#### About the Dataset:

Dataset used in this project consists of a collection of tweets that were posted during covid-19 pandemic by users from different locations across the globe. Datset consists of tweets and sentiments reflected from them, alongwith other information like location, date, username etc.

## Preprocessing

- · Preprocessing
- · hashtags, mentions, URLs, punctuation, special characters removal
- lowercasing
- · WordCloud visualizaion
- · Label Preprocessing
- · Text normalization
- Stemming
- Lemmatization
- Stopword Removal
- · Vectorization (using TF-IDF)
- · Train-Test split

# ML Algorithms Used

- · K Nearest Neioughbors
- · Support Vector Machine Algorithm(SVM)
- Multinomial NB
- · LogisticRegression
- DecisionTreeClassifier
- · RandomForestClassifier
- AdaBoostClassifier

import pandas as pd

dtype: int64

import re

```
import nltk
from nltk.stem import SnowballStemmer
from nltk import TweetTokenizer
from nltk.corpus import stopwords
import matplotlib.pyplot as plt
import seaborn as sns
from wordcloud import WordCloud, STOPWORDS, ImageColorGenerator
from sklearn.preprocessing import LabelEncoder
from sklearn.feature extraction.text import TfidfVectorizer
from sklearn.model_selection import train_test_split
from sklearn.neighbors import KNeighborsClassifier
from sklearn.svm import SVC
from sklearn.naive_bayes import MultinomialNB
from sklearn.metrics import accuracy_score,ConfusionMatrixDisplay,classification_report
from sklearn.linear_model import LogisticRegression
from sklearn.tree import DecisionTreeClassifier
from sklearn.ensemble import RandomForestClassifier
from sklearn.ensemble import AdaBoostClassifier
from nltk.util import ngrams
import nltk
df_train=pd.read_csv("/content/Corona_NLP_train.csv",encoding="ISO-8859-1",nrows=6000)
df_test=pd.read_csv("/content/Corona_NLP_test.csv",encoding="ISO-8859-1",nrows=6000)
df_train.isna().sum()
     UserName
                         0
     ScreenName
                         0
     Location
                      1212
     TweetAt
                         a
     OriginalTweet
                         0
     Sentiment
     dtype: int64
df_test.isna().sum()
     UserName
                        0
     ScreenName
                        а
     Location
                      834
     TweetAt
                        0
     OriginalTweet
                        0
     Sentiment
```

int64 UserName ScreenName int64 object Location TweetAt object OriginalTweet object Sentiment object

dtype: object

#### df\_test.dtypes

UserName int64 int64 object ScreenName Location TweetAt object OriginalTweet object Sentiment object

dtype: object

df\_train.drop(['UserName', 'ScreenName', 'Location', 'TweetAt' ], axis=1, inplace=True) df\_train

1

	OriginalTweet	Sentiment
0	@MeNyrbie @Phil_Gahan @Chrisitv https://t.co/i	Neutral
1	advice Talk to your neighbours family to excha	Positive
2	Coronavirus Australia: Woolworths to give elde	Positive
3	My food stock is not the only one which is emp	Positive
4	Me, ready to go at supermarket during the #COV	Extremely Negative
5995	I expect that one of these days everyone will	Negative
5996	Looking for ways to help your community Go to	Positive
5997	Hey @asda @AsdaServiceTeam my friend went into	Extremely Positive
5998	Our industry is adaptable, resilient, and read	Positive
5999	As the #coronavirus pandemic has unleashed fur	Negative

6000 rows × 2 columns

df\_test.drop(['UserName', 'ScreenName', 'Location', 'TweetAt'], axis=1, inplace=True)  $df\_test$ 

Sentiment	OriginalTweet	
Extremely Negative	TRENDING: New Yorkers encounter empty supermar	0
Positive	When I couldn't find hand sanitizer at Fred Me	1
Extremely Positive	Find out how you can protect yourself and love	2
Negative	#Panic buying hits #NewYork City as anxious sh	3
Neutral	#toiletpaper #dunnypaper #coronavirus #coronav	4
Positive	Meanwhile In A Supermarket in Israel People	3793
Negative	Did you panic buy a lot of non-perishable item	3794
Neutral	Asst Prof of Economics @cconces was on @NBCPhi	3795
Extremely Negative	Gov need to do somethings instead of biar je r	3796
	I and @ForestandPaper members are committed to	3797

```
df_train["Sentiment"] =df_train["Sentiment"].str.replace("Extremely Negative", "Negative")
df_train["Sentiment"] =df_train["Sentiment"].str.replace("Extremely Positive", "Positive")
df_test['Sentiment'] =df_test.Sentiment.str.replace('Extremely Positive', 'Positive')
df_test['Sentiment'] =df_test.Sentiment.str.replace('Extremely Negative', 'Negative')
```

	OriginalTweet	Sentiment
0	@MeNyrbie @Phil_Gahan @Chrisitv https://t.co/i	Neutral
1	advice Talk to your neighbours family to excha	Positive
2	Coronavirus Australia: Woolworths to give elde	Positive
3	My food stock is not the only one which is emp	Positive
4	Me, ready to go at supermarket during the #COV	Negative
5995	I expect that one of these days everyone will	Negative
5996	Looking for ways to help your community Go to	Positive
5997	Hey @asda @AsdaServiceTeam my friend went into	Positive

1

1

df\_test

#### OriginalTweet Sentiment TRENDING: New Yorkers encounter empty supermar... 0 Negative 1 When I couldn't find hand sanitizer at Fred Me... Positive 2 Find out how you can protect yourself and love... Positive #Panic buying hits #NewYork City as anxious sh... 3 Negative 4 #toiletpaper #dunnypaper #coronavirus #coronav... Neutral 3793 Meanwhile In A Supermarket in Israel -- People... Positive 3794 Did you panic buy a lot of non-perishable item... Negative 3795 Asst Prof of Economics @cconces was on @NBCPhi... Neutral 3796 Gov need to do somethings instead of biar je r... Negative I and @ForestandPaper members are committed to... 3797 Positive

3798 rows × 2 columns

data=pd.concat([df\_train,df\_test], ignore\_index= True)
data

	OriginalTweet	Sentiment
0	@MeNyrbie @Phil_Gahan @Chrisitv https://t.co/i	Neutral
1	advice Talk to your neighbours family to excha	Positive
2	Coronavirus Australia: Woolworths to give elde	Positive
3	My food stock is not the only one which is emp	Positive
4	Me, ready to go at supermarket during the #COV	Negative
9793	Meanwhile In A Supermarket in Israel People	Positive
9794	Did you panic buy a lot of non-perishable item	Negative
9795	Asst Prof of Economics @cconces was on @NBCPhi	Neutral
9796	Gov need to do somethings instead of biar je r	Negative
9797	I and @ForestandPaper members are committed to	Positive
9798 rows × 2 columns		

data.dropna(inplace=True)

data.isna().sum()

OriginalTweet 6
Sentiment 6
dtype: int64

```
# preprocessing
def remove_urls(text):
      text = re.sub(r'http\S+',' ',text)# remove URLs
      text=re.sub(r'<,*?>',' ',text)#to remove html tags
text=re.sub(r'\d+',' ',text)# remove digit
       text=re.sub(r'#\w+',' ',text)# remove hasttags
       textt=re.sub(r'@\w+',' ',text)#remove mentions
       return text
data["OriginalTweet"] = data['OriginalTweet'].apply(remove_urls)
txt=data["OriginalTweet"].str.replace('[^a-zA-Z0-9]+'," ")# replaced with a space " "
txt1=txt
         <ipython-input-23-4c393152b9e8>:1: FutureWarning: The default value of regex will change from True to False in a future version.
             txt=data["OriginalTweet"].str.replace('[^a-zA-Z0-9]+'," ")# replaced with a space "
stemmer=SnowballStemmer("english")
tk=TweetTokenizer()
#tokenizing lowercase
\label{txt-txt-apply} $$ txt=txt.apply(lambda x:[stemmer.stem(i.lower()) for i in tk.tokenize(x)]).apply(lambda y:" ".join(y)) $$ $$ txt=txt.apply(lambda x:[stemmer.stem(i.lower()) for i in tk.tokenize(x)]).apply(lambda y:" ".join(y)) $$ $$ txt=txt.apply(lambda y:" ".join(y)) $$ txt
txt
        0
                                                 menyrbi phil gahan chrisitv and and
         1
                        advic talk to your neighbour famili to exchang...
         2
                        coronavirus australia woolworth to give elder ...
                        my food stock is not the onli one which is emp...
         4
                        me readi to go at supermarket dure the outbrea...
         9793
                        meanwhil in a supermarket in israel peopl danc...
         9794
                        did you panic buy a lot of non perish item ech...
         9795
                        asst prof of econom cconc was on nbcphiladelph...
         9796
                        gov need to do someth instead of biar je rakya...
         9797
                        \ensuremath{\mathtt{i}} and forestandpap member are commit to the sa...
         Name: OriginalTweet, Length: 9798, dtype: object
# importing stop words
nltk.download("stopwords")
sw=stopwords.words("english")
         ['i', 'me', 'my', 'myself', 'we', 'our', 'ours', 'ourselves', 'you', "you're", "you've", "you'll", "you'd", 'your', 'yourself', 'yourself', 'yourselv
         [nltk_data] Downloading package stopwords to /root/nltk_data...
                                 Package stopwords is already up-to-date!
         [nltk_data]
txt=txt.apply(lambda x:[i for i in tk.tokenize(x) if i not in sw]).apply(lambda y:" ".join(y))
         0
                                                                menyrbi phil gahan chrisitv
                        advic talk neighbour famili exchang phone numb...
         2
                        coronavirus australia woolworth give elder dis...
         3
                        food stock onli one empti pleas panic enough f...
         4
                        readi go supermarket dure outbreak becaus para...
         9793
                        meanwhil supermarket israel peopl danc sing to...
         9794
                        panic buy lot non perish item echo need food d...
         9795
                        asst prof econom cconc nbcphiladelphia talk re...
         9796
                        gov need someth instead biar je rakyat assum 1...
         9797
                        forestandpap member commit safeti employe end ...
         Name: OriginalTweet, Length: 9798, dtype: object
sns.countplot(data=data,y='Sentiment')
plt.title("Class Count Distribution")
plt.show()
```

# 

#### Positive Tweets Wordcloud

plt.show()

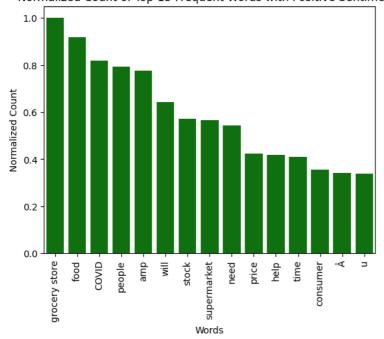
plt.xticks(rotation=90)

plt.show()



```
x = []
y = []
for key,value in wordcloud.words_.items(): # loop through the top 15 frequent words in the word cloud and append the word and its count to x and y list
    x.append(key)
    y.append(value)
    if len(x) == 15:
        break
sns.barplot(x=x,y=y,color='green')
plt.title("Normalized Count of Top-15 Frequent Words with Positive Sentiments")
plt.xlabel("Words")
plt.ylabel("Normalized Count")
```

### Normalized Count of Top-15 Frequent Words with Positive Sentiments



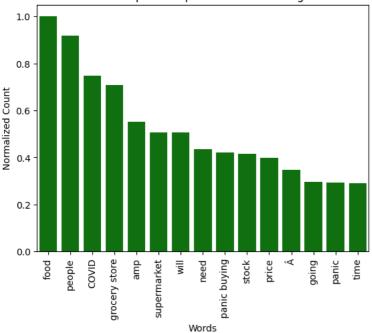
```
wordcloud = WordCloud(max_words=1500, width=600, background_color='black').generate(" ".join(negative_tweets))
plt.imshow(wordcloud, interpolation='bilinear')
plt.title("Negative Tweets Wordcloud")
plt.axis("off")
plt.show()
```

#### **Negative Tweets Wordcloud**

```
price tores to let paper shop shopping works make work to home go les need take government home go
```

```
x = []
y = []
for key,value in wordcloud.words_.items(): # loop through the top 15 frequent words in the word cloud and append the word and its count to x and y list
    x.append(key)
    y.append(value)
    if len(x) == 15:
        break
sns.barplot(x=x,y=y,color='green')
plt.title("Normalized Count of Top-15 Frequent Words with Negative Sentiments")
plt.xlabel("Words")
plt.ylabel("Words")
plt.ylabel("Normalized Count")
plt.xticks(rotation=90)
plt.show()
```

#### Normalized Count of Top-15 Frequent Words with Negative Sentiments



#label encoding
le = LabelEncoder()
data['Sentiment\_encoded'] = le.fit\_transform(data['Sentiment'])
data

	OriginalTweet	Sentiment	Sentiment_encoded
0	@MeNyrbie @Phil_Gahan @Chrisitv and and	Neutral	1
1	advice Talk to your neighbours family to excha	Positive	2
2	Coronavirus Australia: Woolworths to give elde	Positive	2
3	My food stock is not the only one which is emp	Positive	2
4	Me, ready to go at supermarket during the o	Negative	0
9793	Meanwhile In A Supermarket in Israel People	Positive	2
9794	Did you panic buy a lot of non-perishable item	Negative	0
9795	Asst Prof of Economics @cconces was on @NBCPhi	Neutral	1
9796	Gov need to do somethings instead of biar je r	Negative	0
9797	I and @ForestandPaper members are committed to	Positive	2

```
#vectorizing
vectorizer=TfidfVectorizer()
X= vectorizer.fit_transform(data['OriginalTweet'].values.tolist()).toarray()
print(X)

[[0. 0. 0. ... 0. 0. 0.]
       [0. 0. 0. ... 0. 0. 0.]
       [0. 0. 0. ... 0. 0. 0.]
       [0. 0. 0. ... 0. 0. 0.]
       [0. 0. 0. ... 0. 0. 0.]
       [0. 0. 0. ... 0. 0. 0.]
       [0. 0. 0. ... 0. 0. 0.]
       [0. 0. 0. ... 0. 0. 0.]
```

```
y=data['Sentiment_encoded'].values
X_train, X_test, y_train, y_test = train_test_split(X,y,test_size=0.2,random_state=1)
# Model training and Predictions
knn=KNeighborsClassifier()
sv=SVC()
nb=MultinomialNB()
re=LogisticRegression(max_iter=1000)
dt=DecisionTreeClassifier()
rf=RandomForestClassifier()
ab=AdaBoostClassifier()
lst=[knn,sv,nb,re,dt,rf,ab]
for model in 1st:
 print("\n model---",model)
  model.fit(X_train,y_train)
 y_pred=model.predict(X_test)
 print("Accuracy:",accuracy_score(y_test,y_pred)*100)
 #print("Classification report:",classification_report(y_test,y_pred))
 #print(ConfusionMatrixDisplay(y_test,y_pred))
 print("__"*100)
      model--- KNeighborsClassifier()
     Accuracy: 18.16326530612245
      model--- SVC()
     Accuracy: 71.0204081632653
      model--- MultinomialNB()
     Accuracy: 64.48979591836735
      model--- LogisticRegression(max_iter=1000)
     Accuracy: 73.41836734693878
      model--- DecisionTreeClassifier()
     Accuracy: 56.53061224489796
      model--- RandomForestClassifier()
     Accuracy: 65.81632653061224
      model--- AdaBoostClassifier()
     Accuracy: 60.153061224489804
    4
```

### Predictions

```
## Find out how you can protect yourself and loved ones from #coronavirus. ? (positive)
## @DrTedros "We canÂ't stop #COVID19 without protecting #healthworkers. (netral)
##@thehill Americans need to take it upon themselves to help avoid contracting covid-19. (negative)

s="Find out how you can protect yourself and loved ones from #coronavirus. ?"
#y_new=ab.predict(vec.transform([s]))
y_new=rf.predict(vectorizer.transform([s]))
if y_new==1:
    print("Neutral")
elif y_new==2:
    print("Positive")
else:
    print("Negative")

Positive
```

```
#y_new=ab.predict(vec.transform([s]))
y_new=rf.predict(vectorizer.transform([s]))
if y_new==0 :
 print("Neutral")
elif y_new==1 :
 print("Positive")
else:
  print("Negative")
     Neutral
s='@thehill Americans need to take it upon themselves to help avoid contracting covid-19.'
y_new=rf.predict(vectorizer.transform([s]))
if y_new==0 :
 print("Neutral")
elif y_new==1 :
 print("Positive")
else:
 print("Negative")
     Negative
```

s='@DrTedros "We canÂ't stop #COVID19 without protecting #healthworkers.'

✓ 0s completed at 1:41 PM