Breast Cancer Classification Using Machine Learning ___ Krutika Shinde

Importing the Dependencies

```
import numpy as np
import pandas as pd
import sklearn.datasets
from sklearn.model_selection import train_test_split
from sklearn.linear_model import LogisticRegression
from sklearn.metrics import accuracy_score
```

Data Collection & Processing

```
# loading the data from sklearn
breast cancer dataset = sklearn.datasets.load breast cancer()
print(breast cancer dataset)
{'data': array([[1.799e+01, 1.038e+01, 1.228e+02, ..., 2.654e-01,
4.601e-01,
       1.189e-01],
      [2.057e+01, 1.777e+01, 1.329e+02, ..., 1.860e-01, 2.750e-01,
       8.902e-02],
       [1.969e+01, 2.125e+01, 1.300e+02, ..., 2.430e-01, 3.613e-01,
       8.758e-021,
       [1.660e+01, 2.808e+01, 1.083e+02, ..., 1.418e-01, 2.218e-01,
       7.820e-02],
      [2.060e+01, 2.933e+01, 1.401e+02, ..., 2.650e-01, 4.087e-01,
       1.240e-01],
       [7.760e+00, 2.454e+01, 4.792e+01, ..., 0.000e+00, 2.871e-01,
       7.039e-02]]), 'target': array([0, 0, 0, 0, 0, 0, 0, 0, 0, 0,
0, 0, 0, 0, 0, 0, 0, 0, 1, 1, 1,
      0,
      0, 0, 1, 0, 1, 1, 1, 1, 1, 0, 0, 1, 0, 0, 1, 1, 1, 1, 0, 1, 0,
0,
      1, 1, 1, 1, 0, 1, 0, 0, 1, 0, 1, 0, 0, 1, 1, 1, 0, 0, 1, 0, 0,
0,
      1, 1, 1, 0, 1, 1, 0, 0, 1, 1, 1, 0, 0, 1, 1, 1, 1, 0, 1, 1, 0,
1,
      1, 1, 1, 1, 1, 1, 0, 0, 0, 1, 0, 0, 1, 1, 1, 0, 0, 1, 0, 1,
0,
      0, 1, 0, 0, 1, 1, 0, 1, 1, 0, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1,
1,
```

```
1, 1, 0, 1, 1, 1, 1, 0, 0, 1, 0, 1, 1, 0, 0, 1, 1, 0, 0, 1, 1,
1,
      1, 0, 1, 1, 0, 0, 0, 1, 0, 1, 0, 1, 1, 1, 0, 1, 1, 0, 0, 1, 0,
0,
      0, 0, 1, 0, 0, 0, 1, 0, 1, 0, 1, 1, 0, 1, 0, 0, 0, 0, 1, 1, 0,
0,
      1, 1, 1, 0, 1, 1, 1, 1, 1, 0, 0, 1, 1, 0, 1, 1, 0, 0, 1, 0, 1,
1,
      1, 1, 0, 1, 1, 1, 1, 0, 1, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0,
0,
      0, 0, 1, 1, 1, 1, 1, 0, 1, 0, 1, 1, 0, 1, 1, 0, 1, 0, 0, 1,
1,
      1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 0, 1, 0, 1, 0, 1, 1, 1, 1,
1,
      1, 1, 1, 1, 1, 1, 1, 1, 1, 0, 1, 1, 0, 1, 0, 1, 1, 1, 1, 0,
0,
      0, 1, 1, 1, 1, 0, 1, 0, 1, 0, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1,
0,
      0, 0, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 0, 0, 1, 0, 0, 0, 1, 0,
0,
      1, 1, 1, 1, 1, 0, 1, 1, 1, 1, 1, 0, 1, 1, 0, 1, 1, 0, 0, 1,
1,
      1, 1, 1, 1, 0, 1, 1, 1, 1, 1, 1, 0, 1, 1, 1, 1, 1, 0, 1, 1,
0,
      1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 0, 1, 0, 0, 1, 0, 1, 1, 1,
1,
      1, 0, 1, 1, 0, 1, 0, 1, 1, 0, 1, 0, 1, 1, 1, 1, 1, 1, 1, 1, 0,
0,
      1,
      1, 1, 1, 0, 1, 0, 1, 1, 0, 1, 1, 1, 1, 1, 0, 0, 1, 0, 1, 0, 1,
1,
      1, 1, 1, 0, 1, 1, 0, 1, 0, 1, 0, 0, 1, 1, 1, 0, 1, 1, 1, 1, 1,
1,
      1, 1, 1, 1, 1, 0, 1, 0, 0, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1,
1,
      1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 0, 0, 0, 0, 0, 0, 1]),
'frame': None, 'target names': array(['malignant', 'benign'],
dtype='<U9'), 'DESCR': '... breast cancer dataset:\n\nBreast cancer</pre>
wisconsin (diagnostic) dataset\
                    -----\n\n**Data Set
Characteristics:**\n\n
                         :Number of Instances: 569\n\n
                                                        :Number of
Attributes: 30 numeric, predictive attributes and the class\n\
     :Attribute Information:\n - radius (mean of distances from
center to points on the perimeter)\n

    texture (standard

deviation of gray-scale values)\n
                                       - perimeter\n
                                                           - area\n
- smoothness (local variation in radius lengths)\n
compactness (perimeter^2 / area - 1.0)\n

    concavity (severity

of concave portions of the contour)\n - concave points (number
```

```
of concave portions of the contour)\n
                                       - symmetry\n
fractal dimension ("coastline approximation" - 1)\n\n
                                                           The mean,
standard error, and "worst" or largest (mean of the three\n
worst/largest values) of these features were computed for each image,\
         resulting in 30 features. For instance, field 0 is Mean
                      10 is Radius SE, field 20 is Worst Radius.\n\n
Radius, field\n
- class:\n
                         WDBC-Malignant\n
            :Summary Statistics:\n\n
Benign\n\n
Max\n
                                     6.981
radius (mean):
                                           28.11\n
                                                      texture
(mean):
                             9.71
                                    39.28\n
                                              perimeter (mean):
43.79 188.5\n
                 area (mean):
                                                      143.5 2501.0
                                          0.053 0.163\n
    smoothness (mean):
compactness (mean):
                                    0.019 0.345\n
                                                      concavity
                           0.0
(mean):
                                  0.427\n
                                            concave points (mean):
      0.201\n
                                                      0.106 0.304\n
0.0
                 symmetry (mean):
fractal dimension (mean):
                                     0.05
                                           0.097\n
                                                      radius
                              0.112 2.873\n
(standard error):
                                               texture (standard
                   0.36
                         4.885\n
error):
                                     perimeter (standard error):
0.757 21.98\n
                 area (standard error):
                                                      6.802 542.2\n
smoothness (standard error):
                                     0.002 0.031\n
                                                      compactness
                         0.002 \quad 0.135\n
(standard error):
                                          concavity (standard
error):
                 0.0
                        0.396\n
                                  concave points (standard error):
0.0
      0.053\n
                 symmetry (standard error):
                                                      0.008 \quad 0.079 \ n
fractal dimension (standard error):
                                    0.001 0.03\n
                                                     radius (worst):
      36.04\n
                 texture (worst):
                                                      12.02 49.54\n
                                     50.41 251.2\n
perimeter (worst):
                                                      area (worst):
185.2 4254.0\n
                  smoothness (worst):
                                                       0.071 \quad 0.223
                                         0.027 \quad 1.058\n
    compactness (worst):
                                                           concavity
(worst):
                           0.0
                                  1.252\n concave points (worst):
                 symmetry (worst):
       0.291\n
                                                      0.156 \quad 0.664 \ n
0.0
fractal dimension (worst):
                                     0.055 \quad 0.208\n
==========\n\n :Missing
Attribute Values: None\n\n :Class Distribution: 212 - Malignant,
357 - Benign\n\n :Creator: Dr. William H. Wolberg, W. Nick Street,
Olvi L. Mangasarian\n\n
                         :Donor: Nick Street\n\n
                                                    :Date: November,
1995\n\nThis is a copy of UCI ML Breast Cancer Wisconsin (Diagnostic)
datasets.\nhttps://goo.gl/U2Uwz2\n\nFeatures are computed from a
digitized image of a fine needle\naspirate (FNA) of a breast mass.
They describe\ncharacteristics of the cell nuclei present in the
image.\n\nSeparating plane described above was obtained using\
nMultisurface Method-Tree (MSM-T) [K. P. Bennett, "Decision Tree\
nConstruction Via Linear Programming." Proceedings of the 4th\nMidwest
Artificial Intelligence and Cognitive Science Society,\npp. 97-101,
1992], a classification method which uses linear\nprogramming to
construct a decision tree. Relevant features\nwere selected using an
exhaustive search in the space of 1-4\nfeatures and 1-3 separating
planes.\n\nThe actual linear program used to obtain the separating
```

```
plane\nin the 3-dimensional space is that described in:\n[K. P.
Bennett and O. L. Mangasarian: "Robust Linear\nProgramming
Discrimination of Two Linearly Inseparable Sets",\nOptimization
Methods and Software 1, 1992, 23-34].\n\nThis database is also
available through the UW CS ftp server:\n\nftp ftp.cs.wisc.edu\ncd
math-prog/cpo-dataset/machine-learn/WDBC/\n\n.. topic:: References\n\n
- W.N. Street, W.H. Wolberg and O.L. Mangasarian. Nuclear feature
                  for breast tumor diagnosis. IS&T/SPIE 1993
extraction \n
International Symposium on \n
                                   Electronic Imaging: Science and
Technology, volume 1905, pages 861-870,\n
                                               San Jose, CA, 1993.\n
- O.L. Mangasarian, W.N. Street and W.H. Wolberg. Breast cancer
diagnosis and \n
                     prognosis via linear programming. Operations
Research, 43(4), pages 570-577, \n
                                        July-August 1995.\n
Wolberg, W.N. Street, and O.L. Mangasarian. Machine learning
              to diagnose breast cancer from fine-needle aspirates. 77 (1994) \n 163-171.', 'feature_names':
techniques\n
Cancer Letters 77 (1994) \n
array(['mean radius', 'mean texture', 'mean perimeter', 'mean area',
       'mean smoothness', 'mean compactness', 'mean concavity',
       'mean concave points', 'mean symmetry', 'mean fractal
dimension',
       'radius error', 'texture error', 'perimeter error', 'area
error',
       'smoothness error', 'compactness error', 'concavity error',
       'concave points error', 'symmetry error'
       'fractal dimension error', 'worst radius', 'worst texture',
       'worst perimeter', 'worst area', 'worst smoothness',
       'worst compactness', 'worst concavity', 'worst concave points',
       'worst symmetry', 'worst fractal dimension'], dtype='<U23'),
'filename': 'breast cancer.csv', 'data_module':
'sklearn.datasets.data'}
# loading the data to a data frame
data frame = pd.DataFrame(breast cancer dataset.data, columns =
breast cancer dataset.feature names)
# print the first 5 rows of the dataframe
data frame.head()
   mean radius mean texture mean perimeter
                                               mean area
smoothness \
         17.99
                       10.38
                                       122.80
                                                  1001.0
0.11840
         20.57
                       17.77
                                       132.90
                                                  1326.0
0.08474
2
         19.69
                       21.25
                                       130.00
                                                  1203.0
0.10960
3
                       20.38
                                        77.58
                                                   386.1
         11.42
0.14250
         20.29
                       14.34
                                       135.10
                                                  1297.0
0.10030
```

```
mean compactness
                     mean concavity mean concave points
symmetry
            0.27760
                              0.3001
                                                  0.14710
0.2419
            0.07864
                              0.0869
                                                  0.07017
1
0.1812
                                                  0.12790
            0.15990
                              0.1974
0.2069
            0.28390
                              0.2414
                                                  0.10520
0.2597
            0.13280
                              0.1980
                                                  0.10430
0.1809
   mean fractal dimension ... worst radius worst texture worst
perimeter \
                  0.07871
                                        25.38
                                                        17.33
184.60
                  0.05667
                                        24.99
                                                        23.41
158.80
                                                        25.53
                  0.05999
                                        23.57
152.50
                  0.09744
                                        14.91
                                                        26.50
98.87
                  0.05883
                                                        16.67
                                        22.54
152.20
   worst area worst smoothness worst compactness worst concavity \
0
       2019.0
                          0.1622
                                             0.6656
                                                               0.7119
1
                                             0.1866
       1956.0
                          0.1238
                                                               0.2416
2
       1709.0
                          0.1444
                                             0.4245
                                                               0.4504
3
        567.7
                          0.2098
                                             0.8663
                                                               0.6869
4
       1575.0
                          0.1374
                                             0.2050
                                                               0.4000
  worst concave points worst symmetry worst fractal dimension
0
                 0.2654
                                  0.4601
                                                           0.11890
1
                 0.1860
                                  0.2750
                                                           0.08902
2
                 0.2430
                                  0.3613
                                                           0.08758
3
                 0.2575
                                  0.6638
                                                           0.17300
4
                 0.1625
                                  0.2364
                                                           0.07678
[5 rows x 30 columns]
# adding the 'target' column to the data frame
data frame['label'] = breast cancer dataset.target
# print last 5 rows of the dataframe
data frame.tail()
```

mean smoothness	radius	mean tex	ture	mean p	erimeter	mean area	mean
564	21.56	2	2.39		142.00	1479.0	
0.11100 565	20.13	2	8.25		131.20	1261.0	
0.09780 566	16.60	2	8.08		108.30	858.1	
0.08455 567	20.60	2	9.33		140.10	1265.0	
0.11780 568	7.76	2	4.54		47.92	181.0	
0.05263	, , , ,	_					
mean symmetry	compact:	ness mea	n con	cavity	mean con	cave point	s mean
564	•	1590	0	.24390		0.1389	0
0.1726 565	0.1	9340	0	.14400		0.0979	1
0.1752 566	0.1	9230	0	.09251		0.0530	2
0.1590 567	0.2	7700	0	.35140		0.1520	0
0.2397 568	0.0	4362	0	.00000		0.0000	0
0.1587							
mean worst area		dimensio	n	. wors	t texture	worst pe	rimeter
564 2027.0		0.0562	3		26.40		166.10
565		0.0553	3		38.25		155.00
1731.0 566		0.0564	8		34.12		126.70
1124.0 567		0.0701	6		39.42		184.60
1821.0 568		0.0588	4		30.37		59.16
268.6							
worst 564 565 566 567 568	0.1 0.1 0.1	ness wor 4100 1660 1390 5500 3996	st co	mpactne 0.211 0.192 0.309 0.868 0.064	.30 220 340 310	concavity 0.4107 0.3215 0.3403 0.9387 0.0000	
	concav		wors			t fractal	
label 564		0.2216		•	2060		0.07115
0				J.2			

```
565
                    0.1628
                                     0.2572
                                                              0.06637
0
566
                    0.1418
                                     0.2218
                                                              0.07820
0
567
                    0.2650
                                     0.4087
                                                              0.12400
568
                    0.0000
                                     0.2871
                                                              0.07039
1
[5 rows x 31 columns]
# number of rows and columns in the dataset
data frame.shape
(569, 31)
# getting some information about the data
data frame.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 569 entries, 0 to 568
Data columns (total 31 columns):
#
     Column
                               Non-Null Count
                                                Dtype
- - -
     -----
                                                - - - - -
 0
     mean radius
                               569 non-null
                                                float64
 1
                               569 non-null
                                                float64
     mean texture
 2
                                                float64
     mean perimeter
                               569 non-null
 3
                               569 non-null
                                                float64
     mean area
                                                float64
 4
                               569 non-null
     mean smoothness
 5
     mean compactness
                               569 non-null
                                                float64
                                                float64
 6
     mean concavity
                               569 non-null
 7
     mean concave points
                               569 non-null
                                                float64
 8
                                                float64
     mean symmetry
                               569 non-null
 9
                                                float64
     mean fractal dimension
                               569 non-null
 10
     radius error
                               569 non-null
                                                float64
                                                float64
 11
                               569 non-null
     texture error
 12
     perimeter error
                               569 non-null
                                                float64
 13
                               569 non-null
                                                float64
     area error
 14
    smoothness error
                               569 non-null
                                                float64
                               569 non-null
                                                float64
 15
     compactness error
                                                float64
                               569 non-null
 16
    concavity error
 17
     concave points error
                               569 non-null
                                                float64
                                                float64
 18
     symmetry error
                               569 non-null
                                                float64
 19
    fractal dimension error
                               569 non-null
 20 worst radius
                               569 non-null
                                                float64
                                                float64
 21 worst texture
                               569 non-null
                                                float64
 22
     worst perimeter
                               569 non-null
                                                float64
 23
                               569 non-null
    worst area
                                                float64
 24 worst smoothness
                               569 non-null
                               569 non-null
                                                float64
     worst compactness
```

```
569 non-null
                                               float64
 26 worst concavity
 27 worst concave points
                               569 non-null
                                               float64
28 worst symmetry
                               569 non-null
                                               float64
 29 worst fractal dimension
                              569 non-null
                                               float64
30 label
                               569 non-null
                                               int32
dtypes: float64(30), int32(1)
memory usage: 135.7 KB
# checking for missing values
data frame.isnull().sum()
mean radius
                            0
                            0
mean texture
                            0
mean perimeter
mean area
                            0
mean smoothness
                            0
                            0
mean compactness
mean concavity
                            0
mean concave points
                            0
                            0
mean symmetry
mean fractal dimension
                            0
                            0
radius error
texture error
                            0
                            0
perimeter error
                            0
area error
                            0
smoothness error
                            0
compactness error
concavity error
                            0
concave points error
symmetry error
                            0
fractal dimension error
worst radius
                            0
                            0
worst texture
worst perimeter
                            0
worst area
                            0
                            0
worst smoothness
worst compactness
                            0
                            0
worst concavity
                            0
worst concave points
                            0
worst symmetry
worst fractal dimension
                            0
label
                            0
dtype: int64
# statistical measures about the data
data frame.describe()
       mean radius
                   mean texture
                                   mean perimeter
                                                     mean area \
        569,000000
                      569,000000
                                       569.000000
                                                    569,000000
count
mean
         14.127292
                       19.289649
                                        91.969033
                                                    654.889104
```

min 6 25% 11 50% 13 75% 15	.370000 .780000	9.710000 43 16.170000 75 18.840000 86 21.800000 104	351.914129 1.790000 143.500000 1.170000 420.300000 1.240000 551.100000 1.100000 782.700000 1.500000 2501.000000
mean points \ count 569.000000 mean 0.048919 std 0.038803 min 0.000000 25% 0.020310 50% 0.033500 75% 0.074000 max 0.201200	smoothness 569.000000 0.096360 0.014064 0.052630 0.086370 0.095870 0.105300 0.163400	mean compactness 569.000000 0.104341 0.052813 0.019380 0.064920 0.092630 0.130400 0.345400	mean concavity mean concave 569.000000 0.088799 0.079720 0.0000000 0.029560 0.061540 0.130700 0.426800
mean count 5 mean std min 25% 50% 75% max	69.000000 0.181162 0.027414 0.106000 0.161900 0.179200 0.195700 0.304000 t perimeter	ean fractal dimens 569.000 0.062 0.007 0.049 0.057 0.061 0.066 0.097 worst area wors 569.000000 880.583128 569.356993 185.200000 515.300000 686.500000	1000 569.000000 1798 25.677223 1060 6.146258 1960 12.020000 1700 21.080000 1540 25.410000 120 29.720000 440 49.540000

```
75%
            125.400000
                         1084.000000
                                               0.146000
0.339100
            251.200000
                         4254.000000
                                               0.222600
max
1.058000
       worst concavity
                         worst concave points
                                                worst symmetry \
            569.000000
                                    569.000000
                                                     569.000000
count
                                                       0.290076
mean
              0.272188
                                      0.114606
              0.208624
                                      0.065732
                                                       0.061867
std
                                      0.000000
                                                       0.156500
min
              0.00000
25%
              0.114500
                                      0.064930
                                                       0.250400
50%
                                      0.099930
              0.226700
                                                       0.282200
                                                       0.317900
75%
              0.382900
                                      0.161400
              1.252000
                                      0.291000
                                                       0.663800
max
       worst fractal dimension
                                       label
                     569.000000
                                  569.000000
count
                       0.083946
                                    0.627417
mean
                       0.018061
std
                                    0.483918
                       0.055040
                                    0.000000
min
25%
                       0.071460
                                    0.000000
                                    1.000000
50%
                       0.080040
75%
                       0.092080
                                    1.000000
                       0.207500
                                    1.000000
max
[8 rows x 31 columns]
# checking the distribution of Target Varibale
data frame['label'].value counts()
1
     357
0
     212
Name: label, dtype: int64
```

1--> Benign

0 --> Malignant

```
data frame.groupby('label').mean()
       mean radius mean texture mean perimeter
                                                   mean area
                                                              mean
smoothness \
label
                       21.604906
                                      115.365377 978.376415
         17.462830
0.102898
         12.146524
                       17.914762
                                       78.075406
                                                  462.790196
0.092478
      mean compactness mean concavity mean concave points
```

```
symmetry \
label
               0.145188
                               0.160775
                                                     0.087990
0.192909
               0.080085
                               0.046058
                                                     0.025717
0.174186
       mean fractal dimension
                                    worst radius worst texture \
label
0
                     0.062680
                                       21.134811
                                                       29.318208
1
                     0.062867
                                       13.379801
                                                       23.515070
       worst perimeter worst area worst smoothness worst
compactness \
label
            141.370330 1422.286321
                                             0.144845
0.374824
             87.005938
                         558.899440
                                              0.124959
0.182673
       worst concavity worst concave points worst symmetry \
label
0
              0.450606
                                    0.182237
                                                     0.323468
1
              0.166238
                                    0.074444
                                                     0.270246
       worst fractal dimension
label
                      0.091530
0
                      0.079442
1
[2 rows x 30 columns]
```

Separating the features and target

```
X = data frame.drop(columns='label', axis=1)
Y = data frame['label']
print(X)
     mean radius mean texture mean perimeter mean area mean
smoothness
           17.99
                         10.38
                                                    1001.0
                                         122.80
0.11840
           20.57
                         17.77
                                         132.90
                                                    1326.0
0.08474
           19.69
                         21.25
                                         130.00
                                                    1203.0
0.10960
           11.42
                         20.38
                                          77.58
                                                     386.1
```

0.14250					
4	20.29	14.34	135.10	1297.0	
0.10030					
	• • •		•••		
564	21.56	22.39	142.00	1479.0	
0.11100					
565	20.13	28.25	131.20	1261.0	
0.09780 566	16.60	28.08	108.30	858.1	
0.08455	10.00	20.00	100.50	050.1	
567	20.60	29.33	140.10	1265.0	
0.11780					
568	7.76	24.54	47.92	181.0	
0.05263					
mean symmetry	compactness	mean concavi	ty mean cond	cave points	mean
0	0.27760	0.300	10	0.14710	
0.2419	0 07064	0 006	00	0 07017	
1 0.1812	0.07864	0.086	90	0.07017	
2	0.15990	0.197	40	0.12790	
0.2069					
3	0.28390	0.241	40	0.10520	
0.2597 4	0.13280	0.198	00	0.10430	
0.1809	0.13280	0.190	00	0.10430	
564	0.11590	0.243	90	0.13890	
0.1726 565	0.10340	0.144	00	0.09791	
0.1752	0110310	01111		0.03731	
566	0.10230	0.092	51	0.05302	
0.1590	0 07700	0.051	4.0	0 15000	
567 0.2397	0.27700	0.351	40	0.15200	
568	0.04362	0.000	00	0.00000	
0.1587	0101302	0.000		0.00000	
	fractal dime		orst radius	worst textur	-
0		97871 95667	25.380 24.990	17.3 23.4	
1 2 3 4		95999	23.570	25.5	
3	0.0	99744	14.910	26.5	9
4	0.0	95883	22.540	16.6	7
 564	0.4	95623	25.450	26.4	
504	0.0	95023	25.450	20.4	U

565 566 567 568		0 0	.05533 .05648 .07016 .05884	23.690 18.980 25.740 9.456	34 39	. 25 . 12 . 42 . 37
	worst	perimeter	worst area	worst smooth	ness worst	compactness
0		184.60	2019.0	0.1	.6220	0.66560
1		158.80	1956.0	0.1	.2380	0.18660
2		152.50	1709.0	0.1	.4440	0.42450
3		98.87	567.7	0.2	0980	0.86630
4		152.20	1575.0	0.1	.3740	0.20500
564		166.10	2027.0	0.1	4100	0.21130
565		155.00	1731.0	0.1	.1660	0.19220
566		126.70	1124.0	0.1	.1390	0.30940
567		184.60	1821.0	0.1	.6500	0.86810
568		59.16	268.6	0.0	8996	0.06444
0 1 2 3 4 564 565 566 567 568	worst	concavity 0.7119 0.2416 0.4504 0.6869 0.4000 0.4107 0.3215 0.3403 0.9387 0.0000	worst concav	e points wo 0.2654 0.1860 0.2430 0.2575 0.1625 0.2216 0.1628 0.1418 0.2650 0.0000	0.4601 0.2750 0.3613 0.6638 0.2364 0.2060 0.2572 0.2218 0.4087 0.2871	
0 1 2 3 4 564	worst		mension 0.11890 0.08902 0.08758 0.17300 0.07678 			

```
565
                       0.06637
566
                       0.07820
567
                       0.12400
568
                       0.07039
[569 rows x 30 columns]
print(Y)
0
       0
1
        0
2
        0
3
       0
4
       0
564
       0
565
       0
566
       0
567
       0
568
Name: label, Length: 569, dtype: int32
```

Splitting the data into training data & Testing data

```
X_train, X_test, Y_train, Y_test = train_test_split(X, Y,
test_size=0.2, random_state=2)
print(X.shape, X_train.shape, X_test.shape)
(569, 30) (455, 30) (114, 30)
```

Model Training

Logistic Regression

```
model = LogisticRegression()
# training the Logistic Regression model using Training data
model.fit(X_train, Y_train)
C:\Users\kruti\anaconda3\envs\Tensorflow\lib\site-packages\sklearn\
linear_model\_logistic.py:460: ConvergenceWarning: 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(
LogisticRegression()
```

Model Evaluation

Accuracy Score

```
# accuracy on training data
X_train_prediction = model.predict(X_train)
training_data_accuracy = accuracy_score(Y_train, X_train_prediction)
print('Accuracy on training data = ', training_data_accuracy)
Accuracy on training data = 0.945054945054945

# accuracy on test data
X_test_prediction = model.predict(X_test)
test_data_accuracy = accuracy_score(Y_test, X_test_prediction)
print('Accuracy on test data = ', test_data_accuracy)
Accuracy on test data = 0.9210526315789473
```

Building a Predictive System

```
input data =
(13.54, 14.36, 87.46, 566.3, 0.09779, 0.08129, 0.06664, 0.04781, 0.1885, 0.0576
6,0.2699,0.7886,2.058,23.56,0.008462,0.0146,0.02387,0.01315,0.0198,0.0
023, 15, 11, 19, 26, 99, 7, 711, 2, 0, 144, 0, 1773, 0, 239, 0, 1288, 0, 2977, 0, 07259)
# change the input data to a numpy array
input data as numpy array = np.asarray(input data)
# reshape the numpy array as we are predicting for one datapoint
input data reshaped = input data as numpy array.reshape(1,-1)
prediction = model.predict(input data reshaped)
print(prediction)
if (prediction[0] == 0):
  print('The Breast cancer is Malignant')
else:
  print('The Breast Cancer is Benign')
[1]
The Breast Cancer is Benign
```

C:\Users\kruti\anaconda3\envs\Tensorflow\lib\site-packages\sklearn\
base.py:464: UserWarning: X does not have valid feature names, but
LogisticRegression was fitted with feature names
 warnings.warn(