

```
In [ ]: import pandas as pd
import numpy as np
import seaborn as sns
from sklearn.metrics import classification_report
from sklearn.metrics import confusion_matrix
from sklearn.neighbors import KNeighborsClassifier
from sklearn.model_selection import train_test_split
import matplotlib.pyplot as plt

%matplotlib inline
```

```
In [ ]: heart_data=pd.read_csv('Heart.csv')
heart_data=heart_data.sort_values(by='Unnamed: 0')
heart_data=heart_data.iloc[:,:]
heart_data
```

```
Out[ ]:
```

	Unnamed: 0	Age	Sex	ChestPain	RestBP	Chol	Fbs	RestECG	MaxHR	ExAng	Oldpea
0	1	63	1	typical	145	233	1	2	150	0	2.
1	2	67	1	asymptomatic	160	286	0	2	108	1	1.
2	3	67	1	asymptomatic	120	229	0	2	129	1	2.
3	4	37	1	nonanginal	130	250	0	0	187	0	3.
4	5	41	0	nontypical	130	204	0	2	172	0	1.
...
298	299	45	1	typical	110	264	0	0	132	0	1.
299	300	68	1	asymptomatic	144	193	1	0	141	0	3.
300	301	57	1	asymptomatic	130	131	0	0	115	1	1.
301	302	57	0	nontypical	130	236	0	2	174	0	0.
302	303	38	1	nonanginal	138	175	0	0	173	0	0.

303 rows × 15 columns

```
In [ ]: heart_data.shape
```

```
Out[ ]: (303, 15)
```

```
In [ ]: heart_data.isnull().sum()
```

```
Out[ ]: Unnamed: 0    0
        Age          0
        Sex          0
        ChestPain    0
        RestBP       0
        Chol         0
        Fbs          0
        RestECG      0
        MaxHR        0
        ExAng        0
        Oldpeak      0
        Slope        0
        Ca           4
        Thal         2
        AHD          0
        dtype: int64
```

```
In [ ]: heart_data.isnull().sum().sum()
```

```
Out[ ]: 6
```

```
In [ ]: heart_data.info()
```

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 303 entries, 0 to 302
Data columns (total 15 columns):
#   Column          Non-Null Count  Dtype
---  -
0   Unnamed: 0      303 non-null   int64
1   Age             303 non-null   int64
2   Sex             303 non-null   int64
3   ChestPain       303 non-null   object
4   RestBP          303 non-null   int64
5   Chol            303 non-null   int64
6   Fbs             303 non-null   int64
7   RestECG         303 non-null   int64
8   MaxHR           303 non-null   int64
9   ExAng           303 non-null   int64
10  Oldpeak         303 non-null   float64
11  Slope           303 non-null   int64
12  Ca              299 non-null   float64
13  Thal            301 non-null   object
14  AHD             303 non-null   object
dtypes: float64(2), int64(10), object(3)
memory usage: 37.9+ KB
```

```
In [ ]: (heart_data==0).sum()
```

```
Out[ ]: Unnamed: 0      0
        Age           0
        Sex          97
        ChestPain     0
        RestBP        0
        Chol          0
        Fbs          258
        RestECG       151
        MaxHR         0
        ExAng        204
        Oldpeak       99
        Slope         0
        Ca           176
        Thal          0
        AHD           0
        dtype: int64
```

```
In [ ]: mean_ca=heart_data['Ca'].mean()
        print(mean_ca)
        heart_data['Ca'].fillna(mean_ca,inplace=True)

0.6722408026755853
```

```
In [ ]: heart_data
```

```
Out[ ]:      Unnamed: 0  Age  Sex  ChestPain  RestBP  Chol  Fbs  RestECG  MaxHR  ExAng  Oldpea
0           0      1   63    1      typical    145   233    1         2    150     0     2.
1           1      2   67    1  asymptomatic    160   286    0         2    108     1     1.
2           2      3   67    1  asymptomatic    120   229    0         2    129     1     2.
3           3      4   37    1   nonanginal    130   250    0         0    187     0     3.
4           4      5   41    0   nontypical    130   204    0         2    172     0     1.
...         ...    ...   ...      ...      ...    ...    ...      ...     ...     ...     .
298         299     45    1      typical    110   264    0         0    132     0     1.
299         300     68    1  asymptomatic    144   193    1         0    141     0     3.
300         301     57    1  asymptomatic    130   131    0         0    115     1     1.
301         302     57    0   nontypical    130   236    0         2    174     0     0.
302         303     38    1   nonanginal    138   175    0         0    173     0     0.
```

303 rows × 15 columns

```
In [ ]: mean_age=heart_data['Age'].mean()
        print(mean_age)

54.43894389438944
```

```
In [ ]: x_values=heart_data.filter(['Age','Sex','ChestPain','RestBP','Chol'])
        y_values=heart_data.filter(['AHD'])
        x_values,y_values
```

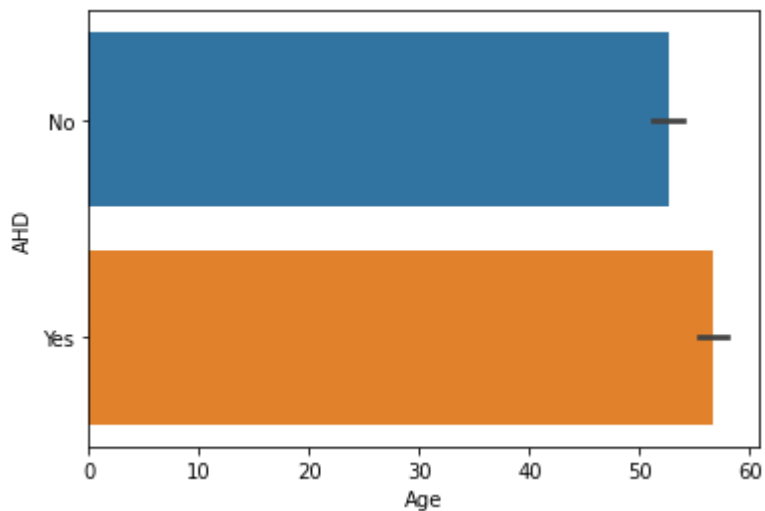
```
Out[ ]: (   Age  Sex   ChestPain  RestBP  Chol
0    63   1    typical    145    233
1    67   1  asymptomatic    160    286
2    67   1  asymptomatic    120    229
3    37   1   nonanginal    130    250
4    41   0   nontypical    130    204
..    ..  ..
298   45   1    typical    110    264
299   68   1  asymptomatic    144    193
300   57   1  asymptomatic    130    131
301   57   0   nontypical    130    236
302   38   1   nonanginal    138    175

[303 rows x 5 columns],
AHD
0    No
1    Yes
2    Yes
3    No
4    No
..    ..
298  Yes
299  Yes
300  Yes
301  Yes
302  No

[303 rows x 1 columns])
```

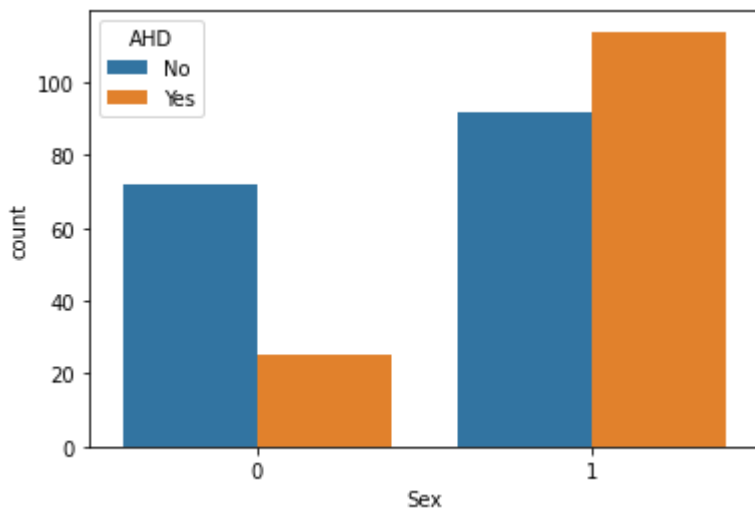
```
In [ ]: sns.barplot(data=heart_data,x='Age',y='AHD')
```

```
Out[ ]: <AxesSubplot: xlabel='Age', ylabel='AHD'>
```



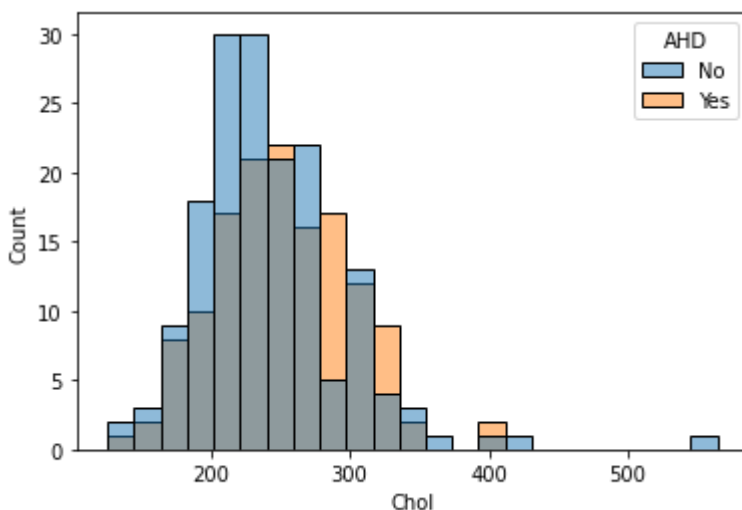
```
In [ ]: sns.countplot(data=heart_data,x='Sex',hue='AHD')
```

```
Out[ ]: <AxesSubplot: xlabel='Sex', ylabel='count'>
```



```
In [ ]: sns.histplot(data=heart_data,x='Chol',hue='AHD')
```

```
Out[ ]: <AxesSubplot: xlabel='Chol', ylabel='Count'>
```



```
In [ ]: heart_data
```

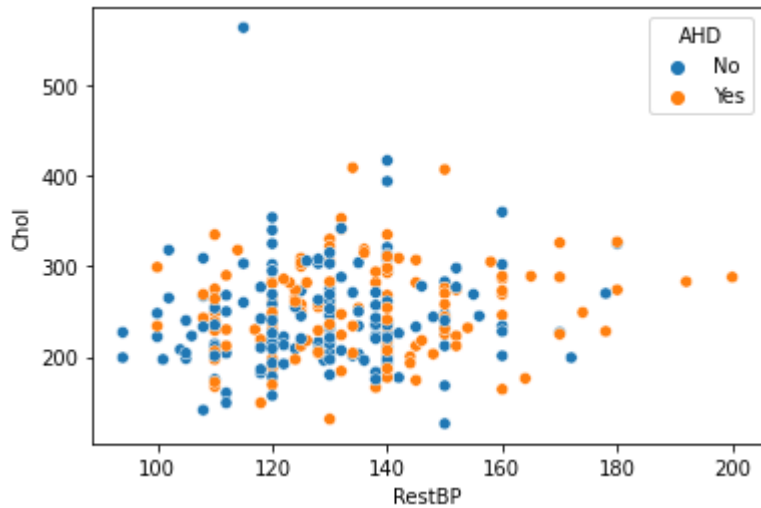
```
Out[ ]:
```

	Unnamed: 0	Age	Sex	ChestPain	RestBP	Chol	Fbs	RestECG	MaxHR	ExAng	Oldpea
0	1	63	1	typical	145	233	1	2	150	0	2.
1	2	67	1	asymptomatic	160	286	0	2	108	1	1.
2	3	67	1	asymptomatic	120	229	0	2	129	1	2.
3	4	37	1	nonanginal	130	250	0	0	187	0	3.
4	5	41	0	nontypical	130	204	0	2	172	0	1.
...
298	299	45	1	typical	110	264	0	0	132	0	1.
299	300	68	1	asymptomatic	144	193	1	0	141	0	3.
300	301	57	1	asymptomatic	130	131	0	0	115	1	1.
301	302	57	0	nontypical	130	236	0	2	174	0	0.
302	303	38	1	nonanginal	138	175	0	0	173	0	0.

303 rows × 15 columns

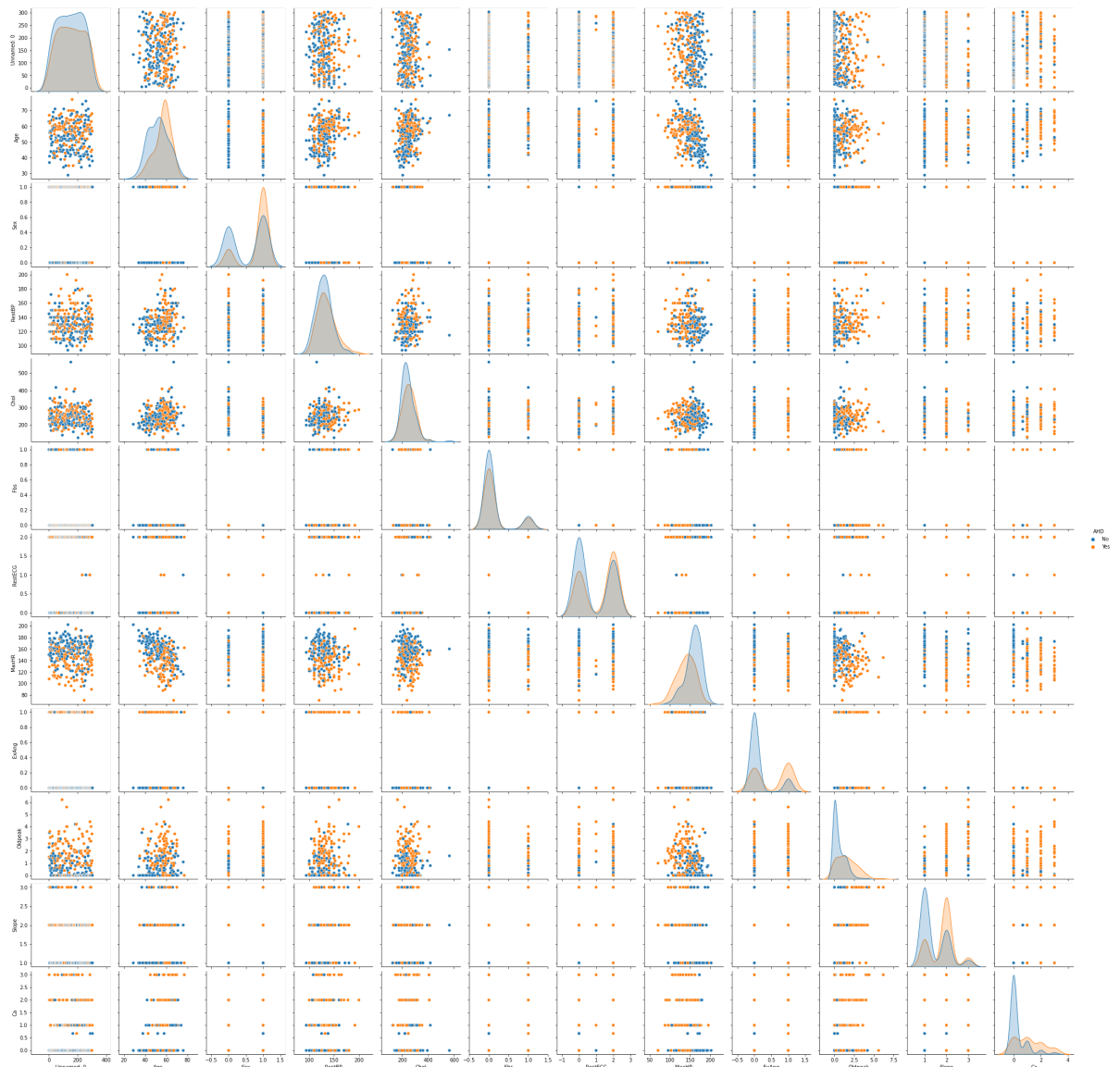
```
In [ ]: sns.scatterplot(data=heart_data,x='RestBP',y='Chol',hue='AHD')
```

```
Out[ ]: <AxesSubplot: xlabel='RestBP', ylabel='Chol'>
```



```
In [ ]: sns.pairplot(data=heart_data,hue='AHD')
```

```
Out[ ]: <seaborn.axisgrid.PairGrid at 0x7f9dfa8da8b0>
```



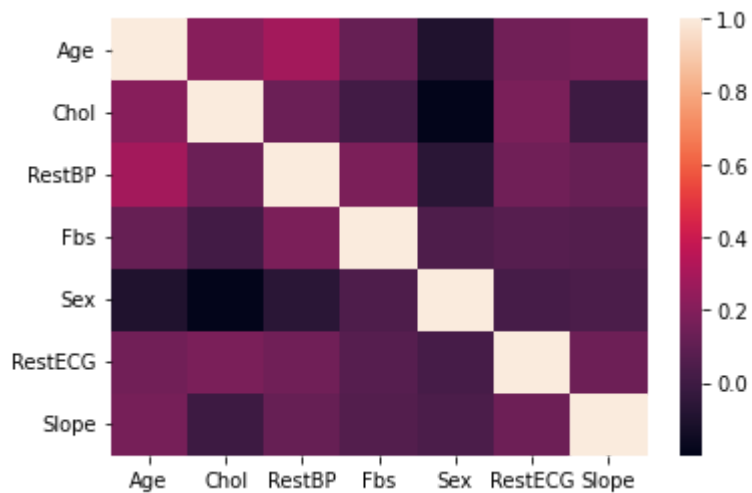
```
In [ ]: heart_data.filter(['Age', 'Chol', 'RestBP', 'Fbs', 'Sex', 'RestECG', 'Slope', 'Oldf
```

```
Out[ ]:
```

	Age	Chol	RestBP	Fbs	Sex	RestECG	Slope
Age	1.000000	0.208950	0.284946	0.118530	-0.097542	0.148868	0.161770
Chol	0.208950	1.000000	0.130120	0.009841	-0.199915	0.171043	-0.004062
RestBP	0.284946	0.130120	1.000000	0.175340	-0.064456	0.146560	0.117382
Fbs	0.118530	0.009841	0.175340	1.000000	0.047862	0.069564	0.059894
Sex	-0.097542	-0.199915	-0.064456	0.047862	1.000000	0.021647	0.037533
RestECG	0.148868	0.171043	0.146560	0.069564	0.021647	1.000000	0.133946
Slope	0.161770	-0.004062	0.117382	0.059894	0.037533	0.133946	1.000000

```
In [ ]: sns.heatmap(heart_data.filter(['Age', 'Chol', 'RestBP', 'Fbs', 'Sex', 'RestECG', 'Slope']),
```

```
Out[ ]: <AxesSubplot: >
```



```
In [ ]: x_train,y_train,x_test,y_test=train_test_split(x_values,y_values,test_size=0.2,
x_train,y_train,x_test,y_test
```

```
Out[ ]: (      Age  Sex      ChestPain  RestBP  Chol
      287   58    1      nontypical    125   220
      282   55    0      asymptomatic    128   205
      197   45    0      asymptomatic    138   236
      158   60    1      asymptomatic    140   293
      164   48    1      nonanginal    124   255
      ..   ...   ...           ...     ...   ...
      188   54    1      nontypical    192   283
      71    67    1      asymptomatic    125   254
      106   59    1      asymptomatic    140   177
      270   61    1      asymptomatic    140   207
      102   57    0      asymptomatic    128   303
```

```
[227 rows x 5 columns],
      Age  Sex      ChestPain  RestBP  Chol
      179   53    1      nonanginal    130   246
      228   54    1      asymptomatic    110   206
      111   56    1      asymptomatic    125   249
      246   58    1      asymptomatic    100   234
      60    51    0      asymptomatic    130   305
      ..   ...   ...           ...     ...   ...
      22    58    1      nontypical    120   284
      258   70    1      nontypical    156   245
      56    50    1      nonanginal    140   233
      242   49    0      asymptomatic    130   269
      114   62    0      nonanginal    130   263
```

```
[76 rows x 5 columns],
      AHD
      287   No
      282   Yes
      197   No
      158   Yes
      164   No
      ..   ...
      188   Yes
      71    Yes
      106   Yes
      270   Yes
      102   No
```

```
[227 rows x 1 columns],
      AHD
      179   No
      228   Yes
      111   Yes
      246   Yes
      60    Yes
      ..   ...
      22    Yes
      258   No
      56    Yes
      242   No
      114   Yes
```

```
[76 rows x 1 columns])
```

```
In [ ]: actual_data=np.array(['positive']*50+['negative']*450)

predicted_data=np.array(['positive']*45+['negative']*5+['positive']*55+['neg
```



```
cm=confusion_matrix(actual_data,predicted_data,labels=['positive','negative'])
```

```
In [ ]: sns.heatmap(cm,
                    annot=True,
                    fmt='g',
                    xticklabels=['Positive','Negative'],
                    yticklabels=['Positive','Negative'])
plt.ylabel('Actual', fontsize=13)
plt.title('Confusion Matrix', fontsize=17, pad=20)
plt.gca().xaxis.set_label_position('top')
plt.xlabel('Prediction', fontsize=13)
plt.gca().xaxis.tick_top()

print(classification_report(actual_data,predicted_data,labels=["positive",'negative']))
```

	precision	recall	f1-score	support
positive	0.45	0.90	0.60	50
negative	0.99	0.88	0.93	450
accuracy			0.88	500
macro avg	0.72	0.89	0.76	500
weighted avg	0.93	0.88	0.90	500

