

```
import pandas as pd
import numpy as np
import seaborn as sns
import matplotlib.pyplot as plt
import warnings
warnings.filterwarnings('ignore')
```

```
df=pd.read_csv("heart.csv")
```

```
df.head(5)
```

	Age	Sex	ChestPainType	RestingBP	Cholesterol	FastingBS	RestingECG
0	40	M	ATA	140	289	0	Normal
1	49	F	NAP	160	180	0	Normal
2	37	M	ATA	130	283	0	ST
3	48	F	ASY	138	214	0	Normal
4	54	M	NAP	150	195	0	Normal

	ExerciseAngina	Oldpeak	ST_Slope	HeartDisease
0	N	0.0	Up	0
1	N	1.0	Flat	1
2	N	0.0	Up	0
3	Y	1.5	Flat	1
4	N	0.0	Up	0

```
df.shape
```

```
(918, 12)
```

```
df.isna().sum()
```

```
Age      0
Sex      0
ChestPainType  0
RestingBP  0
Cholesterol  0
FastingBS  0
RestingECG  0
MaxHR    0
ExerciseAngina  0
Oldpeak   0
ST_Slope  0
HeartDisease  0
dtype: int64
```

```
df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 918 entries, 0 to 917
Data columns (total 12 columns):
#   Column                Non-Null Count  Dtype
---  -
0   Age                    918 non-null   int64
1   Sex                    918 non-null   object
2   ChestPainType          918 non-null   object
3   RestingBP              918 non-null   int64
4   Cholesterol             918 non-null   int64
5   FastingBS              918 non-null   int64
6   RestingECG             918 non-null   object
7   MaxHR                  918 non-null   int64
8   ExerciseAngina         918 non-null   object
9   Oldpeak                918 non-null   float64
10  ST_Slope               918 non-null   object
11  HeartDisease           918 non-null   int64
dtypes: float64(1), int64(6), object(5)
memory usage: 86.2+ KB
```

```
df.describe()
```

	Age	RestingBP	Cholesterol	FastingBS	MaxHR	\
count	918.000000	918.000000	918.000000	918.000000	918.000000	
mean	53.510893	132.396514	198.799564	0.233115	136.809368	
std	9.432617	18.514154	109.384145	0.423046	25.460334	
min	28.000000	0.000000	0.000000	0.000000	60.000000	
25%	47.000000	120.000000	173.250000	0.000000	120.000000	
50%	54.000000	130.000000	223.000000	0.000000	138.000000	
75%	60.000000	140.000000	267.000000	0.000000	156.000000	
max	77.000000	200.000000	603.000000	1.000000	202.000000	

	Oldpeak	HeartDisease
count	918.000000	918.000000
mean	0.887364	0.553377
std	1.066570	0.497414
min	-2.600000	0.000000
25%	0.000000	0.000000
50%	0.600000	1.000000
75%	1.500000	1.000000
max	6.200000	1.000000

```
df['Sex'].unique()
```

```
array(['M', 'F'], dtype=object)
```

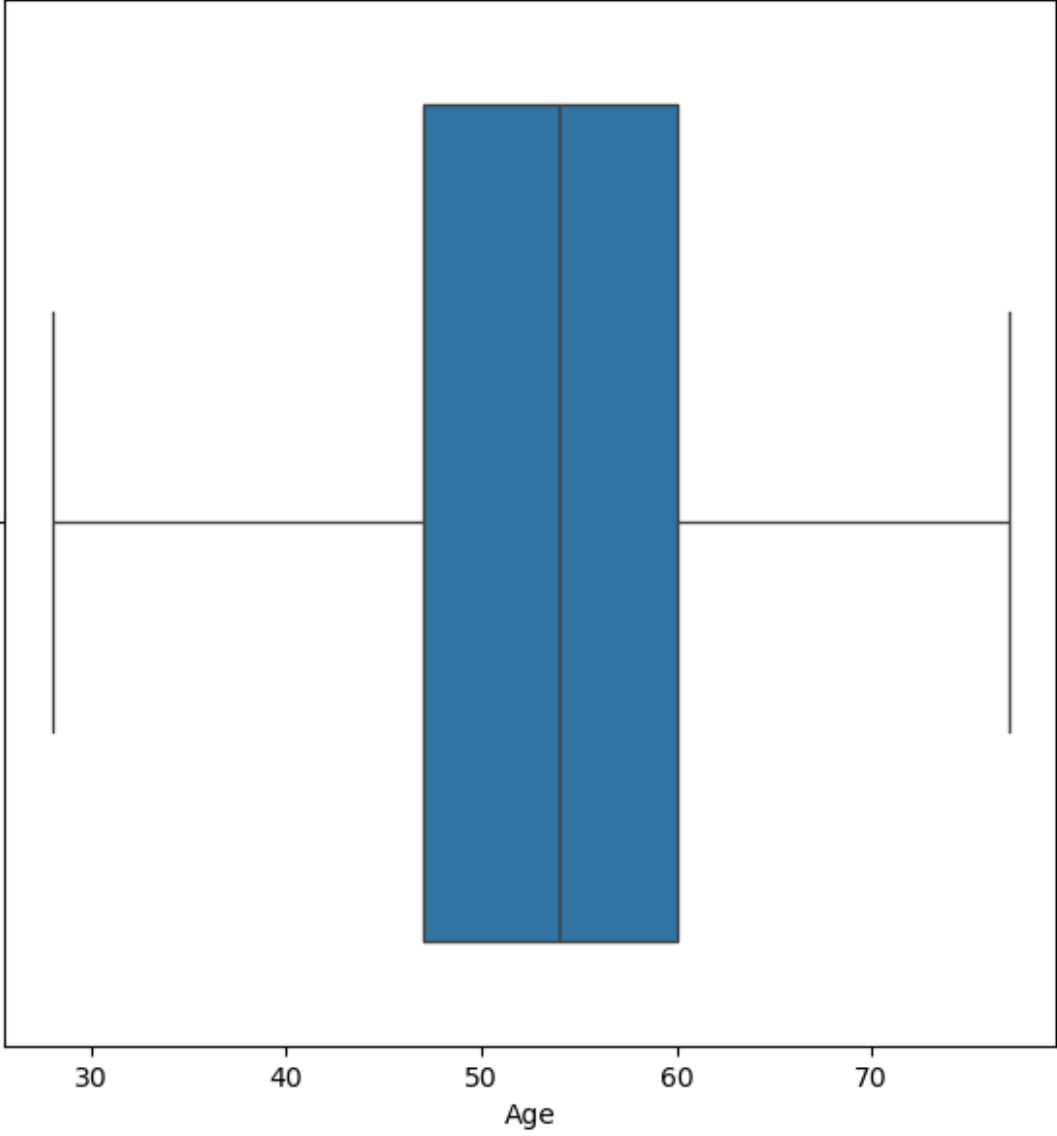
```
df['ChestPainType'].unique()
```

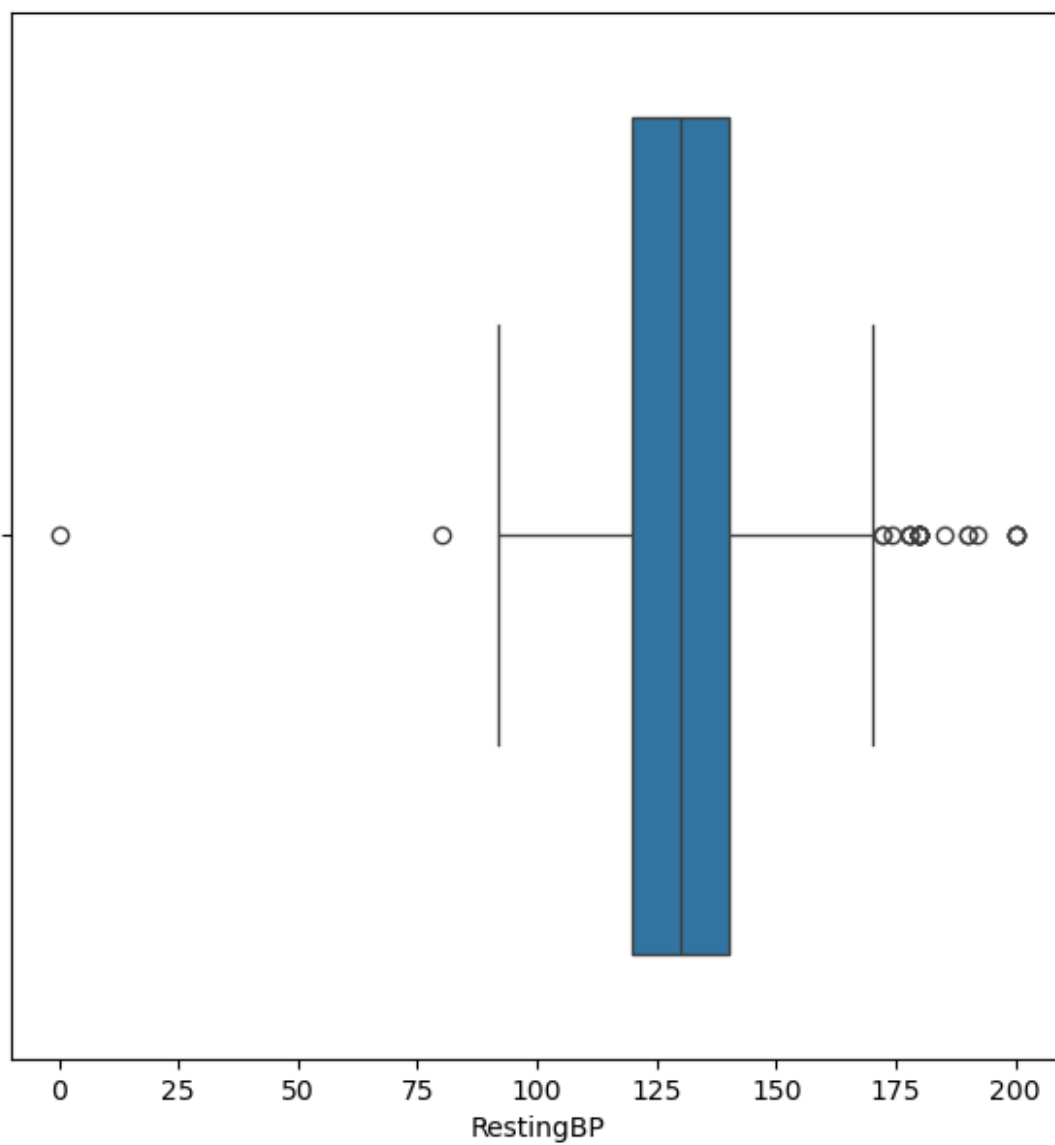
```
array(['ATA', 'NAP', 'ASY', 'TA'], dtype=object)
```

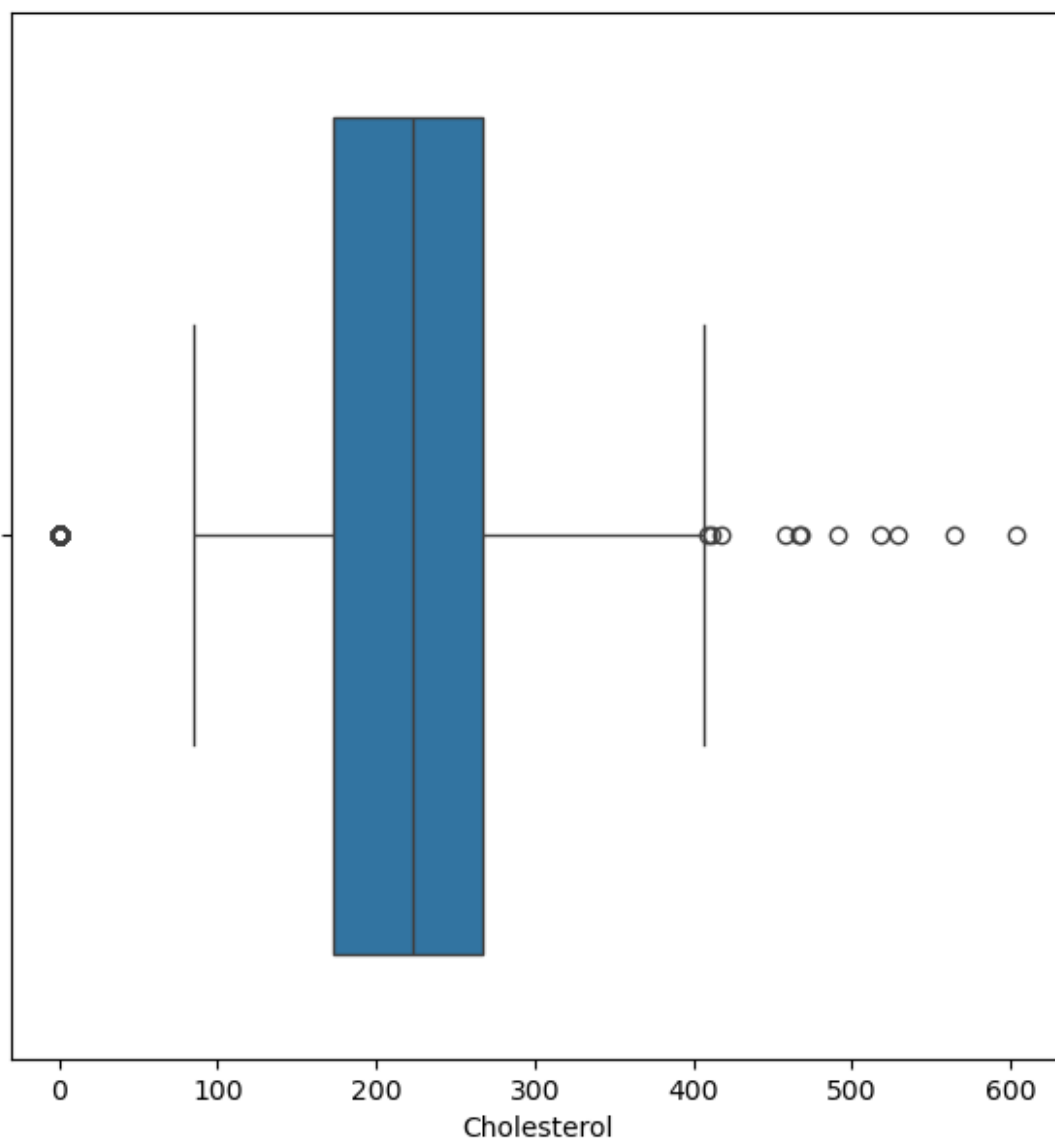
```

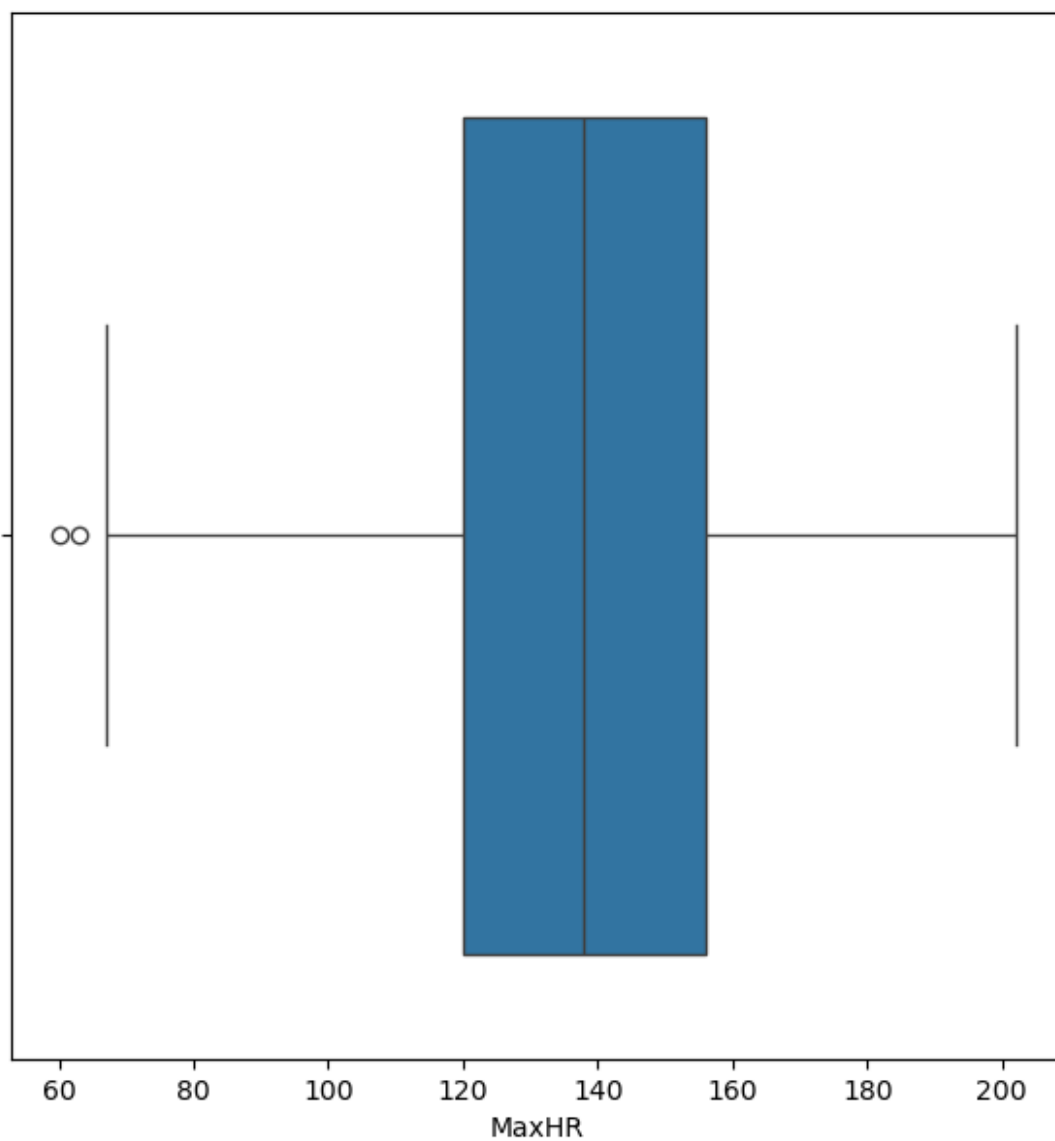
df['RestingECG'].unique()
array(['Normal', 'ST', 'LVH'], dtype=object)
df['ExerciseAngina'].unique()
array(['N', 'Y'], dtype=object)
df['ST_Slope'].unique()
array(['Up', 'Flat', 'Down'], dtype=object)
df['HeartDisease'].unique()
array([0, 1])
df['FastingBS'].unique()
array([0, 1])
df.duplicated().any()
np.False_
df.columns
Index(['Age', 'Sex', 'ChestPainType', 'RestingBP', 'Cholesterol',
       'FastingBS',
       'RestingECG', 'MaxHR', 'ExerciseAngina', 'Oldpeak', 'ST_Slope',
       'HeartDisease'],
      dtype='object')
cols=['Age', 'RestingBP', 'Cholesterol',
      'MaxHR', 'Oldpeak',
      ]
for i in cols:
    plt.figure(figsize=(7,7))
    sns.boxplot(x=df[i])

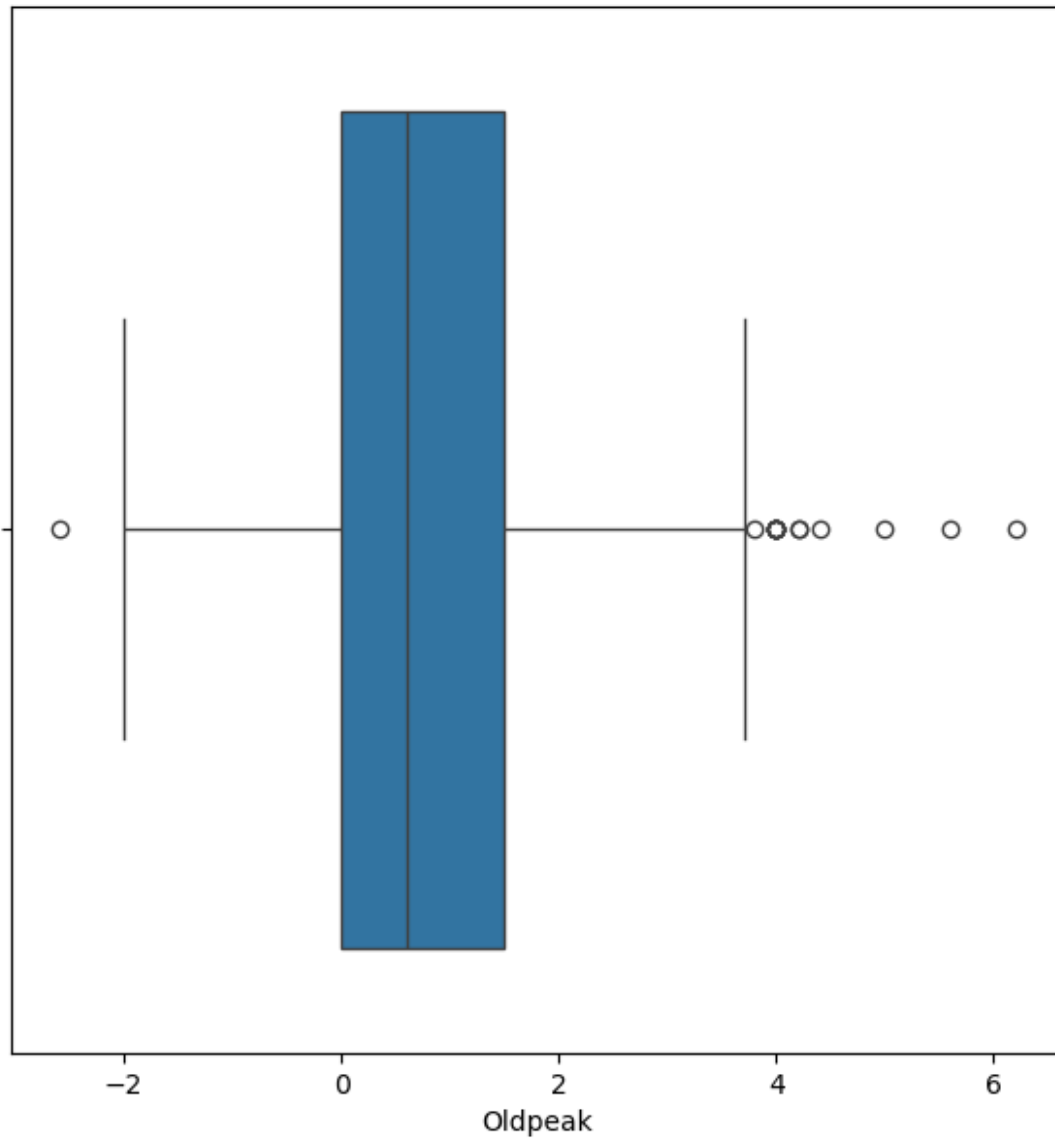
```



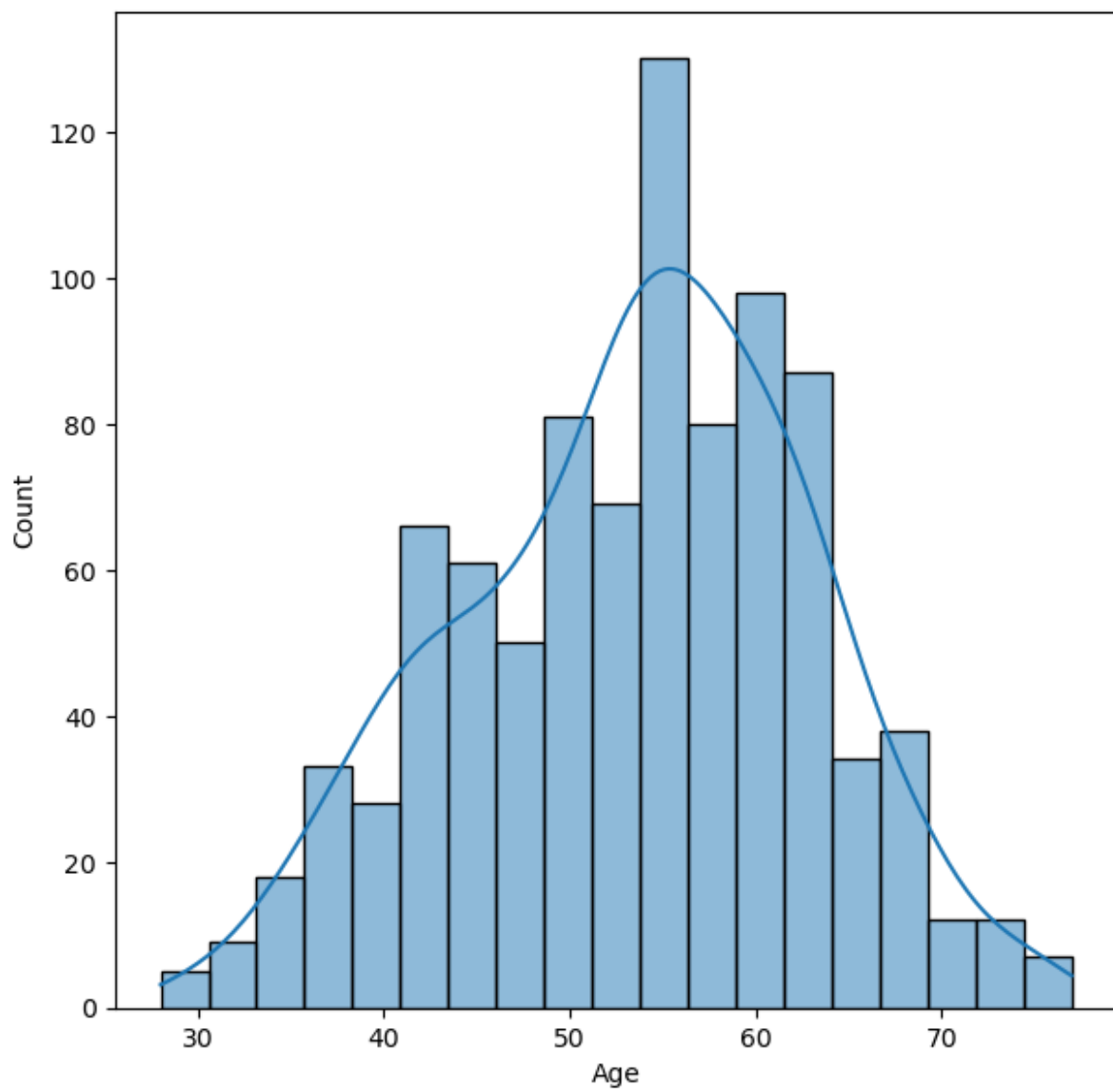


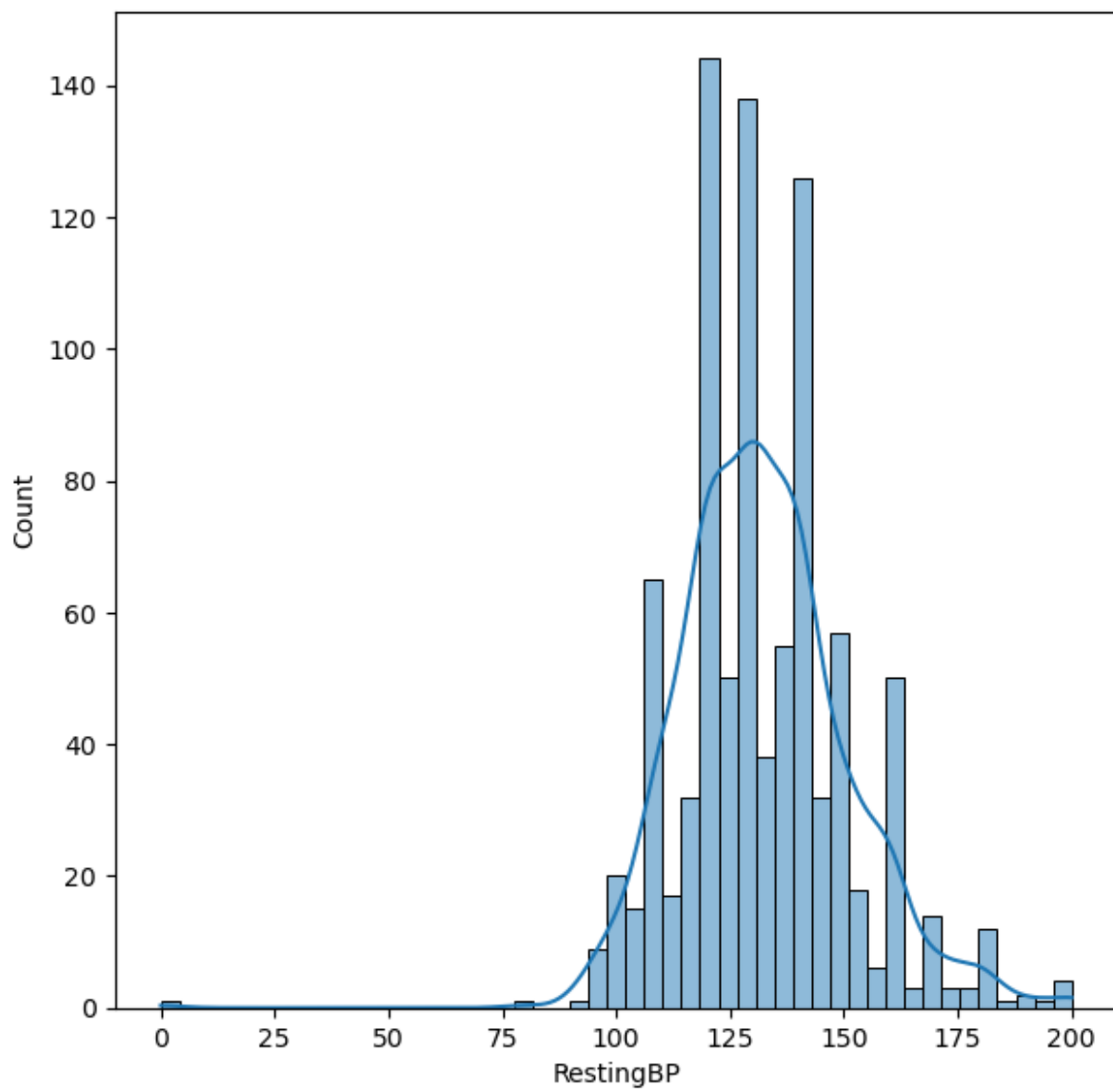


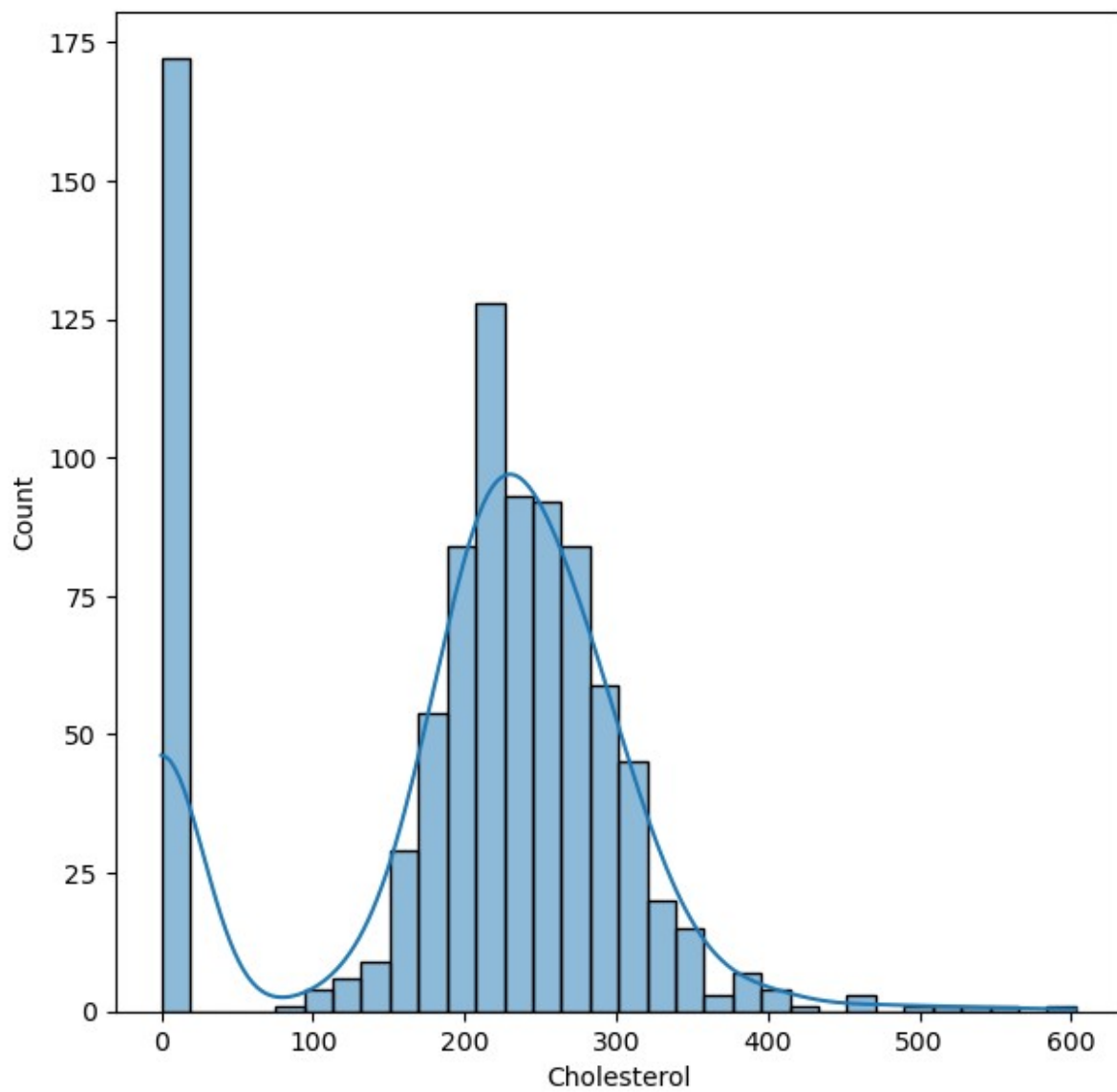


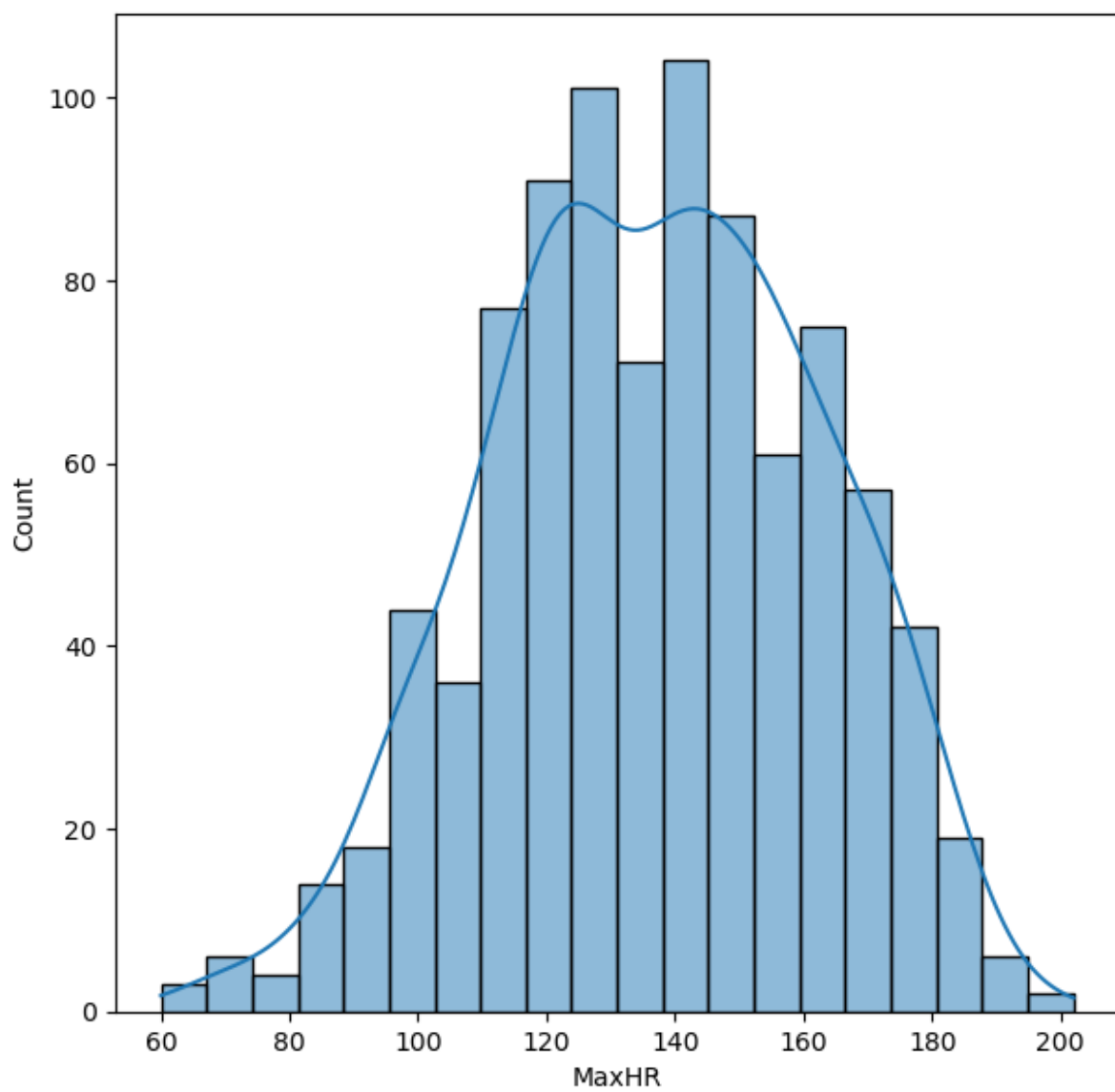


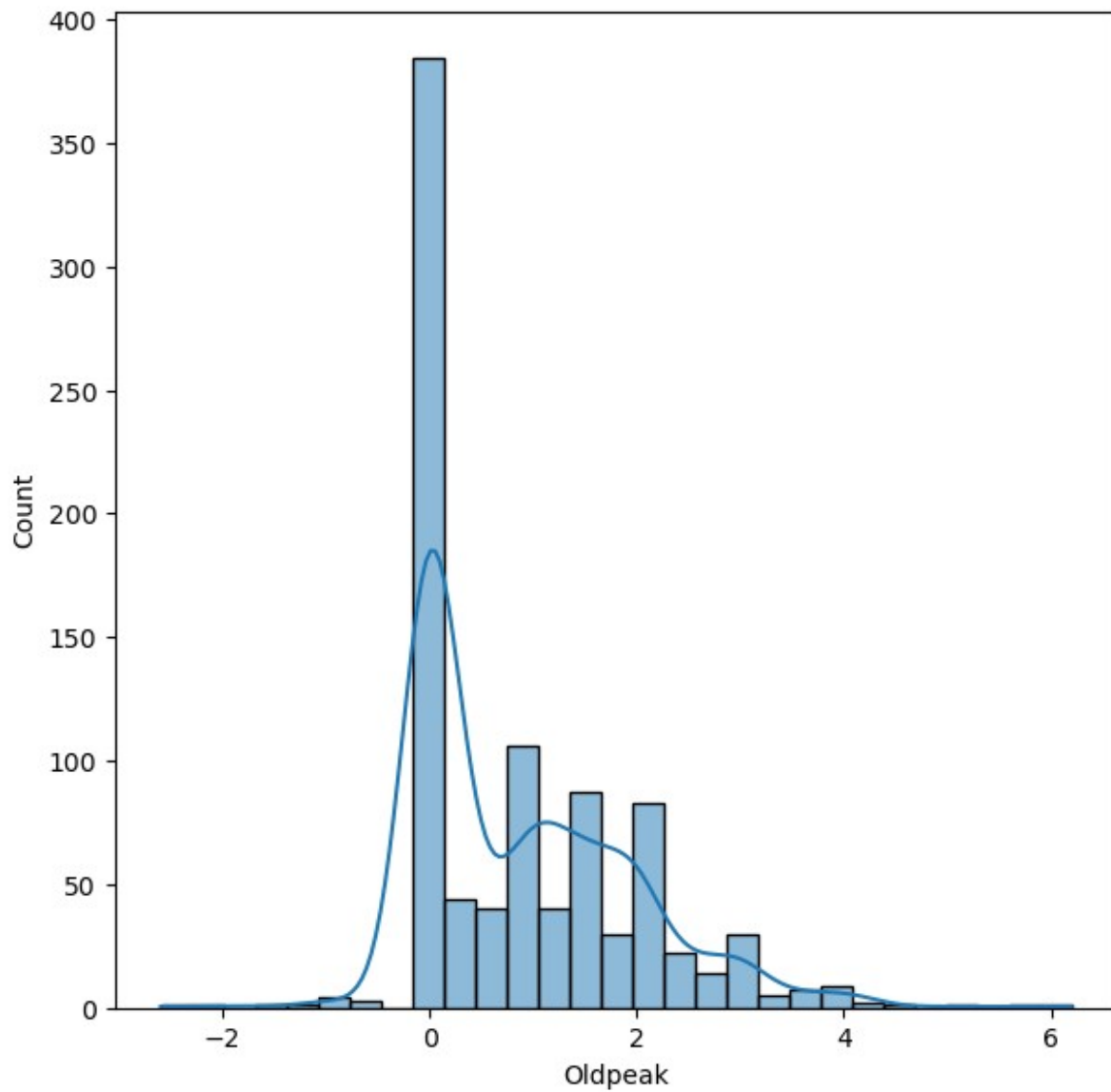
```
for i in cols:  
    plt.figure(figsize=(7,7))  
    sns.histplot(x=df[i],kde=True)
```

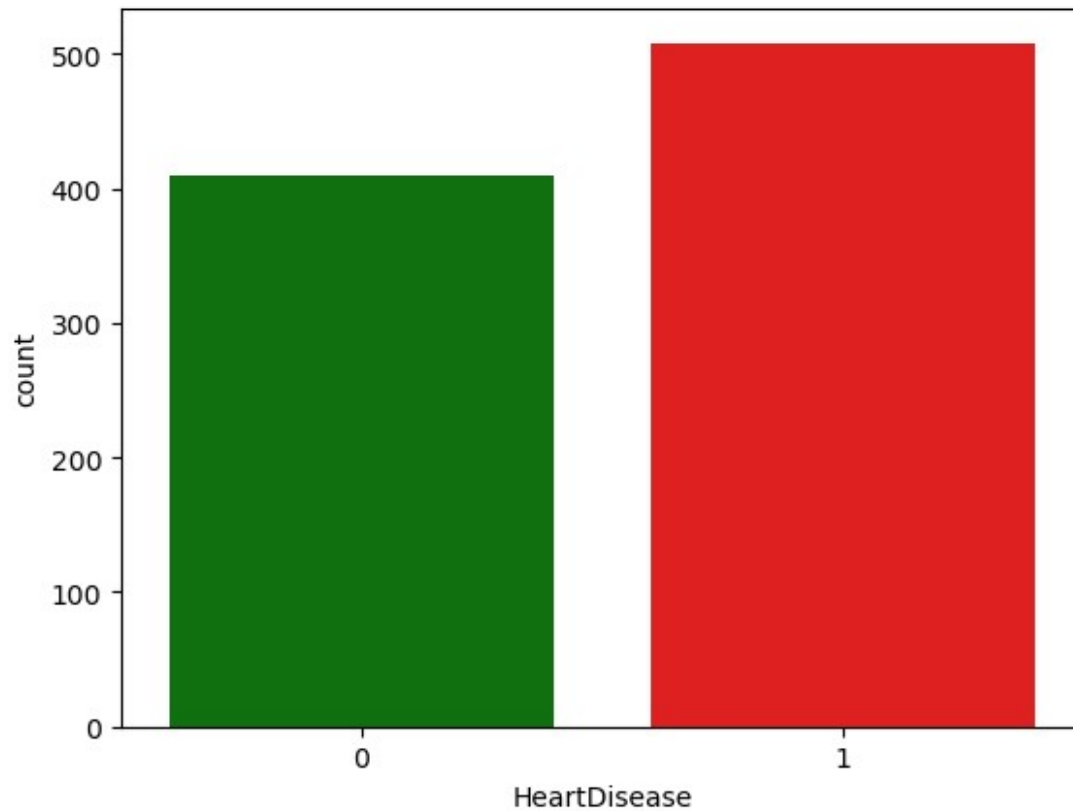




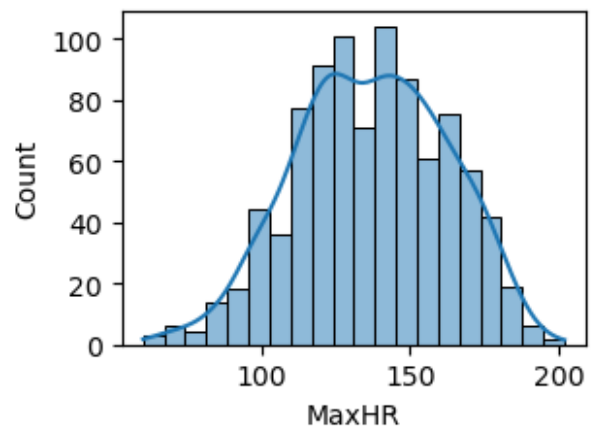
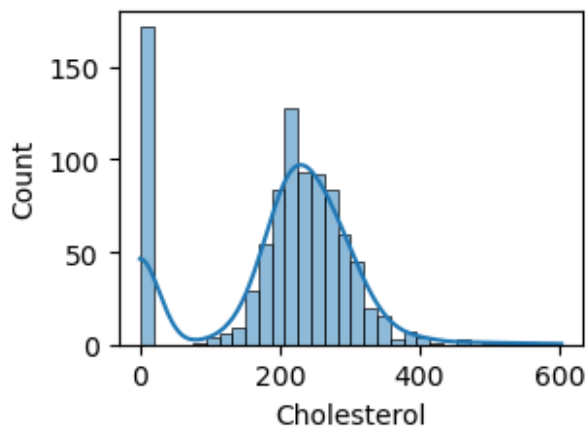
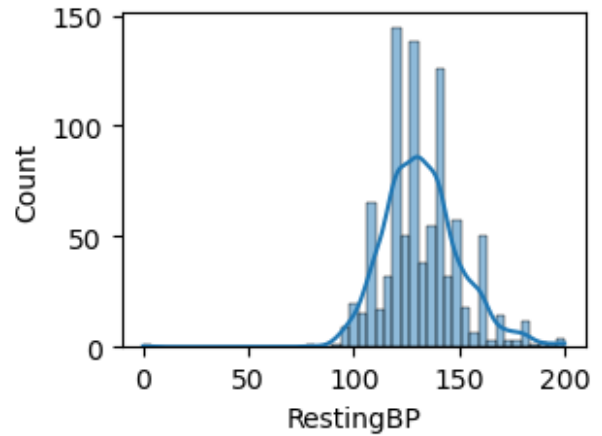
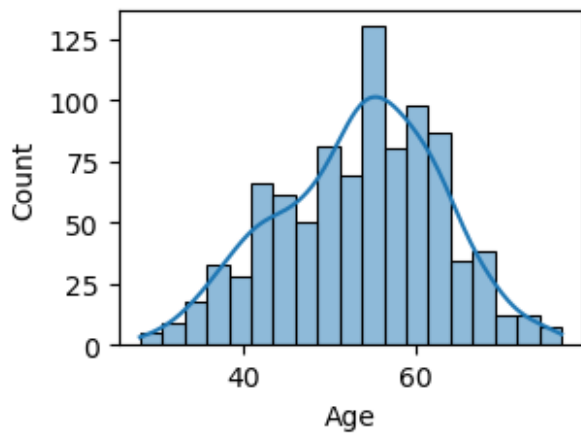




```
sns.countplot(x=df['HeartDisease'],palette=['green','red'])  
<Axes: xlabel='HeartDisease', ylabel='count'>
```



```
def plotting(var,num):  
    plt.subplot(2,2,num)  
    sns.histplot(df[var],kde=True)  
  
plotting('Age',1)  
plotting('RestingBP',2)  
plotting('Cholesterol',3)  
plotting('MaxHR',4)  
plt.tight_layout()
```



```
df_clean=df.copy()

ch_mean=df_clean.loc[df_clean['Cholesterol'] !=
0,'Cholesterol'].mean()

ch_mean

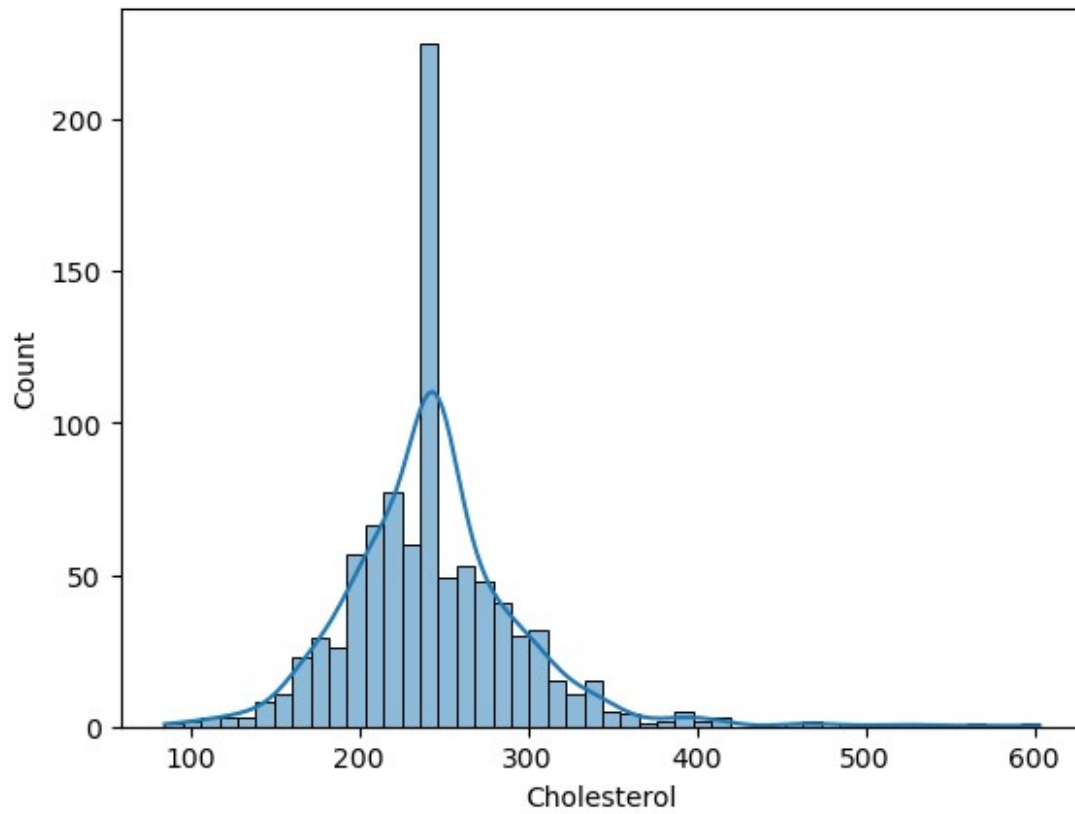
np.float64(244.6353887399464)

df_clean['Cholesterol']=df_clean['Cholesterol'].replace(0,ch_mean)
df_clean['Cholesterol']=df_clean['Cholesterol'].round(2)

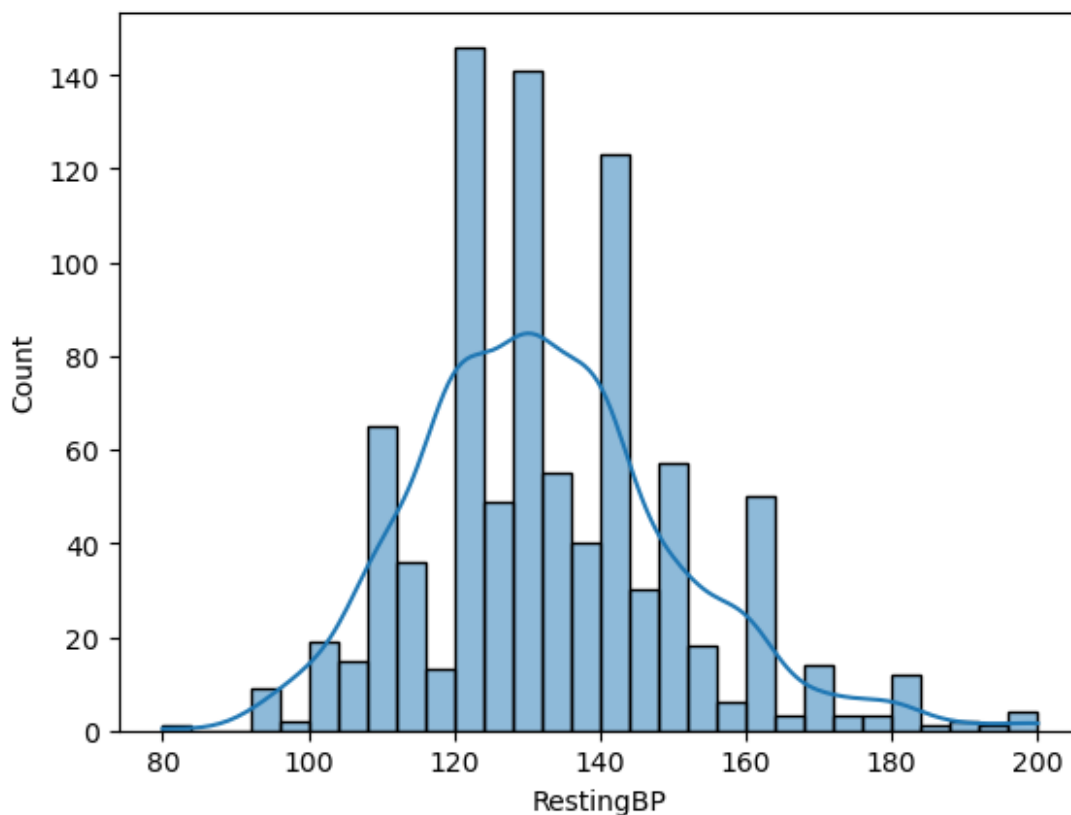
ch_mean=df_clean.loc[df_clean['RestingBP'] != 0,'RestingBP'].mean()
df_clean['RestingBP']=df_clean['RestingBP'].replace(0,ch_mean)
df_clean['RestingBP']=df_clean['RestingBP'].round(2)

sns.histplot(df_clean['Cholesterol'],kde=True)

<Axes: xlabel='Cholesterol', ylabel='Count'>
```



```
sns.histplot(df_clean['RestingBP'],kde=True)  
<Axes: xlabel='RestingBP', ylabel='Count'>
```

```
df_clean['Sex']=df['Sex'].map({'M':1 , 'F':0})
```

```
df_clean.rename(columns={'Sex':'is_Male'},inplace=True)
```

```
df_clean
```

	Age	is_Male	ChestPainType	RestingBP	Cholesterol	FastingBS
RestingECG \						
0	40	1	ATA	140.0	289.0	0
Normal						
1	49	0	NAP	160.0	180.0	0
Normal						
2	37	1	ATA	130.0	283.0	0
ST						
3	48	0	ASY	138.0	214.0	0
Normal						
4	54	1	NAP	150.0	195.0	0
Normal						
...
...						
913	45	1	TA	110.0	264.0	0
Normal						
914	68	1	ASY	144.0	193.0	1
Normal						
915	57	1	ASY	130.0	131.0	0

Normal						
916	57	0	ATA	130.0	236.0	0
LVH						
917	38	1	NAP	138.0	175.0	0
Normal						

	MaxHR	ExerciseAngina	Oldpeak	ST_Slope	HeartDisease
0	172	N	0.0	Up	0
1	156	N	1.0	Flat	1
2	98	N	0.0	Up	0
3	108	Y	1.5	Flat	1
4	122	N	0.0	Up	0
..
913	132	N	1.2	Flat	1
914	141	N	3.4	Flat	1
915	115	Y	1.2	Flat	1
916	174	N	0.0	Flat	1
917	173	N	0.0	Up	0

[918 rows x 12 columns]

```
df_clean=pd.get_dummies(df_clean,columns=['ChestPainType'],drop_first=False)
```

df_clean

	Age	is_Male	RestingBP	Cholesterol	FastingBS	RestingECG	MaxHR
\							
0	40	1	140.0	289.0	0	Normal	172
1	49	0	160.0	180.0	0	Normal	156
2	37	1	130.0	283.0	0	ST	98
3	48	0	138.0	214.0	0	Normal	108
4	54	1	150.0	195.0	0	Normal	122
..
913	45	1	110.0	264.0	0	Normal	132
914	68	1	144.0	193.0	1	Normal	141
915	57	1	130.0	131.0	0	Normal	115
916	57	0	130.0	236.0	0	LVH	174
917	38	1	138.0	175.0	0	Normal	173

	ExerciseAngina	Oldpeak	ST_Slope	HeartDisease	ChestPainType_ASY
0	N	0.0	Up	0	False
1	N	1.0	Flat	1	False
2	N	0.0	Up	0	False
3	Y	1.5	Flat	1	True
4	N	0.0	Up	0	False
..
913	N	1.2	Flat	1	False
914	N	3.4	Flat	1	True
915	Y	1.2	Flat	1	True
916	N	0.0	Flat	1	False
917	N	0.0	Up	0	False

	ChestPainType_ATA	ChestPainType_NAP	ChestPainType_TA
0	True	False	False
1	False	True	False
2	True	False	False
3	False	False	False
4	False	True	False
..
913	False	False	True
914	False	False	False
915	False	False	False
916	True	False	False
917	False	True	False

[918 rows x 15 columns]

```
df_clean=pd.get_dummies(df_clean,columns=['RestingECG'],drop_first=False)
```

```
df_clean=pd.get_dummies(df_clean,columns=['ExerciseAngina'],drop_first=False)
```

```
df_clean=pd.get_dummies(df_clean,columns=['ST_Slope'],drop_first=False)
```

```
df_clean
```

	Age	is_Male	RestingBP	Cholesterol	FastingBS	MaxHR	
Oldpeak \							
0	40	1	140.0	289.0	0	172	0.0
1	49	0	160.0	180.0	0	156	1.0
2	37	1	130.0	283.0	0	98	0.0
3	48	0	138.0	214.0	0	108	1.5
4	54	1	150.0	195.0	0	122	0.0
..
913	45	1	110.0	264.0	0	132	1.2
914	68	1	144.0	193.0	1	141	3.4
915	57	1	130.0	131.0	0	115	1.2
916	57	0	130.0	236.0	0	174	0.0
917	38	1	138.0	175.0	0	173	0.0
	HeartDisease	ChestPainType_ASY	ChestPainType_ATA				
ChestPainType_NAP \							
0	0	False	True				
False							
1	1	False	False				
True							
2	0	False	True				
False							
3	1	True	False				
False							
4	0	False	False				
True							
..				
...							
913	1	False	False				
False							
914	1	True	False				
False							
915	1	True	False				
False							
916	1	False	True				
False							
917	0	False	False				
True							
	ChestPainType_TA	RestingECG_LVH	RestingECG_Normal				

RestingECG_ST \				
0	False	False	True	
False				
1	False	False	True	
False				
2	False	False	False	
True				
3	False	False	True	
False				
4	False	False	True	
False				
..
.				
913	True	False	True	
False				
914	False	False	True	
False				
915	False	False	True	
False				
916	False	True	False	
False				
917	False	False	True	
False				
	ExerciseAngina_N	ExerciseAngina_Y	ST_Slope_Down	ST_Slope_Flat
\				
0	True	False	False	False
1	True	False	False	True
2	True	False	False	False
3	False	True	False	True
4	True	False	False	False
..
913	True	False	False	True
914	True	False	False	True
915	False	True	False	True
916	True	False	False	True
917	True	False	False	False
	ST_Slope_Up			
0	True			

```
1      False
2      True
3      False
4      True
..
913    False
914    False
915    False
916    False
917     True
```

```
[918 rows x 20 columns]
```

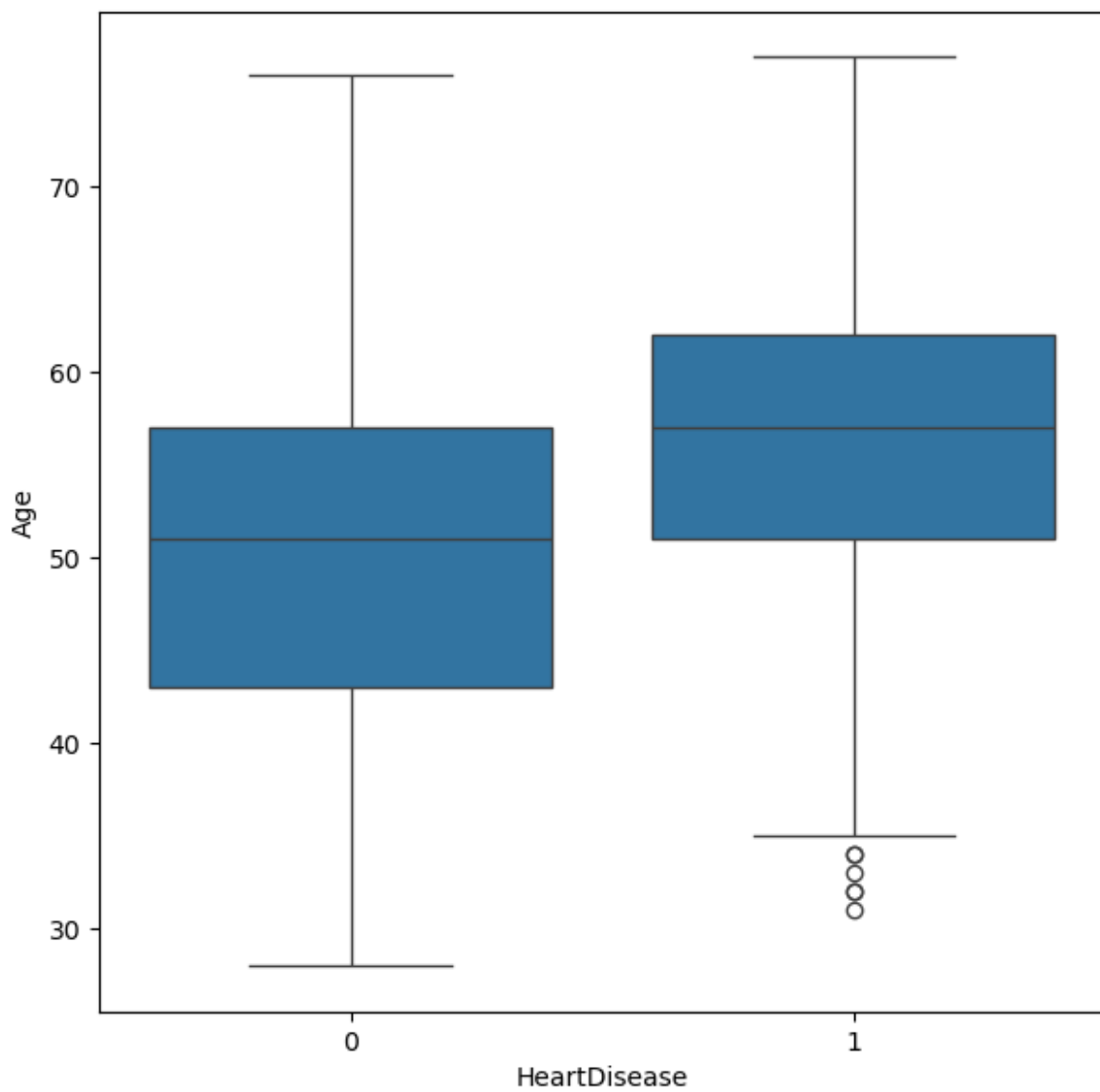
```
df_clean=df_clean.astype(int)
```

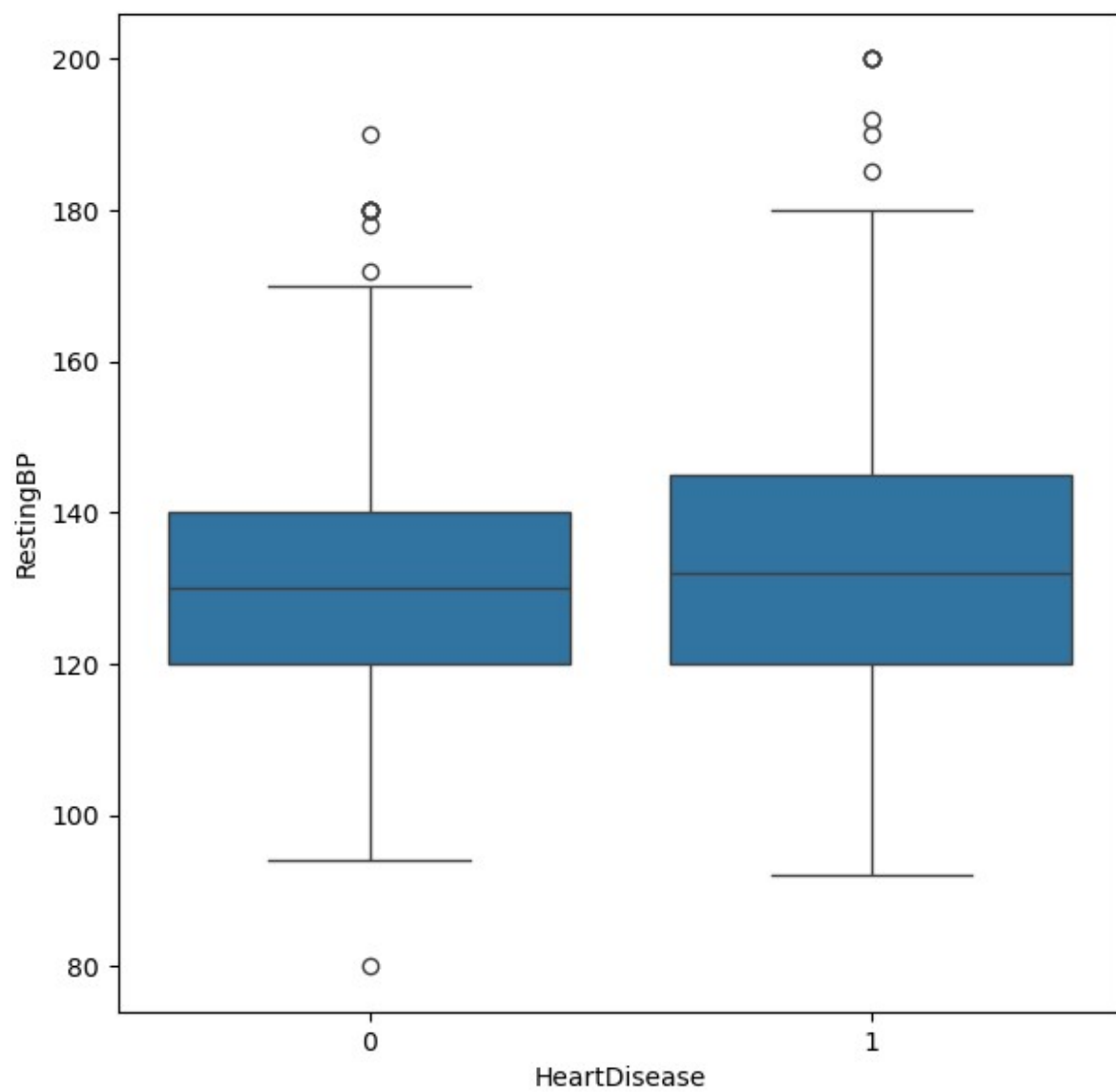
```
numeric_cols=['Age', 'RestingBP', 'Cholesterol', 'MaxHR', 'Oldpeak',
'HeartDisease']
```

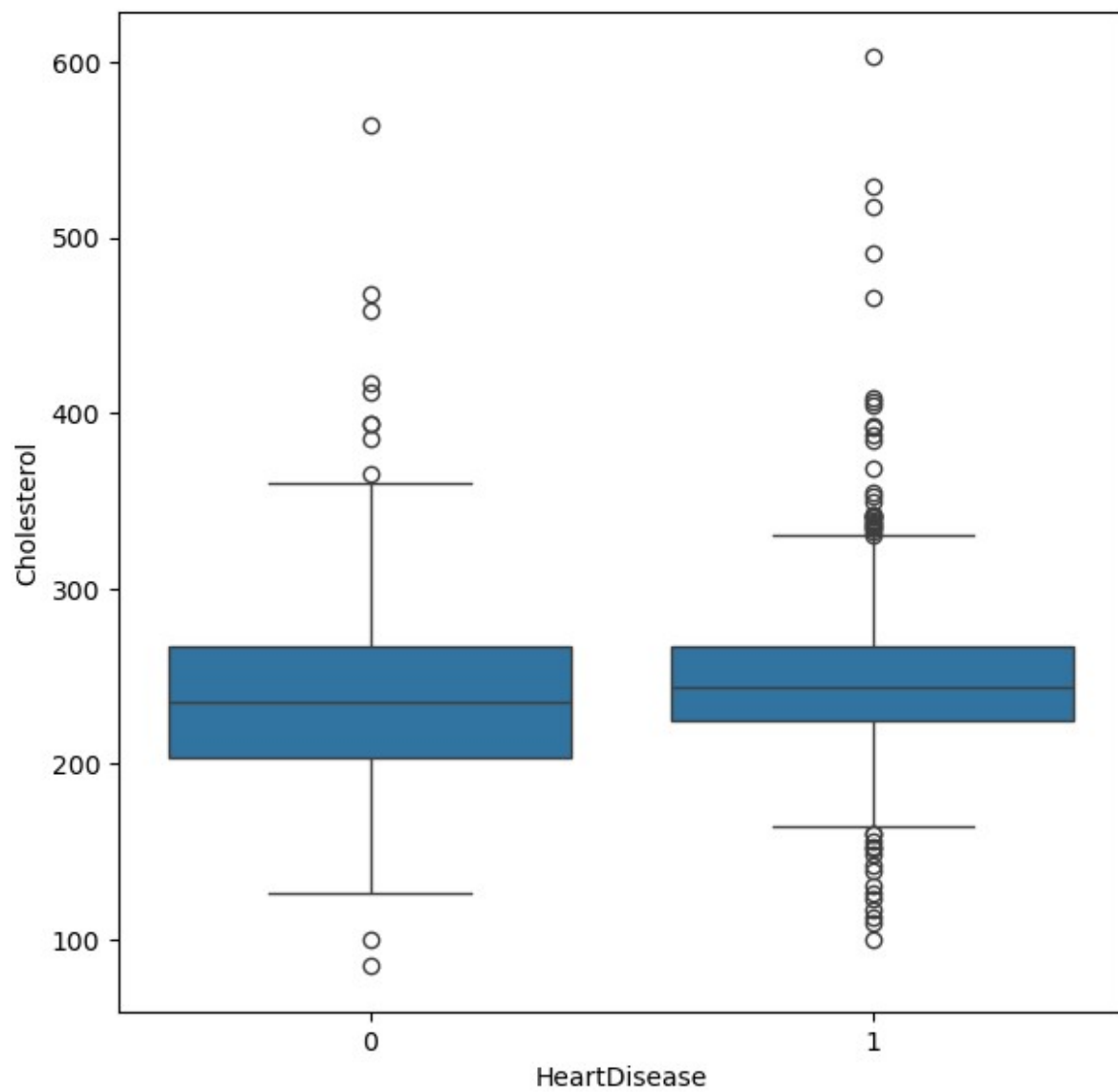
```
for i in numeric_cols:
```

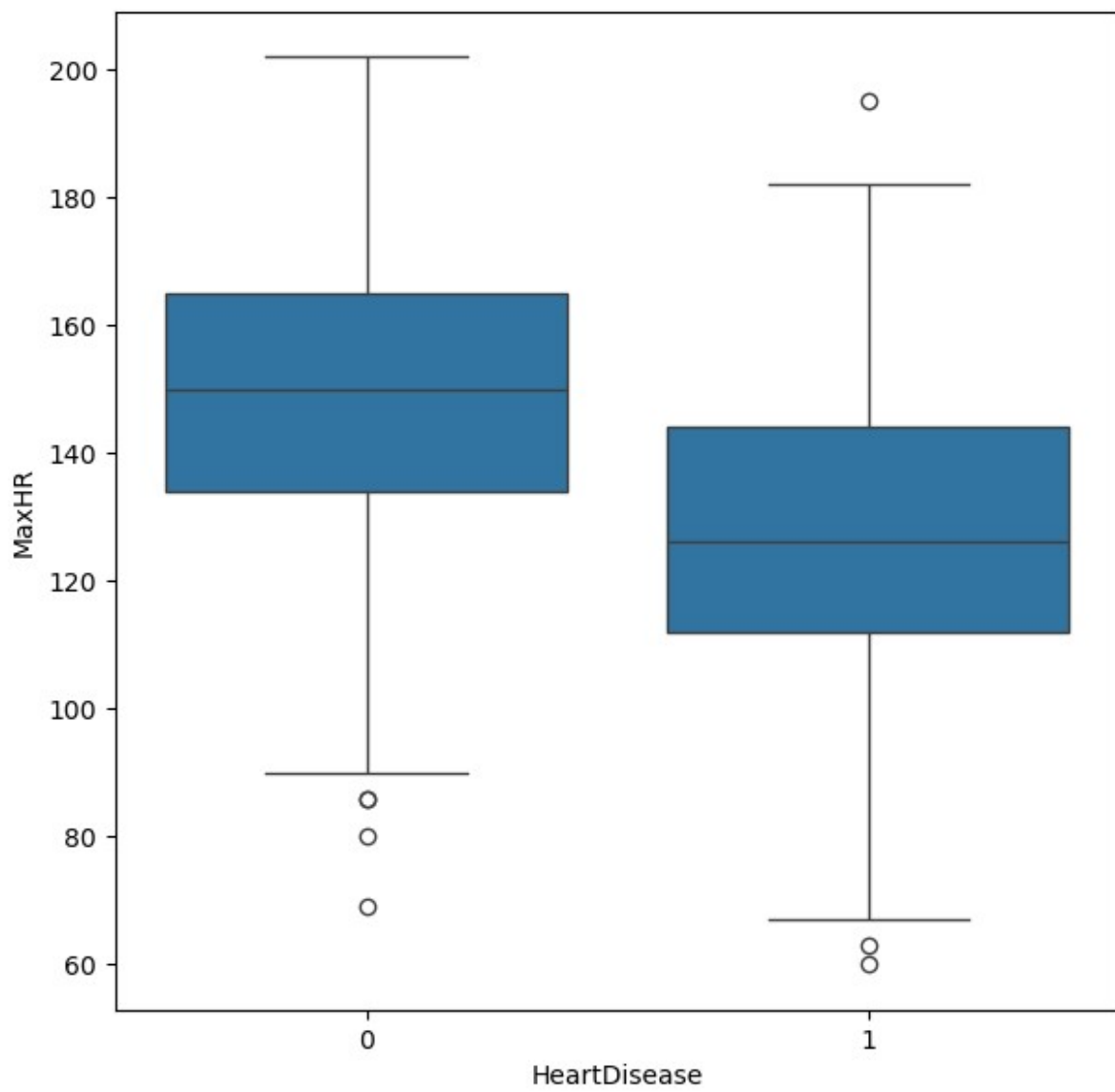
```
    plt.figure(figsize=(7,7))
```

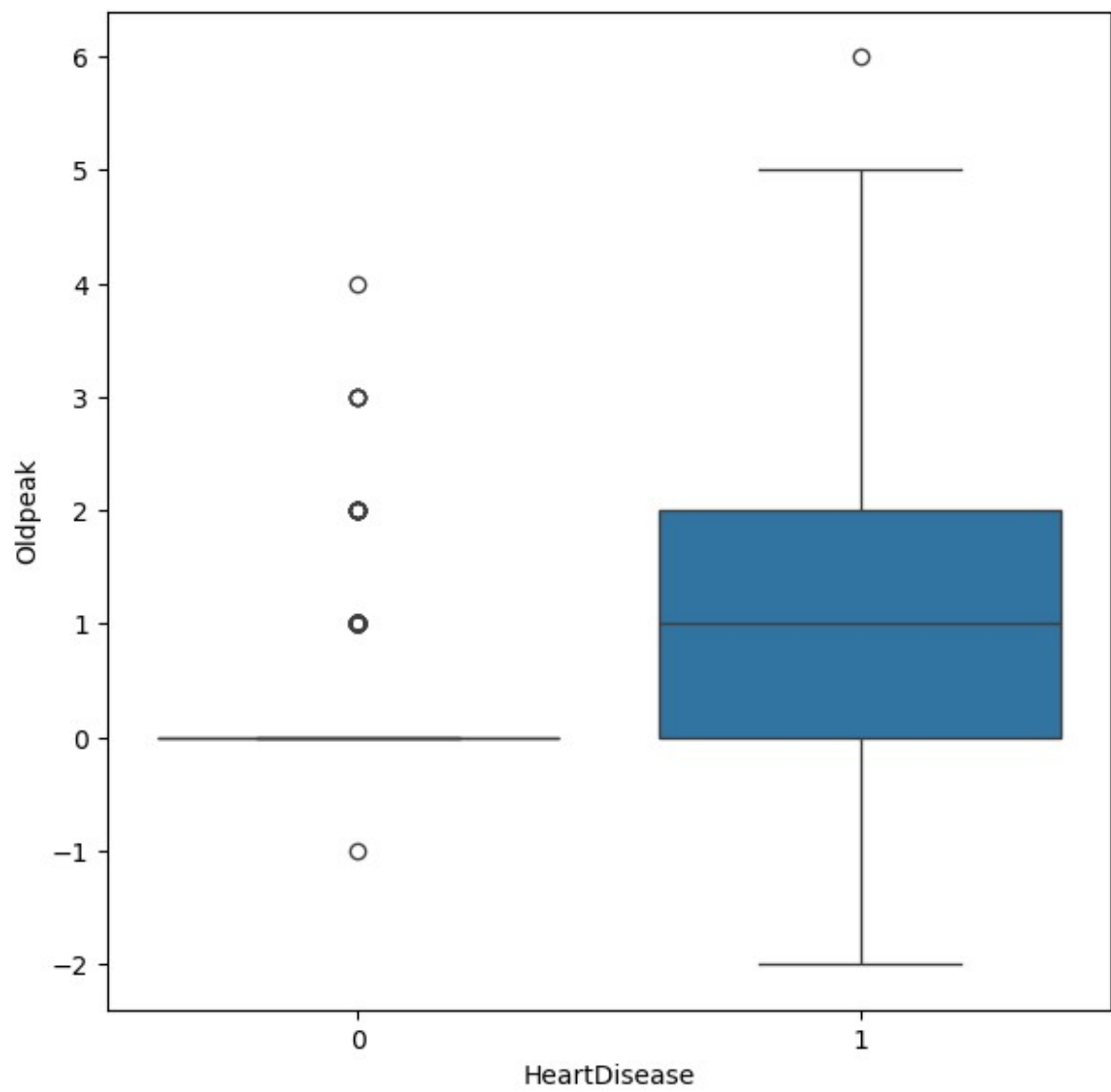
```
    sns.boxplot(y=i,x='HeartDisease',data=df_clean)
```

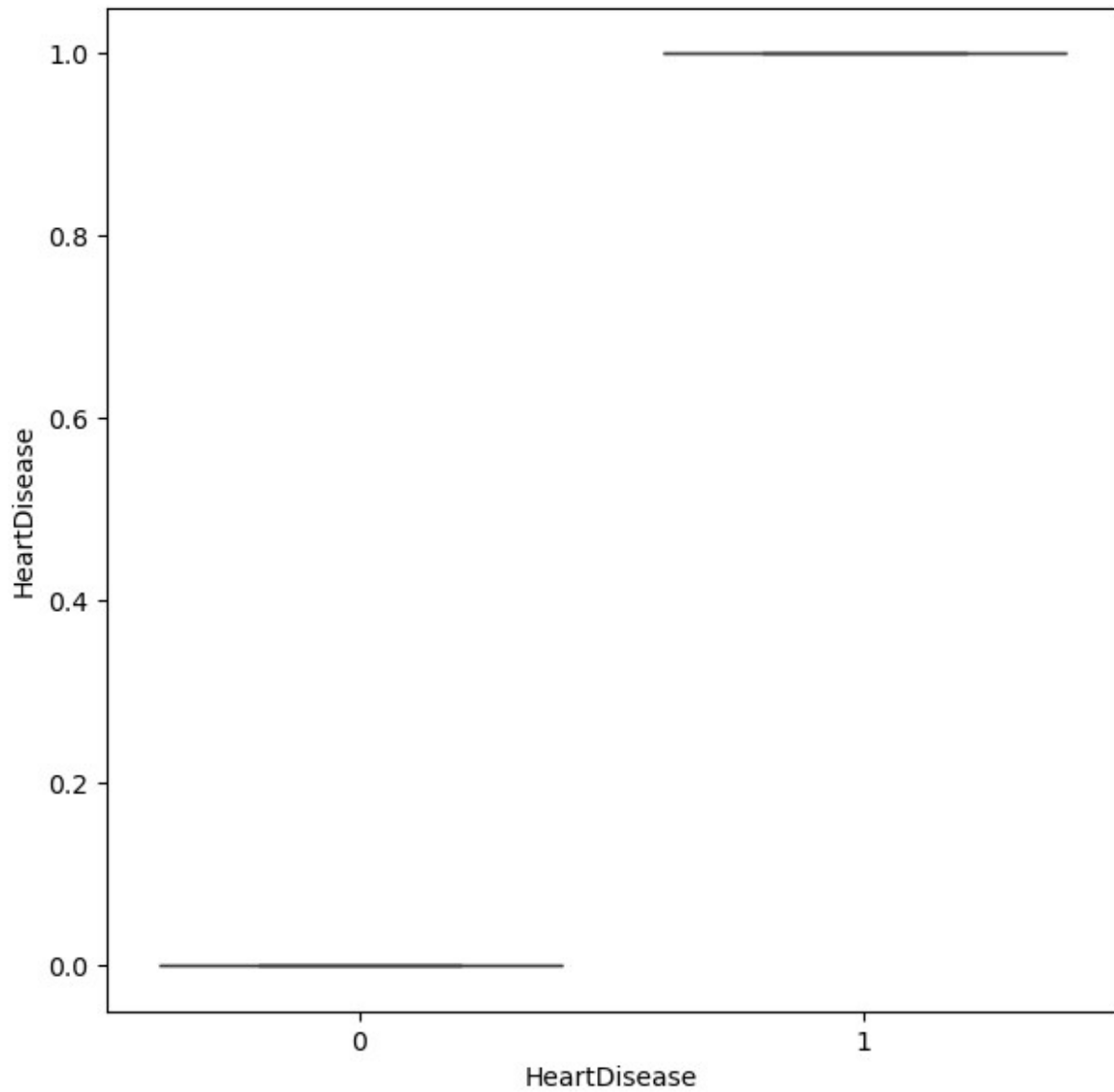




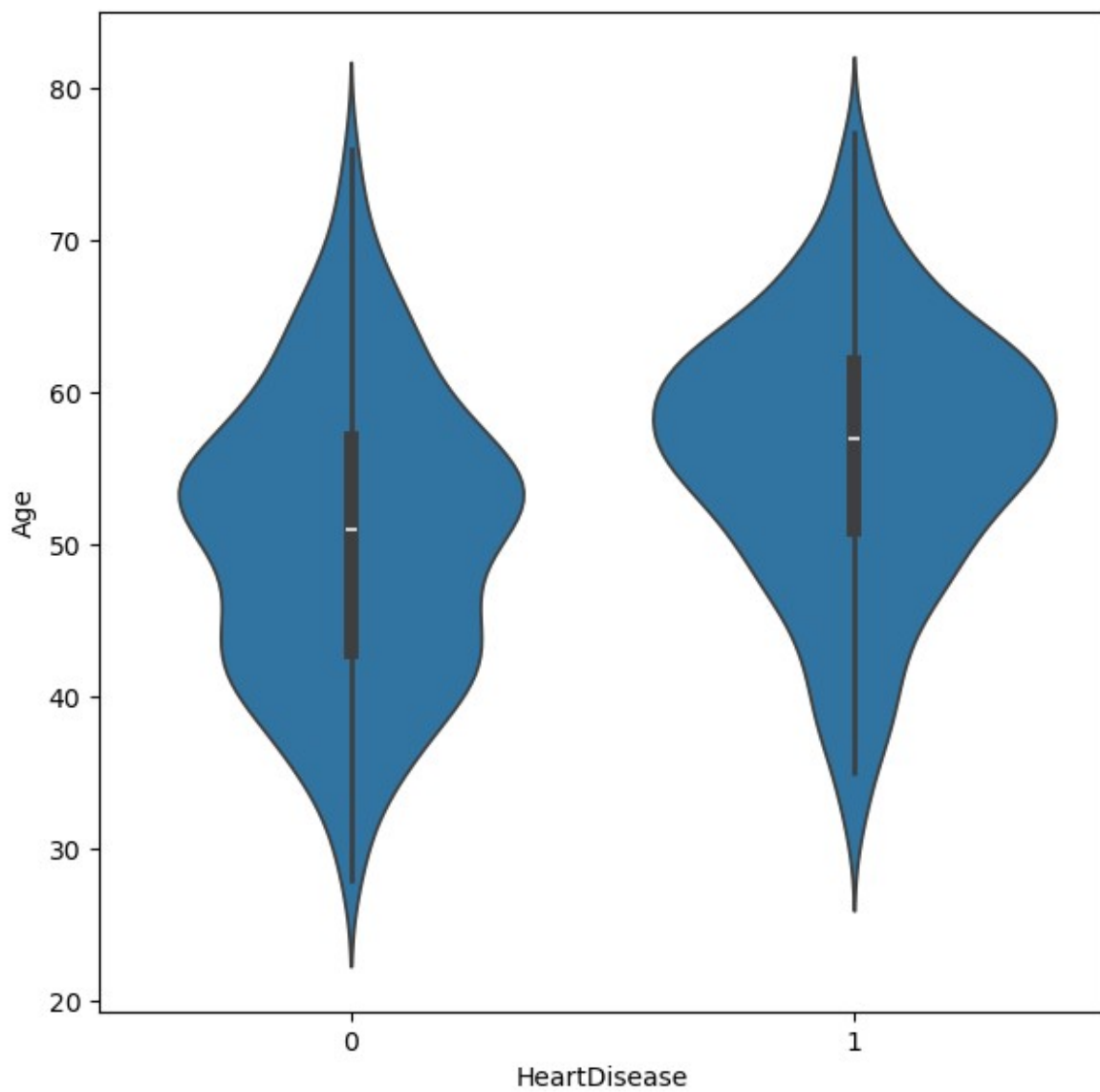


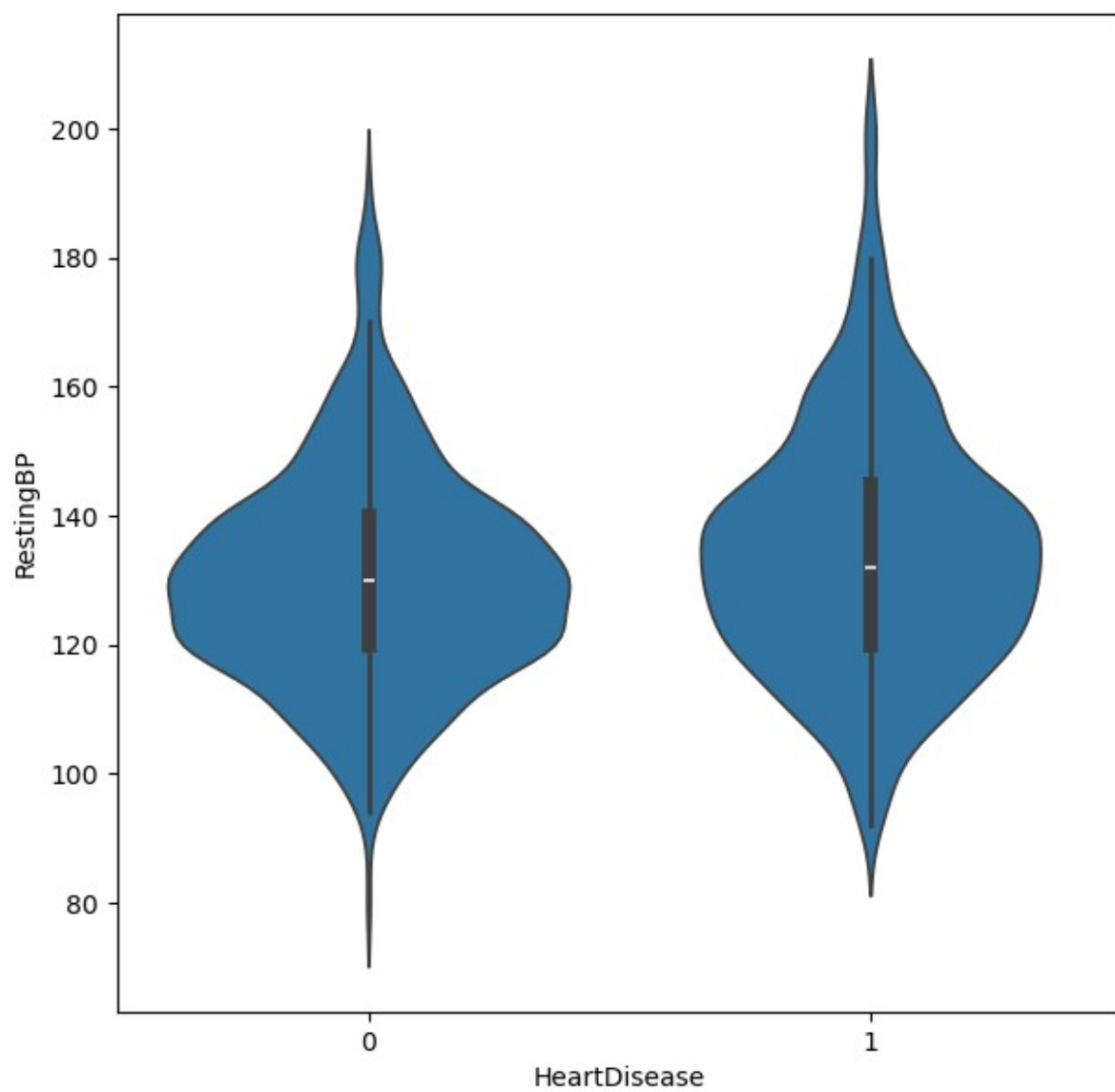


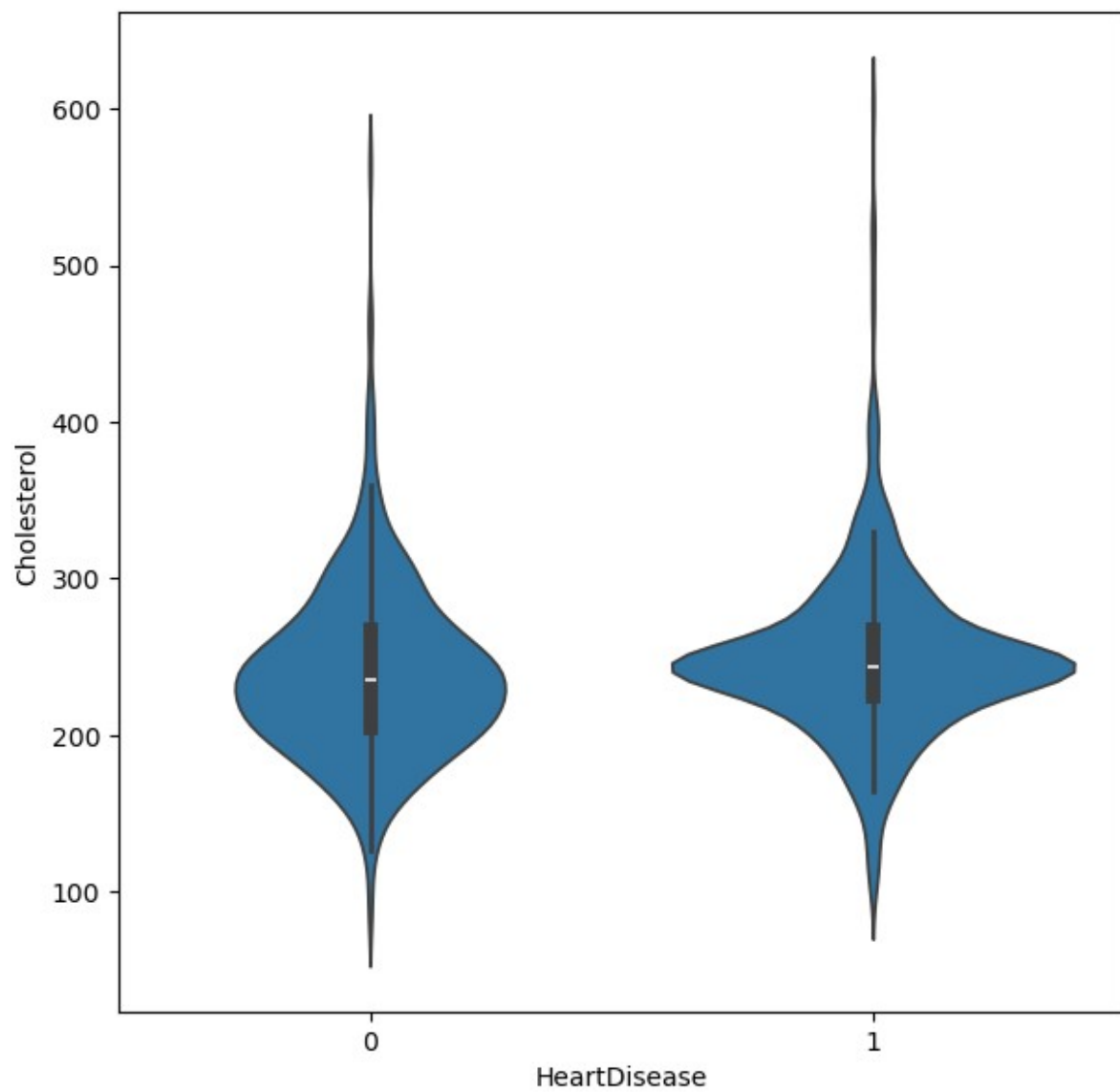


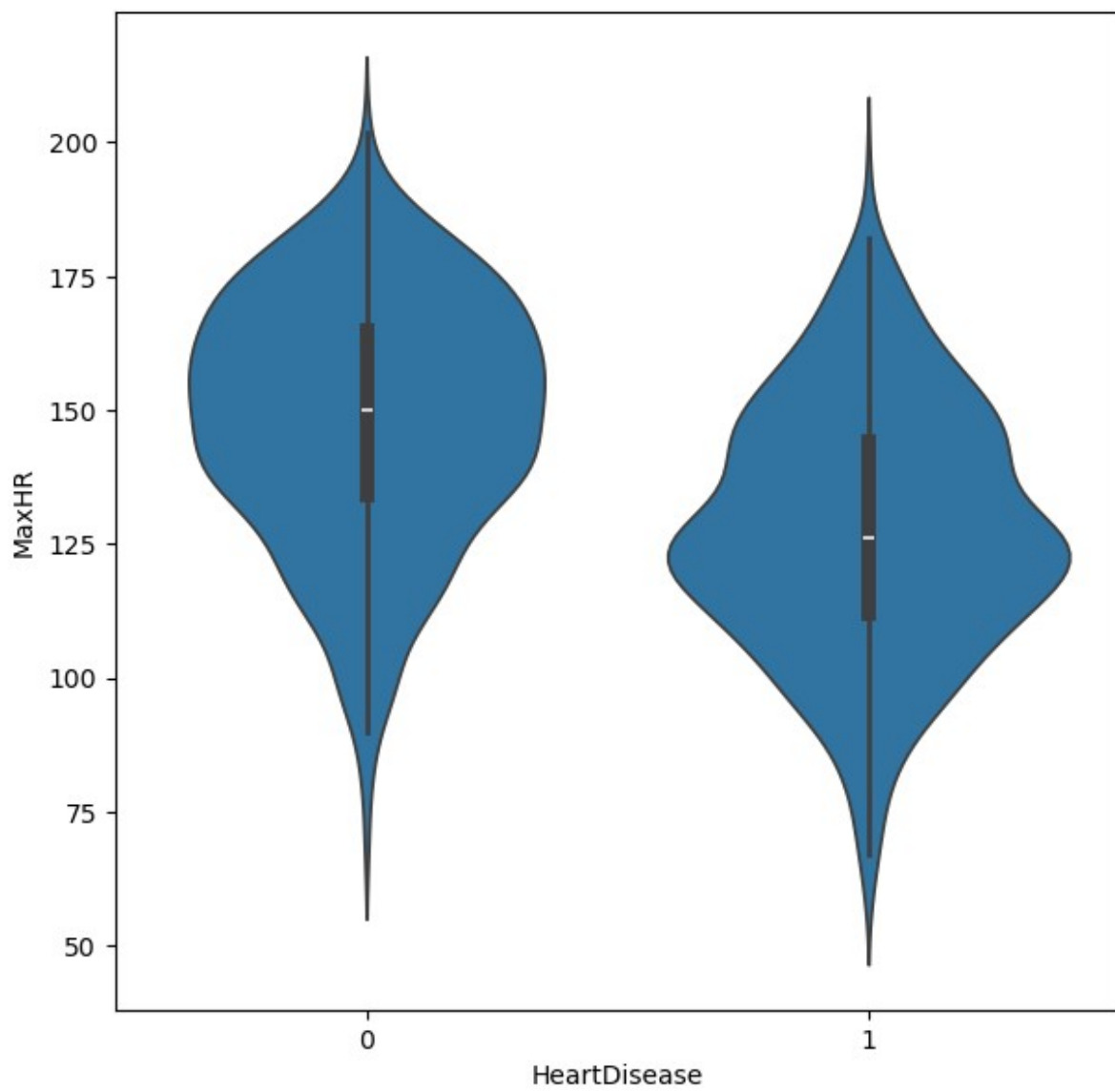


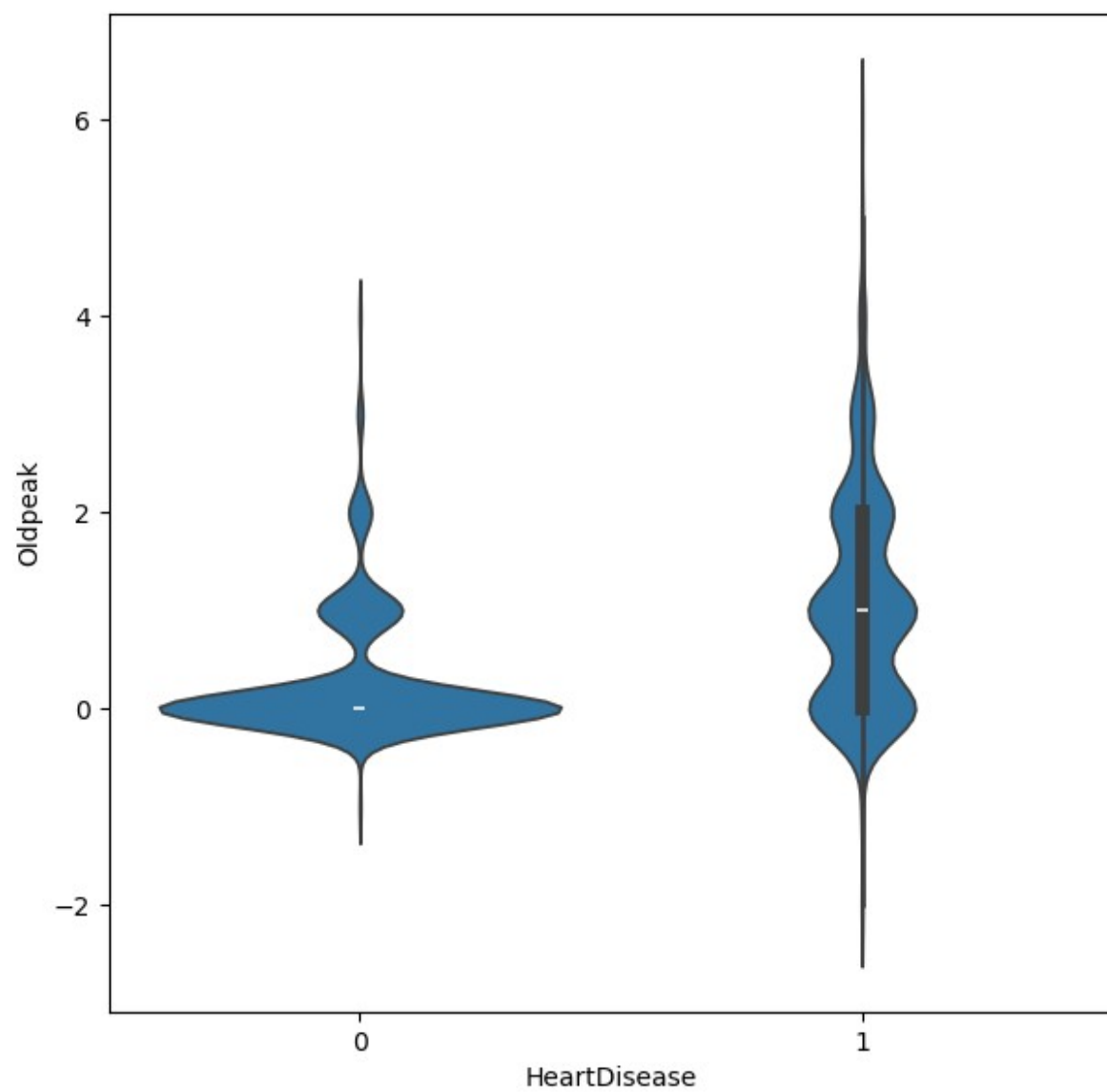
```
numeric_cols=['Age', 'RestingBP', 'Cholesterol', 'MaxHR', 'Oldpeak',  
'HeartDisease']  
for i in numeric_cols:  
    plt.figure(figsize=(7,7))  
    sns.violinplot(y=i,x='HeartDisease',data=df_clean)
```

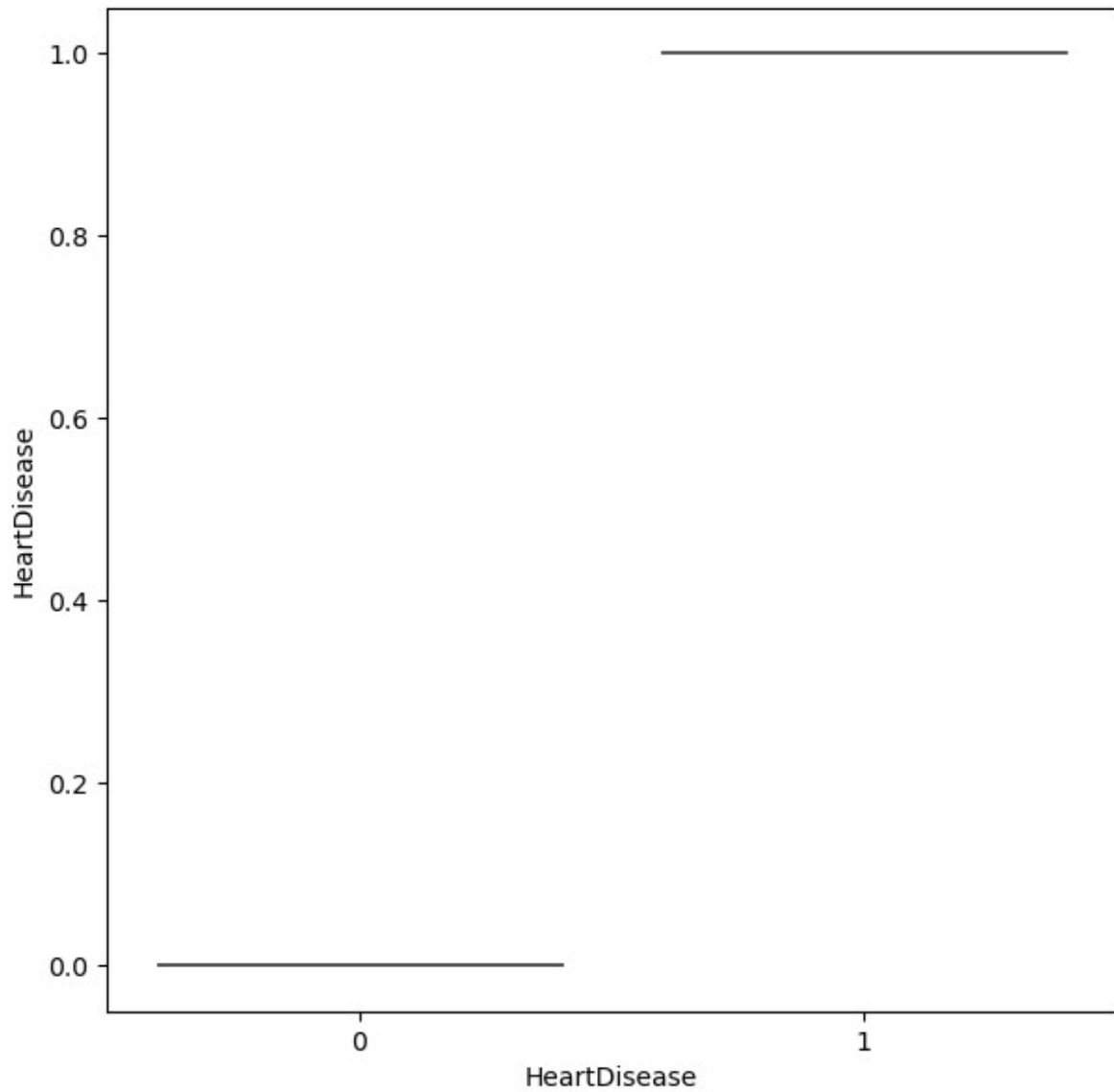








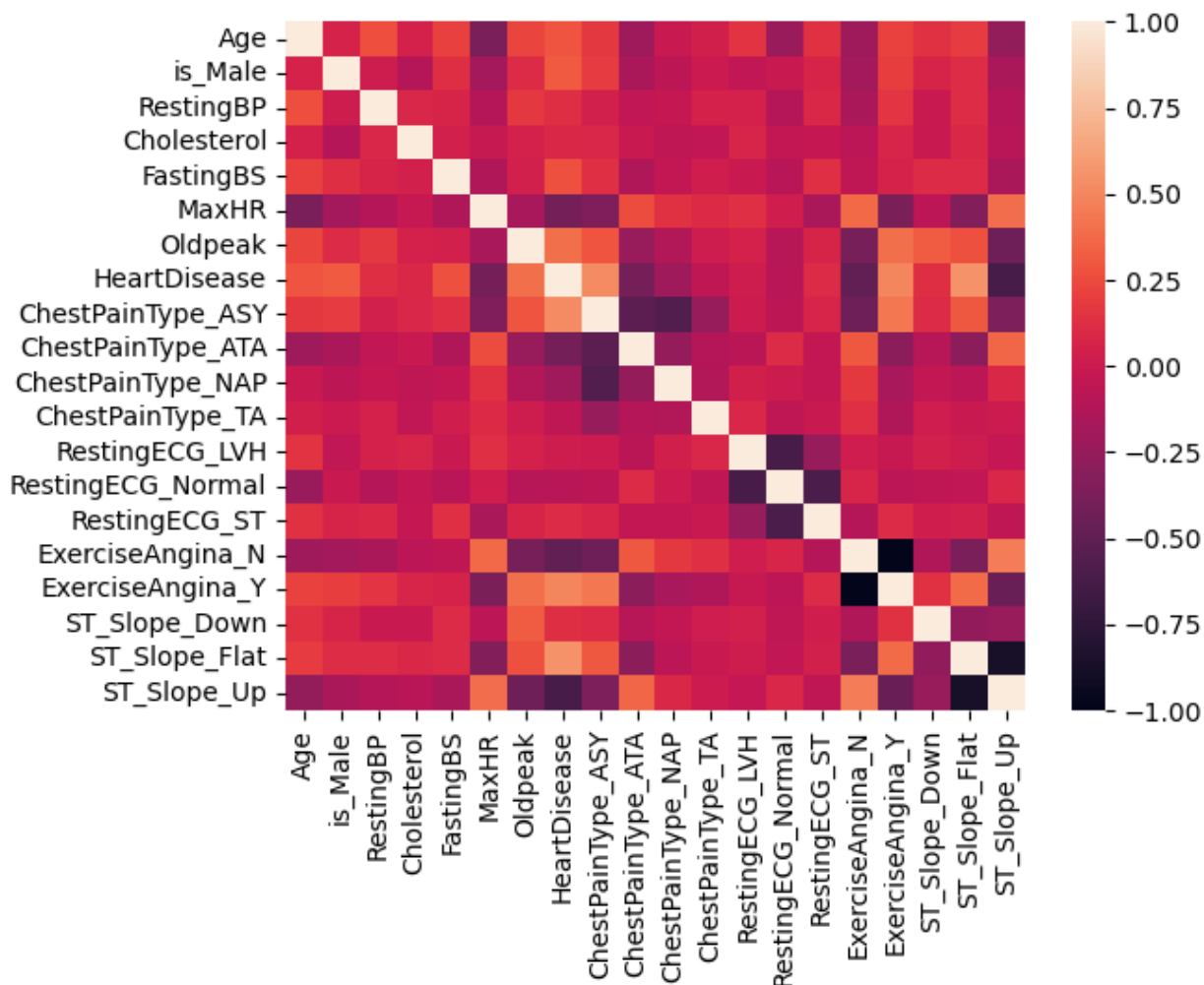




```
# from sklearn.preprocessing import StandardScaler  
# cols=['Age','RestingBP','Cholesterol','MaxHR']  
# scaler=StandardScaler()  
# df_clean[cols]=scaler.fit_transform(df_clean[cols])  
# df_clean
```

```
sns.heatmap(df_clean.corr())
```

```
<Axes: >
```



```
df_corr=df_clean.corr()['HeartDisease'].sort_values(ascending=False)
```

```
df_corr[df_corr>0]
```

```
HeartDisease      1.000000
ST_Slope_Flat     0.554134
ChestPainType_ASY 0.516716
ExerciseAngina_Y  0.494282
Oldpeak           0.392385
is_Male           0.305445
Age               0.282039
FastingBS         0.267291
ST_Slope_Down     0.122527
RestingBP         0.117909
RestingECG_ST     0.102527
Cholesterol       0.092586
RestingECG_LVH    0.010670
Name: HeartDisease, dtype: float64
```

```

df_clean.columns
Index(['Age', 'is_Male', 'RestingBP', 'Cholesterol', 'FastingBS',
      'MaxHR',
      'Oldpeak', 'HeartDisease', 'ChestPainType_ASY',
      'ChestPainType_ATA',
      'ChestPainType_NAP', 'ChestPainType_TA', 'RestingECG_LVH',
      'RestingECG_Normal', 'RestingECG_ST', 'ExerciseAngina_N',
      'ExerciseAngina_Y', 'ST_Slope_Down', 'ST_Slope_Flat',
      'ST_Slope_Up'],
      dtype='object')

cat_features=[ 'is_Male', 'FastingBS', 'ChestPainType_ASY',
               'ChestPainType_ATA', 'ChestPainType_NAP',
               'ChestPainType_TA', 'RestingECG_LVH', 'RestingECG_Normal',
               'RestingECG_ST', 'ExerciseAngina_N',
               'ExerciseAngina_Y', 'ST_Slope_Down', 'ST_Slope_Flat',
               'ST_Slope_Up']

from scipy.stats import chi2_contingency

alpha = 0.05

df_clean['HeartDisease_bin'] = df_clean['HeartDisease']
chi2_results = {}

for col in cat_features:
    contingency = pd.crosstab(df_clean[col],
df_clean['HeartDisease_bin'])
    chi2_stat, p_val, _, _ = chi2_contingency(contingency)
    decision = 'Reject Null (Keep Feature)' if p_val < alpha else
'Accept Null (Drop Feature)'
    chi2_results[col] = {
        'chi2_statistic': chi2_stat,
        'p_value': p_val,
        'Decision': decision
    }

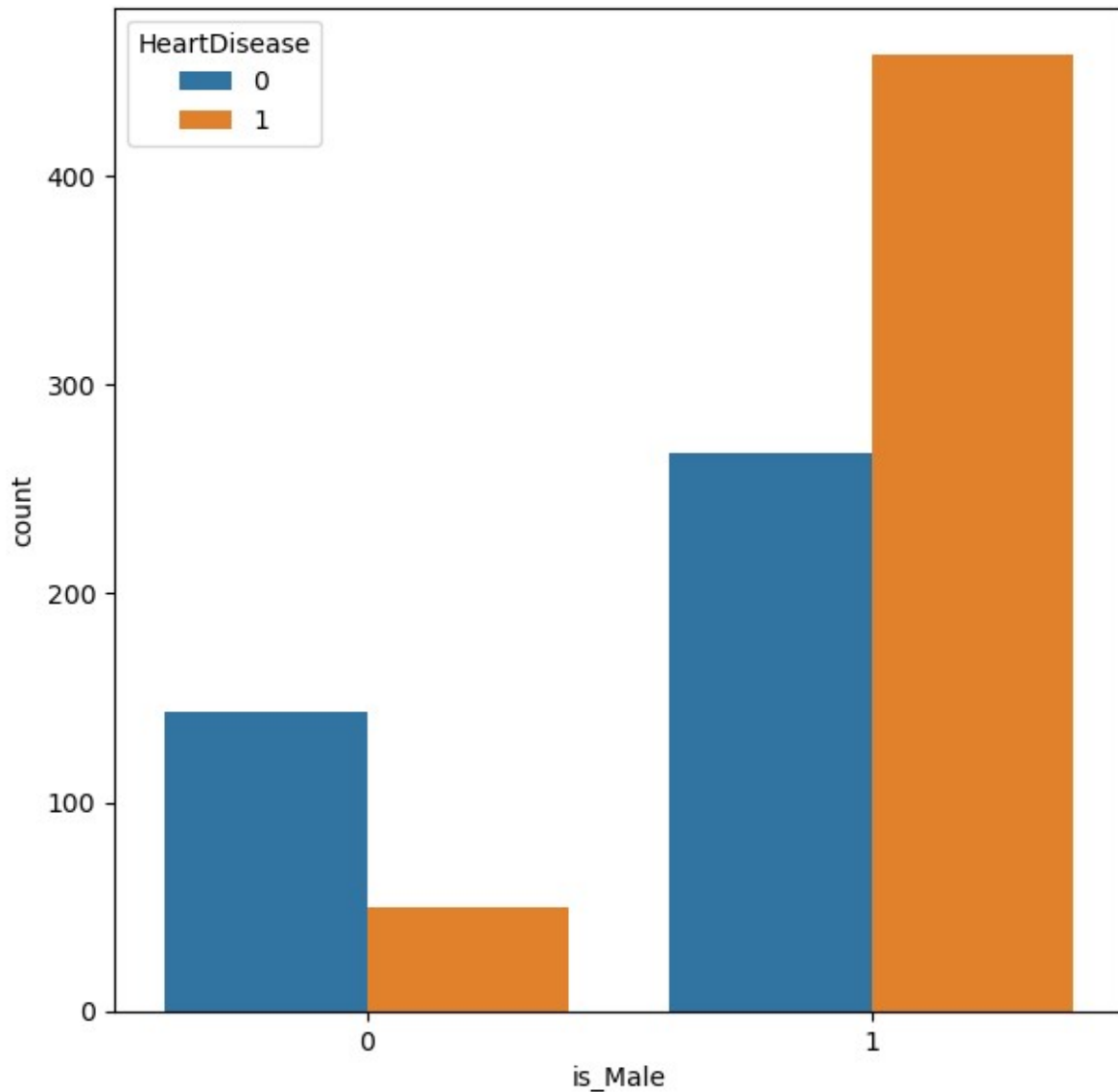
chi2_df = pd.DataFrame(chi2_results).T
chi2_df = chi2_df.sort_values(by='p_value')
chi2_df

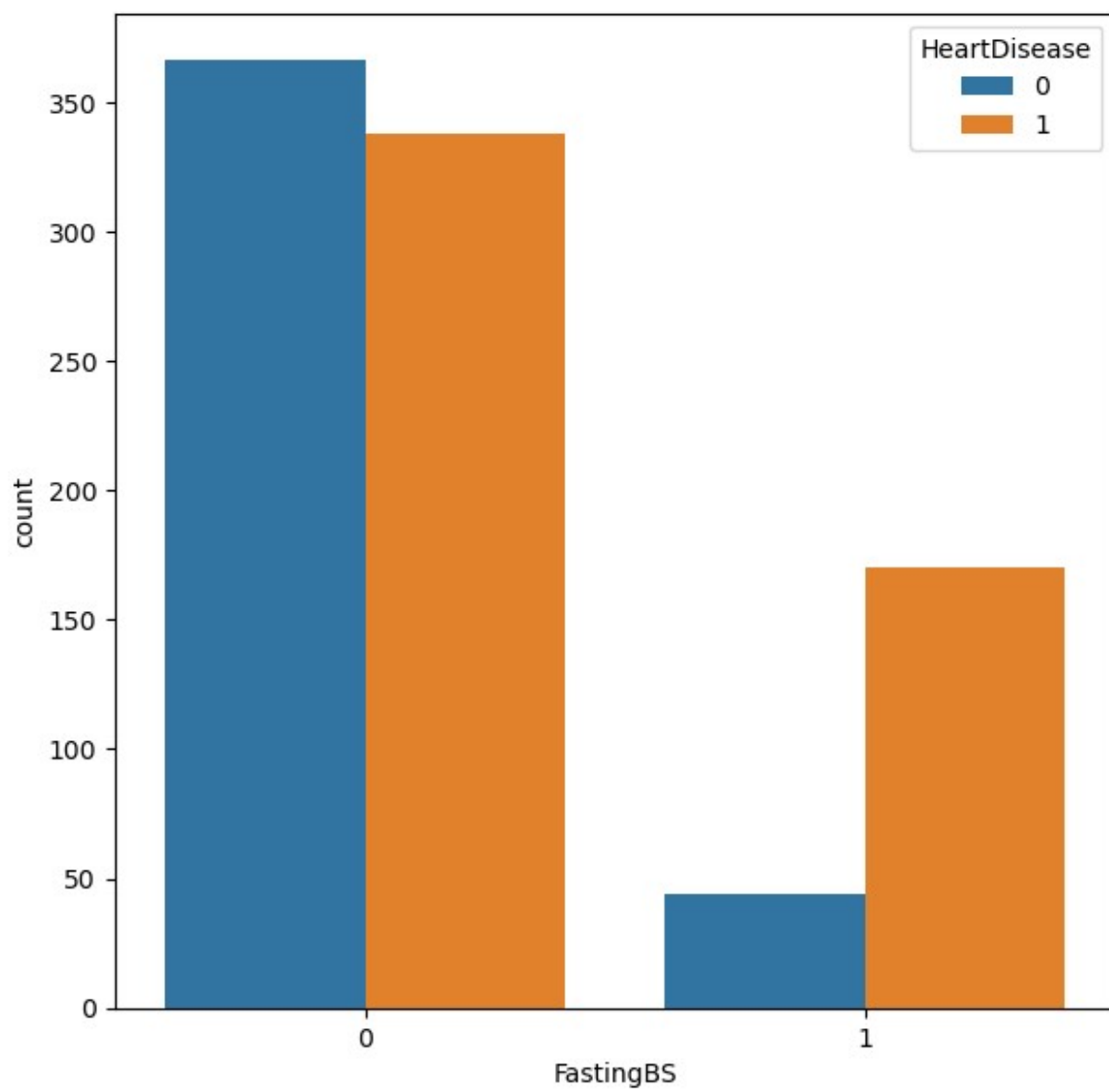
```

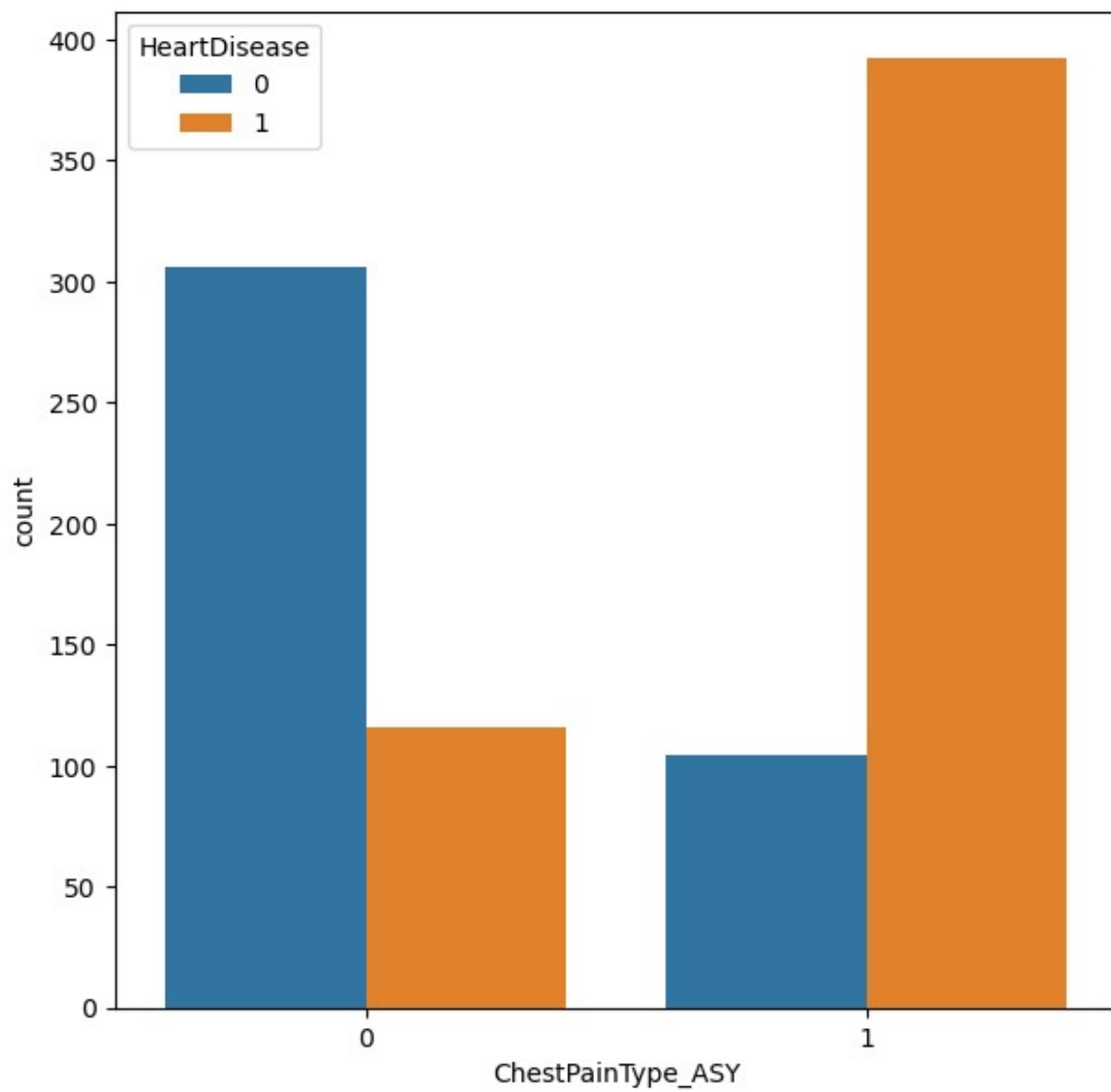
	chi2_statistic	p_value	Decision
ST_Slope_Up	352.823905	0.0	Reject Null (Keep Feature)
ST_Slope_Flat	279.659914	0.0	Reject Null (Keep Feature)
ChestPainType_ASY	243.021138	0.0	Reject Null (Keep Feature)
ExerciseAngina_N	222.259383	0.0	Reject Null (Keep Feature)
ExerciseAngina_Y	222.259383	0.0	Reject Null (Keep Feature)
ChestPainType_ATA	146.236323	0.0	Reject Null (Keep Feature)
is_Male	84.145101	0.0	Reject Null (Keep Feature)
FastingBS	64.320679	0.0	Reject Null (Keep Feature)

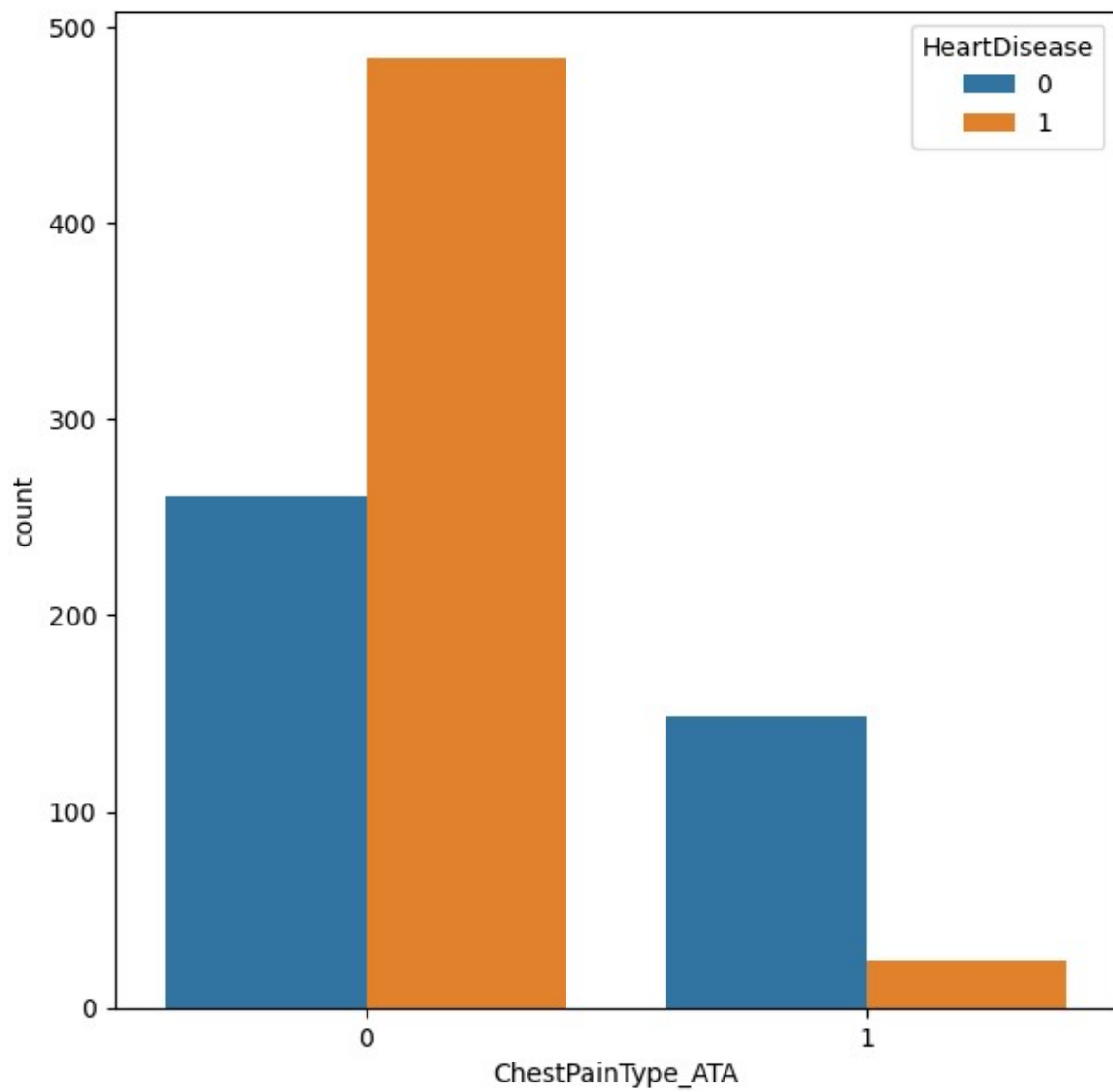
ChestPainType_NAP	40.608711	0.0	Reject Null (Keep Feature)
ST_Slope_Down	12.824125	0.000342	Reject Null (Keep Feature)
RestingECG_ST	9.135266	0.002507	Reject Null (Keep Feature)
RestingECG_Normal	7.327532	0.006791	Reject Null (Keep Feature)
ChestPainType_TA	2.273802	0.131577	Accept Null (Drop Feature)
RestingECG_LVH	0.058098	0.809528	Accept Null (Drop Feature)

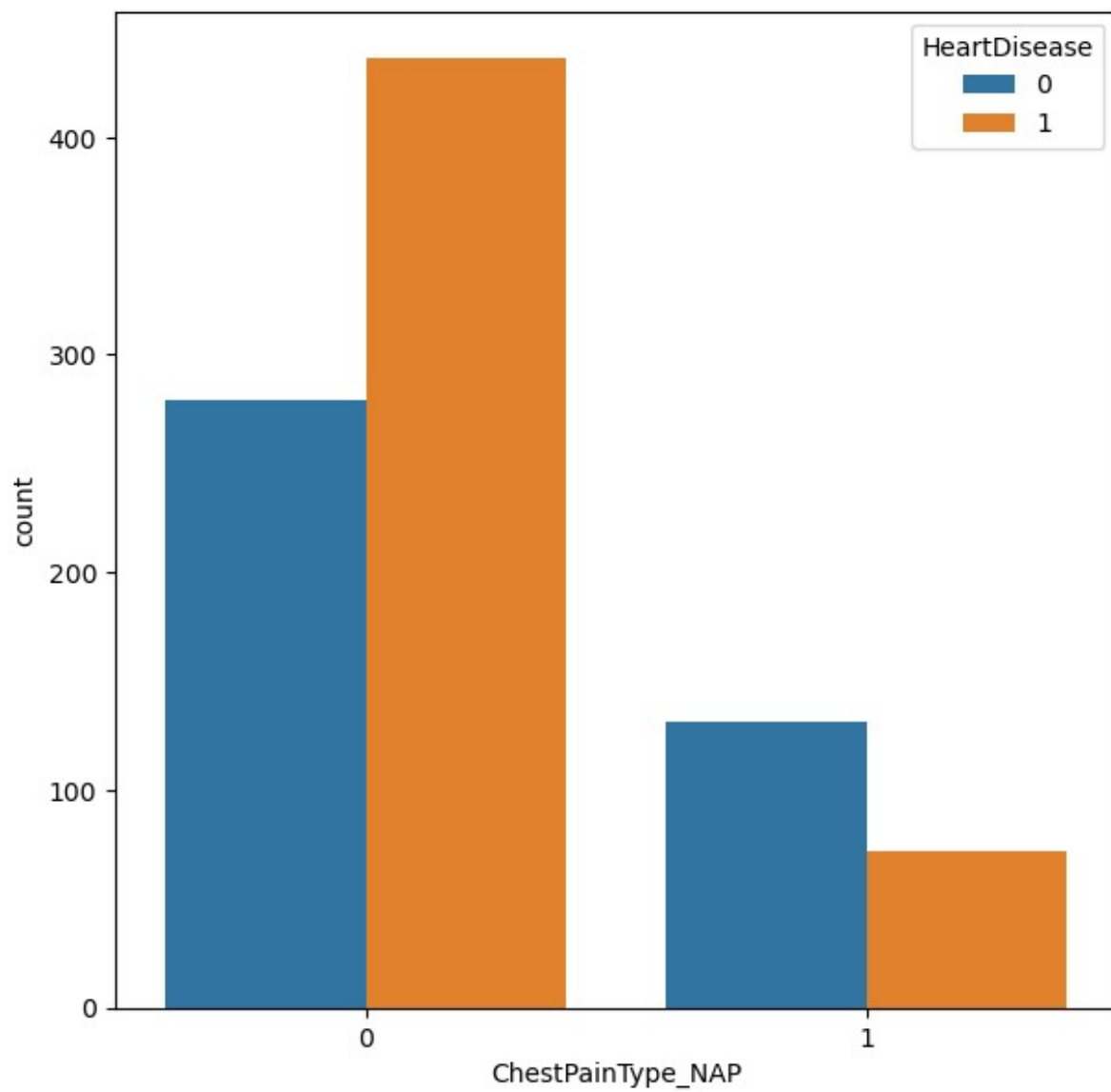
```
for i in cat_features:
    plt.figure(figsize=(7,7))
    sns.countplot(x=df_clean[i],hue=df_clean['HeartDisease'])
```

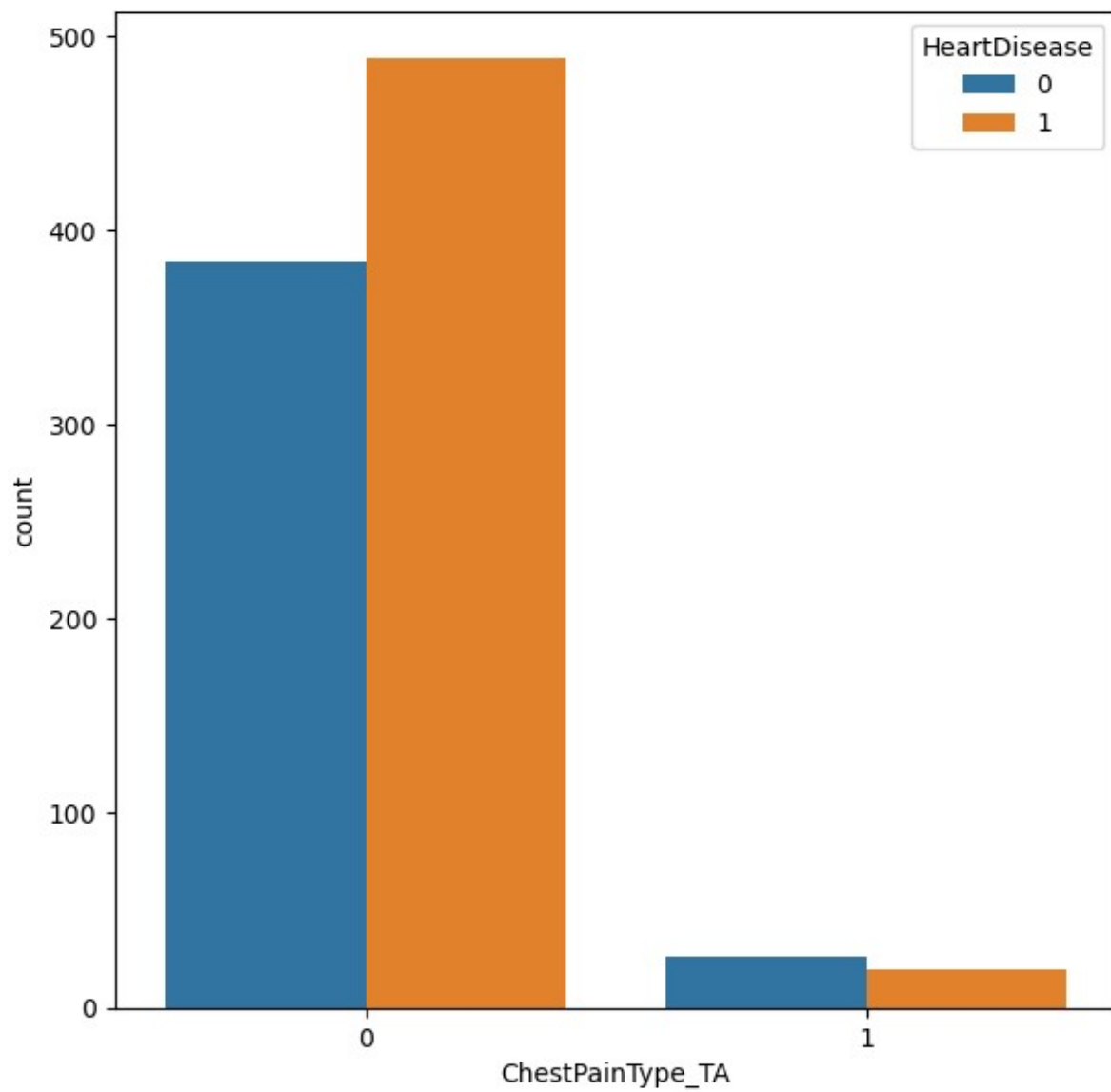


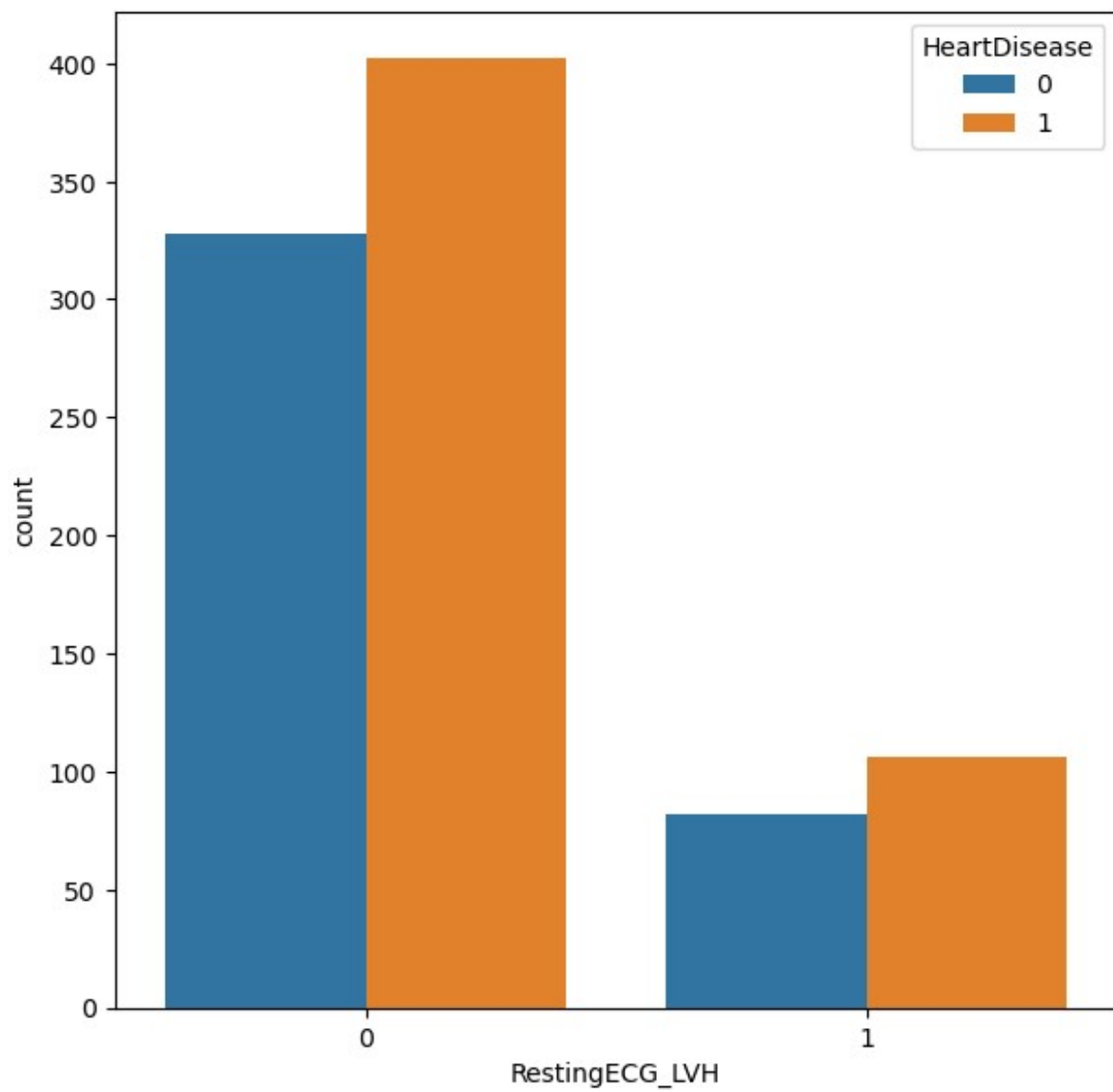


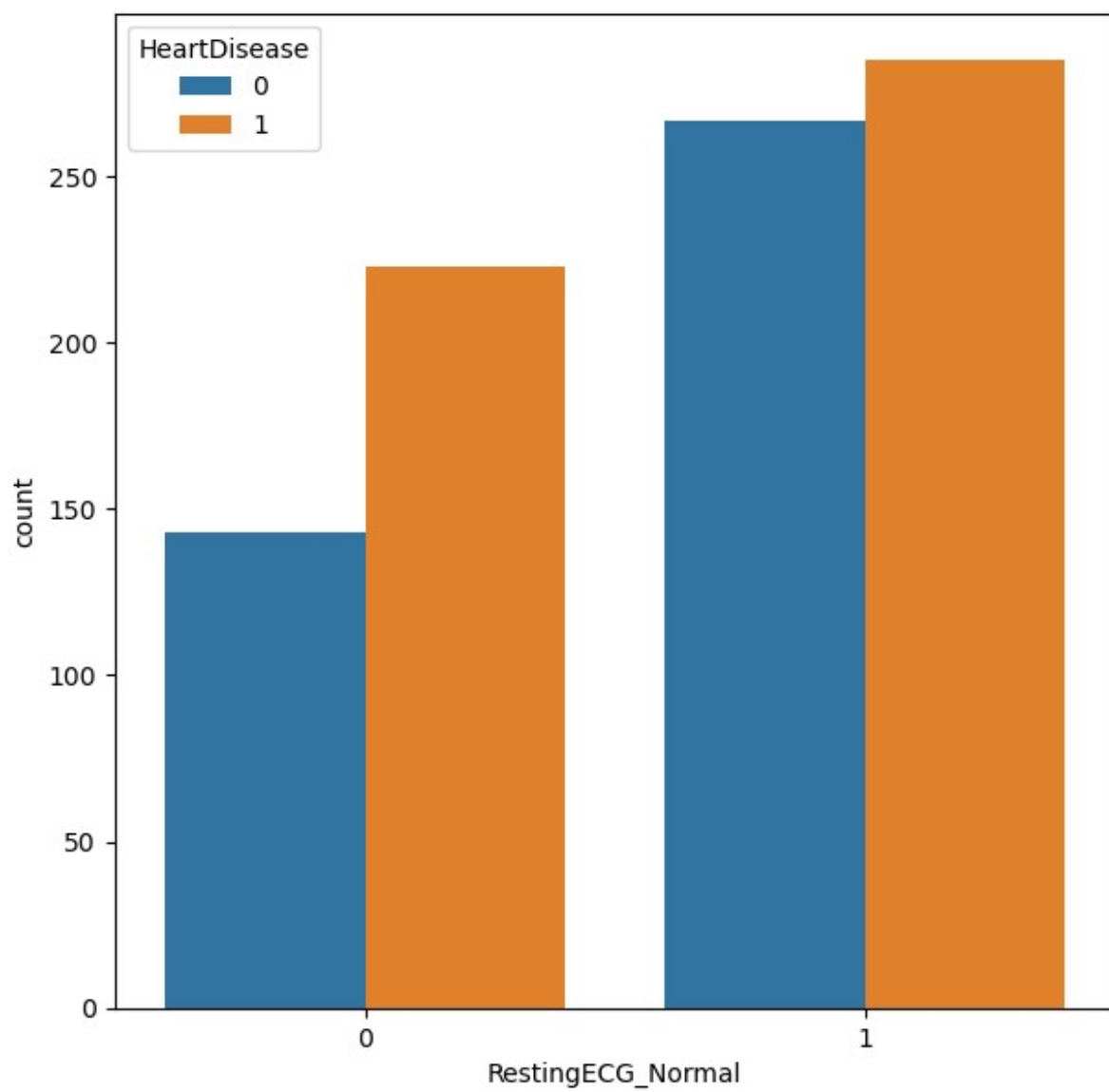


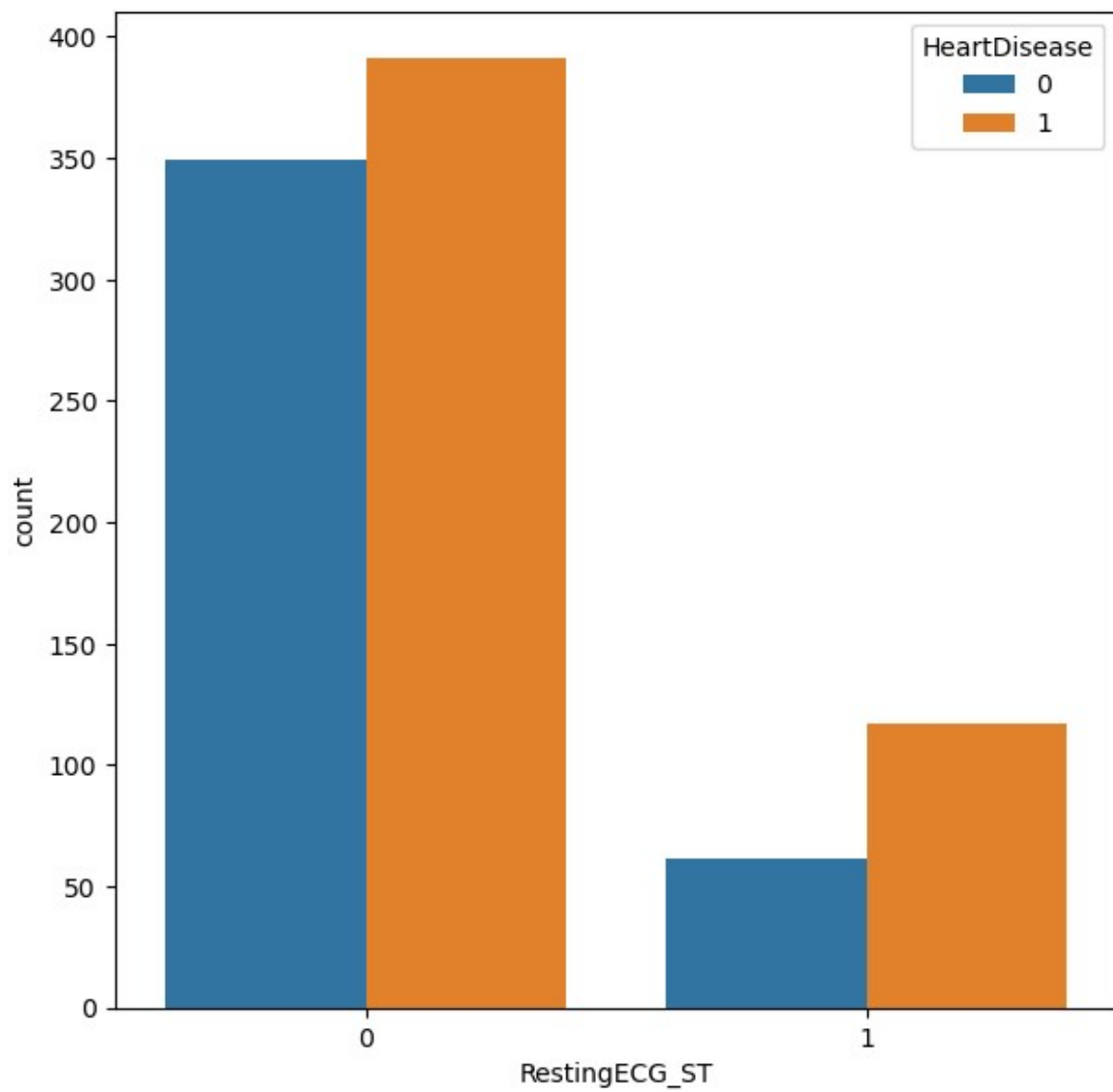


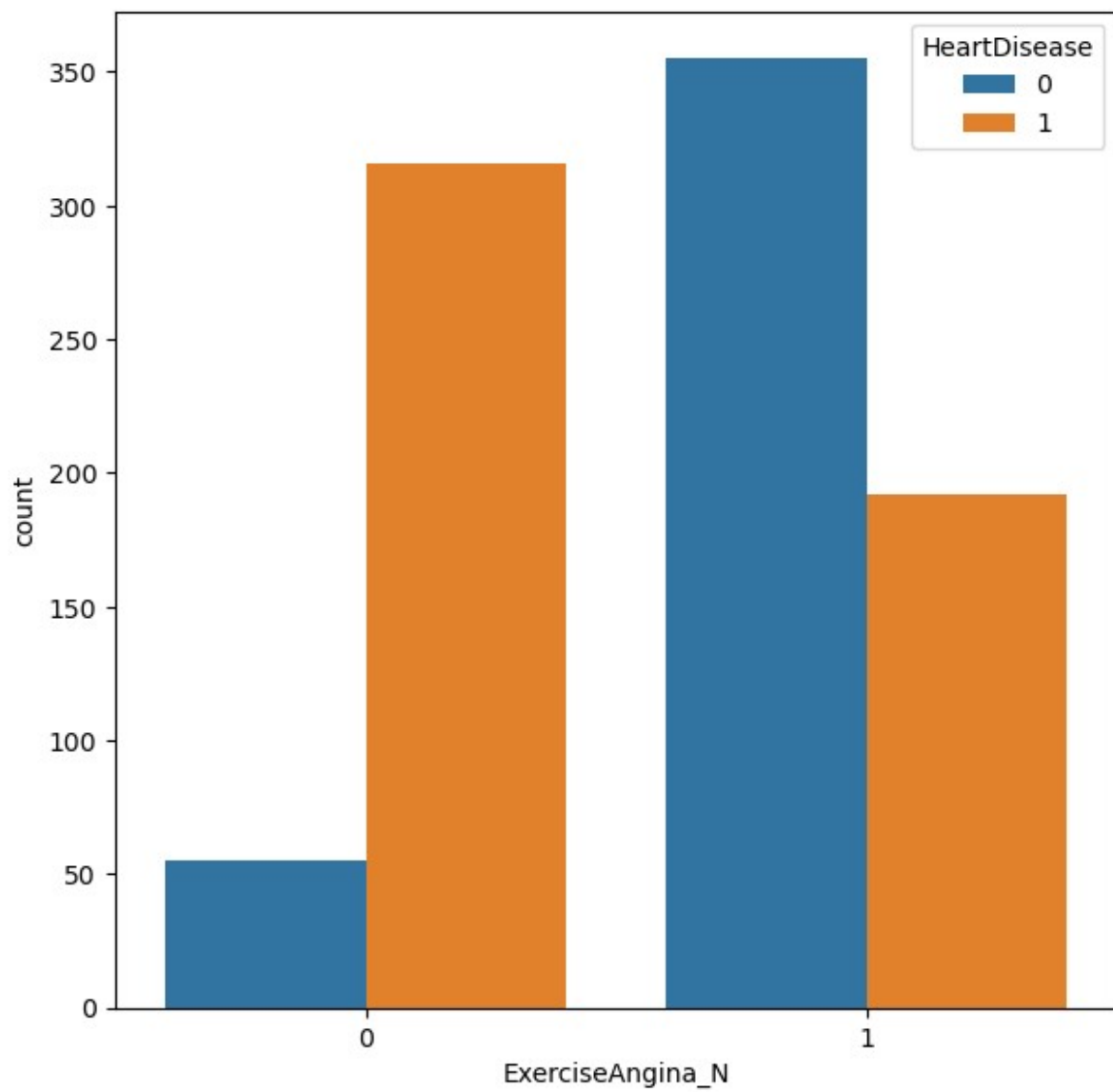


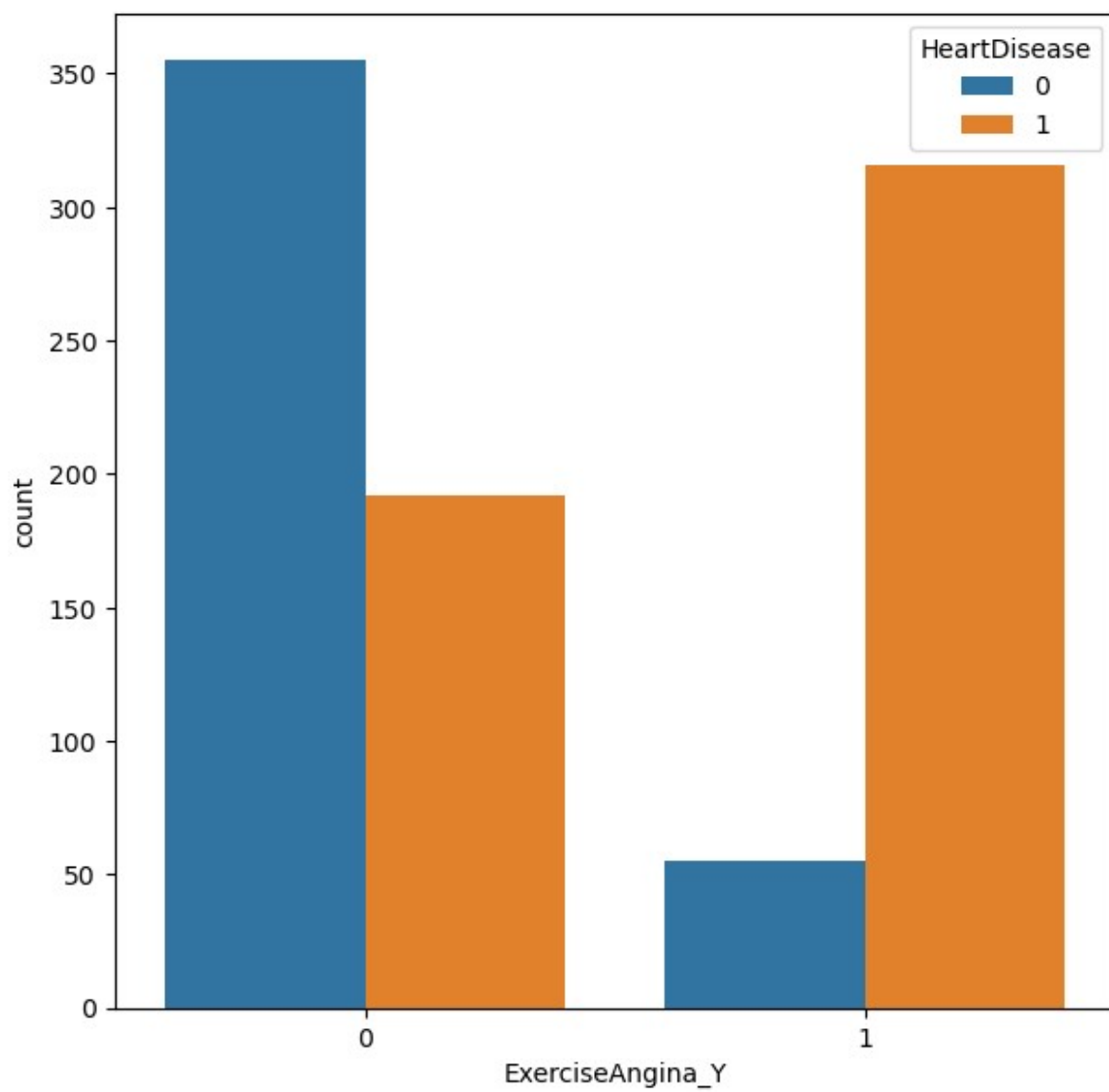


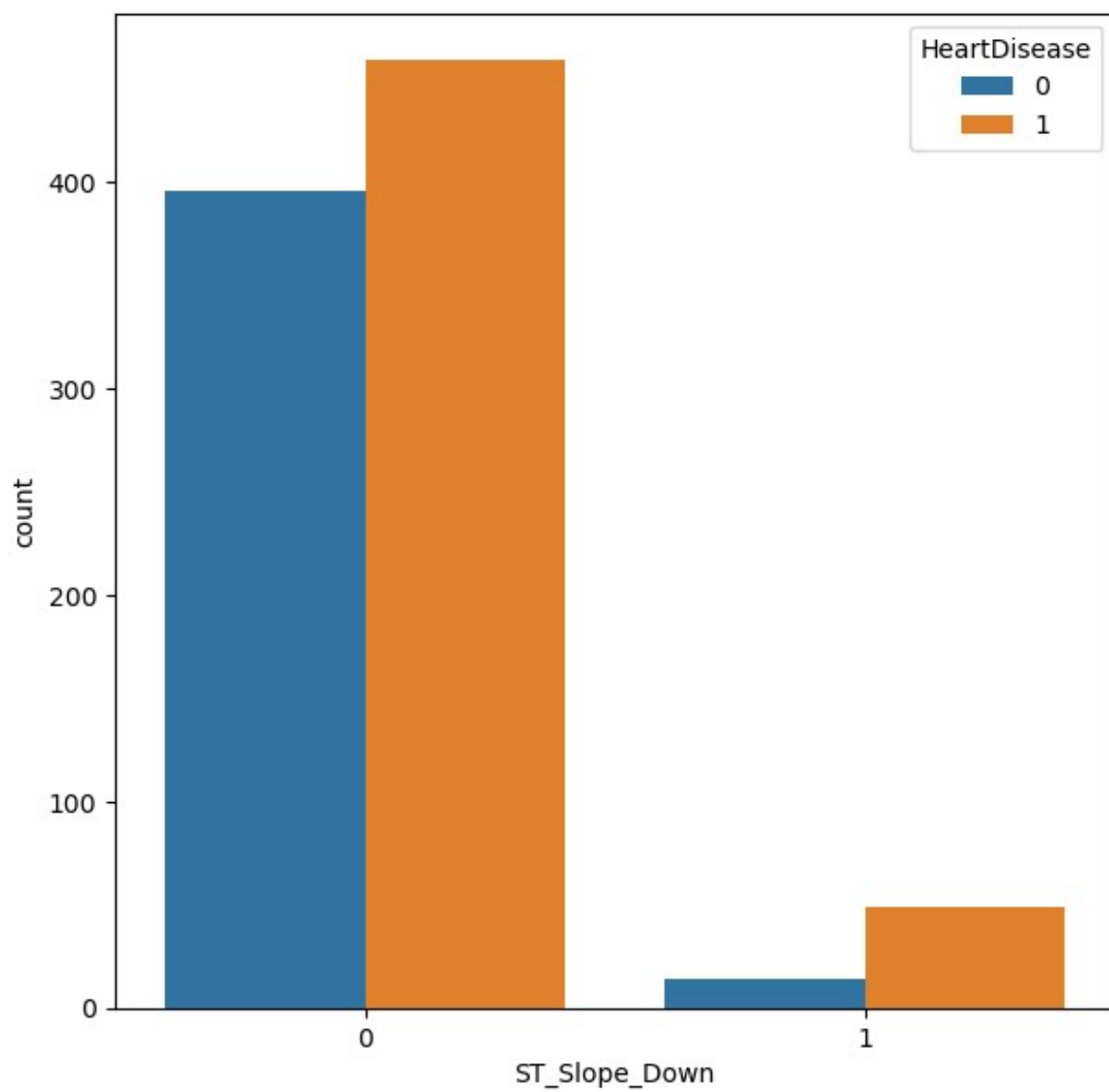


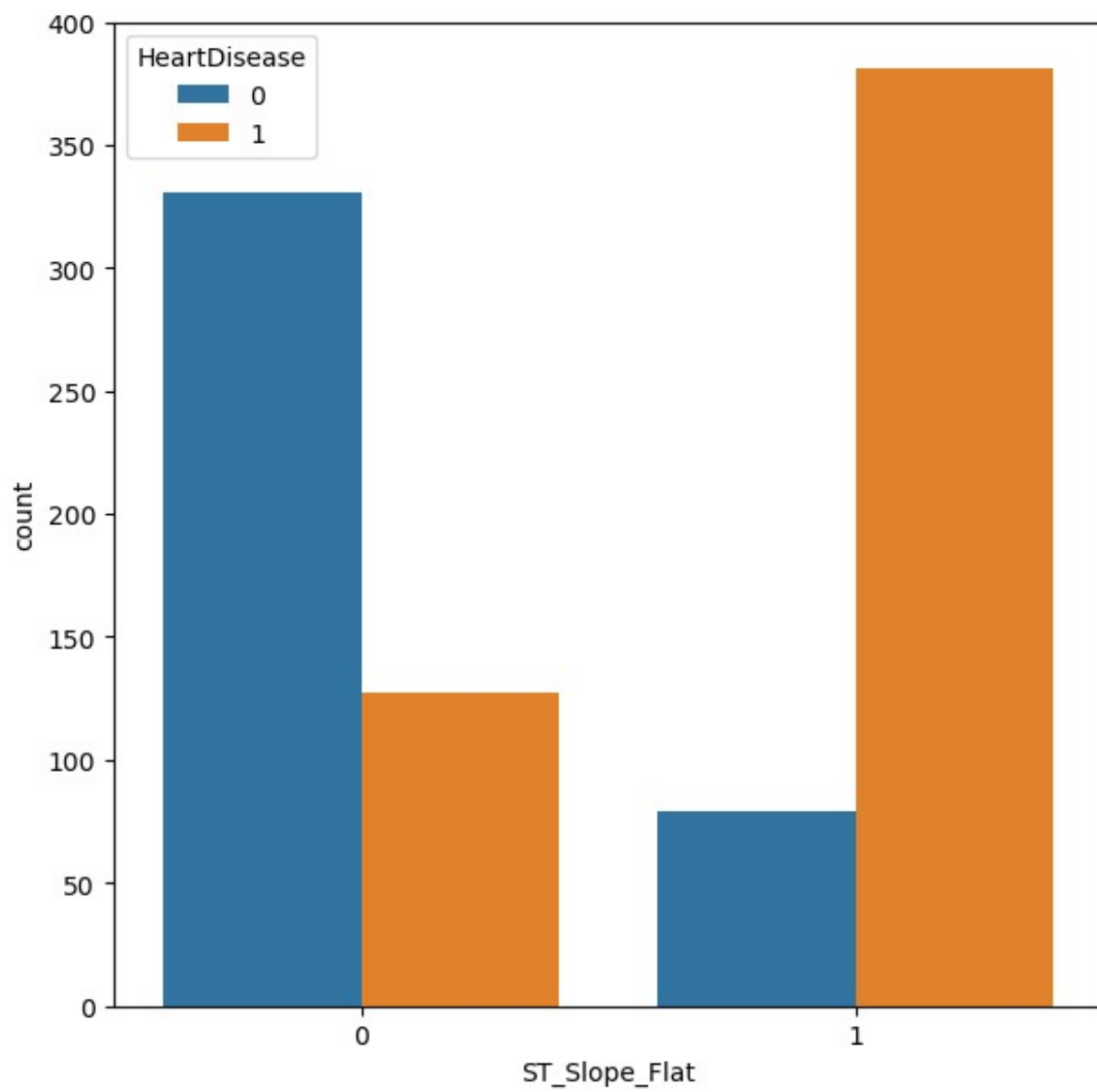


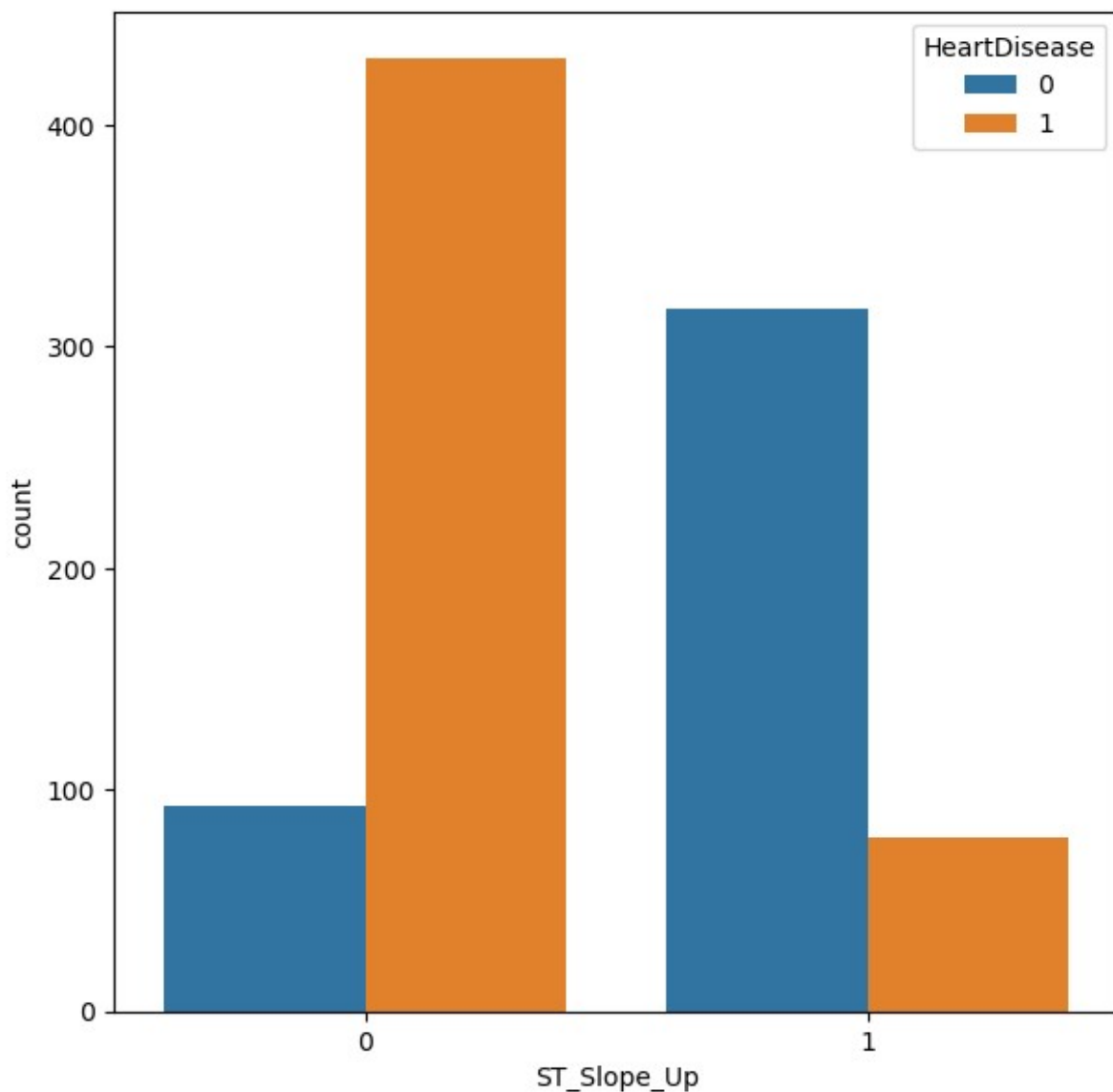












```
df_clean.columns
Index(['Age', 'is_Male', 'RestingBP', 'Cholesterol', 'FastingBS',
      'MaxHR',
      'Oldpeak', 'HeartDisease', 'ChestPainType_ASY',
      'ChestPainType_ATA',
      'ChestPainType_NAP', 'ChestPainType_TA', 'RestingECG_LVH',
      'RestingECG_Normal', 'RestingECG_ST', 'ExerciseAngina_N',
      'ExerciseAngina_Y', 'ST_Slope_Down', 'ST_Slope_Flat',
      'ST_Slope_Up',
      'HeartDisease_bin'],
      dtype='object')
df_clean.head(5)
```

	Age	is_Male	RestingBP	Cholesterol	FastingBS	MaxHR	Oldpeak	\
0	40	1	140	289	0	172	0	
1	49	0	160	180	0	156	1	
2	37	1	130	283	0	98	0	
3	48	0	138	214	0	108	1	
4	54	1	150	195	0	122	0	

	HeartDisease	ChestPainType_ASY	ChestPainType_ATA	...
ChestPainType_TA	\			
0	0	0	1	...
0				
1	1	0	0	...
0				
2	0	0	1	...
0				
3	1	1	0	...
0				
4	0	0	0	...
0				

	RestingECG_LVH	RestingECG_Normal	RestingECG_ST	ExerciseAngina_N
\				
0	0	1	0	1
1	0	1	0	1
2	0	0	1	1
3	0	1	0	0
4	0	1	0	1

	ExerciseAngina_Y	ST_Slope_Down	ST_Slope_Flat	ST_Slope_Up	\
0	0	0	0	1	
1	0	0	1	0	
2	0	0	0	1	
3	1	0	1	0	
4	0	0	0	1	

	HeartDisease_bin
0	0
1	1
2	0
3	1
4	0

[5 rows x 21 columns]

model

```
from sklearn.model_selection import train_test_split
from sklearn.preprocessing import StandardScaler
from sklearn.metrics import accuracy_score, f1_score,
classification_report
from sklearn.linear_model import LogisticRegression
from sklearn.naive_bayes import GaussianNB
from sklearn.tree import DecisionTreeClassifier
from sklearn.svm import SVC
from sklearn.neighbors import KNeighborsClassifier

df_clean.columns

Index(['Age', 'is_Male', 'RestingBP', 'Cholesterol', 'FastingBS',
      'MaxHR',
      'Oldpeak', 'HeartDisease', 'ChestPainType_ASY',
      'ChestPainType_ATA',
      'ChestPainType_NAP', 'ChestPainType_TA', 'RestingECG_LVH',
      'RestingECG_Normal', 'RestingECG_ST', 'ExerciseAngina_N',
      'ExerciseAngina_Y', 'ST_Slope_Down', 'ST_Slope_Flat',
      'ST_Slope_Up',
      'HeartDisease_bin'],
      dtype='object')

X = df_clean.drop(columns=['HeartDisease', 'ExerciseAngina_N',
                          'HeartDisease_bin'], axis=1)
y = df_clean['HeartDisease']

X_train, X_test, y_train, y_test = train_test_split(
    X, y, stratify=y, test_size=0.2, random_state=42)

scaler=StandardScaler()
x_train_scaled=scaler.fit_transform(X_train)
x_test_scaled=scaler.fit_transform(X_test)

models = {
    "Logistic Regression": LogisticRegression(),
    "KNN": KNeighborsClassifier(n_neighbors=7),
    "Naive Bayes": GaussianNB(),
    "Decision Tree": DecisionTreeClassifier(),
    "SVM (RBF Kernel)": SVC(probability=True, kernel='poly')
}

results = []

for name, model in models.items():
    model.fit(x_train_scaled, y_train)
    y_pred = model.predict(x_test_scaled)
    acc = accuracy_score(y_test, y_pred)
    f1 = f1_score(y_test, y_pred)
```

```

    results.append({
        'Model': name,
        'Accuracy': round(acc, 4),
        'F1 Score': round(f1, 4)
    })

results

[{'Model': 'Logistic Regression', 'Accuracy': 0.8967, 'F1 Score':
0.91},
 {'Model': 'KNN', 'Accuracy': 0.875, 'F1 Score': 0.89},
 {'Model': 'Naive Bayes', 'Accuracy': 0.8587, 'F1 Score': 0.8725},
 {'Model': 'Decision Tree', 'Accuracy': 0.7554, 'F1 Score': 0.7739},
 {'Model': 'SVM (RBF Kernel)', 'Accuracy': 0.875, 'F1 Score': 0.891}]

import joblib
joblib.dump(models['Logistic Regression'], 'LOG_heart.pkl')
joblib.dump(scaler, 'scaler.pkl')
joblib.dump(X.columns.tolist(), 'columns.pkl')

['columns.pkl']

X.columns

Index(['Age', 'is_Male', 'RestingBP', 'Cholesterol', 'FastingBS',
'MaxHR',
      'Oldpeak', 'ChestPainType_ASY', 'ChestPainType_ATA',
      'ChestPainType_NAP', 'ChestPainType_TA', 'RestingECG_LVH',
      'RestingECG_Normal', 'RestingECG_ST', 'ExerciseAngina_Y',
      'ST_Slope_Down', 'ST_Slope_Flat', 'ST_Slope_Up'],
      dtype='object')

```