

# NBA Shot Data Exploration and Visualization

General Assembly Data Analytics

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# Shot analysis with selected features

- Attempt to discover player rankings with different features
- Identify player tendencies
- Display statistics not usually found in official statistics sites
- Visualize player shots



# Available features from datasets

- Game/Date
- Match Up
- Home/Away
- Final margin
- Shot number
- Period
- Game/shot clock
- Dribbles
- Shot Distance
- Touch Time
- Event Type
- Action Type
- Shot Type
- X/Y Coordinates



# Identifying the 'Right' Dataset

- **Obtained data from GitHub**
  - User collected data from stats.nba.com
  - 30 MB - 203,589 rows, 490 unique players
  - Covers shots from 2014-15 NBA season
- **Secondary dataset scraped from stats.nba.com using Python**
  - Obtained 11 players' shot information, including X and Y coordinates of all shots in 2015-16 NBA season
- **Set up data in Excel and used basic data cleansing techniques**
- **Imported data to Tableau to generate visualizations and calculated fields**



# Understanding the Data

## Initial Assumptions/Limitations

- **Exclusion of Free Throws**
  - Point totals distorted
  - Unable to identify player strength from drawing fouls
- **Incomplete records (Data set 1)**
  - In addition to exclusion of free throws, some shots were not recorded
    - E.g. Stephen Curry recorded 1,573 points, but official NBA stats show 1,592
    - E.g. December 14, 2014 VS Pelicans, Curry's first shot in OT was not recorded, resulting in a difference of 2 points



# Data Cleaning

- **Separation of Date, Home Team, and Away Team from Matchup Column**
  - E.g. APR 15, 2015 - GSW vs. DEN
- **Shot Clock NULL Values**
  - When the game clock counts down to 24 seconds, it becomes the shot clock and the shot clock value becomes NULL
  - Filtered 4<sup>th</sup> quarter and overtimes and replaced NULL shot clock values with 'CLUTCH' to measure player effectiveness in high-pressure situations
- **Negative Touch Time Values**
  - 439 out of 203,589 rows (0.2%) excluded from data analysis



# Exploratory Data Analysis

- **Shot Number**

- Mean = 6.29
- Median = 5
- Max = 43 (Russell Westbrook)
- Variance = 21.45
- Standard Dev. = 4.63

- **Largest Final Margin**

- 53 (123 – 70 DAL vs. PHI)

- **Dribbles**

- Mean = 2.00
- Median = 1
- Max = 32 (Mo Williams)
- Variance = 11.78
- Standard Dev. = 3.43

- **Shot Distance**

- Mean = 13.61
- Median = 13.6
- Max = 47.4 (Michael Carter-Williams)
- Variance = 79.54
- Standard Dev. = 8.92



# Data Visualization with Tableau

## Setup

### Workbook 1

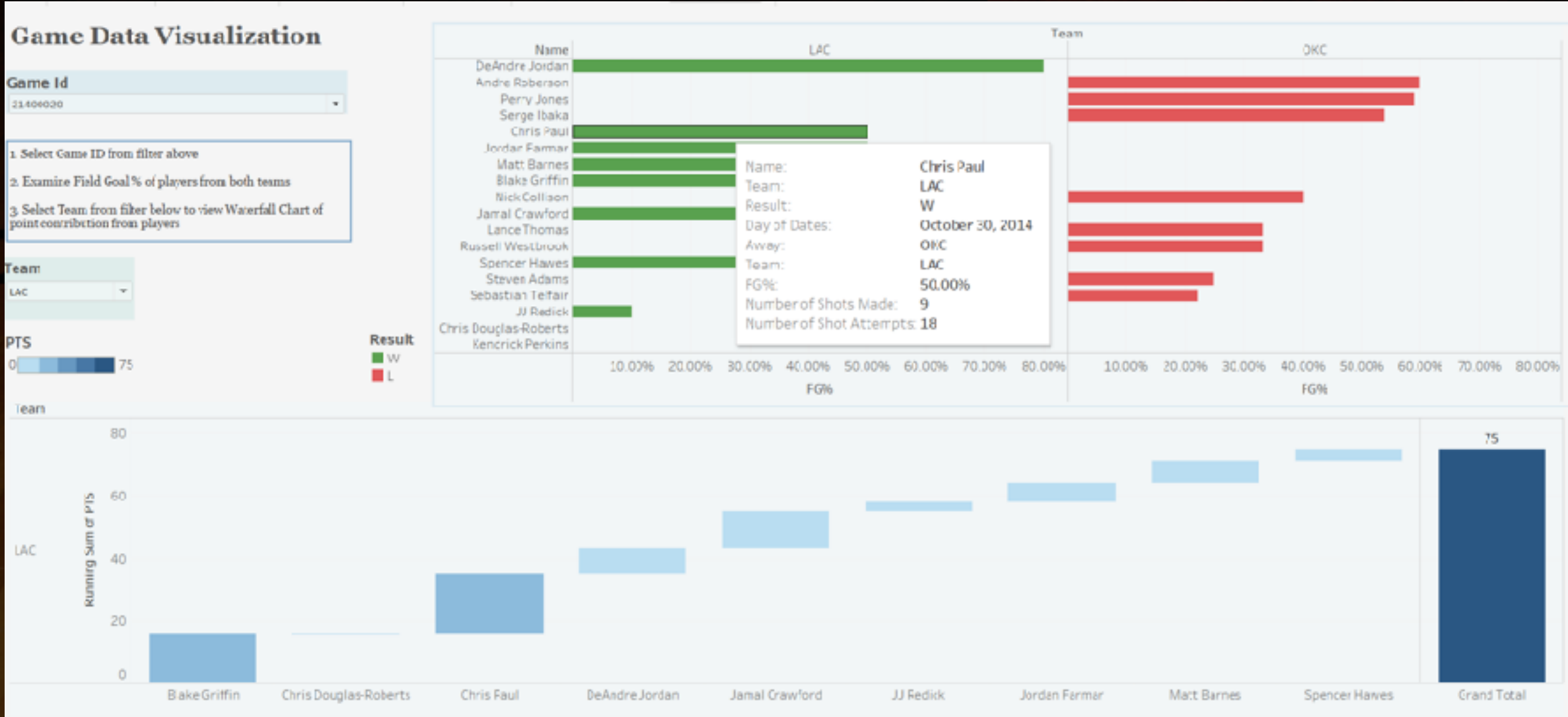
- Left join Shots dataset with CSV file of Player ID, Name, and an image URL of player

### Workbook 2

- Inner join CSV file of Player ID, Name, and image URL with CSV file of scraped data of 11 players

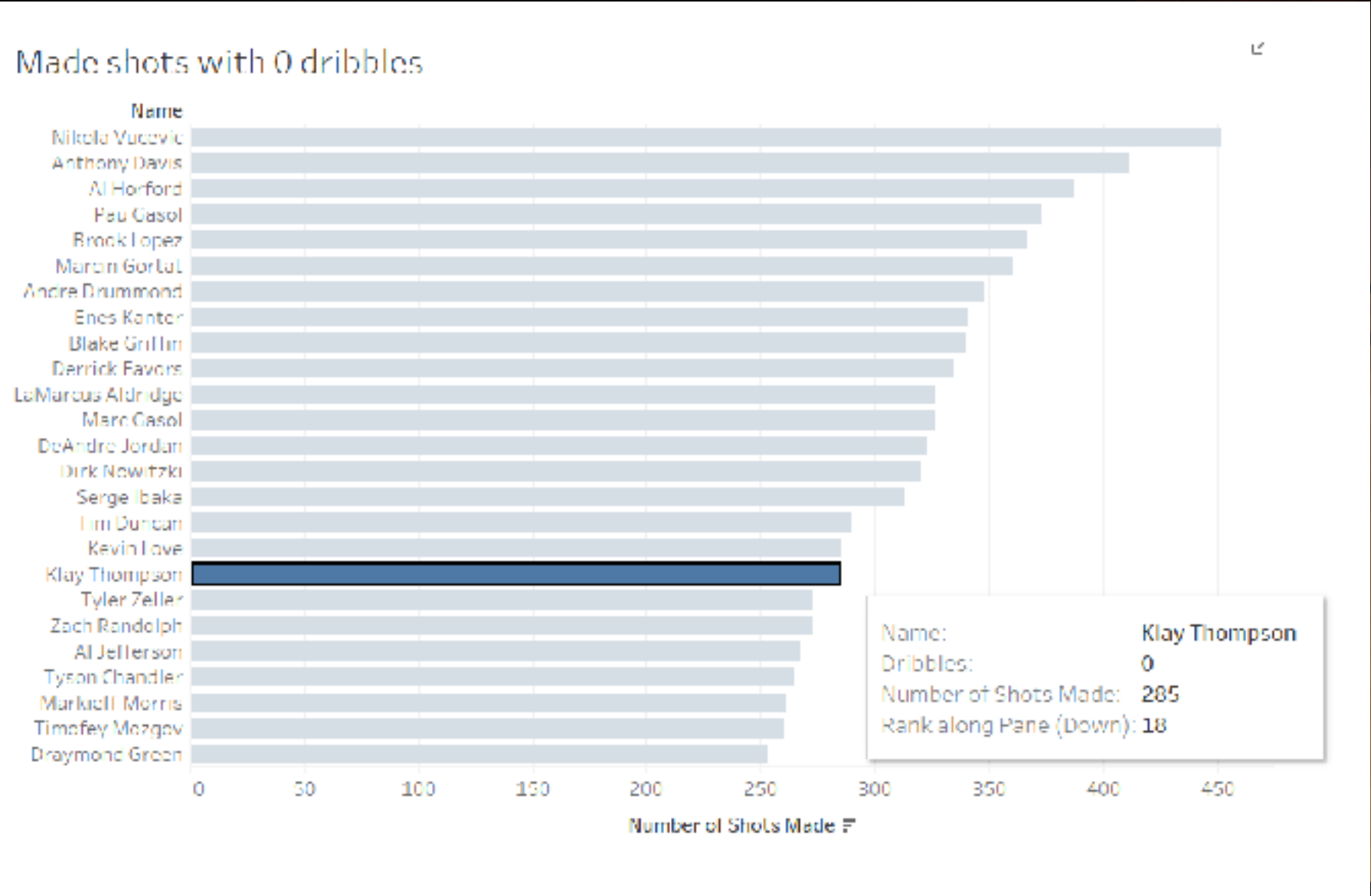


# Game Data Dashboard





# Identifying top catch and shoot player



Ranking of Top 25 players composed of either Power Forwards (PF) or Centers (C)

Their short proximity to the basket enables dunks, put-backs, and offensive rebound chances, resulting in 0 dribbles

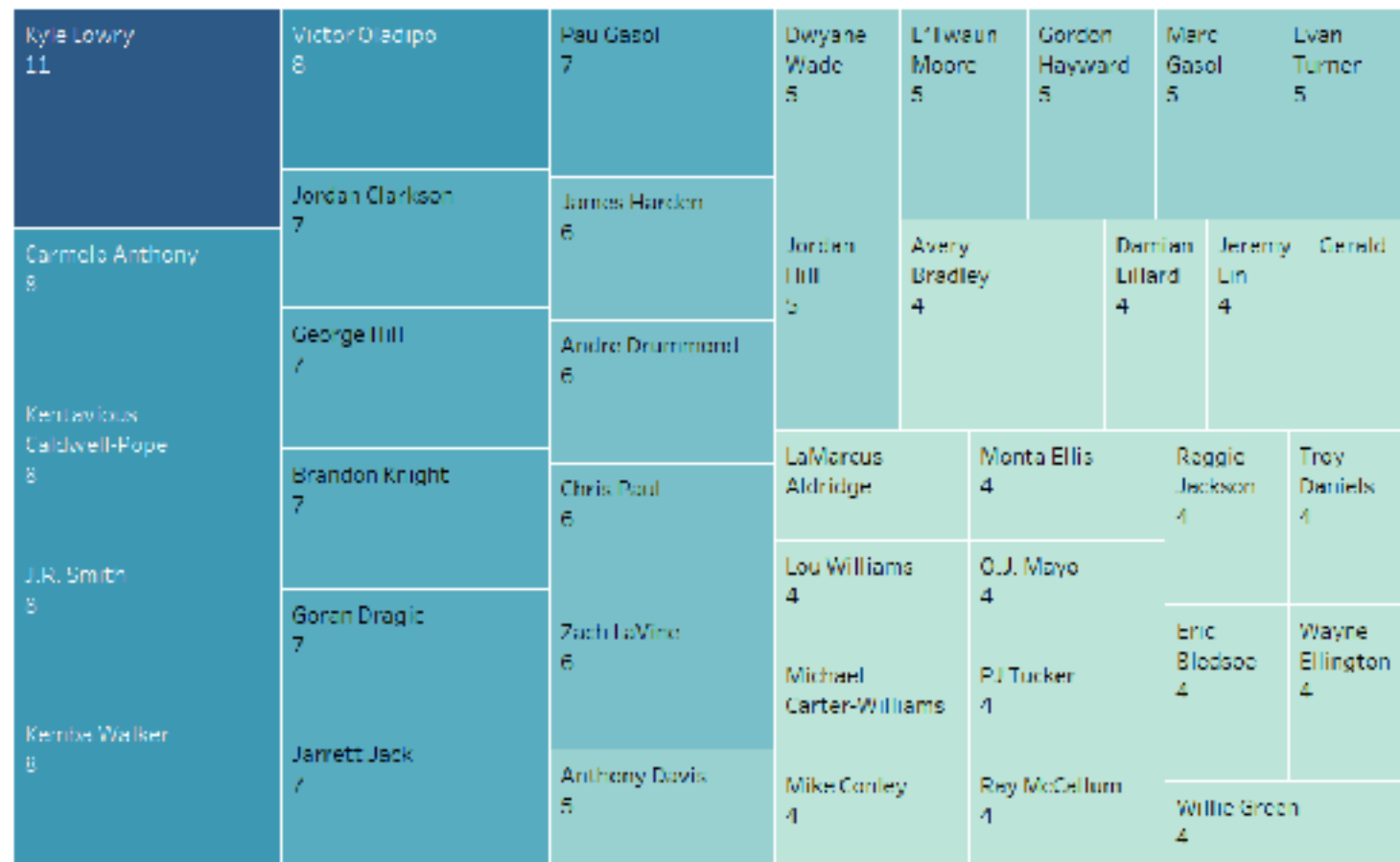
The exception is Klay Thompson, who ranks 18<sup>th</sup> in this list

Being able to be placed in this list of PFs and Cs proves that he makes an extremely high volume of catch and shoot shots for a Shooting Guard



# Identifying 'clutch' shooters

## Clutch Shots Made



Number of Shots Made

4

11

- Labelled shot clock at 24 seconds and under as 'Clutch'
- Filtered 4<sup>th</sup> quarter and overtime(s)
- Kyle Lowry leads the league in shots made (11)
- However, does not account for Wins/Losses
  - E.g. Losing team may have free shots as time winds down
  - Does not accurately define 'clutch' shooters

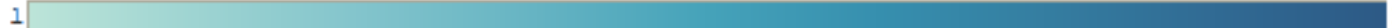


# Identifying 'clutch' shooters

## Game winners

Kemba Walker 3	Jarrett Jack 2	Loukas Kallas 2	Gerald Gordon		Henry Walker 1	Joe	Jett Green 1	John Wall 1
Mario Gasol 3	Khris Middleton 2	Stephen Curry 2	Jordan Clarkson 1	Marcus Smart 1	Michael	Mike Conley 1	Bradley Beal 1	Nick Johnson 1
	Evan Turner 2	Tim Duncan 2	Kirk Hinrich 1	Nick Young 1	Pau Gasol 1	Rasual Butler 1		Reggie Jackson 1
Brandon Knight 2	George Hill 2		Kyrie Irving 1					
Anthony Davis 2	LaMarcus Aldridge 2		Blake Griffin 1	Brandon Jennings		Carl Landry 1	Robin Lopez 1	Tony
Courtney Lee 2		Lance Stephenson	Russell Westbrook					
James Harden 2		Monta Ellis 2	Tou Williams 1	Solomon Hill 1	Trey Burke 1	Tyrece Evans	Zach	
		Andre Drummond	Bojan Bogdanovic	Brook Lopez 1	DeMarcus Cousins	Victor Oladipo		

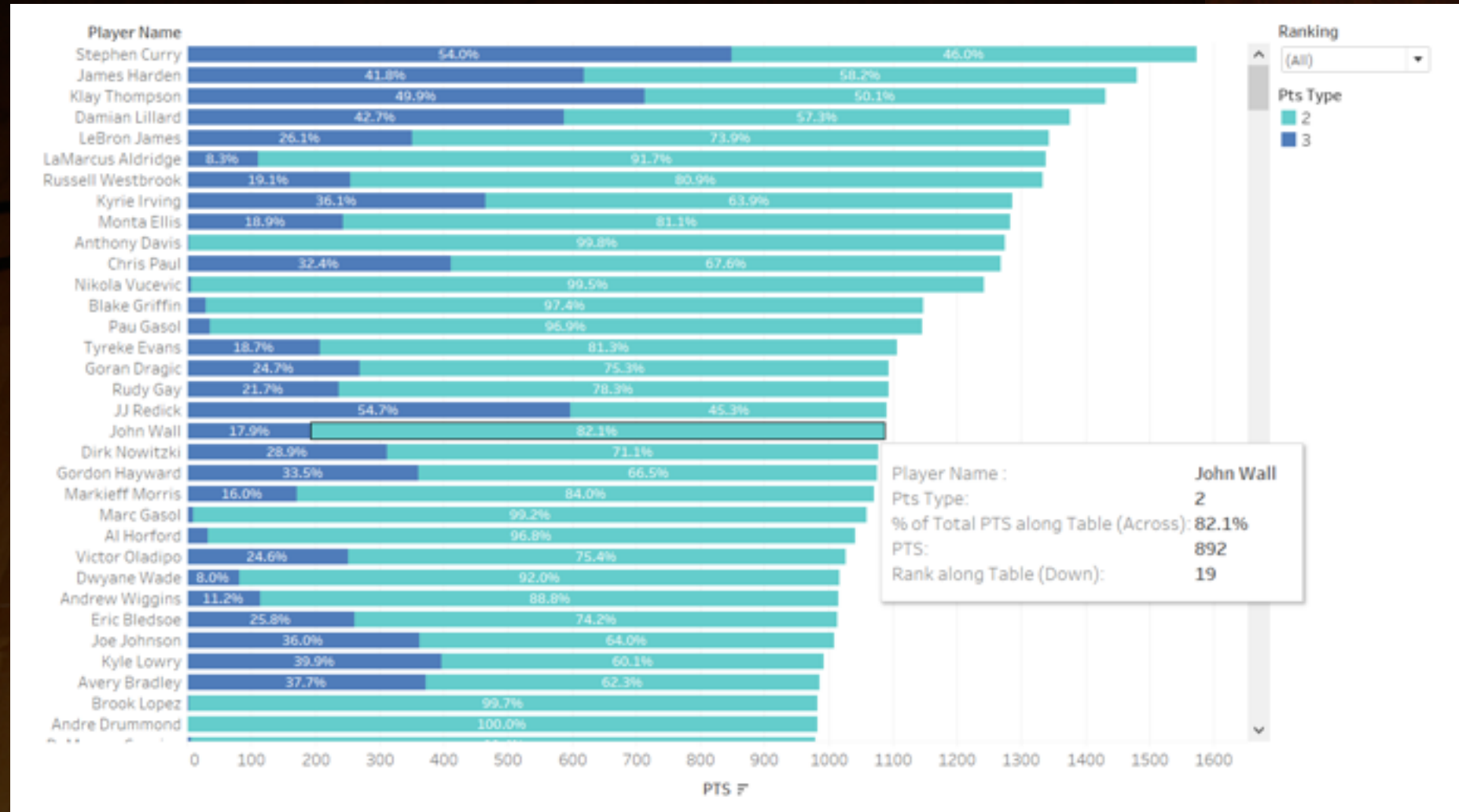
Number of Shots Made



- Adding on 'Win' and Final Margin of 1, 2, and 3 points filter
- We identify the leaders in game-winning shots



# Shot Type Breakdown

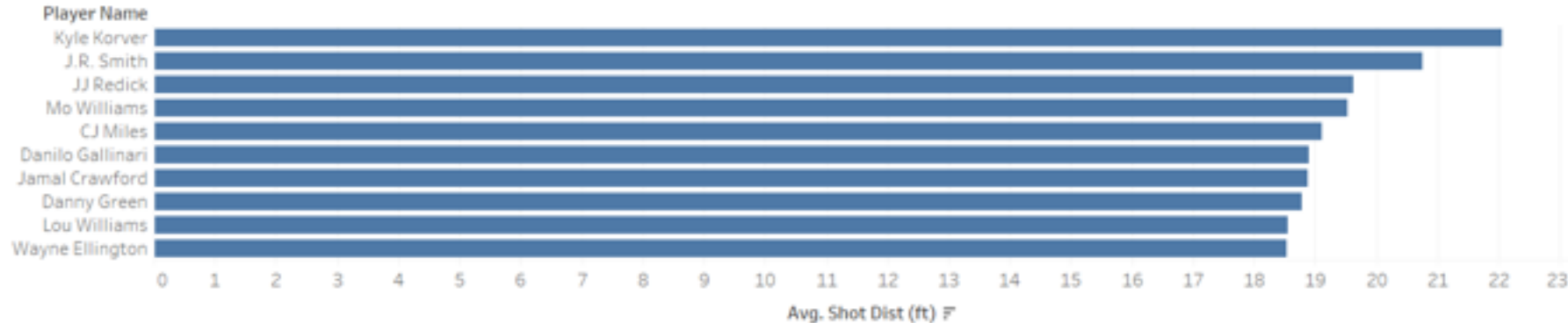


- Overall points ranking (kept when filtered)
- Percentage breakdown of 2 and 3 point shots



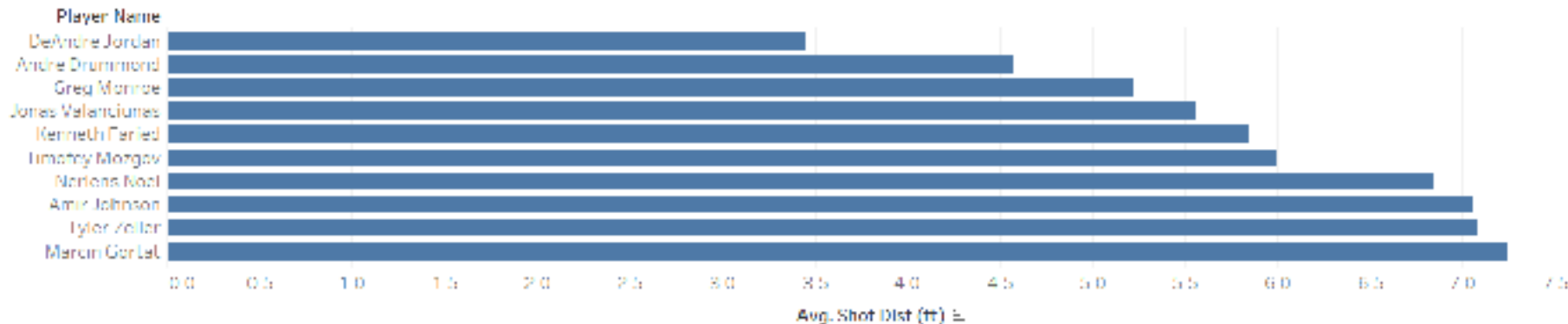
# Shot Distance

Longest average shot distance throughout season with at least 500 shot attempts



- Tendencies would include shooting jump-shots only
- 3 point line: 22-24 feet
- Free Throw line: 15 feet

Shortest average shot distance throughout season with at least 500 shot attempts



- Tendencies include dunks, hook shots, post-moves, short-range jumpers

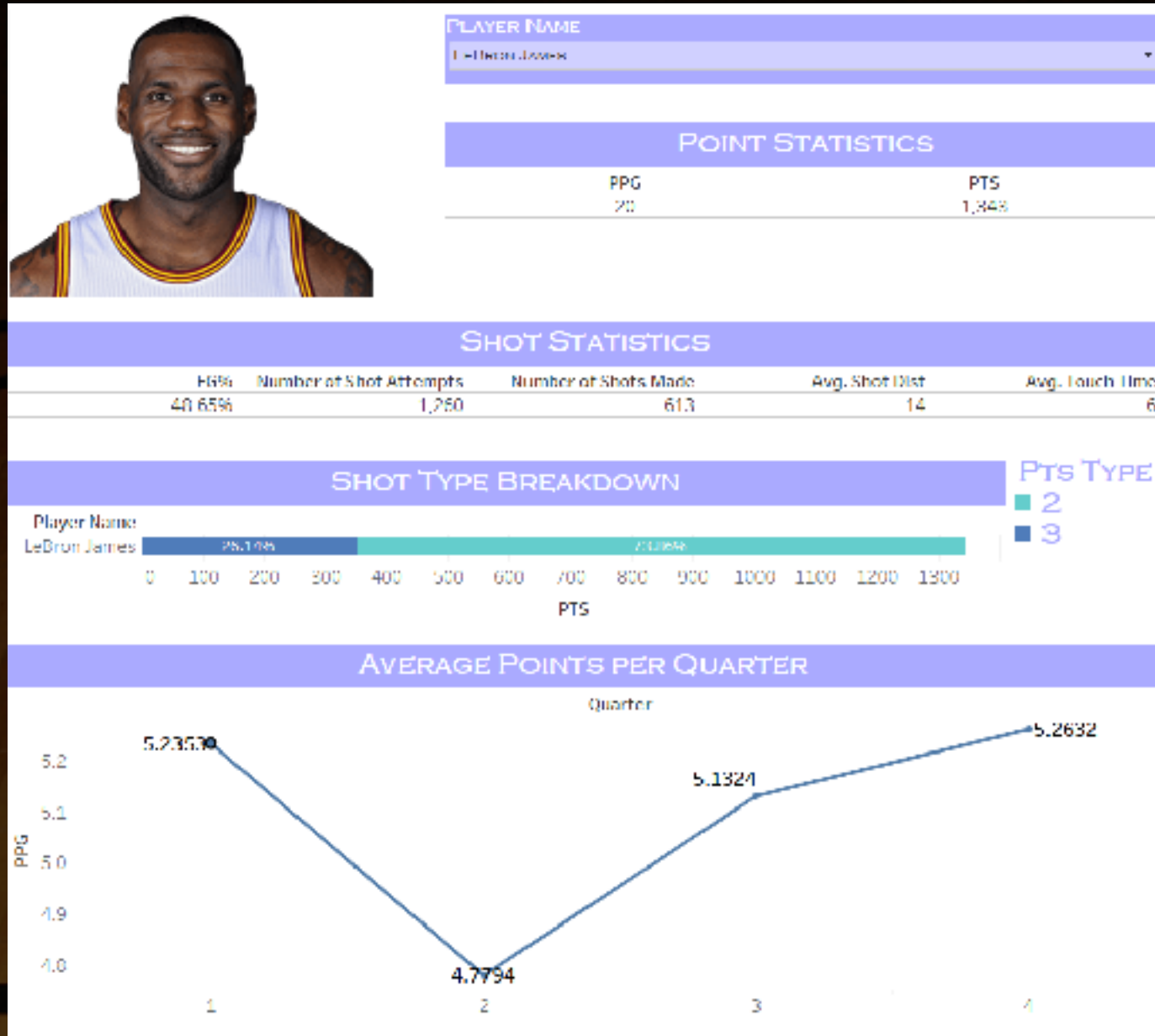


# Leaders by Quarters





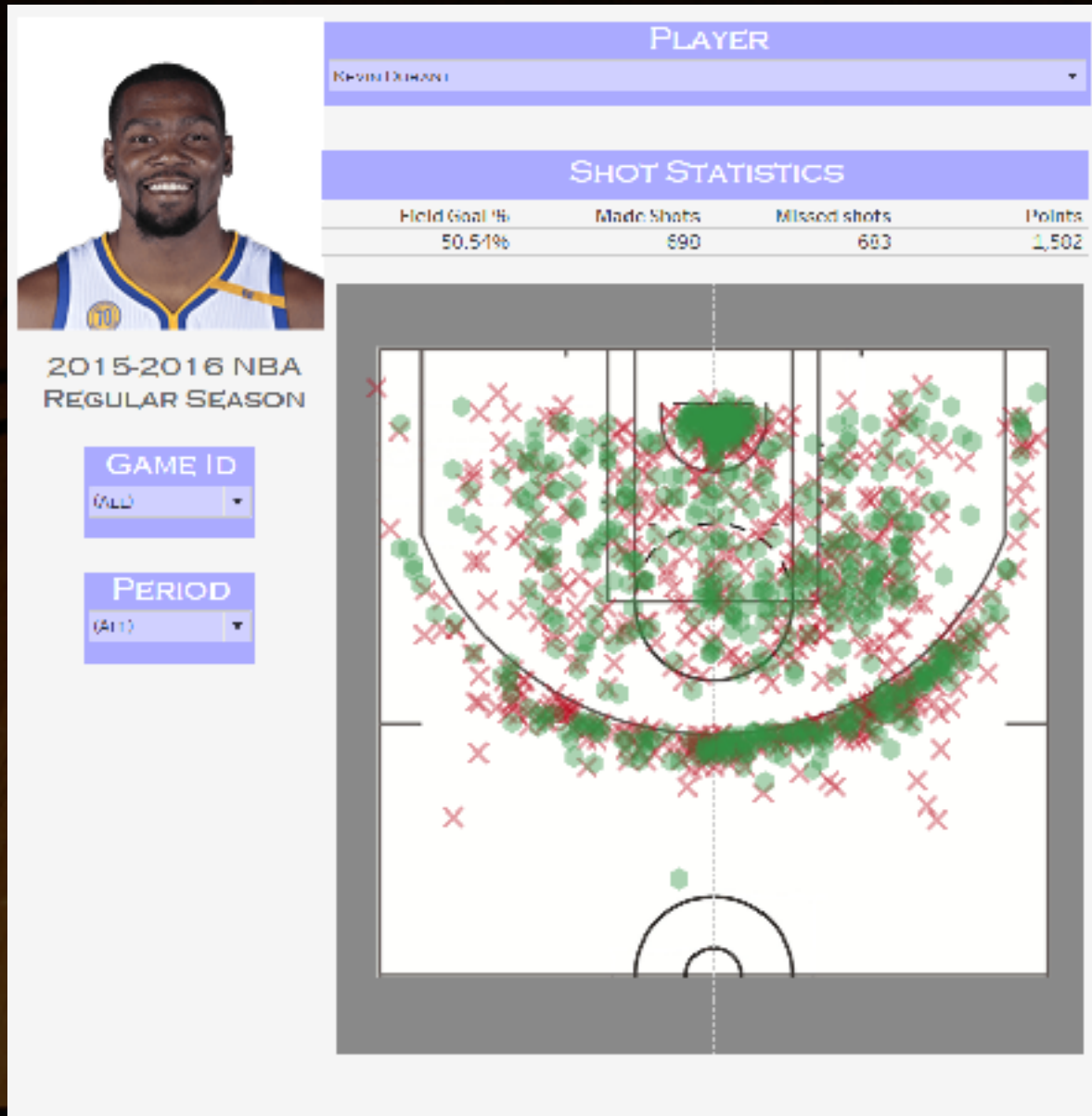
# Player Card



- Created a player profile that show a summary of stats from the data set
- Enabled filter to switch image and stats to any of the 490 players in the data set

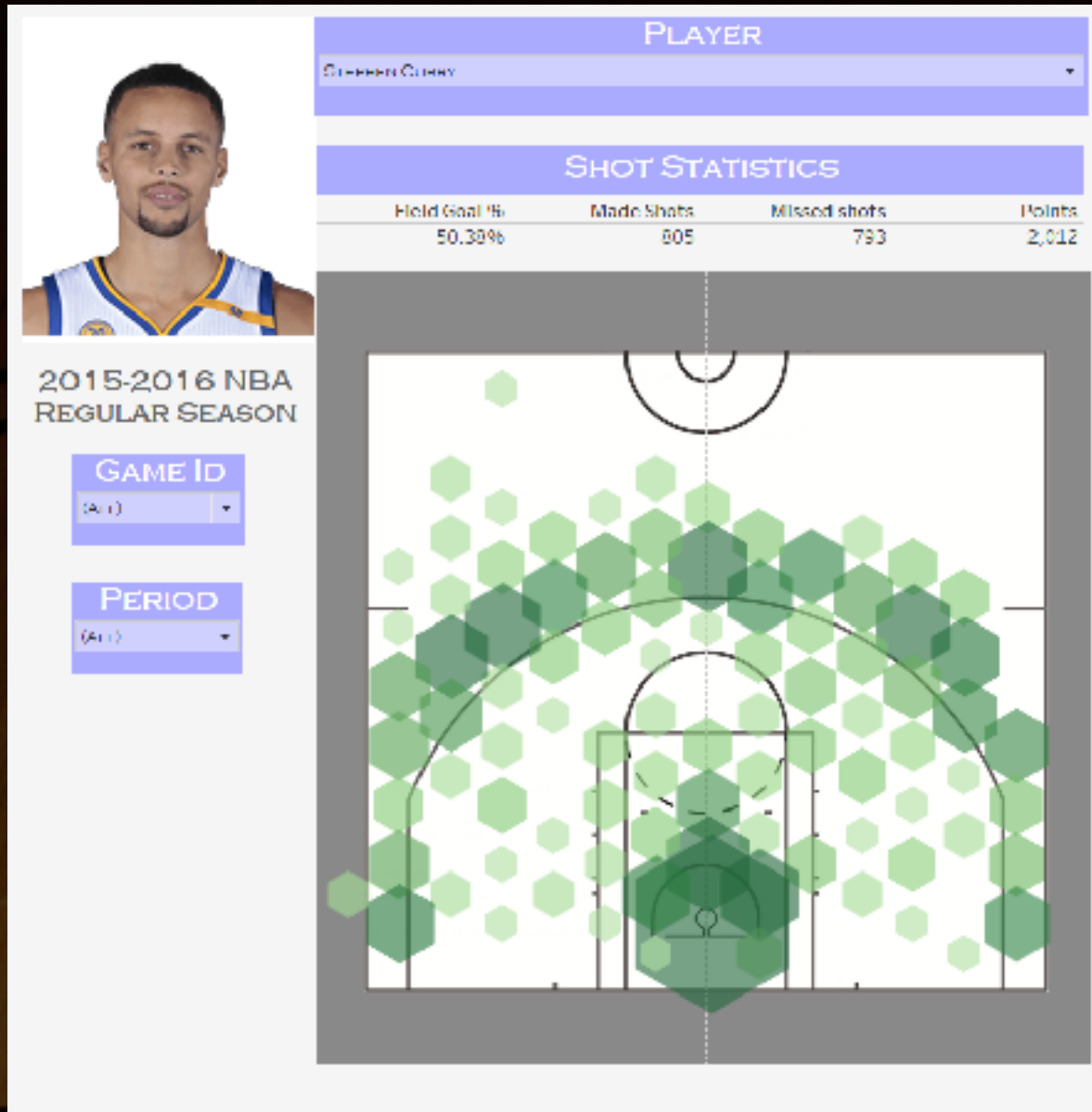


# Shot Chart v1



- Created player shot chart using second data set
- Enabled filter to switch image, stats, and shot chart to any of the 11 players in the data set
- Included additional filters of Game ID and Period which affect the stats and the shot chart
- Created Calculated Field 'Points' using nested IF statements

# Shot Chart v2



- Used Hexbins to plot Made Shots
- Different style of visualization with only made shots



# Further Analysis

- **Collect more data from [stats.nba.com](https://stats.nba.com)**
- **Analyze more variables, such as 'Defender Distance'**
- **Improve Tableau Dashboard design**



# Thanks!

## Q&A

- Sources for help:
  - Dataset - <https://github.com/JunWorks/NBAstat>
  - stats.nba.com scraping framework - <http://savvastjortjoglou.com/nba-shot-sharts.html>
  - Dynamic Image Filter - <https://community.tableau.com/thread/119079?start=0&tstart=0>
  - Keeping Overall Rank - <https://community.tableau.com/message/516072?et=watches.email.thread#516072>
  - Hexbin Tutorial - <http://tableautim.com/tableau-hexbin-tutorial-with-hexbin-shape-pack/>