Exploring the Impact of Academic and Socioeconomic Factors on Student Mental Health and Well-being



```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
import warnings
warnings.filterwarnings('ignore')
df = pd.read_csv('student_mental_health_data.csv')
df.head()
   Student_ID
              Age
                        Gender Year_of_Study Education_Level
Course \
                24
                          Male
                                    4th Year
                                              Post-Graduation
Science
            2
                22
                          Male
                                    4th Year
                                                           PhD
Arts
                19
                          Male
                                    4th Year Post-Graduation
Science
                22 Non-Binary
                                    2nd Year Post-Graduation
Science
```

4 Commerce	5	18	Female	1	st Year		Pł	nD
Academic Social_Conn 0 1			Family_ \	Income High High	Stay	nce_Typ ing Hom Hoste	ne	
0 2 5 3 3 4		72.68 54.63 60.88		Low Low Low		Outsic Outsic	le	
1 2	evel High Low Low High Low		ours Su 9.42 8.18 5.33 6.93 8.05	bstanc	e_Use P No No Yes No No	ast_Tra	No No No Yes Yes No	
Counselin 0 1 2 3	g_Ava	Y Y Y Y	ty Couns es es es es es	eling_	Utiliza	tion Fa No No Yes Yes No	i – i	oort \ High Hium Low Low Low
Suicidal_Thoughts Suicide_Attempt Reason_for_ No No Family Yes No Relationship pr Yes Yes Financial No Yes Relationship pr No No Financial							issues problems issues problems	
<pre>[5 rows x 21 columns] df.tail()</pre>								
Stude Course \ 9995 Science	9996	5 21	Ma	le	r_of_St 3rd Y	ear	ducation_L Gradua	ation
9996 Engineering 9997 Engineering 9998	9998	3 21	Fema Fema Non-Bina	le	3rd Y 3rd Y 4th Y	ear	Gradua	PhD ation PhD

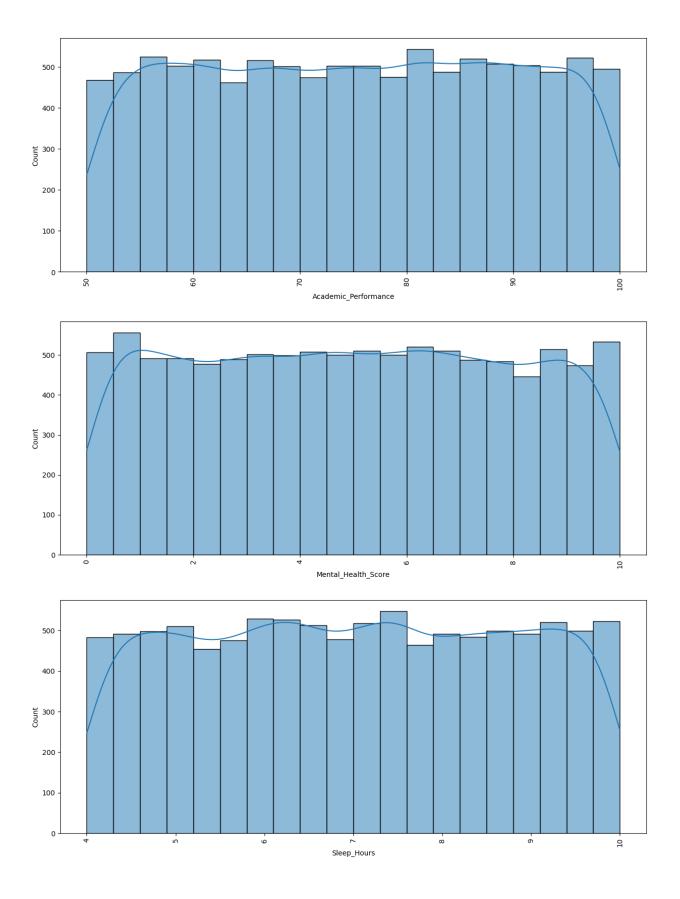
```
Commerce
9999
           10000
                   18
                            Female
                                         4th Year Post-Graduation
Arts
      Academic Performance Family Income Residence Type
Social Connections
9995
                      84.96
                                       Low
                                                  Outside
1
9996
                      97.30
                                       Low
                                                  Outside
1
9997
                      95.65
                                   Medium
                                                   Hostel
3
9998
                      92.64
                                       Low
                                             Staying Home
5
9999
                                             Staying Home
                      73.68
                                       Low
           Stress Level Sleep Hours
                                       Substance Use Past Trauma
9995
                                4.40
                                                 Yes
                     Low
                                                               No
                 Medium
                                                 Yes
9996
                                6.07
                                                               No
9997
                     Low
                                4.41
                                                  No
                                                               No
9998
                                                 Yes
                    High
                                9.15
                                                               No
      . . .
9999
                    High
                                8.05
                                                 Yes
                                                               No
     Counseling Availability Counseling Utilization Family Support \
9995
                           No
                                                   No
                                                                  Low
9996
                          Yes
                                                  Yes
                                                                 High
9997
                           No
                                                  Yes
                                                                  Low
9998
                          Yes
                                                  Yes
                                                               Medium
9999
                           No
                                                   No
                                                               Medium
     Suicidal Thoughts Suicide Attempt
                                              Reason_for_Stress
9995
                     No
                                      No
                                               Financial issues
9996
                                                  Family issues
                     No
                                      No
9997
                     No
                                     Yes
                                               Financial issues
9998
                     No
                                      No
                                               Financial issues
9999
                     No
                                      No
                                          Relationship problems
[5 rows x 21 columns]
df.shape
(10000, 21)
df.columns
Index(['Student ID', 'Age', 'Gender', 'Year of Study',
'Education Level'
       'Course', 'Academic_Performance', 'Family Income',
'Residence_Type',
       'Social Connections', 'Mental_Health_Score', 'Stress_Level',
```

```
'Sleep_Hours', 'Substance_Use', 'Past_Trauma',
       'Counseling_Availability', 'Counseling_Utilization',
'Family_Support',
       dtype='object')
df.duplicated().sum()
0
df.isnull().sum()
Student ID
Age
                          0
                          0
Gender
Year of Study
                          0
Education Level
                          0
Course
                          0
                          0
Academic Performance
Family Income
                          0
                          0
Residence Type
Social Connections
                          0
Mental Health Score
                          0
                          0
Stress Level
Sleep Hours
                          0
Substance Use
                          0
Past Trauma
Counseling Availability
                          0
Counseling Utilization
                          0
Family_Support
                          0
Suicidal Thoughts
                          0
Suicide Attempt
                          0
Reason for Stress
dtype: int64
df.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 10000 entries, 0 to 9999
Data columns (total 21 columns):
#
    Column
                                            Dtype
                             Non-Null Count
                             10000 non-null int64
0
    Student ID
1
                             10000 non-null int64
    Age
2
    Gender
                             10000 non-null object
3
    Year of Study
                             10000 non-null object
4
    Education_Level
                             10000 non-null
                                            object
5
    Course
                             10000 non-null
                                            object
6
    Academic Performance
                             10000 non-null
                                            float64
    Family_Income
7
                             10000 non-null
                                            object
8
    Residence Type
                             10000 non-null
                                            object
```

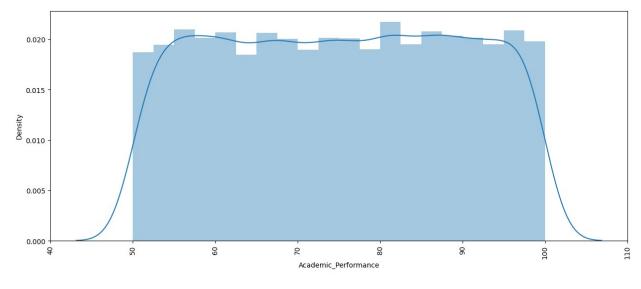
```
Social Connections
                                10000 non-null
                                                 int64
 10
     Mental Health Score
                                10000 non-null
                                                 float64
 11
     Stress Level
                                10000 non-null
                                                 object
     Sleep Hours
 12
                                10000 non-null
                                                 float64
 13
     Substance Use
                                10000 non-null
                                                 object
 14 Past Trauma
                                10000 non-null
                                                 object
     Counseling Availability
 15
                                10000 non-null
                                                 object
     Counseling Utilization
                                10000 non-null
                                                 object
 16
     Family Support
 17
                                10000 non-null
                                                 object
 18
     Suicidal Thoughts
                                10000 non-null
                                                 object
     Suicide Attempt
                                                 object
 19
                                10000 non-null
     Reason for Stress
20
                                10000 non-null
                                                 object
dtypes: float64(3), int64(3), object(15)
memory usage: 1.6+ MB
df.describe()
        Student ID
                               Age
                                    Academic_Performance
Social Connections
       10000.00000
                     10000.000000
count
                                             10000.000000
10000.000000
        5000.50000
                        20.999400
                                                75.128297
mean
2.513200
                         2.007088
std
        2886.89568
                                                14.408652
1.692841
min
           1.00000
                        18.000000
                                                50.010000
0.000000
25%
        2500.75000
                        19.000000
                                                62.510000
1.000000
50%
        5000.50000
                        21.000000
                                                75.255000
3.000000
        7500.25000
                        23,000000
75%
                                                87.630000
4.000000
       10000.00000
                        24.000000
                                               100.000000
max
5.000000
                               Sleep Hours
       Mental Health Score
               10000.\overline{0}00000
                              10000.\overline{0}00000
count
                   4.972233
mean
                                  7.011468
std
                   2.899176
                                  1.729888
min
                   0.000000
                                  4.000000
                                  5.537500
25%
                   2.470000
50%
                   4.970000
                                  7.020000
75%
                   7.450000
                                  8.520000
                  10.000000
                                 10.000000
max
df.nunique()
Student ID
                             10000
                                 7
Age
```

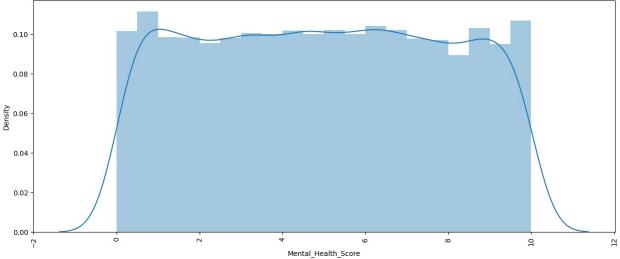
```
Gender
                                3
                               4
Year of Study
Education Level
                               3
                               4
Course
Academic Performance
                            4322
Family Income
                               3
                               3
Residence Type
Social Connections
                               6
Mental Health Score
                            1001
Stress Level
                               3
Sleep Hours
                             601
Substance Use
                                2
                                2
Past Trauma
Counseling Availability
                               2
Counseling Utilization
                                2
                               3
Family Support
                               2
Suicidal Thoughts
                               2
Suicide Attempt
Reason for Stress
dtype: int64
df = df.drop(['Student ID'], axis = 1)
object columns = df.select dtypes(include=['object']).columns
print("Object type columns:")
print(object columns)
numerical_columns = df.select_dtypes(include=['int64',
'float64']).columns
print("\nNumerical type columns:")
print(numerical columns)
Object type columns:
Index(['Gender', 'Year of Study', 'Education Level', 'Course',
'Family Income',
       'Residence Type', 'Stress Level', 'Substance Use',
'Past Trauma',
       'Counseling_Availability', 'Counseling_Utilization',
'Family_Support',
       'Suicidal Thoughts', 'Suicide Attempt', 'Reason for Stress'],
      dtype='object')
Numerical type columns:
Index(['Age', 'Academic_Performance', 'Social Connections',
       'Mental_Health_Score', 'Sleep_Hours'],
      dtype='object')
def classify features(df):
    categorical features = []
    non categorical features = []
```

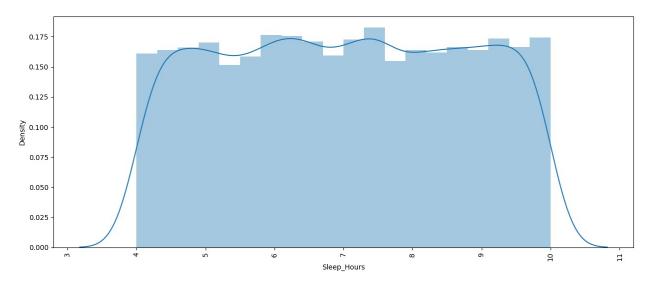
```
discrete features = []
    continuous features = []
    for column in df.columns:
        if df[column].dtype == 'object':
            if df[column].nunique() < 10:</pre>
                categorical features.append(column)
            else:
                non_categorical_features.append(column)
        elif df[column].dtype in ['int64', 'float64']:
            if df[column].nunique() < 10:</pre>
                discrete features.append(column)
            else:
                continuous features.append(column)
    return categorical features, non categorical features,
discrete features, continuous features
categorical, non categorical, discrete, continuous =
classify features(df)
print("Categorical Features:", categorical)
print("Non-Categorical Features:", non categorical)
print("Discrete Features:", discrete)
print("Continuous Features:", continuous)
Categorical Features: ['Gender', 'Year_of_Study', 'Education_Level',
'Course', 'Family Income', 'Residence Type', 'Stress Level',
'Substance Use', 'Past Trauma', 'Counseling Availability',
'Counseling_Utilization', 'Family_Support', 'Suicidal_Thoughts',
'Suicide_Attempt', 'Reason_for_Stress']
Non-Categorical Features: []
Discrete Features: ['Age', 'Social Connections']
Continuous Features: ['Academic Performance', 'Mental Health Score',
'Sleep Hours']
for i in continuous:
    plt.figure(figsize=(15,6))
    sns.histplot(df[i], bins = 20, kde = True, palette='hls')
    plt.xticks(rotation = 90)
    plt.show()
```



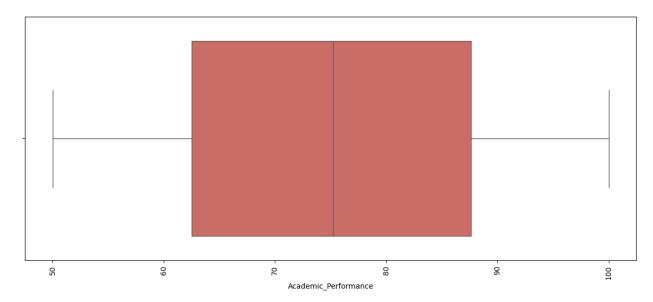
```
for i in continuous:
   plt.figure(figsize=(15,6))
   sns.distplot(df[i], bins = 20, kde = True)
   plt.xticks(rotation = 90)
   plt.show()
```

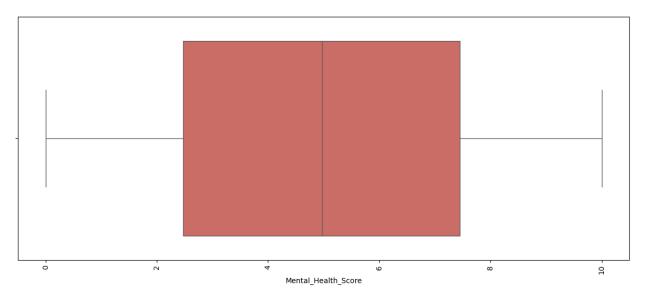


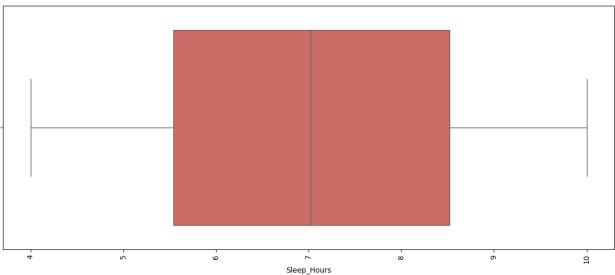




```
for i in continuous:
   plt.figure(figsize=(15, 6))
   sns.boxplot(x=i, data=df, palette='hls')
   plt.xticks(rotation=90)
   plt.show()
```







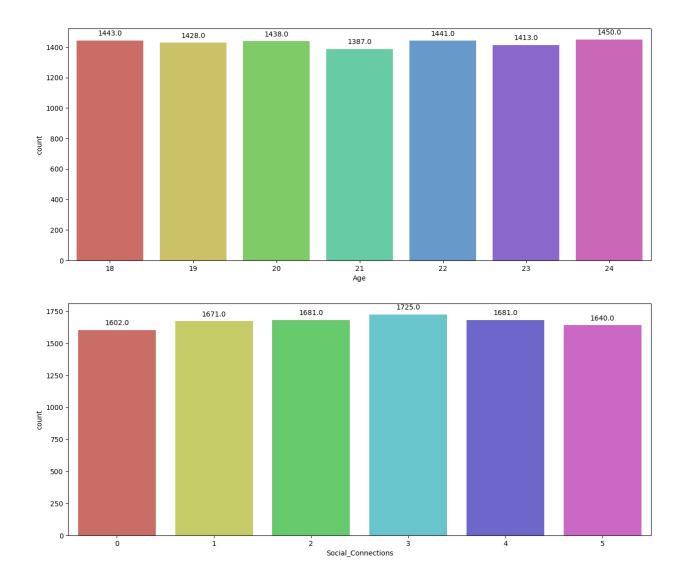
```
for i in discrete:
    print(i)
    print(df[i].unique())
    print()

Age
[24 22 19 18 21 23 20]

Social_Connections
[1 0 5 3 4 2]

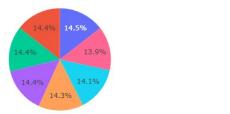
for i in discrete:
    print(i)
    print(df[i].value_counts())
    print()
```

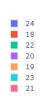
```
Age
Age
24
      1450
18
      1443
22
      1441
20
      1438
19
      1428
23
      1413
21
      1387
Name: count, dtype: int64
Social Connections
Social Connections
     1725
4
     1681
2
     1681
1
     1671
5
     1640
     1602
0
Name: count, dtype: int64
for i in discrete:
    plt.figure(figsize=(15, 6))
    ax = sns.countplot(x=i, data=df, palette='hls')
    for p in ax.patches:
        height = p.get height()
        ax.annotate(f'{height}',
                    xy=(p.get_x() + p.get_width() / 2., height),
                    xytext=(0, 10),
                    textcoords='offset points',
                    ha='center', va='center')
    plt.show()
```



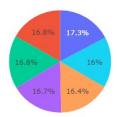
```
import plotly.express as px

for i in discrete:
    counts = df[i].value_counts()
    fig = px.pie(counts, values=counts.values, names=counts.index,
title=f'Distribution of {i}')
    fig.show()
```





Distribution of Social_Connections

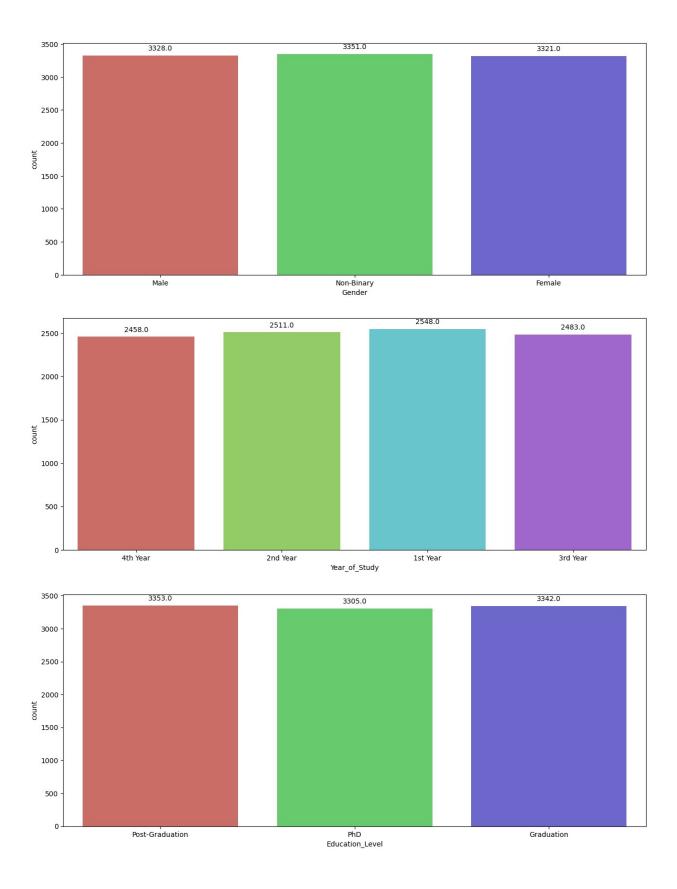


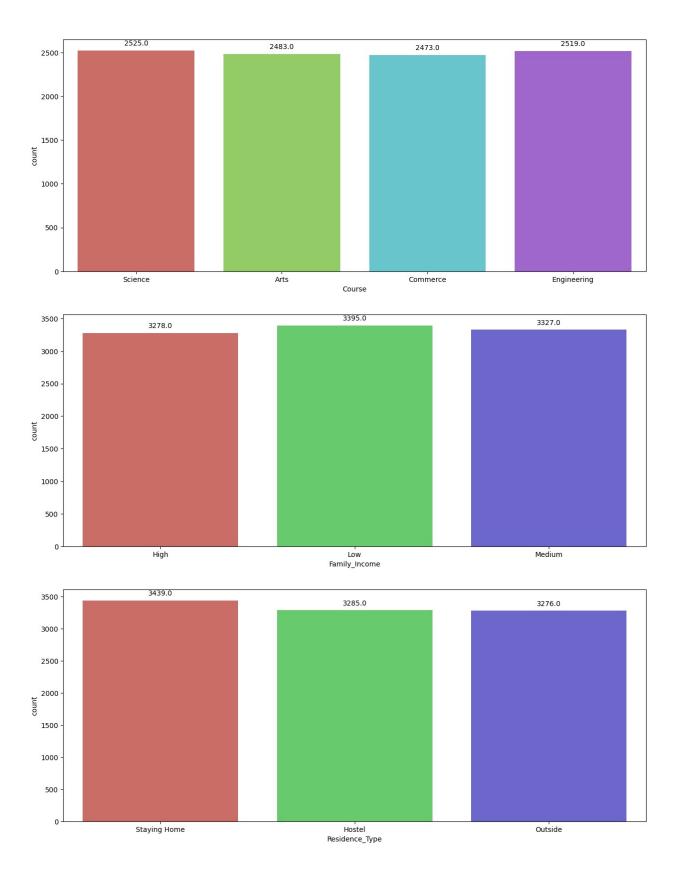
```
for i in categorical:
    print(i)
    print(df[i].unique())
    print()
Gender
['Male' 'Non-Binary' 'Female']
Year_of_Study
['4th Year' '2nd Year' '1st Year' '3rd Year']
Education_Level
['Post-Graduation' 'PhD' 'Graduation']
Course
['Science' 'Arts' 'Commerce' 'Engineering']
Family_Income
['High' 'Low' 'Medium']
Residence_Type
['Staying Home' 'Hostel' 'Outside']
Stress_Level
['High' 'Low' 'Medium']
```

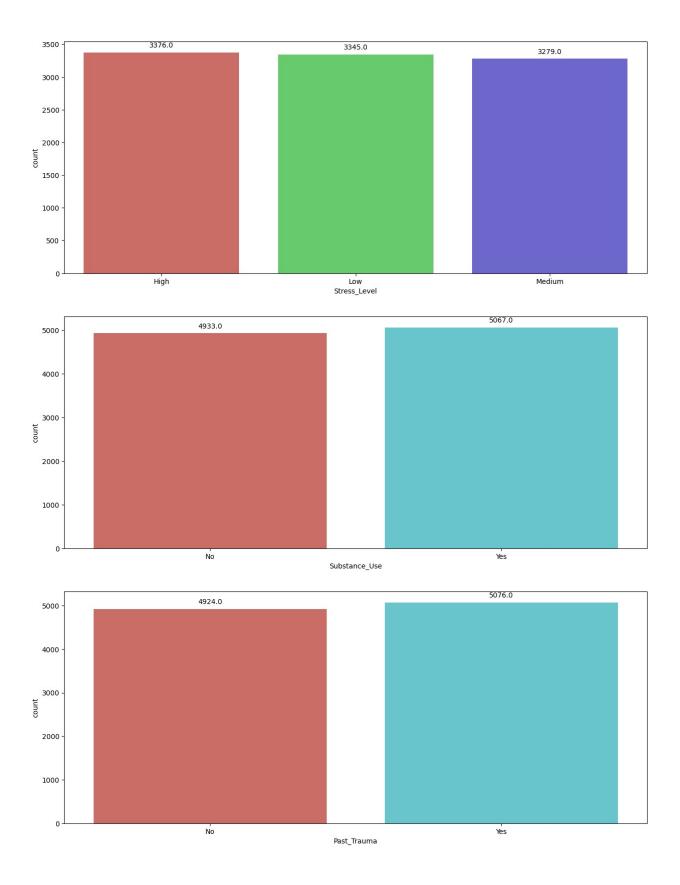
```
Substance Use
['No' 'Yes']
Past Trauma
['No' 'Yes']
Counseling_Availability
['Yes' 'No']
Counseling Utilization
['No' 'Yes']
Family Support
['High' 'Medium' 'Low']
Suicidal Thoughts
['No' 'Yes']
Suicide Attempt
['No' 'Yes']
Reason_for_Stress
['Family issues' 'Relationship problems' 'Financial issues'
'Academic pressure']
for i in categorical:
    print(i)
    print(df[i].value counts())
    print()
Gender
Gender
Non-Binary
              3351
Male
              3328
Female
              3321
Name: count, dtype: int64
Year_of_Study
Year of Study
1st Year
            2548
2nd Year
           2511
3rd Year
           2483
4th Year
           2458
Name: count, dtype: int64
Education Level
Education Level
Post-Graduation
                   3353
Graduation
                   3342
```

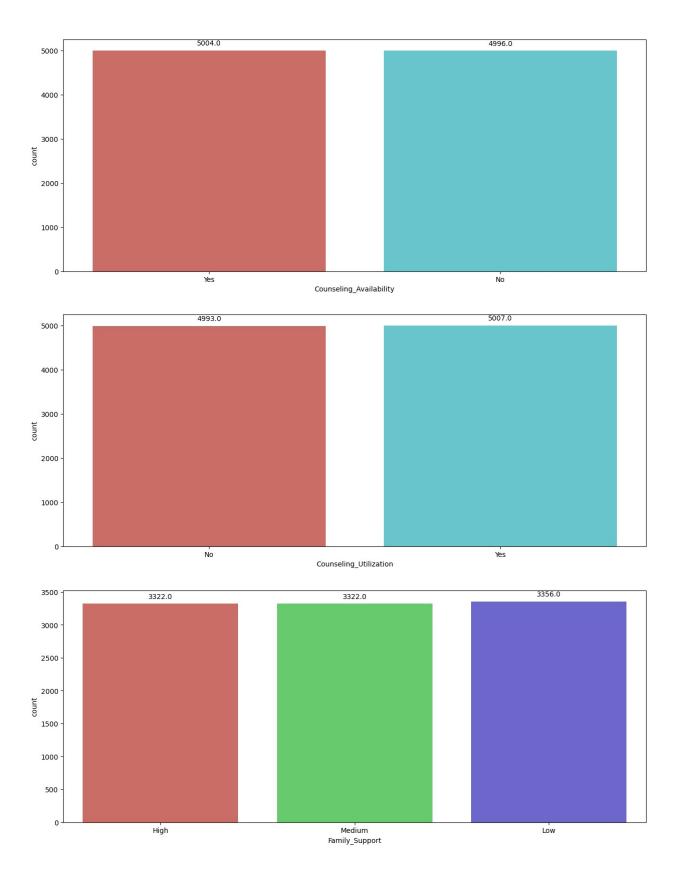
PhD 3305 Name: count, dtype: int64 Course Course Science 2525 Engineering 2519 Arts 2483 Commerce 2473 Name: count, dtype: int64 Family_Income Family_Income Low 3395 Medium 3327 3278 High Name: count, dtype: int64 Residence Type Residence_Type Staying Home 3439 Hostel 3285 Outside 3276 Name: count, dtype: int64 Stress Level Stress_Level High 3376 3345 Low Medium 3279 Name: count, dtype: int64 Substance Use Substance Use Yes 5067 4933 Name: count, dtype: int64 Past Trauma Past Trauma Yes 5076 4924 No Name: count, dtype: int64 Counseling Availability Counseling Availability Yes 5004 4996 No Name: count, dtype: int64

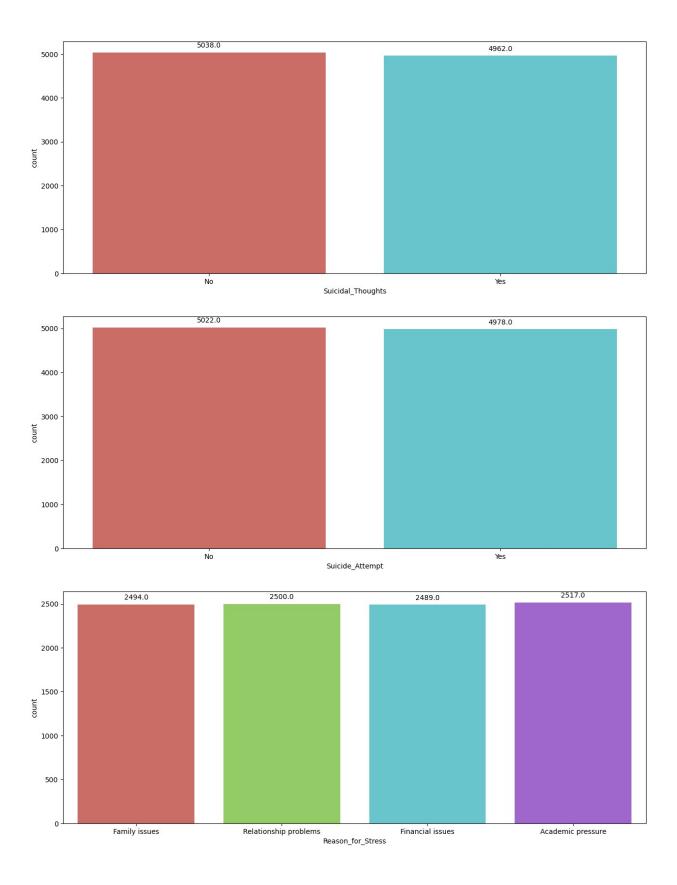
```
Counseling Utilization
Counseling Utilization
Yes
       5007
No
       4993
Name: count, dtype: int64
Family_Support
Family_Support
          3356
Low
High
          3322
Medium
          3322
Name: count, dtype: int64
Suicidal_Thoughts
Suicidal Thoughts
       5038
No
       4962
Yes
Name: count, dtype: int64
Suicide Attempt
Suicide Attempt
No
       5022
Yes
       4978
Name: count, dtype: int64
Reason for Stress
Reason_for_Stress
Academic pressure
                          2517
Relationship problems
                          2500
Family issues
                          2494
Financial issues
                         2489
Name: count, dtype: int64
for i in categorical:
    plt.figure(figsize=(15, 6))
    ax = sns.countplot(x=i, data=df, palette='hls')
    for p in ax.patches:
        height = p.get height()
        ax.annotate(f'{height}',
                    xy=(p.get_x() + p.get_width() / 2., height),
                    xytext=(0, 10),
                    textcoords='offset points',
                    ha='center', va='center')
    plt.show()
```









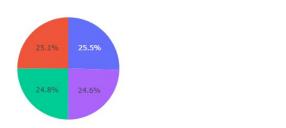


```
for i in categorical:
    counts = df[i].value_counts()
    fig = px.pie(counts, values=counts.values, names=counts.index,
title=f'Distribution of {i}')
    fig.show()
```

Distribution of Gender



Distribution of Year_of_Study

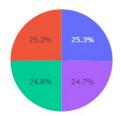


1st Year 2nd Year 3rd Year 4th Year

Distribution of Education_Level



Distribution of Course



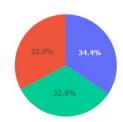


Distribution of Family_Income



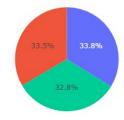


Distribution of Residence_Type





Distribution of Stress_Level





Distribution of Substance_Use



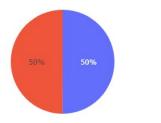
Yes No

Yes No

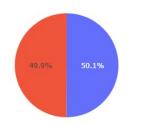
Distribution of Past_Trauma



Distribution of Counseling_Availability

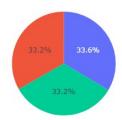


Distribution of Counseling_Utilization



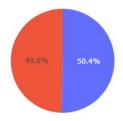
Yes No

Distribution of Family_Support



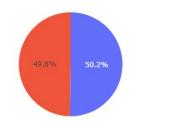


Distribution of Suicidal_Thoughts





Distribution of Suicide_Attempt



Distribution of Reason_for_Stress

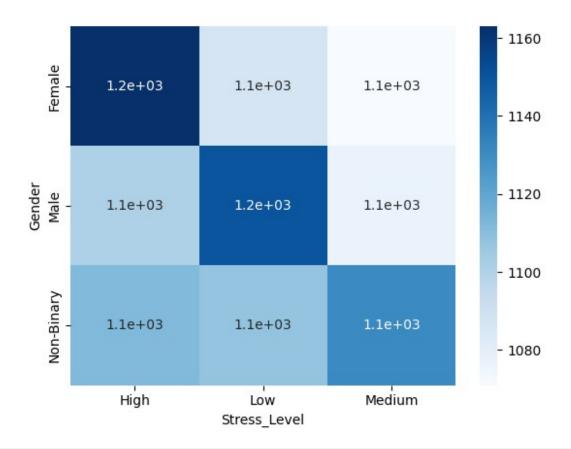


```
Academic pressure
Relationship problems
Family issues
Financial issues
```

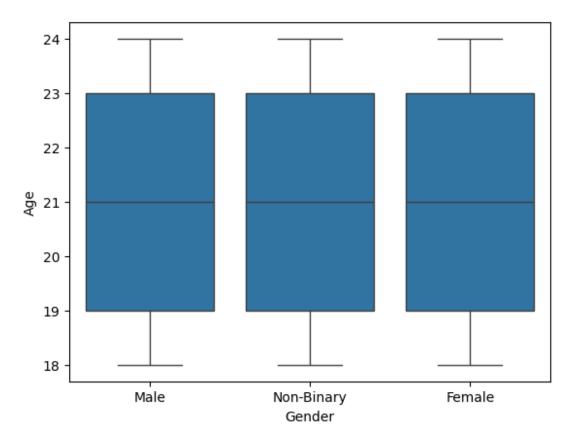
```
from scipy.stats import chi2_contingency

crosstab = pd.crosstab(df['Gender'], df['Stress_Level'])
chi2, p, dof, ex = chi2_contingency(crosstab)

sns.heatmap(crosstab, annot=True, cmap='Blues')
plt.show()
```



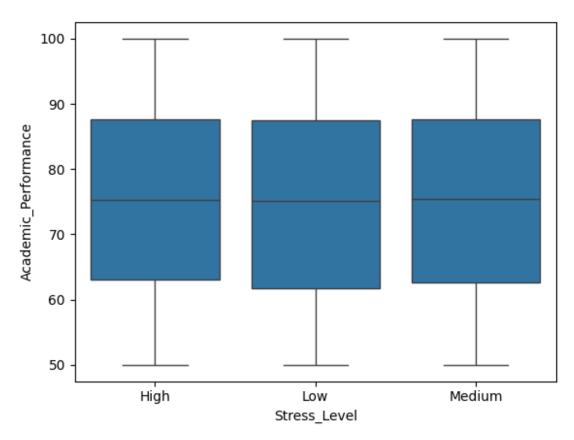
sns.boxplot(x='Gender', y='Age', data=df)
plt.show()



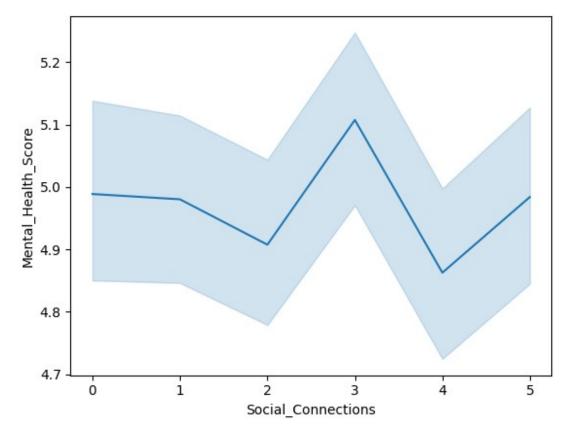
```
import statsmodels.api as sm
from statsmodels.formula.api import ols

sns.boxplot(x='Stress_Level', y='Academic_Performance', data=df)
plt.show()

model = ols('Academic_Performance ~ C(Stress_Level)', data=df).fit()
anova_table = sm.stats.anova_lm(model, typ=2)
print(anova_table)
```

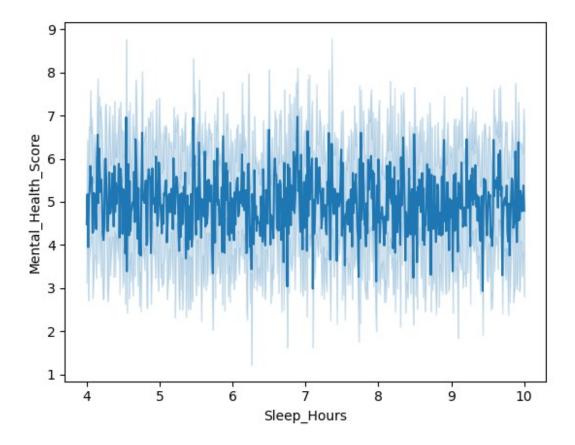


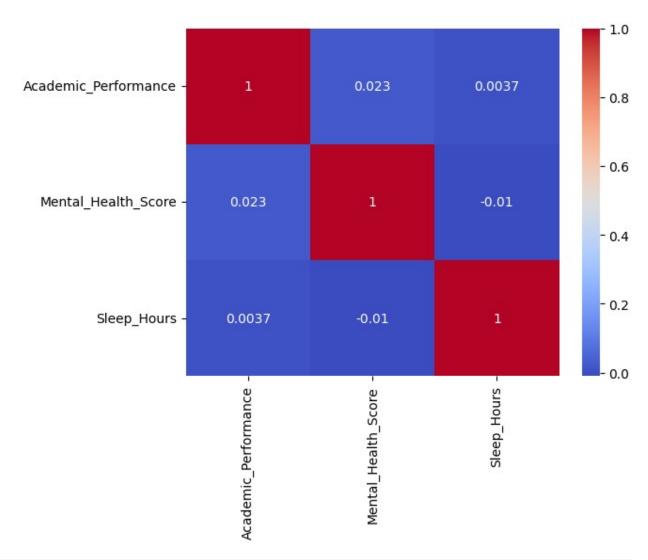
```
sum_sq
                                                    PR(>F)
                                   df
C(Stress_Level)
                 2.418930e+02
                                  2.0
                                       0.582519
                                                 0.558509
Residual
                 2.075643e+06
                               9997.0
                                            NaN
sns.lineplot(x='Social_Connections', y='Mental_Health_Score', data=df)
plt.show()
correlation = df['Social_Connections'].corr(df['Mental_Health_Score'])
print(correlation)
```



```
-0.002923769623728415
sns.lineplot(x='Sleep_Hours', y='Mental_Health_Score', data=df)
plt.show()

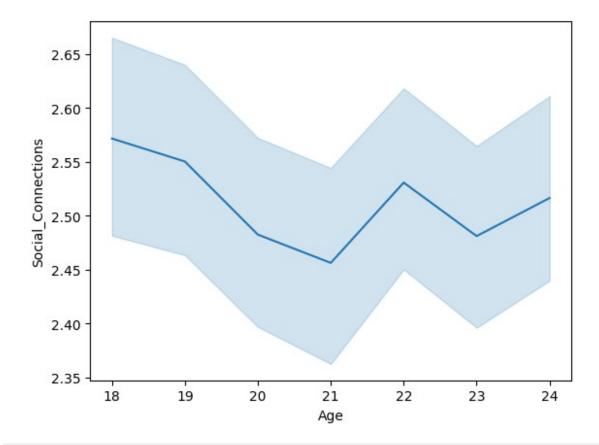
correlation_matrix = df[['Academic_Performance',
    'Mental_Health_Score', 'Sleep_Hours']].corr()
sns.heatmap(correlation_matrix, annot=True, cmap='coolwarm')
plt.show()
```





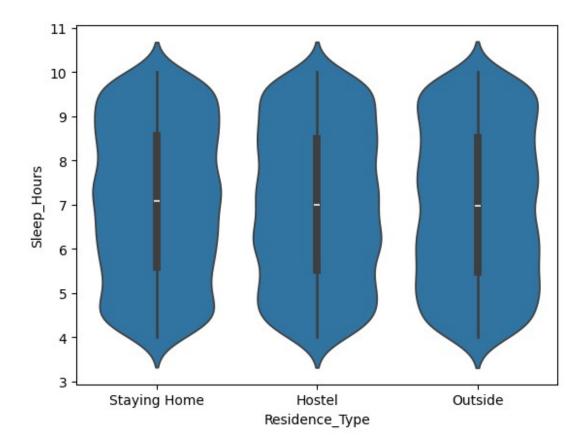
```
sns.lineplot(x='Age', y='Social_Connections', data=df)
plt.show()

correlation = df['Age'].corr(df['Social_Connections'])
print(correlation)
```

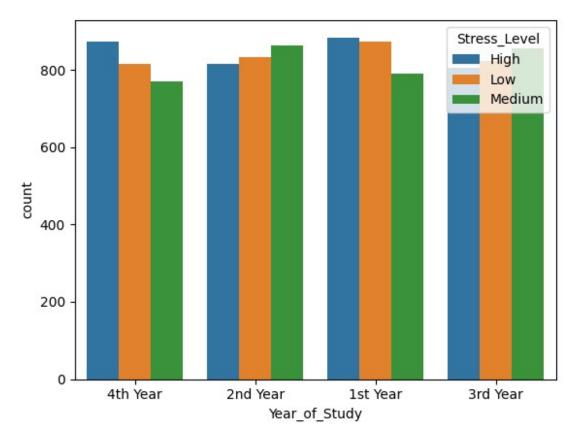


-0.010770796109171145

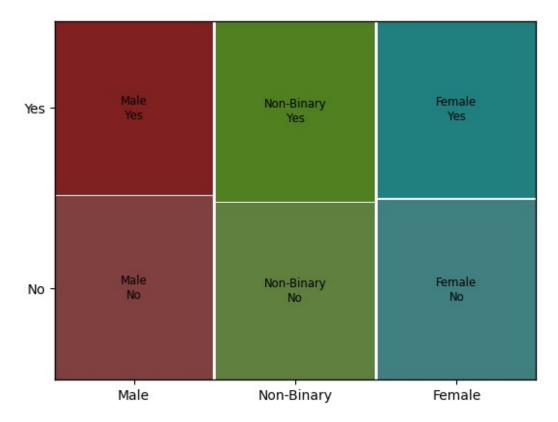
sns.violinplot(x='Residence_Type', y='Sleep_Hours', data=df)
plt.show()



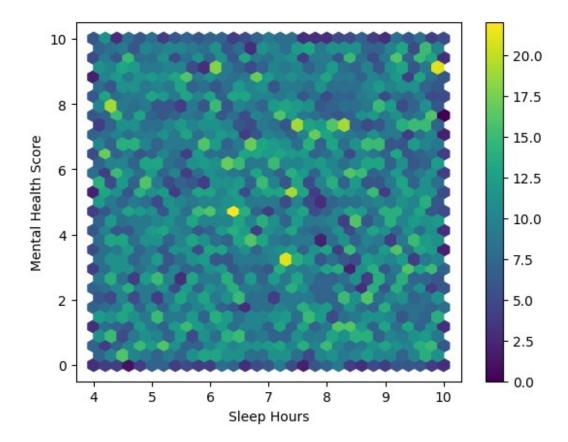
sns.countplot(x='Year_of_Study', hue='Stress_Level', data=df)
plt.show()



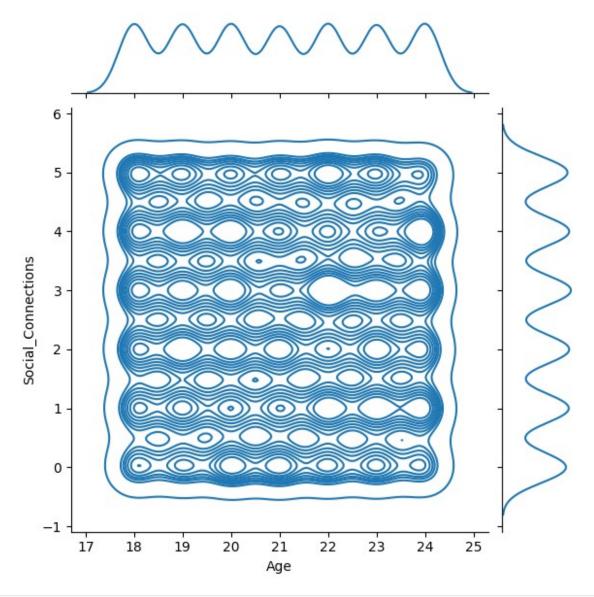
```
from statsmodels.graphics.mosaicplot import mosaic
mosaic(df, ['Gender', 'Suicidal_Thoughts'])
plt.show()
```



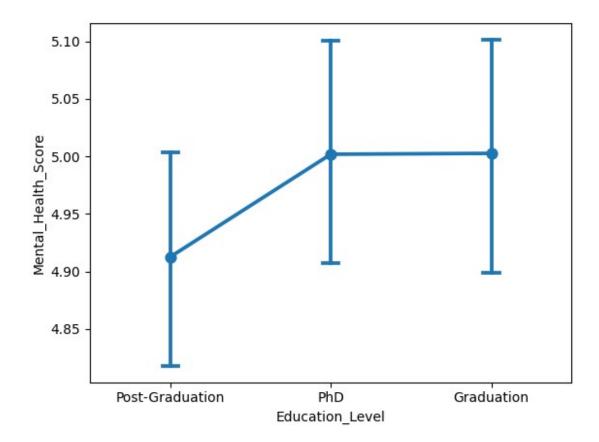
```
plt.hexbin(df['Sleep_Hours'], df['Mental_Health_Score'], gridsize=30,
cmap='viridis')
plt.colorbar()
plt.xlabel('Sleep Hours')
plt.ylabel('Mental Health Score')
plt.show()
```



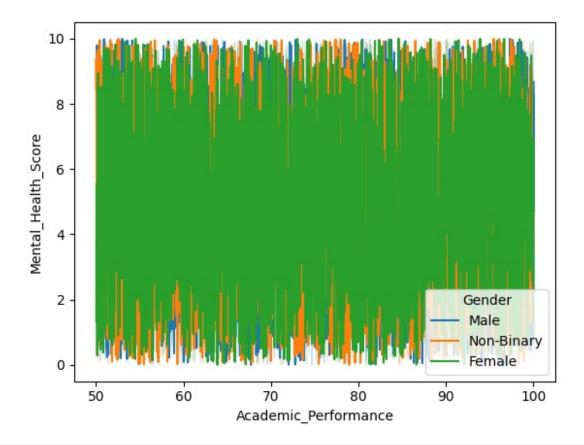
 $sns.jointplot(x='Age', y='Social_Connections', data=df, kind='kde')\\ plt.show()$



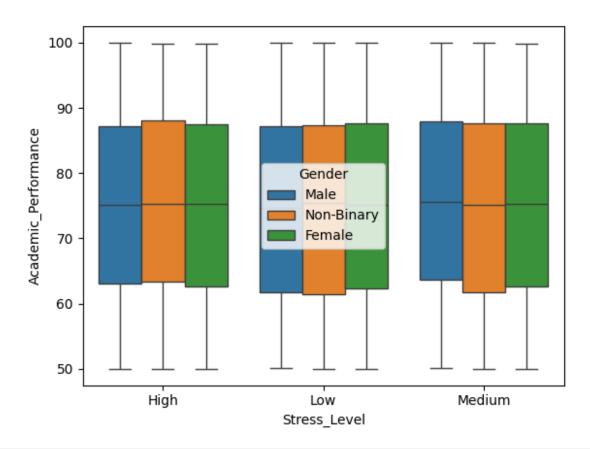
sns.pointplot(x='Education_Level', y='Mental_Health_Score', data=df, capsize=0.1) plt.show()



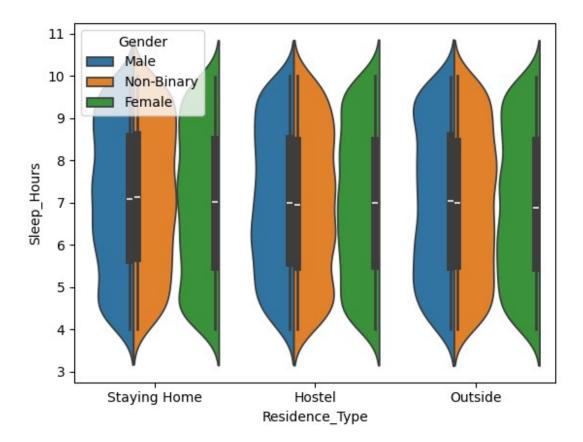
```
sns.lineplot(x='Academic_Performance', y='Mental_Health_Score',
hue='Gender', data=df)
plt.show()
```



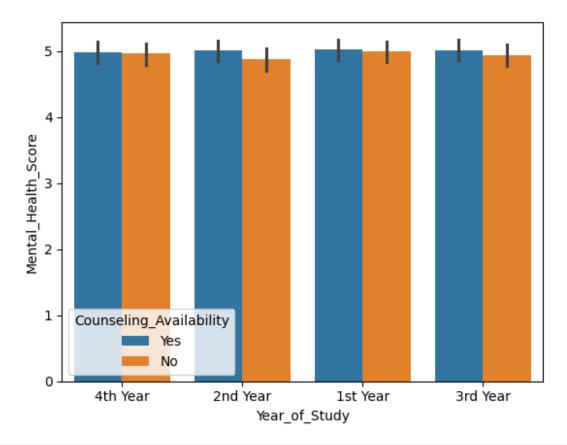
sns.boxplot(x='Stress_Level', y='Academic_Performance', hue='Gender',
data=df)
plt.show()



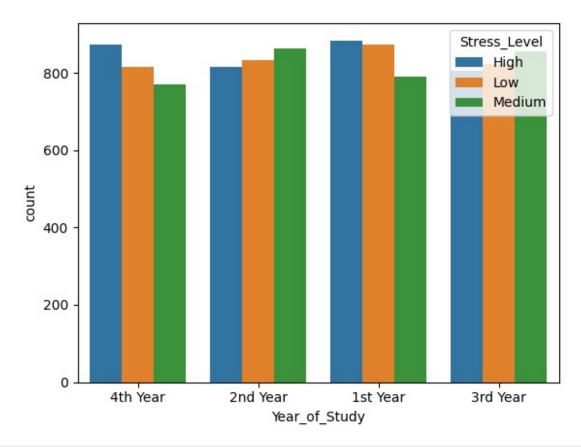
```
sns.violinplot(x='Residence_Type', y='Sleep_Hours', hue='Gender',
data=df, split=True)
plt.show()
```



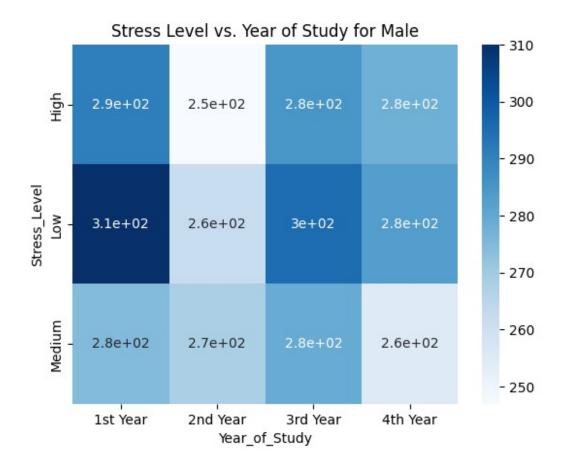
```
sns.barplot(x='Year_of_Study', y='Mental_Health_Score',
hue='Counseling_Availability', data=df)
plt.show()
```

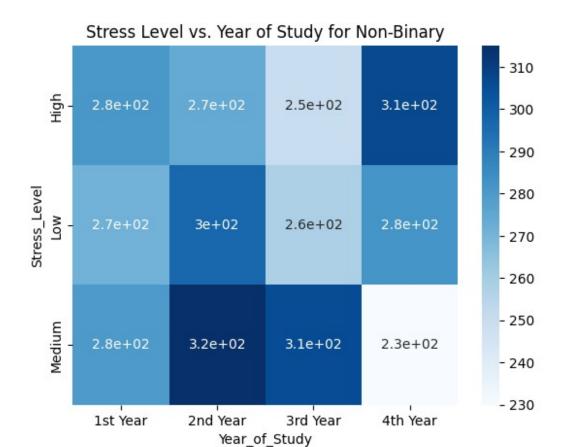


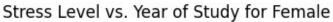
sns.countplot(x='Year_of_Study', hue='Stress_Level', data=df)
plt.show()

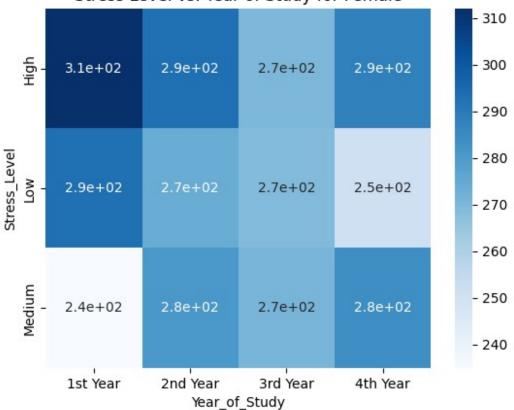


```
for gender in df['Gender'].unique():
    sns.heatmap(pd.crosstab(df['Stress_Level'], df['Year_of_Study']
[df['Gender'] == gender]), annot=True, cmap='Blues')
    plt.title(f'Stress_Level_vs. Year of Study for {gender}')
    plt.show()
```









```
x = df['Age']
y = df['Sleep_Hours']
z = df['Mental_Health_Score']

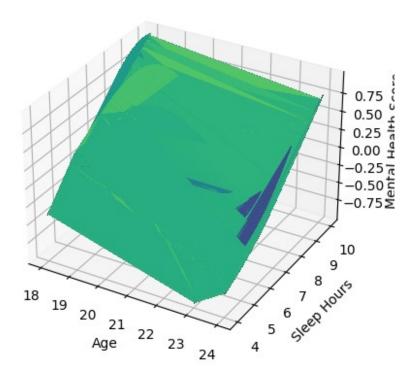
x, y = np.meshgrid(x, y)
z = np.sin(np.sqrt(x**2 + y**2))

fig = plt.figure()
ax = fig.add_subplot(111, projection='3d')

ax.plot_surface(x, y, z, cmap='viridis')

ax.set_xlabel('Age')
ax.set_ylabel('Sleep Hours')
ax.set_zlabel('Mental Health Score')

plt.show()
```



```
pivot1 = df.pivot table(values='Mental Health Score',
index='Year_of_Study', columns='Gender', aggfunc='mean')
print(pivot1)
Gender
                 Female
                             Male
                                   Non-Binary
Year_of_Study
1st Year
               4.996619 5.057146
                                     4.970721
2nd Year
               4.828750 5.069575
                                     4.925260
3rd Year
               4.912111 5.029476
                                     4.984410
4th Year
               5.080838 4.880600
                                     4.934444
pivot2 = df.pivot table(values='Age', index='Residence Type',
columns='Counseling Availability', aggfunc='count', fill value=0)
print(pivot2)
Counseling_Availability
                           No Yes
Residence Type
Hostel
                         1632
                               1653
Outside
                         1653
                               1623
Staying Home
                         1711
                               1728
pivot3 = df.pivot table(values='Academic Performance',
index='Family Income', columns='Family Support', aggfunc='mean')
print(pivot3)
                                         Medium
Family Support
                     High
                                 Low
Family Income
```

High	74.783939	75.576402	75.067936
Low	74.965401	75.507559	75.147911
Medium	75.069229	75.201476	74.820339

- To Be Continued -