## Final Project - Predicting March Madness

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```
library(tidyverse)
library(tidymodels)
library(Stat2Data)
library(caret)
library(leaps)
library(MASS)
cbb <- read_csv("data/cbb.csv")</pre>
#Remove non-postseason teams and R68 losers
cbb <- cbb[!is.na(cbb$POSTSEASON),]</pre>
cbb <- filter(cbb, !grepl("R68", POSTSEASON))</pre>
#Cleaning up variable names, variables, etc
cbb$POSTSEASON <- str trim(cbb$POSTSEASON, side = c("both"))</pre>
cbb <- rename(cbb, march_madness = POSTSEASON)</pre>
cbb <- cbb |>
  mutate(march_madness = case_when(
    march_madness == "Sweet Sixteen" ~ "S16",
    march_madness == "Elite Eight" ~ "E8",
    march_madness == "Final Four" ~ "F4",
    march_madness == "Finals" ~ "2ND",
    march madness == "CHAMPS" ~ "Champions",
    TRUE ~ march_madness
  ))
#separated each row by round for determining differences
cbb <- mutate(cbb, round_64 = if_else(march_madness == "R64", FALSE, TRUE))</pre>
round_64 <- cbb
```

```
cbb <- mutate(cbb, round_32 =</pre>
         case_when(march_madness == "R32" ~ FALSE,
         march_madness %in% c("S16", "E8", "F4", "2ND", "Champions") ~ TRUE,
         TRUE ~ NA))
round_32 <- cbb[!is.na(cbb$round_32),]</pre>
cbb <- mutate(cbb, sweet sixteen =</pre>
         case_when(march_madness == "S16" ~ FALSE,
         march_madness %in% c("E8", "F4", "2ND", "Champions") ~ TRUE,
         TRUE ~ NA))
sweet_sixteen <- cbb[!is.na(cbb$sweet_sixteen),]</pre>
cbb <- mutate(cbb, elite_eight =</pre>
         case_when(march_madness == "E8" ~ FALSE,
         march_madness %in% c("F4", "2ND", "Champions") ~ TRUE,
         TRUE ~ NA))
elite_eight <- cbb[!is.na(cbb$elite_eight),]</pre>
cbb <- mutate(cbb, final_four =</pre>
         case_when(march_madness == "F4" ~ FALSE,
         march_madness %in% c("2ND", "Champions") ~ TRUE,
         TRUE ~ NA))
final_four <- cbb[!is.na(cbb$final_four),]</pre>
cbb <- mutate(cbb, champ_game =</pre>
         case_when(march_madness == "2ND" ~ FALSE,
         march_madness %in% c("Champions") ~ TRUE,
         TRUE ~ NA))
champ_game <- cbb[!is.na(cbb$champ_game),]</pre>
round_64_model <- glm(round_64 ~ ADJOE + ADJDE + `EFG%` +
                          `EFGD%` + TOR + TORD + ORB +
                         DRB + FTR + FTRD + `2P%` +
                          ^2P\%D^ + ^3P\% + ^ADJ T.^,
                       data = round_64,
                       family = "binomial")
round_64_min <- glm(round_64 ~ 1,</pre>
                     data = round 64,
                     family = "binomial")
```

```
stepAIC(round_64_min,
          scope = list(lower = round_64_min, upper = round_64_model),
          data = round_64, direction = "both")
Start: AIC=889.23
round 64 ~ 1
          Df Deviance
                         AIC
+ ADJOE
           1 745.58 749.58
+ ADJDE
           1 748.66 752.66
+ `EFGD%`
           1 852.37 856.37
+ `2P%D`
           1 863.10 867.10
+ TOR
           1 867.23 871.23
+ ORB
           1 869.63 873.63
+ `EFG%`
           1 874.24 878.24
+ `2P%`
           1 874.95 878.95
           1 877.05 881.05
+ FTRD
+ FTR
           1 882.54 886.54
           1 882.58 886.58
+ `3P%`
+ TORD
           1 883.84 887.84
               887.23 889.23
<none>
+ `ADJ T.` 1 886.55 890.55
+ DRB
           1
               886.80 890.80
Step: AIC=749.58
round_64 ~ ADJOE
          Df Deviance
                         AIC
+ ADJDE
               633.57 639.57
+ `EFGD%`
           1 700.73 706.73
+ TORD
           1 721.45 727.45
+ `2P%D`
           1 722.31 728.31
+ `3P%`
           1 727.36 733.36
+ `EFG%`
           1 731.12 737.12
+ `2P%`
           1 741.68 747.68
```

+ `ADJ T.`

+ ORB

<none>

+ FTR

+ TOR

+ DRB

+ FTRD

1 742.04 748.04

1 742.31 748.31

1 743.83 749.83

1 744.14 750.14

1 744.28 750.28

1 744.43 750.43

745.58 749.58

- ADJOE 1 887.23 889.23

Step: AIC=639.57
round\_64 ~ ADJOE + ADJDE

		Df	Deviance	AIC
+	DRB	1	626.48	634.48
+	TORD	1	630.67	638.67
+	`2P%D`	1	631.14	639.14
<r< td=""><td>none&gt;</td><td></td><td>633.57</td><td>639.57</td></r<>	none>		633.57	639.57
+	`3P%`	1	633.04	641.04
+	TOR	1	633.09	641.09
+	`EFGD%`	1	633.20	641.20
+	ORB	1	633.29	641.29
+	FTR	1	633.49	641.49
+	`ADJ T.`	1	633.52	641.52
+	`EFG%`	1	633.53	641.53
+	`2P%`	1	633.54	641.54
+	FTRD	1	633.54	641.54
-	ADJDE	1	745.58	749.58
-	ADJOE	1	748.66	752.66

Step: AIC=634.48
round\_64 ~ ADJOE + ADJDE + DRB

	Df	Deviance	AIC
+ `2P%D`	1	623.01	633.01
<none></none>		626.48	634.48
+ ORB	1	624.98	634.98
+ `2P%`	1	625.03	635.03
+ TOR	1	625.06	635.06
+ `EFGD%`	1	625.36	635.36
+ FTR	1	625.46	635.46
+ FTRD	1	625.46	635.46
+ `EFG%`	1	625.66	635.66
+ TORD	1	626.24	636.24
+ `ADJ T.`	1	626.39	636.39
+ `3P%`	1	626.43	636.43
- DRB	1	633.57	639.57
- ADJOE	1	741.75	747.75
- ADJDE	1	744.28	750.28

Step: AIC=633.01

```
round_64 ~ ADJOE + ADJDE + DRB + `2P%D`
           Df Deviance
                          AIC
                623.01 633.01
<none>
+ `2P%`
           1 621.81 633.81
+ TOR
               622.20 634.20
+ `EFG%`
           1 622.26 634.26
+ FTRD
           1 622.27 634.27
+ ORB
            1 622.38 634.38
+ `EFGD%`
            1 622.40 634.40
- `2P%D`
            1 626.48 634.48
+ FTR
            1 622.76 634.76
            1 622.95 634.95
+ TORD
+ `ADJ T.`
           1 622.99 634.99
+ `3P%`
            1 623.01 635.01
- DRB
           1 631.14 639.14
- ADJDE
           1 721.03 729.03
- ADJOE
           1 734.31 742.31
Call: glm(formula = round_64 ~ ADJOE + ADJDE + DRB + `2P%D`, family = "binomial",
    data = round_64)
Coefficients:
(Intercept)
                                               DRB
                                                         `2P%D`
                   ADJOE
                                ADJDE
   -1.12003
                 0.18617
                             -0.27140
                                           0.09371
                                                        0.08000
Degrees of Freedom: 639 Total (i.e. Null); 635 Residual
Null Deviance:
                    887.2
Residual Deviance: 623 AIC: 633
  round_32_model <- glm(round_32 ~ ADJOE + ADJDE + `EFG%` +</pre>
                          `EFGD%` + TOR + TORD + ORB +
                          DRB + FTR + FTRD + `2P%` +
                          ^2P\%D^ + ^3P\% + ^ADJ T.^,
                        data = round_32,
                        family = "binomial")
  round_32_min <- glm(round_32 ~ 1,</pre>
                      data = round_32,
                      family = "binomial")
```

Start: AIC=445.61 round\_32 ~ 1

Df Deviance AIC + ADJOE 399.95 403.95 1 + ADJDE 1 424.78 428.78 + `EFG%` 1 434.30 438.30 + `2P%` 1 435.62 439.62 1 435.97 439.97 + FTRD + `3P%` 1 439.12 443.12 + ORB 1 439.24 443.24 + `EFGD%` 1 439.26 443.26 1 439.63 443.63 + `2P%D` 1 439.76 443.76 + TOR <none> 443.61 445.61 + FTR 1 443.31 447.31 + `ADJ T.` 1 443.37 447.37 + TORD 1 443.40 447.40 + DRB 1 443.59 447.59

Step: AIC=403.95 round\_32 ~ ADJOE

Df Deviance AIC 1 370.97 376.97 + ADJDE + `EFGD%` 1 391.59 397.59 + `2P%D` 1 395.25 401.25 + `3P%` 1 397.04 403.04 + TORD 1 397.14 403.14 397.80 403.80 + `EFG%` 399.95 403.95 <none> + FTRD 1 398.21 404.21 + TOR 1 398.26 404.26 + ORB 1 398.87 404.87 1 399.55 405.55 + FTR + DRB 1 399.64 405.64 1 399.67 405.67 + `2P%`

```
+ `ADJ T.` 1 399.92 405.92
- ADJOE 1 443.61 445.61
```

Step: AIC=376.97

round\_32 ~ ADJOE + ADJDE

		Df	Deviance	AIC
+	DRB	1	368.40	376.40
<1	none>		370.97	376.97
+	`2P%D`	1	369.61	377.61
+	FTRD	1	369.88	377.88
+	`EFGD%`	1	370.09	378.09
+	`3P%`	1	370.53	378.53
+	`ADJ T.`	1	370.58	378.58
+	`EFG%`	1	370.67	378.67
+	FTR	1	370.67	378.67
+	TOR	1	370.69	378.69
+	ORB	1	370.92	378.92
+	`2P%`	1	370.96	378.96
+	TORD	1	370.97	378.97
_	ADJDE	1	399.95	403.95
_	ADJOE	1	424.78	428.78

Step: AIC=376.4

round\_32 ~ ADJOE + ADJDE + DRB

		D£	Deviance	AIC
		דת	Deviance	AIC
+	FTRD	1	366.21	376.21
<r< td=""><td>none&gt;</td><td></td><td>368.40</td><td>376.40</td></r<>	none>		368.40	376.40
+	`2P%D`	1	366.56	376.56
+	`EFGD%`	1	366.84	376.84
-	DRB	1	370.97	376.97
+	TORD	1	367.34	377.34
+	FTR	1	367.65	377.65
+	ORB	1	367.88	377.88
+	`ADJ T.`	1	368.01	378.01
+	`3P%`	1	368.15	378.15
+	`2P%`	1	368.25	378.25
+	TOR	1	368.33	378.33
+	`EFG%`	1	368.40	378.40
-	ADJDE	1	399.64	405.64
_	ADJOE	1	424.42	430.42

```
Step: AIC=376.21
round_32 ~ ADJOE + ADJDE + DRB + FTRD
          Df Deviance
                         AIC
               366.21 376.21
<none>
- FTRD
               368.40 376.40
+ `2P%D`
           1 364.74 376.74
+ `EFGD%`
           1 364.81 376.81
+ `3P%`
            1 365.84 377.84
            1 369.88 377.88
- DRB
+ `ADJ T.`
           1 365.89 377.89
+ TORD
            1 365.99 377.99
+ `EFG%`
            1 366.04 378.04
+ FTR
           1 366.06 378.06
+ TOR
           1 366.08 378.08
+ ORB
           1 366.16 378.16
+ `2P%`
           1 366.20 378.20
- ADJDE
          1 397.39 405.39
- ADJOE
          1 415.73 423.73
Call: glm(formula = round_32 ~ ADJOE + ADJDE + DRB + FTRD, family = "binomial",
    data = round_32)
Coefficients:
(Intercept)
                  ADJOE
                               ADJDE
                                              DRB
                                                          FTRD
   -3.60830
                 0.18163
                           -0.19702
                                          0.08740
                                                       -0.03527
Degrees of Freedom: 319 Total (i.e. Null); 315 Residual
Null Deviance:
                    443.6
Residual Deviance: 366.2
                           AIC: 376.2
  sweet_sixteen_model <- glm(sweet_sixteen ~ ADJOE + ADJDE +</pre>
                             `EFG%` + `EFGD%` + TOR + TORD +
                               ORB + DRB + FTR + FTRD + `2P%` +
                               ^2P\%D^ + ^3P\%^ + ^ADJ T.^,
                          data = sweet_sixteen,
                          family = "binomial")
  sweet_sixteen_min <- glm(sweet_sixteen ~ 1,</pre>
                      data = sweet_sixteen,
                      family = "binomial")
```

```
stepAIC(sweet_sixteen_min,
          scope = list(lower = sweet_sixteen_min,
                       upper = sweet_sixteen_model),
          data = sweet_sixteen, direction = "both")
Start: AIC=223.81
sweet_sixteen ~ 1
          Df Deviance
                         AIC
+ ADJOE
               211.57 215.57
               214.56 218.56
+ ADJDE
           1
+ `EFGD%`
           1 217.95 221.95
+ `2P%D`
           1 218.79 222.79
+ TOR
               219.13 223.13
           1
+ `2P%`
           1 219.37 223.37
               219.64 223.64
+ `EFG%`
<none>
               221.81 223.81
               220.62 224.62
+ ORB
           1
+ `ADJ T.`
           1 221.34 225.34
+ TORD
           1 221.56 225.56
+ `3P%`
           1
               221.57 225.57
+ FTRD
           1 221.59 225.59
+ FTR
               221.62 225.62
           1
+ DRB
               221.73 225.73
           1
Step: AIC=215.57
sweet_sixteen ~ ADJOE
           Df Deviance
                          AIC
+ ADJDE
               198.30 204.30
+ `EFGD%`
               205.52 211.52
+ `2P%D`
               208.10 214.10
+ `3P%`
               208.81 214.81
+ TORD
               208.91 214.91
               211.57 215.57
<none>
```

210.33 216.33

210.68 216.68

211.24 217.24

1 210.88 216.88 211.16 217.16

1 211.17 217.17

1 1

1

+ `EFG%`

+ ORB

+ FTRD + DRB

+ FTR

+ `ADJ T.`

```
+ `2P%` 1 211.45 217.45
+ TOR 1 211.57 217.57
- ADJOE 1 221.81 223.81
```

Step: AIC=204.3

sweet\_sixteen ~ ADJOE + ADJDE

	Df	${\tt Deviance}$	AIC
+ DRB	1	195.97	203.97
<none></none>		198.30	204.30
+ `3P%`	1	197.51	205.51
+ `EFG%`	1	197.54	205.54
+ `ADJ T.`	1	197.72	205.72
+ `2P%`	1	197.92	205.92
+ FTRD	1	197.95	205.95
+ `2P%D`	1	197.99	205.99
+ TOR	1	198.05	206.05
+ FTR	1	198.18	206.18
+ TORD	1	198.18	206.18
+ `EFGD%`	1	198.26	206.26
+ ORB	1	198.30	206.30
- ADJDE	1	211.57	215.57
- ADJOE	1	214.56	218.56

Step: AIC=203.97

sweet\_sixteen ~ ADJOE + ADJDE + DRB

	Df	Deviance	AIC
<none></none>		195.97	203.97
- DRB	1	198.30	204.30
+ TOR	1	195.31	205.31
+ `3P%`	1	195.32	205.32
+ `2P%D`	1	195.39	205.39
+ `ADJ T.`	1	195.42	205.42
+ `EFGD%`	1	195.65	205.65
+ TORD	1	195.68	205.68
+ ORB	1	195.73	205.73
+ `EFG%`	1	195.77	205.77
+ FTRD	1	195.90	205.90
+ `2P%`	1	195.95	205.95
+ FTR	1	195.96	205.96
- ADJDE	1	211.17	217.17
- ADJOE	1	213.87	219.87

```
Call: glm(formula = sweet_sixteen ~ ADJOE + ADJDE + DRB, family = "binomial",
    data = sweet_sixteen)
Coefficients:
(Intercept)
                  ADJOE
                               ADJDE
                                              DRB
    -2.1216
                 0.1480
                             -0.1896
                                           0.0910
Degrees of Freedom: 159 Total (i.e. Null); 156 Residual
Null Deviance:
                   221.8
Residual Deviance: 196 AIC: 204
  elite_eight_model <- glm(elite_eight ~ ADJOE + ADJDE +</pre>
                           `EFG%` + `EFGD%` + TOR + TORD +
                             ORB + DRB + FTR + FTRD + `2P%` +
                             ^2P\%D^ + ^3P\% + ^ADJ T.^,
                          data = elite_eight,
                          family = "binomial")
  elite_eight_min <- glm(elite_eight ~ 1,</pre>
                      data = elite_eight,
                      family = "binomial")
  stepAIC(elite_eight_min,
          scope = list(lower = elite_eight_min,
                       upper = elite_eight_model),
          data = elite_eight, direction = "both")
Start: AIC=112.9
elite_eight ~ 1
          Df Deviance AIC
+ ADJDE
           1 107.77 111.77
+ ADJOE
          1 108.19 112.19
               110.90 112.90
<none>
+ FTR
          1 109.41 113.41
+ FTRD
          1 109.64 113.64
+ `EFGD%` 1 109.85 113.85
+ `3P%`
           1 110.15 114.15
+ `ADJ T.` 1 110.34 114.34
+ `2P%D` 1 110.56 114.56
```

```
+ `EFG%` 1 110.59 114.59
+ TOR 1 110.68 114.68
+ DRB 1 110.78 114.78
+ ORB 1 110.79 114.79
+ TORD 1 110.86 114.86
+ `2P%` 1 110.90 114.90
```

Step: AIC=111.77
elite\_eight ~ ADJDE

	Df	Deviance	AIC
+ ADJOE	1	103.10	109.10
+ FTR	1	105.24	111.24
+ `3P%`	1	105.47	111.47
<none></none>		107.77	111.77
+ FTRD	1	105.78	111.78
+ `EFG%`	1	106.69	112.69
+ TOR	1	106.88	112.88
- ADJDE	1	110.90	112.90
+ `ADJ T.`	1	106.93	112.93
+ `2P%D`	1	107.20	113.20
+ TORD	1	107.30	113.30
+ `EFGD%`	1	107.60	113.60
+ DRB	1	107.75	113.75
+ `2P%`	1	107.76	113.76
+ ORB	1	107.77	113.77

Step: AIC=109.1
elite\_eight ~ ADJDE + ADJOE

	Df	Deviance	AIC
+ `2P%`	1	100.34	108.34
<none></none>		103.10	109.10
+ FTR	1	101.20	109.20
+ `2P%D`	1	101.98	109.98
+ `ADJ T.`	1	102.21	110.21
+ `EFG%`	1	102.46	110.46
+ `EFGD%`	1	102.77	110.77
+ FTRD	1	102.80	110.80
+ `3P%`	1	102.81	110.81
+ ORB	1	102.94	110.94
+ TOR	1	102.97	110.97
+ DRB	1	103.05	111.05

```
+ TORD
           1 103.07 111.07
- ADJOE
               107.77 111.77
           1
- ADJDE
               108.19 112.19
           1
Step: AIC=108.34
elite_eight ~ ADJDE + ADJOE + `2P%`
          Df Deviance
                         AIC
+ FTR
               97.503 107.50
              100.343 108.34
<none>
+ FTRD
           1 98.914 108.91
+ `2P%D`
           1 98.943 108.94
+ ORB
           1 98.961 108.96
- `2P%`
           1 103.101 109.10
+ `EFG%`
           1 99.729 109.73
+ `EFGD%`
           1 99.815 109.81
+ `ADJ T.`
           1 100.181 110.18
+ `3P%`
           1 100.212 110.21
+ TORD
           1 100.222 110.22
```

Step: AIC=107.5

+ TOR

+ DRB

ADJDEADJOE

elite\_eight ~ ADJDE + ADJOE + `2P%` + FTR

1 100.225 110.22

1 100.322 110.32

1 106.197 112.20

1 107.763 113.76

```
Df Deviance
                         AIC
               97.503 107.50
<none>
- FTR
           1 100.343 108.34
+ ORB
               96.851 108.85
           1
+ FTRD
           1 96.860 108.86
+ `2P%D`
           1 97.032 109.03
+ TOR
           1 97.089 109.09
- `2P%`
           1 101.197 109.20
              97.303 109.30
+ TORD
+ `ADJ T.`
           1 97.305 109.31
+ `EFG%`
           1
               97.352 109.35
+ `EFGD%`
           1 97.417 109.42
+ DRB
           1 97.482 109.48
+ `3P%`
           1 97.502 109.50
           1 104.627 112.63
- ADJDE
- ADJOE
           1 105.190 113.19
```

```
Call: glm(formula = elite_eight ~ ADJDE + ADJOE + `2P%` + FTR, family = "binomial",
    data = elite_eight)
Coefficients:
(Intercept)
                                             `2P%`
                   ADJDE
                                ADJOE
                                                            FTR
   10.68272
                -0.19039
                              0.17180
                                          -0.19025
                                                       -0.09283
Degrees of Freedom: 79 Total (i.e. Null); 75 Residual
Null Deviance:
                    110.9
Residual Deviance: 97.5
                           AIC: 107.5
  final_four_model <- glm(final_four ~ ADJOE + ADJDE + `EFG%` +</pre>
                            `EFGD%` + TOR + TORD + ORB + DRB +
                            FTR + FTRD + `2P%` + `2P%D` +
                            ^3P\% + ^ADJ T.^,
                          data = final_four,
                          family = "binomial")
  final_four_min <- glm(final_four ~ 1,</pre>
                      data = final_four,
                      family = "binomial")
  stepAIC(final_four_min,
          scope = list(lower = final_four_min,
                       upper = final_four_model),
          data = final_four, direction = "both")
Start: AIC=57.45
final_four ~ 1
           Df Deviance
                        AIC
+ `2P%`
            1 48.649 52.649
+ ADJOE
           1 48.973 52.973
+ `EFG%`
            1 51.674 55.674
+ TOR
            1 51.692 55.692
               55.452 57.452
<none>
+ DRB
            1 53.506 57.506
+ `ADJ T.` 1 54.135 58.135
+ FTRD
            1 54.150 58.150
          1 54.825 58.825
```

+ ADJDE

```
1 54.945 58.945
+ TORD
+ `2P%D`
           1 55.035 59.035
+ `3P%`
           1 55.337 59.337
+ FTR
           1 55.425 59.425
+ ORB
           1 55.439 59.439
+ `EFGD%`
           1 55.452 59.452
Step: AIC=52.65
final_four ~ `2P%`
           Df Deviance
                         AIC
               48.649 52.649
<none>
+ ORB
               46.858 52.858
+ ADJDE
           1 46.995 52.995
           1 47.100 53.100
+ ADJOE
+ `2P%D`
           1 47.437 53.437
+ TOR
           1 47.557 53.557
+ `EFG%`
           1 47.814 53.814
+ FTR
           1 47.881 53.881
+ `3P%`
           1 48.162 54.162
+ `EFGD%`
           1 48.379 54.379
+ `ADJ T.`
           1 48.451 54.451
+ DRB
           1 48.483 54.483
+ FTRD
           1 48.488 54.488
+ TORD
           1 48.645 54.645
- `2P%`
           1 55.452 57.452
Call: glm(formula = final_four ~ `2P%`, family = "binomial", data = final_four)
Coefficients:
(Intercept)
                   `2P%`
    -14.448
                  0.276
Degrees of Freedom: 39 Total (i.e. Null); 38 Residual
Null Deviance:
                   55.45
Residual Deviance: 48.65
                           AIC: 52.65
  champ_game_model <- glm(champ_game ~ ADJOE + ADJDE +</pre>
                            `EFG%` + `EFGD%` + TOR + TORD +
                            ORB + DRB + FTR + FTRD + ^2P\%^ +
                            ^2P\%D^ + ^3P\%^ + ^ADJ T.^,
```

```
data = champ_game,
family = "binomial")
```

Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

```
champ_game_min <- glm(champ_game ~ 1,</pre>
                     data = champ_game,
                     family = "binomial")
  stepAIC(champ_game_min,
          scope = list(lower = champ_game_min,
                      upper = champ_game_model),
          data = champ_game, direction = "both")
Start: AIC=29.73
champ_game ~ 1
          Df Deviance
                       AIC
+ `3P%`
           1 23.552 27.552
+ DRB
           1 23.790 27.790
          1 25.449 29.449
+ TORD
              27.726 29.726
<none>
           1 26.521 30.521
+ ADJOE
+ ORB
          1 27.224 31.224
           1 27.227 31.227
+ TOR
+ `2P%D` 1 27.422 31.422
         1 27.440 31.440
+ `2P%`
+ FTR
          1 27.520 31.520
+ ADJDE
           1 27.523 31.523
+ `ADJ T.` 1 27.574 31.574
+ FTRD
           1 27.583 31.583
           1 27.589 31.589
+ `EFG%`
+ `EFGD%`
           1 27.721 31.721
Step: AIC=27.55
champ_game ~ `3P%`
          Df Deviance
                         AIC
+ DRB
           1 18.472 24.472
```

1 20.227 26.227

+ TORD

```
+ ORB 1 20.229 26.229
+ TOR
         1 21.289 27.289
             23.552 27.552
<none>
+ FTRD 1 21.699 27.699
+ `EFG%` 1 22.122 28.122
+ `2P%`
        1 22.254 28.254
         1 23.233 29.233
+ ADJDE
         1 23.352 29.352
+ FTR
         1 23.423 29.423
+ ADJOE
+ `2P%D` 1 23.535 29.535
+ `ADJ T.` 1 23.549 29.549
+ `EFGD%` 1 23.551 29.551
- `3P%`
           1 27.726 29.726
```

Step: AIC=24.47
champ\_game ~ `3P%` + DRB

	Df	${\tt Deviance}$	AIC
<none></none>		18.472	24.472
+ ORB	1	16.473	24.473
+ `2P%D`	1	17.260	25.260
+ ADJOE	1	17.566	25.566
+ `EFGD%`	1	17.586	25.586
+ `EFG%`	1	18.050	26.050
+ `2P%`	1	18.104	26.104
+ TORD	1	18.123	26.123
+ `ADJ T.`	1	18.262	26.262
+ FTRD	1	18.299	26.299
+ TOR	1	18.349	26.349
+ FTR	1	18.386	26.386
+ ADJDE	1	18.466	26.466
- DRB	1	23.552	27.552
- `3P%`	1	23.790	27.790

Call: glm(formula = champ\_game ~ `3P%` + DRB, family = "binomial",
 data = champ\_game)

## Coefficients:

(Intercept) 3P% DRB -33.7666 0.5821 0.4441 Degrees of Freedom: 19 Total (i.e. Null); 17 Residual

Null Deviance: 27.73

Residual Deviance: 18.47 AIC: 24.47