```
In [1]: import nltk
        from nltk.corpus import stopwords
        import csv
        import numpy as np
        stopwords = set(stopwords.words('english'))
In [2]: import pandas as pd
        df = pd.read csv(r"C:\Users\raval\Downloads\full training dataset.csv",names=["sentiment",
In [3]: positive_sentences = df[df['sentiment'] == 'positive']['sentence'].tolist()
        # Create a list of tuples
        positive_tuples = [(sentiment, sentence) for sentiment, sentence in zip(['positive'] * len(
        print(positive tuples)
        # positive = df[df['sentiment'] == 'positive']['sentence'].tolist()
        negative_sentences = df[df['sentiment'] == 'negative']['sentence'].tolist()
        # Create a list of tuples
        negative tuples = [(sentiment, sentence) for sentiment, sentence in zip(['negative'] * len(
        print(negative tuples)
        [('positive', 'the rock is destined to be the 21st century\'s new " conan " and that h
        e\'s going to make a splash even greater than arnold schwarzenegger , jean-claud van d
        amme or steven segal .'), ('positive', 'the gorgeously elaborate continuation of " the
        lord of the rings " trilogy is so huge that a column of words cannot adequately descri
        be co-writer/director peter jackson\'s expanded vision of j . r . r . tolkien\'s middl
        e-earth .'), ('positive', 'effective but too-tepid biopic'), ('positive', 'if you some
        times like to go to the movies to have fun , wasabi is a good place to start .'), ('po
        sitive', "emerges as something rare , an issue movie that's so honest and keenly obser
        ved that it doesn't feel like one ."), ('positive', 'the film provides some great insi
        ght into the neurotic mindset of all comics -- even those who have reached the absolut
        e top of the game .'), ('positive', 'offers that rare combination of entertainment and
        education .'), ('positive', 'perhaps no picture ever made has more literally showed th
        at the road to hell is paved with good intentions .'), ('positive', "steers turns in a
        snappy screenplay that curls at the edges ; it's so clever you want to hate it . but h \,
        e somehow pulls it off ."), ('positive', 'take care of my cat offers a refreshingly di
        fferent slice of asian cinema .'), ('positive', 'this is a film well worth seeing , ta
```

lking and singing heads and all .'), ('positive', 'what really surprises about wisegir ls is its low-key quality and genuine tenderness .'), ('positive', '(wendigo is) why

we go to the cinema : to be fed through the eye , the heart , the mind .'), ('positiv

```
In [4]: # Combine positive and negative tuples
                                Senti_tweets = []
                                 for (sentiment, sentence) in positive_tuples + negative_tuples:
                                                words_filtered = [e.lower() for e in sentence.split() if len(e) >= 3]
                                                Senti tweets.append((words filtered, sentiment))
                                 print(Senti tweets)
                               [(['the', 'rock', 'destined', 'the', '21st', "century's", 'new', 'conan', 'and', 'tha t', "he's", 'going', 'make', 'splash', 'even', 'greater', 'than', 'arnold', 'schwarzen egger', 'jean-claud', 'van', 'damme', 'steven', 'segal'], 'positive'), (['the', 'gorge ously', 'elaborate', 'continuation', 'the', 'lord', 'the', 'rings', 'trilogy', 'huge', 'that', 'column', 'words', 'cannot', 'adequately', 'describe', 'co-writer/director', 'peter', "jackson's", 'expanded', 'vision', "tolkien's", 'middle-earth'], 'positive'), (['effective', 'but', 'too-tepid', 'biopic'], 'positive'), (['you', 'sometimes', 'lik e', 'the', 'movies', 'have', 'fun', 'wasabi', 'good', 'place', 'start'], 'positive'), (['emerges', 'something', 'rare', 'issue', 'movie', "that's", 'honest', 'and', 'keenl y', 'observed', 'that', "doesn't", 'feel', 'like', 'one'], 'positive'), (['the', 'fil m', 'provides', 'some', 'great', 'insight', 'into', 'the', 'neurotic', 'mindset', 'al l', 'comics', 'even', 'those', 'who', 'have', 'reached', 'the', 'absolute', 'top', 'th e', 'game'], 'positive'), (['offers', 'that', 'rare', 'combination', 'entertainment', 'and', 'education'], 'positive'), (['perhaps', 'picture', 'ever', 'made', 'has', 'mor e', 'literally', 'showed', 'that', 'the', 'road', 'hell', 'paved', 'with', 'good', 'in tentions'], 'positive'), (['steers', 'turns', 'snappy', 'screenplay', 'that', 'curls', 'the', 'edges', "it's", 'clever', 'you', 'want', 'hate', 'but', 'somehow', 'pulls', 'off'], 'positive'), (['take', 'care', 'cat', 'offers', 'refreshingly', 'different', 'sl
                                 ff'], 'positive'), (['take', 'care', 'cat', 'offers', 'refreshingly', 'different', 'sl
                                 ice', 'asian', 'cinema'], 'positive'), (['this', 'film', 'well', 'worth', 'seeing', 't
In [5]: def get_words_in_tweets(tweets):
                                                 all_words = []
                                                for (words, sentiment) in tweets:
                                                                all_words.extend(words)
                                                return all_words
In [6]: def get word features(wordlist):
                                                wordlist = nltk.FreqDist(wordlist)
                                                word_features = wordlist.keys()
                                                return word_features
In [7]: # Assuming Senti_tweets is already defined
                                 words_in_tweets = get_words_in_tweets(Senti_tweets)
                                word_features = get_word_features(words_in_tweets)
                                print(word_features)
                                word_features_filtered = [w for w in word_features if w not in stopwords]
                                print(word_features_filtered)
                              dict_keys(['the', 'rock', 'destined', '21st', "century's", 'new', 'conan', 'and', 'tha t', "he's", 'going', 'make', 'splash', 'even', 'greater', 'than', 'arnold', 'schwarzen egger', 'jean-claud', 'van', 'damme', 'steven', 'segal', 'gorgeously', 'elaborate', 'c ontinuation', 'lord', 'rings', 'trilogy', 'huge', 'column', 'words', 'cannot', 'adequa tely', 'describe', 'co-writer/director', 'peter', "jackson's", 'expanded', 'vision', "tolkien's", 'middle-earth', 'effective', 'but', 'too-tepid', 'biopic', 'you', 'someti mes', 'like', 'movies', 'have', 'fun', 'wasabi', 'good', 'place', 'start', 'emerges', 'something', 'rare', 'issue', 'movie', "that's", 'honest', 'keenly', 'observed', "does n't", 'feel', 'one', 'film', 'provides', 'some', 'great', 'insight', 'into', 'neuroti c', 'mindset', 'all', 'comics', 'those', 'who', 'reached', 'absolute', 'top', 'game', 'offers', 'combination', 'entertainment', 'education', 'perhaps', 'picture', 'ever', 'made', 'has', 'more', 'literally', 'showed', 'road', 'hell', 'paved', 'with', 'intent ions', 'steers', 'turns', 'snappy', 'screenplay', 'curls', 'edges', "it's", 'clever', 'want', 'hate', 'somehow', 'pulls', 'off', 'take', 'care', 'cat', 'refreshingly', 'different', 'slice', 'asian', 'cinema', 'this', 'well', 'worth', 'seeing', 'talking', 'si nging', 'heads', 'what', 'really', 'surprises', 'about', 'wisegirls', 'its', 'low-ke y', 'quality', 'genuine', 'tenderness', 'wendigo', 'why', 'fed', 'through', 'eye', 'he art', 'mind', 'greatest', 'family-oriented', 'fantasy-adventure', 'ultimately', 'ponde rs', 'reasons', 'need', 'stories', 'much', 'utterly', 'compelling', "who', 'wrote', "it'" 'reasons', 'need', 'stories', 'much', 'utterly', 'compelling', "who', 'wrote', "it'" 'reasons', 'need', 'stories', 'much', 'utterly', 'compelling', "who', 'wrote', "it'" 'reasons', 'need', 'stories', 'much', 'utterly', 'compelling', "who', 'wrote', "it'" 'reasons', 'need', 'stories', 'much', 'utterly', 'compelling', "who', 'wrote', "it'" 'reasons', 'need', 'stories', 'much', 'utterly', 'compelling'
```

```
In [8]: def extract features(document, word features filtered):
             document_words = set(document)
             features = {}
             for word in word_features_filtered:
                 features['contains(%s)' % word] = (word in document_words)
             return features
 In [9]: # Assuming Senti_tweets and word_features_filtered are already defined
         training_set = nltk.classify.apply_features(lambda doc: extract_features(doc, word_features
         classifier = nltk.NaiveBayesClassifier.train(training_set)
         test tweet = 'This is a horrible book'
         features = extract_features(test_tweet.split(), word_features_filtered)
         sentiment = classifier.classify(features)
         print("{}: Sentiment={}".format(test tweet, sentiment))
         This is a horrible book: Sentiment=negative
In [21]: |test_tweet = 'explaination is very good'
         features = extract_features(test_tweet.split(), word_features_filtered)
         sentiment = classifier.classify(features)
         print("{}: Sentiment={}".format(test_tweet, sentiment))
         explaination is very good: Sentiment=positive
 In [ ]:
```