## Statistical Analysis of Kobe Bryant's Shots

Team 5

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#### Outlines

- Data introduction
- Comparisons and hypothesis tests
- Shots' locations comparison
- KNN classifier
- Annual shots' locations
- Future works

#### Data Introduction

- From the Kaggle
- Containing all the Kobe's shots during his career
- 30697 shots and 25 variables
- 25697 training data and 5000 test data

#### Data Introduction (cont.)

- Response: Whether a shot is made or not
- 1 and 0 are denoted for a shot is made or not
- NA is denoted for the test data

#### Data Introduction (cont.)

- Predictors: 24 variables
- Factors: shot types, shot zone, match up, playoffs...
- Continuous: location(x, y), time remaining...

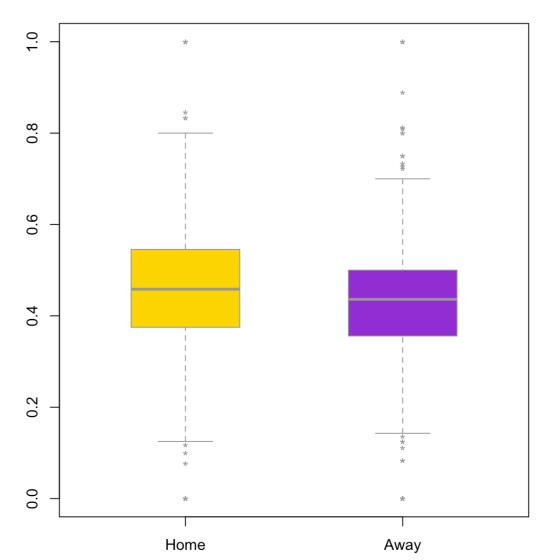
#### Data Introduction (cont.)

#### > summary(df) game date action\_type game\_id season 2005 : 1924 2016-04-13: 21501228: 43 Jump Shot :15836 43 2002 : 1852 20601081: 2007-03-30: 41 Layup Shot : 2154 41 2008 : 1851 2002-11-07: 20200069: Driving Layup Shot : 1628 2007 : 1819 2006-01-22: 20500591: Turnaround Jump Shot: 891 2009 : 1772 20700553: Fadeaway Jump Shot: 2008-01-14: 37 37 872 2001 : 1708 2010-01-08: 20900527: 36 Running Jump Shot 779 36 (Other):14771 (Other) :25462 (Other) :25462 (Other) : 3537 combined\_shot\_type loc\_x loc\_y shot\_distance three\_pt Bank Shot: 120 Min. :-250.000 :-44.00 Min. Min. : 0.00 0:20285 1st Qu.: 4.00 : 1056 Dunk 1st Qu.: -67.000 1st Qu.: 5.00 1: 5412 Hook Shot: 127 Median : 0.000 Median : 74.00 Median :15.00 Jump Shot:19710 Mean : 7.148 : 91.26 Mean :13.46 Mean Layup **:** 4532 3rd Qu.: 94.000 3rd Qu.:160.00 3rd Qu.:21.00 Tip Shot: 152 Max. : 248.000 Max. :791.00 Max. :79.00 time\_remaining ot home playoffs shot\_made\_flag opponent Min. 0 0:25380 0:13212 0:21939 : 1638 0:14232 SAS 1st Qu.: 720 1: 317 1:12485 1: 3758 PHX : 1535 1:11465 Median:1378 : 1399 HOU :1397 SAC : 1397 Mean 3rd Ou.:2171 DEN : 1352 :2874 P<sub>0</sub>R : 1292 Max. (Other):17084

#### Comparisons and Hypothesis Tests

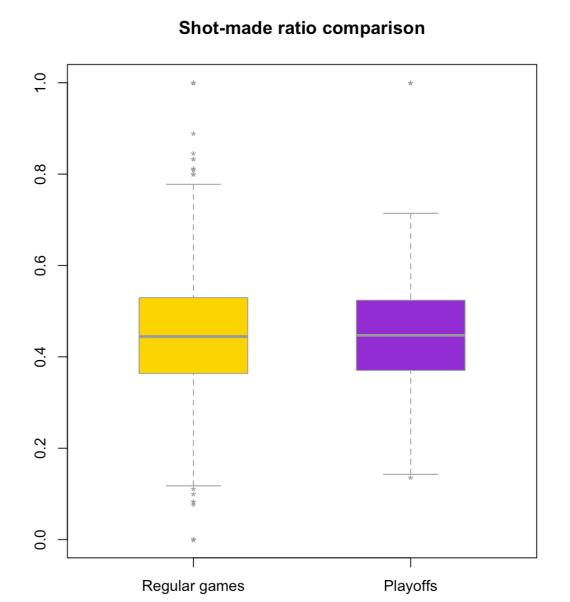
- home v.s. away
- paired: FALSE
- p-value of variance test:0.7318
- var.equal: TRUE
- p-value of two sample t-test:
  0.0007103
- result: different means

#### **Shot-made ratio comparison**



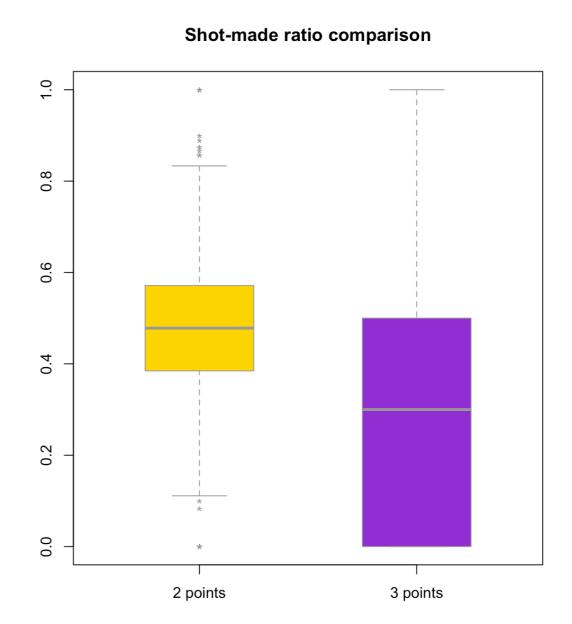
## Comparisons and Hypothesis Tests (cont.)

- regular games v.s. playoffs
- paired: FALSE
- p-value of variance test:0.2206
- var.equal: TRUE
- p-value of two sample t-test:
  0.5658
- result: same means

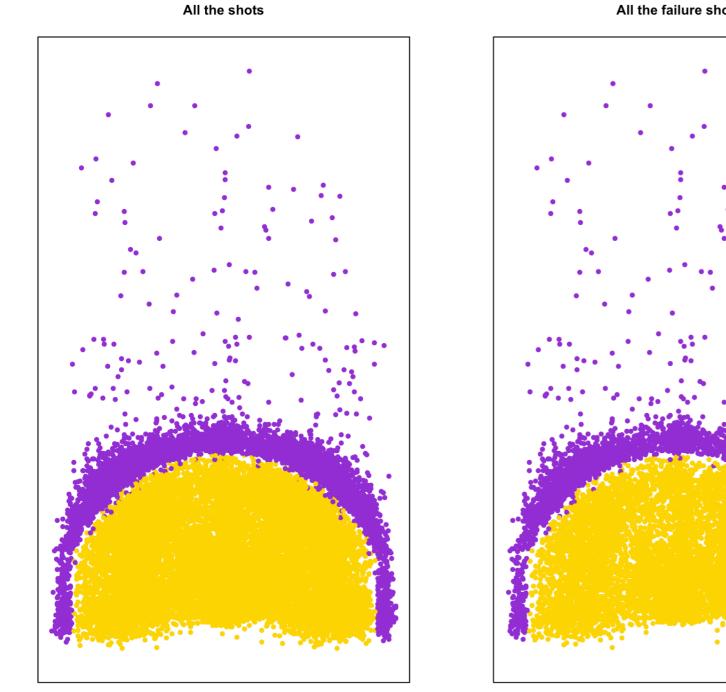


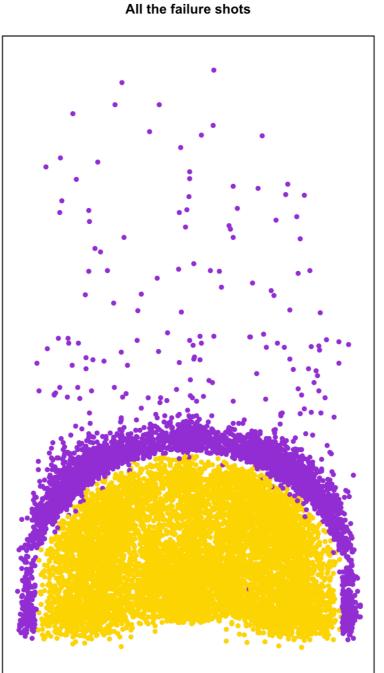
## Comparisons and Hypothesis Tests (cont.)

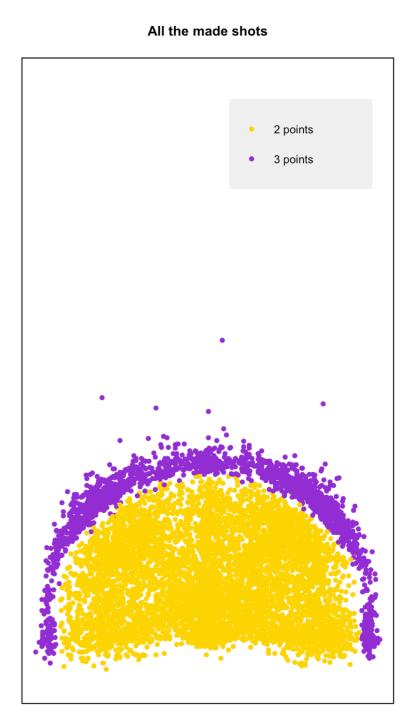
- 2 pt. v.s. 3 pt.
- paired: TRUE
- p-value of variance test:< 2.2e-16</li>
- var.equal: FALSE
- p-value of two sample t-test:< 2.2e-16</li>
- result: different means



## Shots' Locations Comparison







#### KNN Classifier

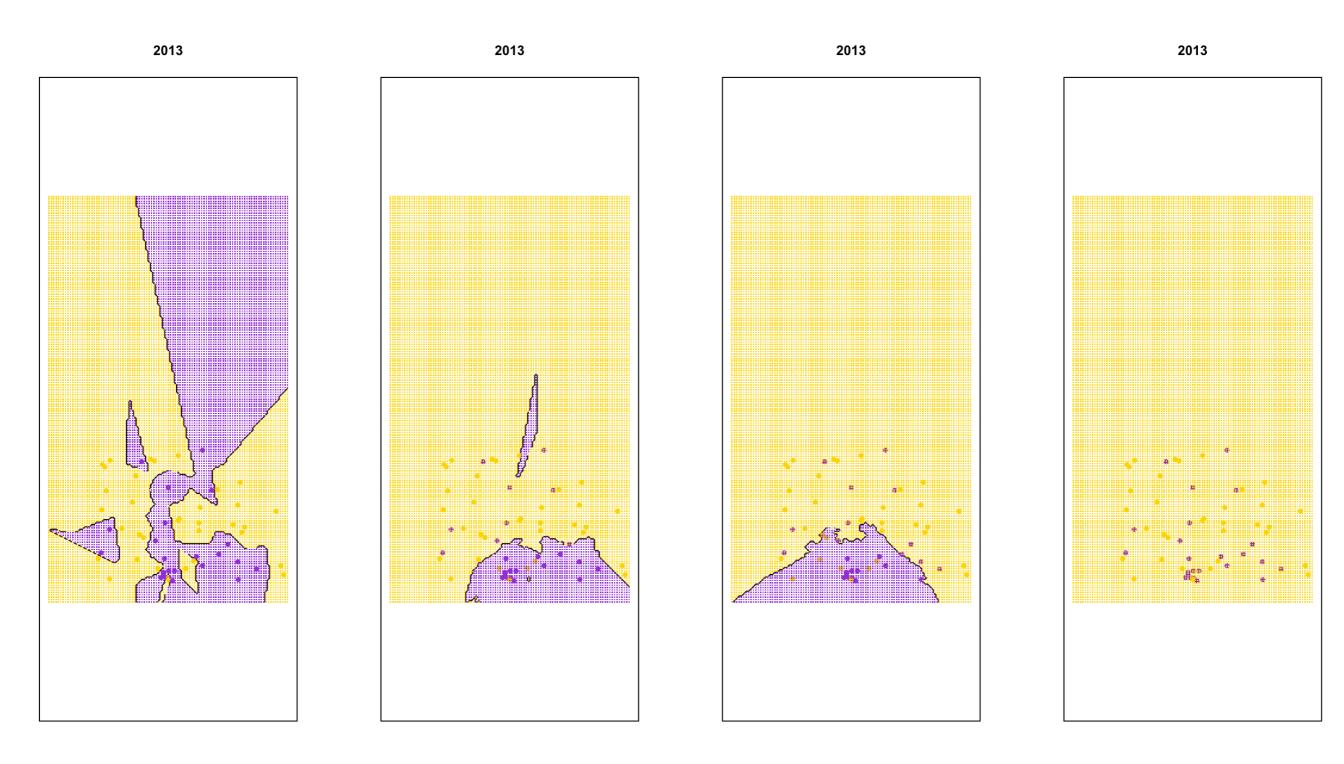
$$Pr(Y = j | X = x_0) = \frac{1}{K} \sum_{i \in N_0} 1_{\{y_i = j\}}$$

- The K nearest neighbors classifier
- $N_0$  is a set collecting K points in the training data closet to the test observation  $x_0$ .

## KNN Classifier (cont.)

1996 2001 2010 2015

# KNN Classifier (cont.)

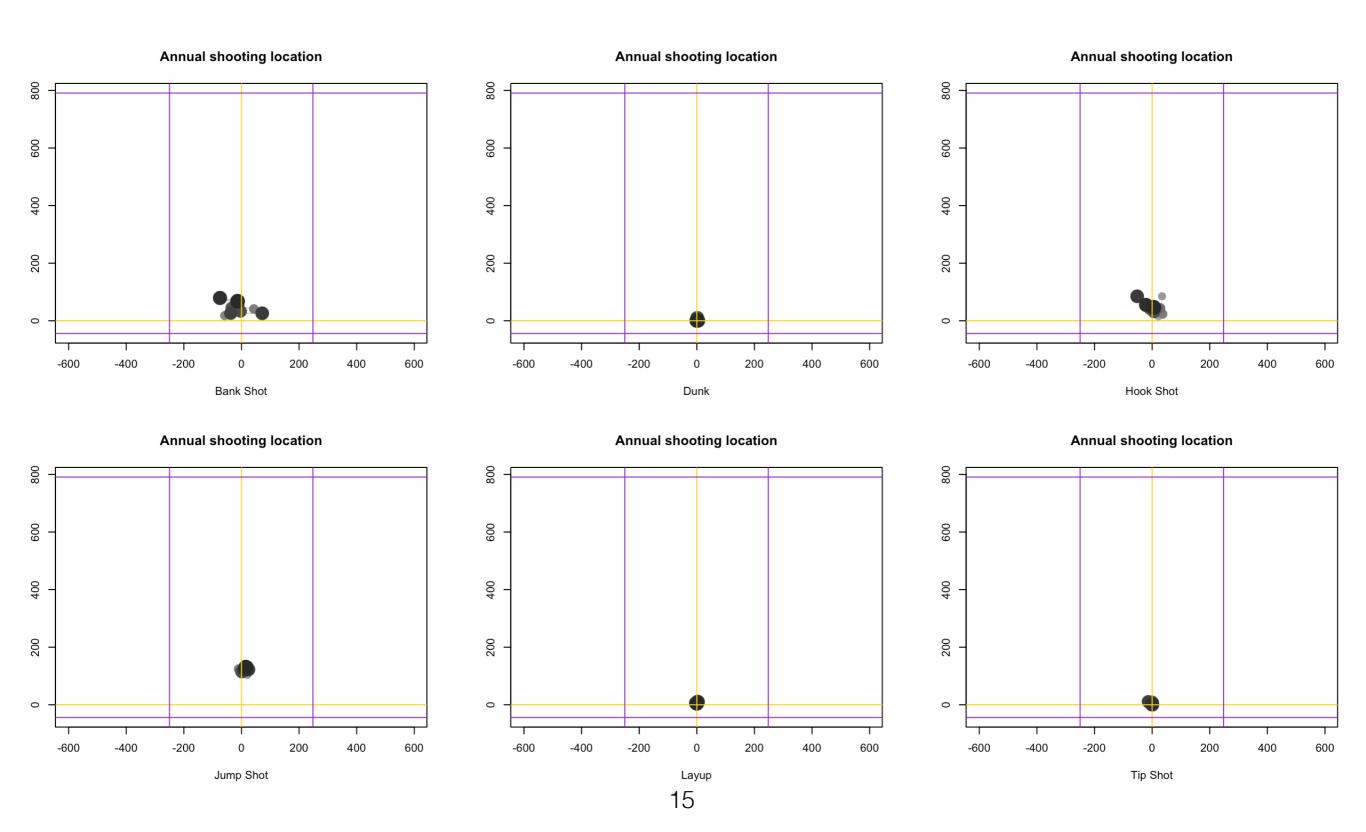


1-nearest neighbour 7-nearest neighbour 21-nearest neighbour 49-nearest neighbour

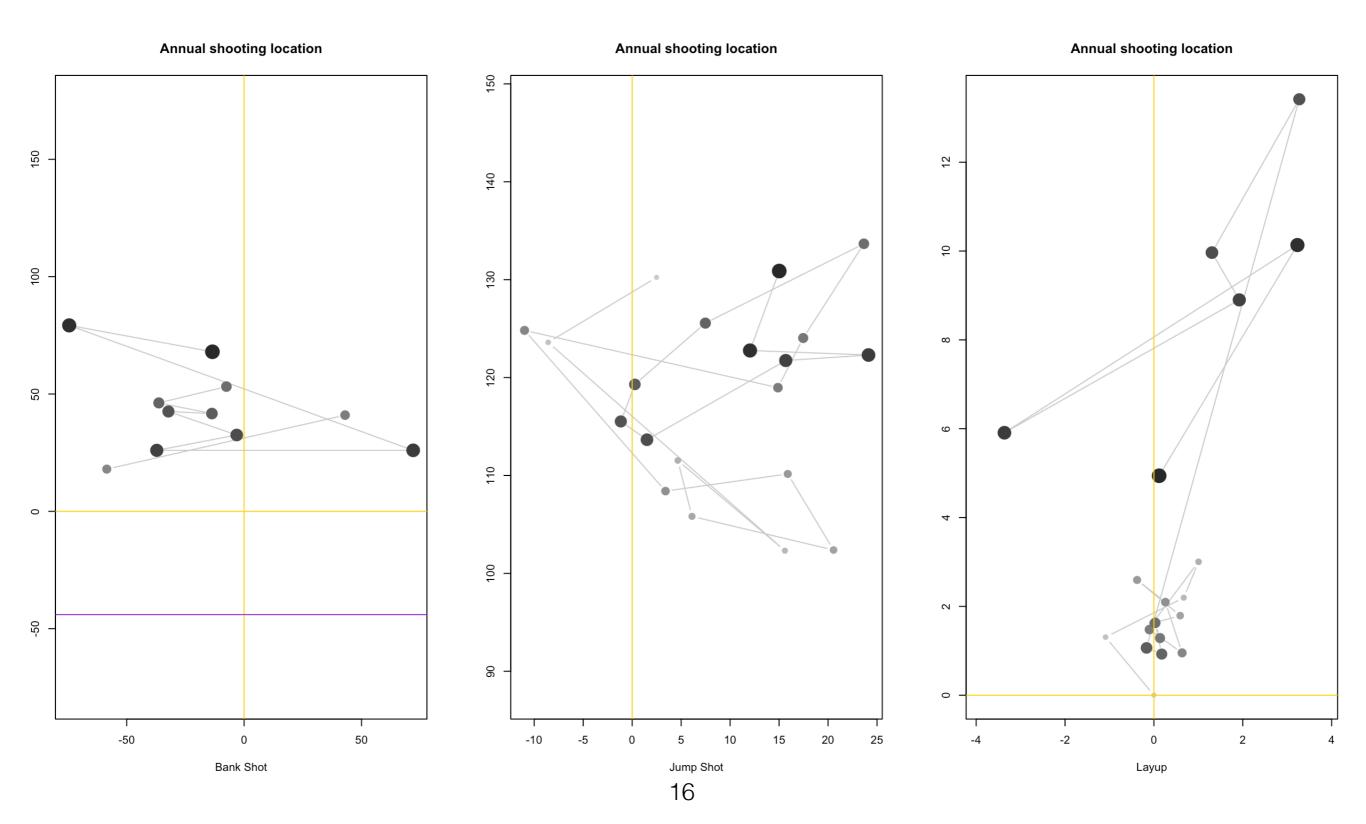
## KNN Classifier (cont.)

1-nearest neighbour 7-nearest neighbour 21-nearest neighbour 49-nearest neighbour

#### Annual Shots' Locations



## Annual Shots' Locations (cont.)



#### **Future Works**

- Logistic regression: model selection, PCA, collinearity analysis
- LDA/ QDA(linear/ quadratic discriminant analysis)
- Decision trees
- Time series analysis

#### Reference

- G. James, D. Witten, T. Hastie, R. Tibshirani, An Introduction to Statistical Learning with Applications in R, Springer, New York, 2013
- Kaggle, <a href="https://www.kaggle.com/c/kobe-bryant-shot-selection">https://www.kaggle.com/c/kobe-bryant-shot-selection</a>