object, and tools for working with these arrays.

DEPARTMENT OF COMPUTER SCIENCE AND ENGINEERING, IKGPTU Main Campus, JALANDHAR

It is the fundamental package for scientific computing with Python. It contains various features

including these important ones:

• A powerful N-dimensional array object

Sophisticated (broadcasting) functions

• Tools for integrating C/C++ and Fortran code

• Useful linear algebra, Fourier transform, and random number capabilities.

Besides its obvious scientific uses, NumPy can also be used as an efficient multi-dimensional

container of generic data.

Syntax: import numpy as nm

ndarray: It is also known as N-Dimensional Array type, Every item in an indarray takes the

same size of block in the memory. Each element in ndarray is an object of data-type object

(called dtype). It have some attributes like:

Ndarray.shape, Ndarray.ndim, Ndarray.arange, Ndarray.linspace,

2. **Matplotlib**: Matplotlib is a plotting library for Python. It is used along with NumPy to provide

an environment that is an effective open source alternative for MatLab.

Syntax:

from matplotlib import pyplot as plt

plt.plot(x,y)

plt.bar(x, y, align='center', color='g')

plt.scatter(x, y)

DEPARTMENT OF COMPUTER SCIENCE AND ENGINEERING, IKGPTU Main Campus, **JALANDHAR**

plt.hist(y)

plt.show()

3.Seaborn: Seaborn is a library for making statistical graphics in Python. It is built on top of matplotlib and closely integrated with pandas data structures.

Syntax: import seaborn as sns

sns.relplot(x="xlabel", y="ylabel", data=mydata);

sns.countplot(y, data=mydata)

Scikit-Learn: It is a free software machine learning library for the Python programming language. It features various classification, regression and clustering algorithms including support vector machines, random forests, gradient boosting, k-means and DBSCAN, and is designed to interoperate with the Python numerical and scientific libraries NumPy and SciPy.

Training And Test Data

>>> from sklearn.model selection import train test split

>>> X_train, X_test, y_train, y_test = train_test_split(X,y,random_state=0)

Create Your Model

Supervised Learning Estimators:

Linear Regression

DEPARTMENT OF COMPUTER SCIENCE AND ENGINEERING, IKGPTU Main Campus, JALANDHAR

```
>>> from sklearn.linear_model import LinearRegression
>>> lr = LinearRegression(normalize=True)
```

Support Vector Machines (SVM)

```
>>> from sklearn.svm import SVC
>>> svc = SVC(kernel='linear')
```

Naive Bayes

```
>>> from sklearn.naive_bayes import GaussianNB
>>> gnb = GaussianNB()
```

KNN

>>> from sklearn import neighbors >>> knn = neighbors.KNeighborsClassifier(n_neighbors=5)

Unsupervised Learning Estimators:

Principal Component Analysis (PCA)

```
>>> from sklearn.decomposition import PCA
>>> pca = PCA(n components=0.95)
```

K Means

```
>>> from sklearn.cluster import KMeans
>>> k_means = KMeans(n_clusters=3, random_state=0)
```

Model Fitting:

Supervised learning

```
>>> lr.fit(X, y)
>>> knn.fit(X_train, y_train)
>>> svc.fit(X_train, y_train)
```

DEPARTMENT OF COMPUTER SCIENCE AND ENGINEERING, IKGPTU Main Campus, JALANDHAR

Unsupervised Learning

```
>>> k_means.fit(X_train)
>>> pca model = pca.fit transform(X train)
```

Prediction:

Supervised Estimators

```
>>> y_pred = svc.predict(np.random.random((2,5)))
>>> y_pred = lr.predict(X_test)
>>> y pred = knn.predict proba(X test))
```

Unsupervised Estimators

```
>>> y_pred = k_means.predict(X_test)
```

Evaluate Your Model's Performance

Classification Metrics:

Accuracy Score

```
>>> knn.score(X_test, y_test)
>>> from sklearn.metrics import accuracy_score
>>> accuracy_score(y_test, y_pred)
```

Confusion Matrix

```
>>> from sklearn.metrics import confusion_matrix
>>> print(confusion_matrix(y_test, y_pred)))
```

DEPARTMENT OF COMPUTER SCIENCE AND ENGINEERING, IKGPTU Main Campus, JALANDHAR

Regression Metrics:

Mean Absolute Error:

```
>>> from sklearn.metrics import mean_absolute_error
>>> y_true = [3, -0.5, 2])
>>> mean_absolute_error(y_true, y_pred))
```

Mean Squared Error:

```
>>> from sklearn.metrics import mean_squared_error
>>> mean squared error(y test, y pred))
```

TensorFlow: TensorFlow is an open source library for fast numerical computing. It was created and is maintained by Google and released under the Apache 2.0 open source license. The API is nominally for the Python programming language, although there is access to the underlying C++ API.

Unlike other numerical libraries intended for use in Deep Learning like Theano, TensorFlow was designed for use both in research and development and in production systems, not least RankBrain in Google search and the fun DeepDream project. It can run on single CPU systems, GPUs as well as mobile devices and large scale distributed systems of hundreds of machines.

Tensorflow architecture works in three parts:

- Preprocessing the data
- Build the model
- Train and estimate the model

It is called Tensorflow because it takes input as a multi-dimensional array, also known as **tensors**. You can construct a sort of **flowchart** of operations (called a Graph) that you want to

perform on that input. The input goes in at one end, and then it flows through this system of multiple operations and comes out the other end as output.

List of Algorithms supported by Tensorflow:

- Linear regression: tf.estimator.LinearRegressor
- Classification:tf.estimator.LinearClassifier
- Deep learning classification: tf.estimator.DNNClassifier
- Deep learning wipe and deep: tf.estimator.DNNLinearCombinedClassifier
- Booster tree regression: tf.estimator.BoostedTreesRegressor
- Boosted tree classification: tf.estimator.BoostedTreesClassifier

WHAT I LEARNED IN MY TRAINING?

The internship exercise was mainly to enable me acquire practical skills and link theory to practice. I have been able to acquire practical skills like creating dataset, working on models, algorithms like linear regression, logistic etc.

ANNEXURE A

Code in Python 3 at Jupyter:

```
In [1]: import tweepy
        consumer_key="hmL3tbC14Y7JgpKsDHKCpTEm9"
        consumer_secret="zGJXewHINvlNE7ViTA10YuGsjZcOJamA1dgdF3V2aN0uF54zc2"
        access_token="741301816361635840-p46wy3cSUEfuoozXvYNDvrfhpQjjt07"
        access_token_secret="Edvzh6AN9KZdZtIClohE1K3KWPMlzY8u3rRRRxKJn8ztW"
In [2]: auth=tweepy.OAuthHandler(consumer_key,consumer_secret)
        auth.set_access_token(access_token,access_token_secret)
In [3]: api=tweepy.API(auth)
        user=api.user_timeline(screen_name="KushKnows")
In [4]: tmpp=[]
        tweets_for_csv =[tweet.text for tweet in user] # CSV file created
        for j in tweets_for_csv:
                tmpp.append(j)
In [5]: import numpy as nm
        # Cleaning Spaces from each and every tweets
        for i in range(len(tmpp)):
             tmpp[i]=tmpp[i].replace('\n','')
In [6]: import re
        for i in range(len(tmpp)):
            x=re.compile(r'https://t.co/*[a-zA-Z0-9]*',re.DOTALL)
            tmpp[i]=re.sub(x,'',tmpp[i])
            print(tmpp[i])
```

```
RT @TripathiiPankaj: प्रोतेभाओं(Talent) के चार चरण ।१ - अनुपयोग२ - दुरुपयोग३ - उपयोग४ - सदुपयोग अथीत ईमानदारी और प्रेम से कायेरत र...
           RT @PMNehru: Only if I could ask Dhoni how it feels when everyone puts the blame on you. #NZvsIND
           RT @TripathiiPankai: .
           RT @varungrover: Jab 2003 sah liya toh 2019 kya bigaad lega humaara. Phir kabhi. #CWC19
           Everywhere on social media, we are watching only 'Jai Shree Ram' chant videos by 'akal ke andhe Bhakts' , this screwed up me !!
RT @varungrover: नक्सों में जंगल है पेड़ नहींनक्सों में नदियां हैं पानी नहींनक्सों में पहाड़ है पत्थर नहींनक्सों में देश है लोग नहींसम...
           RT @nadeemkhanUAH: Smile is saying all court order of prashant kanojia
           @katelynnacon Happy birthday!!
गुड़िया खेलने की उम्र थी उसकी ,पर दरिन्दों ने उसकी ज़िन्दगी के साथ खेला l#TwinkleSharma
           RT @anuragkashyap72: Chernobyl scripts .. here
           RT @GabbbarSingh: From निंदा to डंडा 😂
           Election Commission of India seems to be Hacked !!!
           @GameOfThrones
           Now again, a water bottle had been seen in GOT final episode.
           RT @AisiTaisiDemo: Kaafi cool artwork featuring Aisi Taisi Democracy with a Cow-Aadhaar being made, by Kolkata based artists @M
           RT @AAPPunjab: AAP Convenor @ArvindKejriwal paying regards and taking blessings of the legendary Maharaj Agrasen in Sunam.#Kejr
           iwalinPunja...
           Just promises remains with people ; no waste to energy plant in Ghazipur, Delhi. Note: These types of issue should n...
          RT @Showbiz_IT: Game of Thrones ending will leave fans in worst pain possible, says Sophie Turner ...
RT @AamAadmiParty: .@raghav_chadha briefing the media about large scale bogus voting at a school in Tughlakabad.
           Guruji : Hindu Muslim Sab Atapi Vatapi hai .
In [7]: for i in range(len(tmpp)):
    tmpp[i]=re.sub(r'@[a-zA-Z_.0-9]*| #[a-zA-Z0-9]*','',tmpp[i])
               print(tmpp[i])
           RT : प्रतिभाओं(Talent) के चार चरण 1१ - अनुपयोग२ - दुरुपयोग३ - उपयोग४ - सदुपयोग अर्थात ईमानदारी और प्रेम से कायेरत र...
           RT: Only if I could ask Dhoni how it feels when everyone puts the blame on you.
           RT : Jab 2003 sah liya toh 2019 kya bigaad lega humaara. Phir kabhi.
          Everywhere on social media, we are watching only 'Jai Shree Ram' chant videos by 'akal ke andhe Bhakts' , this screwed up me !!
RI : नक्से में जंगल है पेड़ नहींनक्से में नदियां हैं पानी नहींनक्से में पहाड़ है पत्थर नहींनक्से में देश है लोग नहींसम...
           RT : Smile is saying all court order of prashant kanojia
           Happy birthday!
गुडिया खेलने की उम्र थी उसकी ,पर दरिन्दों ने उसकी जिन्दगी के साथ खेला I#TwinkleSharma
           RT : Chernobyl scripts .. here
           RT : From निंदा to डंडा 🤮
           Election Commission of India seems to be Hacked !!!
           Now again, a water bottle had been seen in GOT final episode.
           RT : Kaafi cool artwork featuring Aisi Taisi Democracy with a Cow-Aadhaar being made, by Kolkata based artists and...
           RT : AAP Convenor paying regards and taking blessings of the legendary Maharaj Agrasen in Sunam.#KejriwalinPunja...
           Just promises remains with people ; no waste to energy plant in Ghazipur, Delhi. Note: These types of issue should n...
           RT : Game of Thrones ending will leave fans in worst pain possible, says Sophie Turner
           RT : . briefing the media about large scale bogus voting at a school in Tughlakabad.
Guruji : Hindu Muslim Sab Atapi Vatapi hai .
In [8]: from textblob import TextBlob
In [9]: po=[]
           for i in range(len(tmpp)):
               analysis=TextBlob(tmpp[i])
                po.append(analysis.sentiment.polarity)
                print(po[i],tmpp[i])
           0.0 RT : प्रतिभाओं(Talent) के चार चरण 1१ - अनुपयोग२ - दुरुपयोग३ - उपयोग४ - सदुपयोग अधीत ईमानदारी और प्रेम से कायेरत र...
           0.0 RT : Jab 2003 sah liya toh 2019 kya bigaad lega humaara. Phir kabhi.
           0.0166666666666666 Everywhere on social media, we are watching only 'Jai Shree Ram' chant videos by 'akal ke andhe Bhakts' .
           this screwed up me !!
0.0 RT : नक्यों में जंगल है पेड़ नहींनक्यों में नदियां हैं पानी नहींनक्यों में पहाड़ है पत्थर नहींनक्यों में देश है लोग नहींसम...
           0.3 RT : Smile is saying all court order of prashant kanojia
           1.0 Happy birthday!!
0.0 गुड़िया खेलने की उम्र थी उसकी ,पर दरिन्दों ने उसकी ज़िन्दगी के साथ खेला I#TwinkleSharma
           0.0 RT : Chernobyl scripts .. here
0.0 RT : From निंदा to डंडा 😉
           0.0 Election Commission of India seems to be Hacked !!!
           99
           0.0 Now again, a water bottle had been seen in GOT final episode.
           0.35 RT : Kaafi cool artwork featuring Aisi Taisi Democracy with a Cow-Aadhaar being made, by Kolkata based artists and...
           1.0 RT : AAP Convenor paying regards and taking blessings of the legendary Maharaj Agrasen in Sunam.#KejriwalinPunja...
0.1 Just promises remains with people ; no waste to energy plant in Ghazipur, Delhi. Note:These types of issue should n...
           -0.46666666666666 RT : Game of Thrones ending will leave fans in worst pain possible, says Sophie Turner 0.21428571428571427 RT : . briefing the media about large scale bogus voting at a school in Tughlakabad.
           0.0 Guruji : Hindu Muslim Sab Atapi Vatapi hai .
```

DEPARTMENT OF COMPUTER SCIENCE AND ENGINEERING, IKGPTU Main Campus, JALANDHAR

```
In [10]: import pandas as pd
          sentiment=pd.DataFrame(po,columns=["Polarity"])
In [11]:
          senti=pd.DataFrame({'pol':po,'Tweets':tmpp},columns=["pol","Tweets"])
          senti.head()
Out[11]:
                   pol
                                                              Tweets
                       RT : प्रतिभाओं(Talent) के चार चरण 1१ - अनुपयोग..
           0.000000
           1 0.000000
                       RT: Only if I could ask Dhoni how it feels wh ...
           2 0.000000
                       RT : .....
           3 0.000000
                       RT: Jab 2003 sah liya toh 2019 kya bigaad leg...
           4 0.016667
                       Everywhere on social media, we are watching on..
In [12]: import matplotlib.pyplot as plt
          import seaborn as sns
          x_axis=[1,2,3,4,5,6,7,8,9,10,11,12,13,14,15,16,17,18,19,20]
          plt.plot(x_axis, senti.pol)
          plt.show()
            1.0
            0.8
            0.6
            0.4
            0.2
            0.0
           -0.2
           -0.4
                          5.0
                                     10.0
                                          12.5
                                                15.0
                                                      17.5
```

ANNEXURE B

References:



A computer science portal for geeks



Medium

Welcome to Medium, where words matter.

