lenovo topic analysis reviews

November 23, 2021

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[]: import re
     import pandas as pd
     import nltk
     import gensim
     import matplotlib.pyplot as plt
     %matplotlib inline
     from wordcloud import WordCloud
[]: !pip install wordcloud
    Requirement already satisfied: wordcloud in
    /Users/sthuraisamy/code/watchblade.com/lab/ai-lab/.venv/lib/python3.9/site-
    packages (1.8.1)
    Requirement already satisfied: numpy>=1.6.1 in
    /Users/sthuraisamy/code/watchblade.com/lab/ai-lab/.venv/lib/python3.9/site-
    packages (from wordcloud) (1.21.4)
    Requirement already satisfied: pillow in
    /Users/sthuraisamy/code/watchblade.com/lab/ai-lab/.veny/lib/python3.9/site-
    packages (from wordcloud) (8.4.0)
    Requirement already satisfied: matplotlib in
    /Users/sthuraisamy/code/watchblade.com/lab/ai-lab/.venv/lib/python3.9/site-
    packages (from wordcloud) (3.5.0)
    Requirement already satisfied: pyparsing>=2.2.1 in
    /Users/sthuraisamy/code/watchblade.com/lab/ai-lab/.venv/lib/python3.9/site-
    packages (from matplotlib->wordcloud) (3.0.6)
    Requirement already satisfied: python-dateutil>=2.7 in
    /Users/sthuraisamy/code/watchblade.com/lab/ai-lab/.venv/lib/python3.9/site-
    packages (from matplotlib->wordcloud) (2.8.2)
    Requirement already satisfied: setuptools-scm>=4 in
    /Users/sthuraisamy/code/watchblade.com/lab/ai-lab/.venv/lib/python3.9/site-
    packages (from matplotlib->wordcloud) (6.3.2)
    Requirement already satisfied: fonttools>=4.22.0 in
    /Users/sthuraisamy/code/watchblade.com/lab/ai-lab/.venv/lib/python3.9/site-
    packages (from matplotlib->wordcloud) (4.28.2)
    Requirement already satisfied: kiwisolver>=1.0.1 in
    /Users/sthuraisamy/code/watchblade.com/lab/ai-lab/.venv/lib/python3.9/site-
    packages (from matplotlib->wordcloud) (1.3.2)
    Requirement already satisfied: packaging>=20.0 in
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/Users/sthuraisamy/code/watchblade.com/lab/ai-lab/.venv/lib/python3.9/site-
    packages (from matplotlib->wordcloud) (21.3)
    Requirement already satisfied: cycler>=0.10 in
    /Users/sthuraisamy/code/watchblade.com/lab/ai-lab/.venv/lib/python3.9/site-
    packages (from matplotlib->wordcloud) (0.11.0)
    Requirement already satisfied: six>=1.5 in
    /Users/sthuraisamy/code/watchblade.com/lab/ai-lab/.venv/lib/python3.9/site-
    packages (from python-dateutil>=2.7->matplotlib->wordcloud) (1.16.0)
    Requirement already satisfied: tomli>=1.0.0 in
    /Users/sthuraisamy/code/watchblade.com/lab/ai-lab/.venv/lib/python3.9/site-
    packages (from setuptools-scm>=4->matplotlib->wordcloud) (1.2.2)
    Requirement already satisfied: setuptools in
    /Users/sthuraisamy/code/watchblade.com/lab/ai-lab/.venv/lib/python3.9/site-
    packages (from setuptools-scm>=4->matplotlib->wordcloud) (58.1.0)
    WARNING: You are using pip version 21.2.4; however, version 21.3.1 is
    available.
    You should consider upgrading via the
    '/Users/sthuraisamy/code/watchblade.com/lab/ai-lab/.venv/bin/python -m pip
    install --upgrade pip' command.
[]: replace_vals = [(re.compile(r'@\w+'), ''),
                               (re.compile(r'http\S+'), '')]
[]: # common functions
[ ]: def read_data_set(data_filename):
         '''function to read dataset and print some information about the dataset'''
         # read csv file into dataframe
        data_df = pd.read_csv(
             data_filename, delimiter=",", encoding="utf-8")
         # print the info of twitter data frame
        print(data_df.head())
        print(data_df.shape)
        print(data_df.columns)
        print(data_df.isnull().sum())
        return data df
[]: def pre_token_cleanup(text, replace_vals):
         '''function to pre-process the tweets'''
        text = text.lower() # convert to lower case
         # text = replace\ with(text,\ [('&', 'and'), ('&qt;', '>'), ('<', \ )]
      '<')])</p>
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for replace in replace_vals:
             text = re.sub(replace[0], replace[1], text)
         text = text.strip() # remove leading and trailing whitespace
         return text
[ ]: def clean_reviews(review_df):
         '''function to clean the reviews'''
         review_df["review"] = review_df["review"].apply(pre_token_cleanup,_
      →args=(replace_vals,))
         print(review_df.head())
         return review_df
[]: def view_wordcloud_common_words(review_df):
         '''function to view the common words'''
         # get the common words
         all_words = ','.join(list(review_df['review'].values))
         # print(all_words)
         # view the word cloud
         w_cloud = WordCloud(background_color='white', max_words=5000, width=600, __
      →height=300, contour_width=3, contour_color='steelblue')
         w_cloud.generate(all_words)
         w_cloud.to_file('wordcloud.png')
[]: def get_values_for_topic_analysis(review_df):
         review_values = review_df["review"].values
         return review_values
[ ]: def get_word_tokens(review_values):
         '''function to get the word tokens'''
         word_tokens = []
         for review in review_values:
             word_tokens.append(nltk.word_tokenize(review))
         return word_tokens
[]: # read the data from csv file into dataframe
     review_df = read_data_set('../data/k8_review.csv')
       sentiment
    0
                             Good but need updates and improvements
               O Worst mobile i have bought ever, Battery is dr...
```

```
2
               1 when I will get my 10% cash back... its alrea...
    3
                                                                Good
               O The worst phone everThey have changed the last...
    (14675, 2)
    Index(['sentiment', 'review'], dtype='object')
    sentiment
    review
                 0
    dtype: int64
[]: # Normalize casings and clean up the tweets
     review df = clean reviews(review df)
     # extract the review text values into a list for easier manipulation.
     review_values = get_values_for_topic_analysis(review_df)
     print(review_values[:10])
       sentiment
                                                              review
    0
               1
                             good but need updates and improvements
               0 worst mobile i have bought ever, battery is dr...
    1
    2
               1 when i will get my 10% cash back... its alrea...
    3
                                                                good
               0 the worst phone everthey have changed the last...
    ['good but need updates and improvements'
     "worst mobile i have bought ever, battery is draining like hell, backup is only
    6 to 7 hours with internet uses, even if i put mobile idle its getting
    discharged.this is biggest lie from amazon & lenove which is not at all
    expected, they are making full by saying that battery is 4000mah & booster
    charger is fake, it takes at least 4 to 5 hours to be fully charged.don't know
    how lenovo will survive by making full of us.please don;t go for this else you
    will regret like me."
     'when i will get my 10% cash back... its already 15 january..' 'good'
     'the worst phone everthey have changed the last phone but the problem is still
    same and the amazon is not returning the phone .highly disappointing of amazon'
     "only i'm telling don't buyi'm totally disappointedpoor batterypoor camerawaste
    of money"
     'phone is awesome. but while charging, it heats up allot..really a genuine
    reason to hate lenovo k8 note'
     'the battery level has worn down'
     "it's over hitting problems...and phone hanging problems lenovo k 8 note...so
    where is service station in ahmedabad it's one years warranty so it's can change
    the phone by lenovo"
     'a lot of glitches dont buy this thing better go for some other options']
[]: view wordcloud common words(review df)
[]: # tokenize the reviews using NLTK
     review_word_tokens = get_word_tokens(review_values)
     print(review_word_tokens[:10])
```

[['good', 'but', 'need', 'updates', 'and', 'improvements'], ['worst', 'mobile', 'i', 'have', 'bought', 'ever', ',', 'battery', 'is', 'draining', 'like', 'hell', ',', 'backup', 'is', 'only', '6', 'to', '7', 'hours', 'with', 'internet', 'uses', ',', 'even', 'if', 'i', 'put', 'mobile', 'idle', 'its', 'getting', 'discharged.this', 'is', 'biggest', 'lie', 'from', 'amazon', '&', 'lenove', 'which', 'is', 'not', 'at', 'all', 'expected', ',', 'they', 'are', 'making', 'full', 'by', 'saying', 'that', 'battery', 'is', '4000mah', '&', 'booster', 'charger', 'is', 'fake', ',', 'it', 'takes', 'at', 'least', '4', 'to', '5', 'hours', 'to', 'be', 'fully', 'charged.do', "n't", 'know', 'how', 'lenovo', 'will', 'survive', 'by', 'making', 'full', 'of', 'us.please', 'don', ';', 't', 'go', 'for', 'this', 'else', 'you', 'will', 'regret', 'like', 'me', '.'], ['when', 'i', 'will', 'get', 'my', '10', '%', 'cash', 'back', '...', 'its', 'already', '15', 'january', '...'], ['good'], ['the', 'worst', 'phone', 'everthey', 'have', 'changed', 'the', 'last', 'phone', 'but', 'the', 'problem', 'is', 'still', 'same', 'and', 'the', 'amazon', 'is', 'not', 'returning', 'the', 'phone', '.highly', 'disappointing', 'of', 'amazon'], ['only', 'i', "'m", 'telling', 'do', "n't", 'buyi', "'m", 'totally', 'disappointedpoor', 'batterypoor', 'camerawaste', 'of', 'money'], ['phone', 'is', 'awesome', '.', 'but', 'while', 'charging', ',', 'it', 'heats', 'up', 'allot', '..', 'really', 'a', 'genuine', 'reason', 'to', 'hate', 'lenovo', 'k8', 'note'], ['the', 'battery', 'level', 'has', 'worn', 'down'], ['it', "'s", 'over', 'hitting', 'problems', '...', 'and', 'phone', 'hanging', 'problems', 'lenovo', 'k', '8', 'note', '...', 'so', 'where', 'is', 'service', 'station', 'in', 'ahmedabad', 'it', "'s", 'one', 'years', 'warranty', 'so', 'it', "'s", 'can', 'change', 'the', 'phone', 'by', 'lenovo'], ['a', 'lot', 'of', 'glitches', 'dont', 'buy', 'this', 'thing', 'better', 'go', 'for', 'some', 'other', 'options']]

[]: # using NLTK to get the parts of speech of the sentences
review_sentences_postags = [nltk.pos_tag(sentence) for sentence in_
→review_word_tokens]
print(review_sentences_postags[:2])

[[('good', 'JJ'), ('but', 'CC'), ('need', 'VBP'), ('updates', 'NNS'), ('and', 'CC'), ('improvements', 'NNS')], [('worst', 'JJS'), ('mobile', 'NN'), ('i', 'NN'), ('have', 'VBP'), ('bought', 'VBN'), ('ever', 'RB'), (',', ','), ('battery', 'NN'), ('is', 'VBZ'), ('draining', 'VBG'), ('like', 'IN'), ('hell', 'NN'), (',', ','), ('backup', 'NN'), ('is', 'VBZ'), ('only', 'RB'), ('6', 'CD'), ('to', 'TO'), ('7', 'CD'), ('hours', 'NNS'), ('with', 'IN'), ('internet', 'JJ'), ('uses', 'NNS'), (',', ','), ('even', 'RB'), ('if', 'IN'), ('i', 'JJ'), ('put', 'VBP'), ('mobile', 'JJ'), ('idle', 'NN'), ('its', 'PRP\$'), ('getting', 'VBG'), ('discharged.this', 'NN'), ('is', 'VBZ'), ('biggest', 'JJS'), ('lie', 'NN'), ('from', 'IN'), ('amazon', 'NN'), ('&', 'CC'), ('lenove', 'NN'), ('which', 'WDT'), ('is', 'VBZ'), ('not', 'RB'), ('at', 'IN'), ('all', 'DT'), ('expected', 'VBN'), (',', ','), ('they', 'PRP'), ('are', 'VBP'), ('making', 'VBG'), ('full', 'JJ'), ('by', 'IN'), ('saying', 'VBG'), ('that', 'DT'), ('battery', 'NN'), ('is', 'VBZ'), ('4000mah', 'CD'), ('&', 'CC'), ('booster', 'JJR'), ('charger', 'NN'), ('is', 'VBZ'), ('fake', 'JJ'), (',', ','), ('it', 'PRP'), ('takes', 'VBZ'), ('at', 'IN'), ('least', 'JJS'), ('4', 'CD'), ('to', 'TO'), ('5', 'CD'),

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'JJ'), ('of', 'IN'), ('us.please', 'JJ'), ('don', 'NN'), (';', ':'), ('t',
    'CC'), ('go', 'VB'), ('for', 'IN'), ('this', 'DT'), ('else', 'JJ'), ('you',
    'PRP'), ('will', 'MD'), ('regret', 'VB'), ('like', 'IN'), ('me', 'PRP'), ('.',
    '.')]]
[]: def get postags with nouns(review sentences postags):
         '''function to get the pos tags with nouns'''
        noun_tags = ['NN', 'NNS', 'NNP', 'NNPS']
        postags with nouns = []
        for sentence in review sentences postags:
            postags_with_nouns.append([word for word, tag in sentence if tag in_
      →noun_tags])
        return postags_with_nouns
[]: # get the pos tags with nouns
     postags_with_nouns = get_postags_with_nouns(review_sentences_postags)
     print(postags_with_nouns[:10])
    [['updates', 'improvements'], ['mobile', 'i', 'battery', 'hell', 'backup',
    'hours', 'uses', 'idle', 'discharged.this', 'lie', 'amazon', 'lenove',
    'battery', 'charger', 'hours', 'don'], ['i', '%', 'cash', '..'], [], ['phone',
    'everthey', 'phone', 'problem', 'amazon', 'phone', 'amazon'], ['camerawaste',
    'money'], ['phone', 'allot', '..', 'reason', 'k8'], ['battery', 'level'],
    ['problems', 'phone', 'hanging', 'problems', 'note', 'station', 'ahmedabad',
    'years', 'phone', 'lenovo'], ['lot', 'glitches', 'thing', 'options']]
[]: def get_postags_with_nouns_lemmed(postags_with_nouns):
         '''function to get the pos tags with nouns lemmatized'''
        lemmatizer = nltk.stem.WordNetLemmatizer()
        postags_with_nouns_lemmed = []
        for sentence in postags_with_nouns:
            postags_with_nouns_lemmed.append([lemmatizer.lemmatize(word) for word_
     →in sentence])
        return postags_with_nouns_lemmed
[]: # lemmatize the nouns
     postags_with_nouns_lemmed = get_postags_with_nouns_lemmed(postags_with_nouns)
     print(postags_with_nouns_lemmed[:10])
    [['update', 'improvement'], ['mobile', 'i', 'battery', 'hell', 'backup', 'hour',
    'us', 'idle', 'discharged.this', 'lie', 'amazon', 'lenove', 'battery',
    'charger', 'hour', 'don'], ['i', '%', 'cash', '..'], [], ['phone', 'everthey',
    'phone', 'problem', 'amazon', 'phone', 'amazon'], ['camerawaste', 'money'],
    ['phone', 'allot', '...', 'reason', 'k8'], ['battery', 'level'], ['problem',
```

('hours', 'NNS'), ('to', 'TO'), ('be', 'VB'), ('fully', 'RB'), ('charged.do', 'VBP'), ("n't", 'RB'), ('know', 'VB'), ('how', 'WRB'), ('lenovo', 'JJ'), ('will', 'MD'), ('survive', 'VB'), ('by', 'IN'), ('making', 'VBG'), ('full',

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'phone', 'hanging', 'problem', 'note', 'station', 'ahmedabad', 'year', 'phone',
    'lenovo'], ['lot', 'glitch', 'thing', 'option']]
[]: def remove_stop_words_and_puncs(postags_with_nouns_lemmed):
         '''function to remove stop words and punctuations'''
         stop_words = set(nltk.corpus.stopwords.words('english'))
         postags_with_nouns_lemmed_no_stop_words = []
         for sentence in postags_with_nouns_lemmed:
             postags_with_nouns_lemmed_no_stop_words.append([word for word in_
      →sentence if word not in stop_words])
         return postags_with_nouns_lemmed_no_stop_words
[]: # Remove stopwords and punctuation (if there are any).
     postags_with_nouns_lemmed_no_stop_words =__
     →remove_stop_words_and_puncs(postags_with_nouns_lemmed)
     print(postags_with_nouns_lemmed_no_stop_words[:10])
    [['update', 'improvement'], ['mobile', 'battery', 'hell', 'backup', 'hour',
    'us', 'idle', 'discharged.this', 'lie', 'amazon', 'lenove', 'battery',
    'charger', 'hour'], ['%', 'cash', '...'], [], ['phone', 'everthey', 'phone',
    'problem', 'amazon', 'phone', 'amazon'], ['camerawaste', 'money'], ['phone',
    'allot', '..', 'reason', 'k8'], ['battery', 'level'], ['problem', 'phone',
    'hanging', 'problem', 'note', 'station', 'ahmedabad', 'year', 'phone',
    'lenovo'], ['lot', 'glitch', 'thing', 'option']]
[]: def get_top_terms_for_topics_using_lda(postags_with_nouns_lemmed_no_stop_words,_u
     →num_topics, alpha, passes, workers):
         '''function to get the top terms for topics using LDA'''
         # Create a dictionary representation of the documents.
         dictionary = gensim.corpora.
     →Dictionary(postags_with_nouns_lemmed_no_stop_words)
         # Create a corpus from the bag of words.
         corpus = [dictionary.doc2bow(sentence) for sentence in___
     →postags_with_nouns_lemmed_no_stop_words]
         # Build the LDA model.
         lda model = gensim.models.LdaMulticore(corpus, num_topics=num_topics,__
      →id2word=dictionary, passes=passes, alpha=alpha, random state=426, ___
     →workers=workers)
         return lda_model, dictionary
[]: num topics=12
     lda_model, dictionary =_
     →get_top_terms_for_topics_using_lda(postags_with_nouns_lemmed_no_stop_words, __
     →num_topics=num_topics, passes=20,alpha='symmetric', workers=3)
```

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[(0, '0.058*"call" + 0.054*"screen" + 0.041*"sim" + 0.039*"glass" +
       0.019*"gorilla" + 0.019*"jio" + 0.018*"voice" + 0.017*"time" + 0.016*"display" +
       0.016*"volta"'), (1, '0.306*"battery" + 0.080*"backup" + 0.043*"hour" +
       0.035*"time" + 0.033*"life" + 0.029*"drain" + 0.027*"day" + 0.025*"problem" +
       0.020*"charge" + 0.018*"heat"'), (2, '0.201*"camera" + 0.185*"product" +
       0.106*"quality" + 0.023*"performance" + 0.020*"phone" + 0.018*"waste" +
       0.014*"money" + 0.013*"clarity" + 0.012*"picture" + 0.012*"mark"'), (3,
       '0.043*"hai" + 0.038*"h" + 0.021*"box" + 0.017*"ho" + 0.016*"item" +
       0.012*"cable" + 0.011*"review" + 0.011*"lenovo" + 0.010*"ka" + 0.010*"model"'),
       (4, 0.254*"phone" + 0.035*"lenovo" + 0.020*"time" + 0.018*"note" + 0.018*"note"
       0.016*"issue" + 0.014*"update" + 0.013*"feature" + 0.011*"software" +
       0.009*"amazon" + 0.009*"month"'), (5, '0.036*"phone" + 0.035*"amazon" +
       0.022*"return" + 0.020*"smartphone" + 0.020*"option" + 0.017*"product" +
       0.016*"screen" + 0.014*"ram" + 0.013*"app" + 0.013*"processor"'), (6,
       '0.097*"phone" + 0.054*"camera" + 0.038*"speaker" + 0.035*"battery" +
       0.020*"everything" + 0.019*"sound" + 0.017*"budget" + 0.015*"quality" +
       0.013*"headphone" + 0.013*"thing"'), (7, '0.312*"mobile" + 0.039*"..." +
       0.035*"superb" + 0.034*"*" + 0.025*"delivery" + 0.021*"worth" + 0.014*"awesome"
       + 0.014*"money" + 0.014*"..." + 0.014*"feature"'), (8, '0.192*"problem" +
       0.125*"issue" + 0.087*"heating" + 0.080*"network" + 0.023*"handset" +
       0.013*"month" + 0.013*"connectivity" + 0.013*"ok" + 0.010*"buy" +
       0.010*"signal"'), (9, '0.091*"note" + 0.057*"k8" + 0.045*"service" +
       0.023*"phone" + 0.021*"lenovo" + 0.018*"day" + 0.015*"customer" +
       0.015*"product" + 0.014*"amazon" + 0.013*"battery"'), (10, '0.257*".." +
       0.106*"..." + 0.063*"money" + 0.062*"phone" + 0.046*"performance" +
       0.039*"value" + 0.012*"..." + 0.009*"plz" + 0.008*"amazon" + 0.007*"camera"'),
       (11, '0.100*"phone" + 0.063*"price" + 0.047*"camera" + 0.028*"charger" +
       0.025*"device" + 0.024*"issue" + 0.023*"feature" + 0.023*"range" + 0.020*"day" +
       0.016*"battery"')]
[]: def get_coherence_score_using_lda(lda_model, dictionary,__
          →postags_with_nouns_lemmed_no_stop_words):
                '''function to get the coherence score using LDA'''
                # Compute Coherence Score
                coherence_model_lda = gensim.models.CoherenceModel(model=lda_model,_u
          →texts=postags with nouns lemmed no stop words, dictionary=dictionary, __
          coherence_lda = coherence_model_lda.get_coherence()
               return coherence_lda
[]: coherence_lda = get_coherence_score_using_lda(lda_model, dictionary,__
          →postags_with_nouns_lemmed_no_stop_words)
        print('Coherence score: ',coherence_lda)
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print(lda_model.print_topics(num_topics=num_topics, num_words=10))

Coherence score: 0.5323107049732453

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[]: def___
     →get_coherence_score_for_multiple_topics(postags_with_nouns_lemmed_no_stop_words,
     →num_topics_list):
         '''function to get the coherence score for multiple topics'''
         coherence scores = []
        for num_topics in num_topics_list:
             lda_model, dictionary =__
      →get_top_terms_for_topics_using_lda(postags_with_nouns_lemmed_no_stop_words,_
      →num_topics=num_topics, passes=30,alpha='symmetric', workers=5)
             coherence_model_lda = get_coherence_score_using_lda(lda_model,_
      →dictionary, postags_with_nouns_lemmed_no_stop_words, num_topics)
             coherence_scores.append(coherence_model_lda)
        return coherence_scores
[]: num_topics_list = [5,6,7,8,9,10]
     coherence_scores =__
     →get coherence score for multiple topics(postags with nouns lemmed no stop words,
     →num_topics_list)
     print(coherence scores)
    [0.5189486456095401, 0.5142553731846591, 0.5045417075996442, 0.5687858691150023,
    0.5407228460090576, 0.5400228379980615]
[]: # get the model for better coherence score
     num_topics_for_better_coherence = num_topics_list[coherence_scores.
     →index(max(coherence_scores))]
     print('Number of topics for better coherence score:
     →',num_topics_for_better_coherence)
     lda_model_v1, dictionary_v1 =
     →get_top_terms_for_topics_using_lda(postags_with_nouns_lemmed_no_stop_words, __
     →num_topics=num_topics_for_better_coherence, passes=30,alpha='symmetric',u
     →workers=3)
     better_coherence_model_lda = get_coherence_score_using_lda(lda_model_v1,_
     →dictionary_v1, postags_with_nouns_lemmed_no_stop_words,
     →num_topics_for_better_coherence)
     print('Better coherence model: ',better_coherence_model_lda)
    Number of topics for better coherence score: 8
    Better coherence model: 0.5521932218121997
[]: def print_topics_report(final_lda_model):
        topic words = {}
        for idx, topic in final_lda_model.print_topics(-1):
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temp = []
for item in topic.split('+'):
    item_alpha = [letter for letter in item if letter.isalpha()]
    temp.append(''.join(item_alpha))
    topic_words[('Topic_'+str(idx+1))] = temp

topics_df = pd.DataFrame(topic_words)
    topics_df.index = ['Word_'+str(i+1) for i in range(topics_df.shape[0])]
    print(topics_df)
[]: print_topics_report(lda_model_v1)
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```
Topic_1
                      Topic_2
                                    Topic_3
                                             Topic_4
                                                       Topic_5
                                                                   Topic_6 \
            call
Word_1
                      problem
                                     camera
                                             charger
                                                         phone
                                                                     price
Word_2
          screen
                       device
                                    product
                                                          note
                                                                     phone
                                                  hai
Word_3
           glass
                        super
                                    quality
                                                    h
                                                        lenovo
                                                                     range
Word_4
                                                                   feature
             sim
                    excellent
                                      phone
                                               turbo
                                                         issue
Word_5
                               performance
                                                          time
                                                                    camera
          option
                           ok
                                                  box
Word_6
            time
                          set
                                                    k
                                                                     music
Word_7
         network
                        dolby
                                       mode
                                                note
                                                      product
                                                                       ram
Word_8
              jio
                      product
                                      depth
                                               charge
                                                       service
                                                                processor
Word_9
            cast
                        atmos
                                                   ho
                                                             k
                                                                      note
Word_10
         gorilla connection
                                    feature
                                                 item
                                                           day
                                                                    memory
```

```
Topic_7
                        Topic_8
Word_1
              battery
                         mobile
Word_2
                phone
Word_3
               camera
                          money
Word_4
                issue
Word_5
              problem
                        product
Word_6
               backup
                          waste
Word_7
             heating
                          value
Word_8
         performance
Word 9
                 life
                       delivery
Word_10
                         superb
                  day
```

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