

PROJECT REPORT ON

AMCAT DATA ANALYSIS

Submitted by:

Payal Kumari

INNOMATICS RESEARCH LABS

Project Objective

- The objective of this project is to understand the factors influencing salary prediction based on various attributes such as demographic data, educational background, job details, and psychological traits.
- We aim to clean the data, perform exploratory data analysis (EDA), and generate insights that can help in building a predictive model for salary estimation.

Project Roles:

- Data Engineer/Scientist: Responsible for data cleaning, transformation, and exploratory analysis.
- Visualization Specialist: Provides different types of visualizations to represent the data insights.

Data Cleaning:

- 1. Missing Values: Identify and handle missing or erroneous data.
- 2. Data Formatting: Ensure all columns, such as Salary, DOJ, DOL, etc., are in the correct format.
- 3. Outliers: Detect and handle any outliers in the Salary column.
- 4. Categorical Data: Convert categorical data into appropriate numerical forms for analysis.

ANALYSIS:

Univariate Analysis:

This involves analysing individual features to understand their distribution and summary statistics.

Bivariate Analysis:

This explores relationships between two variables (e.g., Salary vs JobCity, Gender, etc.) to identify correlations and patterns.

INNOMATICS RESEARCH LABS

Observations:

- 1. Salary Distribution (Univariate Analysis): The salary distribution appears right-skewed, indicating that most candidates earn in the lower to mid-range of salaries, with fewer individuals earning significantly higher amounts.
- 2. Salary vs. JobCity (Bivariate Analysis): There are significant variations in salary based on job cities. Some cities show a wider salary range, suggesting they might offer more opportunities or have larger firms that pay higher salaries.
- 3. Salary vs. Gender (Bivariate Analysis): There seems to be a noticeable difference in the median salary between males and females, with males appearing to earn more on average in this dataset.
- **4. Salary vs. College Tier (Bivariate Analysis):** Candidates from Tier 1 colleges tend to earn more compared to those from Tier 2, suggesting that college reputation plays a role in salary levels.

Visualizations:

- Count of Candidates by Gender: Shows that there are more male candidates compared to female candidates in the dataset.
- 2. **Distribution of 10th Grade Percentage**: The majority of candidates scored between 70-90% in their 10th-grade exams, with fewer candidates scoring outside this range.
- **3. Boxplot of Salary**: Highlights the salary range, with some candidates earning significantly higher salaries.
- **4. Salary by Degree**: Reveals that different degrees show varied salary ranges, with certain degrees offering higher earning potential.
- **5.** Correlation Heatmap: Shows how various features like Salary, 10percentage, and psychological traits such as conscientiousness correlate with each other.

INNOMATICS RESEARCH LABS

amcat-data-analysis

October 2, 2024

1 AMCAT DATA ANALYSIS

```
[2]: import numpy as np
import pandas as pd
import matplotlib as plt
```

2 Load Data

```
[4]: data_description = pd.read_excel('F:/Innomatics/data_description_doc.xlsx')
results = pd.read_excel('F:/Innomatics/results.xlsx')
test_data = pd.read_excel('F:/Innomatics/test.xlsx')
train_data = pd.read_excel('F:/Innomatics/train.xlsx')
```

[7]: data_description.head() , results.head()

*This dataset contains self-reported information. May contain meaningless/misspelled/mistyped entries. \

```
0 Input
1 Train/Test
2 ID
3 DEPENDENT VARIABLES
4 Salary
```

Unnamed: 2 Unnamed: 3 Description 0 Comments 1 Whether the data belongs to the train set or t... NaN 2 A unique ID to identify a candidate NaN 3 NaNNaN 4 Annual CTC offered to the candidate (in INR) NaN

ID Salary

```
1123290
                      NaN
      1
      2
         1062444
                      NaN
         1072028
                      NaN
      4
          267259
                      NaN)
[8]: test_data.head(), train_data.head()
                          ID Salary DOJ DOL Designation JobCity Gender
[8]: (
        Unnamed: 0
                                                                                  DOB
      0
              test
                      664736
                                       ?
                                           ?
                                                        ?
                                                                        m 1992-01-16
                                       ?
                                           ?
                                                        ?
                                                                 ?
      1
                     1123290
              test
                                                                        m 1992-06-05
                                           ?
                                                        ?
                                                                 ?
      2
              test
                     1062444
                                                                        f 1992-11-22
                                   ?
                                       ?
                                                        ?
                                                                 ?
      3
              test
                     1072028
                                                                        f 1990-10-17
      4
                      267259
                                                                        m 1990-03-20
              test
         10percentage ... ComputerScience MechanicalEngg ElectricalEngg
      0
                  75.0
                                        -1
                                                         -1
                                                                          -1
      1
                  83.0
                                       253
                                                         -1
                                                                          -1
      2
                  85.2 ...
                                                                          -1
                                        -1
                                                         -1
      3
                  81.8
                                                                          -1
                                       469
                                                         -1
                  78.0 ...
                                        -1
                                                         -1
                                                                          -1
        TelecomEngg
                     CivilEngg
                                 conscientiousness agreeableness extraversion
                                             0.2718
                                                           -0.2871
      0
                  -1
                             -1
                                                                          0.4711
      1
                  -1
                             -1
                                             0.7027
                                                            0.2124
                                                                          1.2396
      2
                  -1
                             -1
                                             0.1282
                                                            1.0449
                                                                         -0.6048
      3
                             -1
                                             0.4155
                                                            1.0449
                                                                         -0.6048
                  -1
      4
                  -1
                             -1
                                             0.0464
                                                            0.0328
                                                                         -0.0537
         nueroticism openess_to_experience
      0
             -0.7415
                                      -0.4776
      1
             -0.8682
                                       1.0554
      2
             -1.6289
                                      -0.8608
      3
              1.5404
                                       1.0554
              0.0623
                                       0.6603
      [5 rows x 39 columns],
                                                                    DOL \
        Unnamed: 0
                         ID
                              Salary
                                             DOJ
      0
             train 203097
                              420000 2012-06-01
                                                                present
      1
             train 579905
                              500000 2013-09-01
                                                                present
      2
             train 810601
                              325000 2014-06-01
                                                                present
      3
             train 267447
                             1100000 2011-07-01
                                                                present
      4
             train 343523
                              200000 2014-03-01 2015-03-01 00:00:00
                       Designation
                                       JobCity Gender
                                                              DOB 10percentage ...
          senior quality engineer
                                    Bangalore
                                                     f 1990-02-19
                                                                            84.3 ...
      0
                                        Indore
                                                     m 1989-10-04
                                                                            85.4 ...
      1
                assistant manager
```

0

664736

NaN

```
systems engineer
                                        Chennai
                                                      f 1992-08-03
                                                                             85.0
                                                      m 1989-12-05
                                                                              85.6
          senior software engineer
                                        Gurgaon
       4
                                 get
                                        Manesar
                                                      m 1991-02-27
                                                                              78.0
         ComputerScience
                           MechanicalEngg
                                            ElectricalEngg TelecomEngg
                                                                          CivilEngg
       0
                       -1
                                        -1
                                                         -1
                                                                      -1
                                                                      -1
                                                                                  -1
                       -1
                                        -1
                                                         -1
       1
       2
                       -1
                                        -1
                                                         -1
                                                                      -1
                                                                                  -1
       3
                       -1
                                                         -1
                                                                                  -1
                                        -1
                                                                      -1
       4
                       -1
                                        -1
                                                         -1
                                                                      -1
                                                                                  -1
          conscientiousness agreeableness extraversion nueroticism \
       0
                      0.9737
                                     0.8128
                                                   0.5269
                                                                1.35490
                                                              -0.10760
                     -0.7335
       1
                                     0.3789
                                                   1.2396
       2
                      0.2718
                                     1.7109
                                                   0.1637
                                                              -0.86820
       3
                      0.0464
                                     0.3448
                                                  -0.3440
                                                               -0.40780
       4
                     -0.8810
                                    -0.2793
                                                  -1.0697
                                                               0.09163
          openess_to_experience
       0
                         -0.4455
                          0.8637
       1
       2
                          0.6721
       3
                         -0.9194
                         -0.1295
       [5 rows x 39 columns])
[11]: data_description.head()
[11]:
         Unnamed: 0
      0
                NaN
      1
                NaN
      2
                NaN
      3
                 NaN
                 NaN
        *This dataset contains self-reported information. May contain
      meaningless/misspelled/mistyped entries.
      0
                                                        Input
                                                   Train/Test
      1
      2
                                                           ID
      3
                                         DEPENDENT VARIABLES
      4
                                                       Salary
                                                   Unnamed: 2 Unnamed: 3
                                                  Description
                                                                 Comments
      1 Whether the data belongs to the train set or t...
                                                                    NaN
```

```
2
                        A unique ID to identify a candidate
                                                                      NaN
      3
                                                                      {\tt NaN}
                                                          NaN
      4
              Annual CTC offered to the candidate (in INR)
                                                                      NaN
[12]: results.head()
[12]:
                   Salary
              ID
      0
          664736
                      NaN
        1123290
      1
                      NaN
      2 1062444
                      NaN
      3 1072028
                      NaN
          267259
                      NaN
[10]: test_data.head()
[10]:
        Unnamed: 0
                          ID Salary DOJ DOL Designation JobCity Gender
                                                                                 DOB \
                      664736
                                   ?
                                       ?
                                           ?
                                                        ?
                                                                 ?
                                                                        m 1992-01-16
      0
              test
      1
                     1123290
                                       ?
                                           ?
                                                        ?
                                                                 ?
              test
                                                                        m 1992-06-05
      2
                                           ?
                                                        ?
                                                                 ?
              test
                     1062444
                                                                        f 1992-11-22
                                           ?
                                                                 ?
      3
                     1072028
                                                                        f 1990-10-17
              test
                                                                        m 1990-03-20
              test
                      267259
                                                                 ?
         10percentage ... ComputerScience MechanicalEngg ElectricalEngg \
      0
                  75.0
                                        -1
      1
                  83.0 ...
                                       253
                                                         -1
                                                                          -1
      2
                  85.2 ...
                                                         -1
                                        -1
                                                                          -1
      3
                  81.8 ...
                                                         -1
                                       469
                                                                          -1
                  78.0 ...
                                        -1
                                                         -1
                                                                          -1
        TelecomEngg CivilEngg conscientiousness agreeableness extraversion \
      0
                  -1
                                             0.2718
                                                           -0.2871
                                                                          0.4711
                             -1
      1
                  -1
                             -1
                                             0.7027
                                                            0.2124
                                                                          1.2396
      2
                  -1
                             -1
                                             0.1282
                                                            1.0449
                                                                         -0.6048
      3
                  -1
                             -1
                                             0.4155
                                                            1.0449
                                                                         -0.6048
                                                            0.0328
                  -1
                             -1
                                             0.0464
                                                                         -0.0537
         nueroticism openess_to_experience
      0
             -0.7415
                                      -0.4776
      1
             -0.8682
                                       1.0554
      2
             -1.6289
                                      -0.8608
      3
              1.5404
                                       1.0554
              0.0623
                                       0.6603
      [5 rows x 39 columns]
 [9]: train_data.head()
```

```
[9]:
       Unnamed: 0
                        ID
                             Salary
                                            DOJ
                                                                  DOL \
            train 203097
                             420000 2012-06-01
     0
                                                              present
     1
            train 579905
                             500000 2013-09-01
                                                              present
     2
            train 810601
                             325000 2014-06-01
                                                              present
                           1100000 2011-07-01
     3
            train 267447
                                                              present
            train 343523
                             200000 2014-03-01 2015-03-01 00:00:00
                      Designation
                                      JobCity Gender
                                                             D<sub>0</sub>B
                                                                  10percentage
         senior quality engineer Bangalore
                                                                          84.3
     0
                                                   f 1990-02-19
     1
               assistant manager
                                       Indore
                                                   m 1989-10-04
                                                                           85.4 ...
     2
                systems engineer
                                     Chennai
                                                   f 1992-08-03
                                                                          85.0 ...
       senior software engineer
                                     Gurgaon
                                                   m 1989-12-05
                                                                           85.6 ...
     3
                                                                           78.0 ...
                                     Manesar
                                                   m 1991-02-27
       ComputerScience MechanicalEngg ElectricalEngg TelecomEngg
                                                                      CivilEngg \
     0
                     -1
     1
                     -1
                                      -1
                                                       -1
                                                                   -1
                                                                               -1
     2
                     -1
                                     -1
                                                      -1
                                                                   -1
                                                                               -1
     3
                     -1
                                     -1
                                                      -1
                                                                   -1
                                                                               -1
     4
                     -1
                                     -1
                                                      -1
                                                                   -1
                                                                               -1
        conscientiousness agreeableness extraversion nueroticism \
                                  0.8128
     0
                   0.9737
                                                0.5269
                                                             1.35490
                  -0.7335
                                  0.3789
                                                1.2396
                                                            -0.10760
     1
     2
                   0.2718
                                  1.7109
                                                0.1637
                                                            -0.86820
     3
                   0.0464
                                  0.3448
                                               -0.3440
                                                            -0.40780
                                                             0.09163
                  -0.8810
                                 -0.2793
                                               -1.0697
        openess_to_experience
     0
                       -0.4455
                        0.8637
     1
     2
                        0.6721
     3
                       -0.9194
                       -0.1295
```

[5 rows x 39 columns]

3 Data Cleaning Summary:

```
[13]: # 1. Missing Values: Both the train and test datasets contain missing values in various columns. We will handle these by imputing or dropping them based on the context.

# 2. Data Formatting: Certain columns such as DOJ, DOL, and Salary will require formatting adjustments.

# 3. Erroneous Data: The test dataset contains placeholder values like ?, which will need to be addressed.
```

```
Collecting ace_toolsNote: you may need to restart the kernel to use updated
     packages.
       Obtaining dependency information for ace_tools from https://files.pythonhosted
     .org/packages/27/c4/402d3ae2ecbfe72fbdcb2769f55580f1c54a3ca110c44e1efc034516a499
     /ace_tools-0.0-py3-none-any.whl.metadata
       Downloading ace_tools-0.0-py3-none-any.whl.metadata (300 bytes)
     Downloading ace_tools-0.0-py3-none-any.whl (1.1 kB)
     Installing collected packages: ace_tools
     Successfully installed ace_tools-0.0
     [notice] A new release of pip is available: 23.2.1 -> 24.2
     [notice] To update, run: python.exe -m pip install --upgrade pip
[18]: import sys
      sys.path.append('/path/to/ace_tools_directory')
[23]: # Checking for missing values in the training dataset
      missing_values_train = train_data.isnull().sum()
      # Checking basic statistics of the train dataset
      train_stats = train_data.describe()
      # Display missing values in the console
      print("Missing Values in Training Data:\n", missing_values_train)
      # Display basic statistics of the train dataset
      print("\nBasic Statistics of the Training Data:\n", train_stats)
      pd.DataFrame(missing_values_train, columns=["Missing Values"])
      # Display basic statistics
      train stats
     Missing Values in Training Data:
      Unnamed: 0
                               0
                              0
     ID
     Salary
                              0
     DOJ
                              0
     DOL
                              0
     Designation
                              0
     JobCity
                              0
     Gender
                              0
     DOB
                              0
                              0
     10percentage
```

[16]: pip install ace_tools

10board	^
	0
12graduation	0
12percentage	0
12board	0
CollegeID	0
CollegeTier	0
Degree	0
Specialization	0
collegeGPA	0
CollegeCityID	0
CollegeCityTier	0
CollegeState	0
GraduationYear	0
English	0
Logical	0
Quant	0
Domain	0
ComputerProgramming	0
ElectronicsAndSemicon	0
ComputerScience	0
MechanicalEngg	0
ElectricalEngg	0
TelecomEngg	0
CivilEngg	0
conscientiousness	0
agreeableness	0
extraversion	0
nueroticism	0
openess_to_experience	0
dtvpe: int64	

dtype: int64

Basic Statistics of the Training Data:

		0			
	ID	Salary		DOJ	\
count	3.998000e+03	3.998000e+03		3998	
mean	6.637945e+05	3.076998e+05	2013-07-02 11:04	:10.325162496	
min	1.124400e+04	3.500000e+04	1991-0	06-01 00:00:00	
25%	3.342842e+05	1.800000e+05	2012-1	.0-01 00:00:00	
50%	6.396000e+05	3.000000e+05	2013-1	1-01 00:00:00	
75%	9.904800e+05	3.700000e+05	2014-0	7-01 00:00:00	
max	1.298275e+06	4.000000e+06	2015-1	2-01 00:00:00	
std	3.632182e+05	2.127375e+05		NaN	
		DO	OB 10percentage	12graduation	\
count		399	3998.000000	3998.000000	
mean	1990-12-06 06	:01:15.63781900	77.925443	2008.087544	
min	197	7-10-30 00:00:0	43.000000	1995.000000	
25%	1989	9-11-16 06:00:0	71.680000	2007.000000	
50%	199	1-03-07 12:00:0	79.150000	2008.000000	

```
75%
                  1992-03-13 18:00:00
                                            85.670000
                                                         2009,000000
                  1997-05-27 00:00:00
                                            97.760000
                                                         2013.000000
max
                                   NaN
                                             9.850162
                                                            1.653599
std
       12percentage
                          CollegeID
                                     CollegeTier
                                                     collegeGPA
        3998.000000
                        3998.000000
                                     3998.000000
                                                    3998.000000
count
mean
          74.466366
                        5156.851426
                                         1.925713
                                                      71.486171
min
          40.000000
                           2.000000
                                         1.000000
                                                       6.450000
25%
          66.000000
                        494.000000
                                         2.000000
                                                      66.407500
50%
          74.400000
                       3879.000000
                                         2.000000
                                                      71.720000
75%
                                                      76.327500
          82.600000
                        8818.000000
                                         2.000000
          98.700000
                      18409.000000
                                         2.000000
                                                      99.930000
max
           10.999933
                       4802.261482
                                         0.262270
                                                       8.167338
std
       ComputerScience
                         MechanicalEngg
                                           ElectricalEngg
                                                            TelecomEngg
            3998.000000
                             3998.000000
                                              3998.000000
                                                            3998.000000
count
              90.742371
                               22.974737
                                                16.478739
                                                              31.851176
mean
              -1.000000
                               -1.000000
                                                -1.000000
                                                              -1.000000
min
25%
              -1.000000
                               -1.000000
                                                              -1.000000
                                                -1.000000
50%
              -1.000000
                               -1.000000
                                                -1.000000
                                                              -1.000000
75%
              -1.000000
                               -1.000000
                                                -1.000000
                                                              -1.000000
             715.000000
                              623.000000
                                               676.000000
                                                             548.000000
max
std
             175.273083
                               98.123311
                                                87.585634
                                                             104.852845
         CivilEngg
                     conscientiousness
                                          agreeableness
                                                          extraversion
       3998.000000
                            3998.000000
                                            3998.000000
                                                           3998.000000
count
          2.683842
                              -0.037831
                                                              0.002763
                                               0.146496
mean
min
         -1.000000
                              -4.126700
                                              -5.781600
                                                             -4.600900
25%
                              -0.713525
         -1.000000
                                              -0.287100
                                                             -0.604800
50%
         -1.000000
                               0.046400
                                               0.212400
                                                              0.091400
75%
         -1.000000
                               0.702700
                                               0.812800
                                                              0.672000
        516.000000
                               1.995300
                                               1.904800
                                                              2.535400
max
std
         36.658505
                               1.028666
                                               0.941782
                                                              0.951471
                     openess_to_experience
       nueroticism
count
       3998.000000
                                3998.000000
mean
         -0.169033
                                  -0.138110
min
         -2.643000
                                  -7.375700
25%
         -0.868200
                                  -0.669200
50%
         -0.234400
                                  -0.094300
75%
          0.526200
                                   0.502400
          3.352500
                                   1.822400
max
          1.007580
                                   1.008075
std
```

[8 rows x 29 columns]

```
[23]:
                        ID
                                                                       DOJ
                                   Salary
      count
             3.998000e+03
                             3.998000e+03
                                                                      3998
              6.637945e+05
                             3.076998e+05
                                            2013-07-02 11:04:10.325162496
      mean
                                                      1991-06-01 00:00:00
      min
              1.124400e+04
                             3.500000e+04
      25%
              3.342842e+05
                             1.800000e+05
                                                      2012-10-01 00:00:00
      50%
                                                      2013-11-01 00:00:00
              6.396000e+05
                             3.000000e+05
      75%
             9.904800e+05
                             3.700000e+05
                                                      2014-07-01 00:00:00
      max
              1.298275e+06
                             4.000000e+06
                                                      2015-12-01 00:00:00
             3.632182e+05
                             2.127375e+05
                                                                       NaN
      std
                                         DOB
                                               10percentage
                                                              12graduation
                                        3998
                                                3998.000000
                                                               3998.000000
      count
              1990-12-06 06:01:15.637819008
                                                  77.925443
                                                               2008.087544
      mean
      min
                        1977-10-30 00:00:00
                                                  43.000000
                                                               1995.000000
      25%
                        1989-11-16 06:00:00
                                                  71.680000
                                                               2007.000000
      50%
                        1991-03-07 12:00:00
                                                  79.150000
                                                               2008.000000
      75%
                        1992-03-13 18:00:00
                                                  85.670000
                                                               2009.000000
                        1997-05-27 00:00:00
      max
                                                  97.760000
                                                               2013.000000
                                         NaN
      std
                                                   9.850162
                                                                  1.653599
              12percentage
                                CollegeID
                                           CollegeTier
                                                           collegeGPA
               3998.000000
                              3998.000000
                                            3998.000000
                                                          3998.000000
      count
      mean
                 74.466366
                              5156.851426
                                               1.925713
                                                            71.486171
      min
                 40.000000
                                 2.000000
                                               1.000000
                                                             6.450000
                                                            66.407500
      25%
                               494.000000
                 66.000000
                                               2.000000
      50%
                 74.400000
                              3879.000000
                                               2.000000
                                                            71.720000
      75%
                                               2.000000
                 82.600000
                              8818.000000
                                                            76.327500
      max
                 98.700000
                             18409.000000
                                               2.000000
                                                            99.930000
                              4802.261482
                                                             8.167338
      std
                 10.999933
                                               0.262270
             ComputerScience
                                                                  TelecomEngg
                                MechanicalEngg
                                                 ElectricalEngg
                  3998.000000
                                   3998.000000
                                                    3998.000000
                                                                  3998.000000
      count
                    90.742371
                                     22.974737
                                                      16.478739
                                                                    31.851176
      mean
                                     -1.000000
                                                                    -1.000000
      min
                    -1.000000
                                                      -1.000000
      25%
                    -1.000000
                                     -1.000000
                                                      -1.000000
                                                                    -1.000000
      50%
                    -1.000000
                                     -1.000000
                                                      -1.000000
                                                                    -1.000000
      75%
                    -1.000000
                                     -1.000000
                                                      -1.000000
                                                                    -1.000000
                   715.000000
                                    623.000000
                                                     676.000000
                                                                   548.000000
      max
      std
                   175.273083
                                     98.123311
                                                      87.585634
                                                                   104.852845
                CivilEngg
                            conscientiousness
                                                agreeableness
                                                                extraversion
             3998.000000
                                  3998.000000
                                                  3998.000000
                                                                 3998.000000
      count
      mean
                 2.683842
                                    -0.037831
                                                     0.146496
                                                                    0.002763
      min
                -1.000000
                                    -4.126700
                                                    -5.781600
                                                                   -4.600900
      25%
                -1.000000
                                    -0.713525
                                                    -0.287100
                                                                   -0.604800
      50%
                -1.000000
                                     0.046400
                                                     0.212400
                                                                    0.091400
      75%
                -1.000000
                                     0.702700
                                                     0.812800
                                                                    0.672000
```

```
516.000000
                             1.995300
                                            1.904800
                                                          2.535400
max
         36.658505
                             1.028666
                                            0.941782
                                                          0.951471
std
       nueroticism openess_to_experience
count 3998.000000
                              3998.000000
                                -0.138110
mean
        -0.169033
min
        -2.643000
                                -7.375700
25%
        -0.868200
                                -0.669200
50%
         -0.234400
                                -0.094300
75%
          0.526200
                                 0.502400
          3.352500
                                 1.822400
max
std
          1.007580
                                 1.008075
```

[8 rows x 29 columns]

```
[24]: # Checking for missing values in the test dataset
missing_values_test = test_data.isnull().sum()

# Checking basic statistics of the test dataset
test_stats = test_data.describe()

# Display missing values in the console or Jupyter Notebook
print("Missing Values in Test Data:\n", missing_values_test)

# Display basic statistics of the test dataset
print("\nBasic Statistics of the Test Data:\n", test_stats)

# Display missing values as a DataFrame
pd.DataFrame(missing_values_test, columns=["Missing Values"])

# Display basic statistics for the test dataset
test_stats
```

Missing Values in Test Data:

Unnamed: 0	0
ID	0
Salary	0
DOJ	0
DOL	0
Designation	0
JobCity	0
Gender	0
DOB	0
10percentage	0
10board	0
12graduation	0
12percentage	0

12board	0
CollegeID	0
CollegeTier	0
Degree	0
Specialization	0
collegeGPA	0
CollegeCityID	0
CollegeCityTier	0
CollegeState	0
GraduationYear	0
English	0
Logical	0
Quant	0
Domain	0
ComputerProgramming	0
ElectronicsAndSemicon	0
ComputerScience	0
MechanicalEngg	0
ElectricalEngg	0
TelecomEngg	0
CivilEngg	0
conscientiousness	0
agreeableness	0
extraversion	0
nueroticism	0
openess_to_experience	0
-	

dtype: int64

Basic Statistics of the Test Data:

	ID		DOI	3 10percenta	ge 12graduation	\
count	1.500000e+03		1500	1500.00000	0 1500.000000	
mean	6.652863e+05	1990-12-20 01	:04:19.200000	78.38455	3 2008.122000	
min	7.474000e+03	1984-0	1-20 00:00:00	43.08000	0 2000.000000	
25%	3.350625e+05	1989-1	2-04 18:00:00	72.00000	0 2007.000000	
50%	6.419305e+05	1991-0	2-11 00:00:00	80.00000	0 2008.000000	
75%	9.858025e+05	1992-0	3-18 18:00:00	85.60000	0 2009.000000	
max	1.298259e+06	1995-1	2-28 00:00:00	97.60000	0 2013.000000	
std	3.605324e+05		NaN	9.56598	3 1.588542	
	12percentage	CollegeID	CollegeTier	collegeGPA	CollegeCityID \	\
count	1500.000000	1500.000000	1500.000000	1500.000000	1500.000000	
mean	74.947040	5202.454667	1.926667	71.615147	5202.454667	
min	40.830000	2.000000	1.000000	7.000000	2.000000	
25%	67.000000	830.000000	2.000000	67.147500	830.000000	
50%	75.000000	3879.000000	2.000000	72.000000	3879.000000	
75%	83.200000	8784.750000	2.000000	76.662500	8784.750000	
max	98.000000	17293.000000	2.000000	95.000000	17293.000000	
std	10.632432	4750.131676	0.260770	8.747405	4750.131676	

```
1500.000000
                                       1500.000000
                                                        1500.000000
                                                                          1500.000000
     count
                    0.278000
                                         84.992000
                                                           22.992667
                                                                            20.673333
     mean
                                                           -1.000000
     min
                    0.000000
                                         -1.000000
                                                                            -1.000000
     25%
                    0.000000
                                         -1.000000
                                                           -1.000000
                                                                            -1.000000
     50%
                    0.000000
                                         -1.000000
                                                           -1.000000
                                                                            -1.000000
     75%
                     1.000000
                                         -1.000000
                                                           -1.000000
                                                                            -1.000000
                     1.000000
                                        746.000000
                                                          653.000000
                                                                           676.000000
     max
     std
                    0.448163
                                        171.721189
                                                           99.572364
                                                                            98.467198
             TelecomEngg
                             CivilEngg
                                         conscientiousness
                                                              agreeableness
             1500.000000
                                                                1500.000000
                           1500.000000
                                                1500.000000
     count
     mean
               34.525333
                              3.997333
                                                  -0.038361
                                                                   0.183612
     min
               -1.000000
                             -1.000000
                                                  -3.508500
                                                                  -4.283100
     25%
               -1.000000
                             -1.000000
                                                                  -0.287100
                                                  -0.733500
     50%
               -1.000000
                             -1.000000
                                                   0.046400
                                                                   0.344800
     75%
               -1.000000
                             -1.000000
                                                   0.702700
                                                                   0.812800
              553.000000
                            548.000000
                                                   1.995300
                                                                   1.904800
     max
              106.704076
                             43.220335
                                                   1.021743
                                                                   0.858094
     std
             extraversion
                            nueroticism
                                          openess to experience
     count
              1500.000000
                            1500.000000
                                                     1500.000000
                 0.048418
                                                       -0.102384
     mean
                              -0.091588
     min
                -3.371300
                              -2.643000
                                                       -5.842800
     25%
                -0.598000
                              -0.868200
                                                       -0.669200
     50%
                 0.091400
                              -0.107600
                                                       -0.046350
     75%
                 0.672000
                               0.532330
                                                        0.502400
                 2.315400
                               3.061700
                                                        1.630200
     max
                 0.919562
                                1.010601
                                                        0.908886
     std
     [8 rows x 27 columns]
[24]:
                         ID
                                                      D<sub>0</sub>B
                                                           10percentage
                                                                           12graduation
      count
              1.500000e+03
                                                     1500
                                                            1500.000000
                                                                            1500.000000
      mean
              6.652863e+05
                             1990-12-20 01:04:19.200000
                                                               78.384553
                                                                            2008.122000
              7.474000e+03
                                     1984-01-20 00:00:00
                                                               43.080000
                                                                            2000.000000
      min
      25%
                                    1989-12-04 18:00:00
                                                              72.000000
                                                                            2007.000000
              3.350625e+05
      50%
              6.419305e+05
                                    1991-02-11 00:00:00
                                                               80.00000
                                                                            2008.000000
      75%
              9.858025e+05
                                    1992-03-18 18:00:00
                                                               85.600000
                                                                            2009.000000
                                    1995-12-28 00:00:00
              1.298259e+06
                                                               97.600000
                                                                            2013.000000
      max
      std
              3.605324e+05
                                                      NaN
                                                                9.565983
                                                                               1.588542
              12percentage
                                CollegeID
                                            CollegeTier
                                                           collegeGPA
                                                                        CollegeCityID
               1500.000000
                              1500.000000
                                            1500.000000
                                                          1500.000000
                                                                           1500.000000
      count
                              5202.454667
                                                                           5202.454667
      mean
                 74.947040
                                               1.926667
                                                            71.615147
                                 2.000000
                                               1.000000
                                                             7.000000
                                                                              2.000000
      min
                 40.830000
```

ComputerScience

MechanicalEngg

ElectricalEngg

CollegeCityTier

```
75%
                 83.200000
                             8784.750000
                                              2.000000
                                                           76.662500
                                                                         8784.750000
                 98.000000
                            17293.000000
                                              2.000000
                                                           95.000000
                                                                        17293.000000
      max
      std
                 10.632432
                             4750.131676
                                              0.260770
                                                            8.747405
                                                                         4750.131676
                                                    {\tt MechanicalEngg}
             CollegeCityTier
                                  ComputerScience
                                                                     ElectricalEngg
                  1500.000000
                                       1500.000000
                                                        1500.000000
                                                                         1500.000000
      count
                     0.278000
                                         84.992000
                                                          22.992667
                                                                           20.673333
      mean
      min
                     0.000000
                                         -1.000000
                                                          -1.000000
                                                                           -1.000000
      25%
                     0.000000
                                         -1.000000
                                                          -1.000000
                                                                           -1.000000
      50%
                                                          -1.000000
                     0.000000
                                         -1.000000
                                                                           -1.000000
      75%
                     1.000000
                                         -1.000000
                                                          -1.000000
                                                                           -1.000000
                     1.000000
                                        746.000000
                                                         653.000000
                                                                          676.000000
      max
                     0.448163
                                        171.721189
                                                          99.572364
                                                                           98.467198
      std
             TelecomEngg
                             CivilEngg
                                         conscientiousness
                                                             agreeableness
             1500.000000
                                                               1500.000000
      count
                           1500.000000
                                               1500.000000
               34.525333
                              3.997333
                                                 -0.038361
                                                                  0.183612
      mean
      min
               -1.000000
                             -1.000000
                                                 -3.508500
                                                                  -4.283100
      25%
               -1.000000
                             -1.000000
                                                 -0.733500
                                                                 -0.287100
      50%
               -1.000000
                             -1.000000
                                                                  0.344800
                                                   0.046400
      75%
               -1.000000
                             -1.000000
                                                  0.702700
                                                                  0.812800
      max
              553.000000
                            548.000000
                                                   1.995300
                                                                  1.904800
              106.704076
                             43.220335
      std
                                                   1.021743
                                                                  0.858094
             extraversion
                            nueroticism
                                          openess_to_experience
      count
              1500.000000
                            1500.000000
                                                     1500.000000
      mean
                 0.048418
                              -0.091588
                                                       -0.102384
                 -3.371300
                              -2.643000
                                                       -5.842800
      min
      25%
                -0.598000
                              -0.868200
                                                       -0.669200
      50%
                              -0.107600
                 0.091400
                                                       -0.046350
      75%
                 0.672000
                               0.532330
                                                        0.502400
      max
                  2.315400
                               3.061700
                                                        1.630200
                 0.919562
                               1.010601
                                                        0.908886
      std
      [8 rows x 27 columns]
[27]: import matplotlib.pyplot as plt
      import seaborn as sns
      # Data Cleaning: Replace '?' with NaN in test data and convert salary to_
       ⇔numeric in train data
      test_data.replace('?', pd.NA, inplace=True)
      train_data['Salary'] = pd.to_numeric(train_data['Salary'], errors='coerce')
```

2.000000

2.000000

67.147500

72.000000

830.000000

3879.000000

25%

50%

67.000000

75.000000

830.000000

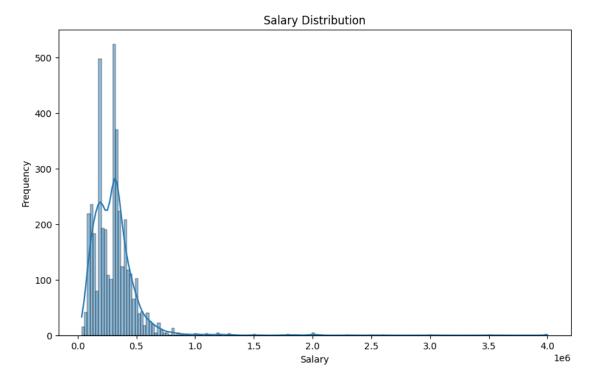
3879.000000

Dropping rows with NaN in Salary for the sake of univariate analysis

```
clean_train_data = train_data.dropna(subset=['Salary'])
```

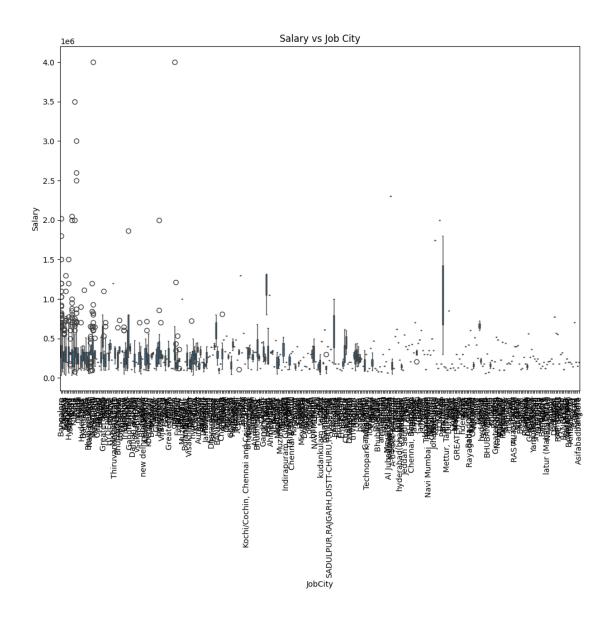
4 Univariate Analysis

```
[28]: # Univariate Analysis: Distribution of Salary
plt.figure(figsize=(10, 6))
sns.histplot(clean_train_data['Salary'], kde=True)
plt.title('Salary Distribution')
plt.xlabel('Salary')
plt.ylabel('Frequency')
plt.show()
```

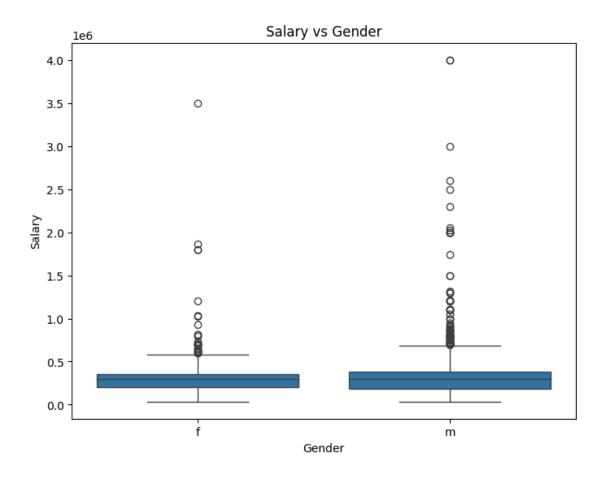


5 Bivariate Analysis

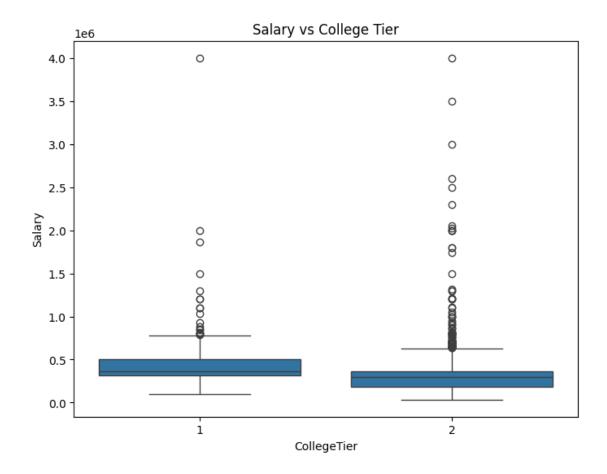
```
[29]: # Bivariate Analysis: Salary vs JobCity
plt.figure(figsize=(12, 8))
sns.boxplot(x='JobCity', y='Salary', data=clean_train_data)
plt.title('Salary vs Job City')
plt.xticks(rotation=90)
plt.show()
```



```
[30]: # Bivariate Analysis: Salary vs Gender
plt.figure(figsize=(8, 6))
sns.boxplot(x='Gender', y='Salary', data=clean_train_data)
plt.title('Salary vs Gender')
plt.show()
```

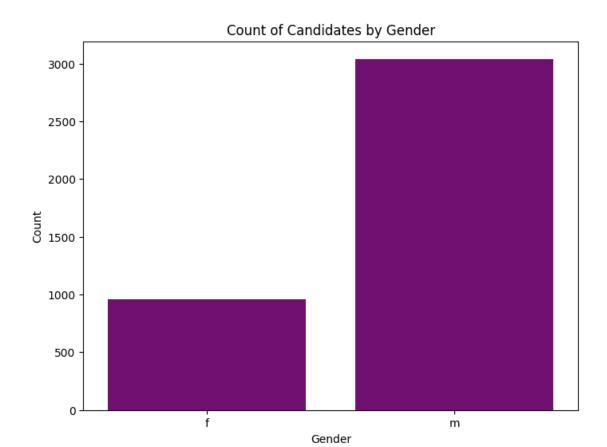


```
[31]: # Bivariate Analysis: Salary vs CollegeTier
plt.figure(figsize=(8, 6))
sns.boxplot(x='CollegeTier', y='Salary', data=clean_train_data)
plt.title('Salary vs College Tier')
plt.show()
```

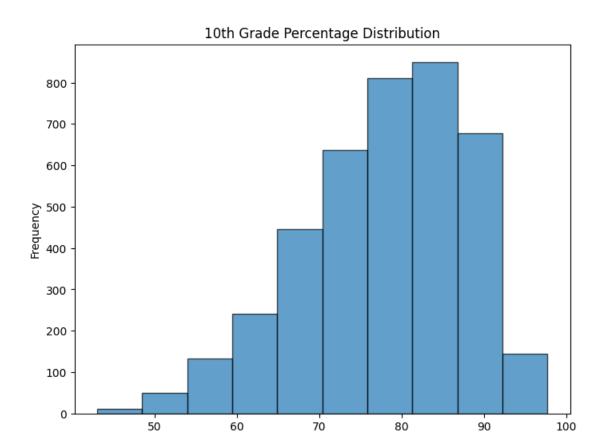


6 Different Types of Visualization

```
[32]: # Gender distribution
plt.figure(figsize=(8,6))
sns.countplot(x='Gender', data=clean_train_data, color='purple')
plt.title('Count of Candidates by Gender')
plt.xlabel('Gender')
plt.ylabel('Count')
plt.show()
```

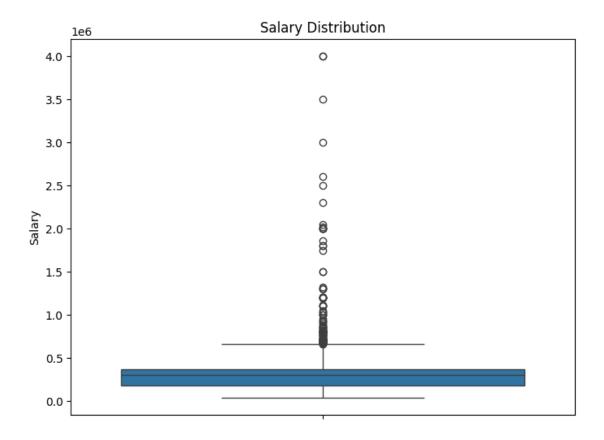


```
[33]: # Distribution of 10th Grade Percentage
plt.figure(figsize=(8,6))
plt.hist(clean_train_data['10percentage'], bins=10, edgecolor='k', alpha=0.7)
plt.title('10th Grade Percentage Distribution')
plt.xlabel('10th Percentage')
plt.ylabel('Frequency')
plt.show()
```

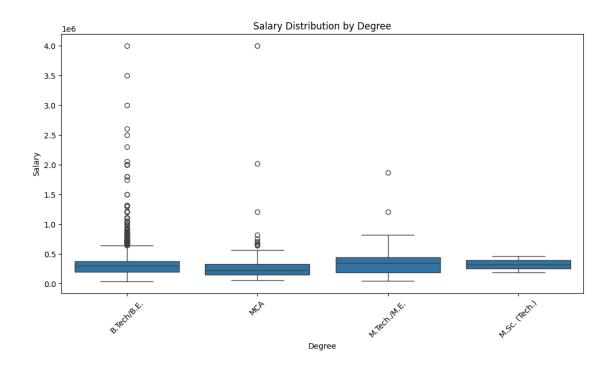


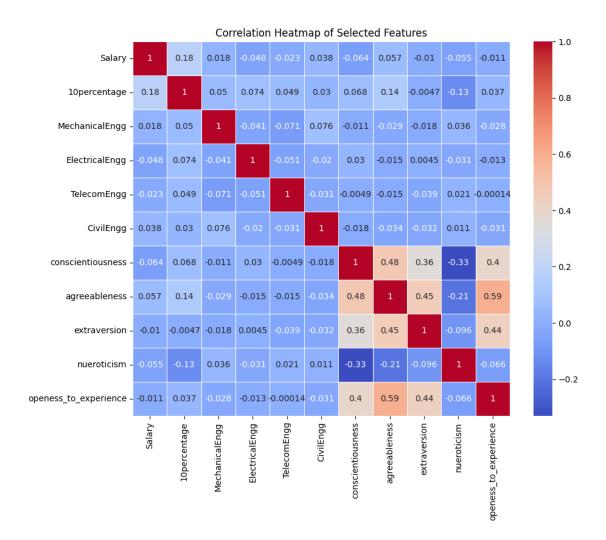
```
[34]: # Boxplot for Salary Distribution
plt.figure(figsize=(8,6))
sns.boxplot(clean_train_data['Salary'])
plt.title('Salary Distribution')
plt.show()
```

10th Percentage

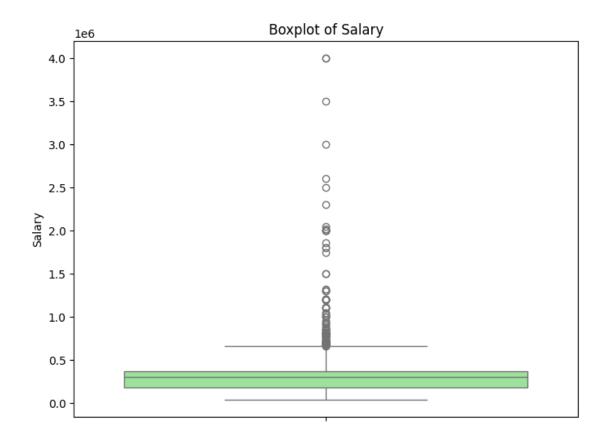


```
[35]: # Salary by Degree
plt.figure(figsize=(12,6))
sns.boxplot(data=clean_train_data, x="Degree", y='Salary')
plt.title("Salary Distribution by Degree")
plt.xticks(rotation=45)
plt.show()
```





```
[38]: # Boxplot of Salary
plt.figure(figsize=(8, 6))
sns.boxplot(clean_train_data['Salary'], color='lightgreen')
plt.title('Boxplot of Salary')
plt.show()
```

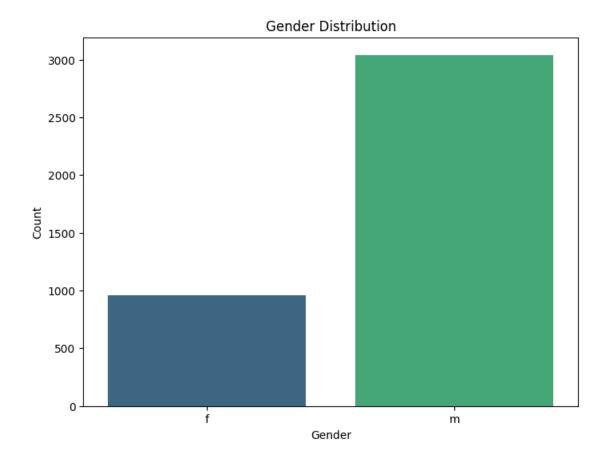


```
[39]: # Gender Distribution (Countplot)
plt.figure(figsize=(8, 6))
sns.countplot(x='Gender', data=clean_train_data, palette='viridis')
plt.title('Gender Distribution')
plt.xlabel('Gender')
plt.ylabel('Count')
plt.show()
```

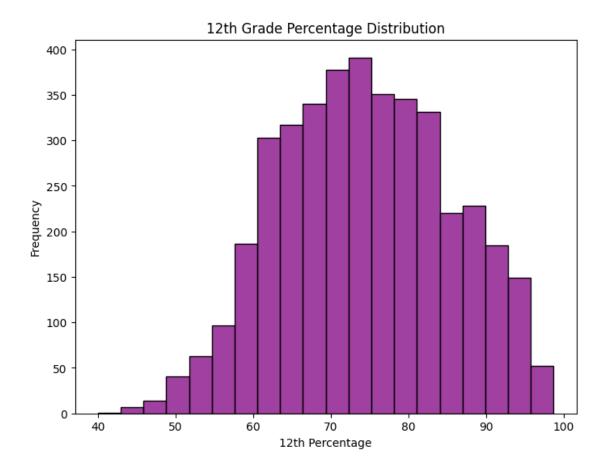
C:\Users\payal\AppData\Local\Temp\ipykernel_2116\4058931214.py:3: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set `legend=False` for the same effect.

sns.countplot(x='Gender', data=clean_train_data, palette='viridis')



```
[40]: # 12th Grade Percentage Distribution (Histogram)
plt.figure(figsize=(8, 6))
sns.histplot(clean_train_data['12percentage'], bins=20, color='purple')
plt.title('12th Grade Percentage Distribution')
plt.xlabel('12th Percentage')
plt.ylabel('Frequency')
plt.show()
```



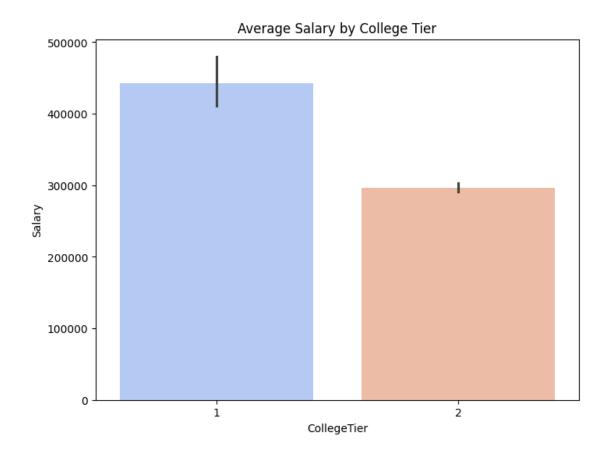
```
[41]: # Salary vs College Tier (Barplot)
plt.figure(figsize=(8, 6))
sns.barplot(data=clean_train_data, x="CollegeTier", y='Salary', estimator=np.

mean, palette='coolwarm')
plt.title('Average Salary by College Tier')
plt.show()
```

C:\Users\payal\AppData\Local\Temp\ipykernel_2116\1311747816.py:3: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set `legend=False` for the same effect.

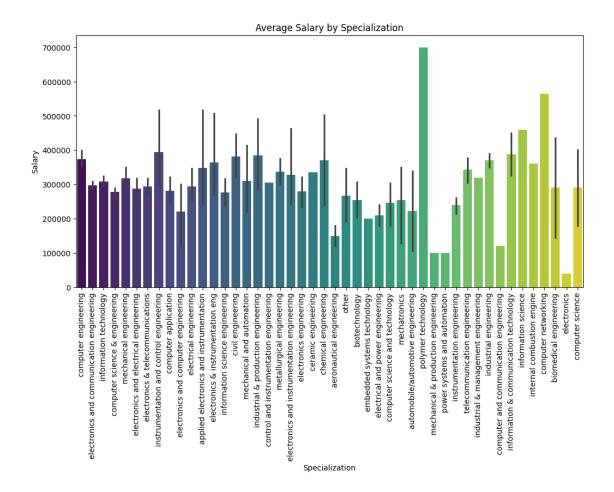
sns.barplot(data=clean_train_data, x="CollegeTier", y='Salary',
estimator=np.mean, palette='coolwarm')



C:\Users\payal\AppData\Local\Temp\ipykernel_2116\850905258.py:3: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set `legend=False` for the same effect.

sns.barplot(x='Specialization', y='Salary', data=clean_train_data,
estimator=np.mean, palette='viridis')



```
[45]: # Scatter Plot of Salary vs College GPA

plt.figure(figsize=(10, 6))

sns.scatterplot(data=clean_train_data, x='collegeGPA', y='Salary', color='b',u

dedgecolor='black')

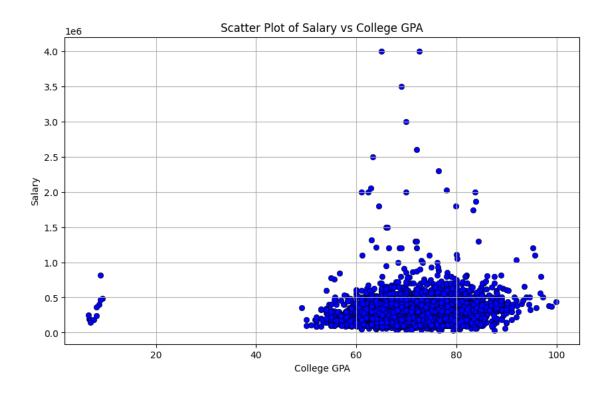
plt.title('Scatter Plot of Salary vs College GPA')

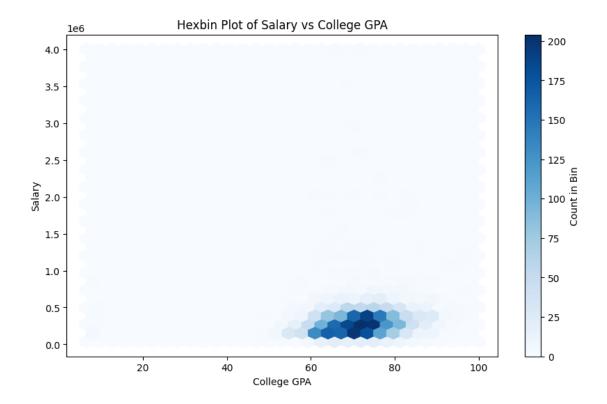
plt.xlabel('College GPA')

plt.ylabel('Salary')

plt.grid(True)

plt.show()
```





```
[47]: # Pair Plot of Numerical Columns

numerical_columns = ['Salary', '10percentage', '12percentage', 'collegeGPA',

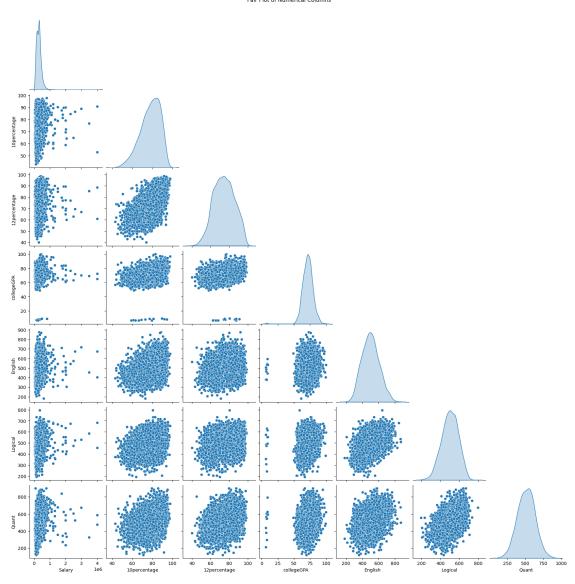
'English', 'Logical', 'Quant']

sns.pairplot(clean_train_data[numerical_columns], diag_kind='kde', corner=True)

plt.suptitle('Pair Plot of Numerical Columns', y=1.02)

plt.show()
```

Pair Plot of Numerical Columns



```
[48]: # Correlation Heatmap of Key Features

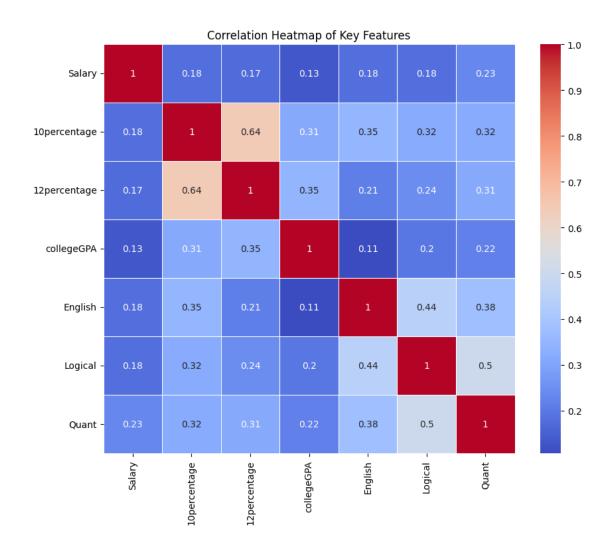
plt.figure(figsize=(10, 8))

sns.heatmap(clean_train_data[numerical_columns].corr(), annot=True,

→cmap='coolwarm', linewidths=0.5)

plt.title('Correlation Heatmap of Key Features')

plt.show()
```



```
[51]: # Salary vs Designation (Swarm Plot)
plt.figure(figsize=(12, 6))
sns.swarmplot(x='Designation', y='Salary', data=clean_train_data,
palette='tab10')
plt.title('Salary vs Designation (Swarm Plot)')
plt.xticks(rotation=90)
plt.show()
```

C:\Users\payal\AppData\Local\Temp\ipykernel_2116\975783360.py:3: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set `legend=False` for the same effect.

```
sns.swarmplot(x='Designation', y='Salary', data=clean_train_data,
palette='tab10')
```

```
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 20.0% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 88.5% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 94.9% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 88.9% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 64.3% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 98.0% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 93.7% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 57.1% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 73.9% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 96.1% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 50.0% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 88.6% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
 warnings.warn(msg, UserWarning)
```

```
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 78.6% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 82.8% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 92.2% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 69.2% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 25.0% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 66.7% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 98.1% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 95.7% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 63.6% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 80.8% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 61.5% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 75.0% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
 warnings.warn(msg, UserWarning)
```

```
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 33.3% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 89.1% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 84.2% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 97.7% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 88.2% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 79.3% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 60.0% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 91.3% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 87.0% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 94.1% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 91.2% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 94.0% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
 warnings.warn(msg, UserWarning)
```

```
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 83.0% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 90.8% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 89.8% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 93.0% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 87.9% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 86.7% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 58.8% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 80.6% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 85.7% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 96.3% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 77.3% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 62.5% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
 warnings.warn(msg, UserWarning)
```

```
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 80.0% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 40.0% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 55.6% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 76.9% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 71.4% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 83.3% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 77.8% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 81.8% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 87.5% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 84.6% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 82.4% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 56.2% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
 warnings.warn(msg, UserWarning)
```

```
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 42.9% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 90.0% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 64.7% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 72.7% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 53.3% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 70.0% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 28.6% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 16.7% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
  warnings.warn(msg, UserWarning)
C:\Users\payal\AppData\Local\Programs\Python\Python311\Lib\site-
packages\seaborn\categorical.py:3399: UserWarning: 92.0% of the points cannot be
placed; you may want to decrease the size of the markers or use stripplot.
```

warnings.warn(msg, UserWarning)

