SENTIMENT ANALYSIS: A MACHINE LEARNING APPROACH

Analyzing Text Sentiment with VADER and NLP

AGENDA

- Introduction to Sentiment Analysis
- Natural Language Processing (NLP) Techniques
- Data Preprocessing
- Sentiment Analysis with VADER
- Visualizing Sentiment
- Model Saving
- Model loading

WHAT IS SENTIMENT ANALYSIS?

- **Definition:** Sentiment analysis, also known as opinion mining, is the process of determining the emotional tone behind a body of text. It is used to understand the attitudes, opinions, and emotions expressed within an online mention.
- **Applications:** Widely used in business to analyze customer feedback, social media monitoring, market research, and more.
- **Importance:** Helps businesses understand the customer sentiment towards products, services, or topics and make data-driven decisions.

NLP TECHNIQUES USED

- **Text Tokenization:** Breaking down text into individual words or sentences.
- **Stop Words Removal:** Eliminating common words that do not contribute to the sentiment (e.g., 'and', 'the').
- **Lemmatization:** Reducing words to their base or root form.
- **Sentiment Analysis with VADER:** Using the VADER (Valence Aware Dictionary and sEntiment Reasoner) tool for analyzing the sentiment of text, particularly effective for social media content.

DATA PREPROCESSING STEPS

- **Loading Text Data:** Reading the speech text from a file.
- **Cleaning Text:** Removing punctuation and converting text to lowercase.
- **Tokenizing Text:** Splitting the text into individual words.
- **Removing Stop Words:** Filtering out common, non-informative words.
- **Lemmatizing Words:** Converting words to their base form for consistency.

LOADING AND CLEANING TEXT DATA

```
import os
import re
import nltk
from nltk.corpus import stopwords
from nltk.tokenize import word_tokenize
nltk.download('punkt')
nltk.download('stopwords')

# Load speech text
file_path = "/content/drive/MyDrive/speech.txt"
with open(file_path, 'r', encoding='utf-8') as file:
    speech_text = file.read()
print(file_path)

# Clean and preprocess the textAr()
print(speech_text_cleaned[:500])  # Display first 500 characters of cleaned text
```

```
words = word_tokenize(speech_text_cleaned)
stop_words = set(stopwords.words('english'))
word_filters = [word for word in words if word not in stop_words]
print(word_filters[:20])  # Display first 20 tokenized words
```

TOKENIZING AND REMOVING STOP WORDS

```
from nltk.stem import WordNetLemmatizer
nltk.download('wordnet')


lemmatizer = WordNetLemmatizer()
words_lemmatizer = [lemmatizer.lemmatize(word) for word in word_filters]
print(words_lemmatizer[:20])  # Display first 20 lemmatized words
```

LEMMATIZATION

SENTIMENT ANALYSIS WITH VADER

- **VADER Overview:** VADER (Valence Aware Dictionary and sEntiment Reasoner) is a lexicon and rule-based sentiment analysis tool designed for social media text.
- **Sentiment Scores:** VADER provides a compound sentiment score for each word, which is used to determine the overall sentiment of the text.
- **Categories:** Words are classified into positive, negative, and neutral categories based on their sentiment scores.

```
from nltk.sentiment.vader import SentimentIntensityAnalyzer
nltk.download('vader_lexicon')

sia = SentimentIntensityAnalyzer()
sentiment_scores = [sia.polarity_scores(word)['compound'] for word in words_lemmatizer]
average_sentiment = sum(sentiment_scores) / len(sentiment_scores)
print(f"The average sentiment is: {average_sentiment}")
```

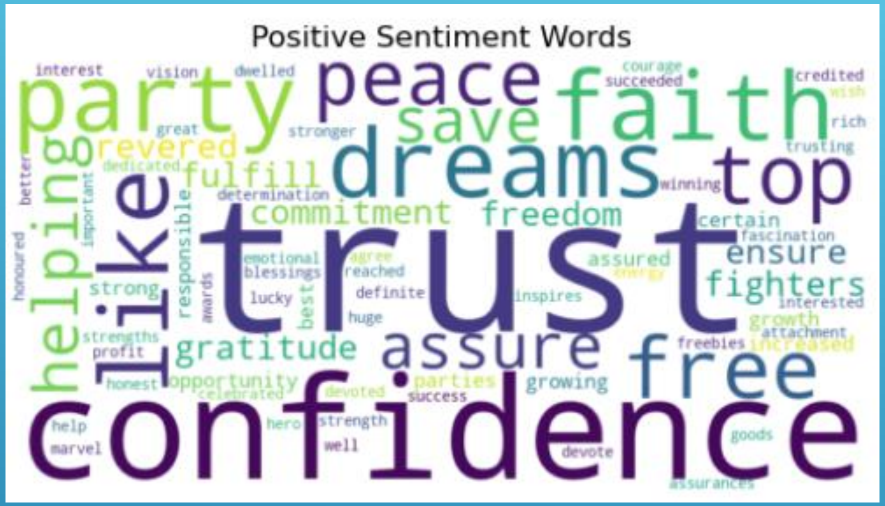
SENTIMENT ANALYSIS WITH VADER

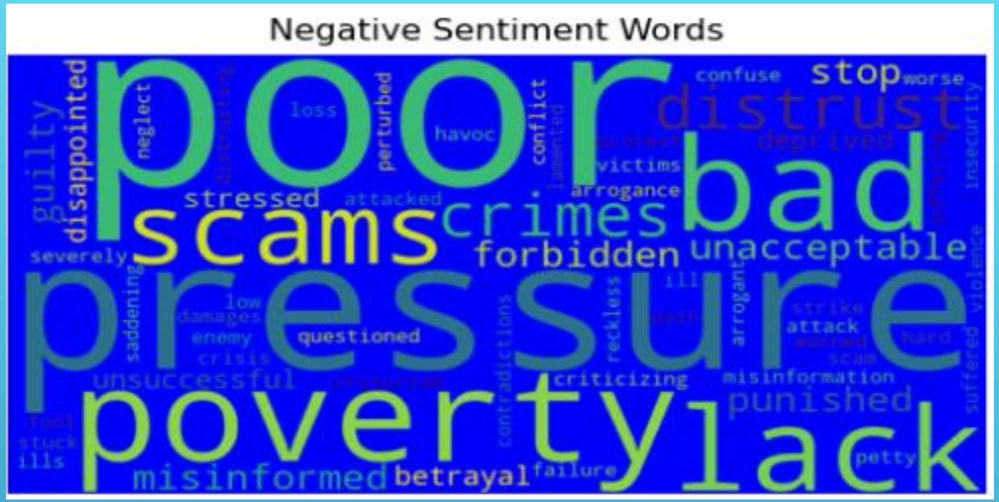
VISUALIZING SENTIMENT

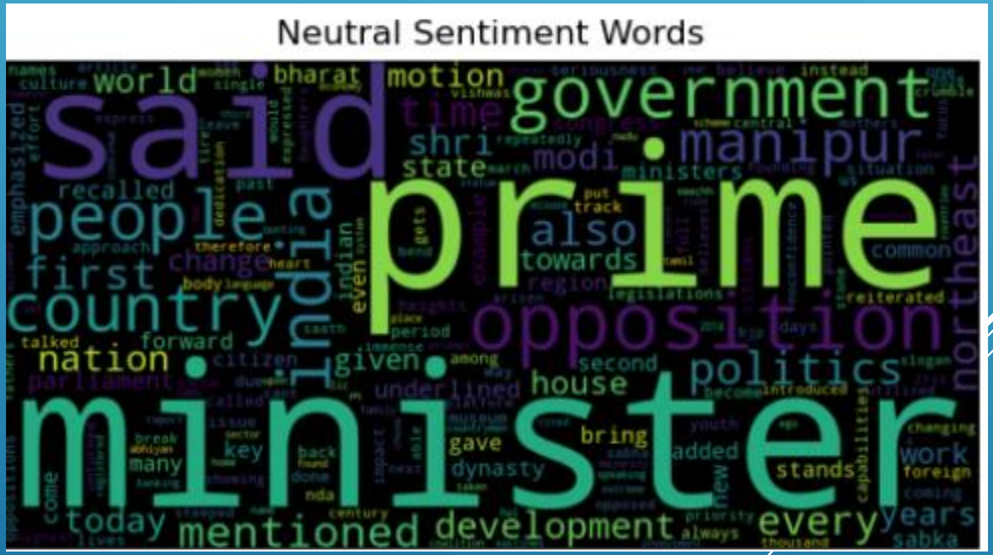
- **Word Clouds:** Visual representations of the most frequent positive and negative words.
- **Bar Charts:** Highlighting the top 10 most frequent words in each sentiment category.
- **Pie Chart:** Showing the distribution of sentiments (positive, negative, neutral) across the text.

```
positive_words = [word for i, word in enumerate(word_filters) if sentiment_scores[i] > 0.1]
negative_words = [word for i, word in enumerate(word_filters) if sentiment_scores[i] < -0.1]
neutral_words = [word for i, word in enumerate(word_filters) if -0.1 <= sentiment_scores[i] <= 0.1]

print("The positive words are:", positive_words[:10])
print("The negative words are:", negative_words[:10])
print("The neutral words are:", neutral_words[:10])
```

CLASSIFYING WORDS BY SENTIMENT


Positive Sentiment Words
trust
confidence
party
peace
faith
dreams
top
like
helping
save
fulfill
commitment
freedom
assure
free
gratitude
fighters
ensure
revered


Negative Sentiment Words
poor
pressure
poverty
bad
scams
crimes
lack
distrust
stop
unacceptable
forbidden
misinformed
betrayal
punished
disappointed
stressed


Neutral Sentiment Words
minister
prime
said
government
opposition
manipur
people
country
india
politics
development
mentioned
nation
first
world
motion
bharat

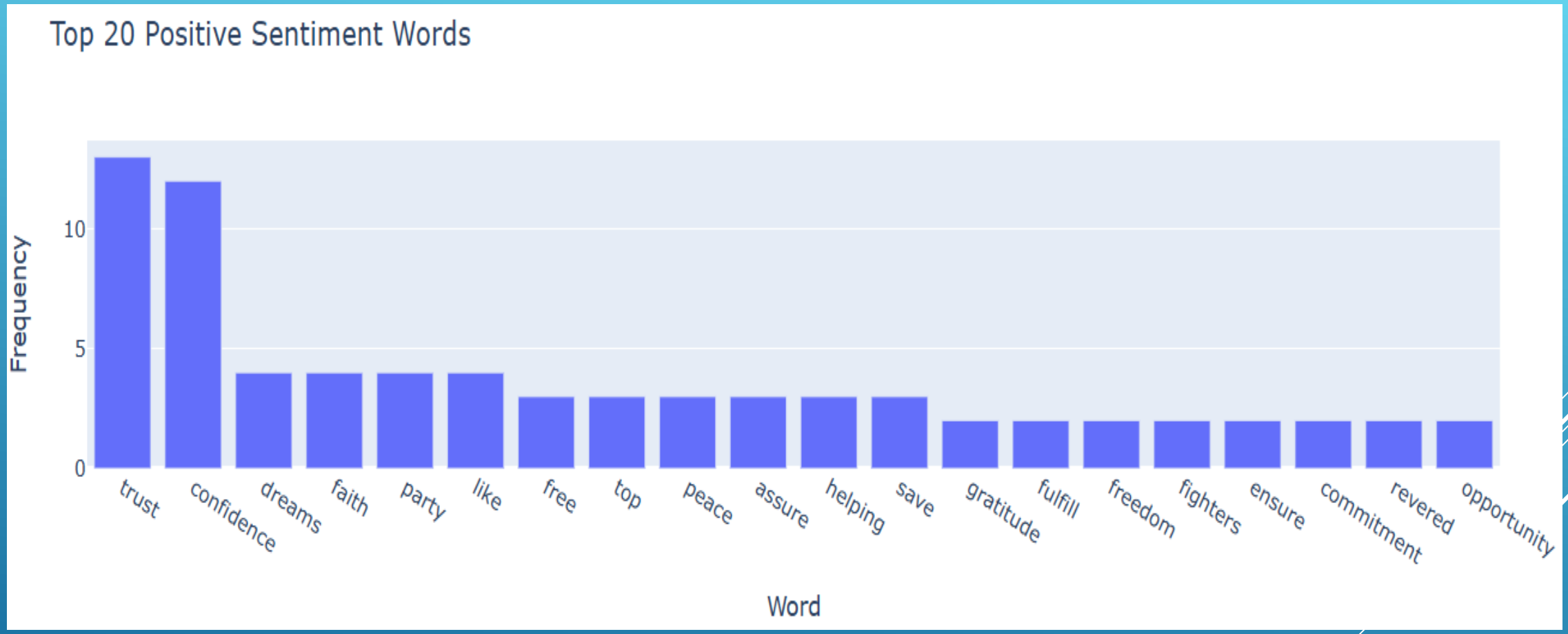
WORD CLOUD

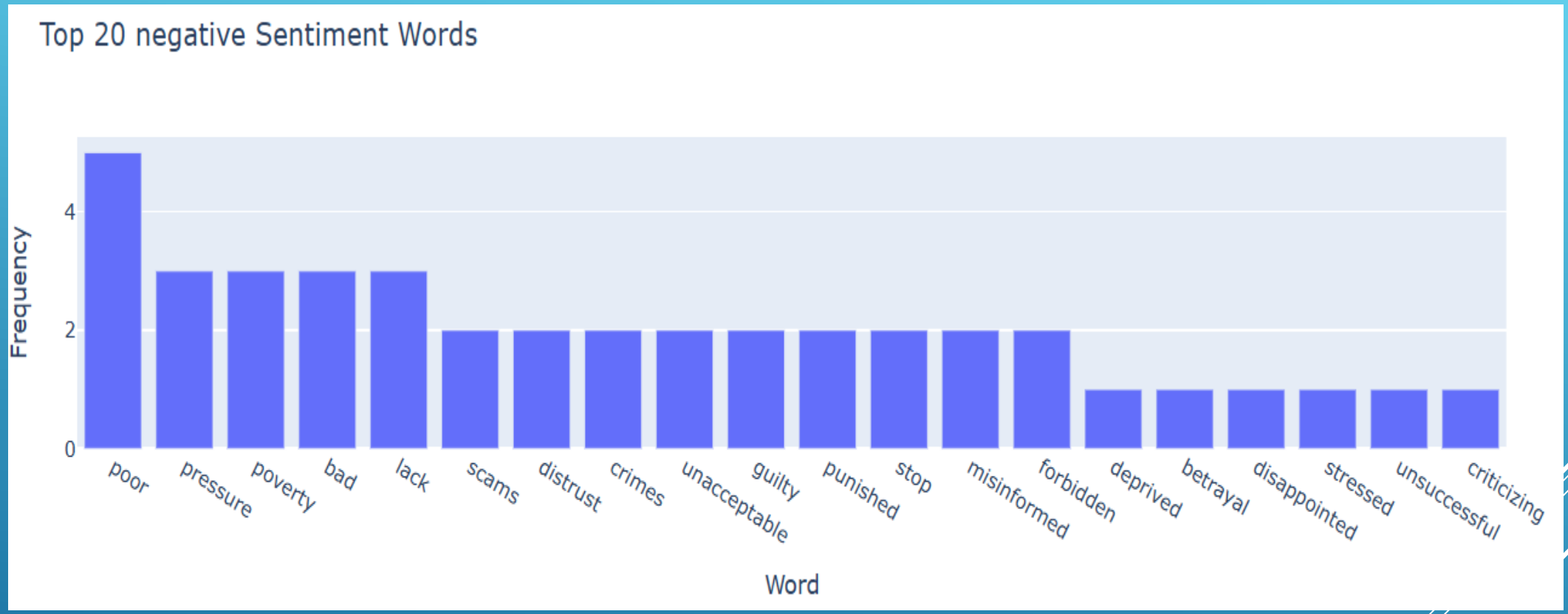
```
from wordcloud import WordCloud
import matplotlib.pyplot as plt

# Word cloud for positive words
positive_wordcloud = WordCloud(width=800, height=400, background_color='white').generate(' '.join(positive_words))
plt.figure(figsize=(10, 5))
plt.imshow(positive_wordcloud, interpolation='bilinear')
plt.axis('off')
plt.title('Positive Words Word Cloud')
plt.show()
```

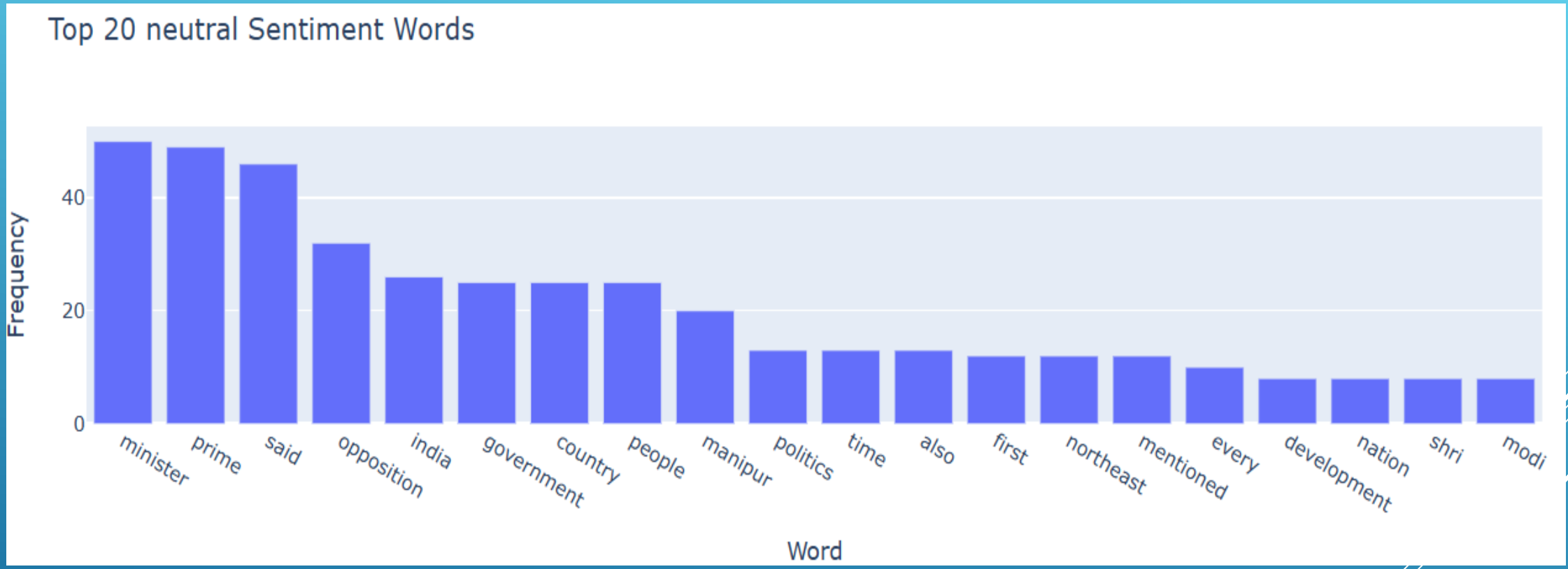
WORD CLOUDS FOR SENTIMENT

```
import pandas as pd
import seaborn as sns

def plot_word_freq(word_freq, title):
    word_freq_df = pd.DataFrame(word_freq.items(),
                                columns=['Word', 'Frequency']).sort_values
                                 (by='Frequency', ascending=False).head(10)
    plt.figure(figsize=(10, 5))
    sns.barplot(x='Frequency', y='Word', data=word_freq_df, palette='viridis')
    plt.title(title)
    plt.show()

# Plot word frequencies
word_freq_positive = nltk.FreqDist(positive_words)
plot_word_freq(word_freq_positive, 'Top 10 Positive Words')
```

BAR CHARTS FOR WORD FREQUENCIES

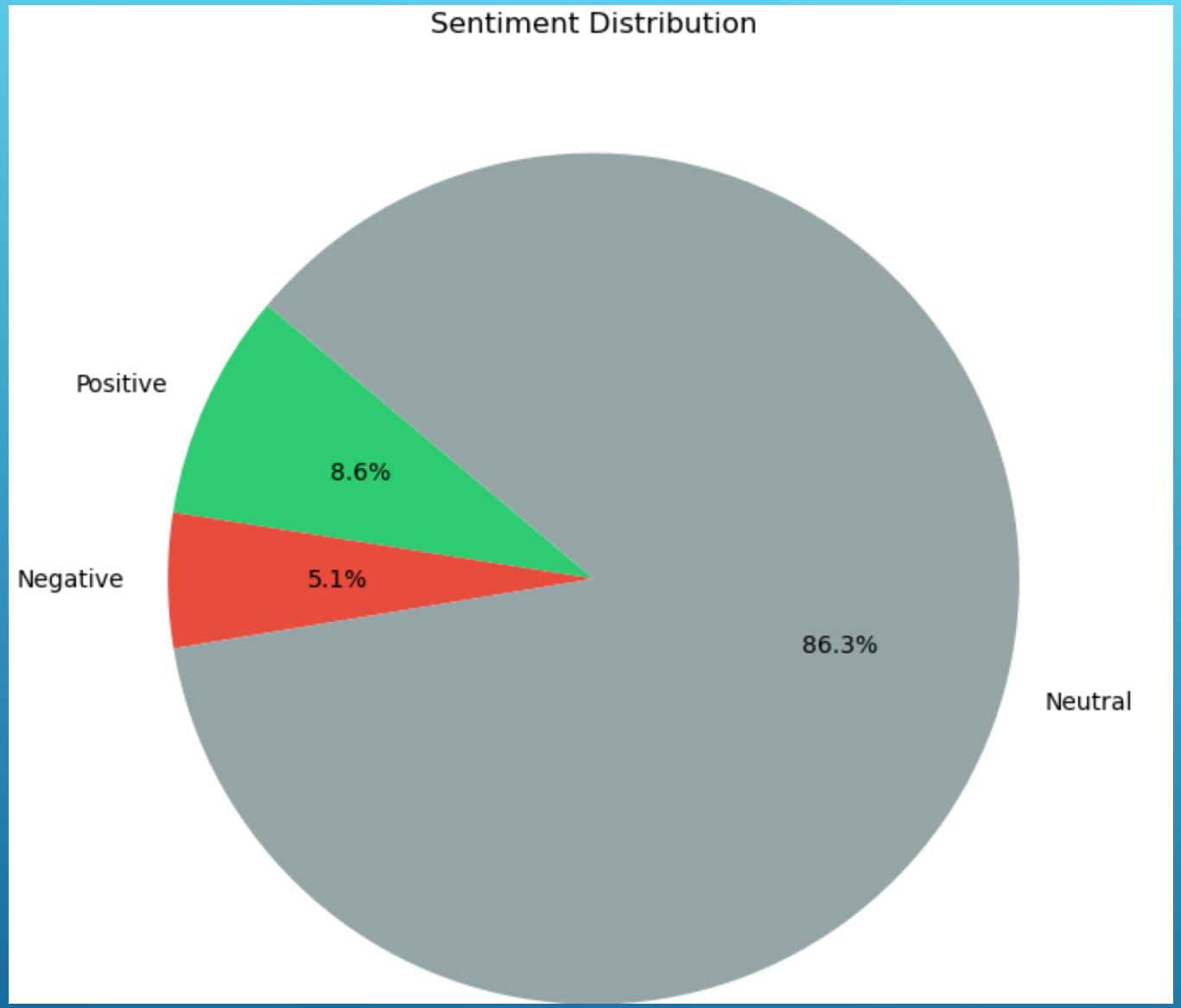

Top 20 Positive Sentiment Words
Frequency
10
5
0
trust
confidence
dreams
faith
party
like
free
top
peace
assure
helping
save
gratitude
fulfill
freedom
fighters
ensure
commitment
revered
opportunity
Word


Top 20 negative Sentiment Words
Frequency
0
2
4
poor
pressure
poverty
bad
lack
scams
distrust
crimes
unacceptable
guilty
punished
stop
misinformed
forbidden
deprived
betrayal
disappointed
stressed
unsuccessful
criticizing
Word


Top 20 neutral Sentiment Words
Frequency
0
20
40
minister
prime
said
opposition
india
government
country
people
manipur
politics
time
also
first
northeast
mentioned
every
development
nation
shri
modi
Word

```
sentiment_counts = [len(positive_words), len(negative_words), len(neutral_words)]
sentiment_labels = ['Positive', 'Negative', 'Neutral']
colors = ['#2ecc71', '#e74c3c', '#95a5a6']


plt.figure(figsize=(8, 8))
plt.pie(sentiment_counts, labels=sentiment_labels, colors=colors, autopct='%1.1f%%', startangle=140)
plt.title('Sentiment Distribution')
plt.show()
```

SENTIMENT DISTRIBUTION PIE CHART


Sentiment Distribution
Positive
8.6%
Negative
5.1%
86.3%
Neutral

MODEL SAVING

```python
import pickle

# Save lemmatized words
with open('words_lemmatized.pkl', 'wb') as file:
    pickle.dump(words_lemmatized, file)

# Save sentiment scores
with open('sentiment_scores.pkl', 'wb') as file:
    pickle.dump(sentiment_scores, file)

# Save sentiment word lists
with open('positive_words.pkl', 'wb') as file:
    pickle.dump(positive_words, file)

with open('negative_words.pkl', 'wb') as file:
    pickle.dump(negative_words, file)

with open('neutral_words.pkl', 'wb') as file:
    pickle.dump(neutral_words, file)

# Save word frequency distributions
with open('word_freq_positive.pkl', 'wb') as file:
    pickle.dump(word_freq_positive, file)

with open('word_freq_negative.pkl', 'wb') as file:
    pickle.dump(word_freq_negative, file)

with open('word_freq_neutral.pkl', 'wb') as file:
    pickle.dump(word_freq_neutral, file)
```

MODEL LOADING

```python
import pickle

# Load lemmatized words
with open('words_lemmatized.pkl', 'rb') as file:
    words_lemmatized = pickle.load(file)

# Load sentiment scores
with open('sentiment_scores.pkl', 'rb') as file:
    sentiment_scores = pickle.load(file)

# Load sentiment word lists
with open('positive_words.pkl', 'rb') as file:
    positive_words = pickle.load(file)

with open('negative_words.pkl', 'rb') as file:
    negative_words = pickle.load(file)

with open('neutral_words.pkl', 'rb') as file:
    neutral_words = pickle.load(file)

# Load word frequency distributions
with open('word_freq_positive.pkl', 'rb') as file:
    word_freq_positive = pickle.load(file)

with open('word_freq_negative.pkl', 'rb') as file:
    word_freq_negative = pickle.load(file)

with open('word_freq_neutral.pkl', 'rb') as file:
    word_freq_neutral = pickle.load(file)
```