```
In [134]: import pandas as pd
In [135]: | s2017 df = pd.read csv('2017 season data.csv')
In [136]: players df = pd.read csv('player data.csv')
In [137]: s2017 df.head(3)
Out[137]:
                           Player Pos Age
                                           Tm
                                                  G GS
                                                            MP PER TS% ... FT% ORB DRB
                                                                                               TRB AST STL BLK TOV
                                                                                                                              PTS
                 Year
             0 2017.0 Alex Abrines SG 23.0 OKC 68.0 6.0 1055.0 10.1 0.560 ... 0.898
                                                                                         68.0
                                                                                               86.0 40.0 37.0
                                                                                                               8.0 33.0 114.0 406.0
                                                                                    18.0
                       Quincy Acy
                                  PF 26.0 TOT 38.0 1.0
                                                          558.0 11.8 0.565 ... 0.750
                                                                                    20.0
                                                                                         95.0 115.0 18.0 14.0
                                                                                                             15.0 21.0
                                                                                                                         67.0 222.0
             2 2017.0 Quincy Acy PF 26.0 DAL 6.0 0.0
                                                           48.0 -1.4 0.355 ... 0.667
                                                                                     2.0
                                                                                          6.0
                                                                                                8.0
                                                                                                     0.0
                                                                                                         0.0
                                                                                                               0.0
                                                                                                                          9.0
                                                                                                                              13.0
            3 rows × 52 columns
In [138]: players df.head(3)
Out[138]:
                           name year start year end position height weight
                                                                            birth date
                                                                                                           college
             0
                    Alaa Abdelnaby
                                                                          June 24, 1968
                                                                                                     Duke University
                                      1991
                                               1995
                                                        F-C
                                                              6-10
                                                                    240.0
                    Zaid Abdul-Aziz
                                      1969
                                               1978
                                                        C-F
                                                               6-9
                                                                    235.0
                                                                           April 7, 1946
                                                                                                 Iowa State University
```

# Data Wrangling Activities

2 Kareem Abdul-Jabbar

■ 1. Merge s2017\_df and players\_df with a left join

1970

1989

С

7-2

225.0

April 16, 1947 University of California, Los Angeles

```
In [139]: df = s2017_df.merge(players_df,how='left',left_on='Player',right_on='name')
df.head()
```

#### Out[139]:

	Year	Player	Pos	Age	Tm	G	GS	MP	PER	TS%	 PF	PTS	name	year_start	year_end	position	height	weight	birth
0	2017.0	Alex Abrines	SG	23.0	OKC	68.0	6.0	1055.0	10.1	0.560	 114.0	406.0	Alex Abrines	2017.0	2018.0	G-F	6-6	190.0	Auç
1	2017.0	Quincy Acy	PF	26.0	TOT	38.0	1.0	558.0	11.8	0.565	 67.0	222.0	Quincy Acy	2013.0	2018.0	F	6-7	240.0	Octc
2	2017.0	Quincy Acy	PF	26.0	DAL	6.0	0.0	48.0	-1.4	0.355	 9.0	13.0	Quincy Acy	2013.0	2018.0	F	6-7	240.0	Octc
3	2017.0	Quincy Acy	PF	26.0	BRK	32.0	1.0	510.0	13.1	0.587	 58.0	209.0	Quincy Acy	2013.0	2018.0	F	6-7	240.0	Octc
4	2017.0	Steven Adams	С	23.0	OKC	80.0	80.0	2389.0	16.5	0.589	 195.0	905.0	Steven Adams	2014.0	2018.0	С	7-0	255.0	Jı

5 rows × 60 columns

```
In [140]: # Use it before modifying the `df` to have a copy
# just in case a modification doesn't go as expected
df_copy = df.copy()
```

## ▼ 2. Are there misses (mismatches) in the resulting dataframe?

```
In [141]: df['name'].isna().sum()
```

Out[141]: 4

#### **▼** 3. How many rows couldn't be matched?

```
In [142]: df['name'].isna().sum()
```

Out[142]: 4

#### 4. Extract the names of the players that couldn't be matched

```
In [143]: df.loc[df['name'].isna()]['Player']
Out[143]: 349
                             Luc Mbah
           350
                        James Michael
           352
                   Sheldon McClellan
           593
                          Metta World
           Name: Player, dtype: object
In [144]: player misses = list(df.loc[df['name'].isna()]['Player'])
           player misses
Out[144]: ['Luc Mbah', 'James Michael', 'Sheldon McClellan', 'Metta World']
           5. Modify players df with the correct names to re-try a successful merge
In [145]: # Use it before modifying the `df` to have a copy
           # just in case a modification doesn't go as expected
           df copy = df.copy()
In [146]: | players df.loc[players df['name'].str.lower().str.contains('mbah')]
Out[146]:
                          name year start year end position height weight
                                                                            birth date
                                                                                                         college
            2595 Luc Mbah a Moute
                                    2009
                                             2018
                                                       F
                                                                 230.0 September 9, 1986 University of California, Los Angeles
                                                            6-8
In [147]: players df.loc[players df['name'].str.lower().str.contains('sheldon')]
Out[147]:
                      name year_start year_end position height weight
                                                                         birth date
                                                                                          college
            2475 Sheldon Mac
                                                             200.0 December 21, 1992 University of Miami
                                2017
                                         2017
                                                   G
                                                        6-5
```

```
In [148]: players df.loc[players df['name'].str.lower().str.contains('metta')]
Out[148]:
                           name year_start year_end position height weight
                                                                             birth date
                                                                                               college
            4487 Metta World Peace
                                    2000
                                             2017
                                                                 260.0 November 13, 1979 St. John's University
In [149]: players df.loc[players df['name'].str.contains('James Michael')]
Out[149]:
                              name year start year end position height weight
                                                                              birth date
                                                                                                     college
            2597 James Michael McAdoo
                                        2015
                                                2018
                                                               6-9
                                                                    230.0 January 4, 1993 University of North Carolina
In [150]: # name mapping = {'Luc Mbah':'Luc Mbah a Moute',
                              'Sheldon McClellan': 'Sheldon Mac',
                              'Metta World': 'Metta World Peace',
                              'James Michael':'James Michael McAdoo'}
           name mapping = {'Luc Mbah a Moute':'Luc Mbah',
                            'Sheldon Mac': 'Sheldon McClellan',
                            'Metta World Peace': 'Metta World',
                            'James Michael McAdoo': 'James Michael'}
In [151]: for name in name mapping.keys():
               players df.loc[players df['name']==name, 'name']=name mapping[name]
           6. Perform the merge between s2017 df and players df again, this time, without misses
In [152]: | df = s2017 df.merge(players df,how='left',left on='Player',right on='name')
```

7. Remove unnecessary columns

```
In [153]: df.info()
```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 605 entries, 0 to 604
Data columns (total 60 columns):

#	Column	Non-Null Count	Dtype
0	Year	605 non-null	float64
1	Player	605 non-null	object
2	Pos	605 non-null	object
3	Age	605 non-null	float64
4	Tm	605 non-null	object
5	G	605 non-null	float64
6	GS	605 non-null	float64
7	MP	605 non-null	float64
8	PER	605 non-null	float64
9	TS%	603 non-null	float64
10	3PAr	603 non-null	float64
11	FTr	603 non-null	float64
12	ORB%	605 non-null	float64
13	DRB%	605 non-null	float64
14	TRB%	605 non-null	float64
15	AST%	605 non-null	float64
16	STL%	605 non-null	float64
17	BLK%	605 non-null	float64
18	T0V%	603 non-null	float64
19	USG%	605 non-null	float64
20	blanl	0 non-null	float64
21	0WS	605 non-null	float64
22	DWS	605 non-null	float64
23	WS	605 non-null	float64
24	WS/48	605 non-null	float64
25	blank2	0 non-null	float64
26	OBPM	605 non-null	float64
27	DBPM	605 non-null	float64
28	BPM	605 non-null	float64
29	VORP	605 non-null	float64
30	FG	605 non-null	float64
31	FGA	605 non-null	float64
32	FG%	603 non-null	float64

22	20	COL	non n17	£1 ~~+C4
33	3P	605		float64
34	3PA	605	non-null	float64
35	3P%	558	non-null	float64
36	2P	605	non-null	float64
37	2PA	605	non-null	float64
38	2P%	600	non-null	float64
39	eFG%	603	non-null	float64
40	FT	605	non-null	float64
41	FTA	605	non-null	float64
42	FT%	581	non-null	float64
43	0RB	605	non-null	float64
44	DRB	605	non-null	float64
45	TRB	605	non-null	float64
46	AST	605	non-null	float64
47	STL	605	non-null	float64
48	BLK	605	non-null	float64
49	TOV	605	non-null	float64
50	PF	605	non-null	float64
51	PTS	605	non-null	float64
52	name	605	non-null	object
53	year start	605	non-null	int64
54	year end	605	non-null	int64
55	position	605	non-null	object
56	height	605	non-null	object
57	weight	605	non-null	float64
58	birth date	605	non-null	object
59	college	491		object
dtyp	_		int64(2),	object(8)
	rv usage: 28			5 ( • )
	<b></b>			

```
In [154]: | columns_to_drop = [
               "Year",
               "PER",
               "TS%",
               "3PAr",
               "FTr",
               "USG%",
               "blanl",
               "OWS",
               "DWS",
               "WS",
               "WS/48",
               "blank2",
               "OBPM",
               "DBPM",
               "BPM",
               "VORP",
               "FG%",
               "3P%",
               "eFG%",
               "FT%",
               "name",
```

In [155]: df.drop(columns = columns\_to\_drop,inplace=True)

```
In [156]: df.info()
```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 605 entries, 0 to 604
Data columns (total 39 columns):

Data #	Columns Column	(total 39 columns): Non-Null Count	Dtype
π 		Non-Nace Counc	
0	Player	605 non-null	object
1	Pos	605 non-null	object
2	Age	605 non-null	float64
3	Tm	605 non-null	object
4	G	605 non-null	float64
5	GS	605 non-null	float64
6	MP	605 non-null	float64
7	ORB%	605 non-null	float64
8	DRB%	605 non-null	float64
9	TRB%	605 non-null	float64
10	AST%	605 non-null	float64
11	STL%	605 non-null	float64
12	BLK%	605 non-null	float64
13	T0V%	603 non-null	float64
14	FG	605 non-null	float64
15	FGA	605 non-null	float64
16	3P	605 non-null	float64
17	3PA	605 non-null	float64
18	2P	605 non-null	float64
19	2PA	605 non-null	float64
20	2P%	600 non-null	float64
21	FT	605 non-null	float64
22	FTA	605 non-null	float64
23	0RB	605 non-null	float64
24	DRB	605 non-null	float64
25	TRB	605 non-null	float64
26	AST	605 non-null	float64
27	STL	605 non-null	float64
28	BLK	605 non-null	float64
29	TOV	605 non-null	float64
30	PF	605 non-null	float64
31	PTS .	605 non-null	float64
32	year_sta	irt 605 non-null	int64

```
33 year end
                605 non-null
                                int64
 34 position
                605 non-null
                                object
 35 height
                                object
                605 non-null
                                float64
 36 weight
                605 non-null
 37 birth date 605 non-null
                                object
 38 college
                491 non-null
                                object
dtypes: float64(30), int64(2), object(7)
memorv usage: 184.5+ KB
```

#### 8. Rename teams to their full name

```
In [157]: | team mapping = {
              "OKC": "Oklahoma City Thunder",
              "DAL": "Dallas Mavericks",
              "BRK": "Brooklyn Nets",
              "SAC": "Sacramento Kings",
              "NOP": "New Orleans Pelicans",
              "MIN": "Minnesota Timberwolves",
              "SAS": "San Antonio Spurs",
              "IND": "Indiana Pacers",
              "MEM": "Memphis Grizzlies",
              "POR": "Portland Trail Blazers",
              "CLE": "Cleveland Cavaliers",
              "LAC": "Los Angeles Clippers",
              "PHI": "Philadelphia 76ers",
              "HOU": "Houston Rockets",
              "MIL": "Milwaukee Bucks",
              "NYK": "New York Knicks",
              "DEN": "Denver Nuggets",
              "ORL": "Orlando Magic",
              "MIA": "Miami Heat",
              "PHO": "Phoenix Suns",
              "GSW": "Golden State Warriors",
              "CHO": "Charlotte Hornets",
              "DET": "Detroit Pistons",
              "ATL": "Atlanta Hawks",
              "WAS": "Washington Wizards",
              "LAL": "Los Angeles Lakers",
              "UTA": "Utah Jazz",
              "BOS": "Boston Celtics",
              "CHI": "Chicago Bulls",
              "TOR": "Toronto Raptors"
```

In [158]: df['Team']=df['Tm'].replace(team\_mapping)
df.head()

## Out[158]:

 Pla	ayer	Pos	Age	Tm	G	GS	MP	ORB%	DRB%	TRB%	 PF	PTS	year_start	year_end	position	height	weight	birth_date
<b>0</b> Abr	Alex	SG	23.0	OKC	68.0	6.0	1055.0	1.9	7.1	4.5	 114.0	406.0	2017	2018	G-F	6-6	190.0	August 1, 1993
<b>1</b> Qu	uincy Acy	PF	26.0	тот	38.0	1.0	558.0	3.9	18.0	11.0	 67.0	222.0	2013	2018	F	6-7	240.0	October 6, 1990
<b>2</b> Qu	uincy Acy	PF	26.0	DAL	6.0	0.0	48.0	4.6	15.2	9.7	 9.0	13.0	2013	2018	F	6-7	240.0	October 6, 1990
3 Qu	uincy Acy	PF	26.0	BRK	32.0	1.0	510.0	3.8	18.2	11.1	 58.0	209.0	2013	2018	F	6-7	240.0	October 6, 1990
	even lams	С	23.0	OKC	80.0	80.0	2389.0	13.0	15.5	14.2	 195.0	905.0	2014	2018	С	7-0	255.0	July 20, 1993

5 rows × 40 columns

## ■ 9. Convert birthday to a datetime object

```
In [159]: df['birth_date'] = pd.to_datetime(df['birth_date'])
df.head()
```

## Out[159]:

	Player	Pos	Age	Tm	G	GS	MP	ORB%	DRB%	TRB%	 PF	PTS	year_start	year_end	position	height	weight	birth_date
(	Alex Abrines	SG	23.0	OKC	68.0	6.0	1055.0	1.9	7.1	4.5	 114.0	406.0	2017	2018	G-F	6-6	190.0	1993-08-01
1	Quincy Acy	PF	26.0	тот	38.0	1.0	558.0	3.9	18.0	11.0	 67.0	222.0	2013	2018	F	6-7	240.0	1990-10-06
2	Quincy Acy	PF	26.0	DAL	6.0	0.0	48.0	4.6	15.2	9.7	 9.0	13.0	2013	2018	F	6-7	240.0	1990-10-06
3	Quincy Acy	PF	26.0	BRK	32.0	1.0	510.0	3.8	18.2	11.1	 58.0	209.0	2013	2018	F	6-7	240.0	1990-10-06
2	Steven Adams	С	23.0	OKC	80.0	80.0	2389.0	13.0	15.5	14.2	 195.0	905.0	2014	2018	С	7-0	255.0	1993-07-20

5 rows × 40 columns

## ▼ 10. Delete all players from the T0T team

```
In [160]: # if something goes wrong, just execute this line:
    df_copy = df.copy()

In [162]: df = df.loc[df['Tm']!='TOT']

In [163]: df.shape
Out[163]: (551, 40)
```

## Analysis

▼ 11. What's the team with the most players in the league?

In [181]: df = df\_copy.copy()

```
In [182]: df['Team'].value counts().sort values(ascending=False)
Out[182]: Team
          T0T
                                     54
          New Orleans Pelicans
                                     27
                                     24
          Dallas Mavericks
                                     22
          Philadelphia 76ers
                                     22
          Atlanta Hawks
          Cleveland Cavaliers
                                     22
          Brooklyn Nets
                                     21
          Milwaukee Bucks
                                     20
                                     19
          Los Angeles Lakers
                                     19
          Charlotte Hornets
          Orlando Magic
                                     19
          Denver Nuggets
                                     19
          Oklahoma City Thunder
                                     19
          Sacramento Kings
                                     19
                                     18
          Washington Wizards
          Houston Rockets
                                     18
          Chicago Bulls
                                     18
                                     18
          Phoenix Suns
                                     17
          San Antonio Spurs
          Golden State Warriors
                                     17
          Toronto Raptors
                                     17
          Indiana Pacers
                                     17
          Memphis Grizzlies
                                     17
          Minnesota Timberwolves
                                     16
                                     16
          New York Knicks
          Miami Heat
                                     15
                                     15
          Detroit Pistons
          Utah Jazz
                                     15
          Boston Celtics
                                     15
                                     15
          Portland Trail Blazers
          Los Angeles Clippers
                                     15
          Name: count, dtype: int64
```

#### ■ 12. What's the team with the lowest FG?

```
In [183]: | df.groupby('Team')['FG'].sum().sort values(ascending=True)
Out[183]: Team
          Dallas Mavericks
                                     2968.0
          Memphis Grizzlies
                                     2984.0
                                     3033.0
          Utah Jazz
          Charlotte Hornets
                                     3093.0
                                     3102.0
          Brooklyn Nets
          Sacramento Kings
                                     3105.0
                                     3139.0
          Orlando Magic
          Boston Celtics
                                     3168.0
                                     3169.0
          Chicago Bulls
          Milwaukee Bucks
                                     3190.0
          Miami Heat
                                     3202.0
                                     3211.0
          Toronto Raptors
          New Orleans Pelicans
                                     3218.0
          Minnesota Timberwolves
                                     3235.0
          Oklahoma City Thunder
                                     3237.0
          Los Angeles Clippers
                                     3242.0
          Portland Trail Blazers
                                     3243.0
          New York Knicks
                                     3244.0
                                     3269.0
          Detroit Pistons
                                     3270.0
          Phoenix Suns
          Houston Rockets
                                     3305.0
                                     3311.0
          Cleveland Cavaliers
          Philadelphia 76ers
                                     3322.0
                                     3377.0
          Denver Nuggets
                                     3379.0
          Indiana Pacers
          Washington Wizards
                                     3388.0
          Los Angeles Lakers
                                     3414.0
                                     3470.0
          San Antonio Spurs
          Golden State Warriors
                                     3532.0
          Atlanta Hawks
                                     3595.0
          T0T
                                     8434.0
          Name: FG, dtype: float64
```

■ 13. What's the team with the best FG%?

In [187]: FG\_df = df.groupby('Team')[['FG','FGA']].sum()
FG\_df

Out[187]:

	FG	FGA
Team		
Atlanta Hawks	3595.0	7961.0
<b>Boston Celtics</b>	3168.0	6978.0
Brooklyn Nets	3102.0	6987.0
<b>Charlotte Hornets</b>	3093.0	7000.0
Chicago Bulls	3169.0	7142.0
<b>Cleveland Cavaliers</b>	3311.0	7053.0
Dallas Mavericks	2968.0	6750.0
<b>Denver Nuggets</b>	3377.0	7194.0
<b>Detroit Pistons</b>	3269.0	7282.0
Golden State Warriors	3532.0	7140.0
Houston Rockets	3305.0	7152.0
Indiana Pacers	3379.0	7270.0
Los Angeles Clippers	3242.0	6819.0
Los Angeles Lakers	3414.0	7525.0
Memphis Grizzlies	2984.0	6854.0
Miami Heat	3202.0	7037.0
Milwaukee Bucks	3190.0	6737.0
Minnesota Timberwolves	3235.0	6922.0
New Orleans Pelicans	3218.0	7154.0
New York Knicks	3244.0	7255.0
Oklahoma City Thunder	3237.0	7169.0

		FG	FGA
	Team		
	Orlando Magic	3139.0	7133.0
	Philadelphia 76ers	3322.0	7545.0
	Phoenix Suns	3270.0	7260.0
	Portland Trail Blazers	3243.0	7059.0
	Sacramento Kings	3105.0	6735.0
	San Antonio Spurs	3470.0	7284.0
	тот	8434.0	18976.0
	Toronto Raptors	3211.0	6918.0
In [188]:	FG_df['FG%'] = FG_o	df['FG	']/FG_df['FGA']
In [189]:	FG_df.loc[FG_df['F	G%'] <b>==</b>	FG_df['FG%'].max()]
Out[189]:		FG	FGA FG%
	Team		
	Golden State Warriors 35	532.0 71	40.0 0.494678

**▼** 14. What's the difference between the best and worst 3P shooters (by position)?

```
In [194]: Pos df = df.groupby('Pos')[['3P','3PA']].sum()
           Pos df.head()
Out[194]:
                          3PA
                    3P
             Pos
              C 1617.0 4583.0
              PF 3903.0 11325.0
                   33.0
            PF-C
                          98.0
             PG 6116.0 17034.0
              SF 6495.0 18508.0
In [199]: Pos df['3P%'] = Pos df['3P']/Pos df['3PA']
           Pos_df
Out[199]:
                    3P
                           3PA
                                  3P%
             Pos
              C 1617.0
                         4583.0 0.352826
              PF 3903.0 11325.0 0.344636
                   33.0
                          98.0 0.336735
            PF-C
             PG 6116.0 17034.0 0.359047
              SF 6495.0 18508.0 0.350929
             SG 8357.0 22627.0 0.369338
In [201]: Pos_df['3P%'].max()
Out[201]: 0.36933751712555796
```

```
In [202]: Pos_df['3P%'].min()
Out[202]: 0.336734693877551
```

▼ 15. Find the best scorers in each team

In [206]:	df.iloc[0].T	
Out[206]:	Player	Alex Abrines
	Pos	SG
	Age	23.0
	Tm	0KC
	G	68.0
	GS	6.0
	MP	1055.0
	ORB%	1.9
	DRB%	7.1
	TRB%	4.5
	AST%	5.5
	STL%	1.7
	BLK%	0.6
	T0V%	8.3
	FG	134.0
	FGA	341.0
	3P	94.0
	3PA	247.0
	2P	40.0
	2PA	94.0
	2P%	0.426
	FT	44.0
	FTA	49.0
	ORB	18.0
	DRB	68.0
	TRB AST	86.0 40.0
	STL	37.0
	BLK	8.0
	TOV	33.0
	PF	114.0
	PTS	406.0
	year start	2017
	year_start	2018
	position	G-F
	height	6-6
	weight	190.0
	birth date	1993-08-01 00:00:00
	= "	

college NaN
Team Oklahoma City Thunder

Name: 0. dtvpe: obiect

## Out[211]:

	Player	Pos	Age	Tm	G	GS	MP	ORB%	DRB%	TRB%	 PTS	year_start	year_end	position	height	weight	birth_date	col
0	Alex Abrines	SG	23.0	OKC	68.0	6.0	1055.0	1.9	7.1	4.5	 406.0	2017	2018	G-F	6-6	190.0	1993-08-01	
1	Quincy Acy	PF	26.0	тот	38.0	1.0	558.0	3.9	18.0	11.0	 222.0	2013	2018	F	6-7	240.0	1990-10-06	B Unive
2	Quincy Acy	PF	26.0	DAL	6.0	0.0	48.0	4.6	15.2	9.7	 13.0	2013	2018	F	6-7	240.0	1990-10-06	B Univ€
3	Quincy Acy	PF	26.0	BRK	32.0	1.0	510.0	3.8	18.2	11.1	 209.0	2013	2018	F	6-7	240.0	1990-10-06	B Univ€
4	Steven	С	23.0	OKC	80.0	80.0	2389.0	13.0	15.5	14.2	 905.0	2014	2018	С	7-0	255.0	1993-07-20	Univ€
	Adams																	Pittsb

5 rows × 41 columns

```
In [223]: best_scorers_per_team = df.loc[df['PTS']==df['Best_score_per_team'],['Player','Team','Pos','PTS']].sort_valuest_scorers_per_team = best_scorers_per_team.loc[best_scorers_per_team['Team']!='TOT']
    best_scorers_per_team
```

## Out[223]:

Player	Team	Pos	PTS
Russell Westbrook	Oklahoma City Thunder	PG	2558.0
James Harden	Houston Rockets	PG	2356.0
Isaiah Thomas	Boston Celtics	PG	2199.0
Anthony Davis	New Orleans Pelicans	С	2099.0
Karl-Anthony Towns	Minnesota Timberwolves	С	2061.0
Damian Lillard	Portland Trail Blazers	PG	2024.0
DeMar DeRozan	Toronto Raptors	SG	2020.0
Stephen Curry	Golden State Warriors	PG	1999.0
LeBron James	Cleveland Cavaliers	SF	1954.0
Kawhi Leonard	San Antonio Spurs	SF	1888.0
Giannis Antetokounmpo	Milwaukee Bucks	SF	1832.0
Kemba Walker	Charlotte Hornets	PG	1830.0
Jimmy Butler	Chicago Bulls	SF	1816.0
John Wall	Washington Wizards	PG	1805.0
Paul George	Indiana Pacers	SF	1775.0
Devin Booker	Phoenix Suns	SG	1726.0
Carmelo Anthony	New York Knicks	SF	1659.0
Gordon Hayward	Utah Jazz	SF	1601.0
Brook Lopez	Brooklyn Nets	С	1539.0
DeMarcus Cousins	Sacramento Kings	С	1528.0
Harrison Barnes	Dallas Mavericks	PF	1518.0
	Russell Westbrook James Harden Isaiah Thomas Anthony Davis Karl-Anthony Towns Damian Lillard DeMar DeRozan Stephen Curry LeBron James Kawhi Leonard Giannis Antetokounmpo Kemba Walker Jimmy Butler John Wall Paul George Devin Booker Carmelo Anthony Gordon Hayward Brook Lopez DeMarcus Cousins	Russell Westbrook James Harden James Harden Isaiah Thomas Boston Celtics Anthony Davis Karl-Anthony Towns Damian Lillard DeMar DeRozan Stephen Curry LeBron James Kawhi Leonard Giannis Antetokounmpo Kemba Walker Jimmy Butler John Wall Paul George Devin Booker Carmelo Anthony DeMarcus Cousins Colklahoma City Thunder Houston Rockets Boston Celtics New Orleans Pelicans Minnesota Timberwolves Portland Trail Blazers Cloveland Trail Blazers Cleveland Cavaliers Cleveland Cavaliers Cleveland Cavaliers Charlotte Hornets Charlotte Hornets Utah Jazz Brook Lopez Brooklyn Nets DeMarcus Cousins	Russell Westbrook Oklahoma City Thunder PG James Harden Houston Rockets PG Isaiah Thomas Boston Celtics PG Anthony Davis New Orleans Pelicans C Karl-Anthony Towns Minnesota Timberwolves C Damian Lillard Portland Trail Blazers PG DeMar DeRozan Toronto Raptors SG Stephen Curry Golden State Warriors PG LeBron James Cleveland Cavaliers SF Kawhi Leonard San Antonio Spurs SF Kamba Walker Charlotte Hornets PG Jimmy Butler Chicago Bulls SF John Wall Washington Wizards PG Paul George Indiana Pacers SF Devin Booker Phoenix Suns SG Carmelo Anthony New York Knicks SF Gordon Hayward Utah Jazz SF Brook Lopez Brooklyn Nets C

	Player	Team	Pos	PTS
136	Goran Dragic	Miami Heat	PG	1483.0
180	Marc Gasol	Memphis Grizzlies	С	1446.0
488	Dennis Schroder	Atlanta Hawks	PG	1414.0
222	Tobias Harris	Detroit Pistons	PF	1321.0
209	Blake Griffin	Los Angeles Clippers	PF	1316.0
289	Nikola Jokic	Denver Nuggets	С	1221.0
101	Jordan Clarkson	Los Angeles Lakers	SG	1205.0

```
In [224]: best_scorers_per_team.shape
```

Out[224]: (30, 4)

**▼** 16. Which team has the 'youngest squad', by average player age?

```
In [228]: s1 = df['Team'].value counts()
          s1
Out[228]: Team
          T0T
                                     54
                                     27
          New Orleans Pelicans
          Dallas Mavericks
                                     24
          Philadelphia 76ers
                                     22
          Atlanta Hawks
                                     22
          Cleveland Cavaliers
                                     22
          Brooklyn Nets
                                     21
                                     20
          Milwaukee Bucks
                                     19
          Los Angeles Lakers
          Charlotte Hornets
                                     19
          Orlando Magic
                                     19
          Denver Nuggets
                                     19
          Oklahoma City Thunder
                                     19
                                     19
          Sacramento Kings
          Phoenix Suns
                                     18
          Chicago Bulls
                                     18
                                     18
          Washington Wizards
          Houston Rockets
                                     18
          San Antonio Spurs
                                     17
          Golden State Warriors
                                     17
          Toronto Raptors
                                     17
          Indiana Pacers
                                     17
                                     17
          Memphis Grizzlies
                                     16
          Minnesota Timberwolves
          New York Knicks
                                     16
          Miami Heat
                                     15
          Detroit Pistons
                                     15
          Utah Jazz
                                     15
                                     15
          Boston Celtics
          Portland Trail Blazers
                                     15
                                     15
          Los Angeles Clippers
          Name: count, dtype: int64
```

```
In [229]: s2 = df.groupby('Team')['Age'].sum()
          s2
Out[229]: Team
          Atlanta Hawks
                                      624.0
                                      379.0
          Boston Celtics
                                      542.0
          Brooklyn Nets
          Charlotte Hornets
                                      490.0
          Chicago Bulls
                                      466.0
          Cleveland Cavaliers
                                      667.0
          Dallas Mavericks
                                      642.0
                                      484.0
          Denver Nuggets
                                      382.0
          Detroit Pistons
          Golden State Warriors
                                      474.0
                                      468.0
          Houston Rockets
          Indiana Pacers
                                      454.0
          Los Angeles Clippers
                                      443.0
                                      505.0
          Los Angeles Lakers
          Memphis Grizzlies
                                      463.0
          Miami Heat
                                      399.0
                                      518.0
          Milwaukee Bucks
                                      411.0
          Minnesota Timberwolves
          New Orleans Pelicans
                                      701.0
          New York Knicks
                                      426.0
          Oklahoma City Thunder
                                      493.0
          Orlando Magic
                                      484.0
          Philadelphia 76ers
                                      548.0
          Phoenix Suns
                                      462.0
          Portland Trail Blazers
                                      365.0
                                      508.0
          Sacramento Kings
                                      493.0
          San Antonio Spurs
          T0T
                                     1434.0
          Toronto Raptors
                                      427.0
          Utah Jazz
                                      393.0
          Washington Wizards
                                      462.0
          Name: Age, dtype: float64
```

In [231]: Age\_df = pd.concat([s1,s2],axis=1)
Age\_df

Out[231]:

	count	Age
Team		
тот	54	1434.0
New Orleans Pelicans	27	701.0
Dallas Mavericks	24	642.0
Philadelphia 76ers	22	548.0
Atlanta Hawks	22	624.0
<b>Cleveland Cavaliers</b>	22	667.0
Brooklyn Nets	21	542.0
Milwaukee Bucks	20	518.0
Los Angeles Lakers	19	505.0
<b>Charlotte Hornets</b>	19	490.0
Orlando Magic	19	484.0
<b>Denver Nuggets</b>	19	484.0
Oklahoma City Thunder	19	493.0
Sacramento Kings	19	508.0
Phoenix Suns	18	462.0
Chicago Bulls	18	466.0
Washington Wizards	18	462.0
<b>Houston Rockets</b>	18	468.0
San Antonio Spurs	17	493.0
Golden State Warriors	17	474.0
Toronto Raptors	17	427.0

	count	Age
Team		
Indiana Pacers	17	454.0
Memphis Grizzlies	17	463.0
Minnesota Timberwolves	16	411.0
New York Knicks	16	426.0
Miami Heat	15	399.0
<b>Detroit Pistons</b>	15	382.0
Utah Jazz	15	393.0
Boston Celtics	15	379.0

In [234]: Age\_df['Avg\_Age'] = Age\_df['Age']/Age\_df['count']
Age\_df.sort\_values('Avg\_Age',ascending=True)

Out[234]:

	count	Age	Avg_Age
Team			
Portland Trail Blazers	15	365.0	24.333333
Philadelphia 76ers	22	548.0	24.909091
Toronto Raptors	17	427.0	25.117647
<b>Boston Celtics</b>	15	379.0	25.266667
<b>Detroit Pistons</b>	15	382.0	25.466667
Orlando Magic	19	484.0	25.473684
Denver Nuggets	19	484.0	25.473684
Phoenix Suns	18	462.0	25.666667
Washington Wizards	18	462.0	25.666667
Minnesota Timberwolves	16	411.0	25.687500
<b>Charlotte Hornets</b>	19	490.0	25.789474
Brooklyn Nets	21	542.0	25.809524
Chicago Bulls	18	466.0	25.888889
Milwaukee Bucks	20	518.0	25.900000
Oklahoma City Thunder	19	493.0	25.947368
New Orleans Pelicans	27	701.0	25.962963
<b>Houston Rockets</b>	18	468.0	26.000000
Utah Jazz	15	393.0	26.200000
тот	54	1434.0	26.55556
Los Angeles Lakers	19	505.0	26.578947
Miami Heat	15	399.0	26.600000

	count	Age	Avg_Age
Team			
New York Knicks	16	426.0	26.625000
Indiana Pacers	17	454.0	26.705882
Sacramento Kings	19	508.0	26.736842
Dallas Mavericks	24	642.0	26.750000
Memphis Grizzlies	17	463.0	27.235294
Golden State Warriors	17	474.0	27.882353
Atlanta Hawks	22	624.0	28.363636
San Antonio Spurs	17	493.0	29.000000

In [ ]: