```
In [1]: import nltk
import string, re
from collections import Counter
from nltk.tokenize import sent_tokenize
from nltk.tokenize import word_tokenize
from nltk.probability import FreqDist
import matplotlib.pyplot as plt
from nltk.corpus import stopwords
from nltk.stem import PorterStemmer
from nltk.stem import PorterStemmer
from nltk.stem.wordnet import WordNetLemmatizer
from nltk.seniment.vader import SentimentIntensityAnalyzer
import pandas as pd
from textblob import TextBlob
import seaborn as sns
%matplotlib inline
```

```
In [2]: aritcle text that is being used as data source.
"""Imagine a society in which you are rated by the government on your trustworthiness. Your "citizen score" follows you wherever When you step outside your door, your actions in the physical world are also swept into the dragnet: The government gathers an a This society may seem dystopian, but it isn't farfetched: It may be China in a few years. The country is racing to become the fichina's evolving algorithmic surveillance system will rely on the security organs of the communist party-state to filter, collecting the text paragraph into sentences ted text = sent_tokenize(text)

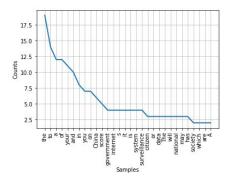
the broken down paragraph that has been tokenized with sentences tokenized_text)
```

['Imagine a society in which you are rated by the government on your trustworthiness.', 'Your "citizen score" follows you where ver you go.', 'A high score allows you access to faster internet service or a fast-tracked visa to Europe.', 'If you make political posts online without a permit, or question or contradict the government's official narrative on current events, however, your score decreases.', 'To calculate the score, private companies working with your government constantly trawl through vast amounts of your social media and online shopping data.', 'When you step outside your door, your actions in the physical world are also swept into the dragnet: The government gathers an enormous collection of information through the video cameras placed on your street and all over your city.', 'If you commit a crime-or simply jaywalk-facial recognition algorithms will match video fo otage of your face to your photo in a national ID database.', 'It won't be long before the police show up at your door.', 'This society may seem dystopian, but it isn't farfetched: It may be China in a few years.', 'The country is racing to become the fir st to implement a pervasive system of algorithmic surveillance.', 'Harnessing advances in artificial intelligence and data mining and storage to construct detailed profiles on all citizens, China's communist party-state is developing a "citizen score" to incentivize "good" behavior.', 'A vast accompanying network of surveillance cameras will constantly monitor citizens' movement s, purportedly to reduce crime and terrorism.', 'While the expanding Orwellian eye may improve "public safety," it poses a chil ling new threat to civil liberties in a country that already has one of the most oppressive and controlling governments in the world.', 'China's evolving algorithmic surveillance system will rely on the security organs of the communist party-state to fil ter, collect, and analyze staggering volumes of data flowing across the internet.', 'Justifying controls in the name of national secu

```
In [3]: # Break down the paragraph into single words
    tokenized_word = word_tokenize(text)
    # Remove all punctuations
    clean_tokenized_words = [tokenized_word for tokenized_word in tokenized_word if tokenized_word.isalnum()]
    # Print out the results of breaking down the paragraph into single words
    print(clean_tokenized_words)
```

['Imagine', 'a', 'society', 'in', 'which', 'you', 'are', 'rated', 'by', 'the', 'government', 'on', 'your', 'trustworthiness', 'Your', 'citizen', 'score', 'follows', 'you', 'wherever', 'you', 'go', 'A', 'high', 'score', 'allows', 'you', 'access', 'to', 'faster', 'internet', 'service', 'on', 'a', 'visa', 'to', 'Europe', 'If', 'you, 'make', 'political', 'posts', 'online', 'witho ut', 'a', 'permit', 'or', 'question', 'or', 'contradict', 'the', 'government', 's', 'official', 'narrative', 'on', 'current', 'events', 'however', 'your', 'score', 'decreases', 'To', 'calculate', 'the', 'score', 'private', 'companies', 'working', 'with', 'your', 'government', 'constantly', 'trawl', 'through', 'vast', 'amounts', 'of', 'your', 'social', 'world', 'are', 'also', 'swept', 'into', 'the', 'drayle', 'though', 'vast', 'amounts', 'of', 'your', 'social', 'world', 'are', 'also', 'swept', 'into', 'the', 'dragnet', 'The', 'government', 'gathers', 'an', 'enormomus', 'collection', 'of', 'inform ation', 'through', 'the', 'video', 'cameras', 'placed', 'on', 'your', 'street', 'and', 'all', 'over', 'your', 'city', 'If', 'you', 'commit', 'a', 'simply', 'recognition', algorithms', 'wll', 'match', 'video', 'footage', 'of', 'your', 'face', 'to', 'you', 'at', 'your', 'door', 'This', 'society', 'may', 'seem', 'dystoplan', 'but', 'it', 'isn', 't', 'farfetched', 'It', 'may', 'be', 'china', 'ni', 'a', 'few', 'years', 'The', 'country', 'is', 'hacaing', 'to', 'bocome', 'the', 'first', 'to', 'implement', 'a', 'pervasive', 'system', 'of', 'algorithmic', 'surveillance', 'Harnessing', 'advances', 'in', 'artificial', 'intelligence', 'an d', 'data', 'mining', 'and', 'storage', 'to', 'construct', 'detailed', 'profiles', 'on', 'all', 'titzens', 'China', 's', 'developing', 'a', 'citzen', 'score', 'to', 'incentivize', 'good', 'behavior', 'A', 'vast', 'accompanying', 'net work', 'of', 'surveillance', 'cameras', 'will', 'constantly', 'monitor', 'citizens', 'movements', 'purportedly', 'to', 'reduce', 'crime', 'and', 'terrorism', 'while', 're', 'governments', 'in', '





In [5]: # Find all the stop words/noise words/words not needed for sentiment in the article
 stop_words_removal=set(stopwords.words("english"))
 # Display all the stop words found in the article
 print(stop_words_removal)

{'some', 'up', 'he', 'myself', 'how', 'by', 's', 'nor', 'both', "hasn't", "don't", 'you', 'and', 'wouldn', 'very', 'll', 'am', 'if', 'into', "you'd", 'your', 'more', "that'll", 'y', 'so', 'again', 'there', "you'll", "aren't", 'shan', 'which', 'no', 'i', 'hasn', 'but', 'its', 'out', 'such', 'ourselves', 'too', 'who', 'before', 'my', 'of', 'while', 'can', 'm', 'from', 'haven', "you 've", "shouldn't", 'thesselves', 'will', "didn't", 'was', "you're", "doesn't", 've', 'are', 'under', 'over', 'their', 'only', 'hadn', 'where', 'those', 'against', 'that', 'after', 'few', 'not', 'mustn', "won't", 'on', 'did', 'these', 'she', 'what', 'the', 'hs', 'don', 'other', 'why', 'until', 'does', 'during', 'in', 'because', 'didn', 'hers', 'about', 'needn', 'him', 'mi ghtn', 'be', 'yourself', 'itself', 'most', 'than', 'ain', 'have', 'couldn', 'been', 'each', 'to', "hadn't", "isn't", 'wasn', 'i sn', 'whom', 'at', 'through', 'her', 'between', 'had', 'same', 'for', 'wouldn't", 'having', 'yours', 'do', 'we', 'as', 'off', 'once', 'shouldn', 'were', 'being', 'herself', "it's", 'here', 'all', "shan't", 'won', 'down', 'an', 'should', 'is', 'our', 'ab ove', 'when', 'doing', "couldn't", 'doesn', "should've", 'yourselves', 'it', 'himself', "needn't", 'or', 'with', 'ours', 'the y', 'o', "she's", "mightn't", 'theirs', "weren't", 'this', 'weren', 'd', 'me', 'a', 'any', "haven't", 'ma', 'his', 'aren', "was n't", 'own', 'just', 'below', 'them', 'then', 're', "mustn't", 'now', 'further'}

```
In [6]: # Filter out all the stop words
# Create a list of what the article would look like with the stop words gone
filtered_stop_words = []
# for loop for every word found in the clean_tokenized_words list
for w in clean_tokenized_words:
# If statement for the condition of if a word is not in the stop_words_removal list then append the word
if w not in stop_words_removal:
# Append: Adding an item to the end of the filtered_stop_words list
filtered_stop_words.append(w)
# Display the clean_tokenized_words list
print("Tokenized Sentence:",clean_tokenized_words)
# Display the filtered_stop_words list to compare
print("Filterd Sentence:",filtered_stop_words)
```

Tokenized Sentence: ['Imagine', 'a', 'society', 'in', 'which', 'you', 'are', 'rated', 'by', 'the', 'government', 'on', 'your', 'trustworthiness', 'Your', 'citizen', 'score', 'follows', 'you', 'wherever', 'you', 'go', 'A', 'high', 'score', 'allows', 'you', 'access', 'to', 'faster', 'internet', 'service', 'on', 'a', 'visa', 'to', 'Europe', 'If', 'you', 'make', 'political', 'post s', 'online', 'without', 'a', 'permit', 'or', 'question', 'or', 'contradict', 'the', 'government', 's', 'or', 'score', 'decreases', 'To', 'calculate', 'the', 'score', 'private', 'companie s', 'working', 'with', 'your', 'soore', 'decreases', 'To', 'calculate', 'the', 'score', 'private', 'companie s', 'working', 'with', 'your', 'soore', 'decreases', 'To', 'calculate', 'the', 'score', 'private', 'companie s', 'working', 'with', 'your', 'soore', 'decreases', 'To', 'calculate', 'the', 'score', 'private', 'companie s', 'working', 'with', 'your', 'soore', 'decreases', 'To', 'calculate', 'the', 'soore', 'private', 'companie s', 'working', 'with', 'your', 'soore', 'decreases', 'To', 'calculate', 'the', 'sathers', 'an', 'enormous', 'calculate', 'mordia', 'withe', 'phy sical', 'world', 'are', 'also', 'swept', 'into', 'the', 'dragnet', The', 'government', 'an', 'an', 'enormous', 'collection', 'of', 'information', 'the', 'withe', 'into', 'the', 'mort', 'the',

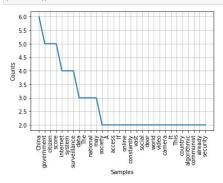
Filterd Sentence: ['Imagine', 'society', 'rated', 'government', 'trustworthiness', 'Your', 'citizen', 'score', 'follows', 'wher ever', 'go', 'A', 'high', 'score', 'allows', 'access', 'faster', 'internet', 'service', 'visa', 'Europe', 'If', 'make', 'political', 'posts', 'online', 'without', 'permit', 'question', 'contradict', 'government', 'official', 'narrative', 'current', 'even ts', 'however', 'score', 'decreases', 'To', 'calculate', 'score', 'private', 'companies', 'working', 'government', 'constantly', 'trawl', 'vast', 'amounts', 'social', 'media', 'online', 'shopping', 'data', 'when', 'step', 'outside', 'door', 'actions', 'physical', 'world', 'also', 'swept', 'dragnet', 'The', 'government', 'gathers', 'enormous', 'collection', 'information', 'vide o', 'cameras', 'placed', 'street', 'city', 'If', 'commit', 'simply', 'recognition', 'algorithms', 'match', 'video', 'footage', 'face', 'photo', 'national', 'ID', 'database', 'It', 'long', 'police', 'show', 'door', 'This', 'society', 'may', 'seem', 'dysto 'pain', 'farfetched', 'It', 'may', 'China', 'years', 'The', 'country', 'nacing', 'become', 'first', 'implement', 'pervasive', 's ystem', 'algorithmic', 'surveillance', 'Harnessing', 'advances', 'artificial', 'intelligence', 'data', 'mining', 'storage', 'construct', 'detailed', 'profiles', 'citizens', 'China', 'communist', 'developing', 'citizen', 'score', 'incentivize', 'good', 'b 'ehavior', 'A', 'vast', 'accompanying', 'network', 'surveillance', 'cameras', 'constantly', 'monitor', 'citizens', 'movements', 'purportedly', 'reduce', 'crime', 'terrorism', 'While', 'expanding', 'Orwellian', 'eye', 'may', 'improve', 'public', 'safety', 'poses', 'chilling', 'new', 'threat', 'civil', 'liberties', 'country', 'already', 'one', 'oppressive', 'controlling', 'governments', 'world', 'China', 'evellance', 'system', 'rely', 'security', 'organs', 'communist', 'filter', 'collect', 'analyze', 'staggering', volumes', 'data', 'flowing', 'across', 'internet', 'Justifying', 'controls', 'name', 'national', 'security', 'social', 'stabil

Filtered Sentence: ['Imagine', 'society', 'rated', 'government', 'trustworthiness', 'Your', 'citizen', 'score', 'follows', 'whe rever', 'go', 'A', 'high', 'score', 'allows', 'access', 'faster', 'internet', 'service', 'visa', 'Europe', 'If', 'make', 'polit ical', 'posts', 'online', 'without', 'permit', 'question', 'contradict', 'government', 'official', 'narrative', 'current', 'events', 'however', 'score', 'decreases', 'To', 'calculate', 'score', 'private', 'companies', 'working', 'government', 'constantl y', 'trawl', 'vast', 'amounts', 'social', 'media', 'online', 'shopping', 'data', 'When', 'step', 'outside', 'door', 'actions', 'physical', 'world', 'also', 'swept', 'dragnet', 'The', 'government', 'gathers', 'enormous', 'collection', 'information', vide o', 'cameras', 'placed', 'street', 'city', 'If', 'commit', 'simply', 'recognition', 'algorithms', 'match', 'video', 'footage', 'face', 'photo', 'national', 'ID', 'database', 'It', 'long', 'police', 'show', 'door', 'This', 'society', 'may', 'seem', 'dysto pian', 'farfetched', 'It', 'may', 'years', 'The', 'country', 'racing', 'become', 'first', 'implement', 'pervasive', 's ystem', 'algorithmic', 'surveillance', 'davances', 'artificial', 'intelligence', 'data', 'mining', 'storage', 'construct', 'detailed', 'profiles', 'citizens', 'China', 'communist', 'developing', 'citizen', 'score', 'incentivize', 'good', 'b ehavior', 'A', 'vast', 'accompanying', 'network', 'surveillance', 'cameras', 'constantly', 'monitor', 'citizens', 'movements', 'purportedly', 'reduce', 'crime', 'terrorism', 'While', 'expanding', 'Orwellian', 'eye', 'may', 'improve', 'public', 'safety', 'poses', 'chilling', 'new', 'threat', 'civil', 'liberties', 'country', 'already', 'one', 'oppressive', 'controlling', 'governments', 'world', 'China', 'evolving', 'algorithmic', 'surveillance', 'system', 'rely', 'security', 'organs', 'communist', 'filte r', 'collect', 'analyze', 'staggering', volumes', 'data', 'flowing', 'across', 'internet', 'Justifying', 'controls', 'name', 'national', 'security', 'social',

Lemmatized Word: ['Imagine', 'society', 'rated', 'government', 'trustworthiness', 'Your', 'citizen', 'score', 'follows', 'where
ver', 'go', 'A', 'high', 'score', 'allows', 'access', 'faster', 'internet', 'service', 'visa', 'Europe', 'If', 'make', 'politic
al', 'post', 'online', 'without', 'permit', 'question', 'contradict', 'government', 'official', 'narrative', 'current', 'even
t', 'however', 'score', 'decrease', 'To', 'calculate', 'score', 'private', 'company', 'working', 'government', 'constantly', 't
rawl', 'vast', 'amount', 'social', 'medium', 'online', 'shopping', 'data', 'When', 'step', 'outside', 'door', 'action', 'physic
al', 'world', 'also', 'swept', 'dragnet', 'The', 'government', 'gather', 'enormous', 'collection', 'information', 'video', 'cam
era', 'placed', 'street', 'city', 'If', 'commit', 'simply', 'recognition', 'algorithm', 'match', 'video', 'footage', 'face', 'p
hoto', 'national', 'ID', 'database', 'It', 'long', 'police', 'show', 'door', 'This', 'society', 'may', 'seem', 'dystopian', 'fa
rfetched', 'It', 'may', 'China', 'year', 'The', 'country', 'racing', 'become', 'first', 'implement', 'pervasive', 'system', 'al
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etailed', 'profile', 'citizen', 'China', 'communist', 'developing', 'citizen', 'score', 'incentivize', 'good', 'behavior', 'A',
'vast', 'accompanying', 'network', 'surveillance', 'camera', 'constantly', 'monitor', 'citizen', 'movement', 'purportedly', 're
duce', 'crime', 'terrorism', 'While', 'expanding', 'Orwellian', 'eye', 'may', 'improve', 'public', 'safety', 'pose', 'chillin
g', 'new', 'threat', 'civil', 'liberty', 'country', 'already', 'one, 'oppressive', 'controlling', 'government', 'world', 'China', 'evolving', 'algorithmic', 'surveillance', 'system', 'rely', 'security', 'organ', 'communist', 'filter', 'collect', 'analyz
e', 'staggering', volume', 'data', 'flowing', 'across', 'internet', 'Justifying', 'control', 'name', 'national', 'security',
's



Plot the distribution of words after it's been through tokenization, filtered stop words, and lemmatized
frequency_distribution_cleaned.plot(30, cumulative = False)
Display the final version of the graph on frequency distribution
plt.show()



```
In [9]: # Function to convert the Lemmatized_words list into strings
def listToString(s):
    # Initializing an empty string
    string1 = " "

    # Return the string values
    return (string1.join(s))
# Put all the words in the Lemmatized_words list into the listToString function
s = lemmatized_words
# Print out the results
print(listToString(s))
```

Imagine society rated government trustworthiness Your citizen score follows wherever go A high score allows access faster inter net service visa Europe If make political post online without permit question contradict government official narrative current event however score decrease To calculate score private company working government constantly trawl vast amount social medium o nline shopping data When step outside door action physical world also swept dragnet The government gather enormous collection i nformation video camera placed street city If commit simply recognition algorithm match video footage face photo national ID da tabase It long police show door This society may seem dystopian farfetched It may China year The country racing become first im plement pervasive system algorithmic surveillance Harnessing advance artificial intelligence data mining storage construct deta iled profile citizen China communist developing citizen score incentivize good behavior A vast accompanying network surveillance camera constantly monitor citizen movement purportedly reduce crime terrorism While expanding Orwellian eye may improve publi c safety pose chilling new threat civil liberty country already one oppressive controlling government world China evolving algo rithmic surveillance system rely security organ communist filter collect analyze staggering volume data flowing across internet Justifying control name national security social stability China originally planned develop called Golden Shield surveillance system allowing easy access local national regional record citizen This ambitious project far mostly confined Great Firewall pro hibits foreign internet site including Google Facebook The New York Times According Freedom House China level internet freedom already worst planet Now Communist Party China finally building extensive multilevel system dreamed decade

```
In [22]: # Using the TextBlob library for text sentiment analyzation which will display the sentiment polarity and subjectivity # Polarity range: [-1.0,1.0] | -1 = negative sentiment | 1 = positive sentiment | # Have the TextBlob library analyze the scrubbed article
          text_analyze = TextBlob("Imagine society rated government trustworthiness Your citizen score follows wherever go A high score all
          # Calculate the sentiment polarity
          text_analyze.sentiment.polarity
          # Display the sentiment polarity
          print("This is the sentiment polarity: ", text_analyze.sentiment.polarity)
          # Variable holding data on the calcauted sentiment polarity
          a = text_analyze.sentiment.polarity
          # Condition for if the article has a positive sentiment
               print("This Article has a Positive Sentiment")
           # Condition for if the article has a negative sentiment
          elif a < 0.50:
               print("This article has a Negative Sentiment")
           # Condition for if the article has a neutral sentiment
          else:
              print("This article has a Neutral Sentiment")
          This is the sentiment polarity: 0.06757575757575758
          This article has a Negative Sentiment
```