```
In [1]:
            import numpy as np
            import pandas as pd
 In [6]:
            df=pd.read csv("heartattack.csv") # reading file
 In [7]:
            df
 Out[7]:
                                trestbps chol fbs restecg
                                                              thalach exang
                                                                               oldpeak slope ca
                                                                                                    thal target
                 age
                      sex
                            ср
              0
                                                           0
                                                                            0
                  63
                         1
                             3
                                     145
                                           233
                                                  1
                                                                  150
                                                                                     2.3
                                                                                             0
                                                                                                  0
                                                                                                        1
                                                                                                                1
              1
                  37
                             2
                                     130
                                           250
                                                  0
                                                           1
                                                                  187
                                                                            0
                                                                                     3.5
                                                                                             0
                                                                                                  0
                                                                                                        2
                                                                                                                1
                         1
              2
                  41
                        0
                                     130
                                           204
                                                  0
                                                           0
                                                                  172
                                                                            0
                                                                                              2
                                                                                                  0
                                                                                                        2
                                                                                                                1
                             1
                                                                                     1.4
              3
                                           236
                                                                                                        2
                  56
                         1
                             1
                                     120
                                                  0
                                                           1
                                                                  178
                                                                            0
                                                                                     8.0
                                                                                              2
                                                                                                  0
                                                                                                                1
                  57
                        0
                             0
                                     120
                                           354
                                                  0
                                                           1
                                                                  163
                                                                                     0.6
                                                                                             2
                                                                                                  0
                                                                                                        2
                                                                                                               1
                   ...
                             ...
                                       ...
                                             ...
                                                           ...
                                                                                                       ...
           298
                  57
                         0
                             0
                                     140
                                           241
                                                  0
                                                           1
                                                                  123
                                                                             1
                                                                                     0.2
                                                                                              1
                                                                                                  0
                                                                                                        3
                                                                                                               0
           299
                  45
                             3
                                     110
                                           264
                                                  0
                                                           1
                                                                  132
                                                                            0
                                                                                     1.2
                                                                                              1
                                                                                                  0
                                                                                                        3
                                                                                                               0
           300
                  68
                         1
                             0
                                     144
                                           193
                                                  1
                                                           1
                                                                  141
                                                                            0
                                                                                     3.4
                                                                                              1
                                                                                                  2
                                                                                                        3
                                                                                                               0
           301
                  57
                             0
                                     130
                                           131
                                                  0
                                                           1
                                                                  115
                                                                             1
                                                                                     1.2
                                                                                              1
                                                                                                  1
                                                                                                        3
                                                                                                               0
           302
                  57
                                     130
                                           236
                                                  0
                                                           0
                                                                  174
                                                                            0
                                                                                     0.0
                                                                                                        2
                                                                                                               0
                         0
                             1
                                                                                              1
                                                                                                  1
          303 rows × 14 columns
 In [9]:
            df.head()
 Out[9]:
                                              fbs
                                                            thalach
                                                                             oldpeak slope
               age
                    sex
                          ср
                              trestbps
                                        chol
                                                   restecg
                                                                     exang
                                                                                              ca
                                                                                                  thal target
           0
                63
                      1
                           3
                                   145
                                         233
                                                1
                                                         0
                                                                150
                                                                          0
                                                                                  2.3
                                                                                           0
                                                                                               0
                                                                                                     1
                                                                                                             1
           1
                37
                      1
                           2
                                   130
                                         250
                                                0
                                                         1
                                                                187
                                                                          0
                                                                                  3.5
                                                                                           0
                                                                                               0
                                                                                                     2
                                                                                                             1
           2
                41
                      0
                           1
                                   130
                                         204
                                                0
                                                         0
                                                                172
                                                                          0
                                                                                  1.4
                                                                                           2
                                                                                               0
                                                                                                     2
                                                                                                             1
           3
                                                                                                     2
                56
                      1
                           1
                                   120
                                         236
                                                0
                                                         1
                                                                178
                                                                          0
                                                                                  8.0
                                                                                           2
                                                                                               0
                                                                                                             1
                57
                      0
                           0
                                   120
                                         354
                                                0
                                                         1
                                                                163
                                                                          1
                                                                                  0.6
                                                                                           2
                                                                                               0
                                                                                                     2
                                                                                                             1
In [10]:
            df.info() # original summary of the data
           <class 'pandas.core.frame.DataFrame'>
           RangeIndex: 303 entries, 0 to 302
           Data columns (total 14 columns):
                             Non-Null Count Dtype
            #
                 Column
```

```
0
                           303 non-null
                                             int64
                age
           1
                           303 non-null
                                             int64
                sex
           2
                           303 non-null
                                             int64
                ср
           3
                trestbps
                           303 non-null
                                             int64
           4
                           303 non-null
                                             int64
                chol
           5
                fbs
                           303 non-null
                                             int64
           6
                           303 non-null
                                             int64
               restecg
           7
               thalach
                           303 non-null
                                             int64
           8
                exang
                           303 non-null
                                             int64
           9
                                             float64
                oldpeak
                           303 non-null
           10
                           303 non-null
                                             int64
               slope
           11
                           303 non-null
                                             int64
               ca
           12
               thal
                           303 non-null
                                             int64
           13
               target
                           303 non-null
                                             int64
          dtypes: float64(1), int64(13)
          memory usage: 33.3 KB
In [11]:
           df.isna().sum() # finding null values
                       0
          age
Out[11]:
                       0
          sex
                       0
          ср
          trestbps
                       0
                       0
          chol
          fbs
                       0
          restecg
                       0
          thalach
                       0
          exang
                       0
          oldpeak
          slope
                       0
                       0
          ca
          thal
                       0
          target
          dtype: int64
In [12]:
           df.duplicated() # duplicate found
                  False
Out[12]:
                  False
          1
          2
                  False
          3
                  False
          4
                  False
          298
                  False
          299
                  False
          300
                  False
          301
                  False
          302
                  False
          Length: 303, dtype: bool
In [13]:
           df.drop duplicates() # 1 duplicate removed
Out[13]:
                             trestbps
                                      chol fbs
                                                restecg
                                                         thalach
                                                                 exang
                                                                        oldpeak slope
                                                                                            thal target
               age
                    sex
                         ср
                                                                                        ca
             0
                 63
                           3
                                  145
                                       233
                                              1
                                                      0
                                                             150
                                                                      0
                                                                              2.3
                                                                                     0
                                                                                         0
                                                                                               1
                 37
                           2
                                  130
                                       250
                                              0
                                                      1
                                                             187
                                                                      0
                                                                              3.5
                                                                                     0
                                                                                         0
                                                                                               2
                                                                                                      1
             2
                                       204
                                                      0
                                                                                               2
                                                                                                      1
                 41
                      0
                           1
                                  130
                                              0
                                                             172
                                                                      0
                                                                              1.4
                                                                                      2
                                                                                         0
                                                                                      2
             3
                 56
                           1
                                  120
                                       236
                                              0
                                                      1
                                                             178
                                                                      0
                                                                             8.0
                                                                                         0
                                                                                               2
                                                                                                      1
```

	age	sex	ср	trestbps	chol	fbs	restecg	thalach	exang	oldpeak	slope	ca	thal	target
4	57	0	0	120	354	0	1	163	1	0.6	2	0	2	1
•••														
298	57	0	0	140	241	0	1	123	1	0.2	1	0	3	0
299	45	1	3	110	264	0	1	132	0	1.2	1	0	3	0
300	68	1	0	144	193	1	1	141	0	3.4	1	2	3	0
301	57	1	0	130	131	0	1	115	1	1.2	1	1	3	0
302	57	0	1	130	236	0	0	174	0	0.0	1	1	2	0

302 rows × 14 columns

```
In [14]: df.describe() # after removing duplicates summary of data
```

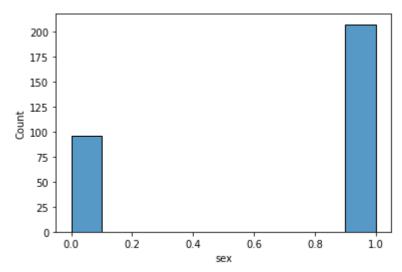
Out[14]:		age	sex	ср	trestbps	chol	fbs	restecg	thalach
	count	303.000000	303.000000	303.000000	303.000000	303.000000	303.000000	303.000000	303.000000
	mean	54.366337	0.683168	0.966997	131.623762	246.264026	0.148515	0.528053	149.646865
	std	9.082101	0.466011	1.032052	17.538143	51.830751	0.356198	0.525860	22.905161
	min	29.000000	0.000000	0.000000	94.000000	126.000000	0.000000	0.000000	71.000000
	25%	47.500000	0.000000	0.000000	120.000000	211.000000	0.000000	0.000000	133.500000
	50%	55.000000	1.000000	1.000000	130.000000	240.000000	0.000000	1.000000	153.000000
	75%	61.000000	1.000000	2.000000	140.000000	274.500000	0.000000	1.000000	166.000000
	max	77.000000	1.000000	3.000000	200.000000	564.000000	1.000000	2.000000	202.000000

```
In [17]:
          df.mean() # central tendencies
                       54.366337
Out[17]: age
         sex
                        0.683168
                        0.966997
         ср
         trestbps
                      131.623762
         chol
                      246.264026
         fbs
                        0.148515
                        0.528053
         restecg
         thalach
                      149.646865
         exang
                        0.326733
         oldpeak
                        1.039604
         slope
                        1.399340
         ca
                        0.729373
         thal
                        2.313531
         target
                        0.544554
         dtype: float64
```

In [18]: df.mode() # central tendencies

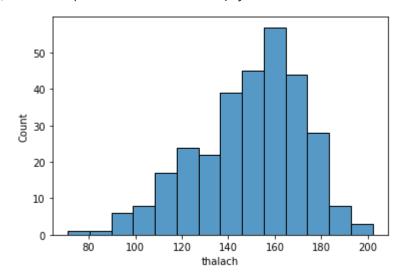
```
Out[18]:
                                                          thalach exang oldpeak slope
              age
                    sex
                          ср
                             trestbps chol
                                              fbs restecg
                                                                                           ca
                                                                                               thal target
                                              0.0
              58.0
                          0.0
                                 120.0
                                        197
                                                      1.0
                                                            162.0
                                                                     0.0
                                                                              0.0
                                                                                     2.0
                                                                                          0.0
                                                                                                2.0
                    1.0
                                                                                                       1.0
          1
             NaN
                   NaN
                        NaN
                                 NaN
                                        204
                                            NaN
                                                     NaN
                                                             NaN
                                                                    NaN
                                                                             NaN
                                                                                   NaN
                                                                                         NaN
                                                                                              NaN
                                                                                                      NaN
             NaN
                   NaN
                        NaN
                                 NaN
                                        234
                                            NaN
                                                     NaN
                                                             NaN
                                                                    NaN
                                                                             NaN
                                                                                   NaN
                                                                                         NaN
                                                                                              NaN
                                                                                                      NaN
In [19]:
           df.median() # central tendencies
                        55.0
Out[19]:
          age
                         1.0
          sex
                         1.0
          ср
          trestbps
                       130.0
          chol
                       240.0
          fbs
                         0.0
                         1.0
          restecg
          thalach
                       153.0
          exang
                         0.0
                         0.8
          oldpeak
                         1.0
          slope
                         0.0
          ca
          thal
                         2.0
          target
                         1.0
          dtype: float64
In [26]:
           # spreading of the data
In [20]:
           import seaborn as sns
           from matplotlib import pyplot as plt
In [21]:
           sns.histplot(data=df,x="age")
          <AxesSubplot:xlabel='age', ylabel='Count'>
             60
             50
             40
          Count
            30
             20
            10
                  30
                            40
                                     50
                                               60
                                                         70
                                        age
In [22]:
           sns.histplot(data=df,x="sex")
```

Out[22]: <AxesSubplot:xlabel='sex', ylabel='Count'>



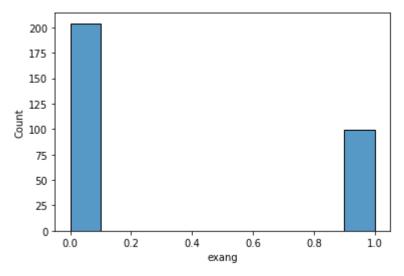
```
In [23]: sns.histplot(data=df,x="thalach")
```

Out[23]: <AxesSubplot:xlabel='thalach', ylabel='Count'>



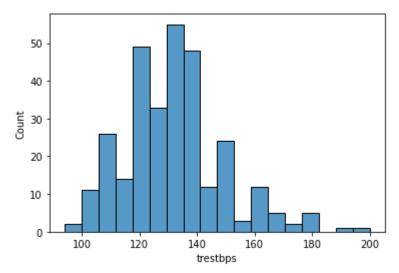
```
In [24]: sns.histplot(data=df,x="exang")
```

Out[24]: <AxesSubplot:xlabel='exang', ylabel='Count'>



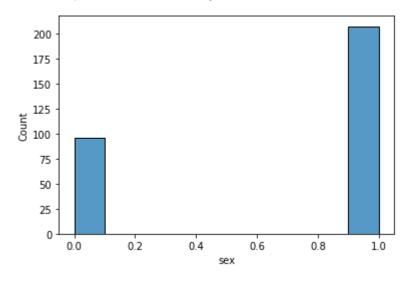
```
In [25]: sns.histplot(data=df,x="trestbps")
```

Out[25]: <AxesSubplot:xlabel='trestbps', ylabel='Count'>



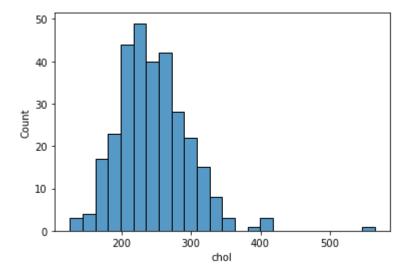
```
In [26]: sns.histplot(data=df,x="sex")
```

Out[26]: <AxesSubplot:xlabel='sex', ylabel='Count'>



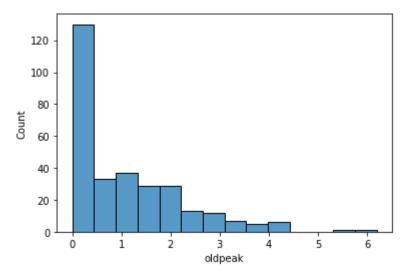
```
In [20]: sns.histplot(data=df,x="chol")
```

```
Out[20]: <AxesSubplot:xlabel='chol', ylabel='Count'>
```



```
In [28]: sns.histplot(data=df,x="oldpeak")
```

Out[28]: <AxesSubplot:xlabel='oldpeak', ylabel='Count'>



```
In [29]: df.sex
```

```
1
Out[29]:
                  1
                  0
          3
                  1
                  0
                  0
          298
                  1
          299
          300
                  1
                  1
          301
          302
          Name: sex, Length: 303, dtype: int64
```

```
# Data variables which might be categorical in nature
 In [ ]:
In [30]:
           df.thalach.value_counts()
Out[30]: 162
                 11
                  9
          163
                  9
          160
          152
          173
                  8
          128
                  1
          129
                  1
          134
                  1
          137
                  1
          202
          Name: thalach, Length: 91, dtype: int64
In [31]:
           df.sex.value_counts()
               207
Out[31]: 1
                96
          Name: sex, dtype: int64
In [27]:
           df.trestbps.value_counts()
Out[27]: 120
                 37
          130
                 36
          140
                 32
          110
                 19
          150
                 17
          138
                 13
          128
                 12
          125
                 11
          160
                 11
                  9
          112
          132
                  8
          118
                  7
          108
                  6
          135
                  6
          124
                  6
          152
                  5
                  5
          145
                  5
          134
          100
                  4
          122
                  4
          170
                  4
          126
                  3
          115
                  3
                  3
          105
                  3
          136
          180
          142
                  3
                  2
          146
                  2
          148
                  2
          178
          94
                  2
                  2
          144
                  2
          102
                  1
          129
          192
```

```
101
                  1
          174
                  1
                  1
          172
          104
                  1
          165
                  1
          164
                  1
          106
          156
                  1
          155
                  1
          154
                  1
          114
          117
          123
                  1
          200
                  1
          Name: trestbps, dtype: int64
In [32]:
           df.chol.value_counts()
                 6
          204
Out[32]:
          197
                 6
          234
                 6
          269
                 5
          212
                 5
          215
          210
          200
          195
          417
          Name: chol, Length: 152, dtype: int64
In [34]:
           df.fbs.value_counts()
               258
Out[34]:
                45
          Name: fbs, dtype: int64
In [35]:
           df.exang.value_counts()
               204
Out[35]:
          Name: exang, dtype: int64
In [37]:
           df.ca.value_counts()
               175
Out[37]:
                65
                38
                20
          Name: ca, dtype: int64
In [38]:
           df.target.value_counts()
               165
Out[38]: 1
               138
          Name: target, dtype: int64
```

Project

```
df.loc[df.sex==1,'sex']='male'
In [39]:
In [40]:
            df.loc[df.sex==0,'sex']="female"
In [41]:
            df
Out[41]:
                                  trestbps
                                           chol fbs restecg
                                                               thalach exang oldpeak slope
                                                                                                ca thal target
                 age
                         sex
                              ср
             0
                  63
                        male
                               3
                                      145
                                            233
                                                   1
                                                            0
                                                                   150
                                                                             0
                                                                                     2.3
                                                                                             0
                                                                                                 0
                                                                                                       1
                                                                                                              1
                                            250
             1
                  37
                        male
                               2
                                      130
                                                   0
                                                            1
                                                                   187
                                                                             0
                                                                                     3.5
                                                                                             0
                                                                                                 0
                                                                                                       2
                                                                                                              1
             2
                  41
                                      130
                                            204
                                                            0
                                                                                                 0
                                                                                                       2
                      female
                                                   0
                                                                   172
                                                                             0
                                                                                     1.4
                                                                                             2
                                                                                                              1
             3
                  56
                                      120
                                            236
                                                   0
                                                            1
                                                                   178
                                                                             0
                                                                                     8.0
                                                                                             2
                                                                                                 0
                                                                                                       2
                        male
                                                                                                              1
             4
                  57
                     female
                                      120
                                            354
                                                   0
                                                            1
                                                                   163
                                                                             1
                                                                                     0.6
                                                                                             2
                                                                                                 0
                                                                                                       2
                                                                                                              1
           298
                  57
                      female
                               0
                                      140
                                            241
                                                   0
                                                            1
                                                                   123
                                                                             1
                                                                                     0.2
                                                                                             1
                                                                                                 0
                                                                                                       3
                                                                                                              0
           299
                  45
                        male
                               3
                                      110
                                            264
                                                            1
                                                                   132
                                                                                     1.2
                                                                                             1
                                                                                                       3
                                                                                                              0
           300
                  68
                        male
                               0
                                      144
                                            193
                                                            1
                                                                   141
                                                                             0
                                                                                     3.4
                                                                                                 2
                                                                                                       3
                                                                                                              0
           301
                                                                                                       3
                  57
                        male
                               0
                                      130
                                            131
                                                   0
                                                            1
                                                                   115
                                                                             1
                                                                                     1.2
                                                                                             1
                                                                                                 1
                                                                                                              0
           302
                                      130
                                                            0
                                                                             0
                                                                                     0.0
                                                                                                       2
                                                                                                              0
                  57 female
                                            236
                                                   0
                                                                   174
                                                                                             1
                                                                                                 1
          303 rows × 14 columns
In [42]:
            df.loc[df.cp==0,'cp']='no chest pain'
In [43]:
            df.loc[df.cp==1,'cp']='low chest pain'
In [44]:
            df.loc[df.cp==2,'cp']='medium chest pain'
In [45]:
            df.loc[df.cp==3,'cp']='high chest pain'
In [46]:
            df
Out[46]:
                                       trestbps chol
                                                      fbs restecg
                                                                   thalach exang
                                                                                    oldpeak slope
                 age
                         sex
                                   ср
                                                                                                         thal
                                                                                                              tarc
                                 high
                                                                 0
                                                                                  0
             0
                  63
                                                        1
                                                                        150
                                                                                          2.3
                                                                                                  0
                                                                                                      0
                                                                                                           1
                        male
                                 chest
                                           145
                                                 233
                                 pain
                              medium
                                                                                                           2
                                                        0
                                                                        187
                                                                                  0
                                                                                          3.5
                                                                                                  0
                                                                                                      0
             1
                  37
                        male
                                 chest
                                           130
                                                 250
                                                                 1
                                 pain
```

	age	sex	ср	trestbps	chol	fbs	restecg	thalach	exang	oldpeak	slope	ca	thal	tarç
2	41	female	low chest pain	130	204	0	0	172	0	1.4	2	0	2	
3	56	male	low chest pain	120	236	0	1	178	0	0.8	2	0	2	
4	57	female	no chest pain	120	354	0	1	163	1	0.6	2	0	2	
•••														
298	57	female	no chest pain	140	241	0	1	123	1	0.2	1	0	3	
299	45	male	high chest pain	110	264	0	1	132	0	1.2	1	0	3	
300	68	male	no chest pain	144	193	1	1	141	0	3.4	1	2	3	
301	57	male	no chest pain	130	131	0	1	115	1	1.2	1	1	3	
302	57	female	low chest pain	130	236	0	0	174	0	0.0	1	1	2	

303 rows × 14 columns

	4 ▶
In [47]:	df.loc[df.fbs==0,'fbs']='<120mg/ml'
In [48]:	df.loc[df.fbs==1,'fbs']='>120mg/ml'
In [49]:	df
Out[49]:	age sex cp trestbps chol fbs restecg thalach exang oldpeak slope ca th

Out[49]:		age	sex	ср	trestbps	chol	fbs	restecg	thalach	exang	oldpeak	slope	ca	tŀ
	0	63	male	high chest pain	145	233	>120mg/ml	0	150	0	2.3	0	0	
	1	37	male	medium chest pain	130	250	<120mg/ml	1	187	0	3.5	0	0	
	2	41	female	low chest pain	130	204	<120mg/ml	0	172	0	1.4	2	0	

	age	sex	ср	trestbps	chol	fbs	restecg	thalach	exang	oldpeak	slope	ca	tł
3	56	male	low chest pain	120	236	<120mg/ml	1	178	0	0.8	2	0	
4	57	female	no chest pain	120	354	<120mg/ml	1	163	1	0.6	2	0	
•••													
298	57	female	no chest pain	140	241	<120mg/ml	1	123	1	0.2	1	0	
299	45	male	high chest pain	110	264	<120mg/ml	1	132	0	1.2	1	0	
300	68	male	no chest pain	144	193	>120mg/ml	1	141	0	3.4	1	2	
301	57	male	no chest pain	130	131	<120mg/ml	1	115	1	1.2	1	1	
302	57	female	low chest pain	130	236	<120mg/ml	0	174	0	0.0	1	1	

303 rows × 14 columns

In [50]: df.loc[df.restecg==0,'restecg']='normal ecg '
In [51]: df.loc[df.restecg==1,'restecg']='not normal ecg'
In [52]: df.loc[df.restecg==2,'restecg']='high ecg'
In [53]: df
Out[53]: age sex cp trestbps chol fbs restecg thalach exang oldpeak slope ca them.

[53]:		age	sex	ср	trestbps	chol	fbs	restecg	thalach	exang	oldpeak	slope	ca	tŀ
	0	63	male	high chest pain	145	233	>120mg/ml	normal ecg	150	0	2.3	0	0	
	1	37	male	medium chest pain	130	250	<120mg/ml	not normal ecg	187	0	3.5	0	0	
	2	41	female	low chest pain	130	204	<120mg/ml	normal ecg	172	0	1.4	2	0	

	age	sex	ср	trestbps	chol	fbs	restecg	thalach	exang	oldpeak	slope	ca	tŀ
3	56	male	low chest pain	120	236	<120mg/ml	not normal ecg	178	0	0.8	2	0	
4	57	female	no chest pain	120	354	<120mg/ml	not normal ecg	163	1	0.6	2	0	
•••													
298	57	female	no chest pain	140	241	<120mg/ml	not normal ecg	123	1	0.2	1	0	
299	45	male	high chest pain	110	264	<120mg/ml	not normal ecg	132	0	1.2	1	0	
300	68	male	no chest pain	144	193	>120mg/ml	not normal ecg	141	0	3.4	1	2	
301	57	male	no chest pain	130	131	<120mg/ml	not normal ecg	115	1	1.2	1	1	
302	57	female	low chest pain	130	236	<120mg/ml	normal ecg	174	0	0.0	1	1	

303 rows × 14 columns

In [54]: df.loc[df.exang==0,'exang']='no'
In [55]: df.loc[df.exang==1,'exang']='yes'

In [56]: df

Out[56]:		age	sex	ср	trestbps	chol	fbs	restecg	thalach	exang	oldpeak	slope	ca	tŀ
	0	63	male	high chest pain	145	233	>120mg/ml	normal ecg	150	no	2.3	0	0	
	1	37	male	medium chest pain	130	250	<120mg/ml	not normal ecg	187	no	3.5	0	0	
	2	41	female	low chest pain	130	204	<120mg/ml	normal ecg	172	no	1.4	2	0	
	3	56	male	low chest pain	120	236	<120mg/ml	not normal ecg	178	no	0.8	2	0	

	age	sex	ср	trestbps	chol	fbs	restecg	thalach	exang	oldpeak	slope	ca	tŀ
4	57	female	no chest pain	120	354	<120mg/ml	not normal ecg	163	yes	0.6	2	0	
•••													
298	57	female	no chest pain	140	241	<120mg/ml	not normal ecg	123	yes	0.2	1	0	
299	45	male	high chest pain	110	264	<120mg/ml	not normal ecg	132	no	1.2	1	0	
300	68	male	no chest pain	144	193	>120mg/ml	not normal ecg	141	no	3.4	1	2	
301	57	male	no chest pain	130	131	<120mg/ml	not normal ecg	115	yes	1.2	1	1	
302	57	female	low chest pain	130	236	<120mg/ml	normal ecg	174	no	0.0	1	1	

303 rows × 14 columns

	→
In [57]:	<pre>df.loc[df.slope==0,'slope']='upsloping'</pre>
In [58]:	<pre>df.loc[df.slope==1,'slope']='flat'</pre>
In [59]:	<pre>df.loc[df.slope==2,'slope']='downsloping'</pre>
In [60]:	df
Out[60]:	age sex cp trestbps chol fbs restecg thalach exang oldpeak slope

Out[60]:		age	sex	ср	trestbps	chol	fbs	restecg	thalach	exang	oldpeak	slope
	0	63	male	high chest pain	145	233	>120mg/ml	normal ecg	150	no	2.3	upsloping
	1	37	male	medium chest pain	130	250	<120mg/ml	not normal ecg	187	no	3.5	upsloping
	2	41	female	low chest pain	130	204	<120mg/ml	normal ecg	172	no	1.4	downsloping
	3	56	male	low chest pain	120	236	<120mg/ml	not normal ecg	178	no	0.8	downsloping

	age	sex	ср	trestbps	chol	fbs	restecg	thalach	exang	oldpeak	slope
4	57	female	no chest pain	120	354	<120mg/ml	not normal ecg	163	yes	0.6	downsloping
•••											
298	57	female	no chest pain	140	241	<120mg/ml	not normal ecg	123	yes	0.2	flat
299	45	male	high chest pain	110	264	<120mg/ml	not normal ecg	132	no	1.2	flat
300	68	male	no chest pain	144	193	>120mg/ml	not normal ecg	141	no	3.4	flat
301	57	male	no chest pain	130	131	<120mg/ml	not normal ecg	115	yes	1.2	flat
302	57	female	low chest pain	130	236	<120mg/ml	normal ecg	174	no	0.0	flat

303 rows × 14 columns

	4											•		
In [61]:	<pre>df.loc[df.thal==0,'thal']='normal'</pre>													
In [62]:	df.	loc[d	df.thal=	==1,'tha	l']='fixe	ed det	Fect'							
In [63]:	<pre>df.loc[df.thal==2,'thal']='reversable defect'</pre>													
In [64]:	<pre>df.loc[df.thal==3,'thal']='major defect'</pre>													
In [65]:	df													
Out[65]:		age	sex	ср	trestbps	chol	fbs	restecg	thalach	exang	oldpeak	slope		
	0	63	male	high chest pain	145	233	>120mg/ml	normal ecg	150	no	2.3	upsloping		
	1	37	male	medium chest pain	130	250	<120mg/ml	not normal ecg	187	no	3.5	upsloping		
	2	41	female	low chest pain	130	204	<120mg/ml	normal ecg	172	no	1.4	downsloping		

	age	sex	ср	trestbps	chol	fbs	restecg	thalach	exang	oldpeak	slope
3	56	male	low chest pain	120	236	<120mg/ml	not normal ecg	178	no	0.8	downsloping
4	57	female	no chest pain	120	354	<120mg/ml	not normal ecg	163	yes	0.6	downsloping
•••											
298	57	female	no chest pain	140	241	<120mg/ml	not normal ecg	123	yes	0.2	flat
299	45	male	high chest pain	110	264	<120mg/ml	not normal ecg	132	no	1.2	flat
300	68	male	no chest pain	144	193	>120mg/ml	not normal ecg	141	no	3.4	flat
301	57	male	no chest pain	130	131	<120mg/ml	not normal ecg	115	yes	1.2	flat
302	57	female	low chest pain	130	236	<120mg/ml	normal ecg	174	no	0.0	flat

303 rows × 14 columns

In [66]: df.loc[df.target==0,'target']='Negative disease'
In [67]: df.loc[df.target==1,'target']='Positive disease'

In [68]: df

Out[68]:	age		sex	ср	trestbps	chol	fbs	restecg	thalach	exang	oldpeak	slope	
	0	63	male	high chest pain	145	233	>120mg/ml	normal ecg	150	no	2.3	upsloping	
	1	37	male	medium chest pain	130	250	<120mg/ml	not normal ecg	187	no	3.5	upsloping	
	2	41	female	low chest pain	130	204	<120mg/ml	normal ecg	172	no	1.4	downsloping	
	3	56	male	low chest pain	120	236	<120mg/ml	not normal ecg	178	no	0.8	downsloping	

12/24/21, 10:41 PM

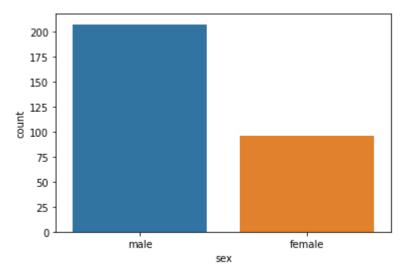
						Pr	oject				
	age	sex	ср	trestbps	chol	fbs	restecg	thalach	exang	oldpeak	slope
4	57	female	no chest pain	120	354	<120mg/ml	not normal ecg	163	yes	0.6	downsloping
•••			•••								
298	57	female	no chest pain	140	241	<120mg/ml	not normal ecg	123	yes	0.2	flat
299	45	male	high chest pain	110	264	<120mg/ml	not normal ecg	132	no	1.2	flat
300	68	male	no chest pain	144	193	>120mg/ml	not normal ecg	141	no	3.4	flat
301	57	male	no chest pain	130	131	<120mg/ml	not normal ecg	115	yes	1.2	flat
302	57	female	low chest pain	130	236	<120mg/ml	normal ecg	174	no	0.0	flat
4	ows ×	14 colu	imns	_	_	_	_	_)
Rang	geInde Colu age sex cp	ex: 303 umns (to umn M stbps 3	entries	null : null onull : null inull : null :	2	t t					

object restecg 303 non-null 7 thalach 303 non-null int64 8 exang 303 non-null object 9 float64 oldpeak 303 non-null object 10 slope 303 non-null 11 ca 303 non-null int64 12 thal 303 non-null object 13 target 303 non-null object dtypes: float64(1), int64(5), object(8) memory usage: 33.3+ KB

```
In [ ]:
          # countplot for showing categorical columns in visualization pattern
In [70]:
          sns.countplot(x="sex",data=df)
```

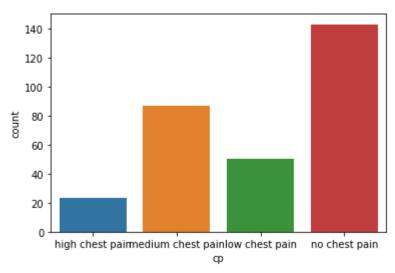
In [69]:

```
Out[70]: <AxesSubplot:xlabel='sex', ylabel='count'>
```



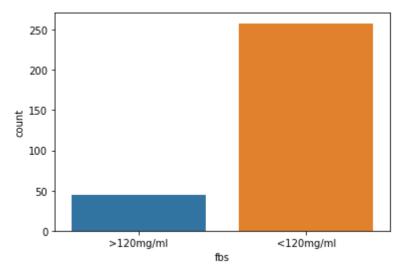
```
In [71]: sns.countplot(x='cp',data=df)
```

Out[71]: <AxesSubplot:xlabel='cp', ylabel='count'>



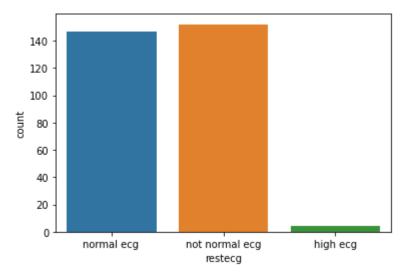
```
In [72]: sns.countplot(x='fbs',data=df)
```

Out[72]: <AxesSubplot:xlabel='fbs', ylabel='count'>



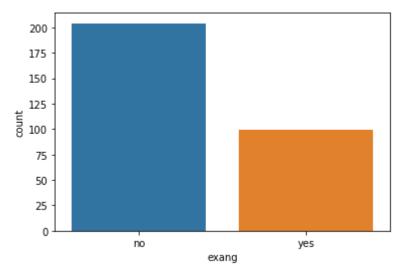
```
In [73]: sns.countplot(x='restecg',data=df)
```

Out[73]: <AxesSubplot:xlabel='restecg', ylabel='count'>



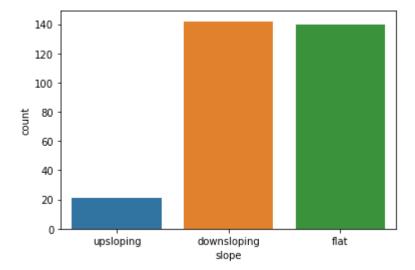
```
In [74]: sns.countplot(x='exang',data=df)
```

Out[74]: <AxesSubplot:xlabel='exang', ylabel='count'>



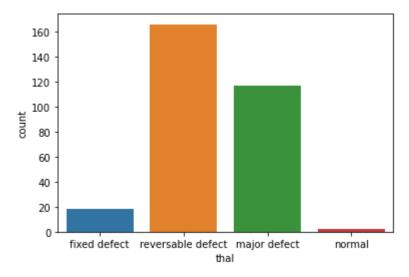
```
In [75]: sns.countplot(x='slope',data=df)
```

Out[75]: <AxesSubplot:xlabel='slope', ylabel='count'>



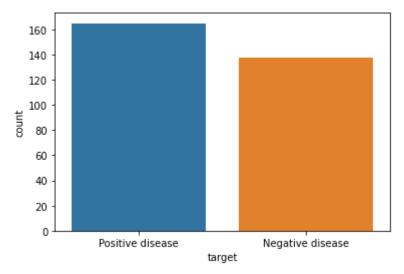
```
In [76]: sns.countplot(x='thal',data=df)
```

Out[76]: <AxesSubplot:xlabel='thal', ylabel='count'>



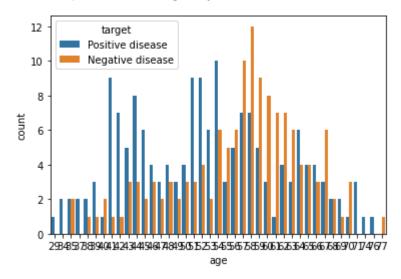
```
In [77]: sns.countplot(x='target',data=df)
```

Out[77]: <AxesSubplot:xlabel='target', ylabel='count'>



```
In []: #Study the occurrence of CVD across different ages.
In [78]: sns.countplot(x='age',data=df,hue="target")
```

Out[78]: <AxesSubplot:xlabel='age', ylabel='count'>

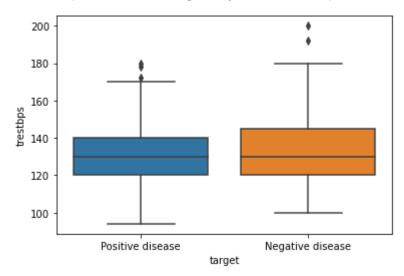


```
In [ ]:
           Can we detect heart attack based on anomalies in resting blood pressure of the patient?
In [79]:
           df.trestbps.value_counts()
Out[79]:
          120
                  37
          130
                 36
          140
                 32
          110
                 19
          150
                 17
          138
                 13
          128
                 12
          125
                 11
          160
                  11
          112
                  9
          132
                  8
```

```
108
         6
135
         6
124
         6
152
         5
145
         5
         5
134
         4
100
         4
122
170
         4
126
         3
115
         3
105
         3
136
         3
180
         3
         3
142
         2
146
148
         2
178
         2
         2
94
         2
144
102
         2
129
         1
192
         1
101
         1
174
         1
172
         1
         1
104
165
         1
164
         1
         1
106
         1
156
155
         1
154
         1
114
         1
117
         1
123
         1
200
         1
Name: trestbps, dtype: int64
```

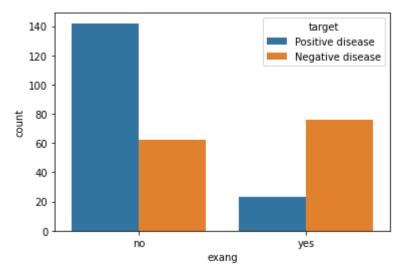
```
In [80]:
          sns.boxplot(x="target",y="trestbps",data=df)
```

Out[80]: <AxesSubplot:xlabel='target', ylabel='trestbps'>



```
In [ ]:
         #Study the composition of overall patients w.r.t . gender.
```

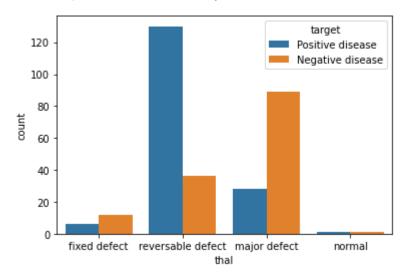
```
In [81]:
           sns.countplot(x='sex',data=df)
Out[81]: <AxesSubplot:xlabel='sex', ylabel='count'>
             200
            175
            150
            125
          8 100
             75
             50
             25
              0
                           male
                                                   female
                                        sex
 In [ ]:
           # relationship between cholesterol levels and our target variable
In [85]:
           sns.violinplot(x='sex',y='chol',hue='target',data=df)
          <AxesSubplot:xlabel='sex', ylabel='chol'>
Out[85]:
                                                      target
             600
                                                    Positive disease
                                                    Negative disease
             500
             400
          ф
             300
            200
            100
                           male
                                                   female
                                        sex
 In [ ]:
           #relationship between peak exercising and occurrence of heart attack?
In [94]:
           sns.countplot(x='exang',data=df,hue='target')
Out[94]: <AxesSubplot:xlabel='exang', ylabel='count'>
```



In []: # Is thalassemia a major cause of CVD? How are the other factors determining the occurr

In [109...
sns.countplot(x='thal',data=df,hue='target')

Out[109... <AxesSubplot:xlabel='thal', ylabel='count'>

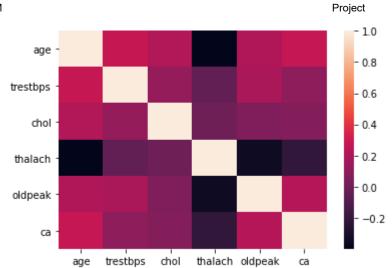


In [115... tc=df.corr()

In [116... cnc heatman(tc)

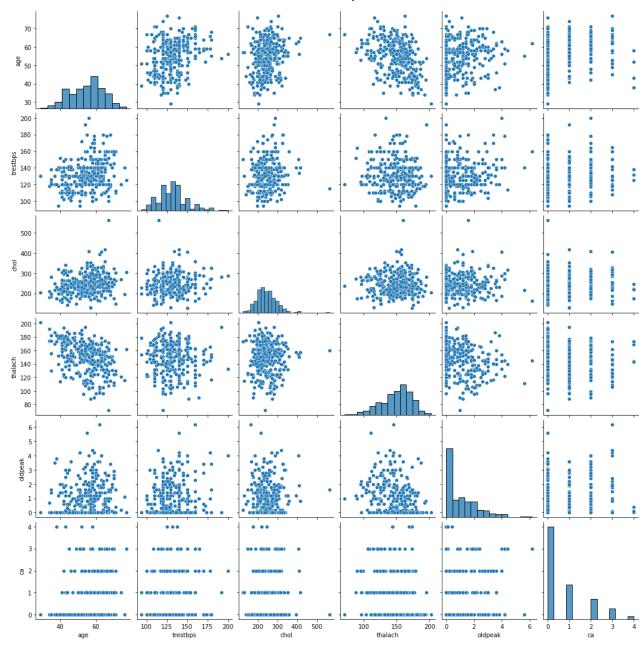
sns.heatmap(tc)

Out[116... <AxesSubplot:>





Out[92]: <seaborn.axisgrid.PairGrid at 0x20c9d216ee0>



In []: # logistic Regression Model

In [1]: import pandas as pd
import numpy as np

In [2]: data=pd.read_csv('heartattack.csv')

In [3]: data

Out[3]: trestbps chol fbs restecg thalach exang oldpeak slope thal target 145 233 0 150 2.3 0 1 1 63 37 130 250 187 0 3.5 0 2

	age	sex	ср	trestbps	chol	fbs	restecg	thalach	exang	oldpeak	slope	ca	thal	target
2	41	0	1	130	204	0	0	172	0	1.4	2	0	2	1
3	56	1	1	120	236	0	1	178	0	0.8	2	0	2	1
4	57	0	0	120	354	0	1	163	1	0.6	2	0	2	1
•••							•••	•••	•••					
298	57	0	0	140	241	0	1	123	1	0.2	1	0	3	0
299	45	1	3	110	264	0	1	132	0	1.2	1	0	3	0
300	68	1	0	144	193	1	1	141	0	3.4	1	2	3	0
301	57	1	0	130	131	0	1	115	1	1.2	1	1	3	0
302	57	0	1	130	236	0	0	174	0	0.0	1	1	2	0

303 rows × 14 columns

```
from sklearn.model_selection import train_test_split as split
from sklearn.linear_model import LogisticRegression
from sklearn.metrics import classification_report,accuracy_score
```

```
data_dummy=pd.get_dummies(data)
    data_dummy.columns=data_dummy.columns.str.replace(' ','_')
    train,test = split (data_dummy,test_size=.30,random_state=12)
    train.shape
    train.head(2)
    X_train=train.drop('target',axis=1)
    Y_train=train.target
    X_test=test.drop('target',axis=1)

    Y_test=test.drop('target',axis=1)

    Y_test=test.target
    lr=LogisticRegression()
    lr.fit(X_train,Y_train)
    pred=lr.predict(X_test)
    accuracy_score(y_true=Y_test,y_pred=pred)
    print (classification_report(y_true=Y_test,y_pred=pred))
```

	precision	recall	f1-score	support
0 1	0.84 0.81	0.80 0.85	0.82 0.83	45 46
accuracy macro avg	0.82	0.82	0.82 0.82	91 91
weighted avg	0.82	0.82	0.82	91

C:\Users\pinku\anaconda3\lib\site-packages\sklearn\linear_model_logistic.py:763: Conver genceWarning: lbfgs failed to converge (status=1): STOP: TOTAL NO. of ITERATIONS REACHED LIMIT.

Increase the number of iterations (max_iter) or scale the data as shown in:
 https://scikit-learn.org/stable/modules/preprocessing.html
Please also refer to the documentation for alternative solver options:
 https://scikit-learn.org/stable/modules/linear_model.html#logistic-regression
 n_iter_i = _check_optimize_result(