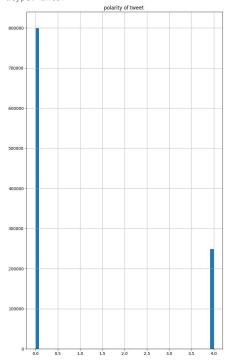
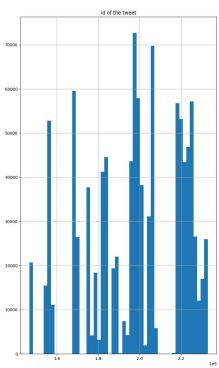
SENTIMENT DATA ANALYSIS

df.hist(bins=50, figsize=(20,15))

```
Exploring dataset
import chardet
import pandas as pd
with open('/content/training.1600000.processed.noemoticon.csv', 'rb') as f:
              result = chardet.detect(f.read(1000000)) # read only 1 million bytes
df = pd.read_csv('/content/training.1600000.processed.noemoticon.csv', encoding=result['encoding'])
df.shape
                  (1048572, 6)
import pandas as pd
# Load the dataset
# Display basic information about the dataset
print(df.info())
# Check the first few rows of the dataset
print('\n\n\n')
print('The fist five columns of the dataset is displayed')
print(df.head())
                   <class 'pandas.core.frame.DataFrame'>
                   RangeIndex: 1048572 entries, 0 to 1048571
                  Data columns (total 6 columns):
                                                                       Non-Null Count
                     # Column
                    0 polarity of tweet 1048572 non-null int64
1 id of the tweet 1048572 non-null int64
2 date of the tweet 1048572 non-null object
                      3 query
                                                                                                           1048572 non-null object
                                 user
                                                                                                             1048572 non-null object
                     5 text of the tweet 1048572 non-null object
                    dtypes: int64(2), object(4)
                    memory usage: 48.0+ MB
                  None
                  The fist five columns of the dataset is displayed % \left\{ \left( 1\right) \right\} =\left\{ \left
                             polarity of tweet  id of the tweet
                                                                                                                                                                                                           date of the tweet
                                                                                                          1467810672 Mon Apr 06 22:19:49 PDT 2009
                                                                                           0
                                                                                                                        1467810917 Mon Apr 06 22:19:53 PDT 2009
                                                                                                   1467811184 Mon Apr 06 22:19:57 PDT 2009
1467811193 Mon Apr 06 22:19:57 PDT 2009
1467811372 Mon Apr 06 22:20:00 PDT 2009
                   2
                                                                                           0
                                                                                            0
                   4
                                                                                            0
                                                                                                 user
                                                                                                                                                                                                                                            text of the tweet
                  0
                            {\tt NO\_QUERY} scotthamilton is upset that he can't update his Facebook by \dots
                             NO_QUERY
                                                                          mattycus @Kenichan I dived many times for the ball. Man...
                             NO_QUERY
                                                                                      ElleCTF
                                                                                                                              my whole body feels itchy and like its on fire
                             NO_QUERY
                                                                                           Karoli @nationwideclass no, it's not behaving at all....
                  4 NO_QUERY
                                                                                    joy_wolf
                                                                                                                                                                                                   @Kwesidei not the whole crew
Exploratory data analysis
import pandas as pd
import matplotlib.pyplot as plt
# Display the first few rows of the DataFrame
print(df.head())
# Display the summary statistics of the
df.describe()
# Display the number of missing values in each column
print(df.isnull().sum())
# Plot a histogram for each numerical attribute
```

polarity of t 0 1 2 3 4	weet id o 0 0 0 0	## the tweet
query 0 NO_QUERY sco 1 NO_QUERY 2 NO_QUERY 3 NO_QUERY 4 NO_QUERY polarity of twee id of the tweet date of the tweet query user text of the twee dtype: int64	mattycus ElleCTF Karoli joy_wolf t 0 0 t 0	<pre>@Kenichan I dived many times for the ball. Man my whole body feels itchy and like its on fire</pre>





Import necessary libraries import pandas as pd import numpy as np import matplotlib.pyplot as plt

Display the first few rows of the data print(df.head())

Display the data types of each column
print(df.dtypes)

Check for missing values
print(df.isnull().sum())

```
polarity of tweet
                           id of the tweet
                                                       date of the tweet
                                1467810672 Mon Apr 06 22:19:49 PDT 2009
    a
                        a
    1
                         0
                                 1467810917 Mon Apr 06 22:19:53 PDT 2009
    2
                         0
                                 1467811184 Mon Apr 06 22:19:57 PDT 2009
     3
                         0
                                 1467811193 Mon Apr 06 22:19:57 PDT 2009
    4
                         0
                                 1467811372 Mon Apr 06 22:20:00 PDT 2009
                                                                text of the tweet
    0 NO_QUERY scotthamilton is upset that he can't update his Facebook by \dots
       NO_QUERY
                      mattycus @Kenichan I dived many times for the ball. Man...
       NO_QUERY
                       ElleCTF
                                  my whole body feels itchy and like its on fire
       NO_QUERY
                        Karoli @nationwideclass no, it's not behaving at all....
    4 NO_QUERY
                       joy_wolf
                                                     @Kwesidei not the whole crew
     polarity of tweet
                            int64
     id of the tweet
                           int64
    date of the tweet
                           object
     query
                           object
    user
                           object
     text of the tweet
                          object
    dtype: object
    polarity of tweet
                           0
     id of the tweet
                          0
     date of the tweet
                          0
     query
                          0
                           0
     user
     text of the tweet
                           0
    dtype: int64
df.nunique()
    polarity of tweet
     id of the tweet
                           1048041
    date of the tweet
                            662450
     query
     user
                            511364
     text of the tweet
     dtype: int64
#Displaying the unique values in the dataset
print('\n\nUnique values of query ')
df['query'].unique()
    Unique values of query
    array(['NO_QUERY'], dtype=object)
df.columns=df.columns.str.strip()
df['polarity of tweet'].unique()
    array([0, 4])
Perform text preprocessing tasks, such as lowercasing, removing stop words, and handling special characters
import nltk
nltk.download('stopwords')
nltk.download('wordnet')
nltk.download('punkt')
from nltk.corpus import stopwords
from nltk.stem import WordNetLemmatizer
from nltk.tokenize import word tokenize
import string
stop words = set(stopwords.words('english'))
lemmatizer = WordNetLemmatizer()
def preprocess_text(text):
   # Convert to lowercase
   text = text.lower()
    # Remove punctuation
   text = ''.join([c for c in text if c not in string.punctuation])
   # Remove stopwords and lemmatize
    text = [lemmatizer.lemmatize(word) for word in word_tokenize(text) if word not in stop_words]
   return ' '.join(text)
     [nltk_data] Downloading package stopwords to /root/nltk_data...
     [nltk_data]
                   Package stopwords is already up-to-date!
     [nltk_data] Downloading package wordnet to /root/nltk_data...
     [nltk_data]
                  Package wordnet is already up-to-date!
     [nltk_data] Downloading package punkt to /root/nltk_data...
     [nltk_data]
                  Unzipping tokenizers/punkt.zip.
```

```
df['preprocessed_text'] = df['text of the tweet'].apply(preprocess_text)
Convert the preprocessed text into numerical vectors using techniques like TF-IDF or word embeddings
from sklearn.feature_extraction.text import TfidfVectorizer
vectorizer = TfidfVectorizer()
X = vectorizer.fit_transform(df['text of the tweet'])
y = df['polarity of tweet']
Split the data into training and testing sets using the train_test_split() function from sklearn
from sklearn.model selection import train test split
X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2, random_state=42)
from sklearn.naive_bayes import MultinomialNB
model = MultinomialNB()
model.fit(X_train, y_train)
      ▼ MultinomialNB
     MultinomialNB()
from sklearn.metrics import accuracy_score
y_pred = model.predict(X_test)
print('Accuracy:', accuracy_score(y_test, y_pred))
     Accuracy: 0.7832725365376821
from sklearn.metrics import accuracy_score, precision_score, recall_score, f1_score
# v test = ...
predictions = model.predict(X_test)
# Calculate metrics
accuracy = accuracy_score(y_test, predictions)
precision = precision_score(y_test, predictions, average='weighted')
```

Assuming that 'y_test' are your true labels and 'predictions' are the predictions made by your model recall = recall_score(y_test, predictions, average='weighted') f1 = f1_score(y_test, predictions, average='weighted') # Print metrics print(f"Accuracy: {accuracy}") print(f"Precision: {precision}") print(f"Recall: {recall}") print(f"F1 Score: {f1}")

Accuracy: 0.7832725365376821 Precision: 0.809377300332663 Recall: 0.7832725365376821 F1 Score: 0.7084173085763821

Implement cross-validation techniques to assess the generalization performance of the model and prevent overfitting

```
from sklearn.model_selection import GridSearchCV
parameters = {'alpha': [0.01, 0.1, 0.5, 1, 10]}
grid_search = GridSearchCV(model, parameters, cv=5, scoring='accuracy')
grid_search.fit(X_train, y_train)
print('Best parameters:', grid_search.best_params_)
print('Best score:', grid_search.best_score_)
     Best parameters: {'alpha': 0.1}
    Best score: 0.8094108994918333
from sklearn.model_selection import cross_val_score
best_model = MultinomialNB(alpha=0.1)
scores = cross_val_score(best_model, X_train, y_train, cv=5, scoring='accuracy')
print('Cross-validation scores:', scores)
print('Mean cross-validation score:', scores.mean())
```

```
from sklearn.feature_extraction.text import TfidfVectorizer
# some example text
corpus = [
    'This is the first document.',
    'This document is the second document.',
    'And this is the third one.',
    'Is this the first document?',
# initialize the vectorizer
vectorizer = TfidfVectorizer()
# fit the vectorizer to the text
X = vectorizer.fit_transform(corpus)
# now you can get the feature names
feature_names = vectorizer.get_feature_names()
print(feature names)
coefs = model.coef_[0]
sorted_coefs = np.argsort(coefs)
print('Top 10 most positive words:')
for i in sorted_coefs[-10:]:
   print(feature_names[i], coefs[i])
print('Top 10 most negative words:')
for i in sorted_coefs[:10]:
   print(feature_names[i], coefs[i])
     AttributeError
                                               Traceback (most recent call last)
     <ipython-input-58-2bf6c1d4fa53> in <cell line: 18>()
          16
          17 # now you can get the feature names
     ---> 18 feature_names = vectorizer.get_feature_names()
          20 print(feature_names)
     AttributeError: 'TfidfVectorizer' object has no attribute 'get_feature_names'
     EXPLAIN ERROR
print(type(vectorizer))
     <class 'sklearn.feature_extraction.text.TfidfVectorizer'>
Evaluate the model's performance using relevant evaluation metrics for sentiment analysis, such as confusion matrix, precision-recall curves, and
ROC-AUC
import sklearn
print(sklearn.__version__)
     1.2.2
from sklearn.metrics import confusion_matrix
y_pred = model.predict(X_test)
cm = confusion_matrix(y_test, y_pred)
print('Confusion matrix:\n', cm)
     Confusion matrix:
      [[159635
      [ 44956 4629]]
from sklearn.metrics import roc_auc_score
y_pred_prob = model.predict_proba(X_test)[:, 1]
roc_auc = roc_auc_score(y_test, y_pred_prob)
print('ROC-AUC score:', roc_auc)
```

Cross-validation scores: [0.80956894 0.81033784 0.80996716 0.80844723 0.80873333]

Mean cross-validation score: 0.8094108994918333

ROC-AUC score: 0.8264902349653249

Deploy the trained model for real-time sentiment analysis, creating an API or integrating it into a web application

```
import streamlit as st
st.title('Sentiment Analysis on Movie Reviews')
review = st.text_input('Enter a movie review:')
if st.button('Predict'):
    review = preprocess_text(review)
    review = vectorizer.transform([review])
    prediction = model.predict(review)
    st.write('The sentiment is:', prediction[0])
```