In [1]: import numpy as np import pandas as pd import matplotlib.pyplot as plt import seaborn as sns In [2]: df = pd.read csv('Forbes Richest Athleetes (Forbes Richest Athletes 1990-2020).csv') S.NO Out[2]: Name Nationality Current Rank Previous Year Rank Sport Year earnings (\$ million) 0 Mike Tyson USA 1 1990 28.6 boxing 2 2 1 **Buster Douglas** USA NaN boxing 1990 26.0 2 3 Sugar Ray Leonard USA 3 NaN boxing 1990 13.0 3 Ayrton Senna 4 NaN 10.0 Brazil auto racing 1990 5 4 5 Alain Prost France NaN auto racing 1990 9.0 ... 296 297 Stephen Curry USA 6 9 74.4 Basketball 2020 297 298 Kevin Durant USA 7 10 Basketball 2020 63.9 298 299 Tiger Woods USA 8 11 Golf 2020 62.3 300 USA 9 60.5 299 Kirk Cousins >100 American Football 2020 10 300 301 Carson Wentz USA >100 American Football 2020 59.1 301 rows × 8 columns In [3]: display(df.dtypes) S.NO int64 Name object Nationality object int64 Current Rank Previous Year Rank object Sport object int64 Year earnings (\$ million) float64 dtype: object In [4]: df.isna().sum() S.NO 0 Out[4]: 0 0 Nationality Current Rank 0 Previous Year Rank 24 Sport 0 0 Year earnings (\$ million) 0 dtype: int64 In [5]: dfnull = df[df['Previous Year Rank'].isna()] dfnull S.NO Current Rank Previous Year Rank Nationality Sport Year earnings (\$ million) Out[5]: Name 0 Mike Tyson USA 1 NaN boxing 1990 28.6 2 USA 2 boxing 26.0 1 **Buster Douglas** NaN 1990 USA 3 13.0 2 3 Sugar Ray Leonard NaN boxing 1990 3 4 Ayrton Senna Brazil 4 NaN 1990 10.0 auto racing 4 5 Alain Prost France 5 NaN auto racing 1990 9.0 5 6 Jack Nicklaus 6 8.6 USA NaN golf 1990 Australia 6 7 Greg Norman 7 NaN 1990 8.5 golf 8 USA 7 Michael Jordan 8 basketball 1990 8.1 NaN

9

10

8

Arnold Palmer

Evander Holyfield

USA

USA

8

8

NaN

golf 1990

boxing 1990

8 1

8.1

80	81	Michael Jordan	USA	1	NaN	Basketball	1998	69.0
81	82	Michael Schumacher	Germany	2	NaN	F1 Motorsports	1998	38.0
82	83	Sergei Federov	Russia	3	NaN	Ice Hockey	1998	29.8
83	84	Tiger Woods	USA	4	NaN	Golf	1998	26.8
84	85	Dale Earnhardt	USA	5	NaN	NASCAR	1998	24.1
85	86	Grant Hill	USA	6	NaN	Basketball	1998	21.6
86	87	Oscar De La Hoya	USA	7	NaN	Boxing	1998	18.5
87	88	Patrick Ewing	USA	8	NaN	Basketball	1998	18.3
88	89	Arnold Palmer	USA	9	NaN	Golf	1998	18.1
89	90	Gary Sheffield	USA	10	NaN	Baseball	1998	17.2
266	267	Andrew Luck	USA	6	NaN	American Football	2017	50.0
268	269	Stephen Curry	USA	8	NaN	Basketball	2017	47.3
269	270	James Harden	USA	9	NaN	Basketball	2017	46.6
270	271	Lewis Hamilton	UK	10	NaN	auto racing	2017	46.0

### Filling null value

NaN

151.000000

87.035433

1.000000

76.000000

151.000000

226.000000

freq

mean

std

min

25%

75%

19

NaN

NaN

NaN

NaN

NaN

NaN

206

NaN

NaN

NaN

NaN

NaN

NaN

NaN

5.448505

2.850995

1.000000

3.000000

5.000000

8.000000

37

NaN

NaN

NaN

NaN

NaN

NaN

54

NaN

NaN

NaN

NaN

NaN

NaN

2005.122924

1990.000000

1997.000000

2005.000000

2013.000000

9.063563

NaN

45.516279

33.525337

8.100000

24.000000

39.000000

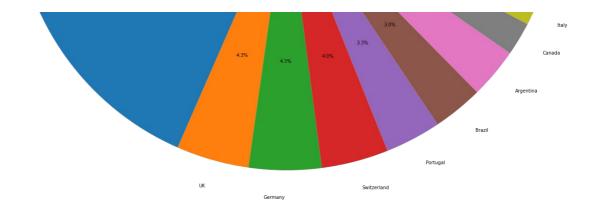
59.400000

```
In [6]:
           mode=df["Previous Year Rank"].mode()
           mode
 Out[6]:
          dtype: object
 In [7]:
           df["Previous Year Rank"].fillna(mode,inplace=True)
 In [8]:
           df.isnull().sum()
          S.NO
                                     0
 Out[8]:
                                     0
          Name
          Nationality
                                     0
          Current Rank
                                     0
          Previous Year Rank
                                     23
          Sport
                                     0
                                     0
          earnings ($ million)
                                     0
          dtype: int64
 In [9]:
           #Checking for duplicate data
           df.duplicated().sum()
 Out[9]:
In [10]:
           df.describe(include="all")
Out[10]:
                      S.NO
                                 Name Nationality
                                                  Current Rank Previous Year Rank
                                                                                   Sport
                                                                                               Year
                                                                                                    earnings ($ million)
           count 301.000000
                                                                                                           301.000000
                                   301
                                             301
                                                   301.000000
                                                                           278
                                                                                    301
                                                                                          301.000000
          unique
                       NaN
                                              22
                                                         NaN
                                                                            36
                                                                                     29
                                                                                                                 NaN
                       NaN Tiger Woods
                                             USA
                                                         NaN
                                                                           >10
                                                                               Basketball
                                                                                               NaN
                                                                                                                 NaN
             top
```

max 301.000000 10.000000 NaN 2020.000000 300.00000

#### Athletes listed in Forbes by country (1990-2020

```
In [11]:
            count by nationality=df.Nationality.value counts()
In [12]:
            count_by_nationality
           USA
                                     206
Out[12]:
           UK
                                      13
            Germany
                                      13
           Switzerland
                                      12
                                      10
           Portugal
           Brazil
                                       9
           Argentina
                                       6
            Canada
            Italy
            Finland
            France
           Philippines
           Russia
           Australia
           Dominican
            Austria
            Filipino
            Spain
            Serbia
           Northern Ireland
           Ireland
           Mexico
           Name: Nationality, dtype: int64
In [13]:
            plt.figure(figsize=(30,27))
            plt.pie(df.Nationality.value_counts().to_frame().values.flatten(),
                       labels=df.Nationality.value_counts().to_frame().index.tolist(),
                       autopct='%.1f%%')
            plt.title('Athletes listed in Forbes by country (1990-2020)',fontsize=20)
            plt.legend(df.Nationality.value_counts().to_frame().index)
            plt.show()
                                                           Athletes listed in Forbes by country (1990-2020)
                                                                                                                                                USA
UK
Germany
Switzerland
Portugal
Brazil
Argentina
Canada
Italy
Finland
France
Philippines
Russia
Australia
Dominican
Austria
Filipino
Spain
Serbia
Northern Ireland
Mexico
```

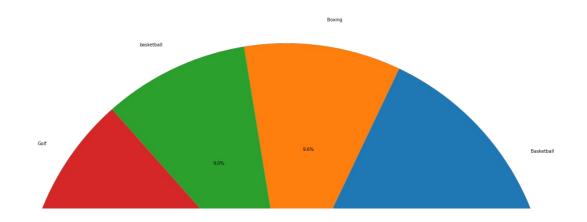


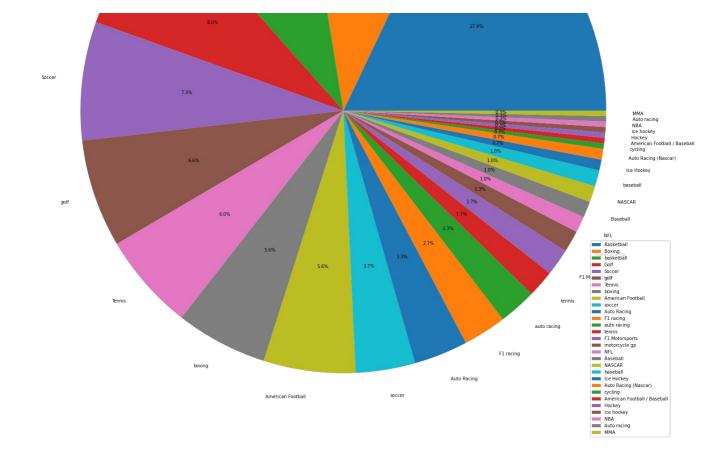
# Which sport has maximum number of athletes in Forbes, listed till 2020?

```
In [14]:
          no of athletes=df.Sport.str.lower().value counts()
          no_of_athletes
         basketball
Out[14]:
         boxing
                                           46
         golf
                                           44
          soccer
                                           33
          tennis
                                           23
         auto racing
                                           18
         american football
                                           17
         fl racing
                                           8
         baseball
         fl motorsports
                                           5
         motorcycle gp
         nascar
         ice hockey
         nfl
         auto racing (nascar)
         american football / baseball
         hockey
         nba
         cycling
                                            1
         mma
         Name: Sport, dtype: int64
```

#### Number of athletes in each sport listed in Forbes (1990-2020)

Number of athletes in each sport listed in Forbes (1990-2020)

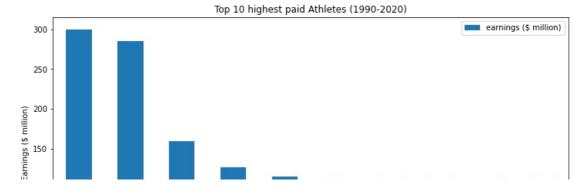


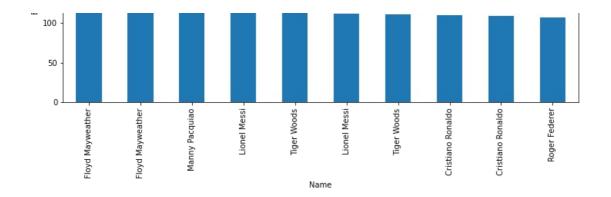


# Top 10 highest paid Athletes (1990-2020)

```
In [16]:
            top_ten=df.sort_values('earnings ($ million)',ascending=False).head(10)
In [17]:
            top_ten
Out[17]:
                S.NO
                                 Name Nationality
                                                    Current Rank Previous Year Rank
                                                                                       Sport Year
                                                                                                    earnings ($ million)
            241
                  242
                       Floyd Mayweather
                                               USA
                                                                                       Boxing
                                                                                              2015
                                                                                                                 300.0
            271
                  272
                       Floyd Mayweather
                                               USA
                                                                                 >100
                                                                                       Boxing
                                                                                              2018
                                                                                                                 285.0
            242
                  243
                        Manny Pacquiao
                                         Philippines
                                                                2
                                                                                              2015
                                                                                                                 160.0
                                                                                       Boxing
            281
                  282
                            Lionel Messi
                                          Argentina
                                                                                              2019
                                                                                                                 127.0
            171
                  172
                            Tiger Woods
                                               USA
                                                                                         golf
                                                                                              2008
                                                                                                                 115.0
            272
                  273
                            Lionel Messi
                                                                                              2018
                                                                                                                 111.0
                                          Argentina
                                                                                      Soccer
            181
                  182
                            Tiger Woods
                                               USA
                                                                                              2009
                                                                                                                 110.0
            282
                  283
                        Cristiano Ronaldo
                                            Portugal
                                                                                      Soccer
                                                                                              2019
                                                                                                                 109.0
                        Cristiano Ronaldo
                                           Portugal
                                                                3
                                                                                                                 108.0
            273
                  274
                                                                                      Soccer
                                                                                              2018
            291
                  292
                           Roger Federer
                                                                                                                  106.3
```

```
In [18]:
    plot=top_ten.plot.bar(x='Name',y='earnings ($ million)',figsize=(12,6));
    plt.title('Top 10 highest paid Athletes (1990-2020)');
    plt.ylabel('Earnings ($ million)');
```





#### Sports in which top 10 athelets are

Who is the most listed athlete in 'Forbes highest Paid Athletes' history, also include sport, nationality and year in which they listed in Forbes?

golf

golf

Sport

```
In [20]:
           new df=df.copy()#copy of original dataframe
In [21]:
           new df.set_index('Name',inplace=True)#make name column index
In [22]:
           max listed athletes=df.Name.mode().tolist()
In [23]:
           new df.loc[max listed athletes][['Nationality', 'Sport', 'Year']]
Out[23]:
                        Nationality
                                      Sport Year
                  Name
          Michael Jordan
                             USA
                                   basketball 1990
          Michael Jordan
                                   basketball 1991
          Michael Jordan
                             USA
                                             1992
                                   Basketball
          Michael Jordan
                             USA
                                   Basketball
                                             1993
          Michael Jordan
                                   Basketball 1994
```

Michael Jordan	USA	basketball	1995
Michael Jordan	USA	Basketball	1996
Michael Jordan	USA	Basketball	1997
Michael Jordan	USA	Basketball	1998
Michael Jordan	USA	Basketball	1999
Michael Jordan	USA	Basketball	2000
Michael Jordan	USA	Basketball	2002
Michael Jordan	USA	Basketball	2003
Michael Jordan	USA	basketball	2004
Michael Jordan	USA	basketball	2005
Michael Jordan	USA	basketball	2006
Michael Jordan	USA	basketball	2007
Michael Jordan	USA	basketball	2008
Michael Jordan	USA	basketball	2009
Tiger Woods	USA	Golf	1997
Tiger Woods	USA	Golf	1998
Tiger Woods	USA	Golf	1999
Tiger Woods	USA	Golf	2000
Tiger Woods	USA	Golf	2002
Tiger Woods	USA	Golf	2003
Tiger Woods	USA	golf	2004
Tiger Woods	USA	golf	2005
Tiger Woods	USA	golf	2006
Tiger Woods	USA	golf	2007
Tiger Woods	USA	golf	2008
Tiger Woods	USA	golf	2009
Tiger Woods	USA	golf	2010
Tiger Woods	USA	golf	2011
Tiger Woods	USA	Golf	2012
Tiger Woods	USA	Golf	2013
Tiger Woods	USA	Golf	2014
Tiger Woods	USA	Golf	2015
Tiger Woods	USA	Golf	2020

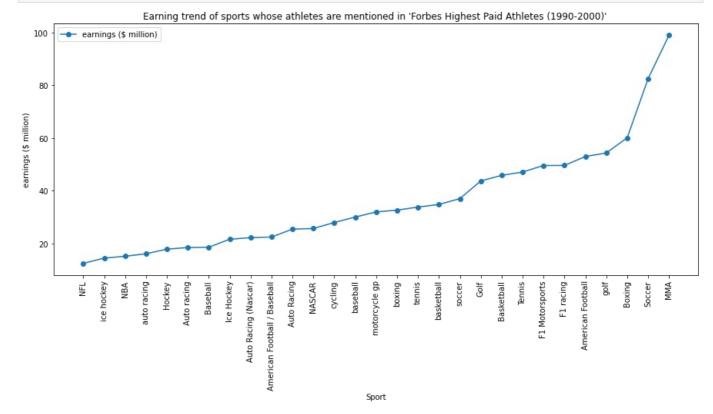
# average income of athletes

```
In [24]:
           sport_df=df.groupby(df.Sport)[['earnings ($ million)']].mean()
In [25]:
           sport_df=sport_df.sort_values('earnings ($ million)')
In [26]:
           sport_df
Out[26]:
                                    earnings ($ million)
                              Sport
                               NFL
                                            12.500000
                                            14.500000
                          ice hockey
                               NBA
                                            15.200000
                         auto racing
                                             16.142857
                            Hockey
                                            17.900000
                                            18.500000
                         Auto racing
                           Baseball
                                            18.633333
                                            21.650000
                         Ice Hockey
                                            22.250000
                 Auto Racing (Nascar)
```

American Football / Baseball	22.500000
Auto Racing	25.480000
NASCAR	25.733333
cycling	28.000000
baseball	30.066667
motorcycle gp	32.000000
boxing	32.682353
tennis	33.840000
basketball	34.837037
soccer	37.045455
Golf	43.733333
Basketball	45.879630
Tennis	47.116667
F1 Motorsports	49.600000
F1 racing	49.625000
American Football	53.011765
golf	54.345000
Boxing	60.110345
Soccer	82.545455
MMA	99.000000

```
In [27]:
    plt.figure(figsize=(15,6))

plt.plot(sport_df[['earnings ($ million)']].index[:].tolist(),sport_df[['earnings ($ million)']],marker='o')
    plt.xticks(rotation=90)
    plt.xlabel('Sport')
    plt.ylabel('earnings ($ million)')
    plt.ylabel('earnings ($ million)')
    plt.title("Earning trend of sports whose athletes are mentioned in 'Forbes Highest Paid Athletes (1990-2000)' ")
    plt.legend(sport_df[['earnings ($ million)']]);
```







There is a strong correlation between earnings and year of earning. As well as, there is a good correlation between serial number and earnings which doesn't really make any sense since its just a serial number.

```
In [29]:
             #correlation between rank and earning.
             data=df[['Current Rank', 'earnings ($ million)']]
             corr=data.corr()
             sns.heatmap(corr, annot=True)
           <AxesSubplot:>
Out[29]:
            Current Rank
                                              -0.45
                                                                - 0.6
                                                                - 0.4
                                                                - 0.2
                                                                - 0.0
            earnings ($
                        -0.45
                                                                 -0.2
                    Current Rank
                                        earnings ($ million)
```

according to the above correlation grid, there is a weak correlation between the athletes current rank and the earnings.

which sport pays the most to its athletes?

dtype: object

```
In [30]:
           df1=df[['Sport','earnings ($ million)']]
           df1.head()
                 Sport earnings ($ million)
Out[30]:
                 boxina
                 boxing
                                     26.0
                 boxing
                                     13.0
           3 auto racing
                                     10.0
           4 auto racing
                                      9.0
In [31]:
           df1.max()
                                      tennis
Out[31]:
          earnings ($ million)
                                       300.0
```

```
In [32]:
                                                #question: who is the highest paid athlete?
                                                df2=df[['Name','Sport','earnings ($ million)']]
                                                df2.max()
                                                                                                                                                               Wayne Gretzky
                                           Name
Out[32]:
                                            Sport
                                                                                                                                                                                                 tennis
                                             earnings ($ million)
                                                                                                                                                                                                     300.0
                                            dtype: object
In [33]:
                                                sport=df.groupby(['Sport'])
                                                earning=df.groupby(['earnings ($ million)'])
                                                plt.clf()
                                                df.groupby('Sport').size().plot(kind='bar')
                                                plt.show()
                                              50
                                              40
                                              30
                                              20
                                              10
                                                        American Football
Auto Racing
Auto Racing
Auto Racing
Auto Racing
Baskeball
Baskeball
Baskeball
Baskeball
Baskeball
Baskeball
Baskeball
Baskeball
Baskeball
Rockey
Ice Hockey
Ic
                                                                                                                                                                                                                                    ice hockey -
ice hockey -
motorcycle gp -
soccer -
tennis -
                                                                                                                                                         Sport
In [34]:
                                                Nationality=df.groupby(['Nationality'])
                                                Nationality
                                                plt.clf()
                                                df.groupby(['Nationality']).size().plot(kind='bar')
                                                plt.show()
                                              200
                                              175
                                              150
                                              125
                                              100
                                                  75
                                                  50
                                                  25
                                                                                                                                                                                                                                               Switzerland -
UK -
USA -
                                                                                                                                                     Nationality
```

#### Top Paid Athlete for Each Year

```
In [61]:
    Top_paid_each_year = df[df['Current Rank'] == 1].sort_values(by='Year',ascending=False)
    z = Top_paid_each_year[['Name','Sport','Nationality','earnings ($ million)']]
```

Out[61]:		Name	Sport	Nationality	earnings (\$ million)
	291	Roger Federer	Tennis	Switzerland	106.300000
	281	Lionel Messi	Soccer	Argentina	127.000000
	271	Floyd Mayweather	Boxing	USA	285.000000
	261	Cristiano Ronaldo	Soccer	Portugal	93.000000
	251	Cristiano Ronaldo	Soccer	Portugal	88.000000
	241	Floyd Mayweather	Boxing	USA	300.000000
	231	Floyd Mayweather	Boxing	USA	105.000000
	221	Tiger Woods	Golf	USA	78.100000
	211	Floyd Mayweather	Boxing	USA	85.000000
	201	Tiger Woods	golf	USA	75.000000
	191	Tiger Woods	golf	USA	105.000000
	181	Tiger Woods	golf	USA	110.000000
	171	Tiger Woods	golf	USA	115.000000
	161	Tiger Woods	golf	USA	100.000000
	151	Tiger Woods	golf	USA	90.000000
	141	Tiger Woods	golf	USA	87.000000
	131	Tiger Woods	golf	USA	80.300000
	121	Tiger Woods	Golf	USA	78.000000
	110	Tiger Woods	Golf	USA	69.000000
	100	Michael Schumacher	Auto Racing	Germany	59.000000
	90	Michael Schumacher	Auto Racing	Germany	49.000000
	80	Michael Jordan	Basketball	USA	69.000000
	70	Michael Jordan	Basketball	USA	78.300000
	60	Mike Tyson	Boxing	USA	75.000000
	50	Michael Jordan	basketball	USA	43.900000
	40	Michael Jordan	Basketball	USA	30.000000
	30	Michael Jordan	Basketball	USA	36.000000
	20	Michael Jordan	Basketball	USA	35.900000
	10	Evander Holyfield	boxing	USA	60.500000

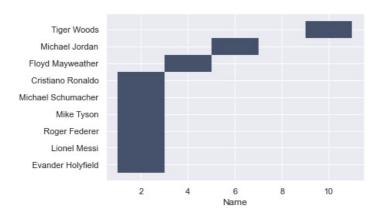
boxing

Mike Tyson

USA

# 2020=Roger Federer,2019=Lionel Messi,2018=Floyd Mayweather highest earning per year

28.600000



#### Athletes appearing maximum time on the list

```
In [68]: s = df['Name'].value_counts().to_frame()[:5]

Out[68]: Name
Tiger Woods 19
Michael Jordan 19
Kobe Bryant 14
LeBron James 13
Michael Schumacher 13
```

#### People who have appeared once on the list.

#### Only women souce google

```
Out[71]:

monica = df[df['Name'] == 'Monica Seles']

monica

S.NO Name Nationality Current Rank Previous Year Rank Sport Year earnings ($ million)

29 30 Monica Seles USA 10 12 Tennis 1992 8.5
```

# Top 5 earners of all time

```
In [77]:
              top_earners_alltime = pd.pivot_table(df, index='Name',values="earnings ($ million)", aggfunc='sum')
top5_earners_all = top_earners_alltime.sort_values(by="earnings ($ million)",ascending=False)[:5]
In [78]:
              top3_earners_all.style.background_gradient(cmap='Reds')
Out[78]:
                                   earnings ($ million)
                          Name
                                          1373.800000
                   Tiger Woods
                                           844.800000
                 LeBron James
              Floyd Mayweather
                                           840.000000
              Cristiano Ronaldo
                                           787.100000
                                           781.100000
                 Roger Federer
```

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