1. Importing Libraries & Datsets

```
# Load All Libbus
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
from wordcloud import WordCloud
import re
import seaborn as sns
from sklearn.feature extraction.text import TfidfVectorizer
from sklearn.ensemble import RandomForestClassifier
from sklearn.model selection import train test split, cross val score
from sklearn.metrics import accuracy score, classification report,
confusion matrix
# Load All Dss
dataframe hinthi = pd.read csv("hindi data.csv")
dataframe lassi = pd.read csv("punjabi lexicon.csv")
dataframe dhokla = pd.read csv("gujarati data.csv")
dataframe vadapav = pd.read csv("final marathi data.csv")
```

2. Data Exploration

```
print("Hindi Language Dataset:-")
dataframe hinthi
Hindi Language Dataset:-
{"summary":"{\n \"name\": \"dataframe_hinthi\",\n \"rows\": 3641,\n
\"fields\": [\n {\n \"column\": \"Sentence\",\n
\"properties\": {\n \"dtype\": \"string\",\n
                                                                       /"//
\"num unique values\": 3641,\n
                                     \"samples\": [\n
u091f\\u0915\\u0930\\u0936\\u0935\\,\n
u0930\\u094d\\u0915\\u0924\\u093e\\,\n
                                                     \"\\u0938\\u0924\\
                                                     \"damage\"\
         ],\n \"semantic_type\": \"\",\n
\ensuremath{\mbox{"description}}: \ensuremath{\mbox{"\n}},\n {\n \ensuremath{\mbox{"column}}}:
\"Score\",\n \"properties\": {\n \"dtype\": \
\"std\": 0,\n \"min\": -1,\n \"max\": 1,\n
                                                \"dtype\": \"number\",\n
\"num_unique_values\": 2,\n
                                      \"samples\": [\n
                                                                    1, n
-1\n ],\n \"semantic_type\": \"\",\n
\"description\": \"\"\n }\n
                                       }\n ]\
n}","type":"dataframe","variable_name":"dataframe hinthi"}
dataframe hinthi.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 3641 entries, 0 to 3640
```

```
Data columns (total 2 columns):
             Non-Null Count Dtype
    Column
    Sentence 3641 non-null
 0
                           obiect
    Score 3641 non-null
                           int64
dtypes: int64(1), object(1)
memory usage: 57.0+ KB
print("Punjabi Language Dataset:-")
dataframe lassi
Punjabi Language Dataset:-
{"summary":"{\n \"name\": \"dataframe_lassi\",\n \"rows\": 19010,\n
\"fields\": [\n {\n \"column\": \"Word\",\n
\"properties\": {\n \"dtype\": \"string\",\n
\"num unique values\": 19010,\n \"samples\": [\n
\"description\": \"\"\n }\n },\n {\n \"column\": \"Positive Score\",\n \"properties\": {\n \"dtype\": \"number\",\n \"std\": 0.18028028140498936,\n \"min\":
0.0,\n \"max\": 1.0,\n \"num unique values\": 388,\n
\"number\",\n \"std\": 0.20587854135614211,\n \"min\":
       \"max\": 1.0,\n \"num_unique_values\": 409,\n
0.0, n
n}","type":"dataframe","variable_name":"dataframe_lassi"}
dataframe lassi.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 19010 entries, 0 to 19009
Data columns (total 3 columns):
#
    Column
                  Non-Null Count Dtype
0
    Word
                  19010 non-null object
    Positive Score 19010 non-null float64
1
    Negative Score 19010 non-null float64
dtypes: float64(2), object(1)
memory usage: 445.7+ KB
print("Marathi Language Dataset:-")
dataframe_vadapav
Marathi Language Dataset:-
```

```
{"summary":"{\n \"name\": \"dataframe_vadapav\",\n \"rows\": 15164,\
                                                                                         \"column\": \"Sentence\",\n
n \"fields\": [\n
                                                              {\n
\"properties\": {\n
                                                                              \"dtype\": \"string\",\n
\"num unique values\": 15072,\n
                                                                                                                 \"samples\": [\n
                                                                                                                                                                                             / " / /
u0926 \\ u092d \\ u094b \\ u0932 \\ u0915 \\ u0930 \\ \\ u092a \\ u093e \\ \\
u0928\u0938\u0930\u0947\u0902\u091a\u0947\\u093e\
u0930\\u0947\\u0915\\u0930\\u0940\\u0939\\u0940\\u092d\\u093e\\
u091c\u092a\u091a\u0947\u0909\u092e\u0947\u09935\
u093e\\u0930 \\u0926\\u093f\\u0938\\u0924\\u0940\\u0932\\u092e\\
u093e\\u0932\\u0947\\u0917\\u093e\\u0935 \\u092c\\u0949\\u092e\\
u094d\u092c\u0938\u094d\u092b\u094b\u091f\u093e\u0924\u0940\u
u0932 \u0906\u0930\u094b\u092a\u0940 \u092a\u094d\u0930\u
u091c\\u094d\\u093e\\u093e\\u093e\\u0930\\
u091a\\u094d\\u092f\\u093e\\u0909\\u092e\\u0947\\u0935\\
u093e\u0930\u0940\u091a\u0947\u092d\u093e\u091c\u092a\
u093e\\u0915\\u0921\\u0942\\u0928 \\u0939\\u094b\\u093e\\
u0930 \setminus u0947 \setminus u0938 \setminus u092e \setminus u0930 \setminus u094d \setminus u0925 \setminus u092a \setminus u0930 \setminus u0940 \setminus u094
u093e\\u0939\\u0924\\u093e\\u0928\\u0925\\u0941\\u093e\\u093e\\u092e
\\u0917\\u094b\\u0921\\u0938\\u0947 \\u091c\\u093f\\u0935\\u0902\\
u0924 \\u0905\\u0938\\u0924\\u093e \\u0924\\u0930 \\u0924\\u094d\\
u092f\u093e\u093e\u0939\u0940\u093e\u0930\
u0924\\u0940\\u092f \\u091c\\u0928\\u0924\\u093e \\u092a\\u0915\\
u094d\\u0937\\u093e\\u0928\\u0947\\u0909\\u0947\\u0926\\
u0935\u093e\u0930\u0940\u0926\u093f\u0932\u0940\",\n
\"\\u0906\\u0926\\u0930\\u094d\\u0936\\u0930\\u093e\\u094d\\
u092f\u0915\u0930\u094d\u0924\u092f\u093e\u0930\
u093e\u091c\u092e\u093e\u0924\u093e\u092a\u0941\u0923\
u094d\u092f\u0936\u094d\u0932\u094b\u0915\u0995\u0939\
u093f\u0932\u094d\u092f\u093e\u0947\u0935\u0940\)
 u0939 \setminus u094b \setminus u0933 \setminus u0915 \setminus u092f \setminus u093e \setminus u0902 \setminus u0928 \setminus u093e 
\\u092a\\u0941\\u0923\\u094d\\u092f\\u0924\\u093f\\u0925\\u0940\\
u0928 \u093f \u093f \u0924 \u094d \u0924 \u093e \
u0935\\u092a\\u0942\\u0930\\u094d\\u0923\\u0906\\u0926\\u0930\\
u093e\u0992\u091c\u0932\u0940\u0924\u094d\u093e\
u0902\\u0928\\u0940 \\u0930\\u093e\\u091c\\u0915\\u0930\\
u0923\u0938\u092e\u093e\u091c\u0915\u093e\u0930\u0923\u0927\
u0930 \\ u094d \\ u092e \\ u0930 \\ u093e \\ u092f \\ u0923 \\ u0947 \\ \\ u0947 \\ \\ u0930 \\ u0947 \\ \\ 
u091a\u094d\u092f\u093e\u0915\u094d\u0937\u0947\u0924\
u0928\u093f\u0930\u094d\u092e\u093e\u0923\\u0915\u0947\
u0932\\u093e\\u093e\\u0924\\u0927\\u0930\\u094d\\u092e\\
u0902\u091a\u094d\u092f\u093e\u0938\u0940\u092e\u093e\
 u0913 \\ u0932 \\ u0902 \\ u0921 \\ u0942 \\ u0928 \\ u0932 \\ u094b \\ \\ 
u0915 \setminus u0915 \setminus u0932 \setminus u094d \setminus u092f \setminus u0923 \setminus u093e \setminus u091a \setminus u0940
\\u0915\\u093e\\u092e\\u0902\\u0915\\u0947\\u0932\\u0940\\u092a\\
u0930\\u0930\\u093e\\u091c\\u094d\\u092f\\u093e\\u0936\\u0940
\\u0938\\u0939\\u0915\\u093e\\u0930\\u094d\\u092f\\u093e\\u091a\\u0947
\\u0938\\u0932\\u094b\\u0916\\u094d\\u092f\\u093e\\u091a\\u0947\\
u0938\\u0902\\u0902\\u0902\\u0930\\u093e\\u0916\\u0932\\
```

```
\"\\u0917 \\u0926\\u093f \\u092e\\u093e\\u0921\\
u0947\",\n
u0917\\u0942\\u0933\\u0915\\u0930 \\u092f\\u093e\\u0902\\u091a\\u0947
\\u0938\\u0941\\u092a\\u0924\\u094d\\u0930 \\u0906\\u0923\\
u093f \\u091c\\u094d\\u092f\\u0947\\u0937\\u094d\\u092a\\
u0924\\u094d\\u0930\\u0935\\u093e\\u0936\\u0930\\
u0940\\u0927\\u0930 \\u092e\\u093e\\u0921\\u0917\\u0942\\u0933\\
u0915\u0930 \u092f\u093e\u0902\u091a\u094d\u092f\u093e \
u0928 \u093f \u0927 \u0928 \u093a \u0947 \u0935 \u0943 \
u0924 \\ u094d \\ u0938 \\ u0902 \\ u092a \\ u0942 \\ u0930 \\ u094d \\ u0923
\\u092e\\u0939\\u093e\\u0930\\u0937\\u094d\\u091f\\u094d\\
u0930\u093e\u0932\u093e\u091a\u091f\u0915\u093e\u0932\
u093e\\u0935\\u093e\\u093e\\u0930\\u0947\\u0906\\u0939\\u0947\\
u092a\\u0924\\u0930\\u0915\\u093e\\u0930\\u0915\\u093e\\
u0926\\u0902\\u0930\\u0940\\u0915\\u0930\\u0932\\
u0947 \setminus u0916 \setminus u0935 \setminus u093f \setminus u093e \setminus u0930 \setminus u0935 \setminus u0947 \setminus u0916 \setminus u0936 \setminus u093
u0902\u0924 \u0936\u0936\u0935\u093e\u092f \
u0935\\u093f\\u093f\\u093f\\u0927\\u0915\\u0937\\u0947\\
u0924 \\ u0930 \\ u093e \\ u0924 \\ u0932 \\ \\ u0924 \\ u0940 \\
u092f\u093e\u0991\u0991\u0994\u0991\u09930\u0994d\u0992f
\\u0905\\u0928\\u0947\\u0915\\u093e\\u0902\\u0938\\u093e\\u0940
\\u092a\\u094d\\u0930\\u0947\\u0930\\u0923\\u093e\\u093e\\u093e\\
u092f\\u0940 \\u0906\\u0939\\u0947 \\u0924\\u094d\\u092f\\u093e\\
u0902\\u0928\\u093e\\u093e\\u093e\\u091d\\u0940\\u093e\\
 u0935 \setminus u092a \setminus u0942 \setminus u094d \setminus u0923 + u0936 \setminus u094d \setminus u0930 \setminus u0936 \setminus u094d \setminus u0930 + u0936 \setminus u094d \setminus \setminus u09
u0926 \\ \\ u094d \\ \\ u093e \\ \\ u0902 \\ \\ u091c \\ \\ u0932 \\ \\ u0940 \\ \\ \\ \\ \\ n
                                                                                                                                                                                                                                                                                                  ],\n
\"semantic type\": \"\",\n
                                                                                                                                                    \"description\": \"\"\n
                                                                                                                                                                                                                                                                                     }\
                      },\n
                                                                                                 \"column\": \"Score\",\n
                                                                                                                                                                                                                                    \"properties\": {\
                                                        {\n
                                        \"dtype\": \"number\",\n
                                                                                                                                                                                    \"std\": 0,\n
                                                                                                                                                                                                                                                                                 \"min\":
n
                                                          \"max\": 1,\n
                                                                                                                                                     \"num_unique_values\": 3,\n
-1,\n
\"samples\": [\n
                                                                                                                  1, n
                                                                                                                                                                                -1,\n
                                                                                                                                                                                                                                                 0\n
                                                                                                                                                                                                                                                                                                  ],\n
\"semantic type\": \"\",\n
                                                                                                                                                     \"description\": \"\"\n
                                                                                                                                                                                                                                                                                     }\
                      }\n 1\
n}","type":"dataframe","variable name":"dataframe vadapav"}
dataframe vadapav.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 15164 entries, 0 to 15163
Data columns (total 2 columns):
                                                                  Non-Null Count Dtype
   #
                     Column
   0
                     Sentence 15164 non-null
                                                                                                                                        object
   1
                      Score
                                                                  15164 non-null
                                                                                                                                        int64
dtypes: int64(1), object(1)
memory usage: 237.1+ KB
print("Gujrati Language Dataset:-")
dataframe dhokla
Guirati Language Dataset:-
```

```
{"summary":"{\n \"name\": \"dataframe_dhokla\",\n \"rows\": 2887,\n
\"fields\": [\n \"column\": \"Sentence\",\n
\"properties\": {\n
                                                                                                   \"dtype\": \"string\",\n
\"num unique values\": 2628,\n
                                                                                                                                            \"samples\": [\n
u0aa1 \overline{\setminus} u0abe \setminus u0a89 \setminus u0a9f \setminus u0abe \setminus u0a89 \setminus u0ab5 \setminus u0abe \cdot u0a89 \setminus u0abb \cdot u
u0ab0\u0acd\u0a9f \u0a8f\u0a9f\u0ac7\u0a95 \u0a97\u0acd\u
 u0ab0 \\ u0ac0 \\ u0ab2 \\ \\ u0ab6 \\ \\ u0ac7 \\ \\ u0ab8 \\ \\ u0acd \\ \\ u0a9f \\ \\ \\ u0ab0 \\ \\ u0acd \\ \\ u0aef \\ \\ u0aef
u0acb\u0ab0\u0aa8\u0acd\u0a9f\u0aae\u0abe\u0a9f\u0ac7\)
u0a8f\u0a95\u0aa6\u0aae \u0ab8\u0aaa\u0abe\u0a9f \u0aac\u
u0ab9\u0abe\u0aa8\u0ac1\u0a82 \u0ac7\",\n
u0aae\\u0ac7\\u0a82 \\u0ab2\\u0ac7\\u0aae\\u0aa8 \\u0ab0\\u0abe\\
u0ab8\\u0acd\\u0aaa\\u0aac\\u0ac7\\u0ab0\\u0ac0 \\u0a86\\u0a88\\u0ab8
\\u0a95\\u0acb\\u0a95\\u0a9f\\u0ac7\\u0ab2\\u0aa8\\u0acb \\u0a93\\
u0ab0\\u0acd\\u0aa1\\u0ab0 \\u0a86\\u0aaa\\u0acd\\u0aaf\\u0acb \\
u0a9c \\ u0a85 \\ u0a95 \\ u0ab2 \\ u0aaa \\ u0aa8 \\ u0ac0 \\ u0aaf
\\u0aaa\\u0aa3 \\u0ab9\\u0aa4\\u0acb\",\n
                                                                                                                                                                                            \"\\u0a85\\u0ab8\\
                                                                                                          \"semantic type\": \"\",\n
u0ab2\"\n
                                                              ],\n
\"description\": \"\"\n
                                                                                                        }\n
                                                                                                                            },\n {\n \"column\":
                                                                                                                                                                  \"dtype\": \"number\",\n
\"Score\",\n \"properties\": {\n
\"std\": 0,\n \"min\": 0,\n \"max\": 1,\n
\"num_unique_values\": 2,\n
                                                                                                                                 \"samples\": [\n
                                                                                                                                                                                                                                 1, n
                                        ],\n \"semantic type\": \"\",\n
0\n
\"description\": \"\"\n }\n },\n
                                                                                                                                                              {\n
                                                                                                                                                                                                \"column\":
\"Stopword\",\n\\"properties\": {\n\\"category\",\n\\"num_unique_values\\"samples\": [\n\\";\",\n\
                                                                                                                                                                                 \"dtype\":
                                                                                    \"num_unique_values\": 115,\n
                                                                                                                                                                  \"\\u0a95\\u0ac7\"\n
                                           \"semantic_type\": \"\",\n
                                                                                                                                                              \"description\": \"\"\n
],\n
}\n
                         }\n ]\
n}","type":"dataframe","variable_name":"dataframe_dhokla"}
dataframe dhokla.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 2887 entries, 0 to 2886
Data columns (total 3 columns):
                                                       Non-Null Count Dtype
                  Column
   0
                  Sentence 2887 non-null
                                                                                                                  object
   1
                  Score
                                                      2887 non-null
                                                                                                                  int64
                  Stopword 122 non-null
   2
                                                                                                                  object
dtypes: int64(1), object(2)
memory usage: 67.8+ KB
```

3. ML Model (RFC)

```
# defineing TF-IDF vectorizer
tfidf_vectorizer = TfidfVectorizer()
```

```
# converting text dataframe into numerical features
X_hindi = tfidf_vectorizer.fit transform(dataframe hinthi['Sentence'])
X punjabi = tfidf vectorizer.transform(dataframe lassi['Word'])
X gujrati = tfidf vectorizer.transform(dataframe dhokla['Sentence'])
X marathi = tfidf vectorizer.transform(dataframe vadapav['Sentence'])
# target variables
y hindi = dataframe hinthi['Score']
v punjabi = (dataframe lassi['Positive Score'] >
dataframe lassi['Negative Score']).astype(int)
y gujrati = dataframe dhokla['Score']
y marathi = dataframe vadapav['Score']
# spliting in ts & ts
X_hindi_train, X_hindi_test, y_hindi_train, y_hindi_test =
train test split(X hindi, y hindi, test size=0.2, random state=42)
X_marathi_train, X_marathi_test, y_marathi_train, y_marathi_test =
train_test_split(X_marathi, y_marathi, test_size=0.2, random_state=42)
X gujrati train, X gujrati test, y gujrati train, y gujrati test =
train_test_split(X_gujrati, y_gujrati, test_size=0.2, random_state=42)
X_punjabi_train, X_punjabi_test, y_punjabi_train, y_punjabi_test =
train test split(X punjabi, y punjabi, test size=0.2, random state=42)
# train the Random Forest Classifier
model hindi = RandomForestClassifier()
model hindi.fit(X hindi train, y hindi train)
RandomForestClassifier()
model marathi = RandomForestClassifier()
model marathi.fit(X marathi train, y marathi train)
RandomForestClassifier()
model gujrati = RandomForestClassifier()
model gujrati.fit(X gujrati train, y gujrati train)
RandomForestClassifier()
model punjabi = RandomForestClassifier()
model_punjabi.fit(X_punjabi_train, y_punjabi_train)
RandomForestClassifier()
# modal evalution on the test set
y hindi pred = model hindi.predict(X hindi test)
accuracy_hindi = accuracy_score(y_hindi_test, y_hindi_pred)
print(f"Accuracy on the Hindi test set: {accuracy_hindi}")
Accuracy on the Hindi test set: 0.663923182441701
```

```
v marathi pred = model marathi.predict(X marathi test)
accuracy marathi = accuracy score(y marathi test, y marathi pred)
print(f"Accuracy on the marathi test set: {accuracy marathi}")
Accuracy on the marathi test set: 0.6660072535443455
v quirati pred = model quirati.predict(X quirati test)
accuracy gujrati = accuracy score(y gujrati test, y gujrati pred)
print(f"Accuracy on the gujrati test set: {accuracy_gujrati}")
Accuracy on the gujrati test set: 0.5536332179930796
v punjabi pred = model punjabi.predict(X punjabi test)
accuracy_punjabi = accuracy_score(y_punjabi_test, y_punjabi_pred)
print(f"Accuracy on the punjabi test set: {accuracy_punjabi}")
Accuracy on the punjabi test set: 0.7185691741188848
# generating classification report
class report hindi = classification report(y hindi test, y hindi pred)
print("Classification Report for Hindi:")
print(class report hindi)
Classification Report for Hindi:
              precision
                           recall f1-score
                                               support
                             0.87
                                        0.77
                                                   465
          - 1
                   0.69
           1
                   0.57
                             0.30
                                        0.39
                                                   264
                                        0.66
                                                   729
    accuracy
                                                   729
   macro avg
                   0.63
                             0.59
                                        0.58
                                                   729
weighted avg
                   0.64
                             0.66
                                        0.63
class report marathi = classification report(y marathi test,
y marathi pred)
print("Classification Report for Marathi:")
print(class report marathi)
Classification Report for Marathi:
              precision
                           recall f1-score
                                               support
                             0.75
          - 1
                   0.65
                                        0.69
                                                   963
           0
                   0.65
                             0.68
                                        0.66
                                                  1066
           1
                   0.71
                             0.58
                                        0.64
                                                  1004
                                                  3033
    accuracy
                                        0.67
                             0.67
                                        0.66
                                                  3033
                   0.67
   macro avg
                                        0.66
weighted avg
                   0.67
                             0.67
                                                  3033
```

```
class report punjabi = classification report(y punjabi test,
y punjabi pred)
print("Classification Report for Punjabi:")
print(class report punjabi)
Classification Report for Punjabi:
              precision
                        recall f1-score
                                              support
           0
                   0.72
                             1.00
                                       0.84
                                                 2732
           1
                   0.00
                             0.00
                                       0.00
                                                 1070
    accuracy
                                       0.72
                                                 3802
                   0.36
                             0.50
                                       0.42
                                                 3802
   macro avq
                                       0.60
weighted avg
                   0.52
                             0.72
                                                 3802
/usr/local/lib/python3.10/dist-packages/sklearn/metrics/
classification.py:1344: UndefinedMetricWarning: Precision and F-score
are ill-defined and being set to 0.0 in labels with no predicted
samples. Use `zero division` parameter to control this behavior.
  warn prf(average, modifier, msg start, len(result))
/usr/local/lib/python3.10/dist-packages/sklearn/metrics/ classificatio
n.py:1344: UndefinedMetricWarning: Precision and F-score are ill-
defined and being set to 0.0 in labels with no predicted samples. Use
zero division` parameter to control this behavior.
  warn prf(average, modifier, msg start, len(result))
/usr/local/lib/python3.10/dist-packages/sklearn/metrics/ classificatio
n.py:1344: UndefinedMetricWarning: Precision and F-score are ill-
defined and being set to 0.0 in labels with no predicted samples. Use
`zero division` parameter to control this behavior.
  warn prf(average, modifier, msg start, len(result))
class report quirati = classification report(y quirati test,
y quirati pred)
print("Classification Report for Gujarati:")
print(class report gujrati)
Classification Report for Gujarati:
              precision
                           recall f1-score
                                              support
           0
                   0.55
                             1.00
                                       0.71
                                                  320
           1
                   0.00
                             0.00
                                       0.00
                                                  258
                                       0.55
                                                   578
    accuracy
                   0.28
                             0.50
                                       0.36
                                                   578
   macro avq
```

/usr/local/lib/python3.10/dist-packages/sklearn/metrics/ _classification.py:1344: UndefinedMetricWarning: Precision and F-score are ill-defined and being set to 0.0 in labels with no predicted

0.39

578

0.55

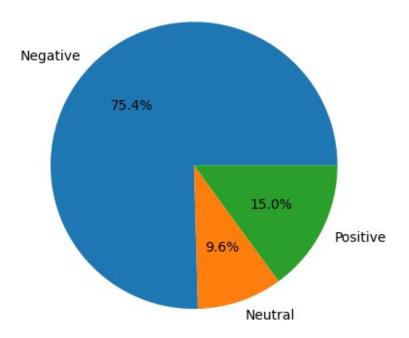
weighted avg

0.31

```
samples. Use `zero_division` parameter to control this behavior.
  warn prf(average, modifier, msg start, len(result))
/usr/local/lib/python3.10/dist-packages/sklearn/metrics/ classificatio
n.py:1344: UndefinedMetricWarning: Precision and F-score are ill-
defined and being set to 0.0 in labels with no predicted samples. Use
zero division` parameter to control this behavior.
  warn prf(average, modifier, msg start, len(result))
/usr/local/lib/python3.10/dist-packages/sklearn/metrics/ classificatio
n.py:1344: UndefinedMetricWarning: Precision and F-score are ill-
defined and being set to 0.0 in labels with no predicted samples. Use
zero division` parameter to control this behavior.
 warn prf(average, modifier, msg start, len(result))
# generateing confusion matrix
conf matrix hindi = confusion matrix(y hindi test, y hindi pred)
print("Confusion Matrix for Hindi:")
print(conf matrix hindi)
Confusion Matrix for Hindi:
[[405 60]
[185 79]]
conf matrix hindi = confusion matrix(y hindi test, y hindi pred)
print("Confusion Matrix for Hindi:")
print(conf matrix hindi)
Confusion Matrix for Hindi:
[[405 60]
[185 79]]
conf matrix gujrati = confusion_matrix(y_gujrati_test, y_gujrati_pred)
print("Confusion Matrix for Gujrati:")
print(conf matrix gujrati)
Confusion Matrix for Gujrati:
[[320
        01
 [258
        011
```

4. Sentiment Analysis

```
0.00
    sentiment scores = []
    for pred in predictions:
        if pred >= positive threshold:
            sentiment scores.append('Positive')
        elif pred <= negative threshold:</pre>
            sentiment scores.append('Negative')
        else:
            sentiment scores.append('Neutral')
    return sentiment scores
def calculate sentiment distribution(sentiment scores):
    Calculate the distribution of sentiment labels.
    unique sentiments, counts = np.unique(sentiment scores,
return counts=True)
    return dict(zip(unique_sentiments, counts))
def plot sentiment distribution(sentiment distribution):
    Plot the distribution of sentiment labels.
    labels, counts = zip(*sentiment distribution.items())
    plt.pie(counts, labels=labels, autopct='%1.1f%%')
    plt.title('Sentiment Distribution')
    plt.show()
# sentiment labels for Hindi test data
y hindi pred = model hindi.predict proba(X hindi test)[:, 1]
sentiment scores hindi = convert to sentiment scores(y hindi pred)
# pie chart for sentiment distribution
sentiment distribution hindi =
calculate sentiment distribution(sentiment scores hindi)
plot sentiment distribution(sentiment distribution hindi)
```



```
text_hindi = ' '.join(preprocessed_hindi_text)
font_path = '/content/Mangal Regular.ttf'
wordcloud_hindi = WordCloud(width=800, height=400,
background_color='white', font_path=font_path).generate(text_hindi)
plt.figure(figsize=(10, 8))
plt.imshow(wordcloud_hindi, interpolation='bilinear')
plt.title('Word Cloud for Hindi')
plt.axis('off')
plt.show()
```

Word Cloud for Hindi



Sentiment Analysis for Marathi

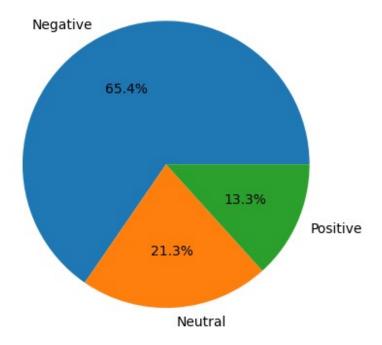
y_marathi_pred = model_marathi.predict_proba(X_marathi_test)[:, 1]
sentiment_scores_marathi = convert_to_sentiment_scores(y_marathi_pred)

pie chart for sentiment distribution in Marathi

sentiment_distribution_marathi =

calculate_sentiment_distribution(sentiment_scores_marathi)

plot_sentiment_distribution(sentiment_distribution_marathi)



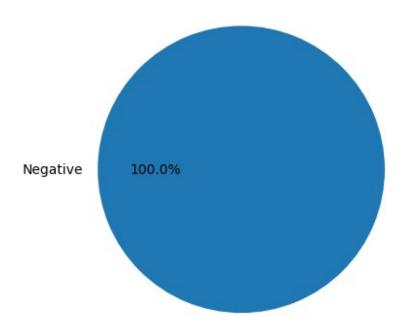
```
dataframe_marathi = pd.read_csv("/content/final_marathi_data.csv")
marathi_text = ' '.join(dataframe_marathi['Sentence'])
wordcloud_marathi = WordCloud(width=800, height=400,
background_color='white', font_path='/content/Mangal
Regular.ttf').generate(marathi_text)
plt.figure(figsize=(10, 8))
plt.imshow(wordcloud_marathi, interpolation='bilinear')
plt.title('Word Cloud for Marathi')
plt.axis('off')
plt.show()
```

Word Cloud for Marathi

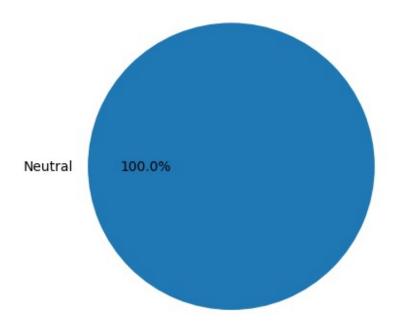


```
# sentiment labels for Punjabi test data
y_punjabi_pred = model_punjabi.predict_proba(X_punjabi_test)[:, 1]
sentiment_scores_punjabi = convert_to_sentiment_scores(y_punjabi_pred)

# pie chart for sentiment distribution in punjabi
sentiment_distribution_punjabi =
calculate_sentiment_distribution(sentiment_scores_punjabi)
plot_sentiment_distribution(sentiment_distribution_punjabi)
```



```
# sentiment labels for gujarati test data
y_gujarati_pred = model_gujrati.predict_proba(X_gujrati_test)[:, 1]
sentiment_scores_gujarati =
convert_to_sentiment_scores(y_gujarati_pred)
sentiment_distribution_gujarati =
calculate_sentiment_distribution(sentiment_scores_gujarati)
plot_sentiment_distribution(sentiment_distribution_gujarati)
```



```
dataframe_gujarati = pd.read_csv("/content/gujarati_data.csv")
gujarati_text = ' '.join(dataframe_gujarati['Sentence'])
wordcloud_gujarati = WordCloud(width=800, height=400,
background_color='white',
font_path='/content/Aakar.ttf').generate(gujarati_text)
plt.figure(figsize=(10, 8))
plt.imshow(wordcloud_gujarati, interpolation='bilinear')
plt.title('Word Cloud for Gujarati')
plt.axis('off')
plt.show()
```

