

dl-ex-2

March 8, 2023

```
[3]: # importing packages
import numpy as np # linear algebra
import pandas as pd # data processing, CSV file I/O (e.g. pd.read_csv)
import sklearn.datasets
```

```
[49]: # reading Breast Cancer Dataset
breast_cancer = sklearn.datasets.load_breast_cancer()
```

```
[5]: x = breast_cancer.data
y = breast_cancer.target
```

```
[50]: print(x)
```

```
[0 1 0 1 0 0 0 0 0 1 1 1 1 1 1 1 1 1 1 1 0 1 0 1 0 0 0 0 0 0]
```

```
[51]: print(y)
```

```
1
```

```
[52]: data = pd.DataFrame(breast_cancer.data, columns=breast_cancer.feature_names)
```

```
[9]: c=breast_cancer.feature_names
c.shape
```

```
[9]: (30,)
```

```
[53]: data['class'] = breast_cancer.target
```

```
[11]: data.describe()
```

```
[11]:    mean radius  mean texture  mean perimeter  mean area \
count    569.000000    569.000000    569.000000    569.000000
mean     14.127292    19.289649    91.969033   654.889104
std      3.524049     4.301036    24.298981   351.914129
min      6.981000     9.710000    43.790000   143.500000
25%     11.700000    16.170000    75.170000   420.300000
50%     13.370000    18.840000    86.240000   551.100000
75%     15.780000    21.800000   104.100000  782.700000
```

| | | | | | | | | |
|-------|-------------------------|------------------------|------------------|---------------------|---|--|--|--|
| max | 28.110000 | 39.280000 | 188.500000 | 2501.000000 | | | | |
| count | mean smoothness | mean compactness | mean concavity | mean concave points | \ | | | |
| mean | 569.000000 | 569.000000 | 569.000000 | 569.000000 | | | | |
| std | 0.096360 | 0.104341 | 0.088799 | 0.048919 | | | | |
| min | 0.014064 | 0.052813 | 0.079720 | 0.038803 | | | | |
| 25% | 0.052630 | 0.019380 | 0.000000 | 0.000000 | | | | |
| 50% | 0.086370 | 0.064920 | 0.029560 | 0.020310 | | | | |
| 75% | 0.095870 | 0.092630 | 0.061540 | 0.033500 | | | | |
| max | 0.105300 | 0.130400 | 0.130700 | 0.074000 | | | | |
| | 0.163400 | 0.345400 | 0.426800 | 0.201200 | | | | |
| count | mean symmetry | mean fractal dimension | ... | worst texture | \ | | | |
| mean | 569.000000 | 569.000000 | ... | 569.000000 | | | | |
| std | 0.181162 | 0.062798 | ... | 25.677223 | | | | |
| min | 0.027414 | 0.007060 | ... | 6.146258 | | | | |
| 25% | 0.106000 | 0.049960 | ... | 12.020000 | | | | |
| 50% | 0.161900 | 0.057700 | ... | 21.080000 | | | | |
| 75% | 0.179200 | 0.061540 | ... | 25.410000 | | | | |
| max | 0.195700 | 0.066120 | ... | 29.720000 | | | | |
| | 0.304000 | 0.097440 | ... | 49.540000 | | | | |
| count | worst perimeter | worst area | worst smoothness | worst compactness | \ | | | |
| mean | 569.000000 | 569.000000 | 569.000000 | 569.000000 | | | | |
| std | 107.261213 | 880.583128 | 0.132369 | 0.254265 | | | | |
| min | 33.602542 | 569.356993 | 0.022832 | 0.157336 | | | | |
| 25% | 50.410000 | 185.200000 | 0.071170 | 0.027290 | | | | |
| 50% | 84.110000 | 515.300000 | 0.116600 | 0.147200 | | | | |
| 75% | 97.660000 | 686.500000 | 0.131300 | 0.211900 | | | | |
| max | 125.400000 | 1084.000000 | 0.146000 | 0.339100 | | | | |
| | 251.200000 | 4254.000000 | 0.222600 | 1.058000 | | | | |
| count | worst concavity | worst concave points | worst symmetry | \ | | | | |
| mean | 569.000000 | 569.000000 | 569.000000 | | | | | |
| std | 0.272188 | 0.114606 | 0.290076 | | | | | |
| min | 0.208624 | 0.065732 | 0.061867 | | | | | |
| 25% | 0.000000 | 0.000000 | 0.156500 | | | | | |
| 50% | 0.114500 | 0.064930 | 0.250400 | | | | | |
| 75% | 0.226700 | 0.099930 | 0.282200 | | | | | |
| max | 0.382900 | 0.161400 | 0.317900 | | | | | |
| | 1.252000 | 0.291000 | 0.663800 | | | | | |
| count | worst fractal dimension | class | | | | | | |
| mean | 569.000000 | 569.000000 | | | | | | |
| std | 0.083946 | 0.627417 | | | | | | |
| min | 0.018061 | 0.483918 | | | | | | |
| | 0.055040 | 0.000000 | | | | | | |

```
25%          0.071460    0.000000
50%          0.080040    1.000000
75%          0.092080    1.000000
max          0.207500    1.000000
```

[8 rows x 31 columns]

```
[12]: print(data['class'].value_counts())
```

```
1    357
0    212
Name: class, dtype: int64
```

```
[13]: print(breast_cancer.target_names)
```

['malignant' 'benign']

```
[14]: data.groupby('class').mean()
```

```
mean radius  mean texture  mean perimeter  mean area  mean smoothness \
class
0          17.462830    21.604906    115.365377   978.376415      0.102898
1          12.146524    17.914762     78.075406   462.790196      0.092478

mean compactness  mean concavity  mean concave points  mean symmetry \
class
0            0.145188      0.160775      0.087990      0.192909
1            0.080085      0.046058      0.025717      0.174186

mean fractal dimension  ...  worst radius  worst texture \
class
0                  0.062680  ...        21.134811    29.318208
1                  0.062867  ...        13.379801    23.515070

worst perimeter  worst area  worst smoothness  worst compactness \
class
0          141.370330  1422.286321      0.144845      0.374824
1          87.005938   558.899440      0.124959      0.182673

worst concavity  worst concave points  worst symmetry \
class
0            0.450606      0.182237      0.323468
1            0.166238      0.074444      0.270246

worst fractal dimension
class
0            0.091530
```

```

1          0.079442

[2 rows x 30 columns]

[15]: from sklearn.model_selection import train_test_split

[54]: x = data.drop('class', axis=1)
y=data['class']

[17]: type(x)

[17]: pandas.core.frame.DataFrame

[18]: X_train, X_test, Y_train, Y_test = train_test_split(x, y, test_size=0.1)

[19]: print(x.shape, X_train.shape, X_test.shape)

(569, 30) (512, 30) (57, 30)

[20]: print(y.shape, Y_train.shape, Y_test.shape)

(569,) (512,) (57,)

[21]: print(y.mean(), Y_train.mean(), Y_test.mean())

0.6274165202108963 0.626953125 0.631578947368421

[22]: X_train, X_test, Y_train, Y_test = train_test_split(x, y, test_size=0.1,
   ↴stratify = y)

[23]: print(y.mean(), Y_train.mean(), Y_test.mean()) # now ratio is maintained of
   ↴malignant and benign

0.6274165202108963 0.626953125 0.631578947368421

[24]: print(x.mean(), X_train.mean(), X_test.mean())

mean radius           14.127292
mean texture          19.289649
mean perimeter        91.969033
mean area             654.889104
mean smoothness       0.096360
mean compactness      0.104341
mean concavity        0.088799
mean concave points  0.048919
mean symmetry         0.181162
mean fractal dimension 0.062798
radius error          0.405172

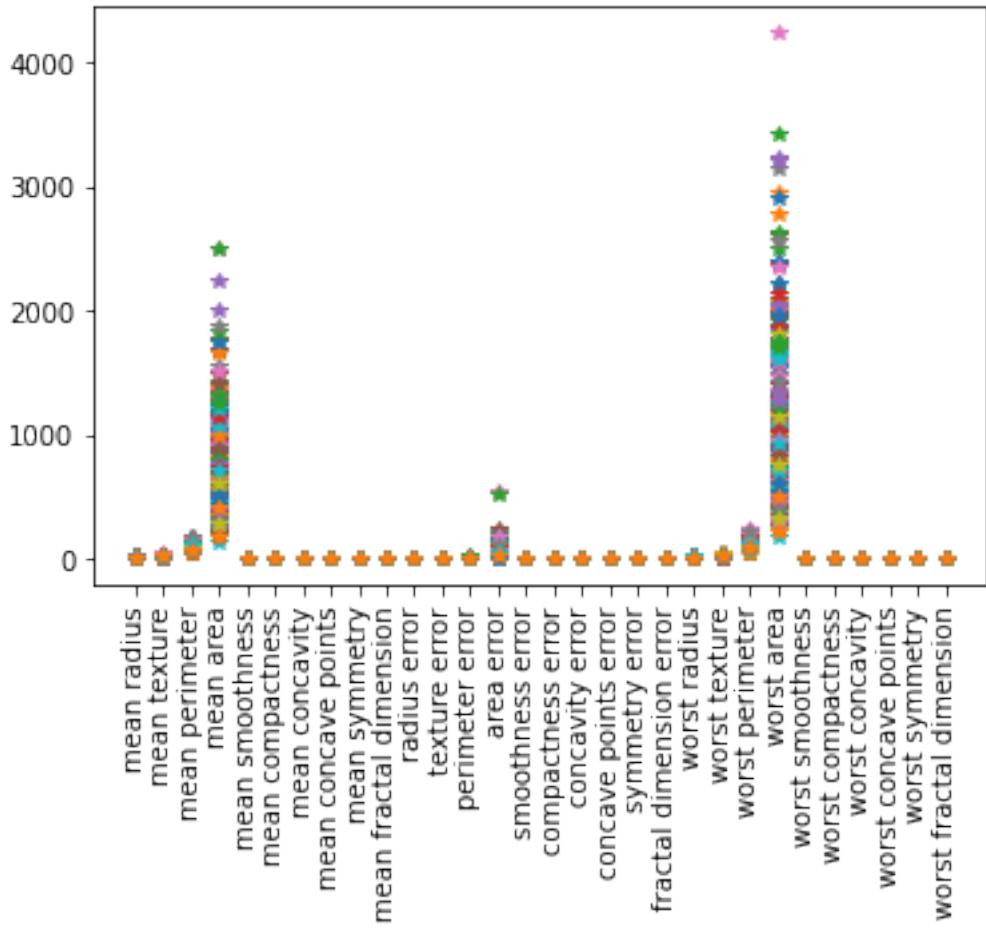
```

| | |
|----------------------------|------------|
| texture error | 1.216853 |
| perimeter error | 2.866059 |
| area error | 40.337079 |
| smoothness error | 0.007041 |
| compactness error | 0.025478 |
| concavity error | 0.031894 |
| concave points error | 0.011796 |
| symmetry error | 0.020542 |
| fractal dimension error | 0.003795 |
| worst radius | 16.269190 |
| worst texture | 25.677223 |
| worst perimeter | 107.261213 |
| worst area | 880.583128 |
| worst smoothness | 0.132369 |
| worst compactness | 0.254265 |
| worst concavity | 0.272188 |
| worst concave points | 0.114606 |
| worst symmetry | 0.290076 |
| worst fractal dimension | 0.083946 |
| dtype: float64 mean radius | 14.148947 |
| mean texture | 19.260781 |
| mean perimeter | 92.144883 |
| mean area | 657.147461 |
| mean smoothness | 0.096602 |
| mean compactness | 0.105335 |
| mean concavity | 0.089602 |
| mean concave points | 0.049290 |
| mean symmetry | 0.181593 |
| mean fractal dimension | 0.062894 |
| radius error | 0.407755 |
| texture error | 1.213243 |
| perimeter error | 2.883710 |
| area error | 40.726930 |
| smoothness error | 0.007019 |
| compactness error | 0.025872 |
| concavity error | 0.032301 |
| concave points error | 0.011803 |
| symmetry error | 0.020651 |
| fractal dimension error | 0.003822 |
| worst radius | 16.296998 |
| worst texture | 25.622910 |
| worst perimeter | 107.482012 |
| worst area | 883.696680 |
| worst smoothness | 0.132448 |
| worst compactness | 0.255780 |
| worst concavity | 0.273197 |
| worst concave points | 0.114995 |
| worst symmetry | 0.290359 |

```
worst fractal dimension      0.084003
dtype: float64 mean radius          13.932772
mean texture                 19.548947
mean perimeter                90.389474
mean area                     634.603509
mean smoothness                0.094188
mean compactness                0.095414
mean concavity                  0.081590
mean concave points            0.045589
mean symmetry                   0.177286
mean fractal dimension         0.061932
radius error                    0.381972
texture error                   1.249286
perimeter error                 2.707509
area error                      36.835263
smoothness error                 0.007238
compactness error                 0.021943
concavity error                  0.028233
concave points error             0.011738
symmetry error                   0.019563
fractal dimension error          0.003551
worst radius                     16.019404
worst texture                    26.165088
worst perimeter                  105.277895
worst area                       852.615789
worst smoothness                  0.131656
worst compactness                  0.240655
worst concavity                   0.263127
worst concave points              0.111118
worst symmetry                     0.287530
worst fractal dimension           0.083433
dtype: float64
```

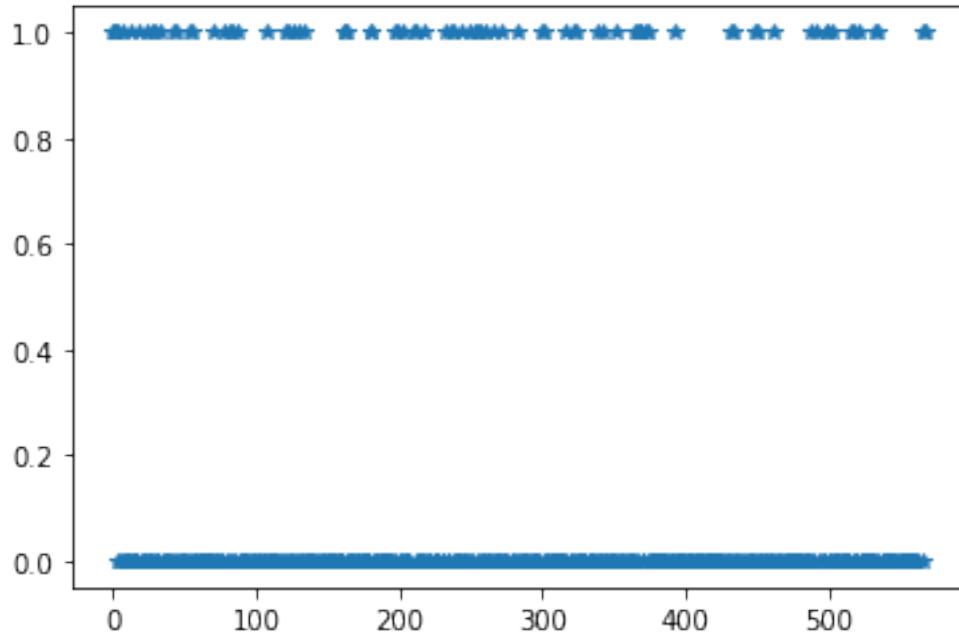
```
[25]: import matplotlib.pyplot as plt
```

```
[26]: plt.plot(X_train.T, '*')
plt.xticks(rotation='vertical')
plt.show()
```

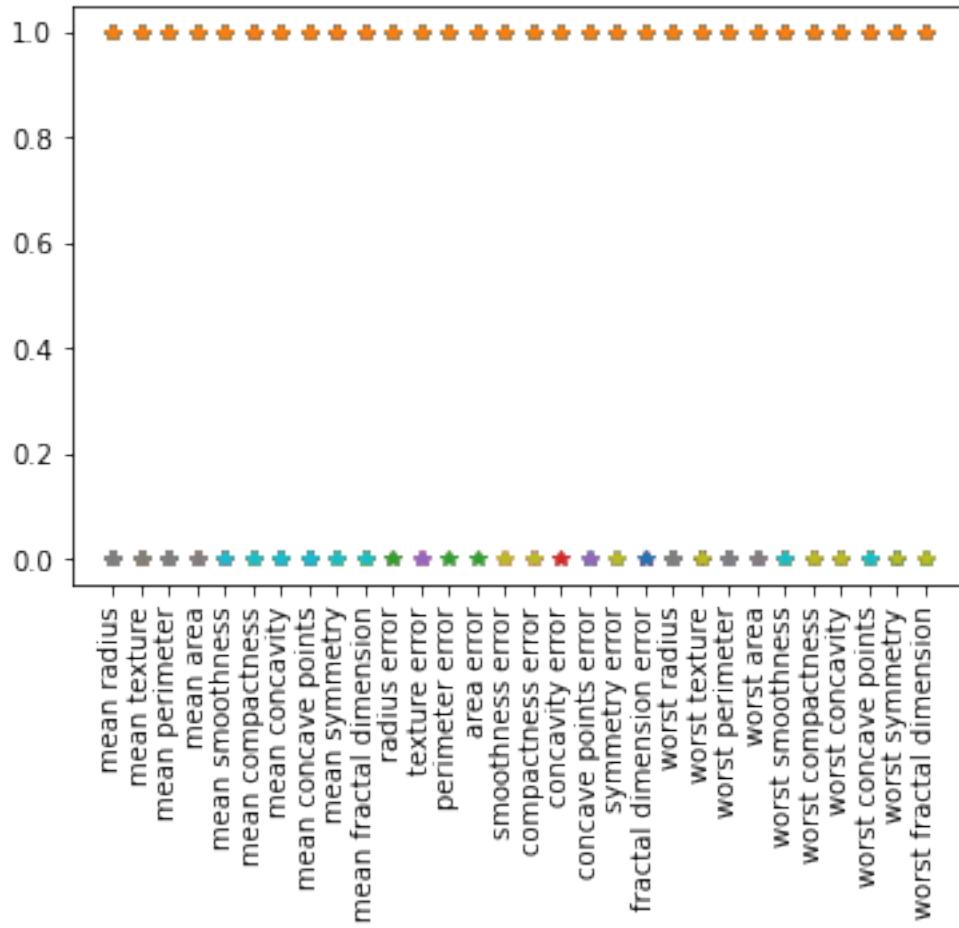


```
[28]: x_binarised_3_train = X_train['mean area'].map(lambda x: 0 if x < 1000 else 1)
#x_binarised_3_train
plt.plot(x_binarised_3_train, '*')
```

```
[28]: [<matplotlib.lines.Line2D at 0x7ff1f9cf60a0>]
```



```
[30]: x_binarised_train = X_train.apply(pd.cut, bins=2, labels=[1,0])
#x_binarised_train
plt.plot(x_binarised_train.T, '*')
plt.xticks(rotation='vertical')
plt.show()
```



```
[32]: x_binarised_test = X_test.apply(pd.cut, bins=2, labels=[1,0])
#x_binarised_test
type(x_binarised_test)
```

[32]: pandas.core.frame.DataFrame

```
[33]: x_binarised_test = x_binarised_test.values
x_binarised_train = x_binarised_train.values
x_binarised_train
x_binarised_test
```

```
[33]: array([[1, 1, 1, ..., 1, 1, 1],
       [1, 1, 1, ..., 1, 1, 1],
       [0, 1, 0, ..., 0, 1, 1],
       ...,
       [1, 1, 1, ..., 1, 1, 1],
       [1, 0, 1, ..., 1, 1, 1],
       [0, 1, 0, ..., 0, 0, 0]], dtype=object)
```

```
[34]: type(x_binarised_train)
```

```
[34]: numpy.ndarray
```

MP Neuron Model

```
[35]: from random import randint
```

```
[40]: b = 3
```

```
i = randint(0, x_binarised_train.shape[0])

print("For row", i)

if (np.sum(x_binarised_train[100, :]) >= b):
    print("MP Neuron inference is malignant")
else:
    print("MP Neuron inference is benign")

if (Y_train[i] == 1):
    print("Ground Truth is malignant")
else:
    print("Ground truth is benign")
```

For row 38

MP Neuron inference is malignant

Ground truth is benign

```
[41]: b = 3
```

```
Y_pred_train = []
accurate_rows = 0

for x, y in zip(x_binarised_train, Y_train):
    y_pred = (np.sum(x) >= b)
    Y_pred_train.append(y_pred)
    accurate_rows += (y == y_pred)

print(accurate_rows, accurate_rows/x_binarised_train.shape[0])
```

321 0.626953125

```
[42]: for b in range(x_binarised_train.shape[1] + 1):
    Y_pred_train = []
    accurate_rows = 0
```

```
for x, y in zip(x_binarised_train, Y_train):
    y_pred = (np.sum(x) >= b)
```

```

    Y_pred_train.append(y_pred)
    accurate_rows += (y == y_pred)

print(b, accurate_rows, accurate_rows/x_binarised_train.shape[0])

```

```

0 321 0.626953125
1 321 0.626953125
2 321 0.626953125
3 321 0.626953125
4 321 0.626953125
5 321 0.626953125
6 321 0.626953125
7 321 0.626953125
8 321 0.626953125
9 321 0.626953125
10 321 0.626953125
11 321 0.626953125
12 321 0.626953125
13 321 0.626953125
14 324 0.6328125
15 326 0.63671875
16 330 0.64453125
17 335 0.654296875
18 337 0.658203125
19 341 0.666015625
20 345 0.673828125
21 354 0.69140625
22 362 0.70703125
23 372 0.7265625
24 392 0.765625
25 407 0.794921875
26 422 0.82421875
27 436 0.8515625
28 435 0.849609375
29 426 0.83203125
30 399 0.779296875

```

[43]: `from sklearn.metrics import accuracy_score`

[44]: `b = 28`

```

Y_pred_test = []

for x in x_binarised_test:
    y_pred = (np.sum(x) >= b)
    Y_pred_test.append(y_pred)

```

```
accuracy = accuracy_score(Y_pred_test, Y_test)
print(b,accuracy)
```

28 0.5614035087719298

MP Neuron Class

```
[45]: class MPNeuron:

    def __init__(self):
        self.b = None

    def model(self, x):
        return(sum(x) >= self.b)

    def predict(self, X):
        Y = []
        for x in X:
            result = self.model(x)
            Y.append(result)
        return np.array(Y)

    def fit(self, X, Y):
        accuracy = {}

        for b in range(X.shape[1] + 1):
            self.b = b
            Y_pred = self.predict(X)
            accuracy[b] = accuracy_score(Y_pred, Y)

        best_b = max(accuracy, key = accuracy.get)
        self.b = best_b

        print('Optimal Value of is', best_b)
        print('Highest accuracy is', accuracy[best_b])
```

```
[46]: mp_neuron = MPNeuron()
mp_neuron.fit(x_binarised_train, Y_train)
```

Optimal Value of is 27
Highest accuracy is 0.8515625

```
[47]: Y_test_pred = mp_neuron.predict(x_binarised_test)
accuracy_test = accuracy_score(Y_test_pred, Y_test)
```

```
[48]: print(accuracy_test)
```

0.631578947368421