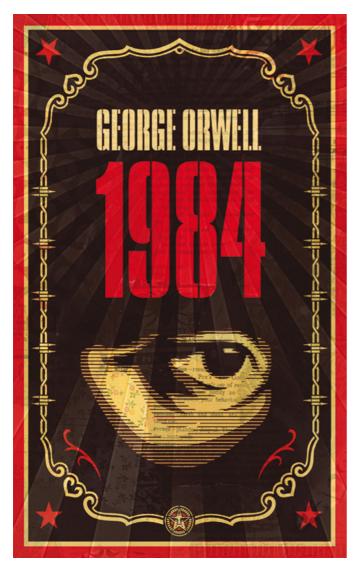
NLP PROJECT

TEAM TECH VIBERS



PROJECT TEAM MEMBERS:

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▼ READING CONTENT OF THE BOOK

import numpy as np

import pandas as pd

import matplotlib.pyplot as plt

import seaborn as sns

import re

 $\label{prop:continuous} \mbox{from collections import Counter}$

 $\ \ \, \text{from wordcloud import WordCloud}$

import nltk

 $\label{from:corpus} \mbox{from nltk.corpus import stopwords}$

```
from nltk.tokenize import word_tokenize
from nltk import FreqDist
from nltk import pos_tag
from google.colab import files
file path='/content/Orwell-1949 1984.txt'
with open(file_path, "r") as file:
      content = file.read()
print("TEXT CONTENT OF THE FILE:")
print(content)
        had already been rewritten, but fragments of the literature
        of the past survived here and there, imperfectly censored,
        and so long as one retained one's knowledge of Oldspeak
        it was possible to read them. In the future such fragments,
        even if they chanced to survive, would be unintelligible
         and \ untranslatable. \ It \ was \ impossible \ to \ translate \ any \ passage \ of \ Oldspeak \ into \ Newspeak \ unless \ it \ either \ referred \ to \ translate \ tran
        some technical process or some very simple everyday action, or was already orthodox (GOODTHINKFUL would
        be the Newspeak expression) in tendency. In practice this
        meant that no book written before approximately 1960
        could be translated as a whole. Pre-revolutionary literature
        could only be subjected to ideological translation—that is,
        alteration in sense as well as language. Take for example
        the well-known passage from the Declaration of Independence:
        WE HOLD THESE TRUTHS TO BE SELF-EVIDENT.
        THAT ALL MEN ARE CREATED EOUAL, THAT THEY
        ARE ENDOWED BY THEIR CREATOR WITH CERTAIN
        INALIENABLE RIGHTS, THAT AMONG THESE ARE
        LIFE, LIBERTY, AND THE PURSUIT OF HAPPINESS.
        Free eBooks at Planet eBook.com
        391
        THAT TO SECURE THESE RIGHTS, GOVERNMENTS ARE
        INSTITUTED AMONG MEN, DERIVING THEIR POWERS
        FROM THE CONSENT OF THE GOVERNED. THAT
        WHENEVER ANY FORM OF GOVERNMENT BECOMES
        DESTRUCTIVE OF THOSE ENDS, IT IS THE RIGHT OF THE
        PEOPLE TO ALTER OR ABOLISH IT, AND TO INSTITUTE
        NEW GOVERNMENT...
        It would have been quite impossible to render this into
        Newspeak while keeping to the sense of the original. The
        nearest one could come to doing so would be to swallow the
        whole passage up in the single word CRIMETHINK. A full
        translation could only be an ideological translation, whereby Jefferson's words would be changed into a panegyric on
        absolute government.
        A good deal of the literature of the past was, indeed, already being transformed in this way. Considerations of
        prestige made it desirable to preserve the memory of certain historical figures, while at the same time bringing
        their achievements into line with the philosophy of Ingsoc.
        Various writers, such as Shakespeare, Milton, Swift, Byron, Dickens, and some others were therefore in process of
        translation: when the task had been completed, their original writings, with all else that survived of the literature
        of the past, would be destroyed. These translations were
        a slow and difficult business, and it was not expected that
        they would be finished before the first or second decade of
        the twenty-first century. There were also large quantities of
        merely utilitarian literature—indispensable technical man392
        1984
        uals, and the like—that had to be treated in the same way. It
        was chiefly in order to allow time for the preliminary work
        of translation that the final adoption of Newspeak had been
        fixed for so late a date as 2050.
        Free eBooks at Planet eBook.com
        393
```

I FNGTH OF THE BOOK

```
print("Length of the book ",len(content))
print("Data type of the content object is",type(content))
     Length of the book 596106
     Data type of the content object is <class 'str'>
```

▼ MODIFYING TEXT USING REGULAR EXPRESSIONS

```
pattern1 = re.compile(r'A THOUSAND SPLENDID SUNS', re.IGNORECASE)
pattern2 = r' \*{3}'
pattern3 = re.compile(r'AFTERWORD.*', re.DOTALL)
punctuation_pattern = re.compile(r'[^\w\s]')
```

```
page_number_pattern = re.compile(r'\b(?:[1-9]|[1-9]\d|1\d\{2\}|200|2[0-9][0-9]|300)\b')
chinese pattern = re.compile(r'[\u4e00-\u9fff]+', re.UNICODE)
txt_without_headers = re.sub(pattern1, '', content)
txt_without_page_numbers = re.sub(page_number_pattern, '', txt_without_headers)
txt_without_chinese_characters = re.sub(chinese_pattern, '', txt_without_page_numbers)
filtered_text = re.sub(pattern2, '', txt_without_chinese_characters)
text_without_punctuation = re.sub(pattern3, '', filtered_text)
final_text = re.sub(punctuation_pattern, '', text_without_punctuation)
print("Modified Text:")
print(final_text)
     had already been rewritten but fragments of the literature
     of the past survived here and there imperfectly censored
     and so long as one retained ones knowledge of Oldspeak
     it was possible to read them In the future such fragments
     even if they chanced to survive would be unintelligible
     and untranslatable It was impossible to translate any passage of Oldspeak into Newspeak unless it either referred to
     some technical process or some very simple everyday action or was already orthodox GOODTHINKFUL would
     be the Newspeak expression in tendency In practice this
     meant that no book written before approximately 1960
     could be translated as a whole Prerevolutionary literature
     could only be subjected to ideological translationthat is
     alteration in sense as well as language Take for example
     the wellknown passage from the Declaration of Independence
     WE HOLD THESE TRUTHS TO BE SELFEVIDENT
     THAT ALL MEN ARE CREATED EQUAL THAT THEY
     ARE ENDOWED BY THEIR CREATOR WITH CERTAIN
     INALIENABLE RIGHTS THAT AMONG THESE ARE
     LIFE LIBERTY AND THE PURSUIT OF HAPPINESS
     Free eBooks at Planet eBookcom
     THAT TO SECURE THESE RIGHTS GOVERNMENTS ARE
     INSTITUTED AMONG MEN DERIVING THEIR POWERS
     FROM THE CONSENT OF THE GOVERNED THAT
     WHENEVER ANY FORM OF GOVERNMENT BECOMES
     DESTRUCTIVE OF THOSE ENDS IT IS THE RIGHT OF THE
     PEOPLE TO ALTER OR ABOLISH IT AND TO INSTITUTE
     NEW GOVERNMENT
     It would have been quite impossible to render this into
     Newspeak while keeping to the sense of the original The
     nearest one could come to doing so would be to swallow the
     whole passage up in the single word CRIMETHINK A full
     translation could only be an ideological translation whereby Jeffersons words would be changed into a panegyric on
     absolute government
     A good deal of the literature of the past was indeed already being transformed in this way Considerations of
     prestige made it desirable to preserve the memory of certain historical figures while at the same time bringing
     their achievements into line with the philosophy of Ingsoc
     Various writers such as Shakespeare Milton Swift Byron Dickens and some others were therefore in process of
     translation when the task had been completed their original writings with all else that survived of the literature
     of the past would be destroyed These translations were
     a slow and difficult business and it was not expected that
     they would be finished before the first or second decade of
     the twentyfirst century There were also large quantities of
     merely utilitarian literatureindispensable technical man392
     1984
     uals and the likethat had to be treated in the same way It
     was chiefly in order to allow time for the preliminary work
     of translation that the final adoption of Newspeak had been
     fixed for so late a date as 2050
     Free eBooks at Planet eBookcom
```

393

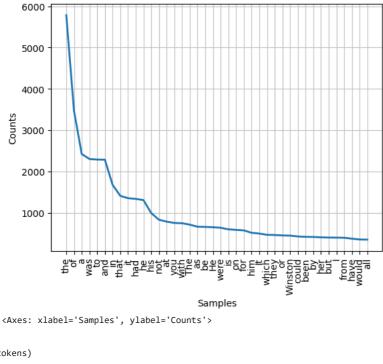
▼ TOKENIZATION OF THE CONTENT

```
nltk.download('punkt')
tokens = word_tokenize(final_text)
T1_frequency_distribution = FreqDist(tokens)
T1_frequency_distribution_org = T1_frequency_distribution
T1_frequency_distribution_org

    [nltk_data] Downloading package punkt to /root/nltk_data...
    [nltk_data] Unzipping tokenizers/punkt.zip.
    FreqDist('the': 5784, 'of': 3467, 'a': 2421, 'was': 2300, 'to': 2286, 'and': 2283, 'in': 1674, 'that': 1407, 'it': 1351, 'had': 1334, ...})
```

PLOT OF THE CHOSEN WORDS BEFORE REMOVING STOPWORDS

T1_frequency_distribution_org.plot(40)

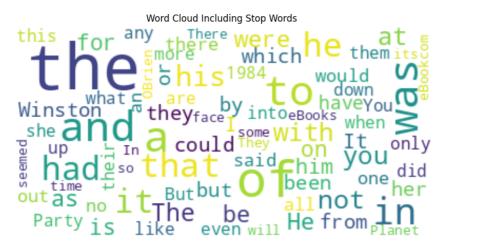


len(tokens)

104840

→ CREATING WORD CLOUD THAT INCLUDES STOPWORDS

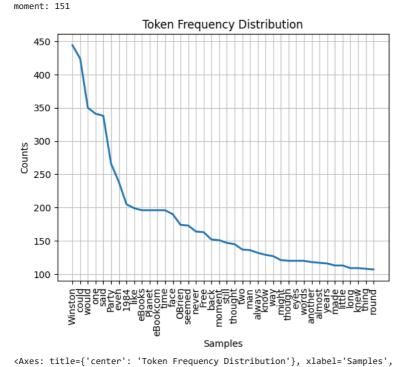
```
import matplotlib.pyplot as plot_
from matplotlib.pyplot import figure
from wordcloud import WordCloud
from collections import Counter
from collections import OrderedDict
dictionary = Counter(T1_frequency_distribution)
cloud = WordCloud(max_font_size = 60, max_words = 80, background_color = "white").generate_from_frequencies(dictionary)
plot_.figure(figsize = (10, 5))
plot_.imshow(cloud, interpolation = 'bilinear')
plot_.axis('off')
plt.title("Word Cloud Including Stop Words")
plot_.show()
```



▼ REMOVING STOPWORDS FROM THE BOOK

-> we are basically checking that is the given word present in the stopword collection. If yes then remove it from our data.

```
nltk.download('stopwords')
words = word_tokenize(final_text)
stop_words = set(stopwords.words('english'))
filtered_words = [word for word in words if word.lower() not in stop_words]
print("Tokenized Text without Stop Words:")
print(filtered_words)
     [nltk_data] Downloading package stopwords to /root/nltk_data...
     [nltk_data] Package stopwords is already up-to-date!
     Tokenized Text without Stop Words:
     ['Eric', 'Arthur', 'Blair', 'June', '1903', 'January', '1950', 'better', 'known', 'pen', 'name', 'George', 'Orwell', 'English', 'no
T1_frequency_distribution_withoutstopwords = FreqDist(filtered_words)
most_common = T1_frequency_distribution_withoutstopwords.most_common(20)
print("Most common words and their frequencies:")
for word, freq in most_common:
      print(f"{word}: {freq}")
plt.title("Token Frequency Distribution")
T1_frequency_distribution_withoutstopwords.plot(40)
     Most common words and their frequencies:
     Winston: 444
     could: 424
     would: 350
     one: 341
     said: 338
     Party: 266
     even: 239
     1984: 205
     like: 199
     eBooks: 196
     Planet: 196
     eBookcom: 196
     time: 196
     face: 190
     OBrien: 174
     seemed: 173
     never: 164
     Free: 163
     back: 152
```



After removing the stop words in the previous sections, we are using matplotlib library to map a frequency plot of the words that we have. It can be observed that the word "WINSTON" is the two most frequent words.

```
dictionary = Counter(filtered_words)
cloud = WordCloud(max_font_size = 60, max_words = 80, background_color = "white").generate_from_frequencies(dictionary)
plot_.figure(figsize = (10,5))
plot_.imshow(cloud, interpolation = 'bilinear')
plot_.axis('off')
plt.title("Word Cloud after removing stopwords")
plot_.show()
```

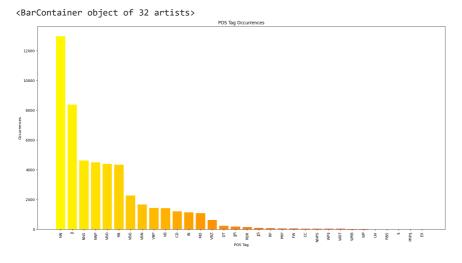


Using average perceptron tagger to tag our tokens.

```
nltk.download('averaged_perceptron_tagger')
        [nltk_data] Downloading package averaged_perceptron_tagger to
        [nltk_data]
                              /root/nltk_data...
        [nltk_data]
                            Package averaged_perceptron_tagger is already up-to-
       [nltk_data]
                                 date!
        True
pos_tagged_words = pos_tag(filtered_words)
pos_tagged_words[:15]
       [('Eric', 'NNP'),
('Arthur', 'NNP'),
('Blair', 'NNP'),
('June', 'NNP'),
         ('1903', 'CD'),
        ( 1903 , 'CD'),
('January', 'NNP'),
('1950', 'CD'),
('better', 'JJR'),
('known', 'VBN'),
         ('pen', 'JJ'),
('name', 'NN'),
         ('George', 'NNP'),
('Orwell', 'NNP'),
         ('English', 'NNP'), ('novelist', 'NN')]
```

-> AS WINSTON IS THE MOST OCCURED WORD IN OUR NOVEL, THE OCCURENCE OF "NN" postag should be highest. Let's observe that by plotting the POS-tag plot.

```
tag_counts = Counter(tag for word, tag in pos_tagged_words)
tags, counts = zip(*sorted(tag_counts.items(), key=lambda x: x[1], reverse=True))
plt.figure(figsize=(20, 10))
plt.xlabel('POS Tag')
plt.ylabel('Occurrences')
plt.title('POS Tag Occurrences')
plt.xticks(rotation=90)
plt.bar(tags, counts, color=sns.color_palette("autumn_r",len(tags)))
```



```
start_index = tokens.index('one') + 1
end_index = tokens.index('two', start_index)
selected_words = tokens[start_index:end_index]
selected_words[:35]
     ['end',
'of',
       'it',
       'a',
       'coloured',
       'poster',
       'too',
       'large',
       'for',
       'indoor',
       'display<sup>'</sup>,
      'had',
'been'
       'tacked',
       'to',
'the'
       'wall',
       'It',
       'depicted',
       'simply',
       'an',
       'enormous',
       'face',
       'more',
       'than',
       'a',
       'metre',
       'wide',
       'the',
'face',
       'of',
       'a',
       'man',
       'of',
       'about']
len(selected_words)
```

BIGRAM MODELLING ON CHAPTER 1

```
Chapter1to2 = selected_words
from nltk.util import bigrams
bi_grams = list(bigrams(Chapter1to2))
bigrams_frequency = nltk.FreqDist(bi_grams)
cfd = nltk.ConditionalFreqDist(bi_grams)
```

1691

```
unique_words = list(set(word for bigram in bigrams_frequency for word in bigram))
bigram_matrix = pd.DataFrame(0, columns=unique_words, index=unique_words, dtype=float)
word_freq = nltk.FreqDist(Chapter1to2)
bigram_probabilities = {}
for word1 in unique_words:
  for word2 in unique words:
    conditional_freq = cfd[word1][word2]
    first_word_count = word_freq[word1]
    probability = float(conditional_freq)/(first_word_count)
    bigram_probabilities[word1, word2] = probability
    bigram_matrix.at[word1, word2] = probability
bigram_matrix = bigram_matrix.fillna(0)
print(bigram_matrix)
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                                                                           0.0
wide
                         0.0
```

-> ABOVE ARE THE BIGRAM PROBABILITIES

```
top_ten_bigrams = sorted(bigram_probabilities.items(), key=lambda x: x[1], reverse=True)[:15]
print("Top Ten Bigrams with Maximum Probability:")
for bigram, probability in top_ten_bigrams:
  word1, word2 = bigram
  print(f"{word1} -> {word2}: Probability = {probability:.4f}")
```

```
Top Ten Bigrams with Maximum Probability:
depicted -> simply: Probability = 1.0000
coloured -> poster: Probability = 1.0000
simply -> an: Probability = 1.0000
moustache -> and: Probability = 1.0000
metre -> wide: Probability = 1.0000
an -> enormous: Probability = 1.0000
enormous -> face: Probability = 1.0000
poster -> too: Probability = 1.0000
than -> a: Probability = 1.0000
been -> tacked: Probability = 1.0000
large -> for: Probability = 1.0000
tacked -> to: Probability = 1.0000
It -> depicted: Probability = 1.0000
it -> a: Probability = 1.0000
wide -> the: Probability = 1.0000
```

-> ABOVE ARE THE PROBABILITIES OF TOP TEN BIGRAMS

▼ SHANNON GAME ON CHAPTER 2

```
def make_guess(previous_word, bigram_probabilities):
    later_probabilities = {word: prob for (prev, word), prob in bigram_probabilities.items() if prev == previous_word}
    optimal_guesses = sorted(later_probabilities, key=later_probabilities.get, reverse=True)
    return optimal_guesses
def play_shannons_game(existing_string, bigram_probabilities):
    print("Welcome to Shannon's Game!")
    print("Think of a word, and I will try to guess it based on the provided string.")
    print("Please respond with 'yes' or 'no' to my guesses.")
    print("You can end the game by typing 'exit'.")
    previous_word = input("Think of a starting word: ")
    print(f"Starting word: {previous_word}")
    s=s+" "+previous_word
    while True:
        guesses = make_guess(previous_word, bigram_probabilities)
        for guess in guesses:
          response = input(f"Is it '{guess}'? (yes/no): ")
          if response == 'yes':
           previous_word = guess
            s=s+" "+guess
            print(f"Sentence: {s}")
            break
          elif response=='no':
          elif response == 'exit':
            print("Thanks for playing!")
          else:
            print("No more guesses. Thanks for playing!")
start_index = tokens.index('TWO') + 1
end_index = tokens.index('three', start_index)
chapter2to3 = tokens[start_index:end_index]
chapter2to3[:15]
     ['AND',
      'TWO',
      'MAKE'
      'FIVE',
      'But',
'then'
      'there',
      'came',
      'a',
      'sort',
      'of',
      'check',
      'His',
      'mind',
      'as']
len(chapter2to3)
     2144
```

play_shannons_game(chapter2to3, bigram_probabilities)

```
Welcome to Shannon's Game!
Think of a word, and I will try to guess it based on the provided string. Please respond with 'yes' or 'no' to my guesses.
You can end the game by typing 'exit'.
Think of a starting word: moustache
Starting word: moustache
Is it 'and'? (yes/no): no
Is it 'depicted'? (yes/no): no
Is it 'coloured'? (yes/no): yes
Sentence: moustache coloured
Is it 'poster'? (yes/no): no
Is it 'depicted'? (yes/no): no
Is it 'coloured'? (yes/no): no
Is it 'the'? (yes/no): no
Is it 'simply'? (yes/no): no
Is it 'face'? (yes/no): no
Is it 'moustache'? (yes/no): no
Is it 'metre'? (yes/no): no
Is it 'an'? (yes/no): no
Is it 'enormous'? (yes/no): no
Is it 'than'? (yes/no): no
Is it 'been'? (yes/no): no
Is it 'large'? (yes/no): no
Is it 'tacked'? (yes/no): no
Is it 'It'? (yes/no): no
Is it 'it'? (yes/no): no
Is it 'wide'? (yes/no): no
Is it 'for'? (yes/no): yes
Sentence: moustache coloured for
Is it 'indoor'? (yes/no): no
Is it 'depicted'? (yes/no): exit
Thanks for playing!
```

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