milestone 1

April 15, 2024

```
[]: from google.colab import drive
     drive.mount('/content/drive')
    Drive already mounted at /content/drive; to attempt to forcibly remount, call
    drive.mount("/content/drive", force_remount=True).
[]: # !pip install ucimlrepo
     # from ucimlrepo import fetch_ucirepo
     # # fetch dataset
     # adult = fetch_ucirepo(id=2)
     # # data (as pandas dataframes)
     # X = adult.data.features
     # y = adult.data.targets
     # # metadata
     # print(adult.metadata)
     # # variable information
     # print(adult.variables)
[]: !pip install squarify
    Requirement already satisfied: squarify in /usr/local/lib/python3.10/dist-
    packages (0.4.3)
[]: import pandas as pd
     import numpy as np
     import matplotlib.pyplot as plt
     db_file_path = '/content/drive/MyDrive/Colab Notebooks/adult.data'
[ ]: data = pd.read_csv(db_file_path)
     data.columns =
      →['age','workclass','fnlwgt','education','education-num','marital-status','occupation','rela
```

[]: print(data.info())

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 32560 entries, 0 to 32559
Data columns (total 15 columns):

#	Column	Non-Null Count	Dtype				
0	age	32560 non-null	int64				
1	workclass	32560 non-null	object				
2	fnlwgt	32560 non-null	int64				
3	education	32560 non-null	object				
4	education-num	32560 non-null	int64				
5	marital-status	32560 non-null	object				
6	occupation	32560 non-null	object				
7	relationship	32560 non-null	object				
8	race	32560 non-null	object				
9	sex	32560 non-null	object				
10	capital-gain	32560 non-null	int64				
11	capital-loss	32560 non-null	int64				
12	hours-per-week	32560 non-null	int64				
13	native-country	32560 non-null	object				
14	income	32560 non-null	object				
dtypes: int64(6), object(9)							

dtypes: int64(6), object(9)

memory usage: 3.7+ MB

None

[]: data.describe()

[]:		age	fnlwgt	education-num	capital-gain	capital-loss	\
	count	32560.000000	3.256000e+04	32560.000000	32560.000000	32560.000000	
	mean	38.581634	1.897818e+05	10.080590	1077.615172	87.306511	
	std	13.640642	1.055498e+05	2.572709	7385.402999	402.966116	
	min	17.000000	1.228500e+04	1.000000	0.000000	0.000000	
	25%	28.000000	1.178315e+05	9.000000	0.000000	0.000000	
	50%	37.000000	1.783630e+05	10.000000	0.000000	0.000000	
	75%	48.000000	2.370545e+05	12.000000	0.000000	0.000000	
	max	90.000000	1.484705e+06	16.000000	99999,000000	4356,000000	

hours-per-week count 32560.000000 mean 40.437469 std 12.347618 min 1.000000

```
25% 40.000000
50% 40.000000
75% 45.000000
max 99.000000
```

```
[]: # Filter data for people earning less than 50K
low_income = data[data["income"] == "<=50K"]

print("Number of records in low_income:", len(low_income))</pre>
```

Number of records in low_income: 24719

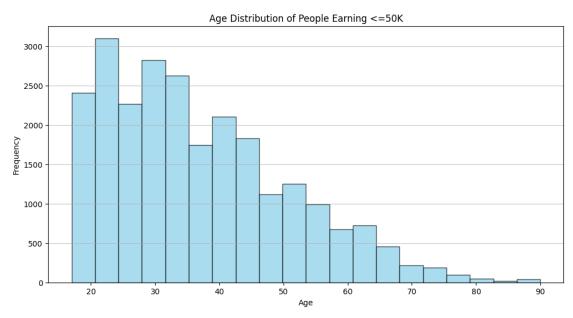
```
[]: print(data["income"].unique())
```

['<=50K' '>50K']

AGE

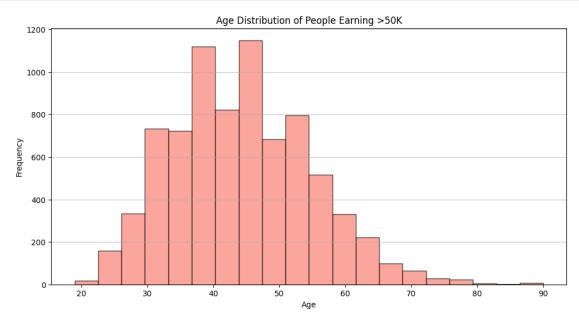
```
[]: # Filter data for people earning less than 50K
low_income = data[data["income"] == "<=50K"]

# Plot age distribution
plt.figure(figsize=(12, 6))
plt.hist(low_income["age"], bins=20, color='skyblue', edgecolor='black', used alpha=0.7)
plt.xlabel("Age")
plt.ylabel("Frequency")
plt.title("Age Distribution of People Earning <=50K")
plt.grid(axis='y', alpha=0.75)
plt.show()</pre>
```



```
[]: # Filter data for people earning more than 50K
high_income = data[data["income"] == ">50K"]

# Plot age distribution
# Plotting the relationship between age and income for income > 50K
plt.figure(figsize=(12, 6))
plt.hist(high_income["age"], bins=20, color='salmon', edgecolor='black',
alpha=0.7)
plt.xlabel("Age")
plt.ylabel("Frequency")
plt.ylabel("Frequency")
plt.title("Age Distribution of People Earning >50K")
plt.grid(axis='y', alpha=0.75)
plt.show()
```

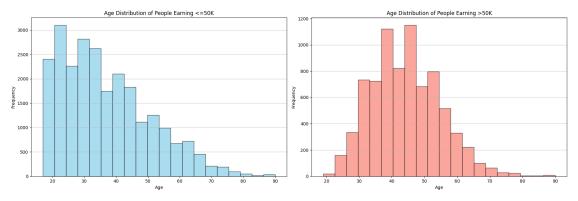


```
[]: # Create a figure and axis
fig, (ax1, ax2) = plt.subplots(1, 2, figsize=(18, 6))

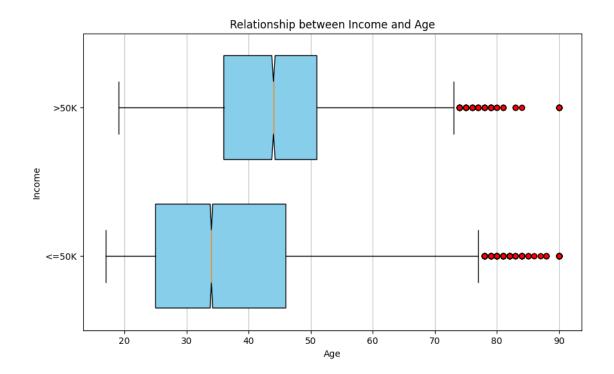
# Plot age distribution for income <=50K
ax1.hist(low_income["age"], bins=20, color='skyblue', edgecolor='black',ualpha=0.7)
ax1.set_xlabel("Age")
ax1.set_ylabel("Frequency")
ax1.set_title("Age Distribution of People Earning <=50K")
ax1.grid(axis='y', alpha=0.75)</pre>
```

```
# Plot age distribution for income >50K
ax2.hist(high_income["age"], bins=20, color='salmon', edgecolor='black',
alpha=0.7)
ax2.set_xlabel("Age")
ax2.set_ylabel("Frequency")
ax2.set_title("Age Distribution of People Earning >50K")
ax2.grid(axis='y', alpha=0.75)

# Display the plots
plt.tight_layout()
plt.show()
```



```
[]: import matplotlib.pyplot as plt
     # Create a boxplot to show the relationship between income and age
     plt.figure(figsize=(10, 6))
     plt.boxplot([low_income["age"], high_income["age"]],
                 labels=["<=50K", ">50K"], patch_artist=True, notch=True,
      ⇔vert=False, widths=0.7,
                 boxprops=dict(facecolor="skyblue", color="black"),
                 whiskerprops=dict(color="black"),
                 capprops=dict(color="black"),
                 flierprops=dict(marker='o', markerfacecolor='red', markersize=6,__
      ⇔linestyle='none'))
     plt.xlabel("Age")
     plt.ylabel("Income")
     plt.title("Relationship between Income and Age")
     plt.grid(axis='x', alpha=0.75)
     plt.show()
```

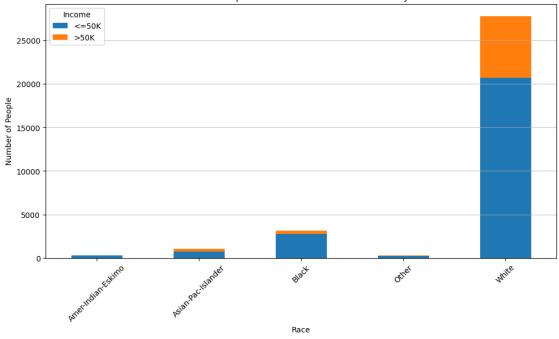


RACE

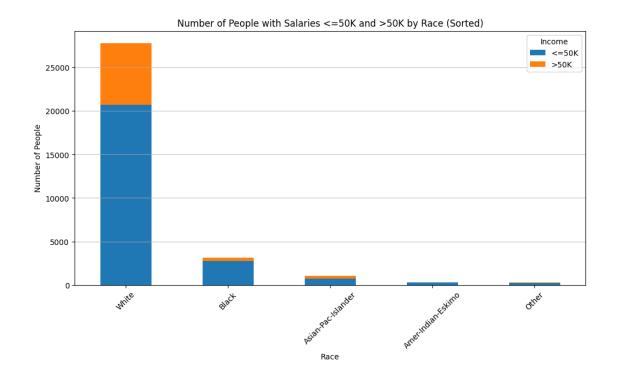
```
[]: # Print the different values of the "race" column print(data["race"].unique())
```

['White' 'Black' 'Asian-Pac-Islander' 'Amer-Indian-Eskimo' 'Other']



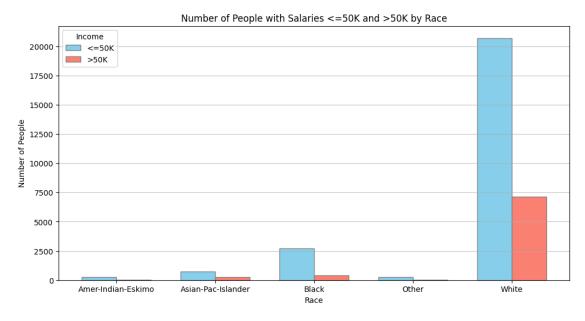


```
[]: # Group the data by race and income, and count the number of individuals in
      ⇔each group
     race_income_counts = data.groupby(["race", "income"]).size().unstack().fillna(0)
     # Calculate the total number of people for each race
     race_income_counts["Total"] = race_income_counts.sum(axis=1)
     # Sort the DataFrame by the total number of people
     race_income_counts_sorted = race_income_counts.sort_values(by="Total",_
      ⇔ascending=False).drop("Total", axis=1)
     # Create a bar plot
     race_income_counts_sorted.plot(kind="bar", stacked=True, figsize=(12, 6))
     plt.xlabel("Race")
     plt.ylabel("Number of People")
     plt.title("Number of People with Salaries <=50K and >50K by Race (Sorted)")
     plt.legend(title="Income", labels=["<=50K", ">50K"])
     plt.xticks(rotation=45)
     plt.grid(axis='y', alpha=0.75)
     plt.show()
```

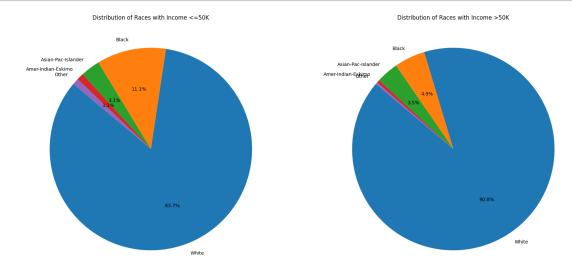


```
[]: # Group the data by race and income, and count the number of individuals in_
     ⇔each group
     race_income_counts = data.groupby(["race", "income"]).size().unstack().fillna(0)
     # Get the races and income categories
     races = race_income_counts.index
     income_categories = race_income_counts.columns
     # Set the bar width
     bar_width = 0.35
     # Set the positions of the bars on the x-axis
     r1 = np.arange(len(races))
     r2 = [x + bar_width for x in r1]
     # Create the grouped bar chart
     plt.figure(figsize=(12, 6))
     plt.bar(r1, race_income_counts["<=50K"], color='skyblue', width=bar_width,
      ⇔edgecolor='grey', label='<=50K')</pre>
     plt.bar(r2, race_income_counts[">50K"], color='salmon', width=bar_width,
      ⇔edgecolor='grey', label='>50K')
     # Add labels, title, and legend
     plt.xlabel('Race')
```

```
plt.ylabel('Number of People')
plt.title('Number of People with Salaries <=50K and >50K by Race')
plt.xticks([r + bar_width/2 for r in range(len(races))], races)
plt.legend(title="Income", labels=["<=50K", ">50K"])
plt.grid(axis='y', alpha=0.75)
plt.show()
```







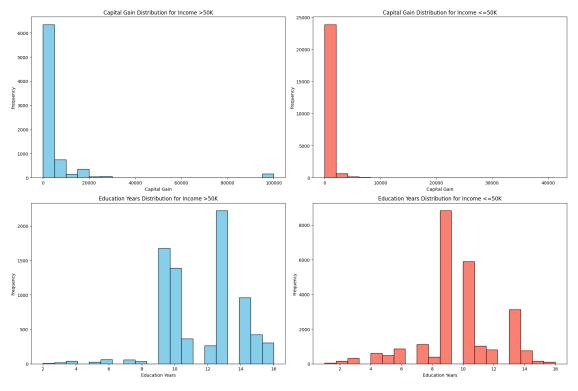
Distribution of capital gain and education years

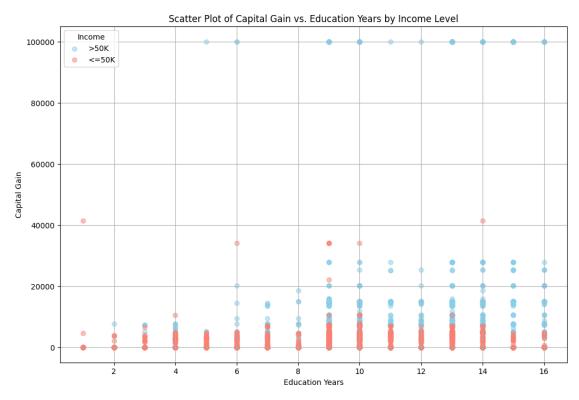
```
[]: # Filter data for people earning more than 50K
     high_income = data[data["income"] == ">50K"]
     # Filter data for people earning less than or equal to 50K
     low_income = data[data["income"] == "<=50K"]</pre>
     # Create a figure with two subplots
     fig, axs = plt.subplots(2, 2, figsize=(18, 12))
     # Plot for capital gain of people earning more than 50K
     axs[0, 0].hist(high_income["capital-gain"], bins=20, color='skyblue',_
      →edgecolor='black')
     axs[0, 0].set_title("Capital Gain Distribution for Income >50K")
     axs[0, 0].set_xlabel("Capital Gain")
     axs[0, 0].set_ylabel("Frequency")
     # Plot for capital gain of people earning less than or equal to 50K
     axs[0, 1].hist(low_income["capital-gain"], bins=20, color='salmon',_
      →edgecolor='black')
     axs[0, 1].set_title("Capital Gain Distribution for Income <=50K")</pre>
     axs[0, 1].set_xlabel("Capital Gain")
     axs[0, 1].set_ylabel("Frequency")
     # Plot for education years of people earning more than 50K
```

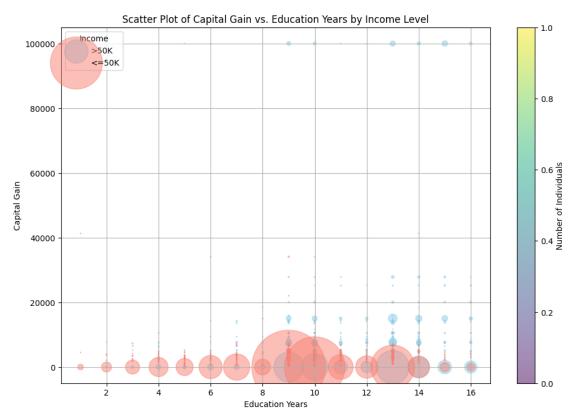
```
axs[1, 0].hist(high_income["education-num"], bins=20, color='skyblue',
edgecolor='black')
axs[1, 0].set_title("Education Years Distribution for Income >50K")
axs[1, 0].set_xlabel("Education Years")
axs[1, 0].set_ylabel("Frequency")

# Plot for education years of people earning less than or equal to 50K
axs[1, 1].hist(low_income["education-num"], bins=20, color='salmon',
edgecolor='black')
axs[1, 1].set_title("Education Years Distribution for Income <=50K")
axs[1, 1].set_xlabel("Education Years")
axs[1, 1].set_ylabel("Frequency")

plt.tight_layout()
plt.show()</pre>
```







hours worked per week, marital status, and number of years of education vs income

```
[]: import matplotlib.pyplot as plt import numpy as np

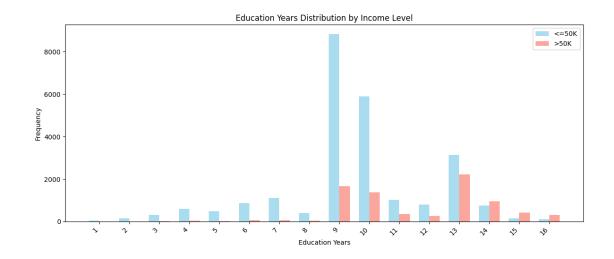
# Filter data for individuals earning less than or equal to $50,000 per year
```

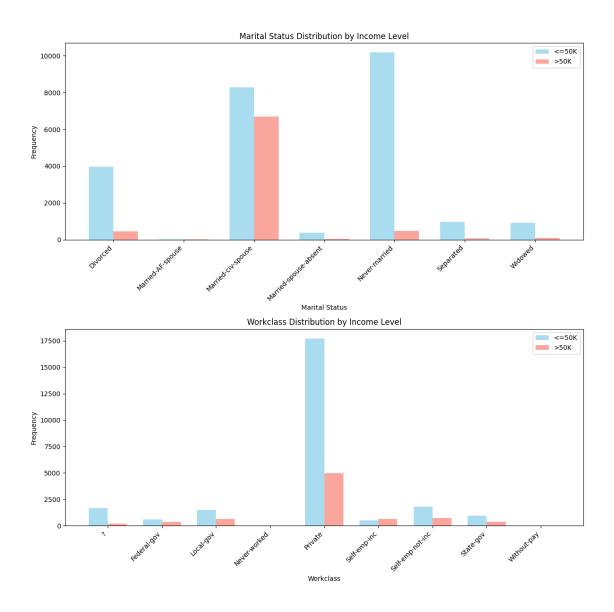
```
low_income_data = data[data["income"] == "<=50K"]</pre>
high_income_data = data[data["income"] == ">50K"]
# Get unique categories for education, marital status, and workclass
education_categories = np.union1d(low_income_data["education-num"].unique(),_u
 ⇔high_income_data["education-num"].unique())
marital_status_categories = np.union1d(low_income_data["marital-status"].

¬unique(), high_income_data["marital-status"].unique())

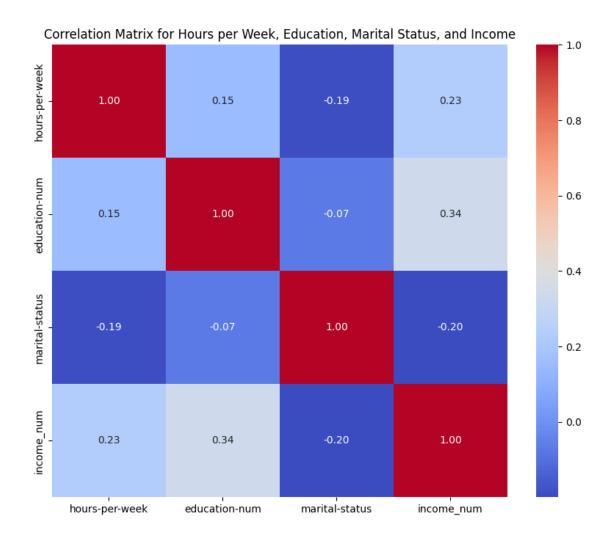
workclass categories = np.union1d(low_income data["workclass"].unique(),_
 ⇔high_income_data["workclass"].unique())
# Grouped bar plot for education, marital status, and workclass
fig, axs = plt.subplots(3, 1, figsize=(12, 18))
# Education
education_counts_low = low_income_data["education-num"].value_counts().
 →reindex(education_categories, fill_value=0)
education counts high = high income data["education-num"].value counts().
 →reindex(education_categories, fill_value=0)
width = 0.35 # Width of the bars
x = np.arange(len(education_categories))
axs[0].bar(x - width/2, education_counts_low.values, width, color='skyblue', __
 \Rightarrowalpha=0.7, label="<=50K")
axs[0].bar(x + width/2, education_counts_high.values, width, color='salmon',_
 ⇒alpha=0.7, label=">50K")
axs[0].set_xlabel("Education Years")
axs[0].set_ylabel("Frequency")
axs[0].set_title("Education Years Distribution by Income Level")
axs[0].set_xticks(x)
axs[0].set_xticklabels(education_categories, rotation=45, ha="right")
axs[0].legend()
# Marital status
marital status counts low = low income data["marital-status"].value counts().
 →reindex(marital_status_categories, fill_value=0)
marital_status_counts high = high_income_data["marital-status"].value_counts().
 Greindex(marital_status_categories, fill_value=0)
width = 0.35 # Width of the bars
x = np.arange(len(marital_status_categories))
axs[1].bar(x - width/2, marital_status_counts_low.values, width,_
 ⇔color='skyblue', alpha=0.7, label="<=50K")</pre>
axs[1].bar(x + width/2, marital_status_counts_high.values, width,_u
⇔color='salmon', alpha=0.7, label=">50K")
axs[1].set xlabel("Marital Status")
axs[1].set_ylabel("Frequency")
axs[1].set_title("Marital Status Distribution by Income Level")
```

```
axs[1].set_xticks(x)
axs[1].set_xticklabels(marital_status_categories, rotation=45, ha="right")
axs[1].legend()
# Workclass
workclass_counts_low = low_income_data["workclass"].value_counts().
 →reindex(workclass_categories, fill_value=0)
workclass_counts_high = high_income_data["workclass"].value_counts().
 →reindex(workclass_categories, fill_value=0)
width = 0.35 # Width of the bars
x = np.arange(len(workclass_categories))
axs[2].bar(x - width/2, workclass_counts_low.values, width, color='skyblue',_
 \Rightarrowalpha=0.7, label="<=50K")
axs[2].bar(x + width/2, workclass_counts_high.values, width, color='salmon', __
 \Rightarrowalpha=0.7, label=">50K")
axs[2].set_xlabel("Workclass")
axs[2].set_ylabel("Frequency")
axs[2].set_title("Workclass Distribution by Income Level")
axs[2].set_xticks(x)
axs[2].set xticklabels(workclass categories, rotation=45, ha="right")
axs[2].legend()
plt.tight_layout()
plt.show()
```

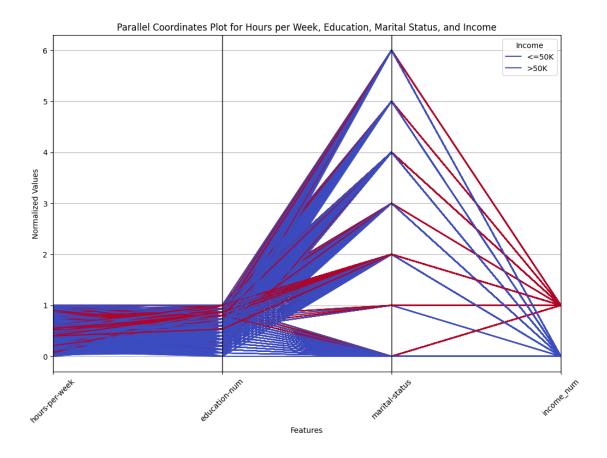




```
[]: import seaborn as sns
    import matplotlib.pyplot as plt
     # Select the columns of interest
    subset_data = data[['hours-per-week', 'education-num', 'marital-status',_
      # Convert 'income' to numeric for visualization
    subset_data['income_num'] = subset_data['income'].apply(lambda x: 0 if x ==__
      \hookrightarrow'<=50K' else 1)
     # Convert 'marital-status' to categorical codes
    subset data['marital-status'] = subset data['marital-status'].
      ⇒astype('category').cat.codes
     # Calculate the correlation matrix
    corr = subset_data[['hours-per-week', 'education-num', 'marital-status',__
      # Create a heatmap
    plt.figure(figsize=(10, 8))
    sns.heatmap(corr, annot=True, cmap='coolwarm', fmt=".2f")
    plt.title('Correlation Matrix for Hours per Week, Education, Marital Status, ...
      →and Income')
    plt.show()
    <ipython-input-60-a836a6e4f837>:8: SettingWithCopyWarning:
    A value is trying to be set on a copy of a slice from a DataFrame.
    Try using .loc[row_indexer,col_indexer] = value instead
    See the caveats in the documentation: https://pandas.pydata.org/pandas-
    docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
      subset_data['income_num'] = subset_data['income'].apply(lambda x: 0 if x ==
    '<=50K' else 1)
    <ipython-input-60-a836a6e4f837>:11: SettingWithCopyWarning:
    A value is trying to be set on a copy of a slice from a DataFrame.
    Try using .loc[row_indexer,col_indexer] = value instead
    See the caveats in the documentation: https://pandas.pydata.org/pandas-
    docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
      subset_data['marital-status'] = subset_data['marital-
    status'].astype('category').cat.codes
```

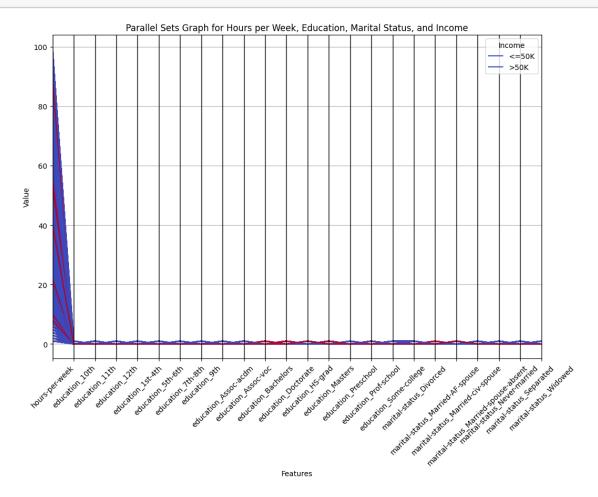


```
# Normalize the numerical columns for better visualization
numerical_columns = ['hours-per-week', 'education-num']
subset_data[numerical_columns] = (subset_data[numerical_columns] -__
 subset_data[numerical_columns].min()) / (subset_data[numerical_columns].
 →max() - subset_data[numerical_columns].min())
# Create a parallel coordinates plot
plt.figure(figsize=(12, 8))
parallel_coordinates(subset_data, 'income', colormap='coolwarm')
plt.xticks(rotation=45)
plt.xlabel('Features')
plt.ylabel('Normalized Values')
plt.title('Parallel Coordinates Plot for Hours per Week, Education, Marital ∪
 ⇔Status, and Income')
plt.legend(title='Income', loc='upper right', labels=['<=50K', '>50K'])
plt.show()
<ipython-input-61-2c543c18320a>:9: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead
See the caveats in the documentation: https://pandas.pydata.org/pandas-
docs/stable/user guide/indexing.html#returning-a-view-versus-a-copy
  subset_data['income_num'] = subset_data['income'].apply(lambda x: 0 if x ==
'<=50K' else 1)
<ipython-input-61-2c543c18320a>:12: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead
See the caveats in the documentation: https://pandas.pydata.org/pandas-
docs/stable/user guide/indexing.html#returning-a-view-versus-a-copy
  subset_data['marital-status'] = subset_data['marital-
status'].astype('category').cat.codes
<ipython-input-61-2c543c18320a>:16: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead
See the caveats in the documentation: https://pandas.pydata.org/pandas-
docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
  subset_data[numerical_columns] = (subset_data[numerical_columns] -
subset_data[numerical_columns].min()) / (subset_data[numerical_columns].max() -
subset_data[numerical_columns].min())
```



```
[]: import pandas as pd
    import matplotlib.pyplot as plt
    from pandas.plotting import parallel_coordinates
    # Select the columns of interest
    subset_data = data[['hours-per-week', 'education', 'marital-status', 'income']]
    # One-hot encode the 'education' and 'marital-status' columns
    subset_data = pd.get_dummies(subset_data, columns=['education',__
     # Create a parallel sets graph
    plt.figure(figsize=(12, 8))
    parallel_coordinates(subset_data, 'income', colormap='coolwarm')
    plt.xticks(rotation=45)
    plt.xlabel('Features')
    plt.ylabel('Value')
    plt.title('Parallel Sets Graph for Hours per Week, Education, Marital Status, ⊔
      →and Income')
    plt.legend(title='Income', loc='upper right', labels=['<=50K', '>50K'])
```

plt.show()



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

# Set the figure size
   plt.figure(figsize=(18, 10))

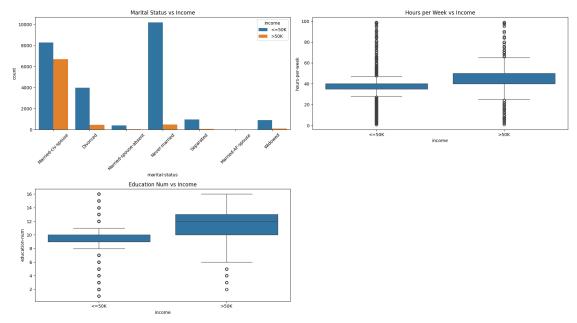
# Plot 1: Bar plot for marital status vs income
   plt.subplot(2, 2, 1)
   sns.countplot(x='marital-status', hue='income', data=data)
   plt.xticks(rotation=45)
   plt.title('Marital Status vs Income')

# Plot 2: Box plot for hours-per-week vs income
   plt.subplot(2, 2, 2)
   sns.boxplot(x='income', y='hours-per-week', data=data)
   plt.title('Hours per Week vs Income')
```

```
# Plot 3: Box plot for education-num vs income
plt.subplot(2, 2, 3)
sns.boxplot(x='income', y='education-num', data=data)
plt.title('Education Num vs Income')

# Adjust layout
plt.tight_layout()

# Show the plots
plt.show()
```



hours-per-week, work-class and income(salary)

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

# Set the figure size
plt.figure(figsize=(18, 10))

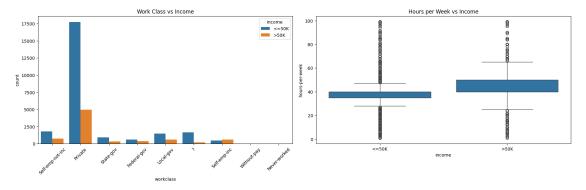
# Plot 1: Bar plot for work-class vs income
plt.subplot(2, 2, 1)
sns.countplot(x='workclass', hue='income', data=data)
plt.xticks(rotation=45)
plt.title('Work Class vs Income')

# Plot 2: Box plot for hours-per-week vs income
```

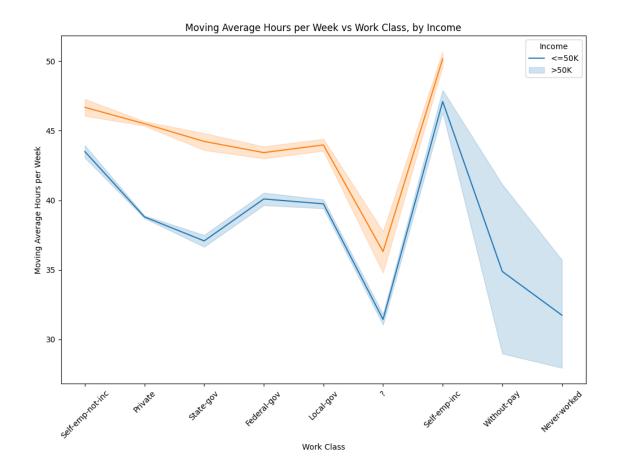
```
plt.subplot(2, 2, 2)
sns.boxplot(x='income', y='hours-per-week', data=data)
plt.title('Hours per Week vs Income')

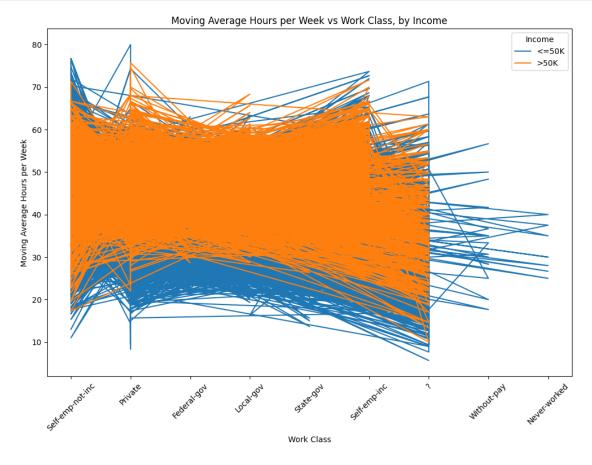
# Adjust layout
plt.tight_layout()

# Show the plots
plt.show()
```



```
[]: import pandas as pd
     import matplotlib.pyplot as plt
     import seaborn as sns
     # Calculate the moving average of hours-per-week for each work-class and income_
     data['moving avg'] = data.groupby(['workclass', 'income'])['hours-per-week'].
      stransform(lambda x: x.rolling(3, min_periods=1).mean())
     # Set the figure size
     plt.figure(figsize=(12, 8))
     # Line plot for moving average of hours-per-week vs work-class, with income as L
     sns.lineplot(x='workclass', y='moving_avg', hue='income', data=data)
     plt.xticks(rotation=45)
     plt.xlabel('Work Class')
     plt.ylabel('Moving Average Hours per Week')
     plt.title('Moving Average Hours per Week vs Work Class, by Income')
     plt.legend(title='Income', loc='upper right', labels=['<=50K', '>50K'])
     # Show the plot
     plt.show()
```





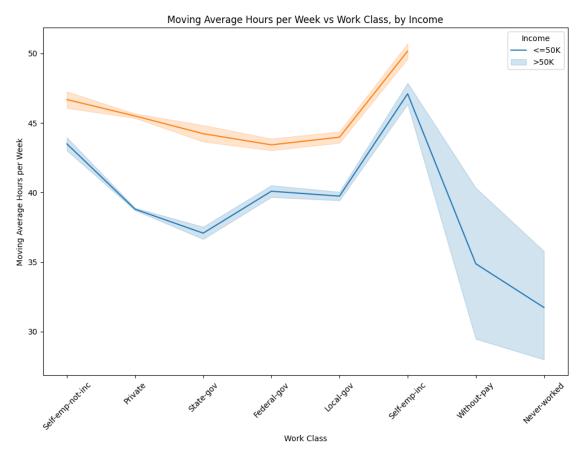
```
[]: data['workclass'] = data['workclass'].replace('?', None)

[]: import pandas as pd
  import matplotlib.pyplot as plt
  import seaborn as sns
```

```
# Calculate the moving average of hours-per-week for each work-class and income_
 ⇔level
data['moving_avg'] = data.groupby(['workclass', 'income'])['hours-per-week'].

→transform(lambda x: x.rolling(3, min_periods=1).mean())

# Set the figure size
plt.figure(figsize=(12, 8))
# Line plot for moving average of hours-per-week vs work-class, with income as L
 \hookrightarrow hue
sns.lineplot(x='workclass', y='moving_avg', hue='income', data=data)
plt.xticks(rotation=45)
plt.xlabel('Work Class')
plt.ylabel('Moving Average Hours per Week')
plt.title('Moving Average Hours per Week vs Work Class, by Income')
plt.legend(title='Income', loc='upper right', labels=['<=50K', '>50K'])
# Show the plot
plt.show()
```



```
[]: import pandas as pd
     import matplotlib.pyplot as plt
     # Remove rows with missing values in the 'workclass' column
     data_cleaned = data.dropna(subset=['workclass'])
     # Calculate the moving average of hours-per-week for each work-class and income_
      -level
     data_cleaned['moving_avg'] = data_cleaned.groupby(['workclass',__
      →'income'])['hours-per-week'].transform(lambda x: x.rolling(3, min_periods=1).

mean())

     # Set the figure size
     plt.figure(figsize=(12, 8))
     # Plot the moving average for income <=50K
     plt.plot(data_cleaned[data_cleaned['income'] == '<=50K']['workclass'],u</pre>
      data_cleaned[data_cleaned['income'] == '<=50K']['moving_avg'], label='<=50K')</pre>
     # Plot the moving average for income >50K
     plt.plot(data_cleaned[data_cleaned['income'] == '>50K']['workclass'],__
      data_cleaned[data_cleaned['income'] == '>50K']['moving_avg'], label='>50K')
     plt.xlabel('Work Class')
     plt.ylabel('Moving Average Hours per Week')
     plt.title('Moving Average Hours per Week vs Work Class, by Income')
     plt.legend(title='Income', loc='upper right')
     # Rotate x-axis labels
     plt.xticks(rotation=45)
     # Show the plot
     plt.show()
    <ipython-input-68-201cc48b13bc>:8: SettingWithCopyWarning:
    A value is trying to be set on a copy of a slice from a DataFrame.
    Try using .loc[row_indexer,col_indexer] = value instead
    See the caveats in the documentation: https://pandas.pydata.org/pandas-
    docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
      data_cleaned['moving_avg'] = data_cleaned.groupby(['workclass',
    'income'])['hours-per-week'].transform(lambda x: x.rolling(3,
    min_periods=1).mean())
```

