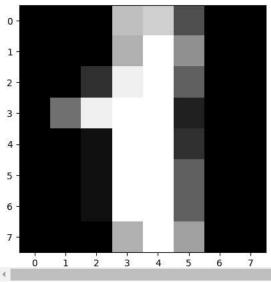
```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
from sklearn.datasets import load_digits
digit=load_digits()
digit
→ {'data': array([[ 0., 0., 5., ..., 0., 0., 0.],
             [0., 0., 0., ..., 10., 0., 0.],
             [ 0., 0., 0., ..., 16., 9., 0.],
             [ 0., 0., 1., ..., 6., 0., 0.],
             [0., 0., 2., ..., 12., 0., 0.],
[0., 0., 10., ..., 12., 1., 0.]]),
      'target': array([0, 1, 2, ..., 8, 9, 8]),
      'frame': None,
      'feature_names': ['pixel_0_0',
       'pixel_0_1',
       'pixel_0_2',
       'pixel_0_3',
       'pixel_0_4',
        'pixel_0_5',
       'pixel_0_6',
       'pixel_0_7',
       'pixel_1_0',
       'pixel_1_1',
       'pixel_1_2',
        'pixel_1_3',
       'pixel_1_4',
       'pixel_1_5',
       'pixel_1_6',
       'pixel_1_7',
        'pixel_2_0',
       'pixel_2_1',
       'pixel_2_2',
        'pixel_2_3',
       'pixel_2_4',
       'pixel_2_5',
        'pixel_2_6',
       'pixel_2_7',
       'pixel_3_0',
       'pixel_3_1',
       'pixel_3_2',
       'pixel_3_3',
       'pixel_3_4',
       'pixel_3_5',
       'pixel_3_6',
       'pixel_3_7',
       'pixel_4_0',
        'pixel_4_1',
       'pixel_4_2',
       'pixel_4_3',
       'pixel_4_4',
       'pixel_4_5',
       'pixel_4_6',
       'pixel_4_7',
       'pixel_5_0',
       'pixel_5_1',
       'pixel_5_2',
       'pixel_5_3',
       'pixel_5_4',
        'pixel_5_5',
       'pixel 5 6',
        'pixel_5_7'
       'pixel_6_0',
plt.imshow(digit.images[1],cmap='gray')
```

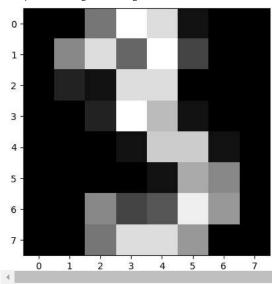


<matplotlib.image.AxesImage at 0x7e3ff3c40070>



plt.imshow(digit.images[3],cmap='gray')

<matplotlib.image.AxesImage at 0x7e3ff3daf5e0>



data1=pd.DataFrame(digit.data)
data1

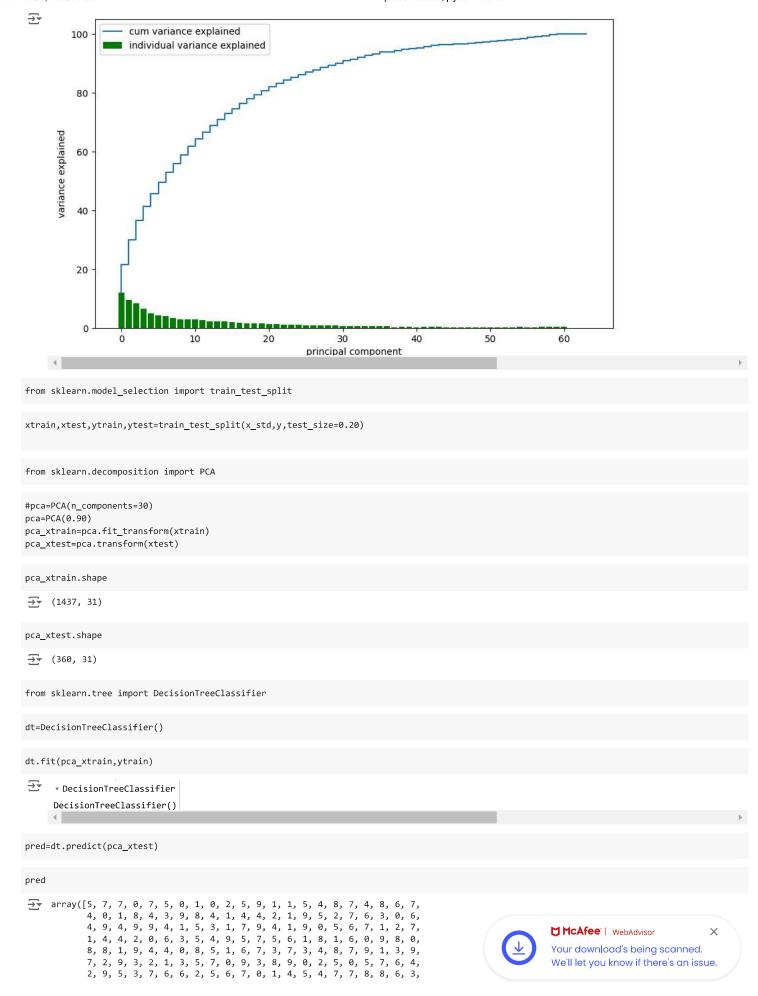
	0	1	2	3	4	5	6	7	8	9	 54	55	56	57	58	59	60	61	62	63
0	0.0	0.0	5.0	13.0	9.0	1.0	0.0	0.0	0.0	0.0	 0.0	0.0	0.0	0.0	6.0	13.0	10.0	0.0	0.0	0.0
1	0.0	0.0	0.0	12.0	13.0	5.0	0.0	0.0	0.0	0.0	 0.0	0.0	0.0	0.0	0.0	11.0	16.0	10.0	0.0	0.0
2	0.0	0.0	0.0	4.0	15.0	12.0	0.0	0.0	0.0	0.0	 5.0	0.0	0.0	0.0	0.0	3.0	11.0	16.0	9.0	0.0
3	0.0	0.0	7.0	15.0	13.0	1.0	0.0	0.0	0.0	8.0	 9.0	0.0	0.0	0.0	7.0	13.0	13.0	9.0	0.0	0.0
4	0.0	0.0	0.0	1.0	11.0	0.0	0.0	0.0	0.0	0.0	 0.0	0.0	0.0	0.0	0.0	2.0	16.0	4.0	0.0	0.0
1792	0.0	0.0	4.0	10.0	13.0	6.0	0.0	0.0	0.0	1.0	 4.0	0.0	0.0	0.0	2.0	14.0	15.0	9.0	0.0	0.0
1793	0.0	0.0	6.0	16.0	13.0	11.0	1.0	0.0	0.0	0.0	 1.0	0.0	0.0	0.0	6.0	16.0	14.0	6.0	0.0	0.0
1794	0.0	0.0	1.0	11.0	15.0	1.0	0.0	0.0	0.0	0.0	 0.0	0.0	0.0	0.0	2.0	9.0	13.0	6.0	0.0	0.0
1795	0.0	0.0	2.0	10.0	7.0	0.0	0.0	0.0	0.0	0.0	 2.0	0.0	0.0	0.0	5.0	12.0	16.0	12.0	0.0	0.0
1796			10.0 Numns	14.0	8.0	1.0	0.0	0.0	0.0	2.0	 8.0	0.0	0.0	1.0	8.0	12.0			You	1cAfee " WebAdvisor ; ur download's being scanned. 'Il let you know if there's an issue

```
plt.imshow(digit.images[1795],cmap='gray')
<matplotlib.image.AxesImage at 0x7e3ff0df3310>
      0
      1
      2 .
      3
      4
      5
      6
x=digit.data
y=pd.DataFrame(digit.target)
y.value_counts()
₹
         count
      0
      3
           183
      1
           182
      5
           182
      4
           181
      6
           181
      9
           180
           179
      0
           178
      2
           177
           174
from sklearn.preprocessing import StandardScaler
sc=StandardScaler()
x_std=sc.fit_transform(x)
x1=x_std.T
x1
→ array([[ 0.
                        , 0.
                                         0.
                         , 0.
            [-0.33501649, -0.33501649, -0.33501649, \dots, -0.33501649,
            -0.33501649, -0.33501649],
[-0.04308102, -1.09493684, -1.09493684, ..., -0.88456568,
             -0.67419451, 1.00877481],
                                                                                                          ™CAfee | WebAdvisor
            [-1.14664746, 0.54856067, 1.56568555, ..., -0.12952258,
              0.8876023 , 0.8876023 ],
                                                                                                          Your download's being scanned.
            [-0.5056698 , -0.5056698 , 1.6951369 , ..., -0.5056698 ,
                                                                                                          We'll let you know if there's an issue.
             -0.5056698 , -0.26113572],
```

```
[-0.19600752,\ -0.19600752,\ -0.19600752,\ \dots,\ -0.19600752,
             -0.19600752, -0.19600752]])
cov_mat=np.cov(x1)
print(cov_mat)
<del>_____</del> [[ 0.
                                                0.
      [ 0.
                    1.00055679 0.55692803 ... -0.02988686 0.02656195
       -0.04391324]
                    0.55692803 1.00055679 ... -0.04120565 0.07263924
        0.08256908]
      [ 0.
                   -0.02988686 -0.04120565 ... 1.00055679 0.64868875
        0.26213704]
                    [ 0.
        0.620773551
      [ 0.
                   1.00055679]]
print(cov_mat.shape)
→ (64, 64)
eig value, eig vecs=np.linalg.eig(cov mat)
eig_value
array([7.34477606, 5.83549054, 5.15396118, 3.96623597, 2.9663452 ,
            2.57204442, 2.40600941, 2.06867355, 1.82993314, 1.78951739,
            1.69784616, 1.57287889, 1.38870781, 1.35933609, 1.32152536,
            1.16829176, 1.08368678, 0.99977862, 0.97438293, 0.90891242,
            0.82271926,\ 0.77631014,\ 0.71155675,\ 0.64552365,\ 0.59527399,
             0.5765018 \ , \ 0.52673155, \ 0.5106363 \ , \ 0.48686381, \ 0.45560107, \\
             0.44285155, \ 0.42230086, \ 0.3991063 \ , \ 0.39110111, \ 0.36094517, 
             0.34860306, \ 0.3195963 \ , \ 0.05037444, \ 0.29406627, \ 0.27692285, 
           0.06328961, 0.258273 , 0.24783029, 0.2423566 , 0.07635394, 0.08246812, 0.09018543, 0.09840876, 0.10250434, 0.11188655,
            0.11932898, 0.12426371, 0.13321081, 0.14311427, 0.217582 ,
            0.15818474, 0.16875236, 0.20799593, 0.17612894, 0.2000909,
                                 , 0.
            0.18983516, 0.
                                             , 0.
eig_vecs
\rightarrow array([[ 0.
                           0.
                                     ],
            [ 0.18223392, -0.04702701, 0.02358821, ...,
                       , 0.
              0.
            [ 0.285868 , -0.0595648 , -0.05679875 , ..., 0.
                        , 0.
              0.
            [ 0.103198 , 0.24261778, -0.02227952, ..., 0.
                           0.
                                     ],
            [ 0.1198106 , 0.16508926, 0.10036559, ..., 0.
                        , 0.
              0.
            [ 0.07149362, 0.07132924, 0.09244589, ..., 0.
                       , 0.
                                     11)
tot=sum(eig_value)
var_exp=[(i/tot)*100 for i in eig_value]
var_exp
[12.033916097734904,
      9.561054403097883,
      8.444414892624566,
      6.498407907524167,
      4.860154875966403,
      4.214119869271944,
      3.9420828035674003.
      3.3893809246383264,
      2.998221011625232,
      2.9320025512522068,
      2.781805463550326,
      2.5770550925819995,
                                                                                                        McAfee | WebAdvisor
      2.2753033157642486,
                                                                                                        Your download's being scanned.
      2.227179739514353,
                                                                                                        We'll let you know if there's an issue.
      2.1652294318492435
      1.9141666064421259,
```

```
1.7755470851681938.
      1.6380692742844212.
      1.5964601688623428,
      1.4891911870878194,
      1.3479695658179378,
      1.2719313702347599,
      1.1658373505919493,
      1.0576465985363224.
      0.9753159471981139,
      0.9445589897319981,
      0.8630138269707229,
      0.8366428536685183,
      0.7976932484112456,
      0.7464713709260611,
      0.725582151370274,
      0.691911245481183,
      0.6539085355726172,
      0.640792573845988,
      0.5913841117223424,
      0.571162405223525,
      0.5236368034166339,
      0.08253509448180278,
      0.48180758644514254,
      0.45371925985845096,
      0.10369573015571817,
      0.42316275323278085,
      0.4060530699790386,
      0.39708480827582743.
      0.12510074249730116,
      0.13511841133708546,
      0.14776269410608744,
      0.161236062256729,
      0.1679463874955841,
      0.18331849919718232,
      0.19551242601981858.
      0.20359763452537666,
      0.21825685771200845,
      0.23448300553563545,
      0.3564933031426177,
      0.25917494088146453,
      0.2764892635235469,
      A 2/A707101/7A2AA7/
cum_var_exp=np.cumsum(var_exp)
cum var exp
→ array([ 12.0339161 , 21.5949705 ,
                                        30.03938539, 36.5377933
             41.39794818, 45.61206805, 49.55415085, 52.94353177,
             55.94175279, 58.87375534, 61.6555608,
                                                      64.23261589,
             66.50791921, 68.73509895,
                                        70.90032838,
                                                      72.81449499,
             74.59004207, 76.22811135, 77.82457152, 79.3137627,
             80.66173227, 81.93366364, 83.09950099,
                                                      84,15714759,
             85.13246353, 86.07702252, 86.94003635, 87.77667921,
             88.57437245, 89.32084382, 90.04642598,
                                                      90.73833722,
             91.39224576, 92.03303833, 92.62442244,
                                                      93.19558485,
             93.71922165, 93.80175675, 94.28356433,
                                                      94.73728359,
             94.84097932, 95.26414208, 95.67019515,
                                                      96.06727995,
            96.1923807 ,
                          96.32749911,
                                        96.4752618 ,
                                                      96.63649786,
             96.80444425, 96.98776275, 97.18327518,
                                                      97.38687281,
             97.60512967, 97.83961267,
                                        98.19610598,
                                                      98.45528092,
            98.73177018, 99.07255736,
                                        99.36113266,
                                                      99.68896799,
                                      , 100.
                                                    , 100.
            100.
                       , 100.
plt.figure(figsize=(10,6))
plt.bar(range(len(var_exp)),var_exp,label='individual variance explained',color='g')
plt.step(range(len(cum_var_exp)),cum_var_exp,label="cum variance explained")
plt.ylabel("variance explained")
plt.xlabel("principal component")
plt.legend()
plt.show()
```





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```
3, 8, 4, 7, 2, 6, 7, 8, 5, 1, 8, 0, 7, 0, 0, 8, 9, 2, 8, 7, 7, 5,
           8, 6, 1, 4, 2, 3, 0, 0, 5, 4, 3, 5, 1, 5, 6, 2, 2, 1, 2, 4, 7, 4,
           4, 8, 5, 2, 9, 2, 2, 8, 5, 1, 0, 3, 2, 4, 9, 5, 9, 8, 1, 1, 6, 8,
           5, 2, 6, 6, 5, 4, 6, 0, 5, 7, 1, 1, 2, 2, 8, 9, 8, 4, 5, 9, 6, 1,
           3, 7, 2, 8, 8, 8, 9, 3, 0, 3, 6, 4, 0, 2, 0, 5, 9, 6, 7, 7, 6, 6,
           3, 6, 2, 3, 0, 3, 4, 0, 9, 5, 8, 9, 4, 3, 8, 6, 1, 8, 3, 0, 1, 4,
           1, 0, 6, 9, 9, 5, 2, 9, 5, 6, 3, 4, 2, 2, 7, 6, 4, 3, 3, 1, 5, 5,
           9, 9, 1, 3, 9, 6, 0, 4, 7, 4, 6, 7, 5, 7, 2, 6, 5, 7, 2, 1, 6, 3,
           0, 1, 9, 6, 4, 7, 6, 8, 8, 5, 6, 5, 6, 3, 1, 8, 5, 9, 8, 8, 3, 5,
           3, 7, 0, 2, 9, 7, 9, 6])
ytest
            0
     1776 5
      170
            8
     1113 7
            0
      724
     1684 7
       •••
     1163 6
      161
           9
     1694 7
      285
           9
     1077 0
    360 rows × 1 columns
from sklearn.metrics import confusion_matrix,accuracy_score
confusion_matrix(ytest,pred)
→ array([[26, 0,
                     0,
                         0,
                             0,
                                 0.
                                         0.
                                             0,
                                                0],
                                     1.
             0, 32,
                     0,
                         0,
                             1,
                                 0,
                                     0,
                                         0,
                                             3,
                                                0],
             0,
                 0, 25, 2,
                             0,
                                 0,
                                     0,
                                         0,
                                            1,
                                                0],
             0,
                 0,
                     2, 26,
                             0,
                                 1,
                                     0,
                                         0,
                                             2,
                                                1],
           [ 2,
                 0,
                     0, 0, 36,
                                0,
                                     1,
                                            0, 1],
                                         3,
             2,
                 0, 1,
                         0,
                             1, 36,
                                    0,
                                        0,
                                            4, 4],
```

0, 2, 1, 2, [0, 2, 2, 1,

1, 0, 1, 0, 0,

0, 0,

0, 1,

accuracy_score(ytest,pred)

sns.heatmap(confusion_matrix(ytest,pred),annot=True,cmap='Greens')

0, 3,

0, 1, 0, 2,

0, 36,

0, 0, 0, 32,

0,

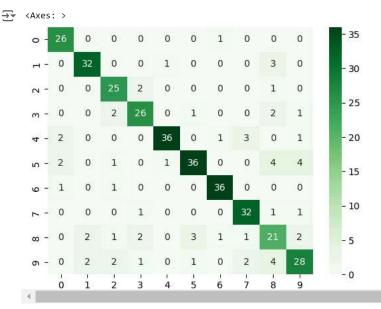
1, 1, 21, 2],

0, 0],

1, 1],

4, 28]])





plt.scatter(ytest,pred)

<matplotlib.collections.PathCollection at 0x7e3ff43ae200>

