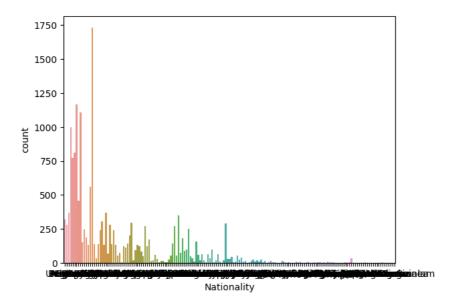
```
guglielmo-basile-ikz8R6LGbK8-unsplash_1619513153581_1619513171760.jpg
  In [ ]: #predicting the overall rating of the players in the fifa game utilizing the data of fifa21
           import pandas as pd
           import numpy as np
           import matplotlib.pyplot as plt
           import seaborn as sns
           df=pd.read_csv('/content/FIFA21_official_data.csv')
Out [62]:
                       ID
                                Name Age
                                                                                      Photo Nationality
                                                                                                                                       Flag Overal
               0 176580 L. Suárez
                                        33
                                             https://cdn.sofifa.com/players/176/580/20_60.png
                                                                                              Uruguay
                                                                                                          https://cdn.sofifa.com/flags/uy.png
                            K. De
               1 192985
                                        29
                                             https://cdn.sofifa.com/players/192/985/20_60.png
                                                                                             Belgium
                                                                                                          https://cdn.sofifa.com/flags/be.png
                                                                                                                                             91
                           Bruvne
                            Bruno
               2 212198
                                        25
                                             https://cdn.sofifa.com/players/212/198/20_60.png
                                                                                              Portugal
                                                                                                          https://cdn.sofifa.com/flags/pt.png
                                                                                                                                             87
                            Fernandes
               3 194765
                                             https://cdn.sofifa.com/players/194/765/20_60.png
                                                                                                          https://cdn.sofifa.com/flags/fr.png
                                        29
                                                                                             France
                                                                                                                                             87
                            Griezmann
                  224334
                           M. Acuña
                                        28
                                             https://cdn.sofifa.com/players/224/334/20_60.png Argentina
                                                                                                          https://cdn.sofifa.com/flags/ar.png
                            19 C.
           17103 247866
                                             https://cdn.sofifa.com/players/247/866/19_60.png
                                        16
                                                                                             Poland
                                                                                                          https://cdn.sofifa.com/flags/pl.png
                                                                                                                                             50
                            Miszta
           17104 251433 B. Voll
                                        19
                                             https://cdn.sofifa.com/players/251/433/20_60.png
                                                                                              Germany
                                                                                                          https://cdn.sofifa.com/flags/de.png
                                                                                                                                             51
                                                                                                          https://cdn.sofifa.com/flags/gb-
                                                                                              Northern
           17105 252420 T. Parker
                                        18
                                             https://cdn.sofifa.com/players/252/420/20_60.png
                                                                                                                                             51
                                                                                              Ireland
                                                                                                          nir.png
           17106 248182 H. Sveijer
                                        18
                                             https://cdn.sofifa.com/players/248/182/20_60.png
                                                                                                          https://cdn.sofifa.com/flags/se.png
                                                                                                                                             49
                                                                                              Sweden
           17107 245862 19 J. Milli
                                             https://cdn.sofifa.com/players/245/862/19_60.png
                                                                                              Italy
                                                                                                          https://cdn.sofifa.com/flags/it.png
          17108 rows × 65 columns
  In [ 1:
          df.isna().sum()
                                   0
Out [63]: ID
          Name
                                   0
          Photo
                                   0
          Nationality
          GKReflexes
                                   0
          Best Position
Best Overall Rating
                                   0
          Release Clause
                                1629
          DefensiveAwareness
          Length: 65, dtype: int64
  In [ ]: | df['Club'].isna().sum()
Out [64]: 325
  In [ ]: df.head()
Out [65]:
                   ID
                           Name Age
                                                                                  Photo Nationality
                                                                                                                                  Flag Overall
                                                                                                                                                Po
           0 176580 L. Suárez
                                   33
                                         https://cdn.sofifa.com/players/176/580/20_60.png
                                                                                                     https://cdn.sofifa.com/flags/uy.png
                                                                                                                                                87
                                                                                         Uruguay
                       K. De
           1 192985
                                         https://cdn.sofifa.com/players/192/985/20_60.png Belgium
                                                                                                     https://cdn.sofifa.com/flags/be.png
                                                                                                                                                91
                                   29
                       Bruyne
                       Bruno
           2 212198
                                   25
                                         https://cdn.sofifa.com/players/212/198/20_60.png
                                                                                         Portugal
                                                                                                     https://cdn.sofifa.com/flags/pt.png
                                                                                                                                        87
                                                                                                                                                90
                       Fernandes
           3 194765
                                   29
                                         https://cdn.sofifa.com/players/194/765/20_60.png France
                                                                                                     https://cdn.sofifa.com/flags/fr.png
                                                                                                                                        87
                                                                                                                                                87
                       Griezmann
             224334 M. Acuña
                                   28
                                         https://cdn.sofifa.com/players/224/334/20_60.png Argentina
                                                                                                     https://cdn.sofifa.com/flags/ar.png
                                                                                                                                                83
          5 rows × 65 columns
```

In []: df.tail()

Out [71]: <Axes: xlabel='Nationality', ylabel='count'>

.00].		ID	Name	Age				Photo	Nationa	lity		Flag	Overall
,	17103	247866	19 C. Miszta	16	https://d	cdn.sofifa.com/p	layers/247/866/1	19_60.png	Poland	https://c	dn.sofifa.com/fla	ags/pl.png	50
	17104	251433	B. Voll	19	https://d	cdn.sofifa.com/p	layers/251/433/2	20_60.png	German	y https://c	dn.sofifa.com/fla	ags/de.png	51
	17105	252420	Т.	18	https://o	cdn sofifa com/p	layers/252/420/2	20 60 png	Norther		dn.sofifa.com/fla	ags/gb-	51
			Parker H.		·	·			Ireland	nir.png			
	17106	248182	Sveijer	18	https://d	cdn.sofifa.com/p	layers/248/182/2	20_60.png	Sweden	https://c	dn.sofifa.com/fla	ags/se.png	49
	17107	245862	19 J. Milli	18	https://d	cdn.sofifa.com/p	layers/245/862/1	19_60.png	Italy	https://c	dn.sofifa.com/fla	ags/it.png	47
	5 rows ×	65 colum	ns										
]:	df.des	scribe()											
]:			ID		Age	Overall	Potential	Sp	ecial	International Reputation	Weak Foot	Skill Mo	res
	count	17108.00	00000	17108	.000000	17108.000000	17108.000000	17108.00	0000 1	7108.000000	17108.000000	17108.0000	00 17
	mean	221421.2	276187	25.053	3718	66.780161	72.553542	1625.722	995 1.	147533	2.981938	2.446107	20
	std	36028.78	36065	4.9159	963	7.019069	5.738347	263.5039	22 0.	.455773	0.674699	0.780278	17
	min	2.000000		16.000	0000	38.000000	46.000000	731.0000	00 1.	.000000	1.000000	1.000000	1.
	25%	205451.7	750000	21.000	0000	62.000000	69.000000	1484.000	000 1.	.000000	3.000000	2.000000	9.
	50%	230441.0		24.000	0000	67.000000	72.000000	1653.000	000 1.	.000000	3.000000	2.000000	18
	75%	245402.5	500000	28.000	0000	72.000000	76.000000	1810.000	000 1.	.000000	3.000000	3.000000	27
:	df.dty	/pes											
í	ID Name Age Photo National	ity	(int64 object int64 object object									
	Release Defensiv	ition erall Rati	fi ing fi iss fi	loat64 object loat64 object loat64									
:	df.sha	эре											
:	(17108,	65)											
:	newdf=	df['Nat	ionali	ty'].	value_c	ounts()							
:	England Germany Spain France Brazil	11 11 9	730 166 106 997 311										
	Tanzania Rwanda Suriname Puerto R Oman Name: Na	<u>:</u>	 1 1 1 1 1 1, Lengtl	h: 169,	dtype:	int64							
]:	# This	s visual	izatio	n help	os us g	ain insights	into the com	position	of pla	yers from	different cou	untries in	the
	sns.co	ountplot	(x='Na	tiona	lity'.d	ata=df)							
				,_3	, , u	,							



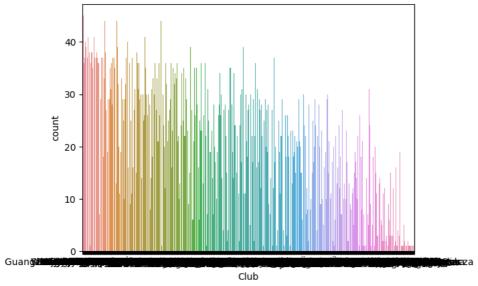
```
In [ ]: nd=df['Club'].value_counts()
    nd
```

Out [72]: Manchester United Bolton Wanderers 44
Crystal Palace 44
Arsenal 44
AS Monaco 44

Associação Académica de Coimbra 1
Carpi 1
SC Fortuna Köln 1
Siena 1
Sakaryaspor 1
Name: Club, Length: 843, dtype: int64

In []: # countplot of player distribution among clubs
sns.countplot(x='Club',data=df)

Out [73]: <Axes: xlabel='Club', ylabel='count'>



```
In [ ]: nd=df['Potential'].value_counts()
nd
```

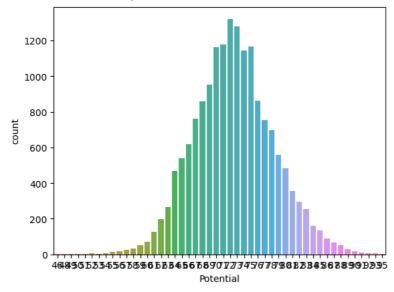
```
Out [74]: 72 1321
73 1277
71 1177
75 1167
70 1161
74 1143
69 953
76 863
68 859
67 761
77 754
78 696
66 620
79 560
65 539
80 484
```

```
64 469
81 357
82 295
63 264
83 256
62 196
84 161
85 134
61 127
86 90
60 72
87 68
88 52
59 52
58 34
89 29
57 24
90 18
56 16
55 14
91 12
93 7
92 5
52 5
54 5
55 5
54 5
55 1
58 3
48 3
95 1
49 1
46 1
51 1
53 1
Name: Potential, dtype: int64
```

In []: # identify the prevalence of different potential levels among players in the game

sns.countplot(x='Potential',data=df)

Out [75]: <Axes: xlabel='Potential', ylabel='count'>

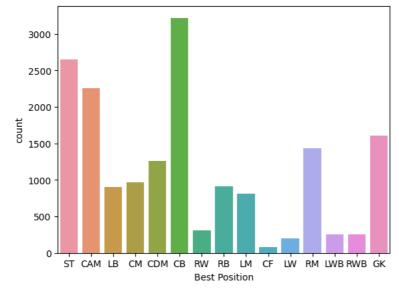


```
Out [76]: CB 3219
    ST 2652
    CAM 2255
    GK 1603
    RM 1432
    CDM 1260
    CM 963
    RB 914
    LB 907
    LM 814
    RW 308
    RWB 251
    LWB 250
    LW 196
    CF 84
    Name: Best Position, dtype: int64
```

In []: # This visualization serves as a fundamental resource for understanding the distribution of player positions

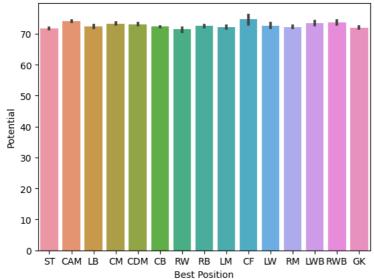
sns.countplot(x='Best Position',data=df)

Out [77]: <Axes: xlabel='Best Position', ylabel='count'>



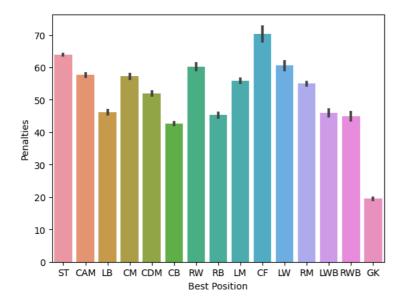
In []: # A barplot is an ideal choice for this analysis because it allows us to compare the average potential ratir
sns.barplot(x='Best Position',y='Potential',data=df)

Out [78]: <Axes: xlabel='Best Position', ylabel='Potential'>



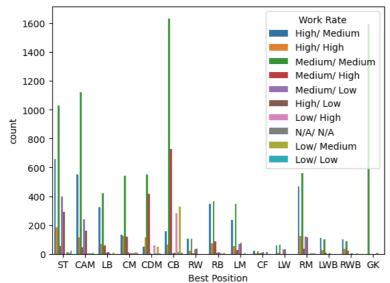
In []:
 # compare the average penalty-taking ratings (y-axis) for each unique best playing position (x-axis)
 sns.barplot(x='Best Position',y='Penalties',data=df)

Out [79]: <Axes: xlabel='Best Position', ylabel='Penalties'>



In []: # it counts and represents the occurrences of each unique best playing position (x-axis) while further disti
sns.countplot(x='Best Position',data=df,hue='Work Rate')

Out [80]: <Axes: xlabel='Best Position', ylabel='count'>



Out	[81]	:

:	Nationality_Albania	Nationality_Algeria	Nationality_Andorra	Nationality_Angola	Nationality_Antigua & Barbuda	Nationality_Argentina	Nationa
0	0	0	0	0	0	0	0
1	0	0	0	0	0	0	0
2	0	0	0	0	0	0	0
3	0	0	0	0	0	0	0
4	0	0	0	0	0	1	0
17103	0	0	0	0	0	0	0
17104	0	0	0	0	0	0	0
17105	0	0	0	0	0	0	0
17106	0	0	0	0	0	0	0
17107	0	0	0	0	0	0	0

17108 rows × 1034 columns

In []: dfe=pd.concat([df,df1],axis=1)
 dfe

Out [82]:

	ID	Name	Age	Photo	Nationality	Flag	Overall
0	176580	L. Suárez	33	https://cdn.sofifa.com/players/176/580/20_60.png	Uruguay	https://cdn.sofifa.com/flags/uy.png	87
1	192985	K. De Bruyne	29	https://cdn.sofifa.com/players/192/985/20_60.png	Belgium	https://cdn.sofifa.com/flags/be.png	91
2	212198	Bruno Fernandes	25	https://cdn.sofifa.com/players/212/198/20_60.png	Portugal	https://cdn.sofifa.com/flags/pt.png	87
3	194765	A. Griezmann	29	https://cdn.sofifa.com/players/194/765/20_60.png	France	https://cdn.sofifa.com/flags/fr.png	87
4	224334	M. Acuña	28	https://cdn.sofifa.com/players/224/334/20_60.png	Argentina	https://cdn.sofifa.com/flags/ar.png	83
17103	247866	19 C. Miszta	16	https://cdn.sofifa.com/players/247/866/19_60.png	Poland	https://cdn.sofifa.com/flags/pl.png	50
17104	251433	B. Voll	19	https://cdn.sofifa.com/players/251/433/20_60.png	Germany	https://cdn.sofifa.com/flags/de.png	51
17105	252420	T. Parker	18	https://cdn.sofifa.com/players/252/420/20_60.png	Northern Ireland	https://cdn.sofifa.com/flags/gb- nir.png	51
17106	248182	H. Sveijer	18	https://cdn.sofifa.com/players/248/182/20_60.png	Sweden	https://cdn.sofifa.com/flags/se.png	49
17107	245862	19 J. Milli	18	https://cdn.sofifa.com/players/245/862/19_60.png	Italy	https://cdn.sofifa.com/flags/it.png	47

17108 rows × 1099 columns

In []: dfe=dfe.drop(['Club','Name','Nationality','Work Rate','Best Position','ID','Photo','Flag','Club Logo','Speci
dfe

Out [83]:

: _		Age	Overall	Potential	Value	Wage	Weak Foot	Skill Moves	Height	Weight	Crossing	 Best Position_LB	Best Position_LM	Best Position_LW	ı
	0	33	87	87	€31.5M	€115K	4.0	3.0	6'0	190lbs	80.0	 0	0	0	(
	1	29	91	91	€87M	€370K	5.0	4.0	5'11	154lbs	94.0	 0	0	0	(
	2	25	87	90	€63M	€195K	4.0	4.0	5'10	152lbs	87.0	 0	0	0	(
	3	29	87	87	€50.5M	€290K	3.0	4.0	5'9	161lbs	83.0	 0	0	0	(
	4	28	83	83	€22M	€41K	3.0	4.0	5'8	152lbs	87.0	 1	0	0	(
	17103	16	50	70	€50K	€500	3.0	1.0	6'4	176lbs	14.0	 0	0	0	(
	17104	19	51	63	€50K	€500	2.0	1.0	6'5	187lbs	8.0	 0	0	0	(
	17105	18	51	70	€60K	€500	3.0	1.0	6'3	176lbs	10.0	 0	0	0	(
	17106	18	49	63	€50K	€500	2.0	1.0	6'1	168lbs	10.0	 0	0	0	(
	17107	18	47	65	€50K	€500	3.0	1.0	6'0	172lbs	10.0	 0	0	0	(

17108 rows × 1078 columns

In []:
 dfe['Value']=dfe['Value'].str.replace('€', '')
 dfe['Value']=dfe['Value'].str.replace('M', '')
 dfe['Value']=dfe['Value'].str.replace('K', '')
 dfe

Out [84]:

:		Age	Overall	Potential	Value	Wage	Weak Foot	Skill Moves	Height	Weight	Crossing	 Best Position_LB	Best Position_LM	Best Position_LW	Po
	0	33	87	87	31.5	€115K	4.0	3.0	6'0	190lbs	80.0	 0	0	0	0
	1	29	91	91	87	€370K	5.0	4.0	5'11	154lbs	94.0	 0	0	0	0
	2	25	87	90	63	€195K	4.0	4.0	5'10	152lbs	87.0	 0	0	0	0
	3	29	87	87	50.5	€290K	3.0	4.0	5'9	161lbs	83.0	 0	0	0	0
	4	28	83	83	22	€41K	3.0	4.0	5'8	152lbs	87.0	 1	0	0	0
	17103	16	50	70	50	€500	3.0	1.0	6'4	176lbs	14.0	 0	0	0	0
	17104	19	51	63	50	€500	2.0	1.0	6'5	187lbs	8.0	 0	0	0	0
	17105	18	51	70	60	€500	3.0	1.0	6'3	176lbs	10.0	 0	0	0	0
	17106	18	49	63	50	€500	2.0	1.0	6'1	168lbs	10.0	 0	0	0	0
	17107	18	47	65	50	€500	3.0	1.0	6'0	172lbs	10.0	 0	0	0	0
															(

17108 rows × 1078 columns

 dfe

Out [85]:

:		Age	Overall	Potential	Value	Wage	Weak Foot	Skill Moves	Height	Weight	Crossing	 Best Position_LB	Best Position_LM	Best Position_LW	Pos
Ī	0	33	87	87	31.5	115	4.0	3.0	6'0	190lbs	80.0	 0	0	0	0
	1	29	91	91	87	370	5.0	4.0	5'11	154lbs	94.0	 0	0	0	0
	2	25	87	90	63	195	4.0	4.0	5'10	152lbs	87.0	 0	0	0	0
	3	29	87	87	50.5	290	3.0	4.0	5'9	161lbs	83.0	 0	0	0	0
	4	28	83	83	22	41	3.0	4.0	5'8	152lbs	87.0	 1	0	0	0
	17103	16	50	70	50	500	3.0	1.0	6'4	176lbs	14.0	 0	0	0	0
	17104	19	51	63	50	500	2.0	1.0	6'5	187lbs	8.0	 0	0	0	0
	17105	18	51	70	60	500	3.0	1.0	6'3	176lbs	10.0	 0	0	0	0
	17106	18	49	63	50	500	2.0	1.0	6'1	168lbs	10.0	 0	0	0	0
	17107	18	47	65	50	500	3.0	1.0	6'0	172lbs	10.0	 0	0	0	0

17108 rows × 1078 columns

Out [86]:

:		Age	Overall	Potential	Value	Wage	Weak Foot	Skill Moves	Height	Weight	Crossing	 Best Position_LB	Best Position_LM	Best Position_LW	Pos
	0	33	87	87	31.5	115	4.0	3.0	6.0	190lbs	80.0	 0	0	0	0
	1	29	91	91	87	370	5.0	4.0	5.11	154lbs	94.0	 0	0	0	0
	2	25	87	90	63	195	4.0	4.0	5.10	152lbs	87.0	 0	0	0	0
	3	29	87	87	50.5	290	3.0	4.0	5.9	161lbs	83.0	 0	0	0	0
	4	28	83	83	22	41	3.0	4.0	5.8	152lbs	87.0	 1	0	0	0
	17103	16	50	70	50	500	3.0	1.0	6.4	176lbs	14.0	 0	0	0	0
	17104	19	51	63	50	500	2.0	1.0	6.5	187lbs	8.0	 0	0	0	0
	17105	18	51	70	60	500	3.0	1.0	6.3	176lbs	10.0	 0	0	0	0
	17106	18	49	63	50	500	2.0	1.0	6.1	168lbs	10.0	 0	0	0	0
	17107	18	47	65	50	500	3.0	1.0	6.0	172lbs	10.0	 0	0	0	0

17108 rows × 1078 columns

In []: dfe['Weight']=dfe['Weight'].str.replace("lbs"," ")
dfa

Out [87]:

:		Age	Overall	Potential	Value	Wage	Weak Foot	Skill Moves	Height	Weight	Crossing	 Best Position_LB	Best Position_LM	Best Position_LW	Pos
	0	33	87	87	31.5	115	4.0	3.0	6.0	190	80.0	 0	0	0	0
	1	29	91	91	87	370	5.0	4.0	5.11	154	94.0	 0	0	0	0
	2	25	87	90	63	195	4.0	4.0	5.10	152	87.0	 0	0	0	0
	3	29	87	87	50.5	290	3.0	4.0	5.9	161	83.0	 0	0	0	0
	4	28	83	83	22	41	3.0	4.0	5.8	152	87.0	 1	0	0	0
1710	3	16	50	70	50	500	3.0	1.0	6.4	176	14.0	 0	0	0	0
1710	4	19	51	63	50	500	2.0	1.0	6.5	187	8.0	 0	0	0	0
1710	5	18	51	70	60	500	3.0	1.0	6.3	176	10.0	 0	0	0	0
1710	6	18	49	63	50	500	2.0	1.0	6.1	168	10.0	 0	0	0	0
1710	7	18	47	65	50	500	3.0	1.0	6.0	172	10.0	 0	0	0	0

17108 rows × 1078 columns

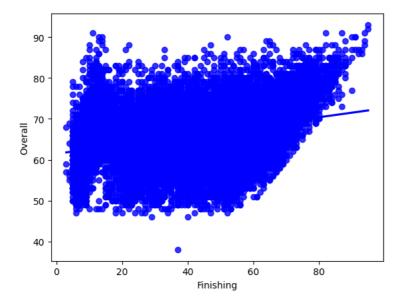
In []: dfe.dtypes

Out [88]: Age int64
Overall int64
Potential int64
Value object
Wage object
...
Best Position_RM uint8
Best Position_RW uint8
Best Position_RWB uint8

```
Preferred Foot_Right
                                  uint8
         Length: 1078, dtype: object
  In [ ]: | dfe['Wage']=dfe['Wage'].astype(float)
          dfe['Value']=dfe['Value'].astype(float)
           dfe['Height']=dfe['Height'].astype(float)
           dfe['Weight']=dfe['Weight'].astype(float)
          dfe.dtypes
Out [89]: Age
                                   int64
          0verall
                                   int64
int64
          Potential
         Value
                                 float64
         Wage
                                 float64
                                   uint8
         Best Position RM
         Best Position_RW
Best Position_RWB
                                    uint8
                                   uint8
         Best Position_ST
Preferred Foot_Right
                                    uint8
                                   uint8
         Length: 1078, dtype: object
  In [ ]: dfe.isna().sum()
Out [90]: Age
                                 0
                                 0
         0verall
         Potential
                                 0
          Value
         Wage
                                 0
                                 0
         Best Position_RM
Best Position_RW
         Best Position_RWB
Best Position_ST
                                 0
         Preferred Foot_Right
         Length: 1078, dtype: int64
  In [ ]: dfe['DefensiveAwareness'].isna().sum()
Out [91]: 942
  In [ ]: | dfe.loc[dfe.Value==0,'Value']=np.NAN
           dfe.loc[dfe.Wage==0,'Wage']=np.NAN
          dfe.isna().sum()
Out [92]: Age
         Overall
                                   n
          Potential
                                 409
         Value
                                 380
         Wage
                                ...
         Best Position_RM
         Best Position_RW
Best Position_RWB
                                   0
         Rest Position ST
                                   n
          Preferred Foot_Right
         Length: 1078, dtype: int64
  In [ ]: | dfe['Value']=dfe['Value'].fillna(dfe['Value'].mean())
          dfe['DefensiveAwareness']=dfe['DefensiveAwareness'].fillna(dfe['DefensiveAwareness'].mode()[0])
           dfe['Wage']=dfe['Wage'].fillna(dfe['Wage'].mean())
          dfe.isna().sum()
Out [93]: Age
Overall
                                 0
         Potential
Value
                                 0
         Wage
                                 0
                                 0
         Best Position RM
         Best Position_RW
         Best Position_RWB
Best Position_ST
                                 0
         Preferred Foot_Right 0
Length: 1078, dtype: int64
  In [ ]: | dfe= dfe.fillna(0)
  In [ ]: | x=dfe.drop(['Overall'],axis=1)
          y=dfe['Overall']
  In [ ]: from sklearn.model_selection import train_test_split
           xtrain,xtest,ytrain,ytest=train_test_split(x,y,test_size=.30,random_state=42)
  In [ ]: | sns.regplot(x=dfe['Finishing'],y=y,color='blue')
Out [97]: <Axes: xlabel='Finishing', ylabel='Overall'>
```

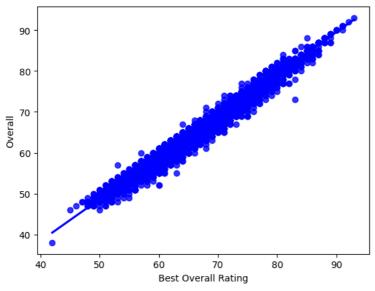
Rest Position ST

uint8



In []: sns.regplot(x=dfe['Best Overall Rating'],y=y,color='blue')

Out [98]: <Axes: xlabel='Best Overall Rating', ylabel='Overall'>



SIMPLE LINEAR REGRESSION

```
from sklearn.linear_model import LinearRegression
model=LinearRegression()
model.fit(xtrain,ytrain)
ypred=model.predict(xtest)
ypred
```

Out [99]: array([70.52409475, 65.18623825, 71.30323951, ..., 71.89032842, 70.3503439 , 68.60023982])

In []: from sklearn.metrics import mean_absolute_error
 print('mae',mean_absolute_error(ytest,ypred))

mae 0.6504289769623379

In []: from sklearn.metrics import mean_absolute_percentage_error
print("error percentage is ",mean_absolute_percentage_error(ytest,ypred))

error percentage is 0.009903543857174927

from sklearn.metrics import mean_squared_error
print("mse is ",mean_squared_error(ytest,ypred))

mse is 0.7838686957187891

```
Out [103]: 0.8853635952075222
  In [ ]: from sklearn.metrics import r2_score
          slr2=r2_score(ytest,ypred)
          print('r2 score is',slr2)
         r2 score is 0.984032392127196
         Random Forest
  In [ ]: from sklearn.ensemble import RandomForestRegressor
          reg = RandomForestRegressor()
          reg.fit(xtrain, ytrain)
Out [105]: RandomForestRegressor
         RandomForestRegressor()
  In [ ]: reg.score(xtest, ytest)
Out [106]: 0.9950703724690045
  In [ ]: reg.score(xtrain, ytrain)
Out [107]: 0.9992168538270579
  In [ ]: ypred2= reg.predict(xtest)
          ypred2
Out [108]: array([71. , 64.92, 71.8 , ..., 72. , 71.91, 67.95])
  In [ ]: from sklearn.metrics import mean_absolute_error
          print('mae',mean_absolute_error(ytest,ypred2))
         mae 0.27849795441262426
  In [ ]: from sklearn.metrics import mean_absolute_percentage_error
          print("error percentage is ",mean_absolute_percentage_error(ytest,ypred2))
         error percentage is 0.004309717958739423
  In [ ]: from sklearn.metrics import mean_squared_error
          print("mse is ",mean_squared_error(ytest,ypred2))
         mse is 0.24200122735242552
  In [ ]: | numbu=mean_squared_error(ytest,ypred2)
          np.sqrt(numbu)
Out [112]: 0.4919362025226701
  In [ ]: from sklearn.metrics import r2_score
          rfr2=r2_score(ytest,ypred2)
          print('r2 score is',rfr2)
         r2 score is 0.9950703724690045
         Decision tree
  In [ ]: from sklearn.tree import DecisionTreeRegressor
          dtr= DecisionTreeRegressor()
          dtr.fit(xtrain,ytrain)
Out [114]: DecisionTreeRegressor
         DecisionTreeRegressor()
  In [ ]: dtr.score(xtest, ytest)
Out [115]: 0.9897573277040124
  In [ ]: ypred3=dtr.predict(xtest)
  In [ ]: ypred3
Out [117]: array([71., 65., 71., ..., 72., 72., 68.])
```

```
In [ ]: from sklearn.metrics import mean_absolute_error
       print('mae',mean_absolute_error(ytest,ypred3))
      mae 0.30995519189557763
In [ ]: from sklearn.metrics import mean_absolute_percentage_error
       print("error percentage is ",mean_absolute_percentage_error(ytest,ypred3))
      error percentage is 0.004825143164415268
In [ ]: from sklearn.metrics import mean_squared_error
       print("mse is ",mean_squared_error(ytest,ypred3))
      mse is 0.5028248587570622
In [ ]: from sklearn.metrics import mean_squared_error
       print("mse is ",mean_squared_error(ytest,ypred3))
      mse is 0.5028248587570622
In [ ]: | from sklearn.metrics import r2_score
       dtr2=r2_score(ytest,ypred3)
       print('r2 score is',dtr2)
      r2 score is 0.9897573277040124
      CONCLUSION
```

all the above models have same accuracy.however random forest regression model is slightly better than the other three models