

NBA Player Performance Analysis in Different Season---

Brandon Ingram

In [9]:

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

In [10]:

```
from sklearn.model_selection import train_test_split, cross_val_score
from sklearn.linear_model import LinearRegression
from sklearn import metrics
from sklearn.pipeline import make_pipeline
```

In [11]:

```
games = pd.read_csv("games.csv")
details = pd.read_csv("games_details.csv")
teams = pd.read_csv("teams.csv")
players = pd.read_csv("players.csv")
ranking = pd.read_csv("ranking.csv")
```

In [12]:

```
players.head()
```

Out[12]:

	PLAYER_NAME	TEAM_ID	PLAYER_ID	SEASON
0	Royce O'Neale	1610612762	1626220	2019
1	Bojan Bogdanovic	1610612762	202711	2019
2	Rudy Gobert	1610612762	203497	2019
3	Donovan Mitchell	1610612762	1628378	2019
4	Mike Conley	1610612762	201144	2019

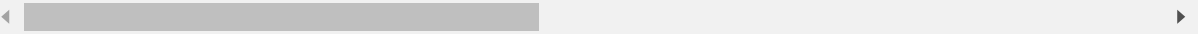
In [13]:

```
details.head()
```

Out[13]:

	GAME_ID	TEAM_ID	TEAM_ABBREVIATION	TEAM_CITY	PLAYER_ID	PLAYER_NAME	NIC
0	22100213	1610612764	WAS	Washington	203484	Kentavious Caldwell-Pope	Ke
1	22100213	1610612764	WAS	Washington	1628398	Kyle Kuzma	
2	22100213	1610612764	WAS	Washington	1629655	Daniel Gafford	
3	22100213	1610612764	WAS	Washington	203078	Bradley Beal	
4	22100213	1610612764	WAS	Washington	203915	Spencer Dinwiddie	

5 rows × 29 columns

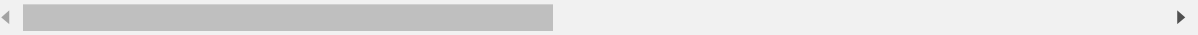


In [14]:

```
teams.head()
```

Out[14]:

	LEAGUE_ID	TEAM_ID	MIN_YEAR	MAX_YEAR	ABBREVIATION	NICKNAME	YEARFOUNDED
0	0	1610612737	1949	2019	ATL	Hawks	19
1	0	1610612738	1946	2019	BOS	Celtics	19
2	0	1610612740	2002	2019	NOP	Pelicans	20
3	0	1610612741	1966	2019	CHI	Bulls	19
4	0	1610612742	1980	2019	DAL	Mavericks	19



In [15]:

```
ranking.head()
```

Out[15]:

	TEAM_ID	LEAGUE_ID	SEASON_ID	STANDINGSDATE	CONFERENCE	TEAM	G	W	L
0	1610612744	0	22021	2021-11-17	West	Golden State	14	12	2
1	1610612756	0	22021	2021-11-17	West	Phoenix	14	11	3
2	1610612742	0	22021	2021-11-17	West	Dallas	14	9	5
3	1610612743	0	22021	2021-11-17	West	Denver	14	9	5
4	1610612746	0	22021	2021-11-17	West	LA Clippers	14	9	5

In [16]:

```
games.head()
```

Out[16]:

	GAME_DATE_EST	GAME_ID	GAME_STATUS_TEXT	HOME_TEAM_ID	VISITOR_TEAM_ID	SEA
0	2021-11-17	22100213	Final	1610612766	1610612764	
1	2021-11-17	22100214	Final	1610612765	1610612754	
2	2021-11-17	22100215	Final	1610612737	1610612738	
3	2021-11-17	22100216	Final	1610612751	1610612739	
4	2021-11-17	22100217	Final	1610612748	1610612740	

5 rows × 21 columns

```
details = details.drop_duplicates(subset=["GAME_ID", "PLAYER_NAME"])
details.head
```

<bound method NDFrame.head of			GAME_ID	TEAM_ID	TEAM_ABBREVIATION	TEAM_
CITY	PLAYER_ID	\				
0	22100213	1610612764	WAS	Washington	203484	
1	22100213	1610612764	WAS	Washington	1628398	
2	22100213	1610612764	WAS	Washington	1629655	
3	22100213	1610612764	WAS	Washington	203078	
4	22100213	1610612764	WAS	Washington	203915	
...	
626106	11200005	1610612743	DEN	Denver	202706	
626107	11200005	1610612743	DEN	Denver	202702	
626108	11200005	1610612743	DEN	Denver	201585	
626109	11200005	1610612743	DEN	Denver	202389	
626110	11200005	1610612743	DEN	Denver	201951	

	PLAYER_NAME	NICKNAME	START_POSITION	COMMENT	MIN
0	Kentavious Caldwell-Pope	Kentavious	F	NaN	27:41
1	Kyle Kuzma	Kyle	F	NaN	30:28
2	Daniel Gafford	Daniel	C	NaN	24:21
3	Bradley Beal	Bradley	G	NaN	35:07
4	Spencer Dinwiddie	Spencer	G	NaN	28:34
...
626106	Jordan Hamilton	NaN	NaN	NaN	19
626107	Kenneth Faried	NaN	NaN	NaN	23
626108	Kosta Koufos	NaN	NaN	NaN	15
626109	Timofey Mozgov	NaN	NaN	NaN	19
626110	Ty Lawson	NaN	NaN	NaN	27

	...	OREB	DREB	REB	AST	STL	BLK	TO	PF	PTS	PLUS_MINUS
0	...	1.0	5.0	6.0	2.0	1.0	0.0	1.0	0.0	3.0	2.0
1	...	1.0	4.0	5.0	3.0	1.0	2.0	1.0	1.0	5.0	-14.0
2	...	2.0	7.0	9.0	1.0	2.0	1.0	1.0	4.0	20.0	-2.0
3	...	0.0	3.0	3.0	7.0	2.0	0.0	2.0	3.0	24.0	-9.0
4	...	0.0	3.0	3.0	2.0	0.0	0.0	2.0	1.0	0.0	-5.0
...
626106	...	0.0	2.0	2.0	0.0	2.0	0.0	1.0	3.0	17.0	NaN
626107	...	1.0	0.0	1.0	1.0	1.0	0.0	3.0	3.0	18.0	NaN
626108	...	3.0	5.0	8.0	0.0	1.0	0.0	0.0	3.0	6.0	NaN
626109	...	1.0	2.0	3.0	1.0	0.0	0.0	4.0	2.0	2.0	NaN
626110	...	0.0	2.0	2.0	6.0	2.0	0.0	6.0	1.0	8.0	NaN

```
ingram = details[details["PLAYER_NAME"]== "Brandon Ingram"]
ingram.drop(["TEAM ID","TEAM CITY","PLAYER ID","PLAYER NAME","COMMENT"],axis= "columns",inplace=True)
```

In [20]:

```
ingram.head
```

Out[20]:

<bound method NDFrame.head of					GAME_ID TEAM_ABBREVIATION NICKNAME START_POSITION								
	MIN	FGM	FGA	\									
105	22100217				NOP	Brandon		F	37:28	6.0	14.0		
415	22100201				NOP	Brandon		F	32:07	9.0	23.0		
926	22100188				NOP	Brandon		F	29:27	7.0	17.0		
1884	22100150				NOP	Brandon	NaN	NaN	NaN	NaN			
2544	22100130				NOP	Brandon	NaN	NaN	NaN	NaN			
...		
477238	11600058				LAL	NaN	NaN	27:50	3.0	7.0			
477661	11600047				LAL	NaN	NaN	24:12	2.0	6.0			
477986	11600036				LAL	NaN	NaN	19:04	1.0	2.0			
478310	11600028				LAL	NaN	NaN	17:28	2.0	8.0			
478756	11600015				LAL	NaN	NaN	26:41	0.0	5.0			
	FG_PCT	FG3M	FG3A	...	OREB	DREB	REB	AST	STL	BLK	TO	PF	\
105	0.429	1.0	6.0	...	0.0	4.0	4.0	5.0	0.0	0.0	5.0	2.0	
415	0.391	2.0	4.0	...	0.0	5.0	5.0	4.0	0.0	0.0	1.0	1.0	
926	0.412	1.0	4.0	...	0.0	3.0	3.0	4.0	0.0	1.0	4.0	3.0	
1884	NaN	NaN	NaN	...	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	
2544	NaN	NaN	NaN	...	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	
...	
477238	0.429	1.0	4.0	...	1.0	1.0	2.0	2.0	0.0	0.0	0.0	2.0	
477661	0.333	1.0	3.0	...	1.0	1.0	2.0	0.0	0.0	1.0	1.0	1.0	
477986	0.500	0.0	0.0	...	0.0	2.0	2.0	0.0	1.0	3.0	0.0	1.0	
478310	0.250	1.0	2.0	...	1.0	1.0	2.0	2.0	1.0	1.0	0.0	1.0	
478756	0.000	0.0	4.0	...	0.0	2.0	2.0	1.0	1.0	2.0	1.0	2.0	
	PTS	PLUS_MINUS											
105	19.0	-13.0											
415	31.0	-2.0											
926	19.0	10.0											
1884	NaN	NaN											
2544	NaN	NaN											
...											
477238	7.0	-27.0											
477661	5.0	1.0											
477986	4.0	0.0											
478310	6.0	18.0											
478756	2.0	20.0											
[378 rows x 24 columns]>													

In [21]:

```
game_date = games[["GAME_DATE_EST", "GAME_ID", "SEASON"]]  
game_date.head()
```

Out[21]:

	GAME_DATE_EST	GAME_ID	SEASON
0	2021-11-17	22100213	2021
1	2021-11-17	22100214	2021
2	2021-11-17	22100215	2021
3	2021-11-17	22100216	2021
4	2021-11-17	22100217	2021

In [22]:

```
stats=ingram.merge(game_date, on="GAME_ID", how="left")
```

In [23]:

```
stats.head
```

Out[23]:

<bound method NDFrame.head of					GAME_ID	TEAM_ABBREVIATION	NICKNAME	START_POSITION							
N	MIN	FGM	FGA	\											
0	22100217				NOP	Brandon	F	37:28	6.0	14.0					
1	22100201				NOP	Brandon	F	32:07	9.0	23.0					
2	22100188				NOP	Brandon	F	29:27	7.0	17.0					
3	22100150				NOP	Brandon	NaN	NaN	NaN	NaN					
4	22100130				NOP	Brandon	NaN	NaN	NaN	NaN					
...					
376	11600058				LAL	NaN	NaN	27:50	3.0	7.0					
377	11600047				LAL	NaN	NaN	24:12	2.0	6.0					
378	11600036				LAL	NaN	NaN	19:04	1.0	2.0					
379	11600028				LAL	NaN	NaN	17:28	2.0	8.0					
380	11600015				LAL	NaN	NaN	26:41	0.0	5.0					
	FG_PCT	FG3M	FG3A	...	REB	AST	STL	BLK	TO	PF	PTS	PLUS_MINUS	\		
0	0.429	1.0	6.0	...	4.0	5.0	0.0	0.0	5.0	2.0	19.0	-13.0			
1	0.391	2.0	4.0	...	5.0	4.0	0.0	0.0	1.0	1.0	31.0	-2.0			
2	0.412	1.0	4.0	...	3.0	4.0	0.0	1.0	4.0	3.0	19.0	10.0			
3	NaN	NaN	NaN	...	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN			
4	NaN	NaN	NaN	...	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN			
...			
376	0.429	1.0	4.0	...	2.0	2.0	0.0	0.0	0.0	2.0	7.0	-27.0			
377	0.333	1.0	3.0	...	2.0	0.0	0.0	1.0	1.0	1.0	5.0	1.0			
378	0.500	0.0	0.0	...	2.0	0.0	1.0	3.0	0.0	1.0	4.0	0.0			
379	0.250	1.0	2.0	...	2.0	2.0	1.0	1.0	0.0	1.0	6.0	18.0			
380	0.000	0.0	4.0	...	2.0	1.0	1.0	2.0	1.0	2.0	2.0	20.0			
	GAME_DATE_EST	SEASON													
0	2021-11-17	2021													
1	2021-11-15	2021													
2	2021-11-13	2021													
3	2021-11-08	2021													
4	2021-11-05	2021													
...													
376	2016-10-13	2016													
377	2016-10-11	2016													
378	2016-10-09	2016													
379	2016-10-07	2016													
380	2016-10-04	2016													
[381 rows x 26 columns]>															

In [24]:

```
seasonal_stats = stats.groupby("SEASON").sum()/stats.groupby("SEASON").count()
```

In [25]:

```
seasonal_stats.head
```

Out[25]:

<bound method NDFrame.head of				AST	BLK	DREB	FG3A	FG
3M	FG3_PCT	FGA	\					
SEASON								
2016	2.057471	0.505747	3.103448	2.356322	0.712644	0.255161	8.413793	
2017	3.750000	0.703125	4.296875	1.828125	0.687500	0.264047	12.703125	
2018	2.842105	0.596491	4.350877	1.771930	0.561404	0.259053	13.789474	
2019	3.985507	0.565217	5.086957	5.913043	2.318841	0.394217	16.927536	
2020	4.833333	0.590909	4.454545	6.060606	2.287879	0.351303	17.787879	
2021	4.500000	0.400000	5.100000	4.800000	1.900000	0.367900	19.600000	

	FGM	FG_PCT	FTA	...	NICKNAME	OREB	PF	\
SEASON								
2016	3.379310	0.387161	2.781609	...	NaN	0.758621	1.942529	
2017	5.890625	0.469609	4.656250	...	NaN	0.937500	2.750000	
2018	6.824561	0.499158	5.771930	...	NaN	0.771930	2.842105	
2019	7.840580	0.470072	5.681159	...	NaN	0.811594	2.797101	
2020	8.257576	0.466939	5.242424	...	NaN	0.575758	2.015152	
2021	8.900000	0.458600	4.200000	...	NaN	0.600000	2.500000	

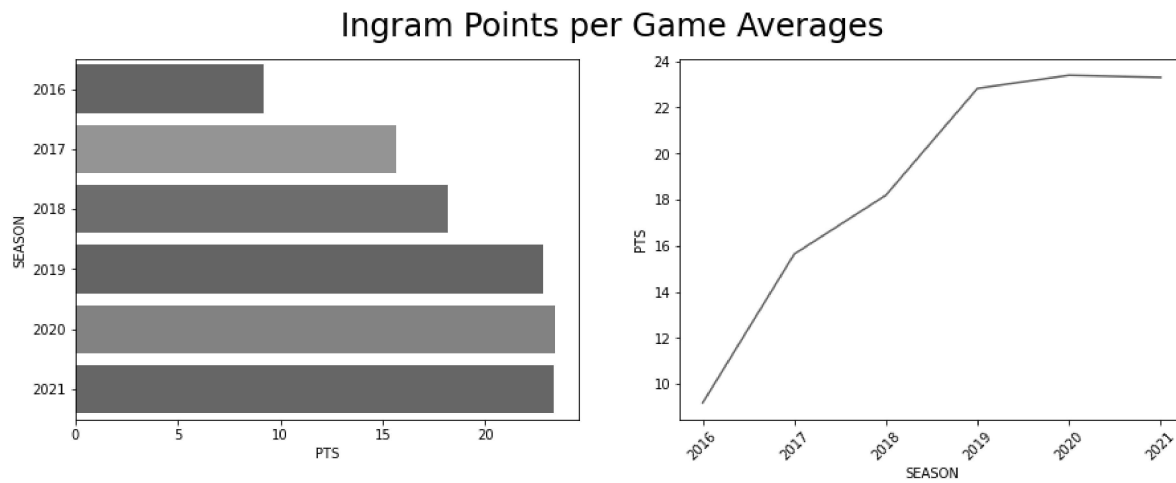
	PLUS_MINUS	PTS	REB	START_POSITION	STL	\
SEASON						
2016	-4.195402	9.183908	3.862069		NaN	0.643678
2017	-2.468750	15.640625	5.234375		NaN	0.765625
2018	-0.771930	18.192982	5.122807		NaN	0.614035
2019	-0.507246	22.826087	5.898551		NaN	0.942029
2020	0.712121	23.393939	5.030303		NaN	0.696970
2021	-5.700000	23.300000	5.700000		NaN	0.400000

	TEAM_ABBREVIATION	TO
SEASON		
2016	NaN	1.390805
2017	NaN	2.531250
2018	NaN	2.456140
2019	NaN	2.927536
2020	NaN	2.515152
2021	NaN	3.500000

[6 rows x 25 columns]>

In [26]:

```
fig, axes = plt.subplots(1, 2, figsize= (15, 5))
fig.suptitle("Ingram Points per Game Averages", fontsize = 24)
sns.barplot(x=seasonal_stats["PTS"], y=seasonal_stats.index.map(str), ax=axes[0])
sns.lineplot(x=seasonal_stats.index.map(str), y=seasonal_stats["PTS"], ax=axes[1])
axes[1].tick_params(axis='x', labelrotation=45)
```



In []: