

## 2008 NFL REGULAR SEASON FIELD GOAL ATTEMPTS

SIMPLE LOGISTIC REGRESSION (WEEK 6)

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### INTRODUCTION

- Simple logistic regression
- Success probability curves
- Prediction of the ability of making a field goal attempt based off kicking distance.



#### SIMPLE LOGISTIC REGRESSION MODEL

The structure of model is like that of a simple linear regression.

$$y = \beta_0 + \beta_1 x_1 + \beta_2 x_2 + \cdots + \beta_k x_k + \epsilon$$
,

- The response variable, Y, is binary.
  - It has only two values, such as "success" or "failure."
- The probability of "success" outcome (success probability) is p.
  - p is also described as the expected value of the binary random variable.

$$p = E[Y] = \beta_0 + \beta_1 x$$

• The X variable acts as a factor that can greatly impact the success probability.

# THE "NFL FIELD GOAL ATTEMPTS BY KICKER WITH SITUATIONAL INFO" DATA SET

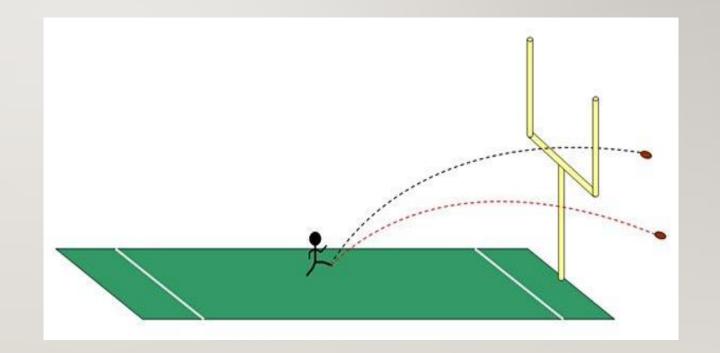


- Data was collected from previous results of NFL regular season field goal attempts.
- Collected during the 2008 season.
- The Elias Sports Bureau (ESB) wanted to look at different kinds of factors affecting likelihood of a successful field goal attempt.
- Data set contains 1039 observations on 23 different variables.

#### THE VARIABLES

**GOOD**: the binary response variable, whether the field goal attempt is made or not. (1 if Success, 0 if Miss)

<u>**Distance**</u>: Numerical predictor, distance in which a football is kicked to the goal post (yards)



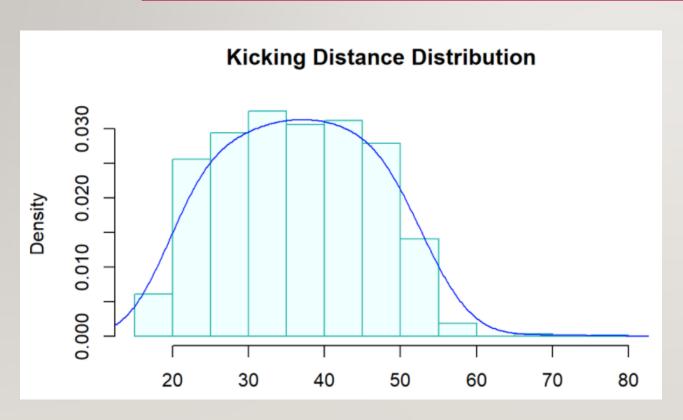
### RESEARCH QUESTION

• Is there any association between whether a football player can successfully make a field goal attempt and the distance that a football is kicked from during a game to score it?





#### EXPLORATORY DATA ANALYSIS



- Symmetrical and unimodal, with no outliers.
- Variables had a linear relationship.
- No high intercorrelations
- There is no issue of potential imbalance.
- I did not transform the kicking distance variable.
- I fitted a logistic regression directly to the data.

## SUMMARY STATISTICS OF THE SIMPLE LOGISTIC REGRESSION MODEL COEFFICIENTS

| The summary stats | of regression coefficier | regression coefficients |          |                      |            |           |  |
|-------------------|--------------------------|-------------------------|----------|----------------------|------------|-----------|--|
|                   | Estimate                 | Std. Error              | z value  | $\Pr(> \mathbf{z} )$ | 2.5 %      | 97.5 %    |  |
| (Intercept)       | 6.7627078                | 0.5444277               | 12.42168 | 0                    | 5.7399740  | 7.877643  |  |
| distance          | -0.1208357               | 0.0122852               | -9.83590 | 0                    | -0.1457751 | -0.097540 |  |

- Kicking distance is negatively associated with the ability to make a field goal attempt.
- The slope of the distance variable equals -0.1208.
- As kicking distance increases by 1 yard, the chances of making a field goal attempt decrease by 0.1028.
- The p-value is 0 and the 95% confidence interval is [-0.1458, -0.0975].

#### THE ODDS RATIOS

#### Summary Stats with Odds Ratios

|             | Estimate   | Std. Error | z value  | $\Pr(> \mathbf{z} )$ | odds.ratio  |
|-------------|------------|------------|----------|----------------------|-------------|
| (Intercept) | 6.7627078  | 0.5444277  | 12.42168 | 0                    | 864.9812621 |
| distance    | -0.1208357 | 0.0122852  | -9.83590 | 0                    | 0.8861796   |

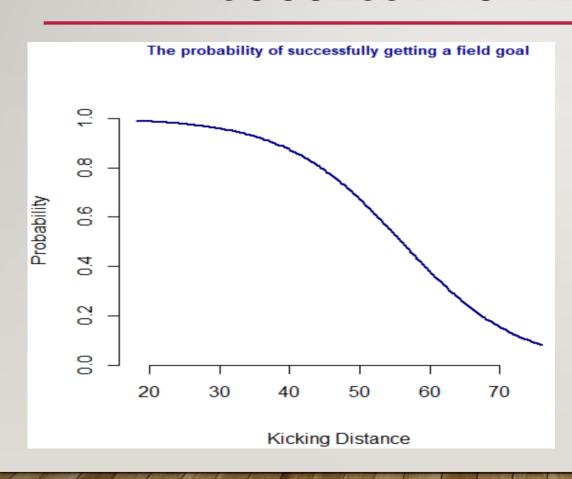
- Odds ratio associated with kicking distance is 0.88.
- As kicking distance increases one yard, odds of making a field goal attempt decreases by about 12%.
- This is a practically significant risk factor.

### GLOBAL GOODNESS OF FIT MEASURES

| Global Goodness-of-fit Measures |                        |         |
|---------------------------------|------------------------|---------|
| Deviance.residual               | Null.Deviance.Residual | AIC     |
| 686.927                         | 817.7227               | 690.927 |

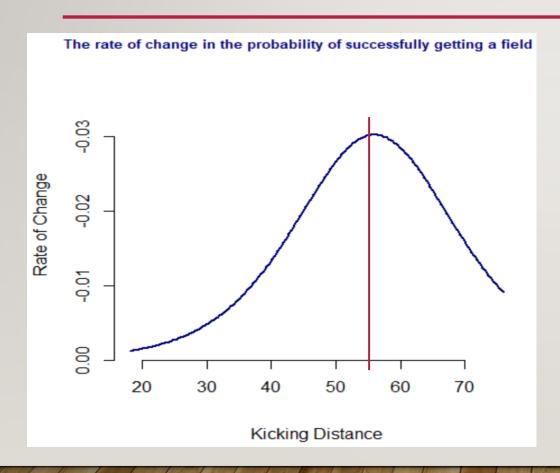
- I can't have other candidate models with corresponding likelihood at the same scale to compare.
- I will not interpret these goodness-of-fit measures.

#### SUCCESS PROBABILITY CURVES



• The standard S curve represents how the probability of making a field goal attempt decreases as kicking distance increases.

#### SUCCESS PROBABILITY CURVES



- This graph indicates the rate of change in the probability of making a field goal attempt decreases when kicking distance is less than 55 yards.
- The rate of change starts to increase when kicking distance is greater than 55 yards.
- The turning point is about 55 yards.

#### **SUMMARY**

- As the distance the football is kicked from increases, the chance of making a field goal attempt decreases.
- Kicking distance is negatively associated with ability to make a field goal attempt.



- The slope of the distance variable is -0.1208.
- As kicking distance increases by 1 yard, the chances of making a field goal attempt decrease by 0.1028.
- The p-value is 0 and the 95% confidence interval is [-0.1458, -0.0975].





- The odds ratio associated with kicking distance is 0.88.
- Since this number is less than 1, as the kicking distance increases one yard, the odds of making a field goal attempt decreases by about 12%.

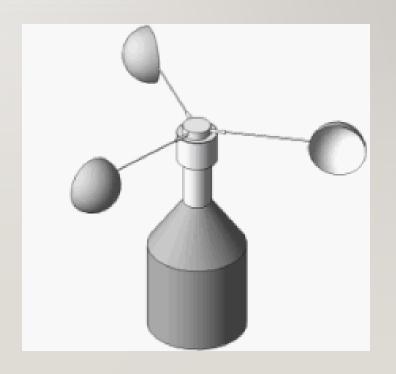
- The rate of change in probability of making a field goal attempt decreases when kicking distance is under 55 yards.
- It starts to increase when kicking distance is greater than 55 yards.
- It is better for most field goal attempts to be made from at most 55 yards from the goal post.





#### POSSIBLE IMPROVEMENTS

- Maybe when running this regression, the data should also be sorted by kicker.
- It would be good to include a variable for wind speed and/or direction since this affects making field goal attempts in a dramatic way.
- Data from other seasons besides 2008 should also be present for observing patterns over a wider timespan.



### **SOURCES**

"NFL Field Goal Attempts by Kicker with Situational Info" Data Set:

http://users.stat.ufl.edu/~winner/data/nfl2008\_fga.csv