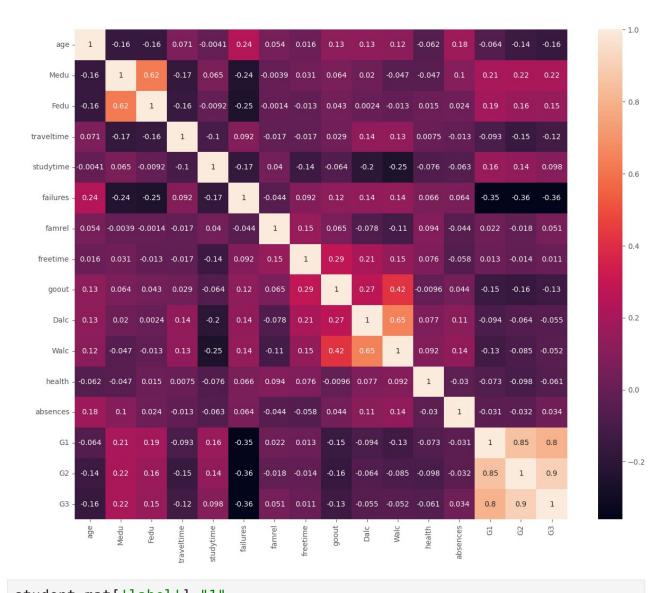
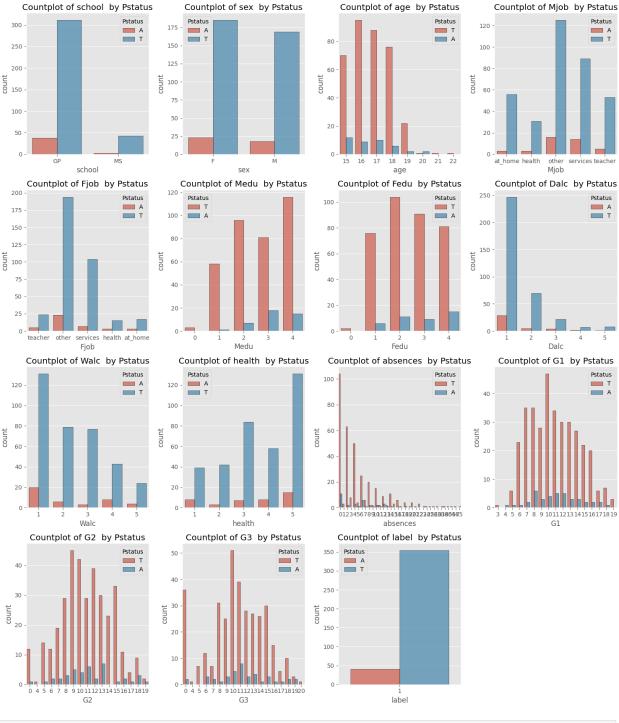
```
import pandas as pd
import matplotlib.pyplot as plt
from sklearn import preprocessing
import numpy as np
import pylab as pl
import pandas as pd
import matplotlib.pyplot as plt
%matplotlib inline
import seaborn as sns
from sklearn.utils import shuffle
from sklearn.svm import SVC
from sklearn.metrics import confusion matrix
from sklearn.model selection import cross val score, GridSearchCV
import matplotlib.pyplot as plt
import seaborn as sns
import numpy as np
import pandas as pd
from sklearn.metrics import mean_absolute_error, mean_squared_error
from sklearn.model selection import train test split
from sklearn.preprocessing import LabelEncoder
import warnings
warnings.filterwarnings("ignore")
plt.style.use('ggplot')
student mat = pd.read csv('student-mat.csv')
student mat
    school sex age address famsize Pstatus Medu
                                                                Mjob
                                                     Fedu
Fjob \
0
        GP
             F
                 18
                           U
                                 GT3
                                                            at home
teacher
        GP
                                 GT3
1
                 17
                                            Т
                                                  1
                                                            at home
other
        GP
                 15
                                 LE3
                           U
                                                  1
                                                        1
                                                            at home
other
        GP
                 15
                           U
                                 GT3
                                                  4
services
                           U
                                 GT3
4
        GP
             F
                 16
                                                  3
                                                               other
other
. . .
390
        MS
                 20
                                 LE3
                                                  2
                                                           services
services
                 17
                           U
                                 LE3
391
        MS
             М
                                                  3
                                                        1
                                                           services
services
                           R
392
        MS
                 21
                                 GT3
                                                  1
                                                        1
                                                               other
             М
other
393
        MS
             М
                 18
                           R
                                 LE3
                                            Т
                                                  3
                                                        2
                                                           services
```

othe 394 at_h	I	MS M	19	U	LE3	Т	1	1	othe	r	
G3		famrel	freetime	goout	Dalc	Walc	health	absences	G1	G2	
0 6		4	3	4	1	1	3	6	5	6	
1 6		5	3	3	1	1	3	4	5	5	
2 10		4	3	2	2	3	3	10	7	8	
3 15		3	2	2	1	1	5	2	15	14	
4 10		4	3	2	1	2	5	4	6	10	
390 9		5	5	4	4	5	4	11	9	9	
391 16		2	4	5	3	4	2	3	14	16	
392 7		5	5	3	3	3	3	3	10	8	
393 10		4	4	1	3	4	5	0	11	12	
394 9		3	2	3	3	3	5	5	8	9	
[395 plt. sns.	<pre>[395 rows x 33 columns] plt.figure(figsize=(15,12)) sns.heatmap(student_mat.corr(numeric_only=True),annot=True) plt.show()</pre>										

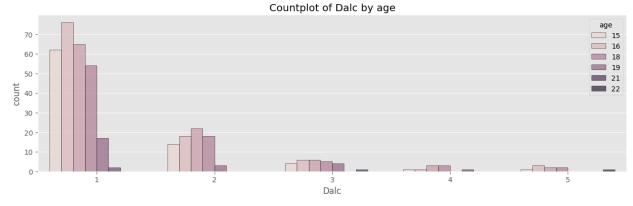


student_mat['label']="1"											
<pre>student_mat.head()</pre>											
	school sex age address famsize Pstatus Medu Fedu Mjob										
	Fjob		\								
	0	GP	F	18	U	GT3	Α	4	4	at home	
	teach	er .								_	
	1	GP	F	17	U	GT3	Т	1	1	at home	
other											
	2	GP	F	15	U	LE3	Т	1	1	at home	
other											
	3	GP	F	15	U	GT3	Т	4	2	health	
services											
	4	GP	F	16	U	GT3	Т	3	3	other	
	other										

```
freetime goout
                  Dalc
                        Walc
                               health absences
                                                 G1
                                                     G2
                                                         G3 label
0
         3
                                                  5
               4
                      1
                            1
                                    3
                                              6
                                                      6
                                                          6
                                                                 1
         3
1
               3
                      1
                            1
                                    3
                                              4
                                                  5
                                                      5
                                                          6
                                                                 1
2
                            3
                                    3
                                                 7
                                                                 1
         3
               2
                      2
                                             10
                                                      8
                                                          10
3
                                    5
         2
               2
                            1
                                                                 1
                      1
                                              2
                                                 15
                                                     14
                                                          15
4
               2
                      1
                            2
                                    5
                                              4
                                                                 1
                                                  6
                                                     10
                                                          10
[5 rows x 34 columns]
plt.figure(figsize=[15,17])
fft=['school','sex','age','Mjob','Fjob','Medu','Fedu','Dalc','Walc','h
ealth', 'absences', 'G1', 'G2', 'G3', 'label']
n=1
for f in fft:
    plt.subplot(4,4,n)
    sns.countplot(x=f, hue='Pstatus', edgecolor="black", alpha=0.7,
data=student mat)
    sns.despine()
    plt.title("Countplot of {} by Pstatus".format(f))
    n=n+1
plt.tight layout()
plt.show()
```

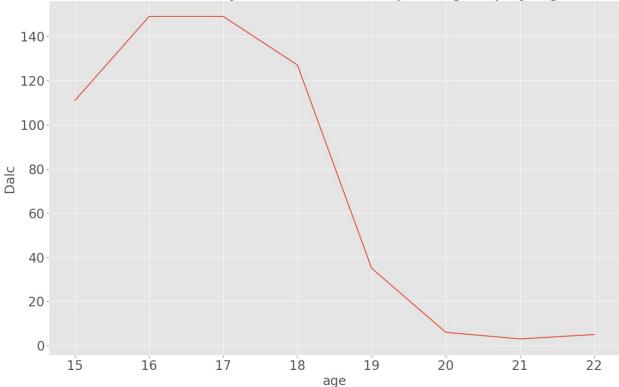


```
plt.figure(figsize=[15,4])
sns.countplot(x='Dalc', hue='age',edgecolor="black", alpha=0.7,
data=student_mat)
sns.despine()
plt.title("Countplot of Dalc by age")
plt.show()
```

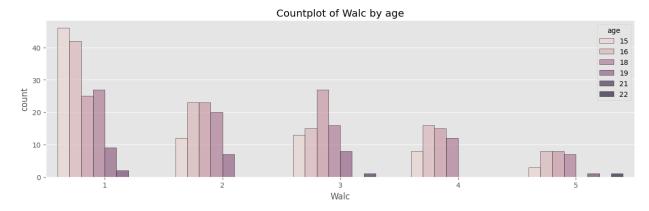


```
fig = plt.figure(figsize=(16,10))
ax = fig.add subplot(111)
dfg = student mat.groupby('age').sum()['Dalc']
dfg.plot(kind='line', title='Dalc - workday alcohol consumption
groupby age', fontsize=20)
plt.ylabel('Dalc ')
ax.title.set_fontsize(30)
ax.xaxis.label.set fontsize(20)
ax.yaxis.label.set fontsize(20)
print('Max: ' + str(dfg.max()) + ' ocurred in ' + str(dfg.loc[dfg ==
dfg.max()].index.values[0:]))
print('Max: ' + str(dfg.min()) + ' ocurred in ' + str(dfg.loc[dfg ==
dfg.min()].index.values[0:]))
print('Mean: ' + str(dfg.mean()))
Max: 149 ocurred in [16 17]
Max: 3 ocurred in [21]
Mean: 73.125
```





```
plt.figure(figsize=[15,4])
sns.countplot(x='Walc', hue='age',edgecolor="black", alpha=0.7,
data=student_mat)
sns.despine()
plt.title("Countplot of Walc by age")
plt.show()
```



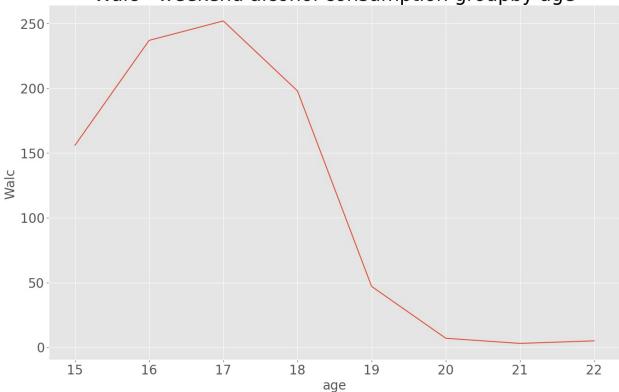
```
fig = plt.figure(figsize=(16,10))
ax = fig.add_subplot(111)
dfg = student_mat.groupby('age').sum()['Walc']
```

```
dfg.plot(kind='line', title='Walc - weekend alcohol consumption
groupby age', fontsize=20)

plt.ylabel('Walc ')
ax.title.set_fontsize(30)
ax.xaxis.label.set_fontsize(20)
ax.yaxis.label.set_fontsize(20)
print('Max: ' + str(dfg.max()) + ' ocurred in ' + str(dfg.loc[dfg == dfg.max()].index.values[0:]))
print('Max: ' + str(dfg.min()) + ' ocurred in ' + str(dfg.loc[dfg == dfg.min()].index.values[0:]))
print('Mean: ' + str(dfg.mean()))

Max: 252 ocurred in [17]
Max: 3 ocurred in [21]
Mean: 113.125
```





```
student_por = pd.read_csv('student-por.csv')
student_por
student_por['label']="0"
student_por.head()

school sex age address famsize Pstatus Medu Fedu Mjob
Fjob ... \
```

0	GP	F	18		U	GT3	Α		4	4	at_	home
teach 1 other	GP	F	17		U	GT3	Т		1	1	at_	_home
2 other	GP	F	15		U	LE3	T		1	1	at_	_home
3 servi	GP	F	15		U	GT3	Т		4	2	he	ealth
4 other	GP	F	16		U	GT3	Т		3	3	C	ther
other												
fre	etime	goo	ut	Dalc	Walc	health	absenc	es	G1	G2	G3	label
0	3		4	1	1	3		4	0	11	11	0
1	3		3	1	1	3		2	9	11	11	0
2	3		2	2	3	3		6	12	13	12	0
3	2		2	1	1	5		0	14	14	14	0
4	3		2	1	2	5		0	11	13	13	0

[5 rows x 34 columns]

Data= student\_mat.\_append([student\_mat,student\_por])

x = Data.iloc[:, [3]].values
Data

SC	hool	sex	age	address	famsize	Pstatus	Medu	Fedu	Mjob
Fjob	ob \								J
0	GP	F	18	U	GT3	Α	4	4	at_home
teache									
1	GP	F	17	U	GT3	Т	1	1	at_home
other	65	_			. = 2	_		-	
2	GP	F	15	U	LE3	T	1	1	at_home
other	CD		1.5	11	CTO	_	4	2	h 1 + h
3	GP	F	15	U	GT3	Т	4	2	health
servic 4	es GP	F	16	U	GT3	Т	3	3	other
other	GF		10	U	013		3	3	other
Other									
	• • • •	••	•••	• • • •	• • •	• • •	• • • •		
644	MS	F	19	R	GT3	Т	2	3	services
other									
645	MS	F	18	U	LE3	Т	3	1	teacher
servic	es								
646	MS	F	18	U	GT3	Т	1	1	other
other									
647	MS	М	17	U	LE3	Т	3	1	services
servic				_		_			
648	MS	М	18	R	LE3	T	3	2	services
other									

```
... freetime goout Dalc Walc health absences G1
                                                            G2
                                                                G3 label
                   4
                               1
                                            3
                3
                             1
                                                     6
                                                         5
                                                             6
                                                                  6
                       3
                             1
                                   1
                                            3
                                                         5
                                                             5
                                                                 6
                3
                       2
                             2
                                   3
                                            3
                                                    10
                                                             8
                                                                 10
                                                                        1
                                                        7
3
                2
                       2
                             1
                                   1
                                            5
                                                     2
                                                        15
                                                            14
                                                                 15
                                                                        1
                      2
                                            5
                                                         6
                                                            10
                                                                 10
                             1
                       2
                                   2
                                            5
                                                            11
                                                                10
644
                             1
                                                     4
                                                        10
                                                        15
                                                            15
645
                      4
                             1
                                            1
                                                                 16
                                                                        0
646
                                            5
                                                            12
                       1
                                                     6
                                                        11
                                                                 9
                                                                        0
                       5
                                            2
                                                                        0
647
                             3
                                                     6
                                                        10
                                                            10
                                                                10
648
                      1
                             3
                                            5
                                                     4
                                                        10
                                                            11
                                                                11
                                                                        0
[1439 rows x 34 columns]
##Convert string to numeric
from sklearn.preprocessing import LabelEncoder
le = LabelEncoder()
def FunLabelEncoder(df):
    for c in df.columns:
        if df.dtypes[c] == object:
            le.fit(df[c].astype(str))
            df[c] = le.transform(df[c].astype(str))
    return df
Data = FunLabelEncoder(Data)
Data.info()
Data.iloc[0:4.:]
<class 'pandas.core.frame.DataFrame'>
Index: 1439 entries, 0 to 648
Data columns (total 34 columns):
                 Non-Null Count Dtype
 #
     Column
- - -
     -----
 0
     school
                 1439 non-null
                                  int64
                  1439 non-null
                                  int64
 1
     sex
 2
     age
                 1439 non-null
                                  int64
 3
     address
                 1439 non-null
                                  int64
 4
     famsize
                 1439 non-null
                                  int64
```

```
5
     Pstatus
                  1439 non-null
                                   int64
                  1439 non-null
 6
     Medu
                                   int64
 7
     Fedu
                  1439 non-null
                                   int64
 8
     Miob
                  1439 non-null
                                   int64
 9
     Fjob
                  1439 non-null
                                  int64
 10
                  1439 non-null
                                   int64
     reason
 11
     quardian
                  1439 non-null
                                  int64
 12
     traveltime
                  1439 non-null
                                   int64
                  1439 non-null
 13
     studytime
                                   int64
 14
     failures
                  1439 non-null
                                  int64
 15
     schoolsup
                  1439 non-null
                                   int64
 16
     famsup
                  1439 non-null
                                   int64
 17
                  1439 non-null
     paid
                                   int64
 18
                  1439 non-null
     activities
                                   int64
 19
     nursery
                  1439 non-null
                                   int64
 20
                  1439 non-null
     higher
                                   int64
 21
     internet
                  1439 non-null
                                  int64
 22
                  1439 non-null
     romantic
                                  int64
 23
                  1439 non-null
                                  int64
     famrel
 24
     freetime
                  1439 non-null
                                   int64
                  1439 non-null
 25
     goout
                                  int64
                  1439 non-null
 26
     Dalc
                                   int64
                                  int64
 27
     Walc
                  1439 non-null
 28
     health
                  1439 non-null
                                  int64
29
     absences
                  1439 non-null
                                  int64
                  1439 non-null
 30
    G1
                                  int64
 31
     G2
                  1439 non-null
                                   int64
 32
     G3
                  1439 non-null
                                  int64
    label
33
                  1439 non-null
                                  int64
dtypes: int64(34)
memory usage: 393.5 KB
   school sex age address famsize Pstatus
                                                  Medu
                                                       Fedu Mjob Fjob
... \
        0
             0
                  18
                            1
                                      0
                                               0
                                                                         4
0
                                                                         2
                  17
1
        0
             0
                  15
                                                                         2
                                      1
2
. . .
3
        0
             0
                  15
                            1
                                      0
                                                            2
                                                                  1
                                                                         3
   freetime
             goout Dalc
                           Walc
                                 health
                                          absences
                                                    G1
                                                         G2
                                                             G3
                                                                 label
0
                  4
                        1
                              1
                                       3
                                                      5
                                                          6
                                                              6
                                                                      1
          3
                                                 6
          3
                                       3
                  3
                              1
                                                      5
                                                          5
1
                        1
                                                 4
                                                              6
                                                                      1
```

3

5

7

15

8

14

10

15

1

1

10

2

[4 rows x 34 columns]

3

2

2

2

2

1

3

1

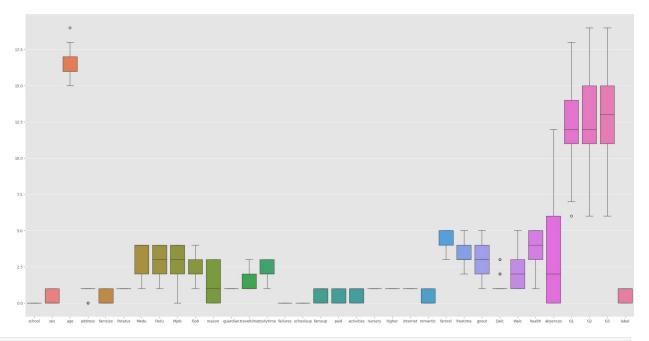
2

3

```
plt.figure(figsize=(30,15))
sns.boxplot(data=Data)
plt.show()
```

```
Q1 = Data.quantile(0.25)
Q3 = Data.quantile(0.75)
IQR= Q3-Q1
#print the IQR
print(IQR)
school
               0.0
               1.0
sex
               2.0
age
address
               1.0
famsize
               1.0
Pstatus
               0.0
Medu
               2.0
Fedu
               1.0
               2.0
Mjob
Fjob
               1.0
reason
               2.0
guardian
               0.0
traveltime
              1.0
studytime
               1.0
failures
               0.0
schoolsup
               0.0
famsup
               1.0
paid
               1.0
activities
              1.0
nursery
              0.0
```

```
higher
               0.0
internet
               0.0
romantic
               1.0
famrel
               1.0
freetime
               1.0
goout
               2.0
Dalc
               1.0
Walc
               2.0
health
               2.0
absences
               6.0
G1
               4.0
G2
               4.0
G3
               4.5
label
               1.0
dtype: float64
ul = Q3 + 1.5*IQR
ll = Q1 - 1.5*IQR
Data= Data[~((Data <ll) |(Data> ul)).any(axis=1)]
plt.figure(figsize=(30,15))
sns.boxplot(data=Data)
plt.show()
```

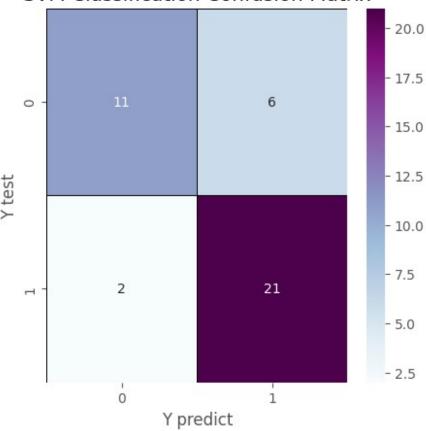


```
from sklearn.model_selection import train_test_split
Y = Data['label']
X = Data.drop(columns=['label'])
X_train, X_test, Y_train, Y_test = train_test_split(X, Y,
test_size=0.15, random_state=9)
```

```
print('X train shape: ', X_train.shape)
print('Y train shape: ', Y_train.shape)
print('X test shape: ', X_test.shape)
print('Y test shape: ', Y_test.shape)
                   (225, 33)
X train shape:
Y train shape: (225,)
X test shape:
                  (40, 33)
Y test shape:
                  (40,)
X train
      school sex age address famsize Pstatus Medu
                                                                  Fedu Mjob
Fjob ... ∖
           0
139
                 0
                      15
                                  1
                                             0
                                                       1
                                                              4
4 ...
357
                 0
                      18
                                  1
                                             0
                                                       1
347
           0
                 1
                      18
                                  1
                                             0
                                                       1
                                                              4
                                                                     3
                                                                            4
2 ...
258
            0
                 1
                      18
                                  1
                                                       1
                                                              2
                                                                     1
                                                                            2
2 ...
15
           0 0
                      16
                                  1
                                             0
                                                       1
                                                          4 4 1
2 ...
. .
           0 0
                      17
302
                                  1
                                             0
                                                       1
                                                          4
                                                                     2
                                                                            2
2 ...
209
            0
                 0
                      17
                                  0
                                             0
                                                       1
                                                              4
                                                                     3
                                                                            4
2 ...
388
            0
                 0
                                  1
                      18
3 ...
267
            0
                 0
                      18
                                  0
                                             0
                                                       1
                                                              4
                                                                     4
2 ...
215
            0
                 0
                      17
                                  1
                                             1
                                                       1
                                                              3
                                                                     2
2 ...
      famrel freetime goout Dalc Walc health absences G1 G2 G3
139
            4
                       3
                               2
                                       1
                                             1
                                                       5
                                                                           16
                                                                       16
                                                                                15
357
            4
                       3
                               4
                                       1
                                              1
                                                       5
                                                                   2
                                                                       14
                                                                           15
                                                                                17
347
            5
                                5
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                                              3
                                                       5
                                                                       10
                                                                           10
                                                                                 9
258
            5
                       2
                                4
                                       1
                                              2
                                                       4
                                                                   8
                                                                      15
                                                                           14
                                                                              14
                                                       2
15
            4
                               4
                                       1
                                             2
                                                                       14
                                                                           14
                                                                                14
```

```
302
          4
                           3
                                 1
                                       1
                                               3
                                                         0 15
                                                                12 14
209
                           2
                                 1
                                       1
                                                           7
                                                               7
                                                                   7
388
          5
                    3
                                 1
                                                         8 10
                                                                11
                                                                   12
267
                    3
                           4
                                       2
                                                         8
                                                            12
                                                                10
                                 2
                                                                    11
215
          4
                           4
                                       3
                                                         2 14
                                 1
                                               1
                                                               15 15
[225 rows x 33 columns]
from sklearn.ensemble import BaggingClassifier
from sklearn.multiclass import OneVsRestClassifier
from sklearn.svm import SVC
svmcla =
OneVsRestClassifier(BaggingClassifier(SVC(C=10,kernel='rbf',random sta
te=9, probability=True),
                                               n jobs=-1)
svmcla.fit(X train, Y train)
Y predict2 = svmcla.predict(X test)
test_acc_svmcla = round(svmcla.fit(X_train,Y_train).score(X_test,
Y test)* 100, 2)
train acc symcla = round(symcla.fit(X train, Y train).score(X train,
Y_train)* 100, 2)
# The confusion matrix
svmcla = confusion matrix(Y test, Y predict2)
f, ax = plt.subplots(figsize=(5,5))
sns.heatmap(svmcla, annot=True, linewidth=0.7, linecolor='black',
fmt='g', ax=ax, cmap="BuPu")
plt.title('SVM Classification Confusion Matrix')
plt.xlabel('Y predict')
plt.ylabel('Y test')
plt.show()
```

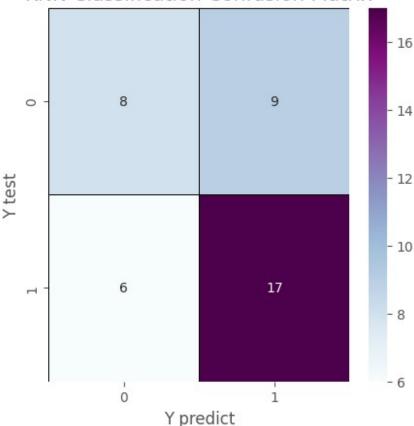
## **SVM Classification Confusion Matrix**



```
model = pd.DataFrame({
    'Model': ['SVM'],
    'Train Score': [train_acc_svmcla],
    'Test Score': [test acc svmcla]
})
model.sort_values(by='Test Score', ascending=False)
  Model Train Score Test Score
0
  SVM
              82.22
                            80.0
from sklearn.metrics import average_precision_score
average precision = average precision score(Y test, Y predict2)
print('Average precision-recall score: {0:0.2f}'.format(
      average precision))
Average precision-recall score: 0.76
from sklearn.ensemble import BaggingClassifier
from sklearn.multiclass import OneVsRestClassifier
from sklearn.neighbors import KNeighborsClassifier
knn = KNeighborsClassifier(n_neighbors=3)
knn.fit(X train, Y train)
```

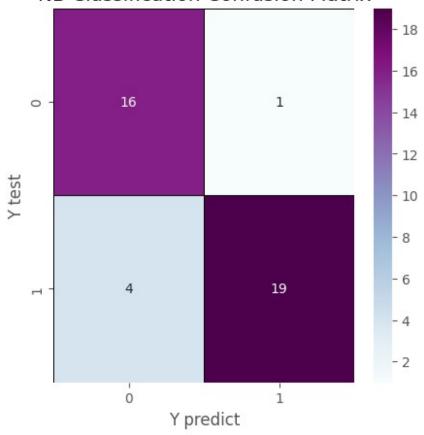
```
y_pred = knn.predict(X test)
y_pred
array([1, 1, 1, 0, 0, 0, 0, 1, 1, 1, 0, 0, 1, 1, 1, 0, 0, 1, 1, 1,
0,
       1, 1, 0, 1, 1, 1, 1, 0, 1, 0, 0, 1, 0, 1, 1, 1, 1, 1])
test acc symcla = round(knn.fit(X train, Y train).score(X test,
Y_test)* 100, 2)
train acc symcla = round(knn.fit(X train, Y train).score(X train,
Y train)* 100, 2)
knn = confusion matrix(Y test, y pred)
f, ax = plt.subplots(figsize=(5,5))
sns.heatmap(knn, annot=True, linewidth=0.7, linecolor='black',
fmt='g', ax=ax, cmap="BuPu")
plt.title('KNN Classification Confusion Matrix')
plt.xlabel('Y predict')
plt.ylabel('Y test')
plt.show()
```

## KNN Classification Confusion Matrix



```
model = pd.DataFrame({
    'Model': ['KNN'],
    'Train Score': [train_acc_svmcla],
    'Test Score': [test acc svmcla]
})
model.sort_values(by='Test Score', ascending=False)
  Model Train Score Test Score
   KNN
                76.0
                            62.5
from sklearn.metrics import average_precision_score
average precision = average precision score(Y test, y pred)
print('Average precision-recall score: {0:0.2f}'.format(
      average precision))
Average precision-recall score: 0.63
from sklearn.ensemble import BaggingClassifier
from sklearn.multiclass import OneVsRestClassifier
from sklearn.naive bayes import GaussianNB
nb = GaussianNB()
nb.fit(X train, Y train)
y pred1 = nb.predict(X test)
test acc svmcla = round(nb.fit(X train,Y train).score(X test, Y test)*
100, 2)
train acc symcla = round(nb.fit(X train, Y train).score(X train,
Y train)* 100, 2)
nb = confusion matrix(Y test, y pred1)
f, ax = plt.subplots(figsize=(5,5))
sns.heatmap(nb, annot=True, linewidth=0.7, linecolor='black', fmt='g',
ax=ax, cmap="BuPu")
plt.title('NB Classification Confusion Matrix')
plt.xlabel('Y predict')
plt.ylabel('Y test')
plt.show()
```

## **NB Classification Confusion Matrix**



```
model = pd.DataFrame({
    'Model': ['NB'],
    'Train Score': [train_acc_svmcla],
    'Test Score': [test_acc_svmcla]
})
model.sort_values(by='Test Score', ascending=False)
  Model Train Score Test Score
0
     NB
              75.11
                          87.5
from sklearn.metrics import average_precision_score
average_precision = average_precision_score(Y_test, y_pred1)
print('Average precision-recall score: {0:0.2f}'.format(
      average precision))
Average precision-recall score: 0.88
```