

```
1 # from google.colab import files
2 # uploaded = files.upload()

1 import pandas as pd
2 import numpy as np

1 rev_df = pd.read_csv('Amazon_Reviews.csv', engine='python')
2 rev_df
```

	Reviewer Name	Profile Link	Country	Review Count	Review Date	Rating	Review Title	Review Text	Date of Experience
0	Eugene ath	/users/66e8185ff1598352d6b3701a	US	1 review	2024-09-16T13:44:26.000Z	Rated 1 out of 5 stars	A Store That Doesn't Want to Sell Anything	I registered on the website, tried to order a ...	September 16, 2024
1	Daniel ohalloran	/users/5d75e460200c1f6a6373648c	GB	9 reviews	2024-09-16T18:26:46.000Z	Rated 1 out of 5 stars	Had multiple orders one turned up and...	Had multiple orders one turned up and driver h...	September 16, 2024
2	p fisher	/users/546cfcf1000064000197b88f	GB	90 reviews	2024-09-16T21:47:39.000Z	Rated 1 out of 5 stars	I informed these reprobates	I informed these reprobates that I WOULD NOT B...	September 16, 2024
3	Greg Dunn	/users/62c35cdbacc0ea0012ccaffa	AU	5 reviews	2024-09-17T07:15:49.000Z	Rated 1 out of 5 stars	Advertise one price then increase it on website	I have bought from Amazon before and no proble...	September 17, 2024
4	Sheila Hannah	/users/5ddbe429478d88251550610e	GB	8 reviews	2024-09-16T18:37:17.000Z	Rated 1 out of 5 stars	If I could give a lower rate I would	If I could give a lower rate I would! I cancel...	September 16, 2024
...

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```
1 rev_df.info()
2 print()
3 print(f'Null : \n{rev_df.isnull().sum()}')
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 21214 entries, 0 to 21213
Data columns (total 9 columns):
#   Column                Non-Null Count  Dtype
---  -
0   Reviewer Name          21214 non-null  object
1   Profile Link           21163 non-null  object
2   Country                21054 non-null  object
3   Review Count           21055 non-null  object
4   Review Date            21055 non-null  object
5   Rating                 21055 non-null  object
6   Review Title           21055 non-null  object
7   Review Text            21055 non-null  object
8   Date of Experience      20947 non-null  object
dtypes: object(9)
memory usage: 1.5+ MB

Null :
Reviewer Name      0
Profile Link        51
Country            160
Review Count       159
Review Date        159
Rating             159
Review Title       159
Review Text        159
Date of Experience  267
dtype: int64
```

```

1 # correcting all the column names
2
3 rev_df.columns = rev_df.columns.str.lower().str.replace(' ', '_')
4 rev_df.columns

```

```

↗ Index(['reviewer_name', 'profile_link', 'country', 'review_count',
        'review_date', 'rating', 'review_title', 'review_text',
        'date_of_experience'],
        dtype='object')

```

```

1 # cleaning the profile links and removing duplicates
2 import uuid
3
4 uid = uuid.uuid4().hex[:24]
5 profile = f'/user/{uid}'
6 rev_df['profile_link'].fillna(profile, inplace=True)
7 rev_df.drop_duplicates(inplace=True)
8

```

↗ <ipython-input-7-e2d94c52b8d0>:6: FutureWarning: A value is trying to be set on a copy of a DataFrame or Series through chained assignment. The behavior will change in pandas 3.0. This inplace method will never work because the intermediate object on which we are setting

For example, when doing 'df[col].method(value, inplace=True)', try using 'df.method({col: value}, inplace=True)' or df[col] = df[col]

```

rev_df['profile_link'].fillna(profile, inplace=True)

```

```

1 # using most common country to fill in the country names using mode
2 most_common_country = rev_df['country'].mode()[0]
3 rev_df['country'].fillna(most_common_country, inplace=True)
4 rev_df

```

↗ <ipython-input-8-e7df5d195954>:3: FutureWarning: A value is trying to be set on a copy of a DataFrame or Series through chained assignment. The behavior will change in pandas 3.0. This inplace method will never work because the intermediate object on which we are setting

For example, when doing 'df[col].method(value, inplace=True)', try using 'df.method({col: value}, inplace=True)' or df[col] = df[col]

```

rev_df['country'].fillna(most_common_country, inplace=True)

```

	reviewer_name	profile_link	country	review_count	review_date	rating	review_title	review_text	date_of_experience
0	Eugene ath	/users/66e8185ff1598352d6b3701a	US	1 review	2024-09-16T13:44:26.000Z	Rated 1 out of 5 stars	A Store That Doesn't Want to Sell Anything	I registered on the website, tried to order a ...	Se
1	Daniel ohalloran	/users/5d75e460200c1f6a6373648c	GB	9 reviews	2024-09-16T18:26:46.000Z	Rated 1 out of 5 stars	Had multiple orders one turned up and...	Had multiple orders one turned up and driver h...	Se
2	p fisher	/users/546cfcf1000064000197b88f	GB	90 reviews	2024-09-16T21:47:39.000Z	Rated 1 out of 5 stars	I informed these reprobates	I informed these reprobates that I WOULD NOT B...	Se
3	Greg Dunn	/users/62c35cdbacc0ea0012ccaffa	AU	5 reviews	2024-09-17T07:15:49.000Z	Rated 1 out of 5 stars	Advertise one price then increase it on website	I have bought from Amazon before and no proble...	Se
4	Sheila Hannah	/users/5ddb4e429478d88251550610e	GB	8 reviews	2024-09-16T18:37:17.000Z	Rated 1 out of 5 stars	If I could give a lower rate I would	If I could give a lower rate I would! I cancel...	Se
...
21209	Anders T	/users/47bd4ffe0000640001001044	DK	1 review	2009-03-22T13:14:12.000Z	Rated 5 out of 5	Fast!!	I have had perfect order fulfillment,	


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```

1 # from the review count column numerical values are extracted
2
3 rev_df['review_count'] = rev_df['review_count'].str.extract(r'(\d+)')
4 rev_df['review_count'] = pd.to_numeric(rev_df['review_count'], errors='coerce')
5 mean_val = rev_df['review_count'].mean()
6 rev_df['review_count'].fillna(mean_val, inplace=True)

```

```
7 rev_df['review_count'] = rev_df['review_count'].astype(int)
8 rev_df
```

 <ipython-input-9-df4aa9abf6db>:6: FutureWarning: A value is trying to be set on a copy of a DataFrame or Series through chained assignment. The behavior will change in pandas 3.0. This inplace method will never work because the intermediate object on which we are setting

For example, when doing 'df[col].method(value, inplace=True)', try using 'df.method({col: value}, inplace=True)' or df[col] = df[col]

```
rev_df['review_count'].fillna(mean_val, inplace=True)
```

	reviewer_name	profile_link	country	review_count	review_date	rating	review_title	review_text	date
0	Eugene ath	/users/66e8185ff1598352d6b3701a	US	1	2024-09-16T13:44:26.000Z	Rated 1 out of 5 stars	A Store That Doesn't Want to Sell Anything	I registered on the website, tried to order a ...	Se
1	Daniel ohalloran	/users/5d75e460200c1f6a6373648c	GB	9	2024-09-16T18:26:46.000Z	Rated 1 out of 5 stars	Had multiple orders one turned up and...	Had multiple orders one turned up and driver h...	Se
2	p fisher	/users/546cfcf1000064000197b88f	GB	90	2024-09-16T21:47:39.000Z	Rated 1 out of 5 stars	I informed these reprobates	I informed these reprobates that I WOULD NOT B...	Se
3	Greg Dunn	/users/62c35cdbacc0ea0012ccaffa	AU	5	2024-09-17T07:15:49.000Z	Rated 1 out of 5 stars	Advertise one price then increase it on website	I have bought from Amazon before and no proble...	Se
4	Sheila Hannah	/users/5ddb429478d88251550610e	GB	8	2024-09-16T18:37:17.000Z	Rated 1 out of 5 stars	If I could give a lower rate I would	If I could give a lower rate I would! I cancel...	Se
...
21209	Anders T	/users/47bd4ffe0000640001001044	DK	1	2009-03-22T13:14:12.000Z	Rated 5 out of 5	Fast!!	I have had perfect order fulfillment,	

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```
1 # Transforming the review_date column as per datetime
2
3 rev_df['review_date'] = pd.to_datetime(rev_df['review_date'], errors='coerce')
4 # rev_df['review_date'] = rev_df['review_date'].dt.strftime('%Y-%m-%d')
5 most_common_date = rev_df['review_date'].mode()[0]
6 rev_df['review_date'] = rev_df['review_date'].fillna(most_common_date)
7
8 rev_df['date_of_experience'] = pd.to_datetime(rev_df['date_of_experience'])
9 # rev_df['date_of_experience'] = rev_df['date_of_experience'].dt.strftime('%Y-%m-%d')
10 most_common_date = rev_df['date_of_experience'].mode()[0]
11 rev_df['date_of_experience'] = rev_df['date_of_experience'].fillna(most_common_date)
12
13 rev_df
```

	reviewer_name	profile_link	country	review_count	review_date	rating	review_title	review_text	date_c
0	Eugene ath	/users/66e8185ff1598352d6b3701a	US	1	2024-09-16 13:44:26+00:00	Rated 1 out of 5 stars	A Store That Doesn't Want to Sell Anything	I registered on the website, tried to order a ...	
1	Daniel ohalloran	/users/5d75e460200c1f6a6373648c	GB	9	2024-09-16 18:26:46+00:00	Rated 1 out of 5 stars	Had multiple orders one turned up and...	Had multiple orders one turned up and driver h...	
2	p fisher	/users/546cfcf1000064000197b88f	GB	90	2024-09-16 21:47:39+00:00	Rated 1 out of 5 stars	I informed these reprobates	I informed these reprobates that I WOULD NOT B...	
3	Greg Dunn	/users/62c35cdbacc0ea0012ccaffa	AU	5	2024-09-17 07:15:49+00:00	Rated 1 out of 5 stars	Advertise one price then increase it on website	I have bought from Amazon before and no proble...	
4	Sheila Hannah	/users/5ddb429478d88251550610e	GB	8	2024-09-16 18:37:17+00:00	Rated 1 out of 5 stars	If I could give a lower rate I would	If I could give a lower rate I would! I cancel...	
...	
					2009-03-22	Rated 5 out		I have had perfect order	

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```

1 # Extracting the numerical value from string
2
3 rev_df['rating'] = rev_df['rating'].str.extract(r'Rated (\d+) out of 5 stars')
4 rev_df['rating'] = pd.to_numeric(rev_df['rating'], errors='coerce')
5 mean_value = rev_df['rating'].mean()
6 rev_df['rating'] = rev_df['rating'].fillna(mean_value).round().astype(int)

1 rev_df['review_title'] = rev_df['review_title'].fillna('N/A')
2 rev_df['review_text'] = rev_df['review_text'].fillna('N/A')
3
4 rev_df['text_features'] = rev_df['review_text'] + ' ' + rev_df['review_title']

1 from textblob import TextBlob
2
3 rev_df['polarity'] = rev_df['review_text'].apply(lambda x: TextBlob(x).sentiment.polarity)
4 rev_df['sentiment'] = rev_df['polarity'].apply(lambda x: 'positive' if x > 0 else ('negative' if x < 0 else 'neutral'))
5 rev_df

```

	reviewer_name	profile_link	country	review_count	review_date	rating	review_title	review_text	date
0	Eugene ath	/users/66e8185ff1598352d6b3701a	US	1	2024-09-16 13:44:26+00:00	1	A Store That Doesn't Want to Sell Anything	I registered on the website, tried to order a ...	
1	Daniel ohalloran	/users/5d75e460200c1f6a6373648c	GB	9	2024-09-16 18:26:46+00:00	1	Had multiple orders one turned up and...	Had multiple orders one turned up and driver h...	
2	p fisher	/users/546cfcf1000064000197b88f	GB	90	2024-09-16 21:47:39+00:00	1	I informed these reprobates	I informed these reprobates that I WOULDN'T B...	
3	Greg Dunn	/users/62c35cdbacc0ea0012ccaffa	AU	5	2024-09-17 07:15:49+00:00	1	Advertise one price then increase it on website	I have bought from Amazon before and no proble...	
4	Sheila Hannah	/users/5ddb429478d88251550610e	GB	8	2024-09-16 18:37:17+00:00	1	If I could give a lower rate I would	If I could give a lower rate I would! I cancel...	
...	
21209	Anders T	/users/47bd4ffe0000640001001044	DK	1	2009-03-22 13:14:12+00:00	5	Fast!!	I have had perfect order fulfillment, and fast...	
21210	David E	/users/495bbbc0000064000100a972	US	2	2008-12-31 18:57:31+00:00	5	Consistently Excellent	I have had perfect order fulfillment, and fast...	
21211	Joseph Harding	/users/48cfacbf0000640001005d04	GB	3	2008-09-16 13:05:05+00:00	3	Good prices but delivery can take time : (I always find myself going back to amazon beco...	
21212	Mads Dørup	/users/474aaec70000640001000a44	DK	82	2008-04-28 11:09:05+00:00	5	World-class online shopping	I have placed an abundance of orders with Amaz...	
21213	Kim Fuglsang Kramer	/users/46d1ed150000640001000051	DK	2	2007-08-27 17:25:01+00:00	4	No title	those goods i've ordered by Amazon.com, have b...	

21212 rows × 12 columns

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```
1 rev_df['has_negative_title'] = rev_df['review_title'].str.contains("w ointed", case=False, na=False)
2 rev_df['has_positive_title'] = rev_df['review_title'].str.contains("great|excellent|amazing|perfect|love", case=False, na=False)
3 rev_df
```

	reviewer_name	profile_link	country	review_count	review_date	rating	review_title	review_text	date
0	Eugene ath	/users/66e8185ff1598352d6b3701a	US	1	2024-09-16 13:44:26+00:00	1	A Store That Doesn't Want to Sell Anything	I registered on the website, tried to order a ...	
1	Daniel ohalloran	/users/5d75e460200c1f6a6373648c	GB	9	2024-09-16 18:26:46+00:00	1	Had multiple orders one turned up and...	Had multiple orders one turned up and driver h...	
2	p fisher	/users/546cfcf1000064000197b88f	GB	90	2024-09-16 21:47:39+00:00	1	I informed these reprobrates	I informed these reprobrates that I WOULD NOT B...	
3	Greg Dunn	/users/62c35cdbacc0ea0012ccaffa	AU	5	2024-09-17 07:15:49+00:00	1	Advertise one price then increase it on website	I have bought from Amazon before and no proble...	
4	Sheila Hannah	/users/5ddb429478d88251550610e	GB	8	2024-09-16 18:37:17+00:00	1	If I could give a lower rate I would	If I could give a lower rate I would! I cancel...	
...	
21209	Anders T	/users/47bd4ffe0000640001001044	DK	1	2009-03-22 13:14:12+00:00	5	Fast!!	I have had perfect order fulfillment, and fast...	
21210	David E	/users/495bbbc0000064000100a972	US	2	2008-12-31 18:57:31+00:00	5	Consistently Excellent	I have had perfect order fulfillment, and fast...	
21211	Joseph Harding	/users/48cfacbf0000640001005d04	GB	3	2008-09-16 13:05:05+00:00	3	Good prices but delivery can take time : (I always find myself going back to amazon beco...	
21212	Mads Dørup	/users/474aaec70000640001000a44	DK	82	2008-04-28 11:09:05+00:00	5	World-class online shopping	I have placed an abundance of orders with Amaz...	
21213	Kim Fuglsang Kramer	/users/46d1ed150000640001000051	DK	2	2007-08-27 17:25:01+00:00	4	No title	those goods i've ordered by Amazon.com, have b...	

21212 rows × 14 columns

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```
1 # from google.colab import files
2 # rev_df.to_csv('cleaned_ecomm_data.csv', index=False)
3 # files.download('cleaned_ecomm_data.csv')
```

Machine Learning

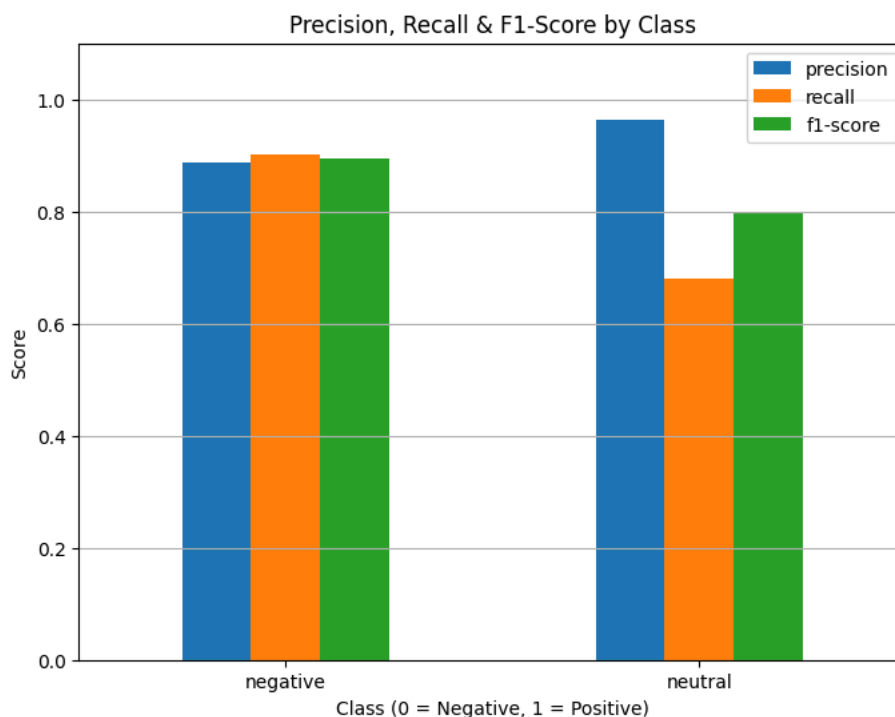
```
1 # Importing required libraries for prediction using machine learning
2
3 from sklearn.linear_model import LogisticRegression
4 from sklearn.feature_extraction.text import TfidfVectorizer
5 from sklearn.model_selection import train_test_split
6 from sklearn.metrics import classification_report, accuracy_score
7 import matplotlib.pyplot as plt
8
9 tf = TfidfVectorizer()
10 x = tf.fit_transform(rev_df['text_features'])
11 y = rev_df['sentiment']
12
13 x_train, x_test, y_train, y_test = train_test_split(x, y, test_size=0.2, random_state=42)
14
```

```

15 model = LogisticRegression()
16 model.fit(x, y)
17 y_pred = model.predict(x_test)
18
19 print(classification_report(y_test, y_pred))
20 report = classification_report(y_test, y_pred, output_dict=True)
21 metrics_df = pd.DataFrame(report).transpose().iloc[:2][['precision', 'recall', 'f1-score']]
22 metrics_df.plot(kind='bar', figsize=(8, 6))
23 plt.title('Precision, Recall & F1-Score by Class')
24 plt.xlabel('Class (0 = Negative, 1 = Positive)')
25 plt.ylabel('Score')
26 plt.ylim(0, 1.1)
27 plt.grid(True, axis='y')
28 plt.xticks(rotation=0)
29 plt.show()

```

	precision	recall	f1-score	support
negative	0.89	0.90	0.89	1692
neutral	0.96	0.68	0.80	465
positive	0.89	0.94	0.91	2086
accuracy			0.89	4243
macro avg	0.91	0.84	0.87	4243
weighted avg	0.90	0.89	0.89	4243



✓ Cross-Validation

Generated code may be subject to a license | NAISt-SE/SOIImages | mrkntrci/Forest_Fire_Susceptibility_ML

```

1 from sklearn.model_selection import cross_val_score, StratifiedKFold, cross_val_predict
2 from sklearn.metrics import classification_report, accuracy_score
3
4 tf = TfidfVectorizer()
5 x = tf.fit_transform(rev_df['text_features'])
6 y = rev_df['sentiment']
7
8 model = LogisticRegression()
9
10 skf = StratifiedKFold(n_splits=5, shuffle=True, random_state=42)
11 cv_scores = cross_val_score(model, x, y, cv=skf, scoring='accuracy')
12
13 print(f'Cross-Validation Scores : {cv_scores[0]}')
14
15 y_pred_cv = cross_val_predict(model, x, y, cv=skf)
16 print(f'Classification Report : {classification_report(y, y_pred_cv)}')
17 print(f'Accuracy Score : {accuracy_score(y, y_pred_cv):.2f}')
18
19 report = classification_report(y, y_pred_cv, output_dict=True)
20 metrics_df = pd.DataFrame(report).transpose().iloc[:2][['precision', 'recall', 'f1-score']]
21
22 # Plot metrics

```

```

23 metrics_df.plot(kind='bar', figsize=(8, 6))
24 plt.title('Precision, Recall & F1-Score by Class (Cross-Validated)')
25 plt.xlabel('Class (0 = Negative, 1 = Positive)')
26 plt.ylabel('Score')
27 plt.ylim(0, 1.1)
28 plt.grid(True, axis='y')
29 plt.xticks(rotation=0)
30 plt.tight_layout()
31 plt.show()
32

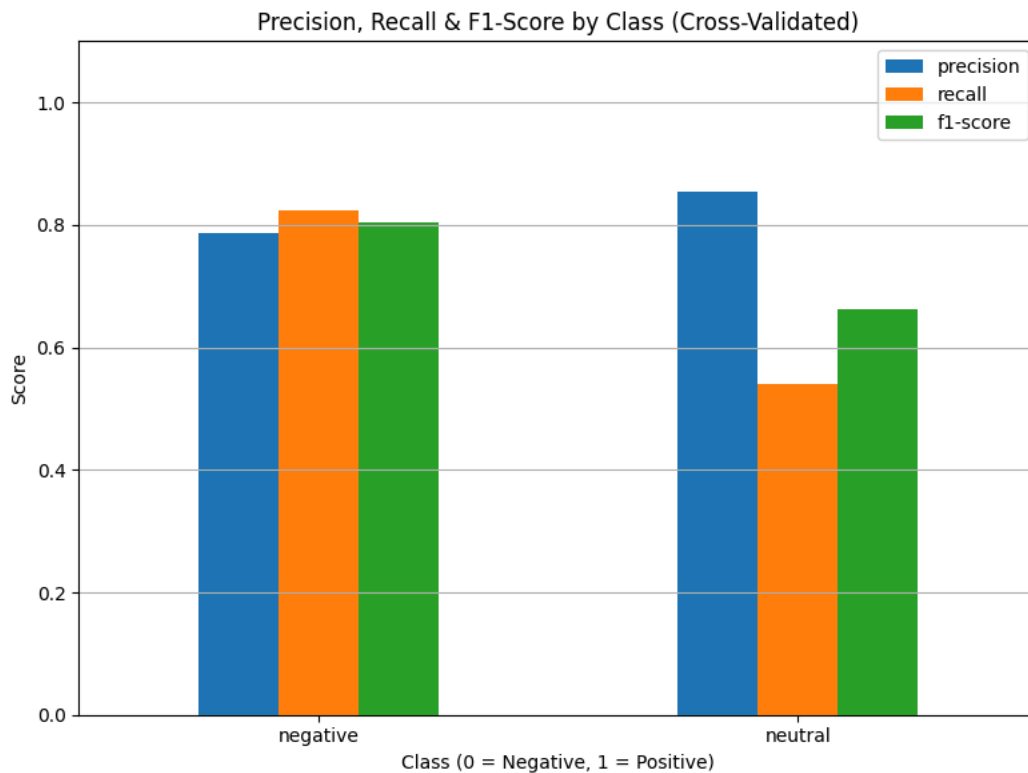
```

↗ Cross-Validation Scores : 0.8197030403016733

Mean Accuracy : 0.81

Classification Report :		precision	recall	f1-score	support
negative	0.79 0.82	0.80	8340		
neutral	0.85 0.54	0.66	2251		
positive	0.83 0.86	0.85	10621		
accuracy		0.81	21212		
macro avg	0.82 0.74	0.77	21212		
weighted avg	0.81 0.81	0.81	21212		

Accuracy Score : 0.81



✓ NLP

```

1 from textblob import TextBlob
2 import nltk
3 nltk.download('punkt_tab')
4
5 aspects = ['price', 'delivery', 'quality']
6 def aspect_sentiment(text):
7     blob = TextBlob(text)
8     aspect_sentiments = {}
9     for aspect in aspects:
10         for sentence in blob.sentences:
11             if aspect in sentence.lower():
12                 aspect_sentiments[aspect] = sentence.sentiment.polarity
13     return aspect_sentiments
14
15 rev_df['Aspect_Sentiment'] = rev_df['text_features'].apply(aspect_sentiment)
16 print(rev_df[['text_features', 'Aspect_Sentiment']].head())

```

↗ [nltk_data] Downloading package punkt_tab to /root/nltk_data...

[nltk_data] Unzipping tokenizers/punkt_tab.zip.

	text_features	Aspect_Sentiment
0	I registered on the website, tried to order a ...	{}
1	Had multiple orders one turned up and driver h...	{'delivery': 0.0}