Untitled

June 26, 2024

```
[1]: import numpy as np
     import matplotlib.pyplot as plt
     import seaborn as sns
     import pandas as pd
[2]: df = pd.read_csv("HR.csv")
[3]: df
[3]:
             satisfaction_level
                                  last_evaluation
                                                     number_project
                            0.38
                                               0.53
                            0.80
                                               0.86
     1
                                                                    5
                                                                    7
     2
                            0.11
                                               0.88
     3
                            0.72
                                               0.87
                                                                    5
     4
                            0.37
                                               0.52
                                                                    2
                            0.40
                                               0.57
                                                                    2
     14994
                                                                    2
     14995
                            0.37
                                               0.48
     14996
                            0.37
                                               0.53
                                                                    2
     14997
                            0.11
                                               0.96
                                                                    6
     14998
                            0.37
                                               0.52
                                                                    2
             average_montly_hours
                                     time_spend_company
                                                           Work_accident
                                                                            left
     0
                                                        3
                                157
                                                                         0
                                                                               1
     1
                                                        6
                                                                         0
                                262
                                                                               1
     2
                               272
                                                        4
                                                                         0
                                                                               1
     3
                                223
                                                        5
                                                                         0
                                                                               1
     4
                                159
                                                        3
                                                                         0
                                                                               1
     14994
                                                                         0
                                151
                                                        3
                                                                               1
     14995
                                160
                                                        3
                                                                         0
                                                                               1
     14996
                                                        3
                                                                         0
                                143
                                                                               1
     14997
                                                        4
                                                                         0
                                280
                                                                               1
     14998
                                158
                                                                               1
```

sales salary

promotion_last_5years

```
0
                            0
                                 sales
                                            low
1
                            0
                                 sales medium
2
                                 sales medium
                            0
3
                                 sales
                                            low
4
                            0
                                 sales
                                            low
14994
                            0 support
                                            low
14995
                               support
                                            low
14996
                               support
                                            low
14997
                               support
                                            low
14998
                               support
                                            low
```

[14999 rows x 10 columns]

[4]: df.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 14999 entries, 0 to 14998
Data columns (total 10 columns):

#	Column	Non-Null Count	Dtype
0	satisfaction_level	14999 non-null	float64
1	last_evaluation	14999 non-null	float64
2	number_project	14999 non-null	int64
3	average_montly_hours	14999 non-null	int64
4	time_spend_company	14999 non-null	int64
5	Work_accident	14999 non-null	int64
6	left	14999 non-null	int64
7	<pre>promotion_last_5years</pre>	14999 non-null	int64
8	sales	14999 non-null	object
9	salary	14999 non-null	object
• .	07 .04(0)04(0		

dtypes: float64(2), int64(6), object(2)

memory usage: 1.1+ MB

[5]: df.isna().sum()

[5]: satisfaction_level 0 last_evaluation 0 number_project 0 average_montly_hours 0 time_spend_company 0 Work_accident 0 0 left 0 promotion_last_5years sales 0

```
salary
                              0
      dtype: int64
 [6]: df["left"].unique()
 [6]: array([1, 0])
     df["promotion_last_5years"].unique()
 [7]: array([0, 1])
 [8]: df["number_project"].unique()
 [8]: array([2, 5, 7, 6, 4, 3])
     df.satisfaction_level.unique()
 [9]: array([0.38, 0.8, 0.11, 0.72, 0.37, 0.41, 0.1, 0.92, 0.89, 0.42, 0.45,
            0.84, 0.36, 0.78, 0.76, 0.09, 0.46, 0.4, 0.82, 0.87, 0.57, 0.43,
            0.13, 0.44, 0.39, 0.85, 0.81, 0.9, 0.74, 0.79, 0.17, 0.24, 0.91,
            0.71, 0.86, 0.14, 0.75, 0.7, 0.31, 0.73, 0.83, 0.32, 0.54, 0.27,
            0.77, 0.88, 0.48, 0.19, 0.6, 0.12, 0.61, 0.33, 0.56, 0.47, 0.28,
            0.55, 0.53, 0.59, 0.66, 0.25, 0.34, 0.58, 0.51, 0.35, 0.64, 0.5,
            0.23, 0.15, 0.49, 0.3, 0.63, 0.21, 0.62, 0.29, 0.2, 0.16, 0.65,
            0.68, 0.67, 0.22, 0.26, 0.99, 0.98, 1. , 0.52, 0.93, 0.97, 0.69,
            0.94, 0.96, 0.18, 0.95])
[10]: df.last_evaluation.unique()
[10]: array([0.53, 0.86, 0.88, 0.87, 0.52, 0.5, 0.77, 0.85, 1. , 0.54, 0.81,
            0.92, 0.55, 0.56, 0.47, 0.99, 0.51, 0.89, 0.83, 0.95, 0.57, 0.49,
            0.46, 0.62, 0.94, 0.48, 0.8, 0.74, 0.7, 0.78, 0.91, 0.93, 0.98,
            0.97, 0.79, 0.59, 0.84, 0.45, 0.96, 0.68, 0.82, 0.9, 0.71, 0.6,
            0.65, 0.58, 0.72, 0.67, 0.75, 0.73, 0.63, 0.61, 0.76, 0.66, 0.69,
            0.37, 0.64, 0.39, 0.41, 0.43, 0.44, 0.36, 0.38, 0.4, 0.42])
[11]: df.time_spend_company.unique()
[11]: array([3, 6, 4, 5, 2, 8, 10, 7])
[12]: df.Work_accident.unique()
[12]: array([0, 1])
[13]: df.sales.unique()
```

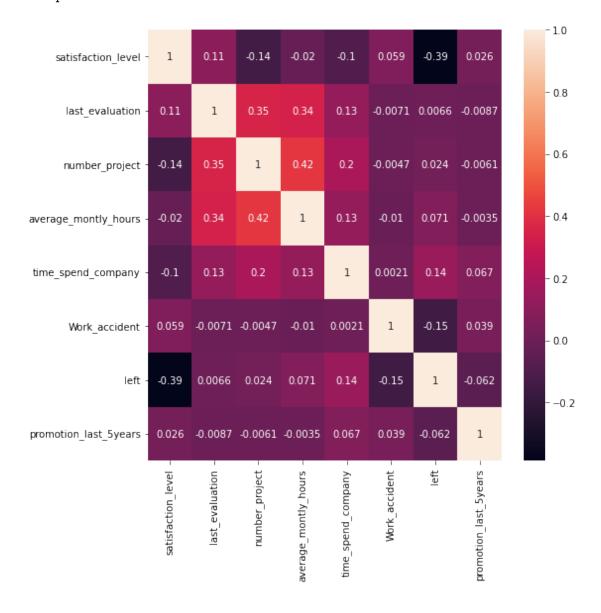
```
[13]: array(['sales', 'accounting', 'hr', 'technical', 'support', 'management',
             'IT', 'product_mng', 'marketing', 'RandD'], dtype=object)
[14]: df.salary.unique()
[14]: array(['low', 'medium', 'high'], dtype=object)
[15]: df.corr()
     /tmp/ipykernel 352/635785762.py:1: FutureWarning: The default value of
     numeric_only in DataFrame.corr is deprecated. In a future version, it will
     default to False. Select only valid columns or specify the value of numeric only
     to silence this warning.
       df.corr()
[15]:
                             satisfaction level last evaluation number project \
      satisfaction_level
                                       1.000000
                                                         0.105021
                                                                        -0.142970
      last_evaluation
                                       0.105021
                                                         1.000000
                                                                         0.349333
      number_project
                                      -0.142970
                                                         0.349333
                                                                         1.000000
                                                                         0.417211
      average_montly_hours
                                      -0.020048
                                                         0.339742
      time_spend_company
                                                                         0.196786
                                      -0.100866
                                                         0.131591
      Work_accident
                                       0.058697
                                                        -0.007104
                                                                        -0.004741
      left
                                      -0.388375
                                                         0.006567
                                                                         0.023787
      promotion_last_5years
                                       0.025605
                                                        -0.008684
                                                                        -0.006064
                             average_montly_hours time_spend_company
      satisfaction_level
                                        -0.020048
                                                             -0.100866
      last_evaluation
                                         0.339742
                                                              0.131591
     number project
                                         0.417211
                                                              0.196786
      average_montly_hours
                                         1.000000
                                                              0.127755
      time_spend_company
                                         0.127755
                                                              1.000000
      Work_accident
                                        -0.010143
                                                              0.002120
      left
                                         0.071287
                                                              0.144822
     promotion_last_5years
                                        -0.003544
                                                              0.067433
                             Work_accident
                                                 left promotion_last_5years
      satisfaction_level
                                  0.058697 -0.388375
                                                                    0.025605
                                                                   -0.008684
      last_evaluation
                                 -0.007104 0.006567
      number_project
                                 -0.004741 0.023787
                                                                   -0.006064
      average_montly_hours
                                 -0.010143 0.071287
                                                                   -0.003544
      time_spend_company
                                  0.002120 0.144822
                                                                    0.067433
      Work_accident
                                  1.000000 -0.154622
                                                                    0.039245
      left
                                 -0.154622 1.000000
                                                                   -0.061788
                                  0.039245 -0.061788
                                                                    1.000000
      promotion last 5years
```

```
[16]: plt.figure(figsize=(8,8))
sns.heatmap(df.corr(),annot=True)
```

/tmp/ipykernel_352/609742482.py:2: FutureWarning: The default value of numeric_only in DataFrame.corr is deprecated. In a future version, it will default to False. Select only valid columns or specify the value of numeric_only to silence this warning.

sns.heatmap(df.corr(),annot=True)

[16]: <AxesSubplot: >

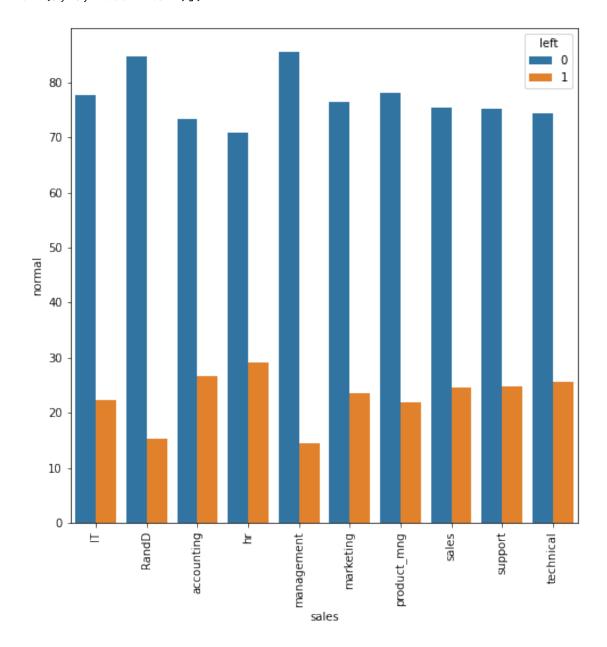


[17]: df1= df.groupby(["sales"])["left"].value_counts().reset_index(name="count")
df1=pd.DataFrame(df1)

```
[18]: df["sales"].value_counts()
[18]: sales
                      4140
      technical
                      2720
      support
                      2229
      ΙT
                      1227
      product_mng
                       902
      marketing
                       858
      RandD
                       787
                       767
      accounting
                       739
      hr
                       630
      management
      Name: sales, dtype: int64
[19]: | dft=df["sales"].value_counts().reset_index(name="Total")
[20]: dft=dft.rename(columns={"index":"sales"})
[21]: dft
[21]:
                sales
                       Total
      0
                sales
                        4140
                        2720
      1
           technical
      2
                        2229
              support
      3
                        1227
                   ΙT
                         902
      4
         product_mng
           marketing
                         858
      5
      6
                RandD
                         787
      7
          accounting
                         767
      8
                   hr
                         739
                         630
      9
          management
      dfmer=df1.merge(dft,how="left")
[23]: dfmer
[23]:
                        left count
                                      Total
                 sales
      0
                    ΙT
                           0
                                 954
                                       1227
      1
                    IT
                           1
                                 273
                                       1227
      2
                 RandD
                           0
                                        787
                                 666
      3
                 RandD
                           1
                                 121
                                        787
      4
                                 563
                                        767
           accounting
                           0
      5
           accounting
                           1
                                 204
                                        767
      6
                    hr
                           0
                                 524
                                        739
      7
                                 215
                                        739
                    hr
                           1
      8
           management
                           0
                                 539
                                        630
      9
           management
                           1
                                  91
                                        630
```

```
858
      10
            marketing
                           0
                                655
      11
                                203
                                        858
            marketing
                           1
      12
          product_mng
                           0
                                704
                                        902
      13
          product_mng
                           1
                                198
                                        902
      14
                sales
                           0
                               3126
                                      4140
      15
                sales
                                      4140
                           1
                               1014
      16
              support
                           0
                               1674
                                      2229
              support
                                      2229
      17
                           1
                                555
      18
            technical
                               2023
                                      2720
                           0
      19
            technical
                           1
                                697
                                      2720
[24]: dfmer["normal"]=dfmer["count"].div(dfmer["Total"].values)
      dfmer["normal"] = dfmer["normal"] *100
[25]: dfmer
[25]:
                sales
                        left
                              count
                                     Total
                                                normal
      0
                    IT
                                954
                                       1227
                           0
                                             77.750611
                    IT
      1
                           1
                                273
                                       1227
                                             22.249389
      2
                RandD
                           0
                                666
                                       787
                                             84.625159
      3
                RandD
                           1
                                121
                                       787
                                             15.374841
      4
           accounting
                           0
                                563
                                       767 73.402868
      5
                                        767
           accounting
                           1
                                204
                                             26.597132
      6
                   hr
                           0
                                524
                                       739
                                             70.906631
      7
                   hr
                           1
                                215
                                        739
                                             29.093369
                                        630 85.555556
           management
                                539
      8
      9
           management
                           1
                                 91
                                        630
                                            14.44444
      10
            marketing
                                655
                                        858
                                             76.340326
                           0
                                203
                                        858 23.659674
      11
            marketing
                           1
      12
          product_mng
                           0
                                704
                                        902 78.048780
      13
          product_mng
                           1
                                198
                                        902 21.951220
      14
                sales
                           0
                               3126
                                      4140 75.507246
      15
                sales
                               1014
                                      4140 24.492754
                           1
                                      2229 75.100942
      16
              support
                           0
                               1674
      17
              support
                           1
                                555
                                      2229
                                             24.899058
                               2023
                                      2720 74.375000
      18
            technical
                           0
      19
            technical
                           1
                                697
                                      2720
                                             25.625000
[26]: plt.figure(figsize=(8,8))
      sns.barplot(x="sales",y='normal',hue="left",data=dfmer)
      plt.xticks(rotation=90)
[26]: (array([0, 1, 2, 3, 4, 5, 6, 7, 8, 9]),
       [Text(0, 0, 'IT'),
        Text(1, 0, 'RandD'),
        Text(2, 0, 'accounting'),
```

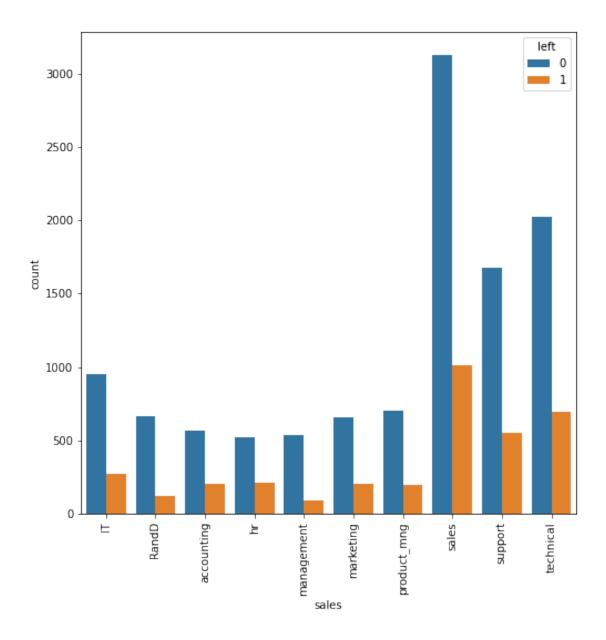
```
Text(3, 0, 'hr'),
Text(4, 0, 'management'),
Text(5, 0, 'marketing'),
Text(6, 0, 'product_mng'),
Text(7, 0, 'sales'),
Text(8, 0, 'support'),
Text(9, 0, 'technical')])
```



[27]:

#People from the hr department are leaving the highest based on the normalized data. The Hr department has the highest percentage. Normal = (Count of people data) from leaving category in a department)/(Total number of people in that data) data department)*100

```
[28]: df1.head()
[28]:
              sales left count
                 ΙT
      0
                        0
                             954
      1
                 ΙT
                        1
                             273
      2
              RandD
                             666
                        0
      3
              RandD
                        1
                             121
      4 accounting
                             563
[29]: plt.figure(figsize=(8,8))
      sns.barplot(x="sales",y='count',hue="left",data=df1)
      plt.xticks(rotation=90)
[29]: (array([0, 1, 2, 3, 4, 5, 6, 7, 8, 9]),
       [Text(0, 0, 'IT'),
       Text(1, 0, 'RandD'),
        Text(2, 0, 'accounting'),
        Text(3, 0, 'hr'),
        Text(4, 0, 'management'),
        Text(5, 0, 'marketing'),
       Text(6, 0, 'product_mng'),
        Text(7, 0, 'sales'),
        Text(8, 0, 'support'),
        Text(9, 0, 'technical')])
```



```
[30]: #The people from the sales department are leaing the highest if we look at only _{\!\!\!\perp} the count of leaving people.
```

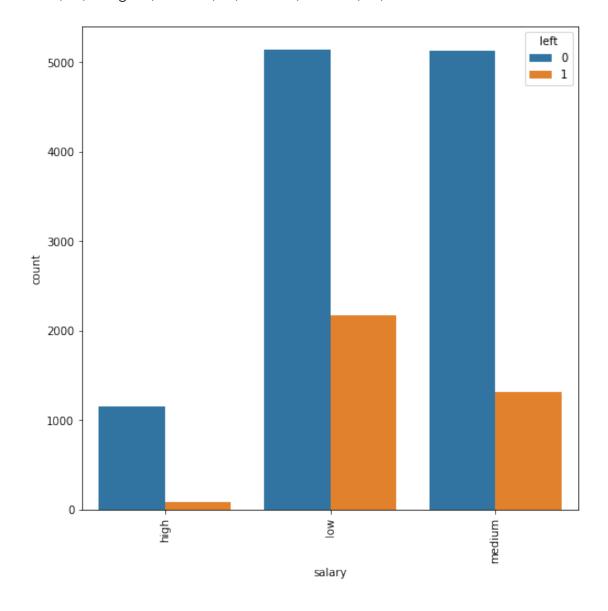
```
[31]: df2= df.groupby(["salary"])["left"].value_counts().reset_index(name="count") df2=pd.DataFrame(df2)
```

[32]: df2.head()

```
[32]: salary left count
0 high 0 1155
1 high 1 82
```

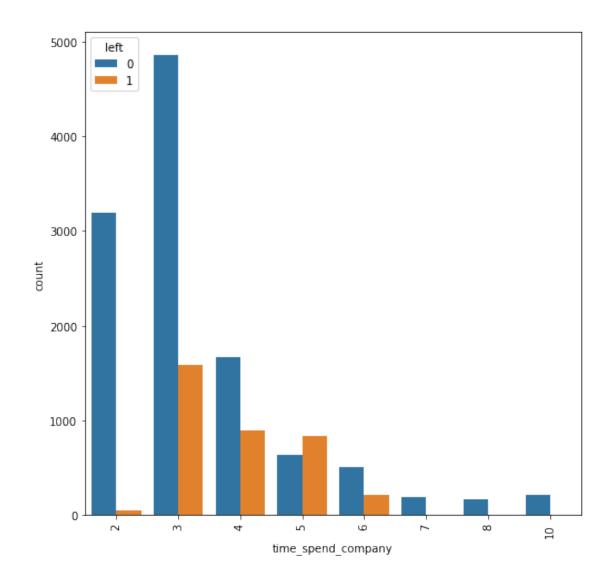
```
2 low 0 5144
3 low 1 2172
4 medium 0 5129
```

```
[33]: plt.figure(figsize=(8,8))
sns.barplot(x="salary",y='count',hue="left",data=df2)
plt.xticks(rotation=90)
```



[34]: #People with Lower Salaries are leaving the company

```
[35]: df3= df.groupby(["time_spend_company"])["left"].value_counts().
      df3=pd.DataFrame(df3)
[36]: #time_spend_company
     plt.figure(figsize=(8,8))
     sns.barplot(x="time_spend_company",y='count',hue="left",data=df3)
     plt.xticks(rotation=90)
[36]: (array([0, 1, 2, 3, 4, 5, 6, 7]),
      [Text(0, 0, '2'),
       Text(1, 0, '3'),
       Text(2, 0, '4'),
       Text(3, 0, '5'),
       Text(4, 0, '6'),
       Text(5, 0, '7'),
       Text(6, 0, '8'),
       Text(7, 0, '10')])
```



[37]: #People with experience of 3 to 5 years are leaving the comapny more.

----> 2 sns.countplot("Work_accident",hue="left",data=df)

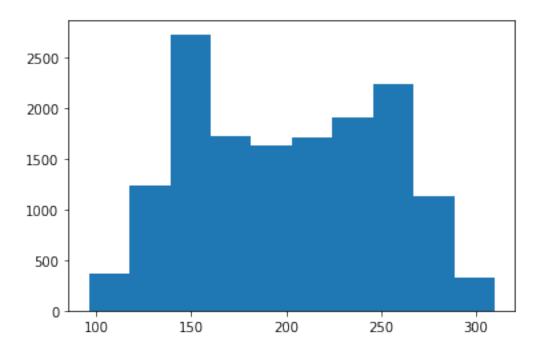
3 plt.xticks(rotation=90)

```
TypeError: countplot() got multiple values for argument 'data'
```

<Figure size 576x576 with 0 Axes>

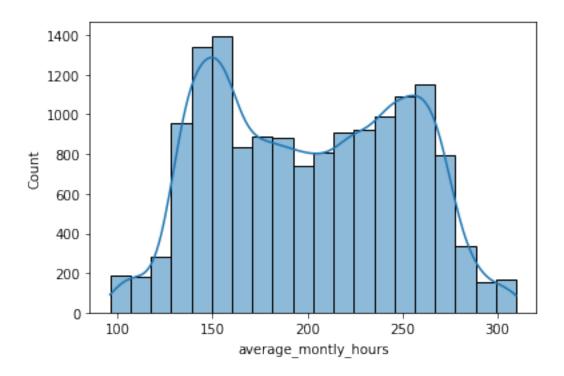
```
[39]: df.columns
```

```
[40]: plt.hist(df["average_montly_hours"])
```



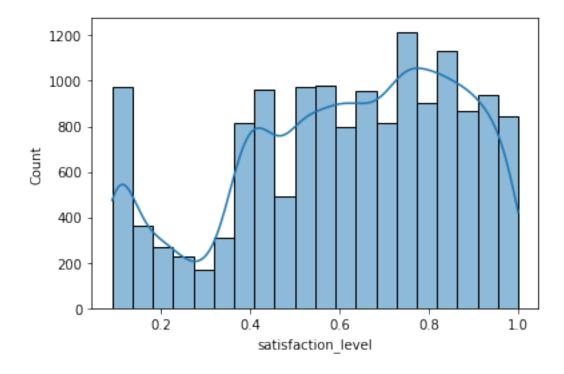
```
[41]: sns.histplot(data = df,x="average_montly_hours", kde = True,bins=20)
```

[41]: <AxesSubplot: xlabel='average_montly_hours', ylabel='Count'>



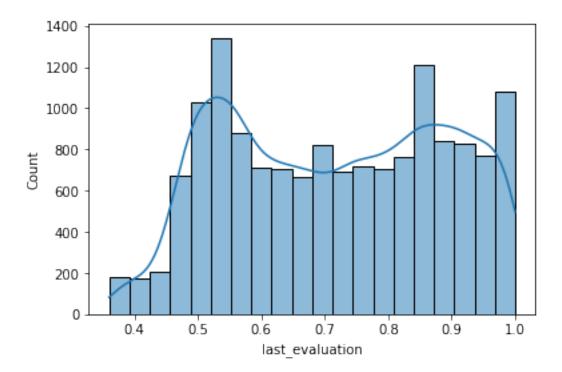
```
[42]: sns.histplot(data = df,x="satisfaction_level", kde = True,bins=20)
```

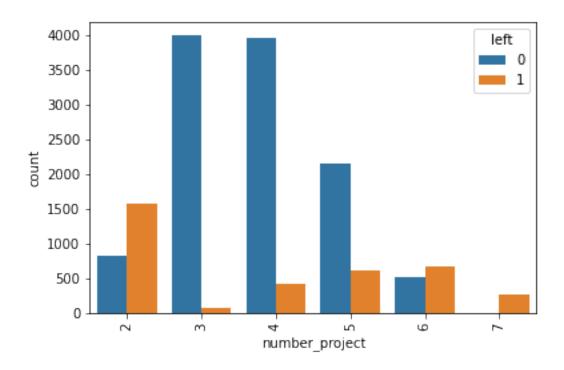
[42]: <AxesSubplot: xlabel='satisfaction_level', ylabel='Count'>



```
[43]: sns.histplot(data = df,x="last_evaluation", kde = True,bins=20)
```

[43]: <AxesSubplot: xlabel='last_evaluation', ylabel='Count'>



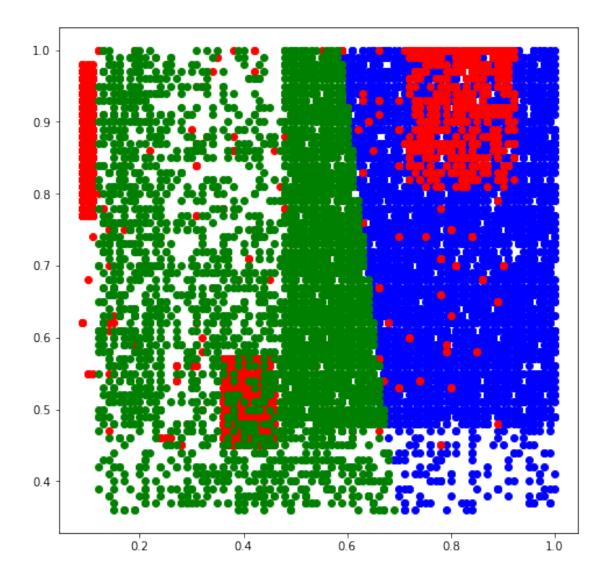


```
[45]: #People who have worked on 3 or 4 projects have left the organisation more.
[46]: dfclus = df[["satisfaction_level","last_evaluation","left"]]
[47]: dfclus
[47]:
             satisfaction_level
                                  last_evaluation
                                                    left
                            0.38
                                              0.53
      0
                                                       1
      1
                            0.80
                                              0.86
                                                       1
      2
                            0.11
                                              0.88
      3
                            0.72
                                              0.87
                                                       1
      4
                            0.37
                                              0.52
                                                       1
      14994
                            0.40
                                              0.57
                                                       1
      14995
                            0.37
                                              0.48
                                                       1
      14996
                            0.37
                                              0.53
                                                       1
      14997
                            0.11
                                              0.96
                                                       1
      14998
                            0.37
                                              0.52
      [14999 rows x 3 columns]
[48]: from sklearn.cluster import KMeans
```

```
[49]: km=dfclus.iloc[:,:].values
      kmeans = KMeans(n_clusters=3, random_state=0)
      label = kmeans.fit_predict(dfclus)
      labelarr = kmeans.fit_predict(km)
     /voc/work/.local/lib/python3.10/site-packages/sklearn/cluster/_kmeans.py:870:
     FutureWarning: The default value of `n_init` will change from 10 to 'auto' in
     1.4. Set the value of `n_init` explicitly to suppress the warning
       warnings.warn(
     /voc/work/.local/lib/python3.10/site-packages/sklearn/cluster/_kmeans.py:870:
     FutureWarning: The default value of `n_init` will change from 10 to 'auto' in
     1.4. Set the value of `n_init` explicitly to suppress the warning
       warnings.warn(
[50]: label
[50]: array([1, 1, 1, ..., 1, 1, 1], dtype=int32)
[51]: dfclus[label==0].describe()
[51]:
             satisfaction_level
                                 last_evaluation
                                                     left
      count
                    6720.000000
                                      6720.000000
                                                   6720.0
                       0.813112
                                         0.739728
                                                      0.0
      mean
                                                      0.0
      std
                       0.108167
                                         0.154900
     min
                       0.590000
                                         0.360000
                                                      0.0
      25%
                       0.720000
                                         0.610000
                                                      0.0
                                                      0.0
      50%
                       0.810000
                                         0.740000
      75%
                                                      0.0
                       0.910000
                                         0.870000
                       1.000000
                                                      0.0
      max
                                         1.000000
[52]: dfclus[label==1].describe()
[52]:
             satisfaction level last evaluation
                                                     left
                    3571.000000
                                      3571.000000
                                                  3571.0
      count
      mean
                       0.440098
                                         0.718113
                                                      1.0
                                                      0.0
      std
                       0.263933
                                         0.197673
                                                      1.0
     min
                       0.090000
                                         0.450000
      25%
                                                      1.0
                       0.130000
                                         0.520000
      50%
                                                      1.0
                       0.410000
                                         0.790000
      75%
                       0.730000
                                         0.900000
                                                       1.0
                       0.920000
                                         1.000000
                                                      1.0
      max
[53]: dfclus[label==2].describe()
[53]:
             satisfaction_level last_evaluation
                                                     left
                    4708.000000
                                      4708.000000
                                                   4708.0
      count
```

```
0.457984
                                         0.680854
                                                      0.0
     mean
                       0.153456
                                         0.165609
                                                      0.0
      std
                                                      0.0
     min
                       0.120000
                                         0.360000
                                                      0.0
      25%
                       0.350000
                                         0.550000
      50%
                       0.510000
                                         0.670000
                                                      0.0
      75%
                       0.570000
                                         0.810000
                                                      0.0
     max
                       0.690000
                                         1.000000
                                                      0.0
[54]: km[label==0,1]
[54]: array([0.67, 0.82, 0.91, ..., 0.55, 0.95, 0.54])
[55]: plt.figure(figsize=(8,8))
      plt.scatter(km[label==0,0],km[label==0,1],color="blue")
      plt.scatter(km[label==1,0],km[label==1,1],color="red")
      plt.scatter(km[label==2,0],km[label==2,1],color="green")
```

[55]: <matplotlib.collections.PathCollection at 0x7ff7810fff10>



The Blue cluster denotes people with best satisfaction levels and scored high in the last evaluation.

The Red cluster denotes people with medium satisfaction levels and scored average to high in the last evaluation

The green cluster denotes people with lower satisfaction levels and scored fairly than the above mentioned clusters.

```
[56]: df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 14999 entries, 0 to 14998
Data columns (total 10 columns):
```

#	Column	Non-Null Count	Dtype
0	satisfaction level	14999 non-null	float64

```
1
          last_evaluation
                                   14999 non-null float64
      2
          number_project
                                   14999 non-null int64
      3
          average_montly_hours
                                   14999 non-null int64
      4
          time_spend_company
                                   14999 non-null int64
          Work accident
      5
                                   14999 non-null int64
      6
                                   14999 non-null int64
      7
          promotion_last_5years 14999 non-null int64
          sales
                                   14999 non-null
      8
                                                   object
          salary
                                   14999 non-null
                                                   object
     dtypes: float64(2), int64(6), object(2)
     memory usage: 1.1+ MB
[57]: df_numerical=df.select_dtypes(include=['int64','float64'])
      df_categorical=df.select_dtypes(include=['object'])
     Converting the categorical data into numerical using one hot encoding
[58]: df = pd.get_dummies(data=df,columns=['sales','salary'])
      df_converted = pd.get_dummies(data=df_categorical)
[59]: df_converted.head()
[59]:
         sales_IT
                   sales_RandD
                                 sales_accounting
                                                    sales_hr
                                                               sales_management
      0
                0
                              0
                                                 0
                                                           0
                0
                              0
                                                 0
                                                           0
                                                                               0
      1
                0
                              0
                                                 0
                                                           0
                                                                               0
      2
      3
                0
                              0
                                                 0
                                                           0
                                                                              0
      4
                0
                              0
                                                 0
                                                           0
                                                                              0
         sales_marketing sales_product_mng
                                              sales sales
                                                           sales support
      0
      1
                        0
                                            0
                                                                         0
      2
                        0
                                            0
                                                         1
                                                                         0
      3
                        0
                                            0
                                                         1
                                                                         0
      4
                        0
                                            0
                                                         1
                                                                         0
         sales_technical
                           salary_high
                                        salary_low
                                                     salary_medium
      0
                        0
                                     0
                                                  1
                        0
                                     0
                                                  0
                                                                  1
      1
      2
                        0
                                     0
                                                  0
                                                                  1
      3
                        0
                                     0
                                                  1
                                                                  0
      4
                        0
                                     0
                                                                  0
                                                  1
[60]: dfn = pd.concat([df_numerical, df_converted], axis=1, join="inner")
[61]: dfn.shape
```

```
[61]: (14999, 21)
[62]: dfn.head()
[62]:
          satisfaction_level
                                last_evaluation
                                                   number_project
                                                                      average_montly_hours
                          0.38
                                             0.53
                                                                   2
                                                                                         157
                                             0.86
                                                                   5
      1
                          0.80
                                                                                         262
                          0.11
                                             0.88
                                                                   7
      2
                                                                                         272
                          0.72
                                                                   5
      3
                                             0.87
                                                                                         223
      4
                          0.37
                                             0.52
                                                                   2
                                                                                         159
                                Work_accident
                                                        promotion_last_5years
          time_spend_company
                                                 left
                                                                                  sales_IT
      0
                             3
                                                     1
                                                                               0
                                                                                           0
                                                                               0
      1
                             6
                                              0
                                                     1
                                                                                          0
                             4
                                              0
                                                     1
                                                                               0
      2
                                                                                          0
      3
                             5
                                              0
                                                     1
                                                                               0
                                                                                           0
      4
                             3
                                              0
                                                     1
                                                                                           0
                                       sales_management
                                                            sales_marketing
          sales_RandD
                            sales_hr
      0
                     0
                                    0
                                    0
                                                        0
                                                                            0
      1
                     0
      2
                                    0
                                                        0
                                                                            0
                     0
      3
                     0
                                    0
                                                        0
                                                                            0
                                    0
                                                                            0
      4
                     0
          sales_product_mng
                               sales_sales
                                              sales_support
                                                               sales_technical
      0
                            0
                                           1
                                                            0
                                                                               0
                            0
                                           1
                                                            0
                                                                               0
      1
      2
                            0
                                           1
                                                            0
                                                                               0
      3
                            0
                                           1
                                                            0
                                                                               0
                            0
                                                                               0
      4
                                                            0
          salary_high
                        salary_low
                                      salary_medium
      0
                     0
                                   1
                                                    0
                     0
                                   0
                                                    1
      1
      2
                     0
                                   0
                                                    1
      3
                     0
                                   1
                                                    0
                     0
                                   1
                                                    0
```

[5 rows x 21 columns]

Splitting the dataset into training and testing in the ratio of 80:20 with random state = 123.

```
[63]: x =dfn.drop("left",axis=1)
y = dfn["left"]
```

```
[64]: from sklearn.model_selection import train_test_split
      xtrain,xtest,ytrain,ytest = train_test_split(x,y,test_size=0.2,random_state=123)
[65]: xtrain.shape, ytrain.shape, xtest.shape, ytest.shape
[65]: ((11999, 20), (11999,), (3000, 20), (3000,))
[66]:
     ytrain.value_counts()
[66]: 0
           9137
           2862
      1
      Name: left, dtype: int64
     Data is highly imbalanced for the training dataset as the record of people who left is very low in
     comparision to the record of people who didn't leave.
     Using SMOTE to handle the imbalance for the left category
 []:
[67]: pip install scikit-learn==1.2.2 imblearn==0.9.1
     Defaulting to user installation because normal site-packages is not writeable
     Requirement already satisfied: scikit-learn==1.2.2 in
     /voc/work/.local/lib/python3.10/site-packages (1.2.2)
     ERROR: Could not find a version that satisfies the requirement
     imblearn==0.9.1 (from versions: 0.0)
     ERROR: No matching distribution found for imblearn==0.9.1
     Note: you may need to restart the kernel to use updated packages.
[68]: pip install -- upgrade pip
     Defaulting to user installation because normal site-packages is not writeable
     ERROR: Could not find a version that satisfies the requirement upgrade
     (from versions: none)
     ERROR: No matching distribution found for upgrade
     Note: you may need to restart the kernel to use updated packages.
[69]: pip install --upgrade pip
```

Defaulting to user installation because normal site-packages is not writeable Requirement already satisfied: pip in /voc/work/.local/lib/python3.10/site-packages (24.1)

Note: you may need to restart the kernel to use updated packages.

```
[70]: pip install scikit-learn==1.2.2 imbalanced-learn==0.10.1
     Defaulting to user installation because normal site-packages is not writeable
     Requirement already satisfied: scikit-learn==1.2.2 in
     /voc/work/.local/lib/python3.10/site-packages (1.2.2)
     Requirement already satisfied: imbalanced-learn==0.10.1 in
     /voc/work/.local/lib/python3.10/site-packages (0.10.1)
     Requirement already satisfied: numpy>=1.17.3 in /usr/local/lib/python3.10/site-
     packages (from scikit-learn==1.2.2) (1.23.5)
     Requirement already satisfied: scipy>=1.3.2 in /usr/local/lib/python3.10/site-
     packages (from scikit-learn==1.2.2) (1.9.3)
     Requirement already satisfied: joblib>=1.1.1 in /usr/local/lib/python3.10/site-
     packages (from scikit-learn==1.2.2) (1.2.0)
     Requirement already satisfied: threadpoolctl>=2.0.0 in
     /usr/local/lib/python3.10/site-packages (from scikit-learn==1.2.2) (3.1.0)
     Note: you may need to restart the kernel to use updated packages.
[71]: pip install scikit-learn imbalanced-learn
     Defaulting to user installation because normal site-packages is not writeable
     Requirement already satisfied: scikit-learn in
     /voc/work/.local/lib/python3.10/site-packages (1.2.2)
     Requirement already satisfied: imbalanced-learn in
     /voc/work/.local/lib/python3.10/site-packages (0.10.1)
     Requirement already satisfied: numpy>=1.17.3 in /usr/local/lib/python3.10/site-
     packages (from scikit-learn) (1.23.5)
     Requirement already satisfied: scipy>=1.3.2 in /usr/local/lib/python3.10/site-
     packages (from scikit-learn) (1.9.3)
     Requirement already satisfied: joblib>=1.1.1 in /usr/local/lib/python3.10/site-
     packages (from scikit-learn) (1.2.0)
     Requirement already satisfied: threadpoolctl>=2.0.0 in
     /usr/local/lib/python3.10/site-packages (from scikit-learn) (3.1.0)
     Note: you may need to restart the kernel to use updated packages.
 []: pip uninstall scikit-learn imbalanced-learn
     Found existing installation: scikit-learn 1.2.2
     Uninstalling scikit-learn-1.2.2:
       Would remove:
         /voc/work/.local/lib/python3.10/site-packages/scikit_learn-1.2.2.dist-info/*
         /voc/work/.local/lib/python3.10/site-
     packages/scikit_learn.libs/libgomp-a34b3233.so.1.0.0
         /voc/work/.local/lib/python3.10/site-packages/sklearn/*
     Proceed (Y/n)?
 []: Y
```

```
[]: pip install --upgrade pip
[]: pip install scikit-learn==1.2.2 imbalanced-learn==0.10.1
[]: pip install scikit-learn imbalanced-learn
[]: import sklearn
     import imblearn
     print(f"scikit-learn version: {sklearn.__version__}")
     print(f"imblearn version: {imblearn.__version__}")
     from imblearn.over_sampling import SMOTE
[]: sm = SMOTE(random_state = 2)
     xtrainres, ytrainres = sm.fit_resample(xtrain, ytrain)
[]: ytrainres.value_counts()
[]: from sklearn.model_selection import cross_val_score
     from sklearn.linear model import LogisticRegression
     from sklearn.ensemble import RandomForestClassifier
     from sklearn.metrics import roc_auc_score
     import sklearn.metrics as metrics
[]: logreg = LogisticRegression(solver='lbfgs', max_iter=10000)
[]: print(cross_val_score(logreg, xtrainres, ytrainres, cv=5).mean())
[]: logreg.fit(xtrainres,ytrainres)
     ypred = logreg.predict(xtest)
[]: from sklearn.metrics import classification_report
    Logistic regression report
[]: metrics.confusion_matrix(ytest,ypred)
[]: print(classification_report(ytest,ypred))
[]: roc_auc_score(ytest,ypred)
[]: fpr, tpr, threshold = metrics.roc_curve(ytest, ypred)
     print(fpr)
```

```
print(tpr)
     print(threshold)
     roc_auc = metrics.auc(fpr, tpr)
     print(roc_auc)
     # method I: plt
     plt.title('Receiver Operating Characteristic for Logistic Regression')
     plt.plot(fpr, tpr, 'b', label = 'AUC = %0.2f' % roc_auc)
     plt.legend(loc = 'lower right')
     plt.plot([0, 1], [0, 1], 'r--')
     plt.xlim([0, 1])
     plt.ylim([0, 1])
     plt.ylabel('True Positive Rate')
     plt.xlabel('False Positive Rate')
     plt.show()
[]: randm=RandomForestClassifier(max depth=5)
[]: print(cross_val_score(randm, xtrainres, ytrainres, cv=5).mean())
[]: randm.fit(xtrainres,ytrainres)
     ypred1=randm.predict(xtest)
    Random Forest Classification report
[]: metrics.confusion_matrix(ytest,ypred1)
[]: print(classification_report(ytest,ypred1))
[]: roc_auc_score(ytest,ypred1)
[]: fpr, tpr, threshold = metrics.roc_curve(ytest, ypred1)
     print(fpr)
     print(tpr)
     print(threshold)
     roc_auc = metrics.auc(fpr, tpr)
     print(roc_auc)
     # method I: plt
     plt.title('Receiver Operating Characteristic for Random Forest')
     plt.plot(fpr, tpr, 'b', label = 'AUC = %0.2f' % roc_auc)
     plt.legend(loc = 'lower right')
     plt.plot([0, 1], [0, 1], 'r--')
     plt.xlim([0, 1])
     plt.ylim([0, 1])
```

```
plt.ylabel('True Positive Rate')
     plt.xlabel('False Positive Rate')
     plt.show()
[]: from sklearn.ensemble import GradientBoostingClassifier
[]: gb = GradientBoostingClassifier(n_estimators=100, learning_rate=1.
      →0, max_depth=1, random_state=0)
[]: print(cross_val_score(gb, xtrainres, ytrainres, cv=5).mean())
[]: gb.fit(xtrainres,ytrainres)
[]:|ypred2 = gb.predict(xtest)
    Gradient boosting Classification Report
[]: metrics.confusion_matrix(ytest,ypred2)
[]: print(classification_report(ytest,ypred2))
[]: roc_auc_score(ytest,ypred2)
[]: fpr, tpr, threshold = metrics.roc_curve(ytest, ypred2)
     print(fpr)
     print(tpr)
     print(threshold)
     roc_auc = metrics.auc(fpr, tpr)
     print(roc_auc)
     # method I: plt
     plt.title('Receiver Operating Characteristic for Gradient Boosting')
     plt.plot(fpr, tpr, 'b', label = 'AUC = %0.2f' % roc_auc)
     plt.legend(loc = 'lower right')
     plt.plot([0, 1], [0, 1], 'r--')
     plt.xlim([0, 1])
     plt.ylim([0, 1])
     plt.ylabel('True Positive Rate')
     plt.xlabel('False Positive Rate')
    plt.show()
```

Based on the confusion matrix, the false negatives should be low because if an employee who might leave the organisation is misclassified as someone who won't leave then proper strategies to retain that person will not be implemented on him or her. Hence Recall is better metric to be used

```
[]: col = xtrainres.columns
[]: col
[]: feature_labels = np.array(col)
[]: importance = randm.feature_importances_
     feature_indexes_by_importance = importance.argsort()
     for index in feature_indexes_by_importance:
         print('{}-{:.2f}%'.format(feature_labels[index], (importance[index] *100.
      →())))
[]: predict_probability = randm.predict_proba(xtest)
[]: predict_probability[:,1]
[]: zone=[]
     prob=[]
     for i in predict_probability[:,1]:
      prob.append(i)
      if (i<=0.2):
         zone.append("Safe Zone")
       elif (i > 0.2 and i < = 0.6):
         zone.append("Low Risk Zone")
       elif (i > 0.6 and i < = 0.9):
         zone.append("Medium Risk Zone ")
       else:
         zone.append("High Risk Zone ")
[]: categories = ["Safe Zone", "Low Risk Zone", "Medium Risk Zone ", "High Risk Zone "]
     color = ["Green", "Yellow", "Orange", "Red"]
[]: colordict = dict(zip(categories, color))
[]: clr = pd.DataFrame({"zone":zone, "probability":prob})
[]: clr["zone"].unique()
[]: clr["Color"] = clr["zone"].apply(lambda x: colordict[x])
[]: clr.head(10)
[]: color= clr["Color"].tolist()
```

```
[]: c = ["Green", "Red", "Orange", "Yellow"]
[]: plt.figure(figsize=(7,7))
    sns.countplot(zone, palette=c)
[]:
```