akulas_hw1

January 10, 2019

```
In [1]: import pandas as pd
        import matplotlib.pyplot as plt
        import seaborn as sns
        from IPython.display import display, HTML
        import numpy as np
        \#df = pd.read\_csv('data/breast-cancer-wisconsin/breast-cancer-wisconsin.data', header=
        df = pd.read_csv('data/breast-cancer-wisconsin/wdbc.data', header=None)
        df = df.iloc[:,:12]
        columns = ['ID',
                   'Diagnosis',
                   'radius',
                   'texture',
                   'perimeter',
                   'area',
                   'smoothness',
                   'compactness',
                   'concavity',
                   'concave_points',
                   'symmetry',
                   'fractal_dim']
        df.columns = columns
        df = df.set_index('ID')
        df.head(10)
Out[1]:
                 Diagnosis radius texture perimeter
                                                           area smoothness \
        ID
                           17.99
                                                        1001.0
        842302
                         Μ
                                      10.38
                                                122.80
                                                                    0.11840
        842517
                         М
                             20.57
                                      17.77
                                                132.90
                                                        1326.0
                                                                    0.08474
                                      21.25
        84300903
                         Μ
                           19.69
                                                130.00
                                                        1203.0
                                                                    0.10960
        84348301
                         Μ
                           11.42
                                      20.38
                                                 77.58
                                                          386.1
                                                                    0.14250
        84358402
                         M
                           20.29
                                      14.34
                                                135.10 1297.0
                                                                    0.10030
                         M 12.45
        843786
                                      15.70
                                                 82.57
                                                         477.1
                                                                    0.12780
        844359
                         М
                           18.25
                                      19.98
                                                119.60 1040.0
                                                                    0.09463
        84458202
                         M 13.71
                                      20.83
                                                 90.20
                                                          577.9
                                                                    0.11890
        844981
                         M 13.00
                                      21.82
                                                 87.50
                                                          519.8
                                                                    0.12730
        84501001
                         М
                             12.46
                                      24.04
                                                 83.97
                                                          475.9
                                                                    0.11860
```

```
compactness
                                concavity
                                            concave_points symmetry
                                                                       fractal_dim
        ID
        842302
                       0.27760
                                  0.30010
                                                   0.14710
                                                               0.2419
                                                                           0.07871
        842517
                       0.07864
                                  0.08690
                                                   0.07017
                                                               0.1812
                                                                           0.05667
                                                   0.12790
                                                               0.2069
        84300903
                       0.15990
                                  0.19740
                                                                           0.05999
        84348301
                       0.28390
                                  0.24140
                                                   0.10520
                                                               0.2597
                                                                           0.09744
        84358402
                       0.13280
                                  0.19800
                                                   0.10430
                                                              0.1809
                                                                           0.05883
        843786
                       0.17000
                                  0.15780
                                                   0.08089
                                                              0.2087
                                                                           0.07613
        844359
                       0.10900
                                  0.11270
                                                   0.07400
                                                              0.1794
                                                                           0.05742
        84458202
                       0.16450
                                  0.09366
                                                   0.05985
                                                              0.2196
                                                                           0.07451
        844981
                       0.19320
                                  0.18590
                                                   0.09353
                                                               0.2350
                                                                           0.07389
        84501001
                       0.23960
                                  0.22730
                                                   0.08543
                                                               0.2030
                                                                           0.08243
In [2]: summary_stats = [df.mean(), df.skew(), df.std(), df.var()]
        results_df = pd.DataFrame()
        results_df['mean'] = df.mean()
        results_df['mode'] = df.mode().iloc[0,:]
        results_df['skew'] = df.skew()
        results_df['std_dev'] = df.std()
        results df['variance'] = df.var()
        results df = results df.T
        display(results_df)
           radius texture perimeter
                                          area smoothness compactness
          14.1273
                   19.2896
                               91.969
                                       654.889
                                                 0.0963603
                                                               0.104341
mean
            12.34
                      14.93
                                82.61
                                          512.2
                                                    0.1007
                                                                 0.1147
mode
          0.94238
                   0.65045
                              0.99065
                                      1.64573
skew
                                                  0.456324
                                                                1.19012
          3.52405
                   4.30104
                               24.299
                                       351.914
                                                 0.0140641
std dev
                                                              0.0528128
variance
          12.4189
                   18.4989
                               590.44
                                        123844
                                                 0.0001978
                                                            0.00278919
           concavity concave_points
                                          symmetry
                                                    fractal_dim
           0.0887993
                           0.0489191
                                          0.181162
                                                      0.0627976
mean
                                            0.1601
                                                        0.05667
mode
                   0
                                   0
skew
             1.40118
                             1.17118
                                          0.725609
                                                        1.30449
                                         0.0274143
std_dev
           0.0797198
                           0.0388028
                                                     0.00706036
                          0.00150566
                                                    4.98487e-05
variance
          0.00635525
                                      0.000751543
```

1 Correlation of features

The pearson correlation for each feature was computed below. The full matrix of correlations can be seen first, then the correlations were sorted from highest to lowest values.

```
radius
                                    perimeter
                                                          smoothness
                           texture
                                                    area
radius
                1.000000 0.323782
                                      0.997855
                                                0.987357
                                                            0.170581
                0.323782 1.000000
                                                           -0.023389
texture
                                      0.329533
                                                0.321086
                0.997855
                         0.329533
                                      1.000000
                                                0.986507
                                                            0.207278
perimeter
area
                0.987357
                          0.321086
                                      0.986507
                                                1.000000
                                                            0.177028
smoothness
                0.170581 -0.023389
                                      0.207278
                                                0.177028
                                                            1.000000
compactness
                0.506124 0.236702
                                      0.556936
                                                0.498502
                                                            0.659123
concavity
                0.676764 0.302418
                                      0.716136
                                                0.685983
                                                            0.521984
concave_points
                0.822529 0.293464
                                      0.850977
                                                0.823269
                                                            0.553695
symmetry
                0.147741 0.071401
                                      0.183027
                                                0.151293
                                                            0.557775
fractal_dim
               -0.311631 -0.076437
                                    -0.261477 -0.283110
                                                            0.584792
                compactness
                             concavity
                                         concave_points
                                                         symmetry
                                                                   fractal_dim
radius
                   0.506124
                              0.676764
                                               0.822529
                                                         0.147741
                                                                     -0.311631
texture
                   0.236702
                              0.302418
                                               0.293464
                                                         0.071401
                                                                     -0.076437
perimeter
                   0.556936
                              0.716136
                                               0.850977
                                                         0.183027
                                                                     -0.261477
                   0.498502
                              0.685983
                                               0.823269
                                                         0.151293
                                                                     -0.283110
area
smoothness
                   0.659123
                              0.521984
                                               0.553695
                                                         0.557775
                                                                      0.584792
compactness
                   1.000000
                              0.883121
                                               0.831135
                                                         0.602641
                                                                      0.565369
                              1.000000
concavity
                   0.883121
                                               0.921391
                                                         0.500667
                                                                       0.336783
concave_points
                   0.831135
                              0.921391
                                               1.000000
                                                         0.462497
                                                                       0.166917
symmetry
                   0.602641
                              0.500667
                                               0.462497
                                                         1.000000
                                                                       0.479921
fractal_dim
                   0.565369
                              0.336783
                                               0.166917
                                                         0.479921
                                                                       1.000000
```

	row	col	value
2	radius	perimeter	0.997855
3	radius	area	0.987357
20	perimeter	area	0.986507
46	concavity	concave_points	0.921391
41	compactness	concavity	0.883121
24	perimeter	concave_points	0.850977
42	compactness	concave_points	0.831135
31	area	concave_points	0.823269
7	radius	concave_points	0.822529
23	perimeter	concavity	0.716136
30	area	concavity	0.685983
6	radius	concavity	0.676764
35	${\tt smoothness}$	compactness	0.659123
43	compactness	symmetry	0.602641
39	smoothness	fractal_dim	0.584792

```
44
                        fractal_dim
                                      0.565369
       compactness
38
        smoothness
                            symmetry
                                      0.557775
22
                        compactness
                                      0.556936
         perimeter
37
                     concave_points
        smoothness
                                      0.553695
36
        smoothness
                          concavity
                                      0.521984
                        compactness
5
            radius
                                      0.506124
47
         concavity
                            symmetry
                                      0.500667
29
               area
                        compactness
                                      0.498502
53
          symmetry
                        fractal_dim
                                      0.479921
50
    concave_points
                            symmetry
                                      0.462497
48
         concavity
                        fractal_dim
                                      0.336783
11
           texture
                          perimeter
                                      0.329533
                                      0.323782
1
            radius
                             texture
12
           texture
                                      0.321086
                                area
15
           texture
                          concavity
                                      0.302418
                                      0.293464
16
                     concave_points
           texture
14
                        compactness
                                      0.236702
           texture
21
                                      0.207278
         perimeter
                         smoothness
25
         perimeter
                                      0.183027
                            symmetry
28
                         smoothness
                                      0.177028
               area
4
            radius
                         smoothness
                                      0.170581
51
    concave points
                        fractal dim
                                      0.166917
32
               area
                            symmetry
                                      0.151293
8
            radius
                            symmetry
                                      0.147741
17
           texture
                            symmetry
                                      0.071401
13
                         smoothness -0.023389
           texture
                        fractal_dim -0.076437
18
           texture
26
         perimeter
                        fractal_dim -0.261477
                        fractal_dim -0.283110
33
               area
9
            radius
                        fractal_dim -0.311631
```

We can see that "radius" and "perimeter" have a high positive correlation between them. This makes sense because the radius of the cells would be directly proportional to its perimeter. It is also the case that radius is highly correlated with area.

The weakest correlation is between texture and smoothness. This indicates that there isn't necessarily a relationship between the two variables.

Radius and fractal_dim are negatively correlated, however, not strongly. This suggests that as one varible trends upwards, the other is likely to trend downwards and vice versa.

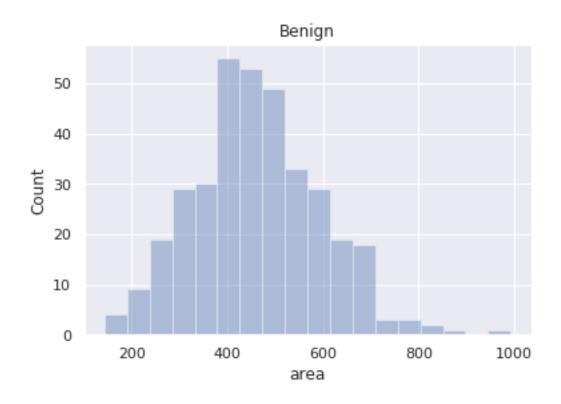
2 Histograms

```
In [5]: sns.set()
    benign = df.loc[df['Diagnosis'] == 'B']
    display(benign.head())
    data = benign['area']
    n_bins = int(np.sqrt(len(data)))
```

```
ax = sns.distplot(data, kde=False, bins=n_bins)
ax.set(ylabel ='Count', title='Benign')
plt.show()
```

	Diagnosis	radius	texture	perimeter	area	${\tt smoothness}$	\
ID							
8510426	В	13.540	14.36	87.46	566.3	0.09779	
8510653	В	13.080	15.71	85.63	520.0	0.10750	
8510824	В	9.504	12.44	60.34	273.9	0.10240	
854941	В	13.030	18.42	82.61	523.8	0.08983	
85713702	В	8.196	16.84	51.71	201.9	0.08600	

	compactness	concavity	concave_points	symmetry	<pre>fractal_dim</pre>
ID					
8510426	0.08129	0.06664	0.047810	0.1885	0.05766
8510653	0.12700	0.04568	0.031100	0.1967	0.06811
8510824	0.06492	0.02956	0.020760	0.1815	0.06905
854941	0.03766	0.02562	0.029230	0.1467	0.05863
85713702	0.05943	0.01588	0.005917	0.1769	0.06503



```
n_bins = int(np.sqrt(len(data)))
ax = sns.distplot(data, kde=False, bins=n_bins)
ax.set(ylabel ='Count', title='Malignant')
plt.show()
```

	Diagnosis	radius	texture	perimeter	area s	$moothness \setminus$
ID						
842302	М	17.99	10.38	122.80	1001.0	0.11840
842517	М	20.57	17.77	132.90	1326.0	0.08474
84300903	М	19.69	21.25	130.00	1203.0	0.10960
84348301	M	11.42	20.38	77.58	386.1	0.14250
84358402	М	20.29	14.34	135.10	1297.0	0.10030
	compactne	ss conc	avity co	ncave_point	s symmetr	y fractal_dim
ID	•		J	-1		_
842302	0.277	60 0	.3001	0.1471	0 0.241	9 0.07871
842517	0.078	64 0	.0869	0.0701	7 0.181	2 0.05667
84300903	0.159	90 0	.1974	0.1279	0 0.206	9 0.05999

0.2414

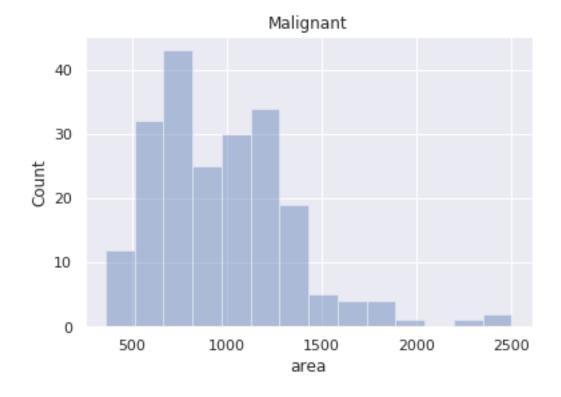
0.1980

84348301

84358402

0.28390

0.13280



0.10520

0.10430

0.2597

0.1809

0.09744

0.05883