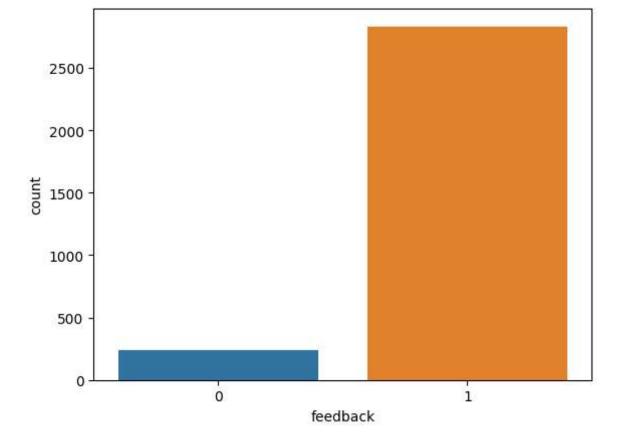
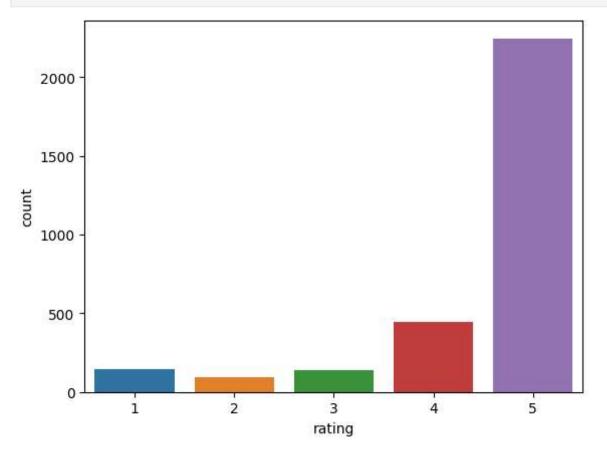
```
In [19]: import pandas as pd
           import numpy as np
           import matplotlib.pyplot as plt
           import seaborn as sns
           import re
           import string
           import nltk
           from nltk.corpus import stopwords
           from nltk.stem import PorterStemmer, WordNetLemmatizer
           from sklearn.feature_extraction.text import CountVectorizer, TfidfVectorizer
In [20]: df = pd.read_csv("AmazonAlexa_Reviews.csv")
In [21]:
Out[21]:
                                        variation
                 rating
                             date
                                                                              verified reviews feedback
              0
                      5 31-Jul-18 Charcoal Fabric
                                                                                Love my Echo!
                                                                                                      1
              1
                      5 31-Jul-18 Charcoal Fabric
                                                                                     Loved it!
                                                                                                      1
              2
                      4 31-Jul-18
                                   Walnut Finish
                                                 Sometimes while playing a game, you can answer...
                                                                                                      1
              3
                      5 31-Jul-18 Charcoal Fabric
                                                      I have had a lot of fun with this thing. My 4 ...
                                                                                                      1
              4
                      5 31-Jul-18 Charcoal Fabric
                                                                                        Music
                                                                                                      1
                                        Black Dot
           3145
                      5 30-Jul-18
                                                     Perfect for kids, adults and everyone in betwe...
                                                                                                      1
           3146
                      5 30-Jul-18
                                        Black Dot
                                                     Listening to music, searching locations, check...
                                                                                                      1
           3147
                      5 30-Jul-18
                                        Black Dot
                                                    I do love these things, i have them running my...
                                                                                                      1
           3148
                      5 30-Jul-18
                                       White Dot
                                                     Only complaint I have is that the sound qualit...
                                                                                                      1
                                        Black Dot
                                                                                                      1
           3149
                      4 29-Jul-18
                                                                                        Good
          3150 rows × 5 columns
In [22]:
          print(df.shape)
           print(df.isnull().sum())
           (3150, 5)
                                   0
           rating
           date
                                   0
                                   0
           variation
                                 79
           verified reviews
           feedback
                                   0
           dtype: int64
In [23]: df.dropna(subset=['verified_reviews'], inplace=True)
          sns.countplot(x="feedback", data=df)
In [24]:
           plt.figure(figsize=(6,2))
           plt.show()
```



<Figure size 600x200 with 0 Axes>

```
In [25]: sns.countplot(x="rating", data=df)
plt.show()
```



```
In [26]: df['verified_reviews'] = df['verified_reviews'].str.lower()

In [27]: # Define a function to remove punctuation
def remove_punctuation(text):
    if isinstance(text, str):
        translator = str.maketrans("", "", string.punctuation)
        return text.translate(translator)
    return ""
```

```
# Apply the function to the "verified_reviews" column
          df["verified_reviews"] = df["verified_reviews"].apply(remove_punctuation)
           df.head()
Out[27]:
              rating
                         date
                                    variation
                                                                          verified_reviews feedback
           0
                  5 31-Jul-18 Charcoal Fabric
                                                                              love my echo
                                                                                                  1
           1
                  5 31-Jul-18 Charcoal Fabric
                                                                                   loved it
                                                                                                  1
           2
                  4 31-Jul-18
                                Walnut Finish sometimes while playing a game you can answer ...
                                                                                                  1
           3
                                                  i have had a lot of fun with this thing my 4 y...
                  5 31-Jul-18 Charcoal Fabric
                                                                                                  1
           4
                  5 31-Jul-18 Charcoal Fabric
                                                                                    music
                                                                                                  1
In [28]:
          def remove_emojis(text):
               emoji pattern = re.compile("["
                    u"\U0001F600-\U0001F64F" # emoticons
                    u"\U0001F300-\U0001F5FF" # symbols & pictographs
                    u"\U0001F680-\U0001F6FF" # transport & map symbols
                    u"\U0001F1E0-\U0001F1FF" # flags (iOS)
                                          "]+", flags=re.UNICODE)
               return emoji_pattern.sub(r"", text)
          df["verified_reviews"] = df["verified_reviews"].apply(lambda x: remove_emojis(x))
          df.head()
Out[28]:
              rating
                         date
                                    variation
                                                                          verified reviews feedback
           0
                  5 31-Jul-18 Charcoal Fabric
                                                                              love my echo
                                                                                                  1
                  5 31-Jul-18 Charcoal Fabric
           1
                                                                                   loved it
                                                                                                  1
           2
                  4 31-Jul-18
                                Walnut Finish sometimes while playing a game you can answer ...
                                                                                                  1
           3
                  5 31-Jul-18 Charcoal Fabric
                                                  i have had a lot of fun with this thing my 4 y...
                                                                                                  1
                                                                                                  1
           4
                  5 31-Jul-18 Charcoal Fabric
                                                                                    music
In [29]:
          def tokenize text(text):
               return text.split()
           df['verified_reviews'] = df['verified_reviews'].apply(tokenize_text)
In [30]: df.head()
Out[30]:
                         date
                                    variation
                                                                       verified_reviews feedback
              rating
           0
                  5 31-Jul-18 Charcoal Fabric
                                                                        [love, my, echo]
                                                                                               1
           1
                  5 31-Jul-18 Charcoal Fabric
                                                                              [loved, it]
                                                                                               1
           2
                  4 31-Jul-18
                                 Walnut Finish [sometimes, while, playing, a, game, you, can,...
                                                                                               1
           3
                  5 31-Jul-18 Charcoal Fabric
                                                   [i, have, had, a, lot, of, fun, with, this, th...
                                                                                               1
           4
                  5 31-Jul-18 Charcoal Fabric
                                                                               [music]
                                                                                               1
In [31]:
          def remove_stopwords(tokens):
               stop words = set(stopwords.words('english'))
               return [word for word in tokens if word not in stop words]
           df['verified_reviews'] = df['verified_reviews'].apply(remove_stopwords)
In [32]: df.head()
```

```
verified reviews feedback
Out[32]:
              rating
                         date
                                    variation
           0
                  5 31-Jul-18 Charcoal Fabric
                                                                             [love, echo]
                                                                                                1
           1
                  5 31-Jul-18 Charcoal Fabric
                                                                                                1
                                                                                 [loved]
           2
                                                                                                1
                  4 31-Jul-18
                                 Walnut Finish [sometimes, playing, game, answer, question, c...
           3
                  5 31-Jul-18 Charcoal Fabric
                                                    [lot, fun, thing, 4, yr, old, learns, dinosaur...
                                                                                                1
           4
                  5 31-Jul-18 Charcoal Fabric
                                                                                 [music]
In [33]: from nltk.tokenize import word_tokenize
           # Convert the list of tokens to a string
           df["verified reviews"] = df["verified reviews"].apply(lambda x: " ".join(x))
           # Tokenize the "verified reviews" column
           df["verified_reviews"] = df["verified_reviews"].apply(word_tokenize)
           df.head()
Out[33]:
              rating
                         date
                                    variation
                                                                         verified reviews feedback
           0
                  5 31-Jul-18 Charcoal Fabric
                                                                                                1
                                                                             [love, echo]
                  5 31-Jul-18 Charcoal Fabric
           1
                                                                                                1
                                                                                 [loved]
           2
                  4 31-Jul-18
                                 Walnut Finish [sometimes, playing, game, answer, question, c...
                                                                                                1
           3
                  5 31-Jul-18 Charcoal Fabric
                                                    [lot, fun, thing, 4, yr, old, learns, dinosaur...
                                                                                                1
           4
                  5 31-Jul-18 Charcoal Fabric
                                                                                 [music]
                                                                                                1
In [34]: nltk.download('wordnet')
           [nltk_data] Downloading package wordnet to
                          C:\Users\Chaitanya\AppData\Roaming\nltk_data...
           [nltk_data]
          [nltk_data] Package wordnet is already up-to-date!
Out[34]: True
In [35]:
           stemmer = PorterStemmer()
           lemmatizer = WordNetLemmatizer()
           def stem and lemmatize(tokens):
               lemmatized = [lemmatizer.lemmatize(token) for token in tokens]
               stemmed = [stemmer.stem(token) for token in lemmatized]
               return stemmed
           df['verified reviews'] = df['verified reviews'].apply(stem and lemmatize)
In [38]: df.head()
Out[38]:
                                    variation
              rating
                         date
                                                                     verified_reviews feedback
                  5 31-Jul-18 Charcoal Fabric
                                                                        ['love', 'echo']
                                                                                             1
           1
                  5 31-Jul-18 Charcoal Fabric
                                                                                             1
                                                                              ['love']
           2
                                Walnut Finish ['sometim', 'play', 'game', 'answer', 'questio...
                                                                                             1
                  4 31-Jul-18
           3
                  5 31-Jul-18 Charcoal Fabric
                                                     ['lot', 'fun', 'thing', '4', 'yr', 'old', 'lea...
                                                                                             1
           4
                  5 31-Jul-18 Charcoal Fabric
                                                                             ['music']
                                                                                             1
In [41]: df['verified reviews'] = df['verified reviews'].astype(str)
In [44]: corpus=df['verified_reviews']
           vector=CountVectorizer()
```

```
tt=vector.fit_transform(corpus)
         print(tt.toarray())
         [[0 0 0 ... 0 0 0]
          [0 0 0 ... 0 0 0]
          [0 0 0 ... 0 0 0]
          . . .
          [0 0 0 ... 0 0 0]
          [0 0 0 ... 0 0 0]
          [0 0 0 ... 0 0 0]]
In [52]: from sklearn.feature_extraction.text import TfidfVectorizer
         # Create an instance of the TfidfVectorizer
         tfidf = TfidfVectorizer()
         # Fit and transform the "verified_reviews" column
         tfidf_matrix = tfidf.fit_transform(df["verified_reviews"])
         # Get the feature names
         feature_names = tfidf.get_feature_names_out()
         # Print the feature names
         print(feature_names[200:300])
         ['againthi' 'age' 'agent' 'ago' 'agoyesterday' 'agre' 'agreement' 'ahead'
          'ai' 'aid' 'aint' 'air' 'aka' 'al' 'alabama' 'alarm' 'alarmb' 'alarmcom'
           'alarmthi' 'albeit' 'alcohol' 'alert' 'alex' 'alexa' 'alexa34'
          'alexaalso' 'alexaechocomput' 'alexathi' 'alexi' 'alexia' 'alexu' 'algo'
           'aliv' 'allevi' 'alli' 'allinon' 'alloveral' 'allow' 'allrecip' 'almost'
           'alon' 'along' 'alongsid' 'alot' 'aloud' 'alread' 'alreadi' 'alright'
           'also' 'alter' 'altern' 'although' 'alway' 'amaonmaz' 'amax' 'amaz'
           'amazin' 'amazingli' 'amazon' 'amazonalexa' 'amazonia' 'amazonmark'
```

'amazons' 'amazont' 'amazonzigbe' 'ambient' 'american' 'among' 'amount'
'amozon' 'amplifi' 'amus' 'analog' 'and' 'android' 'angl' 'annoy' 'anoth'
'answer' 'ant' 'anticip' 'antitechnolog' 'anybodi' 'anyhow' 'anylist'
'anymor' 'anyon' 'anypod' 'anyth' 'anythingi' 'anytim' 'anyway' 'anywher'

'apart' 'app' 'app34' 'appar' 'apparentlylong' 'appeal' 'appear']