```
In [42]: import warnings
              warnings.filterwarnings("ignore")
              import numpy as np
              import pandas as pd
              import matplotlib.pyplot as plt
              import seaborn as sns
              import math
              from sklearn.model_selection import train_test_split
              from sklearn.neighbors import KNeighborsClassifier
              from sklearn.preprocessing import MinMaxScaler
              from sklearn.metrics import accuracy_score
              from sklearn.preprocessing import LabelEncoder
  In [43]: df = pd.read_csv("KNN_Dataset.csv")
             df.head()
  Out[43]:
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              Data Preprocessing
  In [44]: df.drop(["id", "Unnamed: 32"], axis=1, inplace=True)
             # Dropping features that are not useful:
              # 1. id: this feature has no impact on the prediction
              # 2. unnamed: since the feature has many NaN values this will affect the model's performance.
              df.head()
  Out[44]:
                 diagnosis radius_mean texture_mean perimeter_mean area_mean smoothness_mean concavity_mean concavity_mean concavity_mean smoothness_worst texture_worst fractal_dimension_worst area_worst smoothness_worst concavity_worst concavity_worst concavity_worst concavity_worst concavity_worst symmetry_worst fractal_dimension_worst area_worst smoothness_worst concavity_worst concavity_worst concavity_worst concavity_worst concavity_worst symmetry_worst fractal_dimension_worst concavity_worst concavity_worst concavity_worst concavity_worst concavity_worst concavity_worst concavity_worst symmetry_worst fractal_dimension_worst concavity_worst c
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             5 rows × 31 columns
  In [45]: # Check if any null values
              df.isna().sum()
   Out[45]: diagnosis
              radius_mean
              texture_mean
              perimeter_mean
              area_mean
              smoothness_mean
              compactness_mean
              concavity_mean
              concave points_mean
              symmetry_mean
              fractal_dimension_mean
              radius_se
              texture_se
              perimeter_se
              area_se
              smoothness_se
              compactness_se
              concavity_se
              concave points_se
              symmetry_se
              fractal_dimension_se
              radius_worst
              texture_worst
              perimeter_worst
              area_worst
              smoothness_worst
              compactness_worst
              concavity_worst
              concave points_worst
              symmetry_worst
              fractal_dimension_worst
              dtype: int64
  In [46]: # Using Label Encoding to convert non-numerical labels into numeric form
              label_encoder = LabelEncoder()
  In [47]: y = label_encoder.fit_transform(y)
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  In [48]: #Visualization
             sns.scatterplot(x="radius_mean", y="texture_mean", hue="diagnosis", data=df, alpha=0.7);
                                                                                       diagnosis
                35
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                                                    radius_mean
              Train-Test split
X = df.drop("diagnosis", axis=1).values y = df["diagnosis"].values
  In [49]: X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.3, random_state=5)
  In [50]: # Feature Scaling using min-max scaler
              scaler = MinMaxScaler()
             X_train = scaler.fit_transform(X_train)
              X_test = scaler.fit_transform(X_test)
              def knn_func(train_data,label_data,test_data,k) :
                   knn = KNeighborsClassifier(n_neighbors=k)
                   knn.fit(train_data,label_data)
                   pred_label = knn.predict(test_data)
                  return pred_label
  In [51]: n = len(df)
  In [52]: k_max = math.sqrt(n)
              k_max
  Out[52]: 23.853720883753127
  In [53]: # Predection
             y_pred = knn_func(X_train, y_train, X_test, 7)
  In [54]: from sklearn.metrics import classification_report
              print(classification_report(y_test, y_pred))
                             precision
                                             recall f1-score support
                                                                          110
                                    0.92
                                                            0.96
                                    1.00
                                                0.85
                                                            0.92
                                                                           61
                                                            0.95
                                                                          171
                 accuracy
                                                                          171
                                                            0.94
                                                                          171
                                                            0.95
              Model Interpretation
               1. Why this KNN for this dataset?
                    • KNN can handle numerical and catagorical datas like the ones here i.e, The target feature is a catagorical type of data.
```

• From the classification report we can see that the precision and recall for class B is 0.92 and 1.00 respectively meaning that the 92% of the predictions made by the model is correct and 100% of the relevant data points were correctly identified. Similarly for class M precision is 100% and recall is 85%.

2. Classification report interpretation:

• And as for the accuracy of the model it is 0.95 i.e., 95% of outcomes were predicted correct.