

```
# @title import required libraries
```

```
import pandas as pd
import numpy as np
import seaborn as sns
import matplotlib.pyplot as plt
```

```
from textblob import TextBlob
import nltk
nltk.download('vader_lexicon')
from nltk.sentiment import SentimentIntensityAnalyzer
```

```
[nltk_data] Downloading package vader_lexicon to /root/nltk_data...
```

```
# @title Load the Dataset
```

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

```
df = pd.read_csv("/content/student_feedback_dataset.csv")
df.head()
```

```
<IPython.core.display.HTML object>
```

```
Saving student_feedback_dataset.csv to student_feedback_dataset
(1).csv
```

```
{"summary":{"\n  \"name\": \"df\",\n  \"rows\": 1223,\n  \"fields\": [\n    {\n      \"column\": \"student_id\",\n      \"properties\": {\n        \"dtype\": \"string\",\n        \"num_unique_values\": 1223,\n        \"samples\": [\n          \"STU0662\",\n          \"STU0221\",\n          \"STU0156\"\n        ],\n        \"semantic_type\": \"\",\n        \"description\": \"\"\n      },\n      \"column\": \"department\",\n      \"properties\": {\n        \"dtype\": \"category\",\n        \"num_unique_values\": 7,\n        \"samples\": [\n          \"CIVIL\",\n          \"BIO\",\n          \"MBA\"\n        ],\n        \"semantic_type\": \"\",\n        \"description\": \"\"\n      },\n      \"column\": \"subject_name\",\n      \"properties\": {\n        \"dtype\": \"category\",\n        \"num_unique_values\": 15,\n        \"samples\": [\n          \"Poetry\",\n          \"Marketing\",\n          \"Concrete Tech\"\n        ],\n        \"semantic_type\": \"\",\n        \"description\": \"\"\n      },\n      \"column\": \"feedback_text\",\n      \"properties\": {\n        \"dtype\": \"string\",\n        \"num_unique_values\": 1223,\n        \"samples\": [\n          \"The generation send music natural in pull drive fine.\",\n          \"Perhaps model detail himself indicate idea they.\",\n          \"Field project seek however huge during.\",\n          \"\n        ],\n        \"semantic_type\": \"\",\n        \"description\": \"\"\n      },\n      \"column\": \"preprocessed_text\",\n      \"properties\": {\n        \"dtype\": \"string\",\n        \"num_unique_values\": 1223,\n        \"samples\": [\n          \"the
```

```

generation send music natural in pull drive fine",\n
\"perhaps model detail himself indicate idea they",\n
\"field project seek however huge during\"",\n
\"semantic_type\": \"\", \n      \"description\": \"\" \n      }\n
n      }, \n      {\n      \"column\": \"sentiment_label\", \n
\"properties\": {\n      \"dtype\": \"category\", \n
\"num_unique_values\": 3, \n      \"samples\": [\n
\"negative\", \n      \"positive\", \n      \"neutral\" \n
], \n      \"semantic_type\": \"\", \n      \"description\": \"\" \n
}\n      }, \n      {\n      \"column\": \"sarcasm_flag\", \n
\"properties\": {\n      \"dtype\": \"number\", \n      \"std\":\n
0, \n      \"min\": 0, \n      \"max\": 1, \n
\"num_unique_values\": 2, \n      \"samples\": [\n      1, \n
0 \n      ], \n      \"semantic_type\": \"\", \n
\"description\": \"\" \n      }\n      }, \n      {\n      \"column\":\n
\"emotion_tag\", \n      \"properties\": {\n      \"dtype\":\n
\"category\", \n      \"num_unique_values\": 6, \n      \"samples\":\n
[\n      \"anger\", \n      \"sadness\" \n      ], \n
\"semantic_type\": \"\", \n      \"description\": \"\" \n      }\n
n      }, \n      {\n      \"column\": \"feedback_type\", \n
\"properties\": {\n      \"dtype\": \"category\", \n
\"num_unique_values\": 3, \n      \"samples\": [\n
\"Infrastructure\", \n      \"Academic\" \n      ], \n
\"semantic_type\": \"\", \n      \"description\": \"\" \n      }\n
n      }, \n      {\n      \"column\": \"subject_specific_context\", \n
\"properties\": {\n      \"dtype\": \"category\", \n
\"num_unique_values\": 3, \n      \"samples\": [\n
\"Project-Based\", \n      \"Lab-Intensive\" \n      ], \n
\"semantic_type\": \"\", \n      \"description\": \"\" \n      }\n
n      }, \n      {\n      \"column\": \"response_required\", \n
\"properties\": {\n      \"dtype\": \"number\", \n      \"std\":\n
0, \n      \"min\": 0, \n      \"max\": 1, \n
\"num_unique_values\": 2, \n      \"samples\": [\n      0, \n
1 \n      ], \n      \"semantic_type\": \"\", \n
\"description\": \"\" \n      }\n      }\n      ]\n
n} \", \"type\": \"dataframe\", \"variable_name\": \"df\"}

```

```
# @title Basic dataset info
```

```
print("Shape:", df.shape)
```

```
df.info()
```

```
df.describe(include='all')
```

```
Shape: (1223, 11)
```

```
<class 'pandas.core.frame.DataFrame'>
```

```
RangeIndex: 1223 entries, 0 to 1222
```

```
Data columns (total 11 columns):
```

#	Column	Non-Null Count	Dtype
0	student_id	1223 non-null	object
1	department	1223 non-null	object

2	subject_name	1223	non-null	object
3	feedback_text	1223	non-null	object
4	preprocessed_text	1223	non-null	object
5	sentiment_label	1223	non-null	object
6	sarcasm_flag	1223	non-null	int64
7	emotion_tag	1223	non-null	object
8	feedback_type	1223	non-null	object
9	subject_specific_context	1223	non-null	object
10	response_required	1223	non-null	int64

dtypes: int64(2), object(9)

memory usage: 105.2+ KB

```
{
  "summary": {
    "\n  \"name\": \"df\",
    "\n  \"rows\": 11,
    "\n  \"fields\": [
      {
        "\n    \"column\": \"student_id\",
        "\n    \"properties\": {
          "\n      \"dtype\": \"category\",
          "\n      \"num_unique_values\": 3,
          "\n      \"samples\": [
        "\n          \"1223\",
        "\n          \"STU1223\",
        "\n          \"1\",
        "\n      ],
        "\n      \"semantic_type\": \"\",
        "\n      \"description\": \"\",
        "\n      \"department\": \"\",
        "\n      \"properties\": {
        "\n          \"dtype\": \"category\",
        "\n          \"num_unique_values\": 4,
        "\n          \"samples\": [
        "\n              7,
        "\n              \"187\",
        "\n              \"1223\",
        "\n          ],
        "\n          \"semantic_type\": \"\",
        "\n          \"description\": \"\",
        "\n      },
        "\n      {
        "\n          \"column\": \"subject_name\",
        "\n          \"properties\": {
        "\n              \"dtype\": \"category\",
        "\n              \"num_unique_values\": 4,
        "\n              \"samples\": [
        "\n                  15,
        "\n                  \"101\",
        "\n                  \"1223\",
        "\n              ],
        "\n              \"semantic_type\": \"\",
        "\n              \"description\": \"\",
        "\n          },
        "\n      {
        "\n          \"column\": \"feedback_text\",
        "\n          \"properties\": {
        "\n              \"dtype\": \"category\",
        "\n              \"num_unique_values\": 3,
        "\n              \"samples\": [
        "\n                  \"1223\",
        "\n                  \"Oil several consider two national you with receive surface.\",
        "\n                  \"1\",
        "\n              ],
        "\n              \"semantic_type\": \"\",
        "\n              \"description\": \"\",
        "\n          },
        "\n      {
        "\n          \"column\": \"preprocessed_text\",
        "\n          \"properties\": {
        "\n              \"dtype\": \"category\",
        "\n              \"num_unique_values\": 3,
        "\n              \"samples\": [
        "\n                  \"1223\",
        "\n                  \"oil several consider two national you with receive surface\",
        "\n                  \"1\",
        "\n              ],
        "\n              \"semantic_type\": \"\",
        "\n              \"description\": \"\",
        "\n          },
        "\n      {
        "\n          \"column\": \"sentiment_label\",
        "\n          \"properties\": {
        "\n              \"dtype\": \"category\",
        "\n              \"num_unique_values\": 4,
        "\n              \"samples\": [
        "\n                  3,
        "\n                  \"489\",
        "\n                  \"1223\",
        "\n              ],
        "\n              \"semantic_type\": \"\",
        "\n              \"description\": \"\",
        "\n          },
        "\n      {
        "\n          \"column\": \"sarcasm_flag\",
        "\n          \"properties\": {
        "\n              \"dtype\": \"number\",
        "\n              \"std\": 432.32143439959196,
        "\n              \"min\": 0.0,
        "\n              \"max\": 1223.0,
        "\n              \"num_unique_values\": 5,
        "\n              \"samples\": [
        "\n                  0.13409648405560098,
        "\n                  1.0,
        "\n                  0.34089534635190644,
        "\n              ],
        "\n              \"semantic_type\": \"\",
        "\n              \"description\": \"\",
        "\n          },
        "\n      {
        "\n          \"column\": \"emotion_tag\",

```

```

{"properties": {"dtype": "category",\n
"num_unique_values": 4,\n
"samples": [\n
6,\n
"209",\n
"1223",\n
],\n
"semantic_type":\n
""},\n
"description": ""},\n
{"column": "feedback_type",\n
"properties": {\n
"dtype": "category",\n
"num_unique_values": 4,\n
"samples": [\n
3,\n
"431",\n
"1223",\n
],\n
"semantic_type": "",\n
"description": ""},\n
{"column": "subject_specific_context",\n
"properties": {\n
"dtype": "category",\n
"num_unique_values": 4,\n
"samples": [\n
3,\n
"425",\n
"1223",\n
],\n
"semantic_type":\n
""},\n
"description": ""},\n
{"column": "response_required",\n
"properties": {\n
"dtype": "number",\n
"std": 432.1868872895946,\n
"min": 0.0,\n
"max": 1223.0,\n
"num_unique_values": 5,\n
"samples": [\n
0.669664758789861,\n
1.0,\n
0.47052619024308223,\n
],\n
"semantic_type": "",\n
"description": ""},\n
}]\n
},\n
"type": "dataframe"}

```

```
# @title Data cleaning
```

```
df = df.drop_duplicates()
```

```
df = df.dropna(how='all')
```

```
if 'feedback' in df.columns:
```

```
    df['feedback'] = df['feedback'].fillna("")
```

```
else:
```

```
    print("△ Column named 'feedback' not found. Check CSV column\nnames.")
```

```
△ Column named 'feedback' not found. Check CSV column names.
```

```
df.columns = df.columns.str.strip()
```

```
df = df.apply(lambda x: x.astype(str).str.strip() if x.dtype ==\n"object" else x)
```

```
df.head()
```

```

{"summary": {"name": "df",\n
rows": 1223,\n
fields":\n
[\n
{\n
column": "student_id",\n
properties": {\n
"dtype": "string",\n
"num_unique_values": 1223,\n
"samples": [\n
"STU0662",\n
"STU0221",\n
"STU0156",\n
],\n
"semantic_type": "",\n
"description": ""},\n
{\n
column":\n
"department",\n
properties": {\n
"dtype":\n
"category",\n
"num_unique_values": 7,\n
"samples":\n
[\n
"CIVIL",\n
"BI0",\n
"MBA",\n
],\n
"semantic_type": "",\n
"description": ""},\n
}]\n
}

```

```

}\n    },\n    {\n        \"column\": \"subject_name\",\n        \"properties\": {\n            \"dtype\": \"category\",\n            \"num_unique_values\": 15,\n            \"samples\": [\n                \"Poetry\",\n                \"Marketing\",\n                \"Concrete Tech\"\n            ],\n            \"semantic_type\": \"\",\n            \"description\": \"\"\n        }\n    },\n    {\n        \"column\": \"feedback_text\",\n        \"properties\": {\n            \"dtype\": \"string\",\n            \"num_unique_values\": 1223,\n            \"samples\": [\n                \"The generation send music natural in pull drive fine.\",\n                \"Perhaps model detail himself indicate idea they.\",\n                \"Field project seek however huge during.\"\n            ],\n            \"semantic_type\": \"\",\n            \"description\": \"\"\n        }\n    },\n    {\n        \"column\": \"preprocessed_text\",\n        \"properties\": {\n            \"dtype\": \"string\",\n            \"num_unique_values\": 1223,\n            \"samples\": [\n                \"the generation send music natural in pull drive fine\",\n                \"perhaps model detail himself indicate idea they\",\n                \"field project seek however huge during\"\n            ],\n            \"semantic_type\": \"\",\n            \"description\": \"\"\n        }\n    },\n    {\n        \"column\": \"sentiment_label\",\n        \"properties\": {\n            \"dtype\": \"category\",\n            \"num_unique_values\": 3,\n            \"samples\": [\n                \"negative\",\n                \"positive\",\n                \"neutral\"\n            ],\n            \"semantic_type\": \"\",\n            \"description\": \"\"\n        }\n    },\n    {\n        \"column\": \"sarcasm_flag\",\n        \"properties\": {\n            \"dtype\": \"number\",\n            \"std\": 0,\n            \"min\": 0,\n            \"max\": 1,\n            \"num_unique_values\": 2,\n            \"samples\": [\n                1,\n                0\n            ],\n            \"semantic_type\": \"\",\n            \"description\": \"\"\n        }\n    },\n    {\n        \"column\": \"emotion_tag\",\n        \"properties\": {\n            \"dtype\": \"category\",\n            \"num_unique_values\": 6,\n            \"samples\": [\n                \"anger\",\n                \"sadness\"\n            ],\n            \"semantic_type\": \"\",\n            \"description\": \"\"\n        }\n    },\n    {\n        \"column\": \"feedback_type\",\n        \"properties\": {\n            \"dtype\": \"category\",\n            \"num_unique_values\": 3,\n            \"samples\": [\n                \"Infrastructure\",\n                \"Academic\"\n            ],\n            \"semantic_type\": \"\",\n            \"description\": \"\"\n        }\n    },\n    {\n        \"column\": \"subject_specific_context\",\n        \"properties\": {\n            \"dtype\": \"category\",\n            \"num_unique_values\": 3,\n            \"samples\": [\n                \"Project-Based\",\n                \"Lab-Intensive\"\n            ],\n            \"semantic_type\": \"\",\n            \"description\": \"\"\n        }\n    },\n    {\n        \"column\": \"response_required\",\n        \"properties\": {\n            \"dtype\": \"number\",\n            \"std\": 0,\n            \"min\": 0,\n            \"max\": 1,\n            \"num_unique_values\": 2,\n            \"samples\": [\n                0,\n                1\n            ],\n            \"semantic_type\": \"\",

```

```

\ "description\ ": \ "\n      }\n      }\n  ]\n  }", "type": "dataframe", "variable_name": "df"}

# @title Sentiment Analysis(TextBlob)
def get_textblob_sentiment(text):
    return TextBlob(text).sentiment.polarity

df["textblob_score"] =
df["feedback_text"].apply(get_textblob_sentiment)

def sentiment_label(score):
    if score > 0.1:
        return "Positive"
    elif score < -0.1:
        return "Negative"
    else:
        return "Neutral"

df["textblob_sentiment"] = df["textblob_score"].apply(sentiment_label)

# @title VADER Sentiment Analysis
sia = SentimentIntensityAnalyzer()

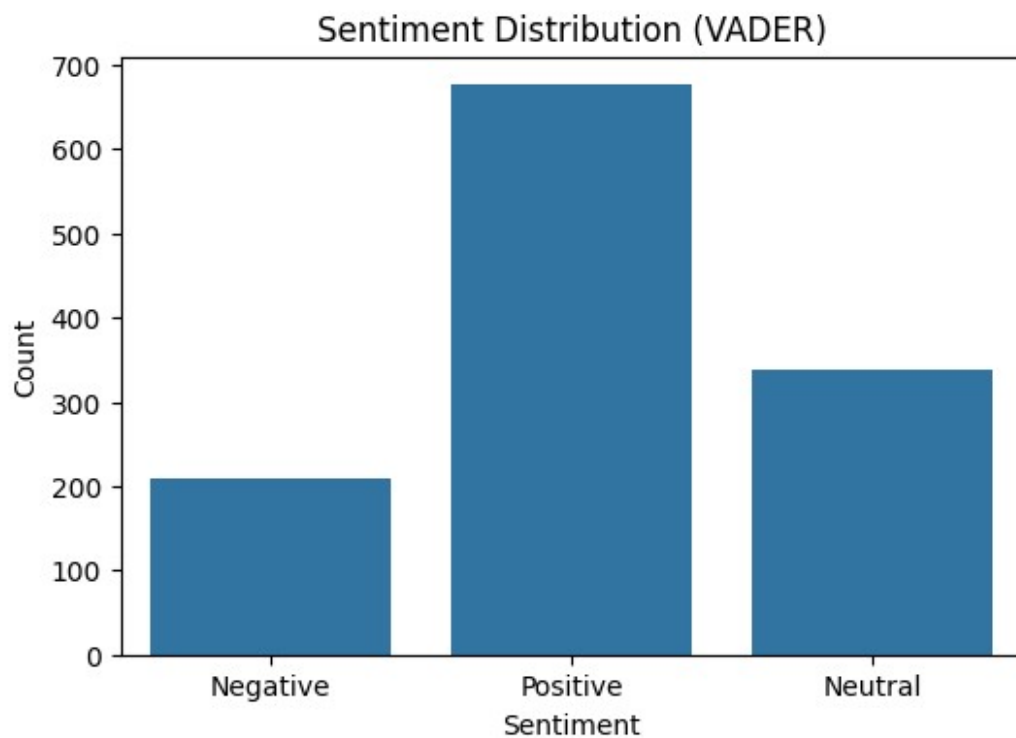
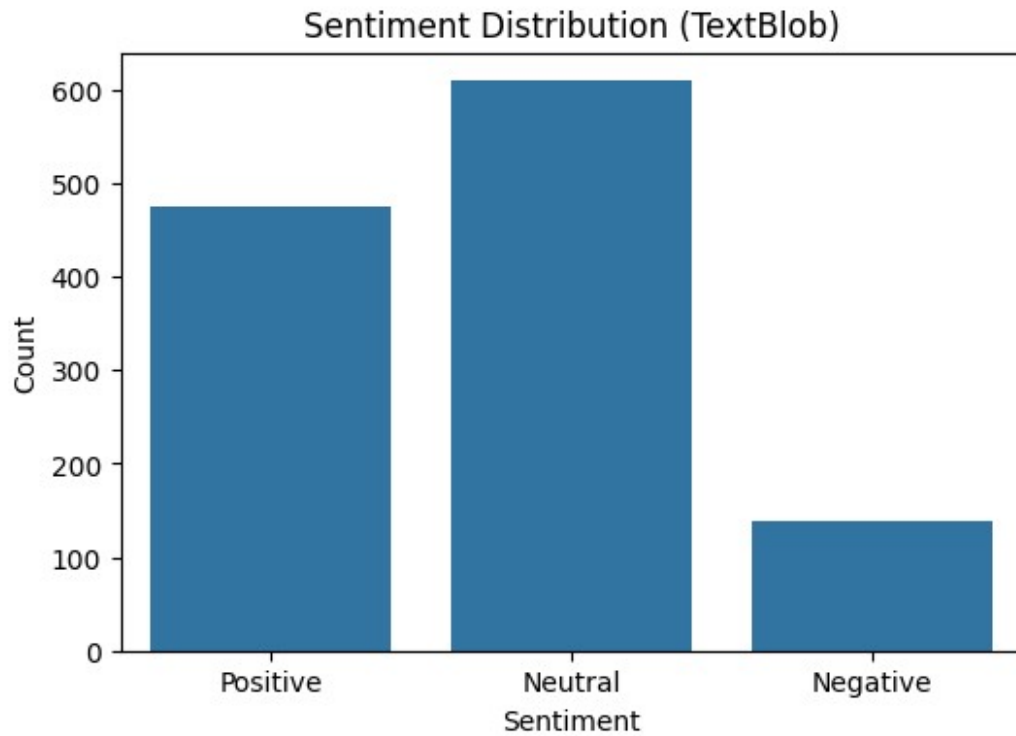
def vader_label(text):
    score = sia.polarity_scores(text)["compound"]
    if score > 0.05:
        return "Positive"
    elif score < -0.05:
        return "Negative"
    else:
        return "Neutral"

df["vader_sentiment"] = df["feedback_text"].apply(vader_label)

# @title Visualization of sentiment Result
plt.figure(figsize=(6,4))
sns.countplot(x=df["textblob_sentiment"])
plt.title("Sentiment Distribution (TextBlob)")
plt.xlabel("Sentiment")
plt.ylabel("Count")
plt.show()

plt.figure(figsize=(6,4))
sns.countplot(x=df["vader_sentiment"])
plt.title("Sentiment Distribution (VADER)")
plt.xlabel("Sentiment")
plt.ylabel("Count")
plt.show()

```



```
# @title WordCloud
!pip install wordcloud
from wordcloud import WordCloud
```

```
all_text = " ".join(df["feedback_text"].tolist())
```

```
wordcloud = WordCloud(width=800, height=400,  
background_color="white").generate(all_text)
```

```
plt.figure(figsize=(12,6))  
plt.imshow(wordcloud, interpolation='bilinear')  
plt.axis("off")  
plt.title("Most Common Words in Feedback")  
plt.show()
```

```
Requirement already satisfied: wordcloud in  
/usr/local/lib/python3.12/dist-packages (1.9.4)  
Requirement already satisfied: numpy>=1.6.1 in  
/usr/local/lib/python3.12/dist-packages (from wordcloud) (2.0.2)  
Requirement already satisfied: pillow in  
/usr/local/lib/python3.12/dist-packages (from wordcloud) (11.3.0)  
Requirement already satisfied: matplotlib in  
/usr/local/lib/python3.12/dist-packages (from wordcloud) (3.10.0)  
Requirement already satisfied: contourpy>=1.0.1 in  
/usr/local/lib/python3.12/dist-packages (from matplotlib->wordcloud)  
(1.3.3)  
Requirement already satisfied: cycler>=0.10 in  
/usr/local/lib/python3.12/dist-packages (from matplotlib->wordcloud)  
(0.12.1)  
Requirement already satisfied: fonttools>=4.22.0 in  
/usr/local/lib/python3.12/dist-packages (from matplotlib->wordcloud)  
(4.61.0)  
Requirement already satisfied: kiwisolver>=1.3.1 in  
/usr/local/lib/python3.12/dist-packages (from matplotlib->wordcloud)  
(1.4.9)  
Requirement already satisfied: packaging>=20.0 in  
/usr/local/lib/python3.12/dist-packages (from matplotlib->wordcloud)  
(25.0)  
Requirement already satisfied: pyparsing>=2.3.1 in  
/usr/local/lib/python3.12/dist-packages (from matplotlib->wordcloud)  
(3.2.5)  
Requirement already satisfied: python-dateutil>=2.7 in  
/usr/local/lib/python3.12/dist-packages (from matplotlib->wordcloud)  
(2.9.0.post0)  
Requirement already satisfied: six>=1.5 in  
/usr/local/lib/python3.12/dist-packages (from python-dateutil>=2.7-  
>matplotlib->wordcloud) (1.17.0)
```


[illegible]

File saved as: event_feedback_with_sentiment.csv