



Student Course Feedback Analysis Project

(Python | Pandas | Visualization | Rating-based Sentiment)

```
In [ ]: # 1. Project Overview

# This project analyzes student course feedback collected via Google Forms.
# The goal is to:

# Clean and prepare feedback data

# Analyze satisfaction using rating patterns

# Convert ratings into sentiment categories

# Visualize trends

# Provide actionable recommendations
```

```
In [1]: # 2. Import Required Libraries
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
```

```
In [2]: # 3. Load Dataset
# Upload CSV in Colab first, then run this
df = pd.read_csv("student_feedback.csv")

df.head()
```

Out[2]:

	Unnamed: 0	Student ID	Well versed with the subject	Explains concepts in an understandable way	Use of presentations	Degree of difficulty of assignments	w
0	0	340	5	2	7	6	
1	1	253	6	5	8	6	
2	2	680	7	7	6	5	
3	3	806	9	6	7	1	
4	4	632	8	10	8	4	

```
In [3]: # 4. Dataset Information
df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 1001 entries, 0 to 1000
Data columns (total 10 columns):
#   Column                                                                 Non-Null Count  Dtype
---  -
0   Unnamed: 0                                                            1001 non-null   int64
1   Student ID                                                            1001 non-null   int64
2   Well versed with the subject                                         1001 non-null   int64
3   Explains concepts in an understandable way                         1001 non-null   int64
4   Use of presentations                                                 1001 non-null   int64
5   Degree of difficulty of assignments                                  1001 non-null   int64
6   Solves doubts willingly                                              1001 non-null   int64
7   Structuring of the course                                             1001 non-null   int64
8   Provides support for students going above and beyond               1001 non-null   int64
9   Course recommendation based on relevance                           1001 non-null   int64
dtypes: int64(10)
memory usage: 78.3 KB
```

```
In [4]: # 5. Data Cleaning
# Drop unwanted index column
df.drop(columns=["Unnamed: 0"], inplace=True)
```

```
# Check for missing values
df.isnull().sum()
```

Out[4]: 0

Student ID	0
Well versed with the subject	0
Explains concepts in an understandable way	0
Use of presentations	0
Degree of difficulty of assignments	0
Solves doubts willingly	0
Structuring of the course	0
Provides support for students going above and beyond	0
Course recommendation based on relevance	0

dtype: int64

```
In [6]: # 6. Rename Columns
df.columns = [
    "Student_ID",
    "Subject_Knowledge",
    "Concept_Clarity",
    "Use_of_Presentations",
    "Assignment_Difficulty",
    "Doubt_Solving",
    "Course_Structure",
    "Extra_Student_Support",
    "Course_Relevance"
]

df.head()
```

Out[6]:

	Student_ID	Subject_Knowledge	Concept_Clarity	Use_of_Presentations	Assig
0	340	5	2	7	
1	253	6	5	8	
2	680	7	7	6	
3	806	9	6	7	
4	632	8	10	8	

```
In [7]: # 7. Descriptive Statistics
df.describe()
```

Out[7]:

	Student_ID	Subject_Knowledge	Concept_Clarity	Use_of_Presentations
count	1001.000000	1001.000000	1001.000000	1001.000000
mean	500.000000	7.497502	6.081918	5.942058
std	289.108111	1.692998	2.597168	1.415853
min	0.000000	5.000000	2.000000	4.000000
25%	250.000000	6.000000	4.000000	5.000000
50%	500.000000	8.000000	6.000000	6.000000
75%	750.000000	9.000000	8.000000	7.000000
max	1000.000000	10.000000	10.000000	8.000000

In [8]:

```
# 8. Average Rating per Student
rating_cols = df.columns[1:]

df["Average_Rating"] = df[rating_cols].mean(axis=1)

df.head()
```

Out[8]:

	Student_ID	Subject_Knowledge	Concept_Clarity	Use_of_Presentations	Assig
0	340	5	2	7	
1	253	6	5	8	
2	680	7	7	6	
3	806	9	6	7	
4	632	8	10	8	

In [9]:

```
# 9. Convert Rating → Sentiment
def rating_to_sentiment(score):
    if score >= 7:
        return "Positive"
    elif score >= 4:
        return "Neutral"
    else:
        return "Negative"

df["Sentiment"] = df["Average_Rating"].apply(rating_to_sentiment)

df.head()
```

```
Out[9]:
```

	Student_ID	Subject_Knowledge	Concept_Clarity	Use_of_Presentations	Assig
0	340	5	2	7	
1	253	6	5	8	
2	680	7	7	6	
3	806	9	6	7	
4	632	8	10	8	

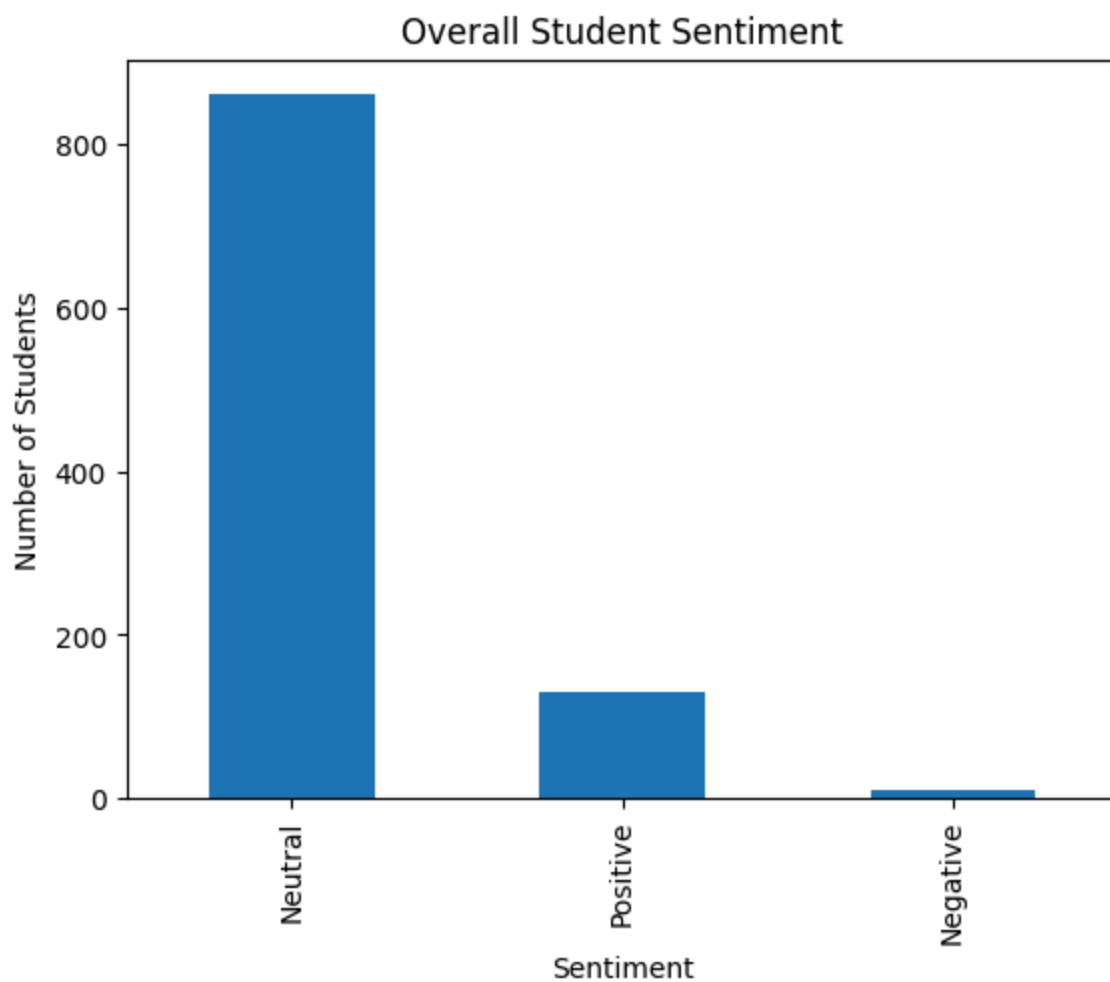
```
In [10]: # 10. Sentiment Distribution
df["Sentiment"].value_counts()
```

```
Out[10]:
```

	count
Sentiment	
Neutral	860
Positive	131
Negative	10

dtype: int64

```
In [11]: # 11. Visualization – Sentiment Analysis
df["Sentiment"].value_counts().plot(kind="bar")
plt.title("Overall Student Sentiment")
plt.xlabel("Sentiment")
plt.ylabel("Number of Students")
plt.show()
```



```
In [12]: # 12. Average Rating per Question
avg_scores = df[rating_cols].mean().sort_values()

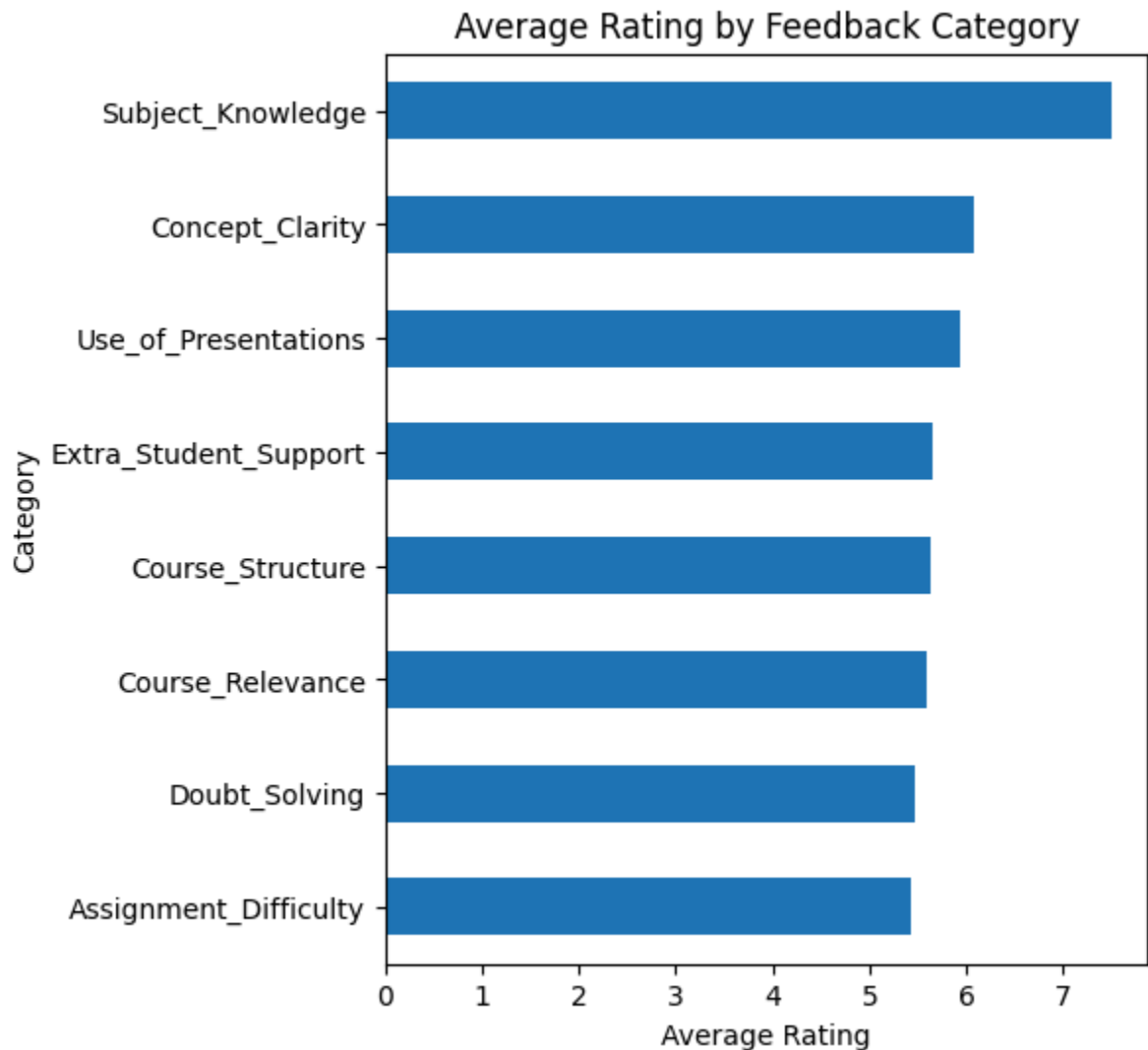
avg_scores
```

Out[12]:

0	
Assignment_Difficulty	5.430569
Doubt_Solving	5.474525
Course_Relevance	5.598402
Course_Structure	5.636364
Extra_Student_Support	5.662338
Use_of_Presentations	5.942058
Concept_Clarity	6.081918
Subject_Knowledge	7.497502

dtype: float64

```
In [15]: # 13. Visualization – Question Wise Ratings
plt.figure(figsize=(5,6))
avg_scores.plot(kind="barh")
plt.title("Average Rating by Feedback Category")
plt.xlabel("Average Rating")
plt.ylabel("Category")
plt.show()
```



```
In [17]: # 14. Key Insights
lowest Rated = avg_scores.head(3)
highest Rated = avg_scores.tail(3)

lowest Rated, highest Rated
```

```
Out[17]: (Assignment_Difficulty    5.430569
         Doubt_Solving            5.474525
         Course_Relevance         5.598402
         dtype: float64,
         Use_of_Presentations     5.942058
         Concept_Clarity          6.081918
         Subject_Knowledge        7.497502
         dtype: float64)
```

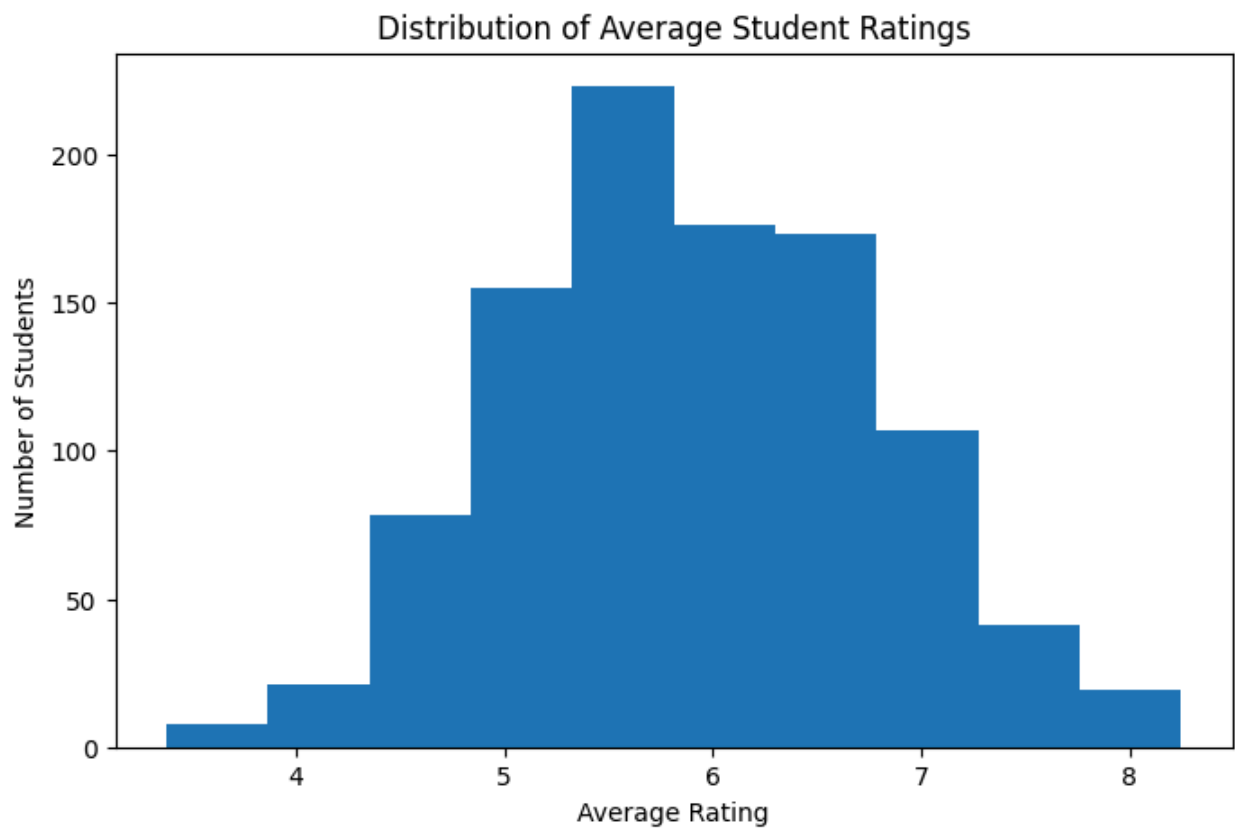
```
In [18]: # 15. Business Recommendations
recommendations = {
    "Assignment_Difficulty": "Simplify or better explain assignments",
    "Use_of_Presentations": "Increase use of visual learning materials",
    "Course_Structure": "Improve course flow and planning"
}

recommendations
```

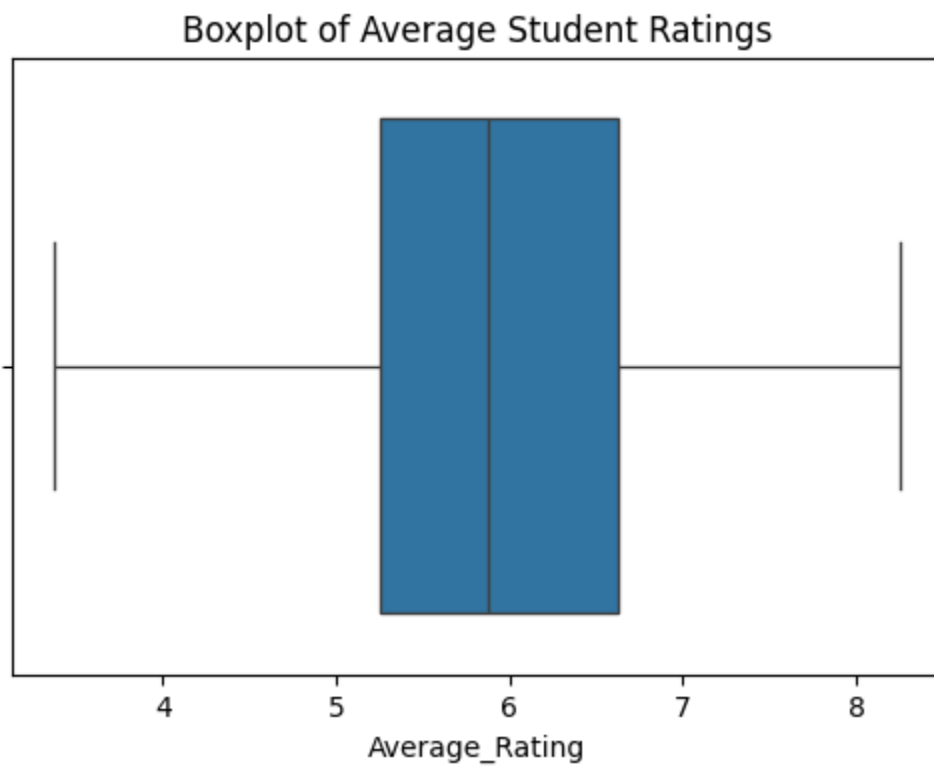
```
Out[18]: {'Assignment_Difficulty': 'Simplify or better explain assignments',
         'Use_of_Presentations': 'Increase use of visual learning materials',
         'Course_Structure': 'Improve course flow and planning'}
```

```
In [20]: import matplotlib.pyplot as plt
import seaborn as sns
```

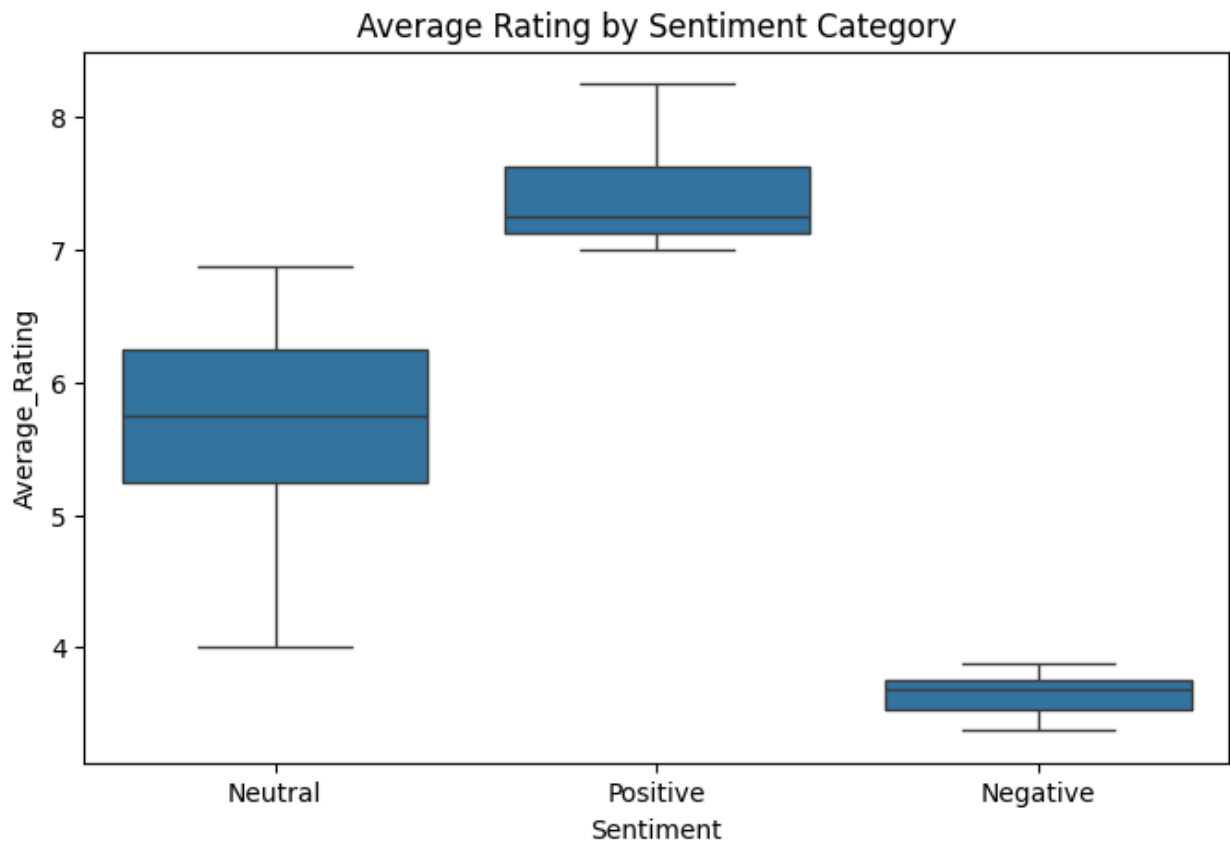
```
In [21]: plt.figure(figsize=(8,5))
plt.hist(df["Average_Rating"], bins=10)
plt.title("Distribution of Average Student Ratings")
plt.xlabel("Average Rating")
plt.ylabel("Number of Students")
plt.show()
```

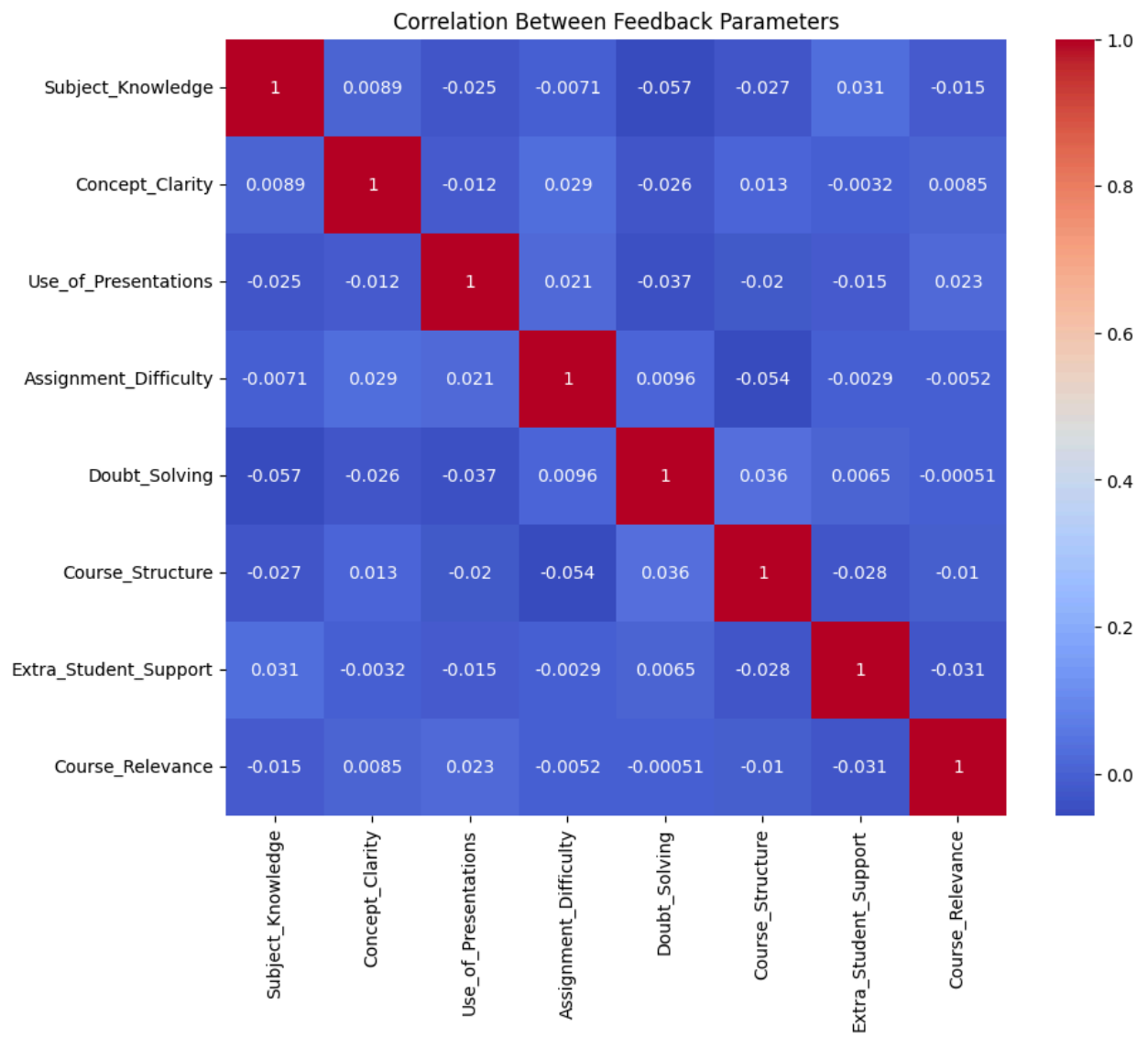
```
In [22]: plt.figure(figsize=(6,4))  
sns.boxplot(x=df["Average_Rating"])  
plt.title("Boxplot of Average Student Ratings")  
plt.show()
```



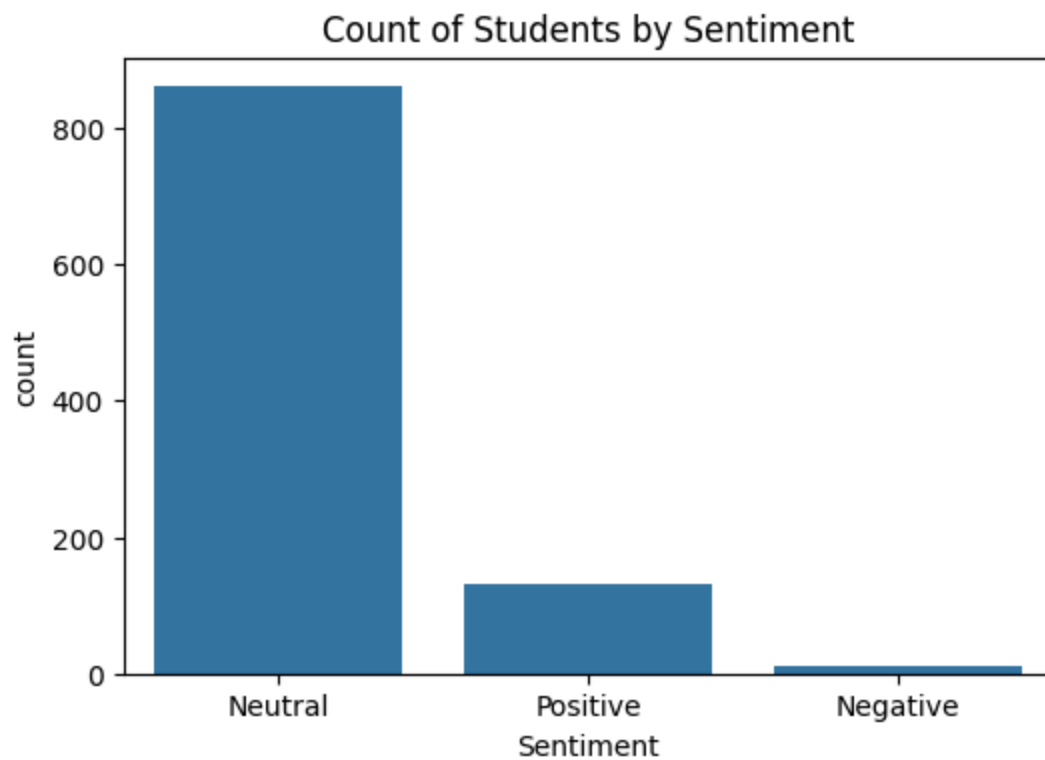
```
In [23]: plt.figure(figsize=(8,5))
sns.boxplot(x="Sentiment", y="Average_Rating", data=df)
plt.title("Average Rating by Sentiment Category")
plt.show()
```



```
In [24]: plt.figure(figsize=(10,8))
sns.heatmap(df[rating_cols].corr(), annot=True, cmap="coolwarm")
plt.title("Correlation Between Feedback Parameters")
plt.show()
```

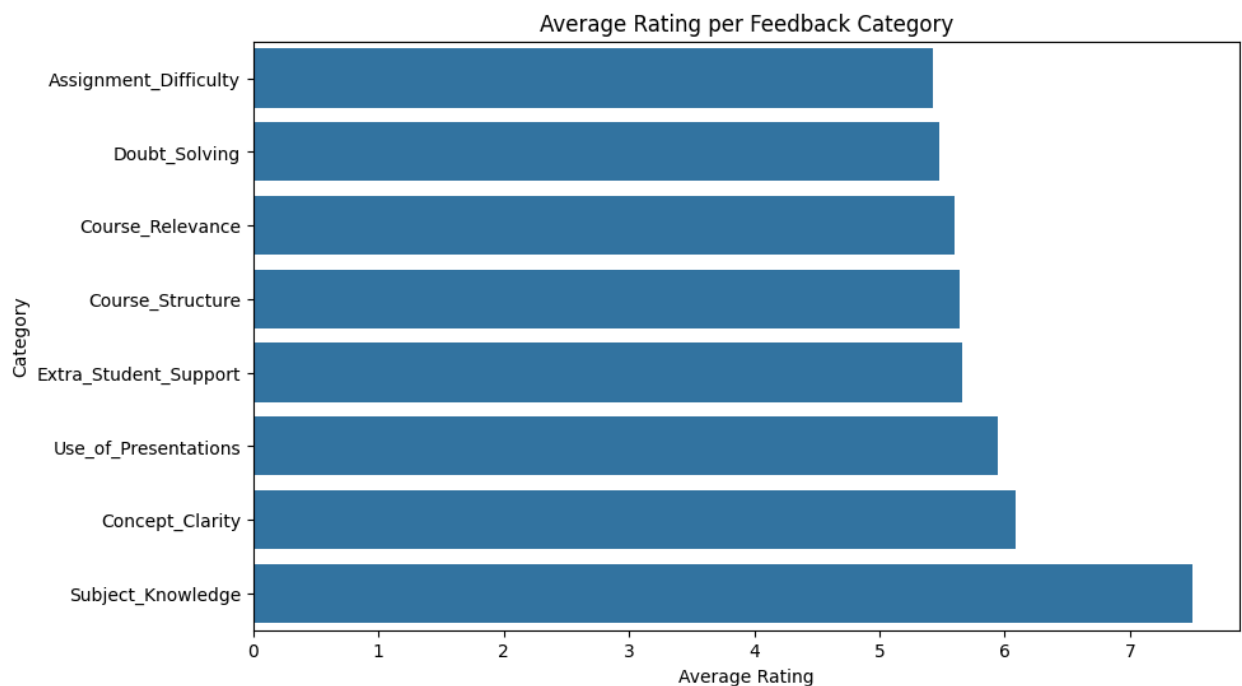


```
In [25]: plt.figure(figsize=(6,4))
sns.countplot(x="Sentiment", data=df)
plt.title("Count of Students by Sentiment")
plt.show()
```

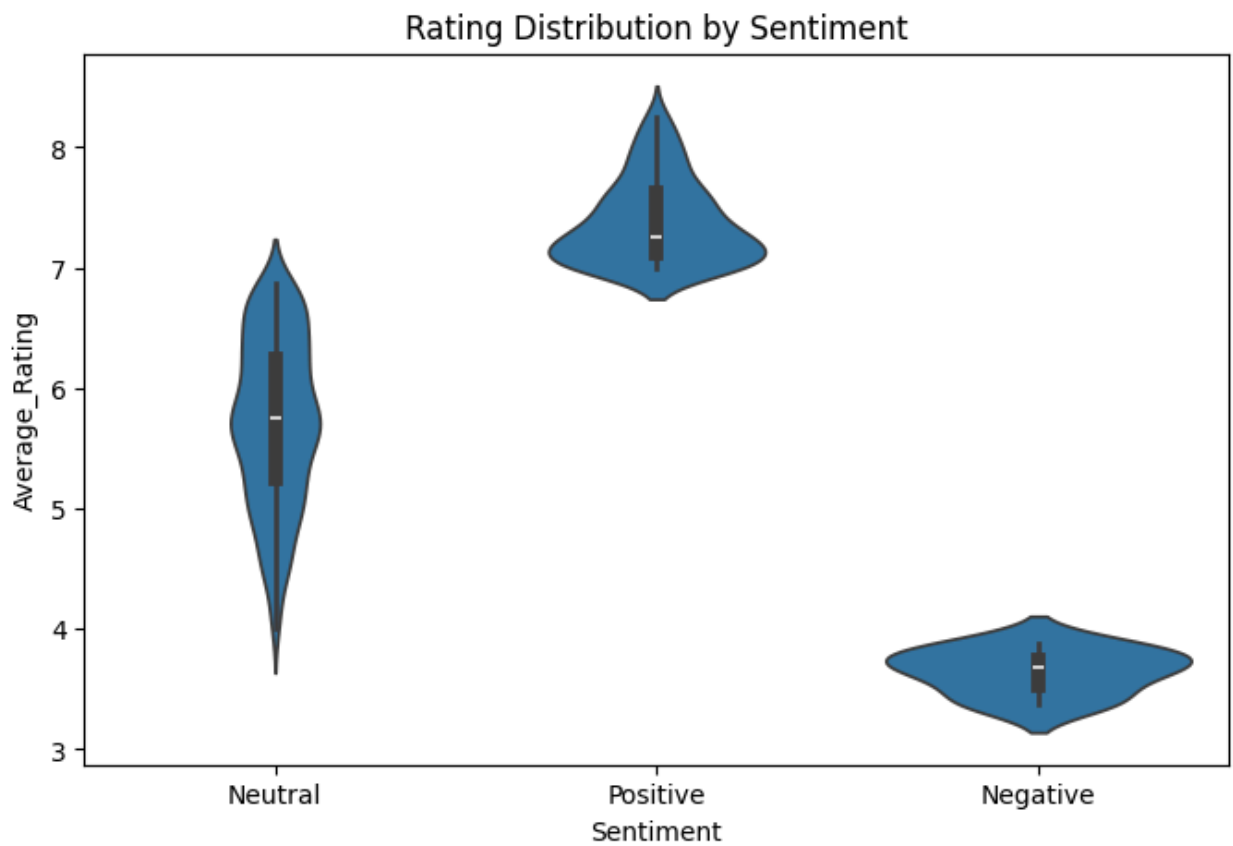


```
In [26]: avg_df = avg_scores.reset_index()
avg_df.columns = ["Category", "Average Rating"]

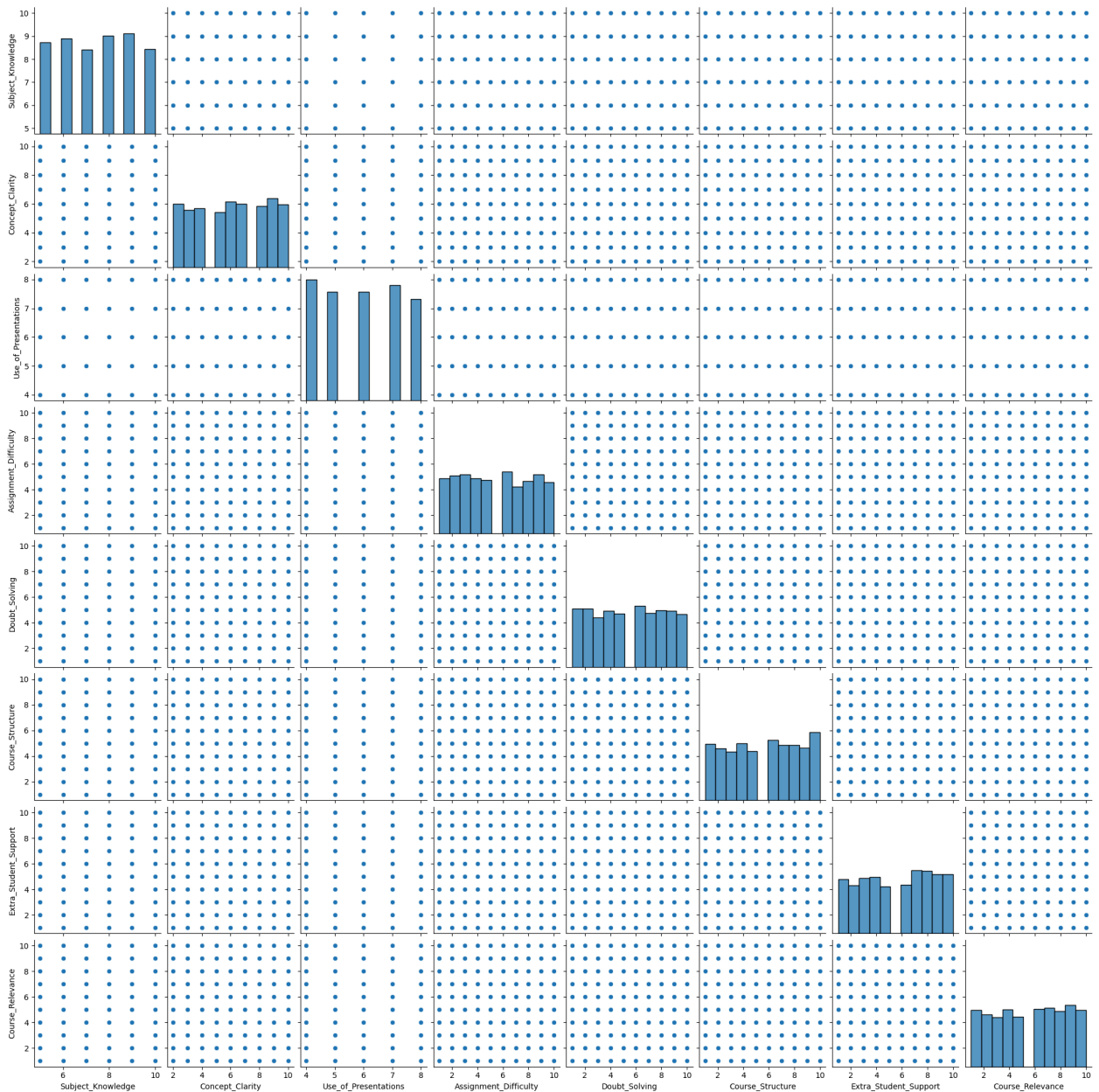
plt.figure(figsize=(10,6))
sns.barplot(x="Average Rating", y="Category", data=avg_df)
plt.title("Average Rating per Feedback Category")
plt.show()
```



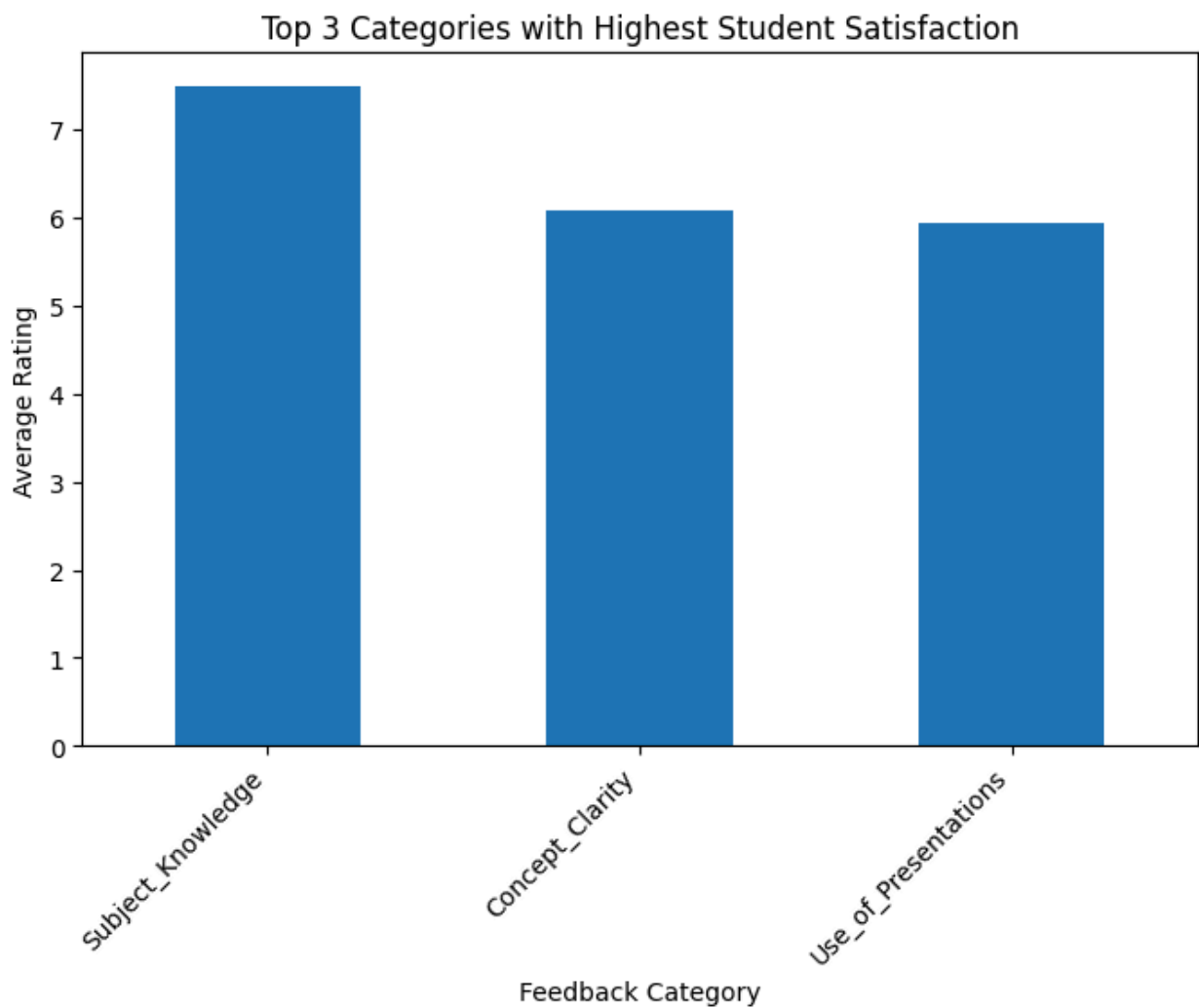
```
In [27]: plt.figure(figsize=(8,5))
sns.violinplot(x="Sentiment", y="Average_Rating", data=df)
plt.title("Rating Distribution by Sentiment")
plt.show()
```



```
In [28]: sns.pairplot(df[rating_cols])
plt.show()
```



```
In [29]: avg_scores = df[rating_cols].mean().sort_values(ascending=False)
avg_scores
top_3 = avg_scores.head(3)
top_3
plt.figure(figsize=(8,5))
top_3.plot(kind="bar")
plt.title("Top 3 Categories with Highest Student Satisfaction")
plt.xlabel("Feedback Category")
plt.ylabel("Average Rating")
plt.xticks(rotation=45, ha="right")
plt.show()
```



```
In [30]: low_scores = avg_scores.sort_values().head(4)
low_scores
complaint_text = " ".join(low_scores.index.str.replace("_", " "))
complaint_text
!pip install wordcloud
from wordcloud import WordCloud
import matplotlib.pyplot as plt
wordcloud = WordCloud(
    width=800,
    height=400,
    background_color="white"
).generate(complaint_text)

plt.figure(figsize=(10,5))
plt.imshow(wordcloud, interpolation="bilinear")
plt.axis("off")
plt.title("Most Common Complaint Areas (Derived from Low Ratings)")
plt.show()
```

Requirement already satisfied: wordcloud in /usr/local/lib/python3.12/dist-packages (1.9.5)
Requirement already satisfied: numpy>=1.19 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) (4.61.1)
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) (3.3.1)
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)

Most Common Complaint Areas (Derived from Low Ratings)

Relevance
Course
Difficulty
Solving.
Assignment
Doubt
Structure

In []:

In []: