## The Perfect Draft

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#### Background Info/Problem Recap

- NBA Draft held once per year after completion of each season
- Best draft eligible players selected by teams
  - Draft order determined by lottery: worst teams from previous season have best odds at getting first
     pick
- Problem: Hundreds of draft eligible players each year
- Can be hard to analyze all players
  - What stats most important, take into account team need

#### Proposed Solution

- Cluster players into various groups based on statistical performance
  - Can be used to evaluate based off of team need
- Create predictive model based on player performance
  - Used to evaluate best overall player
- Combine two together with model/random forest/decision tree
- Only focus on analyzing players drafted in first round
  - More clarity, less randomness with players drafted in first round

#### Dataset Overview: Players

- 12000 NCAA players dating back to 2009-10 Season
- Features: player name, team, season, GP, 20 player per game performance

#### measures

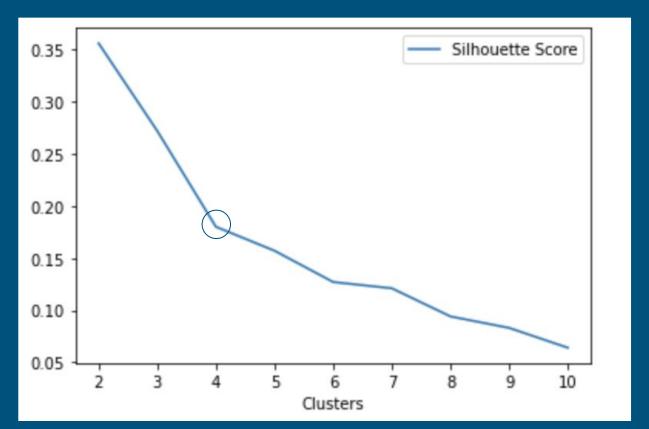
	Player	Team	GP	MPG	FGM	FGA	FG%	3PM	3PA	3P%	•••	TOV	PF	ORB	DRB	RPG	APG	SPG	BPG	PPG	season
0	Aubrey Coleman	U of H	35	36.9	8.7	20.5	0.425	1.5	4.6	0.317	•••	2.3	2.2	2.4	5.0	7.4	2.6	2.7	0.2	25.6	2010
1	Adnan Hodzic	LIP	30	32.3	9.0	14.8	0.604	0.0	0.0	0.000		2.7	2.2	3.4	5.6	9.1	8.0	0.5	0.4	22.7	2010
2	Keith Haynes	UTA	30	33.3	7.2	14.8	0.483	2.1	5.1	0.409		3.6	2.1	0.8	3.5	4.3	3.7	1.5	0.3	22.6	2010
3	Adrian Oliver	SJSU	31	36.1	7.4	17.0	0.437	1.6	4.0	0.408		3.2	3.0	1.6	3.7	5.3	2.9	1.0	0.5	22.5	2010
4	Devan Downey	USC	31	34.0	7.6	19.1	0.400	2.2	6.5	0.342		3.5	2.3	0.5	2.7	3.3	3.5	2.7	0.0	22.5	2010

#### Dataset Overview: Teams

- Each NBA team from 2010-2020
- Features: WIN%, PTS, FG%, 3PT%, FT%, RPG, APG, TOV, STL, BLK

	TEAM	Season	GP	w	L	WIN%	MIN	PTS	FGM	FGA	 DREB	REB	AST	TOV	STL	BLK	BLKA	PF	PFD	+/-
0	Utah Jazz	2020.0	72.0	52.0	20.0	0.722	48.2	116.4	41.3	88.1	 37.6	48.3	23.7	14.2	6.6	5.2	3.9	18.5	19.0	9.3
1	Phoenix Suns	2020.0	72.0	51.0	21.0	0.708	48.6	115.3	43.3	88.3	 34.2	42.9	26.9	12.5	7.2	4.3	3.6	19.1	18.0	5.8
2	Philadelphia 76ers	2020.0	72.0	49.0	23.0	0.681	48.4	113.6	41.4	86.9	 35.0	45.1	23.7	14.4	9.1	6.2	4.7	20.2	21.0	5.6
3	Brooklyn Nets	2020.0	72.0	48.0	24.0	0.667	48.3	118.6	43.1	87.3	 35.5	44.4	26.8	13.5	6.7	5.3	4.6	19.0	18.9	4.5
4	Denver Nuggets	2020.0	72.0	47.0	25.0	0.653	48.6	115.1	43.3	89.2	 33.9	44.4	26.8	13.5	8.1	4.5	4.5	19.1	19.2	4.9

- Used k-means clustering, pipeline models in spark to create clusters
  - Clustered based on all player metrics mentioned earlier
- Clustered entire dataset, then filtered out first rounders for analysis
- Based on Silhouette score analysis, 4 clusters gave best results
- Although Silhouette scores were kind of low, clusters still appeared to be fairly defined, easy to identify groups



Clustered Resulted in four groups of players who fall into various groups

Cluster	Skillset
0	Big Men
1	Scorers
2	3-Point Specialists
3	Defensive Specialists

cluster	FGM	FGA	FG%	3PM	3PA	3P%	FTM	FTA	FT%	ORB	DRB	RPG	APG	SPG	BPG	PPG
(	5.5311111	10.1588889	0.54675556	0.44111111	1.25666667	0.26444444	3.37	4.9355556	0.67986667	2.82444444	5.9	8.7222222	1.53888889	0.97111111	1.58222222	14.8733333
:	1 6.35779817	13.7009174	0.46538532	1.95779817	5.17522936	0.37438532	4.20825688	5.29724771	0.79544037	1.29174312	4.33486239	5.62844037	3.21651376	1.36238532	0.54770642	18.8844037
	2 4.38571429	9.61904762	0.45728571	1.72857143	4.45714286	0.39157143	1.95714286	2.55714286	0.76928571	0.88571429	3.20952381	4.10952381	2.11904762	0.95238095	0.46190476	12.4619048
	4.66285714	10.2771429	0.45465714	1.25428571	3.42285714	0.35745714	3.01714286	4.1	0.74217143	1.00285714	3.69142857	4.68857143	4.00857143	1.47714286	0.49428571	13.5914286

- Cluster 0: Big Guys
  - Highest Rebounds/Game,
     Blocks/Game, Field Goal%
- Example: Anthony Davis



- Cluster 1: Scorers
  - Highest points/game, field goal makes/attempts, 2nd FG%
- Example: Cade Cunningham



- Cluster 2: Shooters
  - Highest 3P%, fewest free throws made/attempted
- Example: Landry Shamet



- Cluster 3: Defensive Guys
  - Highest Steals/game
- Example: Eric Bledsoe



Cluster	Average Draft Position
0	14
1	15
2	18
3	17

#### Approach #2: Linear Regression

- Created linear regression model to predict draft pick
- Used as a rating system for players
- Features include player stats and mock draft data

#### Approach #2: Linear Regression

- Features: PPG, FGM, 3PM, RPG, TOV, BPG, APG, FGA, MPG, FTM, TOV, Mock
- R-squared (validation): 0.684
- RMSE (testing): 5.22

prediction	features	Drafted   Mock	VERALL PICK
3.64129977589884	[20.1,6.5,2.3,6.2	1.0  1.0	1.0
4.75656155851307	[16.4,6.0,0.4,8.7	1.0 3.0	3.0
5.55453780546218	[14.4,5.2,1.2,5.3	1.0 4.0	5.0
6.51263934876363	[10.3,4.1,0.5,4.0	1.0 5.0	4.0
8.64366422147782	[16.8,5.2,1.8,5.8	1.0 8.0	14.0
11.41122381497114	[12.5,4.4,1.2,6.5	1.0 9.0	8.0
12.34844939333109	[18.6,6.5,2.8,5.0	1.0   13.0	15.0
13.12497818179896	[14.0,5.3,2.1,2.7	1.0   14.0	9.0
13.25380197068944	[17.1,6.2,2.3,4.6	1.0   15.0	13.0
15.03427090355848	[16.5,6.9,0.0,7.5	1.0 16.0	20.0

#### Team Needs

- Teams will draft players based on what they are missing
- Original goal was to use a Random Forest model to predict type of player needed most (Shooter, Big Man, Scorer, Defense) based on previous year's stats
- Switched to Multinomial Logistic Regression

#### Team Needs: Multinomial Logistic Regression

- Focus on team stats that indicate weaknesses (3P%, Reb, Steals, etc.)
- Training Accuracy: 47.5
- Testing Accuracy: 46.1

predicted_cluster	0.0	1.0	2.0	3.0
cluster				
0.0	29	57	1	2
1.0	21	84	1	2
2.0	3	12	2	4
3.0	5	26	0	4

Pick location a major factor, scorers will be valued by all teams

# Draft Comparison

Pick 🔻	Actual <b>V</b>	Ours	Pick 🔻	Actual	Ours 🔻
1	Cade Cunningham	Cade Cunningham	16	Alperen Sengun	Ziaire Williams
2	Jalen Green	Evan Mobley	17	Trey Murphy III	Bones Hyland
3	Evan Mobley	Jalen Suggs	18	Tre Mann	Burile Belo
4	Scottie Barnes	Scottie Barnes	19	Kai Jones	Nick Muszynski
5	Jalen Suggs	Moses Moody	20	Jalen Johnson	Ayo Dosunmu
6	Josh Giddey	Franz Wagner	21	Keon Johnson	Scott Blakney
7	Jonathan Kuminga	Corey Kispert	22	Isaiah Jackson	Drew Timme
8	Franz Wagner	Davion Mitchell	23	Usman Garuba	Jaden Springer
9	Davion Mitchell	Chris Duarte	24	Josh Christopher	D.J. Burns, Jr.
10	Ziaire Williams	Jalen Johnson	25	Quentin Grimes	Scotty Pippen, Jr.
11	James Bouknight	Trey Murphy III	26	Bones Hyland	Braelen Bridges
12	Joshua Primo	Keon Johnson	27	Cam Thomas	James Jean-Marie
13	Chris Duarte	Miles McBride	28	Jaden Springer	Matt Lewis
14	Moses Moody	Jared Butler	29	Day'Ron Sharpe	Oscar da Silva
15	Corey Kispert	Cam Thomas	30	Santi Aldama	Karlis Silins

#### Factors to Improve Results

- Controllables
  - Including International Players

2. Gathering more advanced metrics

- Uncontrollables
  - Player
     Character

2. Injury History

# Thank you Questions?