```
# import libraries
import os
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
FILE_PATH = r"/content/ai_job_dataset.csv"
# 1. Load the AI job dataset
df = pd.read_csv(FILE_PATH)
print("Loaded:", FILE_PATH)
Loaded: /content/ai_job_dataset.csv
      Shape: (15000, 19)
          job_id
                                    job_title salary_usd salary_currency \

        0
        AIO0001
        AI Research Scientist
        90376
        USD

        1
        AIO0002
        AI Software Engineer
        61895
        USD

        2
        AIO0003
        AI Specialist
        152626
        USD

        3
        AIO0004
        NLP Engineer
        80215
        USD

        4
        AIO0005
        AI Consultant
        54624
        EUR

        experience_level employment_type company_location company_size \
      0
                       SE CT China M
                                             CT
      1
                         ΕN
                                                            Canada
      2
                         MI
                                             FL
                                                       Switzerland
                                                      India
                         SE
                                             FL
                                            PT
                                                             France
      4
                         ΕN
        employee_residence remote_ratio \
             China
Ireland
                                 50
                                            100
      1
      2
                 South Korea
                                            a
                    India
                                            100
      4
                   Singapore
                                                 required_skills education_required \
         Tableau, PyTorch, Kubernetes, Linux, NLP Bachelor
Deep Learning, AWS, Mathematics, Python, Docker Master
      0
             Kubernetes, Deep Learning, Java, Hadoop, NLP
Scala, SQL, Linux, Python
MLOps, Java, Tableau, Python
                                                                              PhD
Master
      3
      4
                                 industry posting_date application_deadline \
          years_experience
                               Automotive 2024-10-18 2024-11-07

        Media
        2024-11-20

        Education
        2025-03-18

        Consulting
        2024-12-23

        Media
        2025-04-15

                                                                         2025-01-11
      1
                           1
                                                                         2025-04-07
                                                                       2025-06-23
                            0
      4
          job_description_length benefits_score
                                                               company_name
      0
                               1076 5.9 Smart Analytics
                                                    5.2
      1
                                1268
                                                              TechCorp Inc
                                                           Autonomous Tech
                                1974
                                                   9.4
                                                 8.6 Future Systems
6.6 Advanced Robotics
      3
                                1345
                                                            Future Systems
                                1989
      4
print("Shape:", df.shape)
→ Shape: (15000, 19)
print(df.head(5))
                          job_title salary_usd salary_currency \
           job id
      0 AI00001 AI Research Scientist 90376 USD
                                                       61895
      1 AI00002 AI Software Engineer
                      AI Software Engineer 61895
AI Specialist 152626
                                                                            USD
      2 AI00003
                              NLP Engineer 80215
AI Consultant 54624
      3 AI00004
                                                                            USD
      4 AI00005
                             AI Consultant
                                                      54624
        experience_level employment_type company_location company_size \
                              CT
                                                             China
      0
                         SE
                                             CT
                                                             Canada
                         MΙ
                                             FL
                                                       Switzerland
      2
                                                                                    L
      3
                         SE
                                             FL
                                                              India
```

```
employee_residence remote_ratio \
    0
                  China
                                   50
                 Ireland
                                   100
    1
             South Korea
                                    0
    3
                  India
                                    50
                                   100
    4
               Singapore
                                      required_skills education_required \
    0
              Tableau, PyTorch, Kubernetes, Linux, NLP
                                                                Bachelor
       Deep Learning, AWS, Mathematics, Python, Docker
    1
                                                                  Master
          Kubernetes, Deep Learning, Java, Hadoop, NLP
                                                               Associate
                            Scala, SQL, Linux, Python
                                                                   PhD
    3
                          MLOps, Java, Tableau, Python
                                                                  Master
    4
       years_experience
                           industry posting_date application_deadline \
    0
                        Automotive
                                     2024-10-18
                                                          2024-11-07
                      9
                                                          2025-01-11
    1
                      1
                            Media
                                     2024-11-20
                          Education
                                      2025-03-18
                                                          2025-04-07
    3
                         Consulting
                                     2024-12-23
                                                          2025-02-24
                                     2025-04-15
                                                          2025-06-23
    4
                      0
                              Media
       job_description_length benefits_score
                                                   company_name
                                         5.9
    0
                        1076
                                                Smart Analytics
    1
                         1268
                                         5.2
                                                   TechCorp Inc
                         1974
                                         9.4
                                                 Autonomous Tech
                         1345
                                         8.6
                                                 Future Systems
    3
                                         6.6 Advanced Robotics
    4
                         1989
print(df.tail(5))
            job_id
                                     job_title salary_usd salary_currency \
    14995 AI14996
                             Robotics Engineer
                                                     38604
                                                                       USD
    14996 AT14997
                                                     57811
                    Machine Learning Researcher
                                                                       GBP
    14997 AI14998
                                  NLP Engineer
                                                     189490
                                                                       USD
                                                     79461
    14998 AI14999
                                    Head of AI
                                                                       EUR
    14999 AI15000
                       Computer Vision Engineer
                                                     56481
                                                                       USD
          experience_level employment_type company_location company_size
    14995
                       EN
                                       FL Finland
    14996
                        ΕN
                                        CT
                                            United Kingdom
                                                                      Μ
    14997
                        FΧ
                                        СТ
                                               South Korea
                                               Netherlands
    14998
                        ΕN
                                        FT
    14999
                                        РΤ
                                                   Austria
                        МТ
          employee_residence remote_ratio \
    14995
                    Finland
                                        50
              United Kingdom
    14996
                                        0
    14997
                 South Korea
                                        50
    14998
                 Netherlands
                                        0
    14999
                     Austria
                                        50
                                         required_skills education_required \
    14995
                                 Java, Kubernetes, Azure
                                                                  Bachelor
    14996
                 Mathematics, Docker, SQL, Deep Learning
                                                                   Master
    14997
                                      Scala, Spark, NLP
                                                                 Associate
               Java, Computer Vision, Python, TensorFlow
    14998
                                                                   PhD
    14999
           Scala, Azure, Deep Learning, GCP, Mathematics
                                 industry posting_date application_deadline
           years_experience
                                  Energy 2025-02-06
                                                                 2025-03-25
    14995
                         1
    14996
                          0
                                Government
                                            2024-10-16
                                                                 2024-10-30
    14997
                         17 Manufacturing
                                            2024-03-19
                                                                 2024-05-02
    14998
                               Real Estate
                                            2024-03-22
                                                                 2024-04-23
                          1
                                                                 2024-08-10
    14999
                          2
                               Technology
                                            2024-07-18
           job_description_length benefits_score
                                                       company name
    14995
                                             7.9
                                                  Advanced Robotics
                             1635
    14996
                             1624
                                             8.2
                                                    Smart Analytics
    14997
                                                     AI Innovations
                             1336
                                             7.4
    14998
                             1935
                                             5.6
                                                    Smart Analytics
    14999
                             2492
                                             7.6
                                                     AI Innovations
# 2. Drop any column with more than 50% missing values
threshold = len(df) * 0.5
df = df.loc[:, df.isnull().sum() < threshold]</pre>
# 3. Fill missing values
null_counts = df.isnull().sum()
```

РΤ

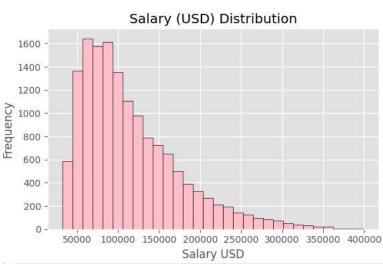
France

ΕN

4

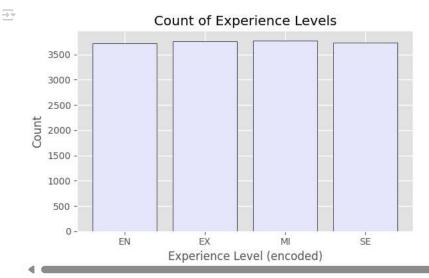
```
print("Null values per column:")
print(null counts[null counts > 0])
Null values per column:
     Series([], dtype: int64)
#Find total number of rows that are completely duplicated
dup_count = df.duplicated().sum()
print(f"\nTotal duplicate rows: {dup count}")
     Total duplicate rows: 0
# Save the cleaned data (optional)
df.to_csv('ai_job_dataset_cleaned.csv', index=False)
print("Cleaned data saved to ai_job_dataset_cleaned.csv\n")
Cleaned data saved to ai_job_dataset_cleaned.csv
# Visualizations (matplotlib only)
import matplotlib.pyplot as plt
# Using a valid matplotlib style, for example 'ggplot'
plt.style.use('ggplot')
# Group by job title and compute average salary
avg_salary_by_job = df.groupby('job_title')['salary_usd'].mean().reset_index()
print(avg_salary_by_job.head())
                    job_title
                                 salary_usd
                AI Architect 117436.513619
               AI Consultant 113671.870739
          AI Product Manager 114680.909825
     3 AI Research Scientist 117897.925926
     4 AI Software Engineer 114273.201531
# Sample job category table
job_category = pd.DataFrame({
    'job_title': df['job_title'].unique()[:5], # simulate a lookup table
    'category': ['Data', 'ML', 'Analytics', 'Engineering', 'DevOps']
})
# Merge based on job_title
merged_df = pd.merge(df, job_category, on='job_title', how='left')
print(merged_df[['job_title', 'category']].head())
\overrightarrow{\Rightarrow}
                    job_title
                                  category
     0 AI Research Scientist
                                      Data
        AI Software Engineer
                                       MI
               AI Specialist
                                 Analytics
                NLP Engineer Engineering
     3
                AI Consultant
     4
                                    Dev0ps
# Create a dummy stats DataFrame with index = experience_level
stats = df.groupby('experience_level')['salary_usd'].mean().to_frame('avg_exp_salary')
# Join using index
joined_df = df.set_index('experience_level').join(stats)
print(joined_df[['salary_usd', 'avg_exp_salary']].head())
                       salary_usd avg_exp_salary
     experience_level
                            90376
                                    122187.657845
     EN
                            61895
                                     63133.377084
     MI
                           152626
                                     87955.471833
     SE
                            80215
                                    122187.657845
                                    63133.377084
     ΕN
                            54624
# Take two pieces of df and stack them
top rows = df.head(3)
bottom_rows = df.tail(3)
vertical_concat = pd.concat([top_rows, bottom_rows], axis=0)
```

```
print(vertical_concat)
                                job_title salary_usd salary_currency \
          AI00001
                     AI Research Scientist 90376
                      AI Software Engineer
          AI00002
                                               61895
    1
                                                                LISD
          AI00003
                           AI Specialist
                                              152626
                                                                USD
    14997 AI14998
                             NLP Engineer
                                                                USD
                                              189490
                              Head of AI
    14998 AT14999
                                              79461
                                                                FUR
    14999 AI15000 Computer Vision Engineer 56481
                                                                USD
          experience_level employment_type company_location company_size
    P
                      SE
                                  CT China M
    1
                       ΕN
                                     СТ
                                                 Canada
                      MΙ
                                     FL
                                            Switzerland
    2
                                     CT
                                            South Korea
                                                                 L
    14997
                      FX
    14998
                      EN
                                     FT
                                            Netherlands
                                                                 Μ
    14999
                      MI
                                               Austria
          employee_residence remote_ratio \
            China
Ireland
    1
                South Korea
    2
                                     a
    14997
                South Korea
    14998
                Netherlands
                                      0
    14999
                  Austria
                                     50
                                        required_skills education_required \
                 Tableau, PyTorch, Kubernetes, Linux, NLP Bachelor
    0
    1
          Deep Learning, AWS, Mathematics, Python, Docker
                                                                Master
             Kubernetes, Deep Learning, Java, Hadoop, NLP
                                                               Associate
    14997
                                  Scala, Spark, NLP
                                                              Associate
                                                              PhD
    14998
                Java, Computer Vision, Python, TensorFlow
    14999
            Scala, Azure, Deep Learning, GCP, Mathematics
          years_experience
                               industry posting_date application_deadline \
    0
                       9
                              Automotive 2024-10-18 2024-11-07
                              Media
                                         2024-11-20
                                                             2025-01-11
                       2 Education 2025-03-18
17 Manufacturing 2024-03-19
                                                           2025-04-07
2024-05-02
    2
    14997
    14998
                       1 Real Estate 2024-03-22
                                                            2024-04-23
    14999
                             Technology 2024-07-18
                                                             2024-08-10
           job_description_length benefits_score
                                                 company_name
                                 5.9 Smart Analytics
    0
    1
                           1268
                                          5.2 TechCorp Inc
                           1974
                                          9.4 Autonomous Tech
    2
    14997
                           1336
                                          7.4 AI Innovations
                                         5.6 Smart Analytics
    14998
                           1935
    14999
                           2492
                                         7.6 AI Innovations
# Plot 1: Histogram of salary usd
plt.figure(figsize=(6,4))
plt.hist(df['salary_usd'], bins=30, color='pink', edgecolor='black')
plt.title('Salary (USD) Distribution')
plt.xlabel('Salary USD')
plt.ylabel('Frequency')
plt.tight_layout()
plt.show()
```

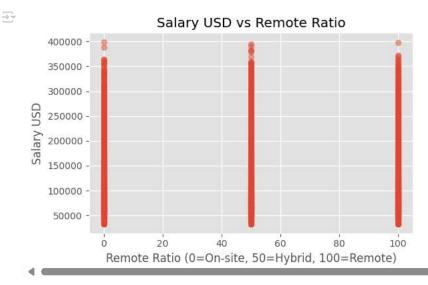


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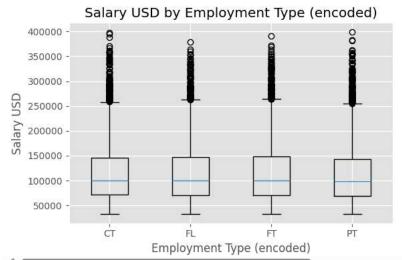
```
# Plot 2: Bar chart of experience_level counts
exp_counts = df['experience_level'].value_counts().sort_index()
plt.figure(figsize=(6,4))
plt.bar(exp_counts.index.astype(str), exp_counts.values,color = "lavender", edgecolor='black')
plt.title('Count of Experience Levels')
plt.xlabel('Experience Level (encoded)')
plt.ylabel('Count')
plt.tight_layout()
plt.show()
```



```
# Plot 3: Scatter plot salary_usd vs remote_ratio
plt.figure(figsize=(6,4))
plt.scatter(df['remote_ratio'], df['salary_usd'], alpha=0.5)
plt.title('Salary USD vs Remote Ratio')
plt.xlabel('Remote Ratio (0=On-site, 50=Hybrid, 100=Remote)')
plt.ylabel('Salary USD')
plt.tight_layout()
plt.show()
```



```
# Plot 4: Boxplot of salary_usd by employment_type
empl_codes = sorted(df['employment_type'].unique())
data_for_box = [df[df['employment_type']==code]['salary_usd'] for code in empl_codes]
plt.figure(figsize=(6,4))
plt.boxplot(data_for_box, labels=[str(code) for code in empl_codes])
plt.title('Salary USD by Employment Type (encoded)')
plt.xlabel('Employment Type (encoded)')
plt.ylabel('Salary USD')
plt.tight_layout()
plt.show()
```



```
# 7. Correlation Heatmap: numeric features
plt.figure(figsize=(8,6))
num_cols = df.select_dtypes(include=['number']).columns.tolist()
corr = df[num_cols].corr()
im = plt.imshow(corr, cmap='viridis', aspect='auto')
plt.colorbar(im, fraction=0.046, pad=0.04)
plt.xticks(range(len(num_cols)), num_cols, rotation=90)
plt.yticks(range(len(num_cols)), num_cols)
plt.title('Correlation Matrix Heatmap')
plt.tight_layout()
plt.show()
```

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