EXPERIMENT NO.5

AIM: To Develop Content based social media analytics model for business.

RESOURCES REOUIRED: Windows/MAC/Linux O.S, Compatible version of Python.

THEORY:

What Is Topic Analysis?

Topic analysis (also called topic detection, topic modeling, or topic extraction) is a machine learning technique that organizes and understands large collections of text data, by assigning "tags" or categories according to each individual text's topic or theme. Topic analysis uses natural language processing (NLP) to break down human language so that you can find patterns and unlock semantic structures within texts to extract insights and help make data-driven decisions. The two most common approaches for topic analysis with machine learning are NLP topic modeling and NLP topic classification.

What Is Trend Analysis?

Trend analysis is a technique used in technical analysis that attempts to predict future stock price movements based on recently observed trend data. Trend analysis uses historical data, such as price movements and trade volume, to forecast the long-term direction of market sentiment.

What is sentiment analysis (opinion mining)?

Sentiment analysis, also referred to as opinion mining, is an approach to natural language processing (NLP) that identifies the emotional tone behind a body of text. This is a popular way for organizations to determine and categorize opinions about a product, service, or idea. It involves the use of data mining, machine learning (ML) and artificial intelligence (AI) to mine text for sentiment and subjective information.

Audio, video, image analytics:

Image analysis or imagery analysis is the extraction of meaningful information from images; mainly from digital images by means of digital image processing techniques. Image analysis tasks can be as simple as reading bar coded tags or as sophisticated as identifying a person from their face. Video content analysis or video content analytics (VCA), also known as video analysis or video analytics (VA), is the capability of automatically analyzing video to detect and determine temporal and spatial events. This technical capability is used in a wide range of domains including entertainment, video retrieval and video browsing, health-care, retail, automotive, transport, home automation, flame and smoke detection, safety, and security. The algorithms can be implemented as software on general-purpose machines, or as hardware in specialized video processing units.

CONCLUSION: Hence, we have successfully studied to Develop Content based social media analytics model for business

```
In [1]: import pandas as pd
         import numpy as np
         post df = pd.read csv('post.csv',index col=['id'])
In [2]:
         comment df = pd.read csv('comment.csv',index col=['comment id'])
In [3]:
         post_df.head()
Out[3]:
                           author
                                    author_id total_comments upvote post_type
                                                                                            ti
               id
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                                                                                  Python becor
          12glkw4 TheBodyPolitic1
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In [4]:
         comment_df.head()
```

Out[4]:		post_id	parent_id	body	created_on	upvotes	author_id	author_I
	comment_id							
	jfkvwx0	12glkw4	t3_12glkw4	Hardware wasn't ready for Python in that time	2023-04-09 15:27:18	5	22vat21u	Du
	jfnha98	12glkw4	t3_12glkw4	Because Python was developed with the conceit	2023-04-10 02:55:16	2	4wtjvsh6	FredVIII
	jflnf2e	12glkw4	t3_12glkw4	Perl was *the* scripting language in the early	2023-04-09 18:37:04	2	4i9hp	tom
	jflbch7	12glkw4	t3_12glkw4	I was a web developer between 2000 and 2010, a	2023-04-09 17:13:45	2	8hi6986p	As Dress
	jfmk972	12glkw4	t1_jflbch7	Adding on to this from my POV, early web in th	2023-04-09 22:33:38	3	380he	snar
4								>

Analysing 1st post comments

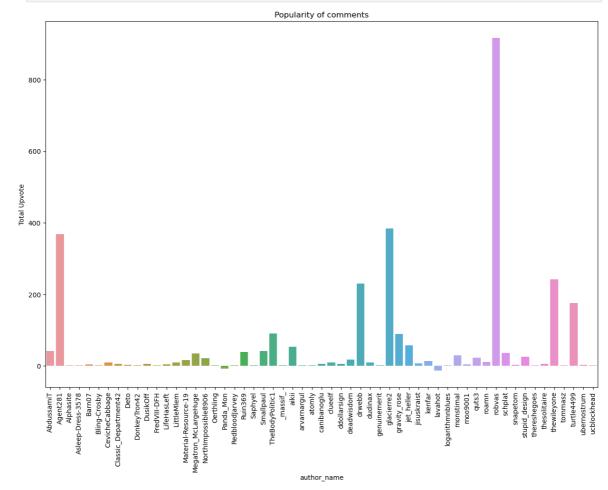
```
In [5]: fp_comments = comment_df.loc[comment_df['post_id']=='12glkw4']
fp_comments.head()
```

Out[5]: post_id parent_id body created_on upvotes author_id author_i comment_id Hardware wasn't 2023-04-09 jfkvwx0 12glkw4 t3_12glkw4 ready for 22vat21u Du 15:27:18 Python in that time Because Python was 2023-04-10 jfnha98 12glkw4 t3_12glkw4 2 4wtjvsh6 FredVIII developed 02:55:16 with the conceit ... Perl was *the* scripting 2023-04-09 2 jflnf2e 12glkw4 t3 12glkw4 4i9hp tom language 18:37:04 in the early... I was a web 2023-04-09 developer A٤ jflbch7 12glkw4 t3 12glkw4 8hi6986p between 17:13:45 Dress-2000 and 2010, a... Adding on to this from my 2023-04-09 3 jfmk972 12glkw4 t1 jflbch7 380he snar POV, 22:33:38 early web in th... In [6]: import matplotlib.pyplot as plt import seaborn as sns In [7]: upvote_rec = fp_comments.groupby(fp_comments['author_name']).apply(lambda "total upvote":x['upvotes'].sum(), 'total comments':len(x) }) upvote_rec

```
Out[7]: author name
        AbdussamiT
                                  {'total upvote': 42, 'total comments': 2}
        Agent281
                                 {'total upvote': 368, 'total comments': 1}
                                   {'total upvote': 2, 'total comments': 1}
        Alphasite
                                   {'total upvote': 2, 'total_comments': 1}
        Asleep-Dress-3578
                                   {'total upvote': 4, 'total comments': 1}
        Barn07
                                   {'total upvote': 2, 'total comments': 1}
        Bling-Crosby
                                   {'total_upvote': 9, 'total_comments': 1}
        CevicheCabbage
                                   {'total upvote': 6, 'total comments': 1}
        Classic Department42
                                   {'total upvote': 3, 'total comments': 1}
        Deto
                                   {'total upvote': 2, 'total_comments': 1}
        DonkeyTron42
        DusikOff
                                   {'total upvote': 5, 'total comments': 1}
        FredVIII-DFH
                                   {'total upvote': 2, 'total comments': 1}
                                   {'total upvote': 4, 'total comments': 2}
        LifeHasLeft
        LittleMlem
                                   {'total upvote': 9, 'total comments': 1}
        Material-Resource-19
                                  {'total upvote': 16, 'total comments': 1}
                                  {'total_upvote': 35, 'total_comments': 1}
        Megatron_McLargeHuge
                                  {'total upvote': 21, 'total_comments': 1}
        NorthImpossible8906
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        Panda Mon
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        RedbloodJarvey
                                  {'total_upvote': 39, 'total_comments': 1}
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        Saphyel
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                                  {'total upvote': 41, 'total comments': 1}
        Smallpaul
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        TheBodyPolitic1
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        arvarnargul
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        deadwisdom
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        drwebb
                                 {'total upvote': 230, 'total comments': 1}
        dudinax
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        genuinemerit
        glacierre2
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                                  {'total_upvote': 89, 'total_comments': 1}
        gravity_rose
                                  {'total upvote': 57, 'total comments': 1}
        jet heller
                                   {'total upvote': 7, 'total comments': 1}
        iisuskraist
        kenfar
                                  {'total_upvote': 13,
                                                       'total_comments': 1}
        lavahot
                                 {'total upvote': -13, 'total comments': 1}
        logarithmnblues
                                   {'total_upvote': 1, 'total_comments': 1}
        monstimal
                                  {'total_upvote': 29, 'total_comments': 1}
        moo9001
                                   {'total upvote': 4, 'total comments': 1}
        auts3
                                  {'total upvote': 23, 'total comments': 2}
                                  {'total upvote': 11, 'total comments': 1}
        roamn
                                 {'total_upvote': 917, 'total_comments': 1}
        robvas
        schplat
                                  {'total_upvote': 36, 'total_comments': 1}
        snapetom
                                   {'total_upvote': 3, 'total comments': 1}
                                  {'total upvote': 26, 'total comments': 1}
        stupid design
        thereshegoes
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                                   {'total upvote': 6, 'total comments': 1}
        thesolitaire
                                 {'total upvote': 242, 'total comments': 1}
        thewileyone
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        tommasz
        turtle4499
                                 {'total upvote': 175, 'total comments': 1}
        ubernostrum
                                   {'total upvote': 3, 'total comments': 1}
                                   {'total upvote': 1, 'total comments': 1}
        ucblockhead
        dtype: object
```

Most upvotes users in comments

```
In [8]: fig,ax = plt.subplots(1,1,figsize=(15,10))
    plt.xticks(rotation=90)
    ax.set_xlabel('author_name')
    ax.set_ylabel('Total Upvote')
    ax.set_title('Popularity of comments')
    sns.barplot(x=upvote_rec.index,y=[data['total_upvote'] for data in upvote plt.show()
```



Most repeated words in comments

```
In [9]: import nltk
   nltk.download('stopwords')
   from nltk.corpus import stopwords
   from nltk.tokenize import word_tokenize

sw = set(stopwords.words('english'))

comments = fp_comments['body'].values.tolist()

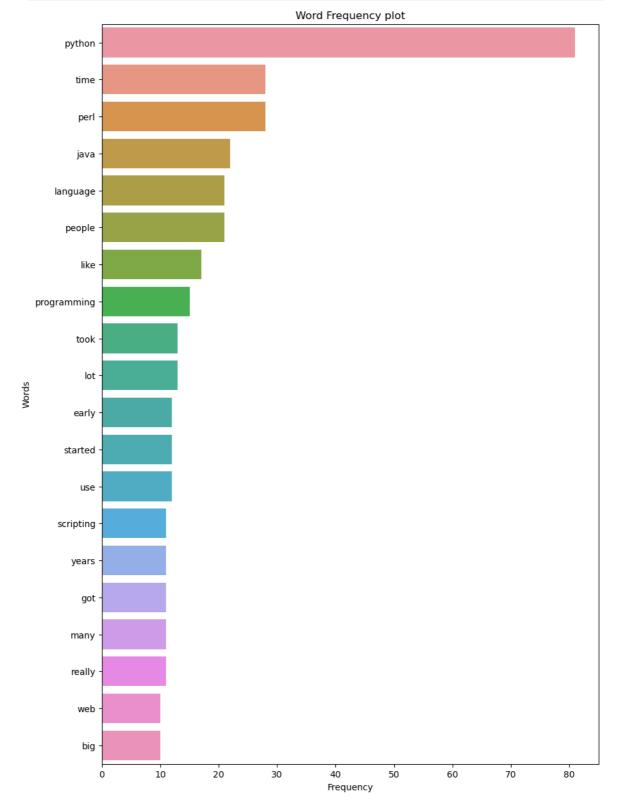
corpus = [word.lower() for comment in comments for word in word_tokenize(
   corpus[:5]

[nltk_data] Downloading package stopwords to
   [nltk_data] /home/slowgamer/nltk_data...
   [nltk_data] Package stopwords is already up-to-date!
```

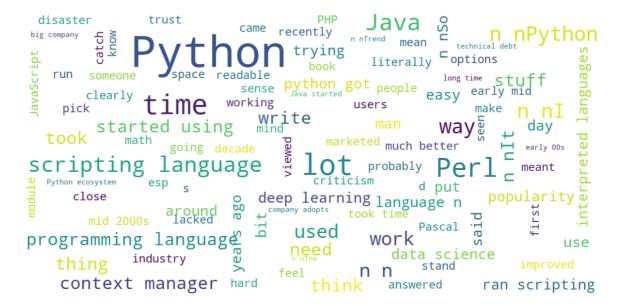
Out[9]: ['hardware', 'ready', 'python', 'time', 'python']

```
In [10]: from collections import Counter

fig,ax = plt.subplots(1,1,figsize=(10,15))
word_counts = dict(Counter(corpus).most_common(20))
ax.set_xlabel('Frequency')
ax.set_ylabel('Words')
ax.set_title('Word Frequency plot')
sns.barplot(x=list(word_counts.values()),y=list(word_counts.keys()),ax=ax
plt.show()
```



```
In [52]: from wordcloud import WordCloud, STOPWORDS
          sw = set(STOPWORDS)
          def generate cloud(data,n grams=2):
              fig, ax = plt.subplots(1,1,figsize=(15,15))
              wordcloud = WordCloud(
                  background color='white',
                  stopwords=sw,
                  max words=100,
                  max font size=30,
                  scale=3,
                   random state=1,
                  collocation threshold=n grams
              ) generate(data)
              ax.imshow(wordcloud)
              ax.axis('off')
              plt.show()
         generate_cloud(str(fp_comments['body'].values).replace('\n',' '))
In [12]:
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In [13]:
         generate cloud(str(fp comments['body'].values).replace('\n',' '),n grams=
```



Sentiment Analysis

Using Text Blob Library

```
In [16]: from textblob import TextBlob

def polarity_score(text):
    return TextBlob(text).sentiment.polarity

In [30]: fp_comments['comment_sent_score'] = fp_comments['body'].apply(lambda tex

/tmp/ipykernel_30060/1826135865.py:1: SettingWithCopyWarning:
    A value is trying to be set on a copy of a slice from a DataFrame.
    Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
    fp_comments['comment_sent_score'] = fp_comments['body'].apply(lambda text: polarity_score(text))

In [31]: fp_comments[['body','comment_sent_score']]
```

Out[31]: body comment_sent_score

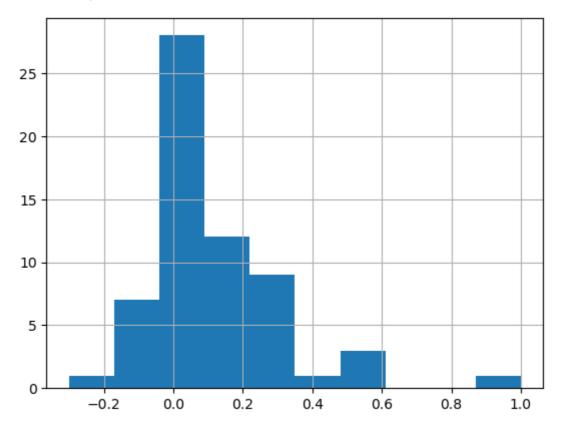
	ner	

jfkvwx0	Hardware wasn't ready for Python in that time	0.200000
jfnha98	Because Python was developed with the conceit	0.212500
jflnf2e	Perl was *the* scripting language in the early	-0.037500
jflbch7	I was a web developer between 2000 and 2010, a	0.292308
jfmk972	Adding on to this from my POV, early web in th	0.080903
jfnxolg	We have to start calling Python as JavaPython,	0.000000
jfnvotv	Java was incredibly popular because it filled	0.304048
jfktbt2	Fair point, but Python became popular and I ca	0.041667
jflq4yt	I'm wondering if Java started to loose popular	-0.076923
jfl01if	To further this comment, Sun had a \$500 millio	0.000000

62 rows × 2 columns

```
In [32]: fp_comments['comment_sent_score'].hist()
```

Out[32]: <AxesSubplot: >



```
In [29]: def sentiment(score):
    return 'positive' if score>0 else 'negative' if score<0 else 'neutral

In [35]: fp_comments['comment_sentiment'] = fp_comments['comment_sent_score'].appl</pre>
```

/tmp/ipykernel_30060/3742194281.py:1: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
 fp_comments['comment_sentiment'] = fp_comments['comment_sent_score'].app
ly(lambda score:sentiment(score))

In [36]: fp_comments[['body','comment_sentiment']]

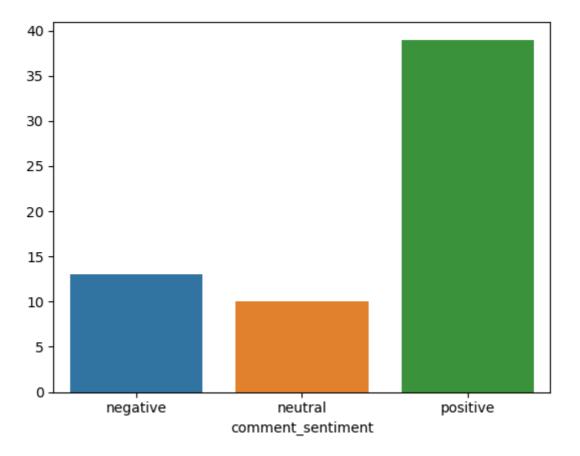
Out[36]:

body comment sentiment

comment_id		
jfkvwx0	Hardware wasn't ready for Python in that time	positive
jfnha98	Because Python was developed with the conceit	positive
jflnf2e	Perl was *the* scripting language in the early	negative
jflbch7	I was a web developer between 2000 and 2010, a	positive
jfmk972	Adding on to this from my POV, early web in th	positive
jfnxolg	We have to start calling Python as JavaPython,	neutral
jfnvotv	Java was incredibly popular because it filled	positive
jfktbt2	Fair point, but Python became popular and I ca	positive
jflq4yt	I'm wondering if Java started to loose popular	negative
jfl01if	To further this comment, Sun had a \$500 millio	neutral

62 rows × 2 columns

```
In [47]: cnt = fp_comments.groupby(fp_comments['comment_sentiment'])['body'].count
    sns.barplot(x=cnt.index,y=cnt.values)
    plt.show()
```



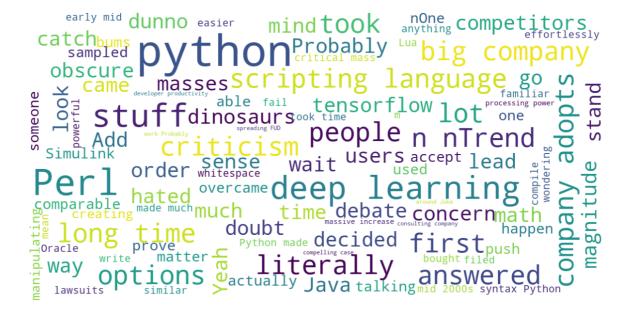
Segmenting comments by sentiment and plotting word cloud

Positive Sentiment

```
generate_cloud(str(fp_comments.loc[fp_comments['comment_sentiment']=='pos
n nThe david beazlev
putmid 90s
                                          ern based ones
  going
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 programming language
                               around
       various web
    think
                       people started
        none web
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                                 network resourced
                     feeln latePHP
      man
                                   popularity
                           solved n
      preted languages
                                                                meant
                        bit book many purposes context manager
            technical debt
 late 90s
```

Negative Sentiment

In [54]: generate_cloud(str(fp_comments.loc[fp_comments['comment_sentiment']=='neg



Neutral Sentiment

```
GUI solution Perl issuescompany called Performance went language Java SCripting language Pythonfacto scripting start calling today People Pythonfacto scripting start calling today People Python JavaPython dynamic typing paving compatibility ended sentences Python called Sun move away said sun preps_500m_java_brand time ran scripting liveScript seentheregisterLua today comment sun use run step Perl' python Dude learn bye bye

Perl' python Dude learn bye bye

PHP' Wait solution now impression compatibilityit' Performance
```