NIRF Rank Predictor

The goal of this machine learning problem is to build a predictive model that can accurately estimate the NIRF ranking of colleges and universities based on a set of relevant features and historical ranking data. By doing so, we aim to assist colleges and universities in assessing and enhancing their performance in various NIRF ranking parameters.

It is carried out in following steps:-

- Data Preprocessing and data cleaning
- Transforming raw data into features that can be used to create predictive models
- Exploratory Data Analysis
- Assessing various Machine Learning models
- Training and Testing ML models
- Finalizing the best model suited.

As per the methodology of NIRF, there are five ranking parameters which are as follows:

- Teaching, learning, and resources
- Research and professional practice
- Graduation outcomes
- Outreach and inclusivity
- Peer perception

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

Data of year 2016, 2017, 2018, 2019, 2020, 2021 is arranged from kaggle. The dataset contains:-

- Institute ID
- Institute Name
- City where it is located
- State
- Rank of various years
- TLR (Teaching, Learning and Resources)
- RPC (Research And Professional Practice)
- GO (Graduation Outcomes)
- OI (Outreach And Inclusivity)
- Perception

The dataset is then combined into one dataset.

```
data_2016 = pd.read_csv('EngineeringRanking_2016.csv')
```

data_2016.head()								
Institute Id Institute Name								
0 NIRF-ENGG-INF-77 Indian Institute Of Technology, Madras Chennai								
1 NIRF-ENGG-INF-312 Indian Institute Of Technology, Bombay								
Bombay 2 NIRF-ENGG-INF-300 Indian Institute Of Technology, Kharagpur								
Kharagpur								
3 NIRF-ENGG-INF-79 Indian Institute Of Technology, Delhi New Delhi								
4 NIRF-ENGG-INF-228 Indian Institute Of Technology, Kanpur								
Kanpur								
State Score Rank TLR RPC G0 OI Perception 0 Tamil Nadu 89.41 1 88.26 94.02 81.81 86.11 98								
1 Maharashtra 87.66 2 85.93 94.14 84.97 74.84 99								
2 West Bengal 83.91 3 76.23 92.68 83.95 78.05 97 3 Delhi 82.02 4 80.27 91.62 74.72 66.17 98								
4 Uttar Pradesh 81.07 5 66.08 93.52 85.62 70.59 98								
<pre>data_2017 = pd.read_csv('EngineeringRanking_2017.csv')</pre>								
data_2017.head()								
Institute Id Institute Name								
City \ 0 IR17-ENGG-1-1-77 Indian Institute of Technology Madras								
0 IR17-ENGG-1-1-77 Indian Institute of Technology Madras								
0 IR17-ENGG-1-1-77 Indian Institute of Technology Madras Chennai								
0 IR17-ENGG-1-1-77 Indian Institute of Technology Madras Chennai 1 IR17-ENGG-2-18633 Indian Institute of Technology Bombay Mumbai								
0 IR17-ENGG-1-1-77 Indian Institute of Technology Madras Chennai 1 IR17-ENGG-2-18633 Indian Institute of Technology Bombay Mumbai 2 IR17-ENGG-2-18630 Indian Institute of Technology Kharagpur								
0 IR17-ENGG-1-1-77 Indian Institute of Technology Madras Chennai 1 IR17-ENGG-2-18633 Indian Institute of Technology Bombay Mumbai 2 IR17-ENGG-2-18630 Indian Institute of Technology Kharagpur Kharagpur 3 IR17-ENGG-2-1-79 Indian Institute of Technology Delhi New								
O IR17-ENGG-1-1-77 Indian Institute of Technology Madras Chennai 1 IR17-ENGG-2-18633 Indian Institute of Technology Bombay Mumbai 2 IR17-ENGG-2-18630 Indian Institute of Technology Kharagpur Kharagpur 3 IR17-ENGG-2-1-79 Indian Institute of Technology Delhi New Delhi								
O IR17-ENGG-1-1-77 Indian Institute of Technology Madras Chennai 1 IR17-ENGG-2-18633 Indian Institute of Technology Bombay Mumbai 2 IR17-ENGG-2-18630 Indian Institute of Technology Kharagpur Kharagpur 3 IR17-ENGG-2-1-79 Indian Institute of Technology Delhi New Delhi								
O IR17-ENGG-1-1-77 Indian Institute of Technology Madras Chennai 1 IR17-ENGG-2-18633 Indian Institute of Technology Bombay Mumbai 2 IR17-ENGG-2-18630 Indian Institute of Technology Kharagpur Kharagpur 3 IR17-ENGG-2-1-79 Indian Institute of Technology Delhi New Delhi 4 IR17-ENGG-2-18248 Indian Institute of Technology Kanpur								
O IR17-ENGG-1-1-77 Indian Institute of Technology Madras Chennai 1 IR17-ENGG-2-18633 Indian Institute of Technology Bombay Mumbai 2 IR17-ENGG-2-18630 Indian Institute of Technology Kharagpur Kharagpur 3 IR17-ENGG-2-1-79 Indian Institute of Technology Delhi New Delhi 4 IR17-ENGG-2-18248 Indian Institute of Technology Kanpur Kanpur								
O IR17-ENGG-1-1-77 Indian Institute of Technology Madras Chennai 1 IR17-ENGG-2-18633 Indian Institute of Technology Bombay Mumbai 2 IR17-ENGG-2-18630 Indian Institute of Technology Kharagpur Kharagpur 3 IR17-ENGG-2-1-79 Indian Institute of Technology Delhi New Delhi 4 IR17-ENGG-2-18248 Indian Institute of Technology Kanpur Kanpur State Score Rank TLR RPC GO OI Perception								
O IR17-ENGG-1-1-77 Indian Institute of Technology Madras Chennai 1 IR17-ENGG-2-18633 Indian Institute of Technology Bombay Mumbai 2 IR17-ENGG-2-18630 Indian Institute of Technology Kharagpur Kharagpur 3 IR17-ENGG-2-1-79 Indian Institute of Technology Delhi New Delhi 4 IR17-ENGG-2-18248 Indian Institute of Technology Kanpur Kanpur State Score Rank TLR RPC GO OI Perception O Tamil Nadu 87.96 1 91.85 92.60 83.78 77.19 81.46								
O IR17-ENGG-1-1-77 Indian Institute of Technology Madras Chennai 1 IR17-ENGG-2-18633 Indian Institute of Technology Bombay Mumbai 2 IR17-ENGG-2-18630 Indian Institute of Technology Kharagpur Kharagpur 3 IR17-ENGG-2-1-79 Indian Institute of Technology Delhi New Delhi 4 IR17-ENGG-2-18248 Indian Institute of Technology Kanpur Kanpur State Score Rank TLR RPC G0 OI Perception 0 Tamil Nadu 87.96 1 91.85 92.60 83.78 77.19 81.46 1 Maharashtra 87.87 2 91.15 94.68 83.64 69.70 84.24								

```
data 2018 = pd.read csv('EngineeringRanking 2018.csv')
data 2018.head()
         Institute Id
                                                 Institute Name
City
      IR-2-E-0E-U-0456
                          Indian Institute of Technology Madras
Chennai
     IR-3-E-0EM-U-0306
                          Indian Institute of Technology Bombay
Mumbai
     IR-3-E-0EM-I-1074
                           Indian Institute of Technology Delhi
Delhi
                       Indian Institute of Technology Kharagpur
  IR-5-E-0EMAL-U-0573
Kharagpur
                          Indian Institute of Technology Kanpur
     IR-3-E-0EM-I-1075
Kanpur
                               TLR
          State Score Rank
                                      RPC
                                              G0
                                                     0I
                                                         Perception
     Tamil Nadu 88.95
0
                          1
                             93.83
                                    91.44
                                           84.91
                                                  63.88
                                                             100.00
1
    Maharashtra 84.82
                          2 89.61
                                    96.04
                                          76.53
                                                  44.71
                                                              93.48
2
                                           81.47
                                                  59.72
                 82.18
                          3
                             80.83
                                    89.35
                                                              88.60
          Delhi
3
    West Bengal 77.78
                          4
                             73.73
                                    84.26
                                           85.65
                                                  53.99
                                                              78.51
4 Uttar Pradesh 75.24
                          5 78.51
                                    77.15 78.99
                                                              85.89
                                                 41.46
data 2019 = pd.read csv('EngineeringRanking 2019.csv')
data 2019.head()
  Institute Id
                                         Institute Name
                                                              City \
  IR-E-U-0456
                  Indian Institute of Technology Madras
                                                           Chennai
                   Indian Institute of Technology Delhi
                                                         New Delhi
  IR-E-I-1074
                  Indian Institute of Technology Bombay
  IR-E-U-0306
                                                            Mumbai
  IR-E-U-0573
               Indian Institute of Technology Kharagpur
                                                         Kharagpur
4 IR-E-I-1075
                  Indian Institute of Technology Kanpur
                                                            Kanpur
          State Score Rank
                                TLR
                                       RPC
                                               G0
                                                      01
                                                        Perception
     Tamil Nadu 89.05
                           1 93.55 92.39 84.36 63.99
                                                              100.00
          Delhi 85.36
                              85.80 96.18 80.32
                                                   56.19
                                                               90.85
    Maharashtra 84.40
                           3
                              89.12 95.30 76.47 48.17
                                                               89.61
    West Bengal 79.41
                           4 73.14 88.20 84.12 57.79
                                                               84.14
  Uttar Pradesh 77.57
                           5
                              79.07 81.79 82.56 46.61
                                                               81.35
data 2020 = pd.read csv('EngineeringRanking 2020.csv')
data 2020.head()
```

0 1 2 3 4	1 IR-E-I-1074 Indian Institute of Technology Delhi New Delhi 2 IR-E-U-0306 Indian Institute of Technology Bombay Mumbai 3 IR-E-I-1075 Indian Institute of Technology Kanpur Kanpur								
	State	Score	Rank	TLR	RPC	G0	OI	Perception	
0	Tamil Nadu	89.93	1	95.42	94.64	83.90	61.31	100.00	
1	Delhi	88.08	2	90.79	96.15	80.36	64.81	94.46	
2	Maharashtra	85.08	3	91.00	93.37	77.60	49.99	92.51	
3	Uttar Pradesh	82.18	4	86.22	82.08	88.44	54.21	85.78	
4	West Bengal	80.56	5	77.32	87.11	83.21	56.62	89.31	
0 1	1 IR-E-I-1074 Indian Institute of Technology Delhi New Delhi 2 IR-E-U-0306 Indian Institute of Technology Bombay Mumbai 3 IR-E-I-1075 Indian Institute of Technology Kanpur Kanpur								
	State	Score	Rank	TLR	RPC	G0	OI	Perception	
0	Tamil Nadu	90.19	1	95.47	96.43	81.92	62.44	100.00	
1	Delhi	88.96	2	91.76	95.82	80.97	66.39	98.63	
2	Maharashtra	85.16	3	89.32	92.56	79.71	53.68	92.88	
3	Uttar Pradesh	83.22	4	86.71	83.13	89.79	55.96	87.05	
4	West Bengal	82.03	5	80.51	88.59	83.01	58.46	88.50	
<pre>data_2016['year'],data_2017['year'],data_2018['year'],data_2019['year'],data_2020['year'],data_2021['year'] = '2016' , '2017' , '2018' , '2019' , '2020' , '2021' df = [data 2016,data 2017,data 2018,data 2019,data 2020,data 2021]</pre>									
<pre>df_combined = pd.concat(df , axis =0 , ignore_index = 'True')</pre>									

```
# Combined dataset
df combined.head()
       Institute Id
                                                Institute Name
City \
                        Indian Institute Of Technology, Madras
   NIRF-ENGG-INF-77
Chennai
1 NIRF-ENGG-INF-312
                        Indian Institute Of Technology, Bombay
Bombay
   NIRF-ENGG-INF-300
                     Indian Institute Of Technology, Kharagpur
Kharagpur
   NIRF-ENGG-INF-79
                         Indian Institute Of Technology, Delhi
Delhi
4 NIRF-ENGG-INF-228
                        Indian Institute Of Technology, Kanpur
Kanpur
          State Score Rank TLR
                                      RPC
                                              G0
                                                     0I
                                                         Perception
year
     Tamil Nadu 89.41
                        1 88.26 94.02
                                          81.81
                                                               98.0
0
                                                  86.11
2016
                                                               99.0
    Maharashtra 87.66
                          2
                             85.93 94.14 84.97
                                                  74.84
2016
                                                               97.0
2
    West Bengal 83.91
                          3 76.23 92.68 83.95
                                                 78.05
2016
          Delhi 82.02
                          4
                             80.27 91.62 74.72 66.17
                                                               98.0
3
2016
4 Uttar Pradesh 81.07
                          5 66.08 93.52 85.62 70.59
                                                               98.0
2016
df combined
                                                   Institute Name \
          Institute Id
      NIRF-ENGG-INF-77
                           Indian Institute Of Technology, Madras
                           Indian Institute Of Technology, Bombay
1
     NIRF-ENGG-INF-312
2
    NIRF-ENGG-INF-300
                        Indian Institute Of Technology, Kharagpur
3
      NIRF-ENGG-INF-79
                            Indian Institute Of Technology, Delhi
4
    NIRF-ENGG-INF-228
                           Indian Institute Of Technology, Kanpur
          IR-E-C-1438
                            The National Institute of Engineering
895
                             K. J. Somaiya College of Engineering
896
          IR-E-C-33584
                       Kakatiya Institute of Technology & Science
897
          IR-E-C-27400
898
         IR-E-C-11015
                                  Walchand College of Engineering
899
          IR-E-U-0037
                                      Sri Venkateswara University
                         State Score Rank
                                                     RPC
                                                             G0
          City
                                              TLR
/ IO
                    Tamil Nadu 89.41
                                         1 88.26 94.02 81.81
       Chennai
0
86.11
                   Maharashtra 87.66
                                         2 85.93 94.14 84.97
        Bombay
74.84
```

```
West Bengal 83.91
                                          3 76.23 92.68 83.95
      Kharagpur
78.05
3
     New Delhi
                          Delhi 82.02
                                          4
                                             80.27
                                                    91.62
                                                          74.72
66.17
         Kanpur
                  Uttar Pradesh 81.07
                                          5
                                             66.08 93.52 85.62
70.59
. .
895
                      Karnataka 32.52
                                        196
                                             53.79
         Mysore
                                                     2.33
                                                           51.03
50.48
896
         Mumbai
                    Maharashtra 32.48
                                        197
                                             52.22
                                                     3.33 58.94
38.08
897
       Warangal
                      Telangana 32.48
                                        197
                                             55.80
                                                      1.64 49.13
49.25
898
         Sangli
                    Maharashtra 32.46
                                        199
                                             48.25
                                                     4.54 56.11
47.93
       Tirupati Andhra Pradesh 32.42 200 41.76 25.59 37.58
899
43.31
     Perception
                 year
0
          98.00
                 2016
          99.00
1
                 2016
2
          97.00
                 2016
3
          98.00
                 2016
4
          98.00
                 2016
895
           4.23
                 2021
896
           2.17
                 2021
           4.90
897
                 2021
898
           6.19
                 2021
           3.56
899
                 2021
[900 rows x 12 columns]
df combined.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 900 entries, 0 to 899
Data columns (total 12 columns):
#
                     Non-Null Count
     Column
                                     Dtype
- - -
0
     Institute Id
                     900 non-null
                                     object
                     900 non-null
1
     Institute Name
                                     object
2
     City
                     900 non-null
                                     object
 3
                                     object
     State
                     900 non-null
 4
     Score
                     900 non-null
                                     float64
 5
     Rank
                     900 non-null
                                     object
 6
     TLR
                     900 non-null
                                     float64
 7
     RPC
                     900 non-null
                                     float64
 8
     G0
                     900 non-null
                                     float64
```

9	0I	900 non-null	float64
10	Perception	900 non-null	float64
11	•	900 non-null	object
dtyno	c. floa+64/6)	object(6)	-

dtypes: float64(6), object(6)

memory usage: 84.5+ KB

There are certain anomalies present in the data like in some fields Rank 21A, 26A is present. The letter is removed using lambda function and the datatype of rank is converted from string to float.

df_combined[219:228]								
Institu	ıte Id					Institute		
Name \ 219 IR-2-E-EM-1 Technology	I-1480 Th	Thapar Institute of Engineering and						
220 IR-2-E-0E-U Surathkal	J-0237	National Institute of Technology						
	IR-2-E-0E-U-0584 Indian Institute of Engineering Science a							
	2-E-OE-U-0378 Indian Institute of Technology							
223 IR-2-E-0E-U Technology	J-0255 Indi	Indian Institute of Space Science and						
224 IR-2-E-0E-L Patna	stitute of Technology							
225 IR-2-E-0E-U-0025 National Institute of Technology Warangal						ology		
226 IR-5-E-0EMAP-UTechnology	J-0202	Birla Institute of						
227 IR-2-E-0E-U Mandi	J-0184	Indian Institute of Technology						
	City	State	Score F	Rank	TLR	RPC		
G0 \ 219 Pat 73.11	tiala	Punjab	56.14	20	69.77	45.75		
220 Surat 71.27	thkal	Karnataka	53.16	21	60.34	38.36		
	owrah W	lest Bengal	53.24	21A	67.15	45.47		
	nagar	Punjab	52.80	22	77.84	29.53		
223 Thiruvanantham	ouram	Kerala	52.74	23	78.87	20.76		
	Patna	Bihar	52.37	24	74.43	35.03		
	angal	Telangana	51.82	25	67.25	31.43		

```
226
                 Ranchi
                               Jharkhand 51.12
                                                  26 71.22 36.61
59.88
227
                 Mandi Himachal Pradesh 51.28 26A 76.90 30.48
63.07
       0I
            Perception
                        year
219
    56.55
                 12.01
                        2018
                 41.93
220
    51.10
                        2018
    40.27
                 32.03
221
                        2018
                        2018
                 14.73
222
    60.61
223
    60.82
                 43.47
                        2018
                       2018
224
    49.30
                 14.73
225
    54.79
                 22.59
                        2018
226
    51.69
                 16.21
                        2018
227
    54.64
                  9.96
                        2018
df_combined['Rank'] = df_combined['Rank'].apply(lambda x: x if
str(x).isdigit() else x[:-1])
df combined['Rank'] = df combined['Rank'].astype('float64')
df combined[219:228]
            Institute Id
                                                             Institute
Name \
219
        IR-2-E-EM-I-1480
                            Thapar Institute of Engineering and
Technology
220
        IR-2-E-0E-U-0237
                                 National Institute of Technology
Surathkal
221
        IR-2-E-0E-U-0584
                         Indian Institute of Engineering Science and
Te...
222
        IR-2-E-0E-U-0378
                                       Indian Institute of Technology
Ropar
223
        IR-2-E-0E-U-0255
                           Indian Institute of Space Science and
Technology
        IR-2-E-0E-U-0064
                                       Indian Institute of Technology
224
Patna
        IR-2-E-0E-U-0025
                                  National Institute of Technology
225
Warangal
226 IR-5-E-0EMAP-U-0202
                                              Birla Institute of
Technology
        IR-2-E-0E-U-0184
227
                                       Indian Institute of Technology
Mandi
                                    State Score Rank
                   City
                                                       TLR
                                                                RPC
GO \
219
               Patiala
                                   Punjab
                                          56.14 20.0 69.77
                                                              45.75
73.11
220
              Surathkal
                               Karnataka 53.16 21.0 60.34 38.36
71.27
```

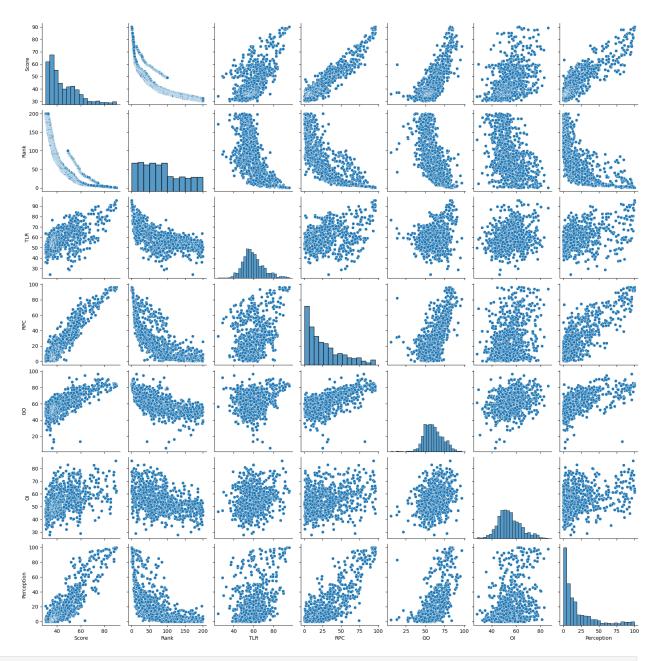
```
221
                 Howrah
                              West Bengal 53.24 21.0 67.15 45.47
61.09
222
               Rupnagar
                                   Punjab
                                            52.80 22.0
                                                         77.84
                                                                29.53
65.29
                                                                20.76
223 Thiruvananthapuram
                                   Kerala
                                            52.74 23.0
                                                        78.87
62.12
224
                                    Bihar 52.37 24.0
                  Patna
                                                        74.43
                                                                35.03
65.64
                                Telangana 51.82 25.0 67.25
225
               Warangal
                                                                31.43
72.38
226
                 Ranchi
                                Jharkhand 51.12 26.0
                                                        71.22
                                                                36.61
59.88
227
                  Mandi Himachal Pradesh 51.28 26.0
                                                         76.90
                                                                30.48
63.07
        0I
            Perception
                        year
                 12.01
                        2018
219
     56.55
    51.10
220
                 41.93
                        2018
221
    40.27
                 32.03
                        2018
                 14.73
                        2018
222
     60.61
                 43.47
223
     60.82
                        2018
224
    49.30
                 14.73
                        2018
                 22.59
225
     54.79
                        2018
226
    51.69
                 16.21
                        2018
227
    54.64
                  9.96
                        2018
df combined.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 900 entries, 0 to 899
Data columns (total 12 columns):
#
     Column
                     Non-Null Count
                                     Dtype
 0
     Institute Id
                     900 non-null
                                     object
 1
     Institute Name
                     900 non-null
                                     object
 2
     Citv
                     900 non-null
                                     object
 3
     State
                     900 non-null
                                     object
 4
     Score
                     900 non-null
                                      float64
 5
                     900 non-null
                                     float64
     Rank
 6
    TLR
                     900 non-null
                                     float64
 7
     RPC
                     900 non-null
                                     float64
 8
                                      float64
     G0
                     900 non-null
 9
     0I
                     900 non-null
                                     float64
 10
                     900 non-null
                                     float64
     Perception
 11
     vear
                     900 non-null
                                     object
dtypes: float64(7), object(5)
memory usage: 84.5+ KB
```

The Institute name in 2016 is different from other year datasets so a operation is carried out to make it same.

```
data 2016.head(1)
      Institute Id
                                         Institute Name
City \
0 NIRF-ENGG-INF-77 Indian Institute Of Technology, Madras Chennai
       State Score Rank TLR RPC GO
                                              0I
                                                  Perception
year
0 Tamil Nadu 89.41 1 88.26 94.02 81.81 86.11
                                                          98
2016
data 2017.head(1)
      Institute Id
                                        Institute Name
                                                         City \
0 IR17-ENGG-1-1-77 Indian Institute of Technology Madras Chennai
       State Score Rank TLR RPC
                                        G0
                                              0I
                                                  Perception
year
0 Tamil Nadu 87.96 1 91.85 92.6 83.78 77.19
                                                       81.46
data 2016['Institute Name'] = data 2016['Institute
Name ].str.replace(',', '')
data 2016.head(1)
      Institute Id
                                        Institute Name
0 NIRF-ENGG-INF-77 Indian Institute Of Technology Madras Chennai
       State Score Rank TLR
                                RPC
                                        G0
                                                  Perception
year
0 Tamil Nadu 89.41 1 88.26 94.02 81.81 86.11
                                                          98
2016
```

EXPLORATORY DATA ANALYSIS

```
sns.pairplot(df_combined)
C:\Users\ASUS\anaconda3\Lib\site-packages\seaborn\axisgrid.py:118:
UserWarning: The figure layout has changed to tight
   self._figure.tight_layout(*args, **kwargs)
<seaborn.axisgrid.PairGrid at 0x1bbeab8b350>
```



Mean RPC is low implies research sector is weak in clgs... df_combined.describe() Rank TLR RPC G0 Score / IO count 900.000000 900.000000 900.000000 900.000000 900.000000 900.000000 83.700000 59.289333 26.604467 45.122317 59.949256 mean 54.611733 12.890893 55.335713 10.674734 23.832522 12.112018 std 9.368713

```
30.310000
                     1.000000
                                24.310000
                                              0.170000
                                                          5.460000
min
28.020000
25%
        35.465000
                    38.000000
                                 52.340000
                                              6.960000
                                                         51.617500
48.217500
50%
        40.495000
                    75.000000
                                 57.820000
                                             19.365000
                                                         58,995000
53.505000
75%
        52.755000
                   125.250000
                                64.847500
                                             39.247500
                                                         67.667500
60.335000
        90.190000
                   200.000000
                                95.470000
                                             96.430000
                                                         96.800000
max
86.110000
       Perception
count
       900.000000
        20.129267
mean
std
        24.133590
         0.000000
min
25%
         3.560000
50%
        10.320000
75%
        27.402500
       100.000000
max
sns.distplot(df combined['Rank'])
C:\Users\ASUS\AppData\Local\Temp\ipykernel 13276\3765976300.py:1:
UserWarning:
```

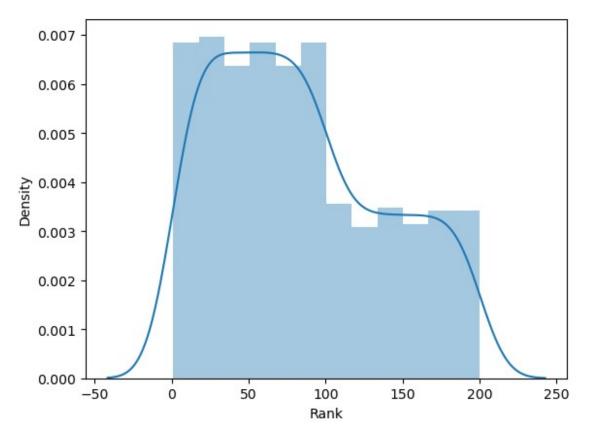
`distplot` is a deprecated function and will be removed in seaborn v0.14.0.

Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms).

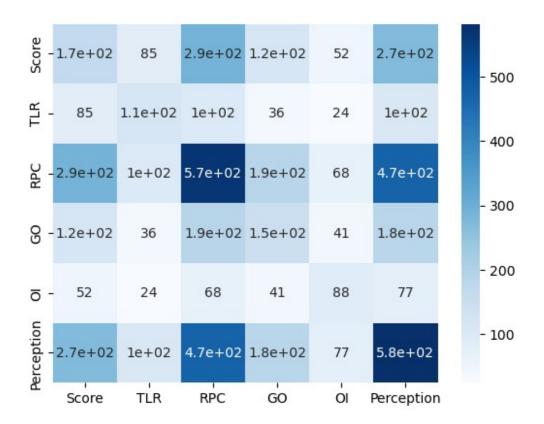
For a guide to updating your code to use the new functions, please see https://gist.github.com/mwaskom/de44147ed2974457ad6372750bbe5751

```
sns.distplot(df combined['Rank'])
```

<Axes: xlabel='Rank', ylabel='Density'>

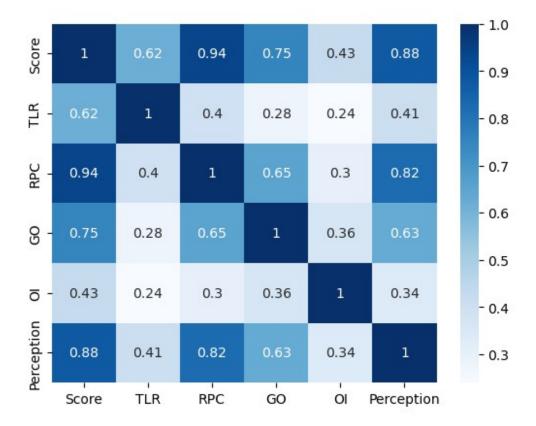


```
df_combined.columns
Index(['Institute Id', 'Institute Name', 'City', 'State', 'Score',
'Rank',
        TLR', 'RPC', 'GO', 'OI', 'Perception', 'year'],
      dtype='object')
df_parameters = df_combined.drop(columns = ['Institute Id', 'Institute
Name', 'City', 'State', 'year', 'Rank'])
df parameters.head()
   Score
            TLR
                   RPC
                           G0
                                  ΟI
                                      Perception
                               86.11
                                            98.0
0 89.41
          88.26
                 94.02
                        81.81
1 87.66
          85.93
                 94.14
                        84.97
                               74.84
                                             99.0
  83.91
          76.23
                 92.68
                        83.95
                               78.05
                                            97.0
3 82.02
          80.27
                 91.62
                        74.72
                               66.17
                                            98.0
4 81.07
         66.08
                 93.52
                        85.62
                               70.59
                                            98.0
covmat = df parameters.cov()
ax = sns.heatmap(covmat, annot = True , cmap = 'Blues')
plt.figure(figsize=(15,15))
plt.show()
```



```
<Figure size 1500x1500 with 0 Axes>

corrmat = df_parameters.corr()
ax = sns.heatmap(corrmat, annot = True , cmap = 'Blues')
plt.figure(figsize=(15,15))
plt.show()
```



<Figure size 1500x1500 with 0 Axes>

Here correlation of rpc with score is 0.94 it implies it greatly affects the overall score.

Liner Regressor

```
X = df_combined[['TLR' , 'RPC' , 'GO' , 'OI' , 'Perception']]
y = df_combined['Score']

from sklearn.model_selection import train_test_split

X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.3, random_state=101)

from sklearn.linear_model import LinearRegression

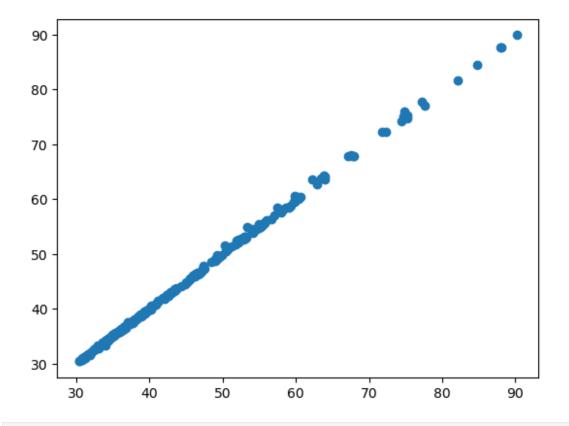
lm = LinearRegression()

lm.fit(X_train,y_train)

LinearRegression()

# print the intercept
print(lm.intercept_)
```

```
-0.37743966713058086
coeff df = pd.DataFrame(lm.coef ,X.columns,columns=['Coefficient'])
coeff df
            Coefficient
TLR
               0.314024
RPC
               0.294388
G0
               0.191477
0I
               0.102426
Perception
               0.098394
predictions = lm.predict(X_test)
plt.scatter(y_test,predictions)
<matplotlib.collections.PathCollection at 0x1bbef772990>
```



sns.distplot((y_test-predictions),bins=50);
C:\Users\ASUS\AppData\Local\Temp\ipykernel_13276\1326397652.py:1:
UserWarning:

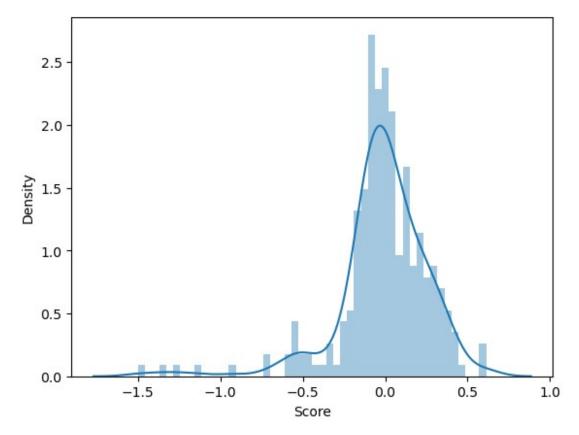
'distplot' is a deprecated function and will be removed in seaborn v0.14.0.

```
Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms).

For a guide to undating your code to use the new functions, please see
```

For a guide to updating your code to use the new functions, please see https://gist.github.com/mwaskom/de44147ed2974457ad6372750bbe5751

sns.distplot((y_test-predictions),bins=50);



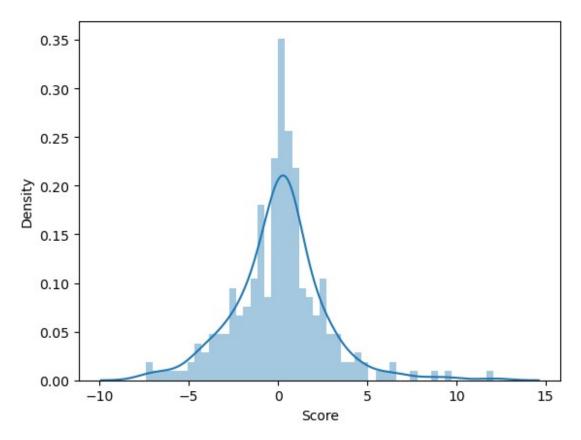
```
from sklearn import metrics

print('MAE:', metrics.mean_absolute_error(y_test, predictions))
print('MSE:', metrics.mean_squared_error(y_test, predictions))
print('RMSE:', np.sqrt(metrics.mean_squared_error(y_test, predictions)))

MAE: 0.18383221952155035
MSE: 0.07726423877762947
RMSE: 0.27796445596088265
```

Decision Tree Regressor

```
from sklearn.tree import DecisionTreeRegressor
dtree = DecisionTreeRegressor()
dtree.fit(X_train,y_train)
DecisionTreeRegressor()
pred1 = dtree.predict(X test)
sns.distplot((y_test-pred1),bins=50);
C:\Users\ASUS\AppData\Local\Temp\ipykernel 13276\3993809026.py:2:
UserWarning:
`distplot` is a deprecated function and will be removed in seaborn
v0.14.0.
Please adapt your code to use either `displot` (a figure-level
function with
similar flexibility) or `histplot` (an axes-level function for
histograms).
For a guide to updating your code to use the new functions, please see
https://gist.github.com/mwaskom/de44147ed2974457ad6372750bbe5751
  sns.distplot((y_test-pred1),bins=50);
```



```
print('MAE:', metrics.mean_absolute_error(y_test, pred1))
print('MSE:', metrics.mean_squared_error(y_test, pred1))
print('RMSE:', np.sqrt(metrics.mean_squared_error(y_test, pred1)))

MAE: 1.7854444444444442
MSE: 6.59323
RMSE: 2.5677285682096542
```

Random Forest Regressor

```
from sklearn.ensemble import RandomForestRegressor
rfc = RandomForestRegressor(n_estimators=100)
rfc.fit(X_train, y_train)

RandomForestRegressor()

rfc_pred = rfc.predict(X_test)

sns.distplot((y_test-pred1),bins=50);

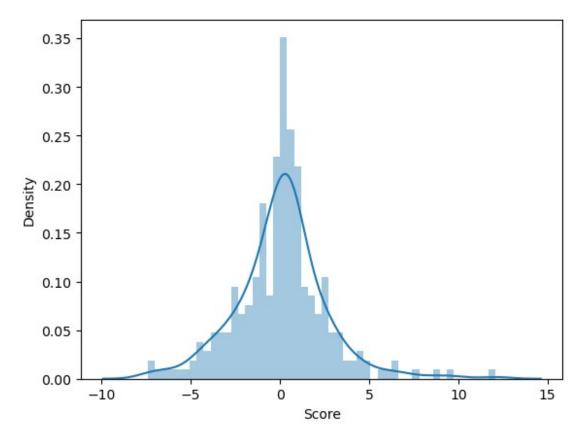
C:\Users\ASUS\AppData\Local\Temp\ipykernel_13276\172980259.py:1:
UserWarning:
```

`distplot` is a deprecated function and will be removed in seaborn v0.14.0.

Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms).

For a guide to updating your code to use the new functions, please see https://gist.github.com/mwaskom/de44147ed2974457ad6372750bbe5751

sns.distplot((y test-pred1),bins=50);

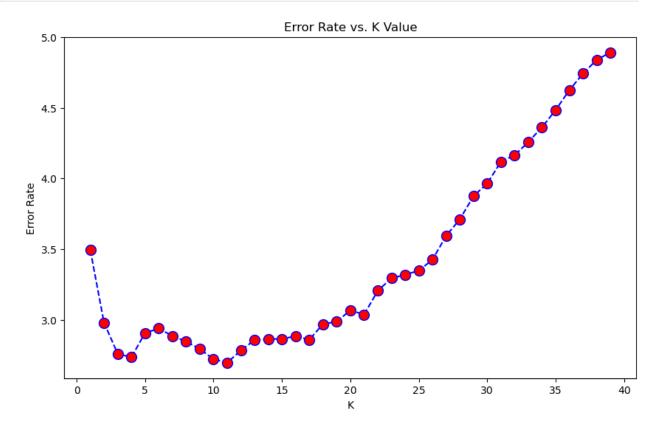


```
print('MAE:', metrics.mean_absolute_error(y_test, rfc_pred))
print('MSE:', metrics.mean_squared_error(y_test, rfc_pred))
print('RMSE:', np.sqrt(metrics.mean_squared_error(y_test, rfc_pred)))

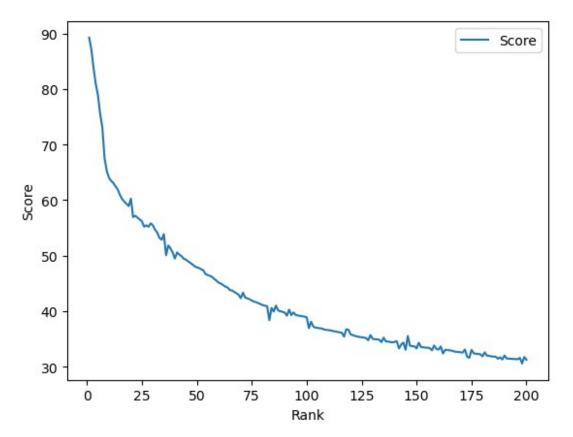
MAE: 1.0658215925925947
MSE: 2.530237056329273
RMSE: 1.5906718883318687
```

KNN Regressor

```
from sklearn.neighbors import KNeighborsRegressor
error rate = []
for i in range(1,40):
    knn = KNeighborsRegressor(n neighbors=i)
    knn.fit(X_train,y_train)
    pred_i = \overline{knn.predict}(X test)
    \exp \bar{i} = list(y test)
    error rate.append((np.square(np.subtract(pred i, exp i))).mean())
plt.figure(figsize=(10,6))
plt.plot(range(1,40),error_rate,color='blue', linestyle='dashed',
marker='o',
         markerfacecolor='red', markersize=10)
plt.title('Error Rate vs. K Value')
plt.xlabel('K')
plt.ylabel('Error Rate')
Text(0, 0.5, 'Error Rate')
```



```
# for k = 19
knn = KNeighborsRegressor(n_neighbors=19)
knn.fit(X_train,y_train)
pred2 = knn.predict(X test)
print('WITH K=19')
print('\n')
print('MAE:', metrics.mean_absolute_error(y_test, pred2))
print('MSE:', metrics.mean_squared_error(y_test, pred2))
print('RMSE:', np.sqrt(metrics.mean squared error(y test, pred2)))
WITH K=19
MAE: 1.1800072124756336
MSE: 2.9860027697240166
RMSE: 1.7280054310458681
df_score_rank = df_combined[['Score' , 'Rank']]
df rel score_rank = df_score_rank.groupby('Rank').mean()
df_rel_score_rank.plot(kind = 'line' , ylabel = 'Score')
<Axes: xlabel='Rank', ylabel='Score'>
```



Comparison of Regression Models

```
test values = [83.50, 89.80, 78.00, 65.50, 94.0]
arr = np.asarray(test values)
y predict = lm.predict(arr.reshape(1,-1))
print('Predicted score: ', y_predict[0])
rank score = df rel score rank.values # extract the ranks and
scores from the dataframe
pos, value = min(enumerate(rank score), key=lambda x:
y predict[0]<=x[1]) # to predict the rank by interpolation
print('Predicted rank: ',pos+1)
Predicted score: 83.17274823359435
Predicted rank: 4
C:\Users\ASUS\anaconda3\Lib\site-packages\sklearn\base.py:464:
UserWarning: X does not have valid feature names, but LinearRegression
was fitted with feature names
 warnings.warn(
arr = np.asarray(test values)
y predict = dtree.predict(arr.reshape(1,-1))
print('Predicted score: ', y predict[0])
pos, value = min(enumerate(rank score), key=lambda x:
y_predict[0]<=x[1]) # to predict the rank by interpolation</pre>
print('Predicted rank: ',pos+1)
Predicted score: 87.66
Predicted rank: 2
C:\Users\ASUS\anaconda3\Lib\site-packages\sklearn\base.py:464:
UserWarning: X does not have valid feature names, but
DecisionTreeRegressor was fitted with feature names
 warnings.warn(
arr = np.asarray(test values)
v predict = rfc.predict(arr.reshape(1,-1))
print('Predicted score: ', y predict[0])
pos, value = min(enumerate(rank_score), key=lambda x:
y predict[0] \le x[1]) # to predict the rank by interpolation
print('Predicted rank: ',pos+1)
```

```
Predicted score: 84.6031
Predicted rank: 3
C:\Users\ASUS\anaconda3\Lib\site-packages\sklearn\base.py:464:
UserWarning: X does not have valid feature names, but
RandomForestRegressor was fitted with feature names
 warnings.warn(
arr = np.asarray(test_values)
y predict = knn.predict(arr.reshape(1,-1))
print('Predicted score: ', y predict[0])
pos, value = min(enumerate(rank score), key=lambda x:
y predict[0] \le x[1]) # to predict the rank by interpolation
print('Predicted rank: ',pos+1)
Predicted score: 84.28684210526318
Predicted rank: 3
C:\Users\ASUS\anaconda3\Lib\site-packages\sklearn\base.py:464:
UserWarning: X does not have valid feature names, but
KNeighborsRegressor was fitted with feature names
 warnings.warn(
```

As from above we can comprehend that the Mean absolute error(MAE) and Root mean squared error(RMSE) of Linear Regressor is least, so it is best suited model for prediction of rank.

Final NIRF Rank predictor model

```
test_values = [83.50, 89.80, 78.00, 65.50, 94.0]
arr = np.asarray(test_values)
y_predict = lm.predict(arr.reshape(1,-1))
print('Predicted score: ', y_predict[0])
rank_score = df_rel_score_rank.values  # extract the ranks and
scores from the dataframe

pos, value = min(enumerate(rank_score), key=lambda x:
y_predict[0]<=x[1]) # to predict the rank by interpolation

print('Predicted rank: ',pos+1)

Predicted score: 83.17274823359435
Predicted rank: 4

C:\Users\ASUS\anaconda3\Lib\site-packages\sklearn\base.py:464:
UserWarning: X does not have valid feature names, but LinearRegression
was fitted with feature names
    warnings.warn(</pre>
```