#### eda-2

#### November 26, 2024

```
[]: import numpy as np
     import pandas as pd
     import matplotlib.pyplot as plt
     import seaborn as sns
     plt.style.use('dark_background')
[]: df = pd.read_csv('adult_with_headers.csv')
     df.head()
[]:
                      workclass fnlwgt
                                           education
                                                     education_num
        age
     0
         39
                      State-gov
                                  77516
                                           Bachelors
                                                                  13
     1
         50
              Self-emp-not-inc
                                  83311
                                          Bachelors
                                                                  13
     2
         38
                                 215646
                                                                   9
                       Private
                                             HS-grad
                                                                   7
     3
         53
                       Private
                                 234721
                                                11th
     4
         28
                       Private 338409
                                                                  13
                                           Bachelors
             marital_status
                                      occupation
                                                     relationship
                                                                      race
                                                                                sex \
                                    Adm-clerical
     0
              Never-married
                                                    Not-in-family
                                                                               Male
                                                                     White
     1
         Married-civ-spouse
                                 Exec-managerial
                                                          Husband
                                                                     White
                                                                               Male
     2
                   Divorced
                               Handlers-cleaners
                                                    Not-in-family
                                                                               Male
                                                                     White
     3
         Married-civ-spouse
                               Handlers-cleaners
                                                          Husband
                                                                     Black
                                                                               Male
     4
         Married-civ-spouse
                                  Prof-specialty
                                                             Wife
                                                                     Black
                                                                             Female
        capital_gain capital_loss
                                     hours_per_week
                                                      native_country
                                                                       income
     0
                2174
                                  0
                                                  40
                                                       United-States
                                                                        <=50K
                                  0
     1
                   0
                                                       United-States
                                                  13
                                                                        <=50K
     2
                   0
                                  0
                                                  40
                                                       United-States
                                                                        <=50K
     3
                   0
                                  0
                                                  40
                                                       United-States
                                                                        <=50K
                   0
                                  0
                                                  40
                                                                 Cuba
                                                                        <=50K
[]: df.shape
[]: (32561, 15)
[]: df.describe()
```

```
[]:
                                         education_num
                                                         capital_gain
                                                                        capital_loss
                                 fnlwgt
                      age
                                                         32561.000000
                                                                        32561.000000
     count
           32561.000000
                           3.256100e+04
                                           32561.000000
                           1.897784e+05
                                                          1077.648844
                                                                           87.303830
    mean
               38.581647
                                              10.080679
    std
                           1.055500e+05
                                                          7385.292085
                                                                          402.960219
               13.640433
                                               2.572720
    min
               17.000000
                           1.228500e+04
                                               1.000000
                                                              0.000000
                                                                            0.000000
     25%
               28.000000
                           1.178270e+05
                                               9.000000
                                                              0.000000
                                                                            0.000000
    50%
               37.000000
                           1.783560e+05
                                              10.000000
                                                              0.000000
                                                                            0.000000
    75%
               48.000000
                           2.370510e+05
                                              12.000000
                                                              0.000000
                                                                            0.000000
               90.000000
                           1.484705e+06
                                              16.000000
                                                         99999.000000
                                                                         4356.000000
    max
            hours_per_week
              32561.000000
     count
                 40.437456
    mean
     std
                 12.347429
    min
                  1.000000
     25%
                 40.000000
    50%
                 40.000000
    75%
                 45.000000
                 99.000000
    max
[]: df.info()
```

<class 'pandas.core.frame.DataFrame'> RangeIndex: 32561 entries, 0 to 32560 Data columns (total 15 columns):

#	Column	Non-Null Count	Dtype
0	age	32561 non-null	int64
1	workclass	32561 non-null	object
2	fnlwgt	32561 non-null	int64
3	education	32561 non-null	object
4	education_num	32561 non-null	int64
5	marital_status	32561 non-null	object
6	occupation	32561 non-null	object
7	relationship	32561 non-null	object
8	race	32561 non-null	object
9	sex	32561 non-null	object
10	capital_gain	32561 non-null	int64
11	capital_loss	32561 non-null	int64
12	hours_per_week	32561 non-null	int64
13	native_country	32561 non-null	object
14	income	32561 non-null	object

[]: df['income'].value\_counts()

memory usage: 3.7+ MB

dtypes: int64(6), object(9)

[]: <=50K 24720 >50K 7841

Name: income, dtype: int64

# []: df['sex'].value\_counts()

[]: Male 21790 Female 10771

Name: sex, dtype: int64

#### []: df['native\_country'].value\_counts()

[]:	United-States	29170
	Mexico	643
	?	583
	Philippines	198
	Germany	137
	Canada	121
	Puerto-Rico	114
	El-Salvador	106
	India	100
	Cuba	95
	England	90
	Jamaica	81
	South	80
	China	75
	Italy	73
	Dominican-Republic	70
	Vietnam	67
	Guatemala	64
	Japan	62
	Poland	60
	Columbia	59
	Taiwan	51
	Haiti	44
	Iran	43
	Portugal	37
	Nicaragua	34
	Peru	31
	France	29
	Greece	29
	Ecuador	28
	Ireland	24
	Hong	20
	Cambodia	19
	Trinadad&Tobago	19
	Laos	18

```
Thailand
                                        18
                                        16
      Yugoslavia
      Outlying-US(Guam-USVI-etc)
                                        14
                                        13
      Honduras
      Hungary
                                        13
                                        12
      Scotland
      Holand-Netherlands
                                         1
     Name: native_country, dtype: int64
[]: df['workclass'].value_counts()
[]: Private
                           22696
      Self-emp-not-inc
                            2541
      Local-gov
                            2093
                            1836
                            1298
      State-gov
      Self-emp-inc
                            1116
      Federal-gov
                             960
      Without-pay
                              14
      Never-worked
     Name: workclass, dtype: int64
[]: df['occupation'].value_counts()
[]: Prof-specialty
                            4140
      Craft-repair
                            4099
      Exec-managerial
                            4066
      Adm-clerical
                            3770
      Sales
                            3650
      Other-service
                            3295
      Machine-op-inspct
                            2002
                            1843
      Transport-moving
                            1597
      Handlers-cleaners
                            1370
      Farming-fishing
                             994
      Tech-support
                             928
      Protective-serv
                             649
      Priv-house-serv
                             149
      Armed-Forces
                               9
     Name: occupation, dtype: int64
[]: \#Dropping\ Education\ -\ Education\ No.\ is\ enough,\ Dropping\ Final\ Weight\ -\ Highly_{\sqcup}
      →Discrete Data so not useful.
[]: df = df.drop(['education', 'fnlwgt'], axis = 1)
     df.head()
```

```
[]:
                      workclass
                                  education_num
                                                       marital_status
        age
     0
         39
                      State-gov
                                              13
                                                         Never-married
     1
         50
               Self-emp-not-inc
                                              13
                                                   Married-civ-spouse
     2
         38
                        Private
                                               9
                                                              Divorced
                                               7
     3
         53
                        Private
                                                   Married-civ-spouse
     4
         28
                        Private
                                              13
                                                   Married-civ-spouse
                 occupation
                                relationship
                                                 race
                                                            sex
                                                                 capital_gain
     0
               Adm-clerical
                               Not-in-family
                                                                          2174
                                                White
                                                           Male
     1
           Exec-managerial
                                     Husband
                                                White
                                                           Male
                                                                             0
     2
                                                                             0
         Handlers-cleaners
                               Not-in-family
                                                White
                                                           Male
     3
         Handlers-cleaners
                                     Husband
                                                Black
                                                           Male
                                                                             0
     4
                                                                             0
            Prof-specialty
                                        Wife
                                                Black
                                                         Female
        capital_loss
                       hours_per_week
                                        native_country
                                                          income
     0
                                    40
                                          United-States
                                                           <=50K
     1
                    0
                                    13
                                          United-States
                                                           <=50K
     2
                    0
                                    40
                                          United-States
                                                           <=50K
     3
                    0
                                    40
                                          United-States
                                                           <=50K
     4
                    0
                                    40
                                                   Cuba
                                                           <=50K
     #Replacing "?" with NaN
[]: df.replace('?', np.NaN, inplace = True)
     df.head()
[]:
                      workclass
                                  education_num
                                                        marital_status
        age
         39
                                                         Never-married
     0
                      State-gov
                                              13
     1
         50
               Self-emp-not-inc
                                              13
                                                   Married-civ-spouse
     2
         38
                        Private
                                               9
                                                              Divorced
                                               7
     3
         53
                        Private
                                                   Married-civ-spouse
                                                   Married-civ-spouse
     4
         28
                        Private
                                              13
                 occupation
                                relationship
                                                 race
                                                                 capital_gain
                                                            sex
     0
               Adm-clerical
                               Not-in-family
                                                White
                                                                          2174
                                                           Male
     1
                                                White
                                                                             0
           Exec-managerial
                                     Husband
                                                           Male
     2
         Handlers-cleaners
                               Not-in-family
                                                White
                                                           Male
                                                                             0
     3
         Handlers-cleaners
                                     Husband
                                                Black
                                                           Male
                                                                             0
     4
            Prof-specialty
                                        Wife
                                                Black
                                                         Female
                                                                             0
                                        native_country
                                                          income
        capital_loss
                       hours_per_week
     0
                    0
                                          United-States
                                                           <=50K
                                    40
     1
                    0
                                    13
                                          United-States
                                                           <=50K
     2
                    0
                                    40
                                          United-States
                                                           <=50K
     3
                                                           <=50K
                    0
                                    40
                                          United-States
                                                           <=50K
                    0
                                    40
                                                   Cuba
```

## 1 Replacing NaN with Forward Fill

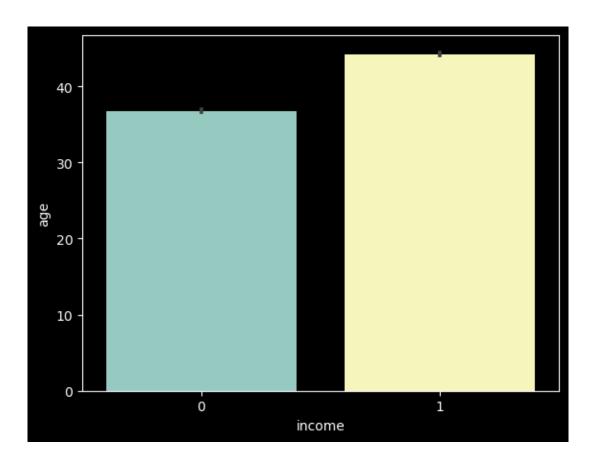
```
[]: df.fillna(method = 'ffill', inplace = True)
```

## 2 Label Encoding

```
[]: from sklearn.preprocessing import LabelEncoder
     le = LabelEncoder()
     df['workclass'] = le.fit_transform(df['workclass'])
     df['marital.status'] = le.fit_transform(df['marital_status'])
     df['occupation'] = le.fit_transform(df['occupation'])
     df['relationship'] = le.fit_transform(df['relationship'])
     df['race'] = le.fit_transform(df['race'])
     df['sex'] = le.fit_transform(df['sex'])
     df['native_country'] = le.fit_transform(df['native_country'])
     df['income'] = le.fit_transform(df['income'])
     df.head()
[]:
                         education_num
                                                               occupation
        age
             workclass
                                              marital_status
     0
         39
                      7
                                     13
                                               Never-married
                                                                         1
                      6
                                                                         4
     1
         50
                                     13
                                          Married-civ-spouse
     2
                      4
                                     9
                                                                         6
         38
                                                     Divorced
                                      7
     3
         53
                      4
                                          Married-civ-spouse
                                                                         6
     4
                      4
         28
                                     13
                                          Married-civ-spouse
                                                                        10
        relationship race
                                  capital_gain capital_loss
                                                               hours_per_week
                             sex
     0
                          4
                                           2174
                                                             0
                    1
                               1
                                                                             40
     1
                    0
                          4
                               1
                                              0
                                                             0
                                                                             13
     2
                                              0
                    1
                          4
                                                             0
                                                                             40
                               1
                          2
     3
                    0
                               1
                                              0
                                                             0
                                                                             40
                          2
     4
                    5
                               0
                                                                             40
        native_country
                         income
                                 marital.status
     0
                     39
                              0
                                               4
                     39
                              0
                                               2
     1
     2
                                               0
                     39
                              0
     3
                     39
                                               2
                              0
     4
                      5
                              0
                                               2
```

## 3 People with more age earn more

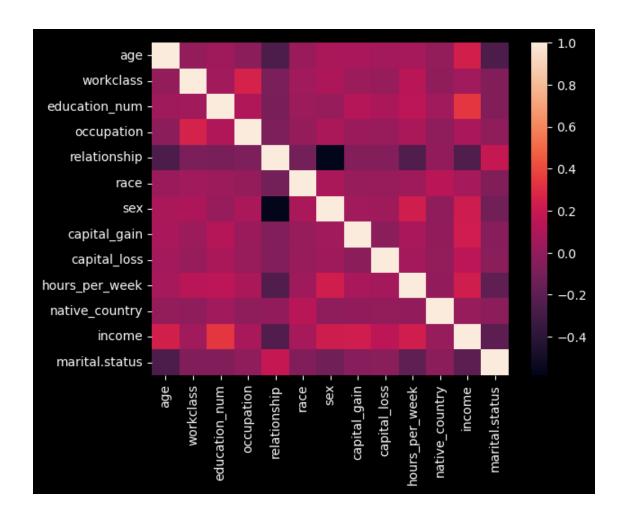
```
[ ]: sns.barplot(x = 'income', y = 'age', data = df)
[ ]: <Axes: xlabel='income', ylabel='age'>
```



#### []: sns.heatmap(df.corr())

C:\Users\excel\AppData\Local\Temp\ipykernel\_25540\58359773.py:1: FutureWarning:
The default value of numeric\_only in DataFrame.corr is deprecated. In a future
version, it will default to False. Select only valid columns or specify the
value of numeric\_only to silence this warning.
 sns.heatmap(df.corr())

[]: <Axes: >



```
[]: X = df.drop(['income'],axis = 1)
     y = df['income']
[]: print('Shape of X =', X.shape)
     print('Shape of y =', y.shape)
    Shape of X = (32561, 13)
    Shape of y = (32561,)
```

#### Train Test Split

```
[]: from sklearn.model_selection import train_test_split
    X_train, X_test, y_train, y_test = train_test_split(X,y, test_size = 0.
      →2,random_state=42)
[]: # Instantiate Gaussian Naive Bayes model
    gnb = GaussianNB()
```

```
# Fit the model
gnb.fit(X_train, y_train)
```

#### []: GaussianNB()

```
[]: from sklearn.metrics import classification_report from sklearn.metrics import confusion_matrix from sklearn.metrics import accuracy_score
```

```
[]: y_pred = gnb.predict(X_test)
    print(classification_report(y_test, y_pred))
    print(confusion_matrix(y_test, y_pred))
    print(accuracy_score(y_test, y_pred)*100)
```

	precision	recall	f1-score	support
0	0.82	0.95	0.88	4942
1	0.67	0.32	0.44	1571
accuracy			0.80	6513
macro avg	0.74	0.64	0.66	6513
weighted avg	0.78	0.80	0.77	6513

[[4698 244] [1065 506]] 79.90173499155534

[]: