



Baseball III



Produced by Dr. Mario | UNC STOR 538

Linear Weights

- Multiple Linear Regression

$$Y = \beta_0 + \beta_1 X_1 + \dots + \beta_k X_k + \epsilon$$

Linear Weights

- Baseball Application

- $Y = \text{Runs for the Season}$
- $\vec{X} = [BB + HBP, S, D, T, HR, SB, CS]'$
- $Y = \vec{X}'\vec{\beta} + \vec{\epsilon}$
- $\hat{Y} = \text{Predicted Runs}$
- $\hat{Y} = \vec{X}'\hat{\vec{\beta}}$

S = Single

D = Double

T = Triple

HR = Home Run

BB = Walk

HBP = Hit-by-Pitch

SB = Stolen Base

CS = Caught

Stealing



Linear Weights

- Estimated Linear Weights Using Least Squares

| Predictor | Estimate |
|-----------|----------|
| Constant | -411.81 |
| Single | 0.46 |
| Double | 0.81 |
| Triple | 1.07 |
| HR | 1.43 |
| BB+HBP | 0.33 |
| SB | 0.25 |
| CS | -0.25 |

$n = 210$
 $R^2 = 0.90$
 $Adj. R^2 = 0.90$

Used to Be
Insignificant

Doesn't Add
Marginal Value



Linear Weights

- Important Information From Linear Regression

| | Coefficients | Standard Error | t Stat | P-value |
|-----------|--------------|----------------|--------------|------------|
| Intercept | -411.8133561 | 33.00675506 | -12.47663866 | 7.3423E-27 |
| BB+HBP | 0.326171191 | 0.026991877 | 12.08405016 | 1.1813E-25 |
| 1B | 0.459107774 | 0.028209869 | 16.2747222 | 1.325E-38 |
| 2B | 0.805141015 | 0.070539419 | 11.41405797 | 1.31E-23 |
| 3B | 1.072129559 | 0.185083303 | 5.792686554 | 2.6244E-08 |
| HR | 1.428105264 | 0.052270693 | 27.32133795 | 9.1608E-70 |
| SB | 0.250044999 | 0.063490957 | 3.938277396 | 0.00011296 |
| CS | -0.254380304 | 0.190576335 | -1.334794818 | 0.18344599 |



Linear Weights

- Important Information From Linear Regression
 - Removal of Insignificant Variables

| | Coefficients | Standard Error | t Stat | P-value |
|-----------|--------------|----------------|--------------|------------|
| Intercept | -422.3214856 | 32.11582993 | -13.14994775 | 5.654E-29 |
| BB+HBP | 0.328427033 | 0.026990732 | 12.16814092 | 6.1158E-26 |
| 1B | 0.462425312 | 0.028154216 | 16.4247273 | 3.9961E-39 |
| 2B | 0.809004928 | 0.070615562 | 11.45646795 | 9.2244E-24 |
| 3B | 1.056646807 | 0.185074775 | 5.709296723 | 3.9868E-08 |
| HR | 1.432093994 | 0.052285581 | 27.38984579 | 4.1936E-70 |
| SB | 0.204454976 | 0.05362427 | 3.812732098 | 0.00018226 |

- $MAD = 17.15$ (Now) vs. $MAD = 26$ (Bill James)



Linear Weights

- Historical Progression

| | 1916 | 1950-1960 | 1978 | 1989 |
|-----------|------|-----------|--------|---------|
| Event | Lane | Lindsay | Palmer | Boswell |
| BB + HBP | .164 | — | .33 | .33 |
| Single | .457 | .41 | .46 | .47 |
| 2B | .786 | .82 | .8 | .78 |
| Triple | 1.15 | 1.06 | 1.02 | 1.09 |
| Home Runs | 1.55 | 1.42 | 1.4 | 1.4 |
| Outs | — | — | -.25 | — |
| SB | — | — | .3 | .3 |
| CS | — | — | -.6 | — |

Now

0.33

0.46

0.81

1.06

1.43

-

0.20

-



Linear Weights



- **Evaluation of Hitters**

- Imagine if Team Had Only Mike Trout (2016)
- Approximately,

$$26.72 \times 162 = 4329 \text{ Outs Per Season}$$

- Trout Hit 29 HR and Had 366.118 Outs
- Therefore, Trout Hit

$$\frac{29}{366.118} = 0.079 \text{ Home Runs Per Out}$$

- Scaling Up, We Expect a Team of Trouts to Hit on Average

$$4329 \times \frac{29}{366.118} = 342.9 \text{ Home Runs Per Season}$$

- Using Linear Weights, We Expect 1,588.07 Runs Per Season which Can Be Thought of 9.80 Runs Per Game



Linear Weights



- OBP, SLG, OPS, and Runs Created
 - *Moneyball* Highlights the Importance of OBP
 - From 2010-2016, Average OBP was 32%
 - Purpose of OPS = Value Power Hitters
 - Recall:

$$\begin{aligned}OPS &= OBP + SLG \\ &= 1 \times OBP + 1 \times SLG\end{aligned}$$

Equal Weights

- Which Covariate (OBP or SLG) is Better for Predicting Runs?



Linear Weights

- OBP, SLG, OPS, and Runs Created
 - Multiple Regression (2010-2016 Team Data)

$$Runs = \beta_0 + \beta_1(SLG) + \beta_2(OBP) + \epsilon$$

| | Coefficients | Standard Error | t Stat | P-value |
|-----------|--------------|----------------|--------------|-------------|
| Intercept | -738.7520251 | 43.82154709 | -16.85819133 | 1.04367E-40 |
| OBP | 2338.121668 | 191.8515917 | 12.18713719 | 4.14782E-26 |
| SLG | 1707.332494 | 92.94672979 | 18.3689356 | 2.39874E-45 |

$$n = 210 \ \& \ R^2 = 0.89 \ \& \ Adj. R^2 = 0.88$$

- Summary: OBP is More Important Than SLG (1.4 Times More)



Linear Weights

- Runs Created Above Average
 - How Many More Runs if Average Team Added a Player?
 - Average Team (2010-2016) Versus Bryant (2016)

| Hit Type | Average Team | Bryant 2016 |
|----------|--------------|-------------|
| Single | 939.83 | 99 |
| Double | 276.2 | 35 |
| Triple | 29.16 | 3 |
| HR | 159.36 | 39 |
| BB+HBP | 544.59 | 93 |
| SB | 95.08 | 8 |
| Outs | 4328.64 | 416.15 |



Linear Weights

- Runs Created Above Average

| Hit Type | Average Team | Bryant | Bryant + Team |
|----------|--------------|--------|---------------|
| Single | 939.83 | 99 | 948.48 |
| Double | 276.2 | 35 | 284.64 |
| Triple | 29.16 | 3 | 29.36 |
| HR | 159.36 | 39 | 183.04 |
| BB+HBP | 544.59 | 93 | 597.33 |
| SB | 95.08 | 8 | 93.94 |



Linear Weights



- **Runs Created Above Average**
 - If Added, Rest of Players Will Cost an Approximate
 $4328.64 - 416.15 = 3912.49$ *Outs*

- For the Rest of The Team, This is Equivalent to
 $\frac{3912.49}{4328.64} = 90.4\%$ *of Total Outs*

- **Singles With Bryant Added to Roster**

$$\begin{aligned} \text{Singles} &= 0.904(\text{Singles of Team}) + (\text{Singles of Bryant}) \\ &= 0.904(939.83) + (99) = 948.61 \end{aligned}$$



Linear Weights



- Runs Created Above Average
 - Predicted Runs of Average Team = 693.02
 - Predicted Runs of Bryant+Average Team = 751.08
 - Added Value of Bryant = $751.08 - 693.02 = 58$ Runs Above Average





Final Inspiration

If you don't like sports,
you may like baseball.

- Mahatma Mario