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```
import pandas as pd
import numpy as np
import seaborn as sns
import matplotlib.pyplot as plt

df = pd.read_csv('breast_cancer_Data.csv')
df.head()
```

	id	diagnosis	Radius_mean	Texture_mean	perimeter_mean	area_mean	smoo	
0	842302	М	17.99	10.38	122.80	1001.0		
1	842517	M	20.57	21.77	132.90	1326.0		
2	84300903	M	19.69	21.25	130.00	1203.0		
3	84348301	M	11.42	20.38	77.58	386.1		
4	84358402	M	20.29	14.34	135.10	1297.0		
5 rows × 32 columns								

1

df.describe()

```
id Radius_mean Texture_mean perimeter_mean
                                                                  area_mean smooth
count 5.690000e+02
                      569.000000
                                    569.000000
                                                     569.000000
                                                                  569.000000
mean 3.037183e+07
                       14.127292
                                     19.296678
                                                      91.969033
                                                                  654.889104
 std
      1.250206e+08
                        3.524049
                                      4.301816
                                                      24.298981
                                                                  351.914129
      8.670000e+03
                        6.981000
                                      9.710000
                                                      43.790000
                                                                  143.500000
min
25%
      8.692180e+05
                       11.700000
                                     16.170000
                                                      75.170000
                                                                  420.300000
      9.060240e+05
                       13.370000
                                     18.870000
                                                      86.240000
                                                                  551.100000
50%
75%
      8.813129e+06
                       15.780000
                                     21.800000
                                                     104.100000
                                                                  782.700000
      9.113205e+08
                       28.110000
                                     39.280000
                                                     188.500000 2501.000000
```

8 rows × 31 columns



df.shape (569, 32)

Drop Null Values

Count total NaN at each column in a DataFrame:

```
0
diagnosis
                             0
Radius_mean
                             0
Texture_mean
                             0
perimeter_mean
                             0
area_mean
                             0
smoothness_mean
                             0
                             0
compactness_mean
concavity_mean
                             0
concave points_mean
                             0
symmetry_mean
\frac{-}{\text{fractal\_dimension\_mean}}
```

```
radius_se
                                  0
texture_se
perimeter_se
area_se
smoothness_se 0
compactness_se 0
concavity_se 0
concave points_se 0
symmetry_se 0
fractal_dimension_se 0
radius_worst 0
radius_worst
                                 0
texture_worst
perimeter_worst
texture_worst
area_worst
smoothness_worst
compactness_worst
concavity_worst
                                 0
concave points_worst 0
symmetry_worst 0
fractal_dimension_worst 0
dtype: int64
(569, 32)
```

No Null values

Drop Duplicated Values

No duplicates

```
plt.figure(figsize=(25,20))
sns.heatmap(data=df.corr(), annot=True)
```

id -	- 1	0.075	0.099	0.073	0.097	-0.013	9.6e-05	0.05	0.044
Radius_mean -	0.075	1	0.33	1	0.99	0.17	0.51	0.68	0.82
Texture_mean -	0.099	0.33	1	0.33	0.32	-0.025	0.24	0.3	0.29
perimeter_mean -	0.073	1	0.33	1	0.99	0.21	0.56	0.72	0.85
area_mean -	0.097	0.99	0.32	0.99	1	0.18	0.5	0.69	0.82
smoothness_mean -	-0.013	0.17	-0.025	0.21	0.18	1	0.66	0.52	0.55
compactness_mean -	9.6e-05	0.51	0.24	0.56	0.5	0.66	1	0.88	0.83
concavity_mean -	0.05	0.68	0.3	0.72	0.69	0.52	0.88	1	0.92
concave points_mean -	0.044	0.82	0.29	0.85	0.82	0.55	0.83	0.92	1
symmetry_mean -	-0.022	0.15	0.071	0.18	0.15	0.56	0.6	0.5	0.46
fractal_dimension_mean -	-0.053	-0.31	-0.078	-0.26	-0.28	0.58	0.57	0.34	0.17
radius_se -	0.14	0.68	0.28	0.69	0.73	0.3	0.5	0.63	0.7
texture_se -	-0.0075	-0.097	0.38	-0.087	-0.066	0.068	0.046	0.076	0.021
perimeter_se -	0.14	0.67	0.28	0.69	0.73	0.3	0.55	0.66	0.71
area_se -	0.18	0.74	0.26	0.74	0.8	0.25	0.46	0.62	0.69
smoothness_se -	0.097	-0.22	0.0056	-0.2	-0.17	0.33	0.14	0.099	0.028
compactness_se -	0.034	0.21	0.19	0.25	0.21	0.32	0.74	0.67	0.49
concavity_se -	0.055	0.19	0.14	0.23	0.21	0.25	0.57	0.69	0.44
concave points_se -	0.079	0.38	0.16	0.41	0.37	0.38	0.64	0.68	0.62

Convert the diagnosis into 0 and 1

(569, 29)

	9	1	2	3	4	
count	5.690000e+02	5.690000e+02	5.690000e+02	5.690000e+02	5.690000e+02	5.69
mean	-1.373633e-16	-3.434082e-17	-1.248757e-16	-2.185325e-16	-8.366672e-16	1.8
std	1.000880e+00	1.000880e+00	1.000880e+00	1.000880e+00	1.000880e+00	1.00
min	-2.029648e+00	-2.230480e+00	-1.984504e+00	-1.454443e+00	-3.112085e+00	-1.61
25%	-6.893853e-01	-7.274670e-01	-6.919555e-01	-6.671955e-01	-7.109628e-01	-7.4
50%	-2.150816e-01	-9.927291e-02	-2.359800e-01	-2.951869e-01	-3.489108e-02	-2.2
75%	4.693926e-01	5.824340e-01	4.996769e-01	3.635073e-01	6.361990e-01	4.9
max	3.971288e+00	4.649409e+00	3.976130e+00	5.250529e+00	4.770911e+00	4.56

8 rows × 29 columns



```
from sklearn.model_selection import GridSearchCV, KFold
from keras.models import Sequential
from keras.layers import Dense
from keras.wrappers.scikit_learn import KerasClassifier
from tensorflow.keras.optimizers import Adam
```

Build a neural network with 29 input layer, 16 neuron on the first hidden layer, another hidden layer with 8 neurons, and 1 output. All using relu activation function

```
# Define a random seed
seed = 6
np.random.seed(seed)
# Start defining the model
def create_model():
    # create model
    model = Sequential()
   model.add(Dense(16, input_dim = 29, kernel_initializer='normal', activation='relu'))
    model.add(Dense(8, kernel_initializer='normal', activation='relu'))
    model.add(Dense(1, activation='sigmoid'))
    # compile the model
    adam = Adam(lr = 0.01)
    model.compile(loss = 'binary_crossentropy', optimizer = adam, metrics = ['accuracy'])
    return model
# create the model
model = KerasClassifier(build_fn = create_model, verbose = 1)
# define the grid search parameters
batch_size = [10, 20, 40]
epochs = [10, 50, 100]
# make a dictionary of the grid search parameters
param_grid = dict(batch_size=batch_size, epochs=epochs)
```

```
# build and fit the GridSearchCV
grid = GridSearchCV(estimator = model, param_grid = param_grid, cv = KFold(random_state=None), verbose = 10)
grid results = grid.fit(X standardized, y)
# summarize the results
print("Best: {0}, using {1}".format(grid_results.best_score_, grid_results.best_params_))
means = grid_results.cv_results_['mean_test_score']
stds = grid_results.cv_results_['std_test_score']
params = grid_results.cv_results_['params']
for mean, stdev, param in zip(means, stds, params):
  print('\{0\}\ (\{1\})\ with:\ \{2\}'.format(mean,\ stdev,\ param))
   Fnoch 89/100
   12/12 [============= ] - 0s 3ms/step - loss: 0.0174 - accuracy: 0.9956
   Epoch 90/100
   12/12 [=====
                  =========] - 0s 3ms/step - loss: 0.0171 - accuracy: 0.9956
   Epoch 91/100
   12/12 [======
                Epoch 92/100
   12/12 [=====
                 Epoch 93/100
   Fnoch 94/100
   12/12 [=====
                  Epoch 95/100
   12/12 [============= ] - 0s 3ms/step - loss: 0.0157 - accuracy: 0.9956
   Epoch 96/100
   Epoch 97/100
   12/12 [============] - 0s 3ms/step - loss: 0.0151 - accuracy: 0.9956
   Epoch 98/100
   Enoch 99/100
   12/12 [======
                 Epoch 100/100
   12/12 [============== ] - 0s 4ms/step - loss: 0.0144 - accuracy: 0.9956
   WARNING:absl:`lr` is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimiz
   [CV 5/5; 9/9] END ....batch_size=40, epochs=100;, score=0.956 total time=
   Epoch 1/10
   57/57 [====
            ========= ] - 1s 3ms/step - loss: 0.6008 - accuracy: 0.9121
   Enoch 2/10
   57/57 [=====
              Epoch 3/10
   57/57 [=========] - 0s 4ms/step - loss: 0.1764 - accuracy: 0.9490
   Epoch 4/10
   57/57 [====
               Epoch 5/10
   57/57 [=====
            Epoch 6/10
   57/57 [====
              Epoch 7/10
   Epoch 8/10
   57/57 [=====
            Epoch 9/10
   57/57 [=====
              Epoch 10/10
   57/57 [=====
                ==========] - 0s 2ms/step - loss: 0.0609 - accuracy: 0.9859
   Best: 0.9754230737686157, using {'batch_size': 10, 'epochs': 10}
   0.9754230737686157 (0.012873061611428028) with: {'batch_size': 10, 'epochs': 10}
   0.9736376285552979 (0.016643807823830226) with: {'batch_size': 10, 'epochs': 50} 0.9736065626144409 (0.015779015663304582) with: {'batch_size': 10, 'epochs': 100}
   0.9736686825752259 (0.014659717026799518) with: {'batch_size': 20, 'epochs': 10}
   0.970128858089447 (0.01805369433335564) with: {'batch_size': 20, 'epochs': 50}
   0.9753764748573304 (0.014082129144334399) with: {'batch_size': 20, 'epochs': 100}
   0.9648812294006348 (0.016610922303183322) with: {'batch_size': 40, 'epochs': 10}
   0.9718987703323364 (0.016990291752306482) with: {'batch_size': 40, 'epochs': 50}
   0.9700978040695191 (0.01633706373959022) with: {'batch_size': 40, 'epochs': 100}
   4
# Define a random seed
seed = 6
np.random.seed(seed)
# Start defining the model
def create_model(neuron1, neuron2):
  # create model
  model = Sequential()
  model.add(Dense(neuron1, input_dim=29, kernel_initializer='uniform', activation='linear'))
  model.add(Dense(neuron2, kernel_initializer='uniform', activation='linear'))
  model.add(Dense(1, activation='sigmoid'))
  # compile the model
   adam = Adam(1r=0.001)
  model.compile(loss='binary crossentropy', optimizer=adam, metrics=['accuracy'])
```

```
# create the model
model = KerasClassifier(build fn=create model, epochs=100, batch size=20, verbose=0)
# define the grid search parameters
neuron1 = [4, 8, 16]
neuron2 = [2, 4, 8]
# make a dictionary of the grid search parameters
param grid = dict(neuron1=neuron1, neuron2=neuron2)
# build and fit the GridSearchCV
grid = GridSearchCV(estimator=model, param_grid=param_grid, cv=KFold(), refit=True, verbose=10)
grid_results = grid.fit(X_standardized, y)
# summarize the results
print("Best: {0}, using {1}".format(grid_results.best_score_, grid_results.best_params_))
means = grid_results.cv_results_['mean_test_score']
stds = grid_results.cv_results_['std_test_score']
params = grid_results.cv_results_['params']
for mean, stdev, param in zip(means, stds, params):
   print('{0} ({1}) with: {2}'.format(mean, stdev, param))
    <ipython-input-18-7b0b0152be14>:19: DeprecationWarning: KerasClassifier is deprecated, use Sci-Keras (https://github.com/adriangb
      model = KerasClassifier(build_fn=create_model, epochs=100, batch_size=20, verbose=0)
    WARNING:absl:`lr` is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimiz
    Fitting 5 folds for each of 9 candidates, totalling 45 fits
    [CV 1/5; 1/9] START neuron1=4, neuron2=2.....
    WARNING:absl:`lr` is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimiz
    [CV 1/5; 1/9] END .....neuron1=4, neuron2=2;, score=0.974 total time= 9.7s
    [CV 2/5; 1/9] START neuron1=4, neuron2=2.....
    WARNING:absl:`lr` is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimiz
    [CV 2/5; 1/9] END .....neuron1=4, neuron2=2;, score=0.947 total time= 6.9s
    [CV 3/5; 1/9] START neuron1=4, neuron2=2.....
    WARNING:absl:`lr` is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimiz
    [CV 3/5; 1/9] END ......neuron1=4, neuron2=2;, score=0.982 total time= 5.0s
    [CV 4/5; 1/9] START neuron1=4, neuron2=2.....
    WARNING:absl:`lr` is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimiz
    [CV 4/5; 1/9] END .....neuron1=4, neuron2=2;, score=0.974 total time= 6.4s
    [CV 5/5; 1/9] START neuron1=4, neuron2=2.....
    WARNING:absl:`lr` is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimiz
    [CV 5/5; 1/9] END .....neuron1=4, neuron2=2;, score=0.982 total time= 6.3s
    [CV 1/5: 2/9] START neuron1=4, neuron2=4.....
    WARNING:absl:`lr` is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimiz
    [CV 1/5; 2/9] END .....neuron1=4, neuron2=4;, score=0.974 total time= 6.2s
    [CV 2/5; 2/9] END .....neuron1=4, neuron2=4;, score=0.947 total time= 6.3s
    [CV 3/5; 2/9] START neuron1=4, neuron2=4.....
    WARNING:absl:`lr` is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimiz
    [CV 3/5; 2/9] END .....neuron1=4, neuron2=4;, score=0.982 total time= 5.6s
    [CV 4/5; 2/9] START neuron1=4, neuron2=4......
    WARNING:absl:`lr` is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimiz
    [CV 4/5; 2/9] END .....neuron1=4, neuron2=4;, score=0.974 total time= 5.0s
    [CV 5/5; 2/9] START neuron1=4, neuron2=4.....
    WARNING:absl:`lr` is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimiz
    [CV 5/5; 2/9] END .....neuron1=4, neuron2=4;, score=0.982 total time= 6.3s
    [CV 1/5; 3/9] START neuron1=4, neuron2=8.....
    WARNING:absl:`lr` is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimiz
    [CV 1/5; 3/9] END .....neuron1=4, neuron2=8;, score=0.965 total time= 5.1s
    [CV 2/5; 3/9] START neuron1=4, neuron2=8.....
    WARNING:absl:`lr` is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimiz
    [CV 2/5; 3/9] END .....neuron1=4, neuron2=8;, score=0.947 total time= 6.3s
    [CV 3/5; 3/9] START neuron1=4, neuron2=8......
    WARNING:absl:`lr` is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimiz
    [CV 3/5; 3/9] END .....neuron1=4, neuron2=8;, score=0.982 total time= 5.6s
    [CV 4/5; 3/9] START neuron1=4, neuron2=8.....
    WARNING:absl:`lr` is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimiz
    [CV 4/5; 3/9] END .....neuron1=4, neuron2=8;, score=0.974 total time= 4.9s
    [CV 5/5; 3/9] START neuron1=4, neuron2=8......
    WARNING:absl:`lr` is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimiz
    [CV 5/5; 3/9] END .....neuron1=4, neuron2=8;, score=0.982 total time= 6.9s
    [CV 1/5; 4/9] START neuron1=8, neuron2=2.....
    WARNING:absl: lr is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimiz
    [CV 1/5; 4/9] END .....neuron1=8, neuron2=2;, score=0.974 total time= 5.0s
    [CV 2/5; 4/9] END .....neuron1=8, neuron2=2;, score=0.947 total time= 7.0s
    [CV 3/5; 4/9] START neuron1=8, neuron2=2.....
    WARNING:absl:`lr` is deprecated in Keras optimizer, please use `learning_rate` or use the legacy optimizer, e.g.,tf.keras.optimiz 🔻
    4
```

from sklearn.metrics import classification_report, accuracy_score
print(accuracy_score(y, y_pred))

0.9876977152899824

print(classification_report(y, y_pred))

₽	precision	recall	f1-score	support
0.0 1.0	0.99 0.99	0.99 0.98	0.99 0.98	357 212
accuracy macro avg weighted avg	0.99 0.99	0.99 0.99	0.99 0.99 0.99	569 569 569