```
Haverman's Survival DataSet
 In [2]: # importing packages
          import pandas as pd
          import numpy as np
          import matplotlib.pyplot as plt
          import seaborn as sns
          1. Data fetching
 In [4]: # Here I'm fetching data from 'haberman.csv' file
          suv_data = pd.read_csv('habermans.csv', names=['age', 'operation_year', 'axillary_nodes', 'survived_
          5 years'], header = None)
          print(suv_data.head())
             age operation_year axillary_nodes survived_5_years
         0 30 64 1
1 30 62 3
2 30 65 0
3 31 59 2
4 31 65 4
         2. Data Preparation
 In [5]: suv_data.info()
          <class 'pandas.core.frame.DataFrame'>
          RangeIndex: 306 entries, 0 to 305
          Data columns (total 4 columns):
               306 non-null int64
         operation_year 306 non-null int64
axillary_nodes 306 non-null int64
survived_5_years 306 non-null int64
          dtypes: int64(4)
         memory usage: 9.6 KB
 In [6]: # Assigning 'yes' to 1 and 'no' to 0 in column 'survived 5 years'.
          suv_data['survived_5_years'] = suv_data['survived_5_years'].apply(lambda x: 'yes' if x == 1 else 'n
          # Converting data type to category
          suv_data['survived_5_years'] = suv_data['survived_5_years'].astype('category')
          # Reading top 5 recors of dataset
          print(suv_data.head())
             age operation_year axillary_nodes survived_5_years
         0 30 64 1 yes
1 30 62 3 yes
2 30 65 0 yes
3 31 59 2 yes
4 31 65 4 yes
 In [8]: suv_data.info()
          <class 'pandas.core.frame.DataFrame'>
          RangeIndex: 306 entries, 0 to 305
          Data columns (total 4 columns):
               306 non-null int64
         operation_year 306 non-null int64
axillary_nodes 306 non-null int64
survived_5_years 306 non-null category
          dtypes: category(1), int64(3)
         memory usage: 7.6 KB
          Observation:
          1. There are four colums in this dataset three of them are integer and one is category type.
         2.The column 'survived_5_years' have 2 classes they are: 'yes' and 'no'. These two signifies that the patient is alive or not
          after five years
         3. High level statistics
 In [9]: print("No. of points : ", suv_data.shape[0])
          print("No. of features : ", suv_data.shape[1])
          print("No. of classes : ", suv_data['survived_5_years'].describe().unique()[1])
         No. of points: 306
         No. of features: 4
         No. of classes: 2
In [10]: print("Data points per class : ")
          print(suv_data['survived_5_years'].value_counts())
          print("\nData point distribution percentage per class:")
          print(suv_data['survived_5_years'].value_counts(normalize=True))
          Data points per class :
         yes
                225
          no
                  81
         Name: survived_5_years, dtype: int64
          Data point distribution percentage per class:
          yes 0.735294
                0.264706
         Name: survived_5_years, dtype: float64
In [11]: suv_data.describe()
Out[11]:
                        age operation_year
                                           axillary_nodes
          count | 306.000000
                            306.000000
                                           306.000000
                52.457516
                            62.852941
                                           4.026144
          mean
                 10.803452
                            3.249405
                                           7.189654
          std
                 30.000000
                            58.000000
                                           0.000000
          min
          25%
                 44.000000
                            60.000000
                                           0.000000
          50%
                 52.000000
                            63.000000
                                           1.000000
                            65.750000
          75%
                 60.750000
                                           4.000000
                 83.000000
                            69.000000
                                           52.000000
          max
          Observarion:
          1. This dataset contains medical record of 306 patients.
         2. These patients age vary from 30 to 83.
          3. There are higher chances of breast cancer to women in their 50's (i.e. more precisely in age of 52).
          4. Approximately 75% of patients have less than 5 positive lymph nodes and nearly 25% of the patients have no positive lymph
          nodes.
          5.After the 5 years of the operation 225 people are alive and 81 people have died.
          6. This dataset is a imbalanced dataset because 73% people belongs to the surviver class.
         4. Univariate Analysis
In [13]: # Histogram/Density Plot and PDF# Histog
          import seaborn as sb
          for feature in list(suv_data.columns[:-1]):
              sb.FacetGrid(suv data, hue='survived 5 years', size=5)\
              .map(sb.distplot, feature)\
              .add legend()
              plt.title('PDF on basis of '+feature)
              plt.show()
          C:\Users\BALARAMI REDDY\Anaconda3\lib\site-packages\matplotlib\axes\ axes.py:6462: UserWarning:
          The 'normed' kwarg is deprecated, and has been replaced by the 'density' kwarg.
           warnings.warn("The 'normed' kwarg is deprecated, and has been "
          C:\Users\BALARAMI REDDY\Anaconda3\lib\site-packages\matplotlib\axes\ axes.py:6462: UserWarning:
          The 'normed' kwarg is deprecated, and has been replaced by the 'density' kwarg.
            warnings.warn("The 'normed' kwarg is deprecated, and has been "
                           PDF on basis of age
          0.040
           0.035
           0.030
           0.025
                                                        survived_5_years
           0.020
                                                          yes
           0.015
          0.010
           0.005
           0.000
                          40
          C:\Users\BALARAMI REDDY\Anaconda3\lib\site-packages\matplotlib\axes\ axes.py:6462: UserWarning:
         The 'normed' kwarg is deprecated, and has been replaced by the 'density' kwarg.
           warnings.warn("The 'normed' kwarg is deprecated, and has been "
          C:\Users\BALARAMI REDDY\Anaconda3\lib\site-packages\matplotlib\axes\ axes.py:6462: UserWarning:
          The 'normed' kwarg is deprecated, and has been replaced by the 'density' kwarg.
            warnings.warn("The 'normed' kwarg is deprecated, and has been "
                      PDF on basis of operation_year
           0.12
          0.10
           0.08
                                                        survived_5_years
           0.06
                                                           no
                                                           yes
           0.04
           0.02
           0.00
                  55.0 57.5 60.0 62.5 65.0 67.5 70.0 72.5
                              operation_year
          C:\Users\BALARAMI REDDY\Anaconda3\lib\site-packages\matplotlib\axes\ axes.py:6462: UserWarning:
         The 'normed' kwarg is deprecated, and has been replaced by the 'density' kwarg.
           warnings.warn("The 'normed' kwarg is deprecated, and has been "
          C:\Users\BALARAMI REDDY\Anaconda3\lib\site-packages\matplotlib\axes\ axes.py:6462: UserWarning:
         The 'normed' kwarg is deprecated, and has been replaced by the 'density' kwarg.
            warnings.warn("The 'normed' kwarg is deprecated, and has been "
                       PDF on basis of axillary_nodes
          0.30
          0.25
          0.20
                                                        survived_5_years
          0.15
                                                           no
                                                           yes
          0.10
          0.05
           0.00
               -10
                                    30
                                         40
                                              50
                              axillary_nodes
In [14]: plt.close() # This line of code releses the memory that have been occupied by previous plot.
          # CDF plot
          mmm
          CDF is the integration of PDF
          # This list stores the data of patients who are alive.
          surv_yes = suv_data.loc[suv_data["survived_5_years"] == "yes"];
          # This list stores the data of patients who are dead.
          surv_no = suv_data.loc[suv_data["survived_5_years"] == "no"];
          # CDF plot for all features from list of alive patients.
          plt.figure(figsize=(20,5))
          for index, feature in enumerate(list(suv_data.columns[:-1])):
              plt.subplot(1, 3, index+1)
              counts, bin_edges = np.histogram(surv_yes[feature], \
                                                 bins=10, density = True)
              pdf = counts/(sum(counts))
              print("\n", feature, ":\n")
              print("BIN Width : ",bin_edges);
              print("PDF : ",pdf);
              cdf = np.cumsum(pdf)
              print("CDF : ",cdf);
              pdf, = plt.plot(bin_edges[1:],pdf,label='PDF')
              cdf, = plt.plot(bin edges[1:], cdf,label='CDF')
              plt.xlabel(feature)
              plt.legend([pdf, cdf])
              plt.title('CDF of survived patient by '+feature)
          print("\n","*"*45,"CDF of survived patient.","*"*45)
          plt.show()
          # CDF plot for all features from list of dead patients.
          plt.figure(figsize=(20,5))
          for index, feature in enumerate(list(suv_data.columns[:-1])):
              plt.subplot(1, 3, index+1)
              counts, bin_edges = np.histogram(surv_no[feature], \
                                                 bins=10, density = True)
              pdf = counts/(sum(counts))
              print("\n", feature, ":\n")
              print("BIN Width : ",bin_edges);
              print("PDF : ",pdf);
              cdf = np.cumsum(pdf)
              print("CDF : ",cdf);
              pdf, = plt.plot(bin_edges[1:],pdf,label='PDF')
              cdf, = plt.plot(bin_edges[1:], cdf,label='CDF')
              plt.xlabel(feature)
              plt.legend([pdf, cdf])
              plt.title('CDF of not survived patient by '+feature)
          print("\n","*"*45,"CDF of not survived patient.","*"*45)
          plt.show()
          age :
          BIN Width: [30. 34.7 39.4 44.1 48.8 53.5 58.2 62.9 67.6 72.3 77.]
          PDF: [0.05333333 0.10666667 0.12444444 0.09333333 0.16444444 0.16444444
          0.09333333 0.11111111 0.06222222 0.02666667]
          CDF: [0.05333333 0.16 0.28444444 0.37777778 0.54222222 0.70666667
                      0.91111111 0.97333333 1.
          operation_year :
          BIN Width: [58. 59.1 60.2 61.3 62.4 63.5 64.6 65.7 66.8 67.9 69.]
          PDF: [0.18666667 0.10666667 0.10222222 0.07111111 0.09777778 0.10222222
          0.06666667 0.09777778 0.09333333 0.07555556]
          CDF: [0.18666667 0.29333333 0.39555556 0.46666667 0.56444444 0.66666667
          0.73333333 0.83111111 0.92444444 1.
          axillary_nodes :
          BIN Width: [ 0. 4.6 9.2 13.8 18.4 23. 27.6 32.2 36.8 41.4 46. ]
          PDF: [0.83555556 0.08 0.02222222 0.02666667 0.01777778 0.00444444
          0.00888889 0.
                                             0.00444444]
                                0.
          CDF: [0.83555556 0.91555556 0.93777778 0.96444444 0.98222222 0.98666667
          0.99555556 0.99555556 0.99555556 1.
           ****** CDF of survived patient. *****************
                  CDF of survived patient by age
                                                   CDF of survived patient by operation_year
                                                                                      CDF of survived patient by axillary nodes

    Line2D(PDF)

          1.0
              Line2D(PDF)
                                             1.0
                                                                                 1.0
               Line2D(CDF)
                                                   Line2D(CDF)
          0.8
                                                                                 0.8
                                             0.8
                                                                                 0.6
          0.6
                                             0.6

    Line2D(PDF)

                                                                                                         Line2D(CDF
                                                                                 0.4
          0.4
                                             0.4
                                                                                 0.2
          0.2
                                             0.2
                                                                                              axillary nodes
          age :
          BIN Width: [34. 38.9 43.8 48.7 53.6 58.5 63.4 68.3 73.2 78.1 83.]
          PDF: [0.03703704 0.12345679 0.19753086 0.19753086 0.13580247 0.12345679
          0.09876543 0.04938272 0.02469136 0.01234568]
          CDF: [0.03703704 0.16049383 0.35802469 0.55555556 0.69135802 0.81481481
          0.91358025 0.96296296 0.98765432 1.
          operation_year :
          BIN Width: [58. 59.1 60.2 61.3 62.4 63.5 64.6 65.7 66.8 67.9 69.]
          PDF: [0.25925926 0.04938272 0.03703704 0.08641975 0.09876543 0.09876543
          0.16049383 0.07407407 0.04938272 0.08641975]
          CDF: [0.25925926 0.30864198 0.34567901 0.43209877 0.5308642 0.62962963
          0.79012346 0.86419753 0.91358025 1.
           axillary_nodes :
          BIN Width: [ 0. 5.2 10.4 15.6 20.8 26. 31.2 36.4 41.6 46.8 52. ]
          PDF: [0.56790123 0.14814815 0.13580247 0.04938272 0.07407407 0.
          0.01234568 0.
                                             0.01234568]
          CDF: [0.56790123 0.71604938 0.85185185 0.90123457 0.97530864 0.97530864
          0.98765432 0.98765432 0.98765432 1.
           CDF of not survived patient by operation_year
                                                                                     CDF of not survived patient by axillary_nodes
                  CDF of not survived patient by age
              Line2D(PDF)

    Line2D(PDF)

    Line2D(PDF)

               Line2D(CDF)
                                                   Line2D(CDF)
                                                                                      Line2D(CDF)
          0.8
                                             0.8
                                                                                 0.8
                                                                                 0.6
          0.6
                                             0.6
                                                                                 0.4
          0.4
                                             0.4
                                                                                 0.2
                                             0.2
In [15]: plt.close()
          # BOX PLOT
          fig, axes = plt.subplots(1, 3, figsize=(17,6))
          for index, feature in enumerate(list(suv data.columns[:-1])):
              sb.boxplot(x='survived_5_years', y=feature, data=suv_data, ax=axes[index], hue='survived_5_year
          s') \setminus
              .set title('BOXPLOT on basis of '+feature)
          plt.show()
                                                                                      BOXPLOT on basis of axillary_nodes
                    BOXPLOT on basis of age
                                                    BOXPLOT on basis of operation_year
            80
                                               68
            70
                                               66
                                               60
                        survived_5_years
                                                           survived_5_years
                                                                                             survived_5_years
                                               58
                        survived_5_years
                                                           survived_5_years
                                                                                             survived_5_years
          Observation:
          1.Almost 85% of the patients have less than or equal to 5(i.e. 0-5) positive axillary lymph node.
          2. There is a higher chance of survival if the operation have done in the age 30 to early 40's.
          3. Survival rate slightly increases after year of 1995 compared to before.
         5. Bivariate analysis
In [16]: # Pair plots
          sb.pairplot(suv_data, hue = 'survived_5_years', size=4)
          plt.show()
            80
            70
            60
            50
            40
            66
            64
                                                                                                       survived_5_years
           ම් 62
            60
            50
            40
            30
            20
            10
                                                                                10
                                                                                    axillary_nodes
In [17]: # SCATTERPLOT for features for better classification
          sb.set_style("whitegrid")
          sb.FacetGrid(suv_data, hue="survived_5_years", size=7) \
             .map(plt.scatter, "axillary_nodes", "operation_year") \
          plt.title('Facegrid on basis of axillary_nodes and operation_year')
          sb.FacetGrid(suv_data, hue="survived_5_years", size=7) \
             .map(plt.scatter, "axillary_nodes", "age") \
             .add legend()
          plt.title('Facegrid on basis of axillary_nodes and age')
                         Facegrid on basis of axillary_nodes and operation_year
                                                                            survived_5_years
                                                                               no
                                                           40
                                                                     50
                                         axillary_nodes
                             Facegrid on basis of axillary_nodes and age
                                                                            survived_5_years
```

classification between the two clases than other scatter plots.

Conclusion:

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By scattering the data points between {operation_year, axillary_nodes} and {age, axillary_nodes}, we can see the better

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