Predicting NFL Wide Receiver Success Using Combine Measurables and PFF College Data

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Load Packages

```
library(tidyverse)
library(tidyr)
library(readr)
library(dplyr)
library(broom)
library(knitr)
library(nflfastR)
library(nflplotR)
library(ggrepel)
library(caret)
```

Load PFF Data

```
stats_2014 <- read.csv("data_pff_receiver/2014_receiver_pff_data.csv") %>%
  select(-c(avg_depth_of_target, avoided_tackles, contested_catch rate,
            contested_receptions, contested_targets, declined_penalties,
            franchise_id, fumbles, grades_pass_block, inline_rate, inline_snaps,
            interceptions, longest, pass_block_rate, pass_blocks, penalties,
            slot rate, slot snaps, wide rate, wide snaps))
stats_2015 <- read.csv("data_pff_receiver/2015_receiver_pff_data.csv") %>%
  select(-c(avg_depth_of_target, avoided_tackles, contested_catch_rate,
            contested_receptions, contested_targets, declined_penalties,
            franchise_id, fumbles, grades_pass_block, inline_rate, inline_snaps,
            interceptions, longest, pass_block_rate, pass_blocks, penalties,
            slot_rate, slot_snaps, wide_rate, wide_snaps))
stats_2016 <- read.csv("data_pff_receiver/2016_receiver_pff_data.csv") %>%
  select(-c(avg_depth_of_target, avoided_tackles, contested_catch_rate,
            contested_receptions, contested_targets, declined_penalties,
            franchise_id, fumbles, grades_pass_block, inline_rate, inline_snaps,
            interceptions, longest, pass_block_rate, pass_blocks, penalties,
            slot_rate, slot_snaps, wide_rate, wide_snaps))
stats_2017 <- read.csv("data_pff_receiver/2017_receiver_pff data.csv") %>%
  select(-c(avg_depth_of_target, avoided_tackles, contested_catch_rate,
            contested_receptions, contested_targets, declined_penalties,
            franchise_id, fumbles, grades_pass_block, inline_rate, inline_snaps,
            interceptions, longest, pass block rate, pass blocks, penalties,
            slot_rate, slot_snaps, wide_rate, wide_snaps))
```

```
stats_2018 <- read.csv("data_pff_receiver/2018_receiver_pff_data.csv") %>%
  select(-c(avg_depth_of_target, avoided_tackles, contested_catch_rate,
            contested_receptions, contested_targets, declined_penalties,
            franchise_id, fumbles, grades_pass_block, inline_rate, inline_snaps,
            interceptions, longest, pass_block_rate, pass_blocks, penalties,
            slot_rate, slot_snaps, wide_rate, wide_snaps))
stats_2019 <- read.csv("data_pff_receiver/2019_receiver_pff_data.csv") %>%
  select(-c(avg_depth_of_target, avoided_tackles, contested_catch_rate,
            contested_receptions, contested_targets, declined_penalties,
            franchise_id, fumbles, grades_pass_block, inline_rate, inline_snaps,
            interceptions, longest, pass_block_rate, pass_blocks, penalties,
            slot_rate, slot_snaps, wide_rate, wide_snaps))
stats_2020 <- read.csv("data_pff_receiver/2020_receiver_pff_data.csv") %>%
  select(-c(avg_depth_of_target, avoided_tackles, contested_catch_rate,
            contested_receptions, contested_targets, declined_penalties,
            franchise_id, fumbles, grades_pass_block, inline_rate, inline_snaps,
            interceptions, longest, pass_block_rate, pass_blocks, penalties,
            slot_rate, slot_snaps, wide_rate, wide_snaps))
combine_stats <- read.csv("combinedStats.csv")</pre>
```

Stats by Draft Classes

```
#2020 Stats of 2021 DC
dc_2021 <- c("Ja'Marr Chase", "DeVonta Smith", "Elijah Moore", "Dax Milne",
              "Jaelon Darden" , "Austin Trammell" , "Marlon Williams" ,
              "Tim Jones", "Tylan Wallace", "D'Wayne Eskridge",
              "Jonathan Adams Jr." , "Kadarius Toney" , "Jaylen Waddle" ,
             "Antonio Nunn", "Dyami Brown", "Rashod Bateman",
              "Terrace Marshall Jr.", "Shi Smith", "Amari Rodgers", "Rondale Moore",
             "Isaiah McKoy", "Damon Hazelton", "Camden Harrison", "Brevin Jordan", "Bailey Gaither", "Tutu Atwell", "Dez Fitzpatrick", "Austin Watkins",
             "Simi Fehoko" , "Connor Wedington" , "Kawaan Baker" , "Cornell Powell" ,
             "Blake Proehl", "Javon McKinley", "Dazz Newsome", "Landen Akers",
"Tre Walker", "Amon-Ra St. Brown", "Eli Stove", "Ramaud Chiaokhiao-Bowman",
             "Josh Palmer" , "Anthony Schwartz" , "Whop Philyor" , "Damonte Coxie" ,
             "Tray Eafford" , "Brennan Eagles" , "Trevon Grimes" , "Myron Mitchell" ,
             "Marquez Stevenson" , "Adrian Hardy" , "Seth Williams" , "Tre Odoms-Dukes" ,
             "Tyler Vaughns" , "Antwan Davis" , "Dillon Stoner" , "Josh Imatorbhebhe" ,
             "Tamorrion Terry", "T.J. Simmons", "DJ Turner", "Tarik Black",
             "Tre Nixon", "Sam Denmark", "Jalen Camp", "Ihmir Smith-Marsette",
             "Osirus Mitchell" , "Bennett Skowronek" , "Terrell Jana" , "Khalil McClain" ,
             "Jeremiah Haydel" , "T.J. Vasher" , "Riley Lees" , "Jacob Harris" ,
              "Racey McMath" , "Rico Bussey Jr." , "Branden Mack" , "Brandon Smith" ,
              "Frank Darby" , "Javon Turner" , "Adam Krumholz")
dc2021_stats2020 <- stats_2020 %>%
  filter(player %in% dc_2021 & position == "WR") %>%
  left_join(stats_2019, by = c("player", "player_id", "position"),
            suffix = c("_draft", "_pre")) |>
  rowwise() %>%
  mutate(total_yards = yards_draft + yards_pre,
         total_catch_percent = sum(c(receptions_draft + receptions_pre), na.rm=TRUE) / sum(c(targets_dr
```

```
na.rm = TRUE
         total_target_percent = sum(c(targets_draft + targets_pre), na.rm = TRUE) / sum(c(routes draft + targets_pre), na.rm = true) / sum(c(routes draft + targets_pre))
                                                                                           na.rm = TRUE),
         total_route_percent = sum(c(routes_draft + routes_pre), na.rm = TRUE) / sum(c(pass_plays_draft
                                                                                        na.rm = TRUE),
         total_drop_percent = sum(c(drops_draft+drops_pre), na.rm = TRUE) / sum(c(targets_draft+targets
         total_yprr = yprr_draft + yprr_pre,
         total_first_downs = sum(c(first_downs_draft+first_downs_pre), na.rm = TRUE),
         total_yards_per_reception = sum(c(yards_per_reception_draft+yards_per_reception_pre), na.rm = '
         total_yards_after_catch_per_reception = sum(c(yards_after_catch_per_reception_draft+
                                                         yards_after_catch_per_reception_pre), na.rm = TR
         total_player_game_count = sum(c(player_game_count_draft+player_game_count_pre), na.rm = TRUE),
         total_touchdowns = sum(c(touchdowns_draft+touchdowns_pre), na.rm = TRUE),
         total_yards_per_game = ((sum(c(yards_draft,yards_pre), na.rm = TRUE)) / total_player_game_coun
         total_yards_after_catch_per_game = ((sum(c(yards_after_catch_draft+ yards_after_catch_pre), na
                                                total_player_game_count),
         total_targets_per_game = ((sum(c(targets_draft+targets_pre), na.rm = TRUE)) / total_player_gam
         total_targeted_qb_rating = sum(c(targeted_qb_rating_draft+targeted_qb_rating_pre), na.rm = TRU
         games_draft = (player_game_count_draft / sum(c(player_game_count_draft+ player_game_count_pre)
         grades_hands_drop = sum(c((games_draft*grades_hands_drop_draft),((1-games_draft)*grades_hands_
                                  na.rm = TRUE),
         grades_hands_fumble = sum(c((games_draft*grades_hands_fumble_draft)+((1-games_draft)*grades_hands_fumble_draft)
                                    na.rm = TRUE),
         grades_offense = sum(c((games_draft*grades_offense_draft)+((1-games_draft)*grades_offense_pre)
         grades_pass_route = sum(c((games_draft*grades_pass_route_draft)+((1-games_draft)*grades_pass_r
                                  na.rm = TRUE)
pro_2022 <- read_csv("data/2022_pro_stats.csv")</pre>
## Rows: 466 Columns: 45
## -- Column specification ----
## Delimiter: ","
## chr (3): player, position, team_name
## dbl (42): player_id, player_game_count, avg_depth_of_target, avoided_tackles...
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
pro 2021 <- read csv("data/2021 pro stats.csv")</pre>
## Rows: 538 Columns: 45
## -- Column specification ----
## Delimiter: ","
## chr (3): player, position, team_name
## dbl (42): player_id, player_game_count, avg_depth_of_target, avoided_tackles...
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
dc_2021_pro_stats <- pro_2021 %>%
  inner_join(pro_2022, by = c("player", "position", "player_id"), suffix = c("1yr", "2yr")) %>%
  select(-c(grades_pass_block1yr, grades_pass_block2yr)) |>
  rowwise() %>%
```

```
mutate(total_yards = yards1yr + yards2yr,
         total_catch_percent = sum(c(receptions1yr + receptions2yr), na.rm=TRUE) / sum(c(targets1yr + t
                                                                                                na.rm = TRUE
         total_target_percent = sum(c(targets1yr + targets2yr), na.rm = TRUE) / sum(c(routes1yr + route
                                                                                             na.rm = TRUE),
         total_route_percent = sum(c(routes1yr + routes2yr), na.rm = TRUE) / sum(c(pass_plays1yr + pass
                                                                                         na.rm = TRUE),
         total_drop_percent = sum(c(drops1yr+drops2yr), na.rm = TRUE) / sum(c(targets1yr+targets2yr), n
         total_yprr = yprr1yr + yprr2yr,
         total_first_downs = sum(c(first_downs1yr+first_downs2yr), na.rm = TRUE),
         total_yards_per_reception = sum(c(yards_per_reception1yr+yards_per_reception2yr), na.rm = TRUE
         total_yards_after_catch_per_reception = sum(c(yards_after_catch_per_reception1yr+
                                                          yards_after_catch_per_reception2yr), na.rm = TRU
         total_player_game_count = sum(c(player_game_count1yr+player_game_count2yr), na.rm = TRUE),
         total_touchdowns = sum(c(touchdowns1yr+touchdowns2yr), na.rm = TRUE),
         total_yards_per_game = sum(c(yards1yr+yards2yr), na.rm = TRUE) / total_player_game_count,
         total_yards_after_catch_per_game = sum(c(yards_after_catch1yr + yards_after_catch2yr), na.rm =
                                                 total_player_game_count,
         total_targets_per_game = sum(c(targets1yr + targets2yr), na.rm = TRUE) / total_player_game_cou
         total_targeted_qb_rating = sum(c(targeted_qb_rating1yr+targeted_qb_rating2yr), na.rm = TRUE) /
         games2yr = (player_game_count2yr / sum(c(player_game_count2yr + player_game_count1yr), na.rm =
         grades_hands_drop = sum(c((games2yr*grades_hands_drop2yr)+((1-games2yr)*grades_hands_drop1yr))
                                  na.rm = TRUE),
         grades_hands_fumble = sum(c((games2yr*grades_hands_fumble2yr)+((1-games2yr)*grades_hands_fumble
                                    na.rm = TRUE),
         grades_offense = sum(c((games2yr*grades_offense2yr)+((1-games2yr)*grades_offense1yr)), na.rm =
         grades_pass_route = sum(c((games2yr*grades_pass_route2yr)+((1-games2yr)*grades_pass_route1yr))
                                  na.rm = TRUE)
#2019 Stats of 2020 DC
dc_{2020} \leftarrow c("Geraud Sanders", "Tyler Johnson", "CeeDee Lamb", "Tee Higgins",
             "Isaiah Hodgins" , "Omar Bayless" , "Devin Duvernay" , "Jauan Jennings" ,
             "Antonio Gandy-Golden", "Ja'Marcus Bradley", "James Proche",
             "Jerry Jeudy" , "Justin Jefferson" , "Laviska Shenault Jr." ,
             "Quintez Cephus" , "Brandon Arconado" , "Lawrence Cager" ,
             "Denzel Mims", "Chase Claypool", "Michael Pittman Jr.",
             "Gabriel Davis" , "Arthur Jackson III" , "Hasise Dubois" , "Brandon Aiyuk" , "Bryan Edwards" , "Deangelo Antoine" , "Michael Lawrence" ,
             "Micah Simon" , "Deshaunte Jones" , "Raghib Ismail Jr." , "Kendall Hinton" ,
             "Binjimen Victor" , "Tony Brown" , "Lucky Jackson" , "Cody White" ,
             "Elijah Robinson", "Collin Johnson", "Easop Winston Jr.",
             "Freddie Swain" , "Quez Watkins" , "Antonio Gibson" , "Henry Ruggs III" ,
             "Siaosi Mariner" , "Darrell Stewart Jr." , "Trishton Jackson" ,
             "Demetrius Davis" , "John Hightower" , "Austin Mack" , "Aaron Fuller" ,
             "Malik Stanley" , "K.J. Hill" , "Dezmon Patmon" , "Pace Ozmint" ,
             "Kirk Merritt" , "Maurice Ffrench" , "Joe Reed" , "Jordan Mitchell" ,
             \mbox{\tt "K.J. Hamler"} , \mbox{\tt "George Campbell"} , \mbox{\tt "Jeff Thomas"} , \mbox{\tt "Van Jefferson"} ,
             "Darnell Mooney" , "Riley Miller" , "Kalija Lipscomb" , "Jason-Matthew Sharsh" ,
             "Donovan Peoples-Jones" , "Marquez Callaway" , "Hutch White" ,
             "Quartney Davis" , "Kumoku Noa" , "Q' Drennan" , "Tony Nicholson" ,
             "Deddrick Thomas" , "Dalton Schoen" , "Scotty Washington" ,
             "Ardell Brown", "Derrick Vickers", "Devin Gentry", "Tony Gaiter IV", "Weston Carr", "Bryan Long Jr.", "Mark Michaud", "Jalen McCleskey",
             "Tyler Tupa" , "Josh Hammond" , "Jalen Reagor" , "Daylon Charlot" ,
```

```
"Talon Shumway" , "La'Michael Pettway" , "JoJo Ward" , "Aaron Molina" ,
              "Camryn Snow", "Kendall Parham", "RJ Turner", "Damian King",
              "Nick Basquine" , "Austin Maloney" , "Keith Mixon Jr." , "Chico McClatcher"
              , "Aleva Hifo" , "Ben Putman" , "Donavan Hale" , "Phil Patterson" ,
              "Mathew Sexton" , "Tyrie Cleveland" , "K.J. Osborn" , "Cedric Byrd II" ,
              "Austin Conway" , "Desmond Phillips" , "DL Knock" , "Lee Morris" ,
              "CJ Sanders" , "Stephen Guidry" , "Markis McCray" , "Juwan Johnson" ,
              "Nick Westbrook-Ikhine" , "Brenden Fulton" , "Trevor Terry" ,
              "Alan Busey" , "Jarrod Jackson" , "Johnathon Johnson" , "Deondre Farrier" ,
              "Chris Finke", "Derrick Dillon", "Terrell Chatman", "Jocquez Bruce",
              "Travon Williams" , "Mike Carrigan" , "A.J. Taylor" , "Derrion {\tt Grim"} ,
              "Line Latu" , "Xavier Brown" , "Dante Cousart" , "Sadiq Palmer" ,
              "Diondre Overton" , "Kaleb Fossum" , "Joey Fields" , "James Brunson" ,
              "Demari Simpkins" , "Jair Hawkins-Anderson" , "Courtney Lark" ,
              "Tabari Hines" , "Isaiah Wright" , "Seth Dawkins" , "Ryan Newsome" ,
              "Tyler Byrd" , "Keenen Johnson" , "Alex Mussat" , "Rashad Medaris" , "OJ Clark" ,
              "Trenard Davis" , "Jordan McCray" , "Prince Taylor" , "Aaron Mathews" ,
              "Kavious Price" , "Cedric Peterson" ,
              "T'Qele Holmes" , "Maurice Alexander" , "Luke Mayock" , "Ky'Jon Tyler" ,
              "Isiah Upton" , "Izaiah Lottie" , "Ty Lee" , "Isaiah Zuber" ,
              "Blaze Moorhead" , "Mason Hays" , "A.D. Miller" , "Ahmad Wagner" ,
              "Chris Platt" , "Quin Jernighan" , "Darren Woods Jr." , "Kyle Williams" , "Caleb Reams" , "Jordan Duncan" , "OJ Davis" , "Jonathan Nance" ,
              "Andre Bodden" , "Darveon Brown" , "Darrell Brown" , "Tyler Simmons" ,
              "Josh Anderson" , "John Humphrey" , "Thomas Vieira" , "Kevin Purlett" , "Anu Somoye" , "Tavaris Harrison" , "Devante Peete" , "Kendrick Rogers" ,
              "Will Hastings" , "Drew Dan" , "Malik Dunner" , "Larry Collins Jr." ,
              "Christian Hayes" , "Simino Walden" , "Thomas Jackson" ,
              "Hasaan Patterson" , "Jay Jay Wilson" , "Steven Claude" , "Spencer Tears" ,
              "Stephen Sullivan", "Kjetil Cline", "Dominic Christian",
              "RB Marlow III" , "Tre'Veon Hamilton" , "Keith Gavin" , "Myron Gailliard" ,
              "Eddie Daugherty", "Colby Ransom", "Andre Baccellia", "Nick Szpor", "Neil McLaurin", "Keishawn Watson", "Devon Jackson", "TreVontae Hights",
              "Malik Tyson", "Akilian Butler", "Marques Jones", "Tavin Richardson",
              "Terry Mark" , "Ben Glines" , "Javonte Woodard" , "Mike Williams" ,
              "Justice Shelton-Mosley", "DeAndre McNeal", "Brendan O'Leary-Orange",
              "Chavis Dawkins" , "Brandon Sowards" , "Kanawai Noa" , "Sal Cannella" ,
              "Thomas Geddis" , "John Okwoli" , "Dejon Brissett" , "Sean Riley" ,
              "Jordan Wayne-Prather" , "Kavika Johnson" , "John Johnson" ,
              "Dan Chisena", "Cameron Cole", "Stanley Clerveaux", "John Burt",
              "Christian Owens" , "Darrius Scott" , "Chaz Collins" , "Shea Holebrook Jr.")
dc2020 stats2019 <- stats 2019 %>%
  filter(player %in% dc 2020 & position == "WR") %>%
  left_join(stats_2018, by = c("player", "player_id", "position"),
            suffix = c("_draft", "_pre")) |>
  rowwise() %>%
  mutate(total_yards = yards_draft + yards_pre,
         total_catch_percent = sum(c(receptions_draft + receptions_pre), na.rm=TRUE) / sum(c(targets_dr
         total_target_percent = sum(c(targets_draft + targets_pre), na.rm = TRUE) / sum(c(routes_draft + targets_pre), na.rm = true) / sum(c(routes_draft + targets_pre))
                                                                                               na.rm = TRUE),
         total_route_percent = sum(c(routes_draft + routes_pre), na.rm = TRUE) / sum(c(pass_plays_draft
```

```
total_drop_percent = sum(c(drops_draft+drops_pre), na.rm = TRUE) / sum(c(targets_draft+targets
         total_yprr = yprr_draft + yprr_pre,
         total_first_downs = sum(c(first_downs_draft+first_downs_pre), na.rm = TRUE),
         total_yards_per_reception = sum(c(yards_per_reception_draft+yards_per_reception_pre), na.rm = '
         total_yards_after_catch_per_reception = sum(c(yards_after_catch_per_reception_draft+
                                                       yards_after_catch_per_reception_pre), na.rm = TR
         total_player_game_count = sum(c(player_game_count_draft+player_game_count_pre), na.rm = TRUE),
         total_touchdowns = sum(c(touchdowns_draft+touchdowns_pre), na.rm = TRUE),
         total_yards_per_game = ((sum(c(yards_draft,yards_pre), na.rm = TRUE)) / total_player_game_coun
         total_yards_after_catch_per_game = ((sum(c(yards_after_catch_draft+ yards_after_catch_pre), na
                                               total_player_game_count),
         total_targets_per_game = ((sum(c(targets_draft+targets_pre), na.rm = TRUE)) / total_player_gam
         total_targeted_qb_rating = sum(c(targeted_qb_rating_draft+targeted_qb_rating_pre), na.rm = TRU
         games_draft = (player_game_count_draft / sum(c(player_game_count_draft+ player_game_count_pre)
         grades_hands_drop = sum(c((games_draft*grades_hands_drop_draft),((1-games_draft)*grades_hands_
                                 na.rm = TRUE),
         grades_hands_fumble = sum(c((games_draft*grades_hands_fumble_draft)+((1-games_draft)*grades_hands_fumble_draft)
                                   na.rm = TRUE),
         grades_offense = sum(c((games_draft*grades_offense_draft)+((1-games_draft)*grades_offense_pre)
         grades_pass_route = sum(c((games_draft*grades_pass_route_draft)+((1-games_draft)*grades_pass_r
                                 na.rm = TRUE))
pro_2020 <- read_csv("data/2020_pro_stats.csv")</pre>
## Rows: 526 Columns: 45
## -- Column specification ---
## Delimiter: ","
## chr (3): player, position, team_name
## dbl (42): player_id, player_game_count, avg_depth_of_target, avoided_tackles...
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
dc_2020_pro_stats <- pro_2020 %>%
  inner_join(pro_2021, by = c("player", "position", "player_id"), suffix = c("1yr", "2yr"))
dc_2020_stats <- inner_join(dc_2020_pro_stats, dc2020_stats2019, by = c("player_id", "player", "position
  select(-c(grades_pass_block1yr, grades_pass_block2yr)) |>
  rowwise() %>%
  mutate(total_yards = yards1yr + yards2yr,
         total_catch_percent = sum(c(receptions1yr + receptions2yr), na.rm=TRUE) / sum(c(targets1yr + t
                                                                                            na.rm = TRUE
         total_target_percent = sum(c(targets1yr + targets2yr), na.rm = TRUE) / sum(c(routes1yr + route
                                                                                         na.rm = TRUE),
         total_route_percent = sum(c(routes1yr + routes2yr), na.rm = TRUE) / sum(c(pass_plays1yr + pass
                                                                                      na.rm = TRUE),
         total_drop_percent = sum(c(drops1yr+drops2yr), na.rm = TRUE) / sum(c(targets1yr+targets2yr), n
         total_yprr = yprr1yr + yprr2yr,
         total_first_downs = sum(c(first_downs1yr+first_downs2yr), na.rm = TRUE),
         total_yards_per_reception = sum(c(yards_per_reception1yr+yards_per_reception2yr), na.rm = TRUE
         total_yards_after_catch_per_reception = sum(c(yards_after_catch_per_reception1yr+
                                                       yards_after_catch_per_reception2yr), na.rm = TRU
         total_player_game_count = sum(c(player_game_count1yr+player_game_count2yr), na.rm = TRUE),
         total_touchdowns = sum(c(touchdowns1yr+touchdowns2yr), na.rm = TRUE),
```

na.rm = TRUE),

```
total_yards_per_game = sum(c(yards1yr+yards2yr), na.rm = TRUE) / total_player_game_count,
         total_yards_after_catch_per_game = sum(c(yards_after_catch1yr + yards_after_catch2yr), na.rm =
                                                  total_player_game_count,
         total_targets_per_game = sum(c(targets1yr + targets2yr), na.rm = TRUE) / total_player_game_cou
         total_targeted_qb_rating = sum(c(targeted_qb_rating1yr+targeted_qb_rating2yr), na.rm = TRUE) /
         games2yr = (player_game_count2yr / sum(c(player_game_count2yr + player_game_count1yr), na.rm =
         grades_hands_drop = sum(c((games2yr*grades_hands_drop2yr)+((1-games2yr)*grades_hands_drop1yr))
                                   na.rm = TRUE),
         grades_hands_fumble = sum(c((games2yr*grades_hands_fumble2yr)+((1-games2yr)*grades_hands_fumble
                                     na.rm = TRUE),
         grades_offense = sum(c((games2yr*grades_offense2yr)+((1-games2yr)*grades_offense1yr)), na.rm =
         grades_pass_route = sum(c((games2yr*grades_pass_route2yr)+((1-games2yr)*grades_pass_route1yr))
                                   na.rm = TRUE))
#2018 Stats of 2019 DC
dc_2019 <- c("Andy Isabella" , "J.J. Arcega-Whiteside" , "Greg Dortch" , "Parris Campbell" ,
             "N'Keal Harry" , "Marquise Brown" , "Jakobi Meyers" , "Emanuel Hall" ,
             "Damion Willis" , "KeeSean Johnson" , "Anthony Johnson" ,
             "Kelvin Harmon" , "Preston Williams" , "Scotty Miller" , "Lil'Jordan Humphrey" ,
             "Antoine Wesley", "Gary Jennings", "Olamide Zaccheaus", "Hakeem Butler", "Papi White", "Dillon Mitchell", "Deebo Samuel", "Shawn Poindexter",
             "C.J. Worton" , "A.J. Brown" , "Travis Fulgham" , "Jovon Durante" , \mbox{\cite{thm}}
             "Floyd Allen" , "Malcolm Williams" , "Miles Boykin" , "Xavier Ubosi" ,
             "Tyre Brady" , "Nyqwan Murray" , "Sean Modster" , "Delane Hart-Johnson" ,
             "Fred Trevillion" , "Ronald Cleveland" , "Jalen Hurd" , "Stanley Morgan Jr." ,
             "DaMarkus Lodge" , "Dominique Heath" , "A.J. Richardson" , "Riley Ridley" ,
             "Jamarius Way" , "Collin Lisa" , "Andre Wilson" , "Olabisi Johnson" ,
             "Kahlil Lewis" , "Taylor Jackson" , "Reggie Turner" , "Trenton Irwin" ,
                              , "Shun Brown" , "Flynn Nagel" , "KaVontae Turpin" ,
             "Trevon Brown",
             "D.K. Metcalf" , "Marcus Simms" , "Blake Banham" , "David Sills" ,
             "Felton Davis" , "Mike Dudek" , "Cody Thompson" , "Jonathan Duhart" ,
             "Earnest Patterson" , "Hunter Renfrow" , "Ja'Deion High" , "Aaren Vaughns" ,
             "Terry McLaurin" , "Mecole Hardman" , "Greg Campbell Jr." , "Terry Godwin II" ,
             "Ventell Bryant" , "Marcus Green" , "Diontae Johnson" , "John Ursua" ,
              "TJ Rahming" , "James Gardner" , "Kailon Carter" , "Jon'Vea Johnson" ,
             "Cudjoe Young", "Penny Hart", "Ron'Quavion Tarver", "Brodrick Yancy", "Zach Abey", "Dredrick Snelson", "Deondre Douglas", "Timmy Hernandez",
             "Justin McInnis", "Jamal Custis", "Brad Stewart", "Tyron Johnson",
             "Nick Easley", "Teddy Veal", "Warren Redix", "Anthony Ratliff-Williams",
             "Michael Walker" , "Terren Encalade" , "Ryheem Malone" , "Jalen Greene" , "Andrew Smith" , "Steven Sims" , "DJ Nelson" , "Luke Timian" ,
             "Jalen Guyton", "Alex Bachman", "B.J. Farrow", "Ryan Davis",
             "Devon Spalding" , "Kwadarrius Smith" , "Thai Cottrell" , "Deric Phouthavong" ,
             "Tyre McCants" , "Juwann Winfree" , "Jahmmir Taylor" , "Dylan Collie" , \prescript{}
             "Andrew Meyer", "Jake Matkovich", "Johnnie Dixon", "Patrick Smith",
             "Raelon Singleton" , "Rafael Araujo-Lopes" , "Alex Weber" , "David Bouvier" ,
              "Tony Ellison", "Johnathan Boone", "Jaylen Smith", "Terry Wright",
             "J-Shun Harris II" , "Darius Slayton" , "Marquez McNair" , "Hergy Mayala" ,
             "Jauan Wesley" , "Sidney Davis" , "Isaac Zico" , "D.J. Brown" ,
              "Taivon Jacobs" , "Tre Hartley" , "Corey Lacanaria" , "Derek Kief" ,
              "Kelton Powell" , "Devan Stubblefield" , "Tyler Watts" , "Kerr Johnson Jr." ,
             "D'Marius Gillespie" , "Ryeshene Bronson" , "Marcus Armstrong-Brown" ,
              "Erik Brown" , "Jelani Roberts" , "Vic Wharton III" , "Darrell Langham" ,
```

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"Terry Juniel" , "Matthew Eaton" , "James Price" , "Isaiah Harper" , "Dre Massey" , "Trevion Thompson" , "Jeremiah Booker" , "Gatlin Casey" , "Raekwon James" , "Stephen Louis" , "Austin Ahrendt" , "Justin Hobbs" ,
              "Justin Walker" , "Kabion Ento" , "Griffin King" , "Royce Caldwell" ,
              "Robert Lewis" , "Drake Harris" , "Johnathan Lloyd" , "Brad Absher" ,
              "Ahkil Crumpton" , "DeSean Holmes" , "Brian Newman" , "Grant Perry" ,
              "Moe Ways" , "Sam Mays" , "Ryan Jenkins" , "Michiah Quick" , "Jamire Jordan" ,
              "Sam Harris", "Johnny Woods", "Jameson Field", "Marcel Williams",
              "Kinte Hatton" , "Dominique Maiden" , "Kyle Sweet" , "Terrell Green" ,
              "Jerrod Heard", "Jarrison Stewart", "Namani Parker", "Jeff Smith",
"Justin Holmes", "Jabril Clewis", "Kyle Buss", "Tristan Payton",
              "Patrick Reed" , "Zach Austin" , "Chris Taylor" , "Kendrick Edwards" ,
              "Trevon Lee" , "Jayson Stanley" , "Sam Craft" , "Myles Tease" , "Jesse Jackson" ,
              "Tristin Kamaka" , "Emmanuel Harris" , "Trey Ellis" , "Kyle Groeneweg" , "De'Quan Bowman" , "Jarrett Burgess" , "Keyan Williams" , "Kendal Keys" ,
              "Christian Pabico" , "Mykel Traylor-Bennett" , "Quinetin Jackson" ,
              "Tavonn Salter" , "Zaquon Tyson" , "Justin Sawmiller" , "Jacoby Herring" ,
              "Jaelan Austin", "Justin Allen", "Dorian Baker", "DeAndre Thompkins",
              "Bryan Reimers" , "Jay MacIntyre" , "Jahrvis Davenport" , "Jared Cornelius" ,
              "Nate Brown", "Devin Reece", "Zach Reuter", "Dakota Torres",
              "George Rushing", "Tyraiq Beals", "Larry Stephens", "Cam Stewart",
              "Ryan Schadler" , "Rafael Hidalgo" , "William Crest Jr." , "Brandon Mitchell" ,
              "Lemar Harris")
dc2019_stats2018 <- stats_2018 %>%
  filter(player %in% dc_2019 & position == "WR") %>%
  left_join(stats_2017, by = c("player", "player_id", "position"),
             suffix = c("_draft", "_pre")) |>
  rowwise() %>%
  mutate(total_yards = yards_draft + yards_pre,
          total_catch_percent = sum(c(receptions_draft + receptions_pre), na.rm=TRUE) / sum(c(targets_dr
                                                                                                     na.rm = TRUE
          total_target_percent = sum(c(targets_draft + targets_pre), na.rm = TRUE) / sum(c(routes draft + targets_pre), na.rm = true) / sum(c(routes draft + targets_pre))
                                                                                                  na.rm = TRUE),
          total_route_percent = sum(c(routes_draft + routes_pre), na.rm = TRUE) / sum(c(pass_plays_draft
                                                                                              na.rm = TRUE),
          total_drop_percent = sum(c(drops_draft+drops_pre), na.rm = TRUE) / sum(c(targets_draft+targets
          total_yprr = yprr_draft + yprr_pre,
          total_first_downs = sum(c(first_downs_draft+first_downs_pre), na.rm = TRUE),
          total_yards_per_reception = sum(c(yards_per_reception_draft+yards_per_reception_pre), na.rm = '
          total_yards_after_catch_per_reception = sum(c(yards_after_catch_per_reception_draft+
                                                             yards_after_catch_per_reception_pre), na.rm = TR
          total_player_game_count = sum(c(player_game_count_draft+player_game_count_pre), na.rm = TRUE),
          total_touchdowns = sum(c(touchdowns_draft+touchdowns_pre), na.rm = TRUE),
          total_yards_per_game = ((sum(c(yards_draft,yards_pre), na.rm = TRUE)) / total_player_game_coun
          total_yards_after_catch_per_game = ((sum(c(yards_after_catch_draft+ yards_after_catch_pre), na
                                                    total_player_game_count),
          total_targets_per_game = ((sum(c(targets_draft+targets_pre), na.rm = TRUE)) / total_player_gam
          total_targeted_qb_rating = sum(c(targeted_qb_rating_draft+targeted_qb_rating_pre), na.rm = TRU
          games_draft = (player_game_count_draft / sum(c(player_game_count_draft+ player_game_count_pre)
          grades_hands_drop = sum(c((games_draft*grades_hands_drop_draft),((1-games_draft)*grades_hands_
                                    na.rm = TRUE),
          grades_hands_fumble = sum(c((games_draft*grades_hands_fumble_draft)+((1-games_draft)*grades_hands_fumble_draft)
```

```
na.rm = TRUE),
         grades_offense = sum(c((games_draft*grades_offense_draft)+((1-games_draft)*grades_offense_pre)
         grades_pass_route = sum(c((games_draft*grades_pass_route_draft)+((1-games_draft)*grades_pass_r
                                 na.rm = TRUE)
pro_2019 <- read_csv("data/2019_pro_stats.csv")</pre>
## Rows: 509 Columns: 45
## -- Column specification -
## Delimiter: ","
## chr (3): player, position, team_name
## dbl (42): player_id, player_game_count, avg_depth_of_target, avoided_tackles...
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
dc_2019_pro_stats <- pro_2019 %>%
  inner_join(pro_2020, by = c("player", "position", "player_id"), suffix = c("1yr", "2yr"))
dc_2019_stats <- inner_join(dc_2019_pro_stats, dc2019_stats2018, by = c("player_id", "player", "position")
  select(-c(grades_pass_block1yr, grades_pass_block2yr)) |>
  rowwise() %>%
  mutate(total yards = yards1yr + yards2yr,
         total_catch_percent = sum(c(receptions1yr + receptions2yr), na.rm=TRUE) / sum(c(targets1yr + t
         total_target_percent = sum(c(targets1yr + targets2yr), na.rm = TRUE) / sum(c(routes1yr + route
                                                                                         na.rm = TRUE),
         total_route_percent = sum(c(routes1yr + routes2yr), na.rm = TRUE) / sum(c(pass_plays1yr + pass
                                                                                      na.rm = TRUE),
         total_drop_percent = sum(c(drops1yr+drops2yr), na.rm = TRUE) / sum(c(targets1yr+targets2yr), n
         total_yprr = yprr1yr + yprr2yr,
         total_first_downs = sum(c(first_downs1yr+first_downs2yr), na.rm = TRUE),
         total_yards_per_reception = sum(c(yards_per_reception1yr+yards_per_reception2yr), na.rm = TRUE
         total_yards_after_catch_per_reception = sum(c(yards_after_catch_per_reception1yr+
                                                       yards_after_catch_per_reception2yr), na.rm = TRU
         total_player_game_count = sum(c(player_game_count1yr+player_game_count2yr), na.rm = TRUE),
         total_touchdowns = sum(c(touchdowns1yr+touchdowns2yr), na.rm = TRUE),
         total_yards_per_game = sum(c(yards1yr+yards2yr), na.rm = TRUE) / total_player_game_count,
         total_yards_after_catch_per_game = sum(c(yards_after_catch1yr + yards_after_catch2yr), na.rm =
                                               total_player_game_count,
         total_targets_per_game = sum(c(targets1yr + targets2yr), na.rm = TRUE) / total_player_game_cou
         total_targeted_qb_rating = sum(c(targeted_qb_rating1yr+targeted_qb_rating2yr), na.rm = TRUE) /
         games2yr = (player_game_count2yr / sum(c(player_game_count2yr + player_game_count1yr), na.rm =
         grades_hands_drop = sum(c((games2yr*grades_hands_drop2yr)+((1-games2yr)*grades_hands_drop1yr))
                                 na.rm = TRUE),
         grades_hands_fumble = sum(c((games2yr*grades_hands_fumble2yr)+((1-games2yr)*grades_hands_fumble
                                   na.rm = TRUE),
         grades_offense = sum(c((games2yr*grades_offense2yr)+((1-games2yr)*grades_offense1yr)), na.rm =
         grades_pass_route = sum(c((games2yr*grades_pass_route2yr)+((1-games2yr)*grades_pass_route1yr))
                                 na.rm = TRUE))
#2017 Stats of 2018 DC
dc_2018 <- c("Michael Gallup" , "Trey Quinn" , "Cedrick Wilson" , "Anthony Miller" ,
             "Marcell Ateman" , "Thomas Owens" , "James Washington" , "Cam Phillips" ,
```

```
"Ricky Jeune", "Darren Carrington II", "D.J. Moore", "Linell Bonner", "Keith Kirkwood", "Alfonso Onunwor", "Tre'Quan Smith", "Teo Redding", "Kylen Towner", "Dante Pettis", "Ike Lewis", "D.J. Chark Jr.",
               "Korey Robertson" , "Allen Lazard" , "J'Mon Moore" , "Calvin Ridley" ,
               "Christian Kirk" , "Steve Ishmael" , "DaeSean Hamilton" , "Jeff Badet" ,
              "Tyler Carmona" , "Kalib Woods" , "Javon Wims" , "Courtland Sutton" ,
              "Trent Sherfield", "Davon Grayson", "Sergio Bailey II", "Tyrell Johnson",
               "Jaleel Scott" , "Armanti Foreman" , "Auden Tate" , "Steven Mitchell Jr." ,
               "Steven Dunbar Jr." , "Ermon Lane" , "Tavares Martin Jr." , "Cam Echols-Luper" ,
               "Deon Cain" , "Darren Andrews" , "Austin Proehl" , "Nacarius Fant" ,
              "Trever Ryen" , "Turner Smiley" , "De'Mornay Pierson-El" , "Dylan Cantrell" ,
               "Brandon Powell" , "Elijah King" , "Braxton Berrios" , "Charlie Callinan" ,
              "Antoine Porter" , "Kerry Thomas Jr." , "Sa'Mory Collier" , "Devonte Boyd" , "Mark Chapman" , "Christian Booker" , "Marquez Valdes-Scantling" ,
               "Equanimeous St. Brown" , "Zy Letman" , "Bryce Bobo" , "Chad Beebe" ,
               "Jacob Sannon" , "Anthony Mahoungou" , "Wyatt Demps" , "Detrich Clark" , "Trey Smith" , "Justin Motlow" , "Russell Gage" , "Jerrid Marhefka" ,
              "Brendan Cope", "Garrett Johnson", "JaQuay Savage", "Ka'Raun White",
               "Ervin Philips" , "Workpeh Kofa" , "Jacob Martinez" , "Damion Ratley" ,
               "Tyler Jaynes" , "Corey Willis" , "Richie James Jr." , "Desmon White" ,
              "Jimmy Williams", "Jordan Veasy", "Simmie Cobbs", "Josh Stewart",
"Janarion Grant", "John Diarse", "Emanuel Thompson", "Jermaine Adams",
               "Andre Levrone", "Pete Norris", "Julian Williams", "Adonis Jennings",
              "Chris Murray", "Charles Nelson", "Phil Mayhue", "Sean Avant", "Jojo Robinson", "Jared Murphy", "Da'Mari Scott", "Chris Davis Jr.",
               "Javonte Bagley" , "Tevaris McCormick" , "Tra'Von Chapman" , "A.J. Coney"
               "Jester Weah" , "Alejandro Marenco III" , "C.J. Duncan" , "Charles Walker" ,
               "Austin Wolf" , "John Leday" , "Tyler Batson" , "Devin Gray" ,
               "Byron Pringle" , "Taj Williams" , "Gabe Myles" , "Allenzae Staggers" ,
              "Liam Allen" , "Chris Lacy" , "Kamathi Holsey" , "Jordan Hogue" ,
               "Josh Aganon" , "Blake Bone" , "Conner Cramer" , "Ellis Jefferson" , "James Clark" , "Will Reger" , "Quay Johnson" , "Lance Wright" ,
               "Marques Little" , "Jeff George" , "Ray-Ray McCloud III" , "Malik Turner"
               "John Johnson" , "Jordan Cunningham" , "Jordan Villamin" , "Dorian Leonard" ,
               "Kayaune Ross", "Shay Fields", "Fransohn Bickley", "Derek McLemore",
               "Chris Montgomery", "Glenn Smith", "Reuben Mwehla", "Hyleck Foster",
               "Cam Sims", "Dijon Paschal", "Cameron Batson", "Temi Alaka",
               "Ammon Barker" , "Doni Dowling" , "Braelon Roberts" , "Quest Truxton" ,
               "Johnnie Niupalau" , "Marchie Murdock" , "John Franklin III" ,
              "Mark Quattlebaum" , "Jumichael Ramos" , "Saeed Blacknall" , "Caleb Scott" ,
              "Jeff Ejekam" , "Derrick Willies" , "Sam Martin" , "Cody Hodgens" ,
               "Kyle Fulks" , "Uriah LeMay" , "Trent Bostick" , "Jordan Smallwood" ,
               "Jonah Trinnaman" , "KE'Marvin Pitts" , "Dominic Collins" ,
               "Quadree Henderson" , "Cam Denson" , "Chase Whitehead" , "Ty Slanina" ,
              "Donald Gray" , "Gregory Phillips" , "Dannon Cavil" , "CJ \operatorname{Dimry} ,
               "Matt VandeBerg" , "Jack Swinney" , "Isaiah Bernard" , "Bobby Mitchell" , "Parker Smith" , "Ben Olinger" , "Dalton Ponchillia" , "Alex Byers" ,
               "Kamrin Solomon", "Brandon Mitchell", "Brandon Colon")
"Dante Jones" , "Tristan Davis" , "Devin Ross" , "Donovan Walker" ,
```

"Keke Coutee" , "Mikah Holder" , "Deontay Burnett" , "Jordan Lasley" ,

```
"Xavier Hawkins" , "Jamarl Eiland" , "Clark Quisenberry" ,
               "Marcus Gaines" , "Tucker Melcher" , "Roderick Proctor" , "Markell Pack",
               "Eric Cooper" , "Eric Luna" , "Quay Chambers" , "Darryl Richards" ,
               "Anthony Young" , "Keelan Ewaliko" , "Alex Van Dyke" , "Cameron Smith" ,
               "Gregory Hogan" , "T.L. Ford II" , "Damon Mitchell" , "Trevor Steinke" ,
               "Nigel Carter" , "Gabe Rahn" , "Christian Blake" , "Ricky Rogers" ,
               "Kevin Gladney", "Jaren Colston-Green", "Myles Campbell",
               "Gary Bradshaw" , "Emanuel Porter" , "Lorenzo Joe" , "Josh Smith" ,
               "Thadd Smith", "DeJuawn Oliver", "Kris White", "Craig Scott",
               "Jared Jackson", "Todd Boyd", "Gavin Locklear", "Freddy Canteen",
"Isaiah Jones", "Devin Scott", "Eric Carter", "Nate Terry",
               "Robert Foster" , "Henry Bussey III" , "Jazz Peavy" , "Kendrick Dorn" ,
               "Shelby Walker" , "Jacquille Veii")
dc2018_stats2017 <- stats_2017 %>%
  filter(player %in% dc_2018 | player %in% dc_2018_2 & position == "WR") %>%
  left_join(stats_2016, by = c("player", "player_id", "position"),
            suffix = c("_draft", "_pre")) |>
  rowwise() %>%
  mutate(total_yards = yards_draft + yards_pre,
         total_catch_percent = sum(c(receptions_draft + receptions_pre), na.rm=TRUE) / sum(c(targets_dr
                                                                                             na.rm = TRUE
         total_target_percent = sum(c(targets_draft + targets_pre), na.rm = TRUE) / sum(c(routes_draft +
                                                                                          na.rm = TRUE),
         total_route_percent = sum(c(routes_draft + routes_pre), na.rm = TRUE) / sum(c(pass_plays_draft
                                                                                       na.rm = TRUE),
         total_drop_percent = sum(c(drops_draft+drops_pre), na.rm = TRUE) / sum(c(targets_draft+targets
         total_yprr = yprr_draft + yprr_pre,
         total_first_downs = sum(c(first_downs_draft+first_downs_pre), na.rm = TRUE),
         total_yards_per_reception = sum(c(yards_per_reception_draft+yards_per_reception_pre), na.rm = '
         total_yards_after_catch_per_reception = sum(c(yards_after_catch_per_reception_draft+
                                                        yards_after_catch_per_reception_pre), na.rm = TR
         total_player_game_count = sum(c(player_game_count_draft+player_game_count_pre), na.rm = TRUE),
         total_touchdowns = sum(c(touchdowns_draft+touchdowns_pre), na.rm = TRUE),
         total_yards_per_game = ((sum(c(yards_draft,yards_pre), na.rm = TRUE)) / total_player_game_coun
         total_yards_after_catch_per_game = ((sum(c(yards_after_catch_draft+ yards_after_catch_pre), na
                                                total_player_game_count),
         total_targets_per_game = ((sum(c(targets_draft+targets_pre), na.rm = TRUE)) / total_player_gam
         total_targeted_qb_rating = sum(c(targeted_qb_rating_draft+targeted_qb_rating_pre), na.rm = TRU
         games_draft = (player_game_count_draft / sum(c(player_game_count_draft+ player_game_count_pre)
         grades_hands_drop = sum(c((games_draft*grades_hands_drop_draft),((1-games_draft)*grades_hands_
                                  na.rm = TRUE),
         grades_hands_fumble = sum(c((games_draft*grades_hands_fumble_draft)+((1-games_draft)*grades_hands_fumble_draft)
                                    na.rm = TRUE),
         grades_offense = sum(c((games_draft*grades_offense_draft)+((1-games_draft)*grades_offense_pre)
         grades_pass_route = sum(c((games_draft*grades_pass_route_draft)+((1-games_draft)*grades_pass_r
                                  na.rm = TRUE))
pro_2018 <- read_csv("data/2018_pro_stats.csv")</pre>
## Rows: 514 Columns: 45
## -- Column specification -----
## Delimiter: ","
```

```
## chr (3): player, position, team_name
## dbl (42): player_id, player_game_count, avg_depth_of_target, avoided_tackles...
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
dc_2018_pro_stats <- pro_2018 %>%
  inner_join(pro_2019, by = c("player", "position", "player_id"), suffix = c("1yr", "2yr"))
dc_2018_stats <- inner_join(dc_2018_pro_stats, dc2018_stats2017, by = c("player_id", "player", "position
  select(-c(grades_pass_block1yr, grades_pass_block2yr)) |>
  rowwise() %>%
  mutate(total_yards = yards1yr + yards2yr,
         total_catch_percent = sum(c(receptions1yr + receptions2yr), na.rm=TRUE) / sum(c(targets1yr + t
                                                                                               na.rm = TRUE
         total_target_percent = sum(c(targets1yr + targets2yr), na.rm = TRUE) / sum(c(routes1yr + route
                                                                                            na.rm = TRUE),
         total_route_percent = sum(c(routes1yr + routes2yr), na.rm = TRUE) / sum(c(pass_plays1yr + pass
                                                                                        na.rm = TRUE),
         total_drop_percent = sum(c(drops1yr+drops2yr), na.rm = TRUE) / sum(c(targets1yr+targets2yr), n
         total_yprr = yprr1yr + yprr2yr,
         total_first_downs = sum(c(first_downs1yr+first_downs2yr), na.rm = TRUE),
         total_yards_per_reception = sum(c(yards_per_reception1yr+yards_per_reception2yr), na.rm = TRUE
         total_yards_after_catch_per_reception = sum(c(yards_after_catch_per_reception1yr+
                                                         yards_after_catch_per_reception2yr), na.rm = TRU
         total_player_game_count = sum(c(player_game_count1yr+player_game_count2yr), na.rm = TRUE),
         total_touchdowns = sum(c(touchdowns1yr+touchdowns2yr), na.rm = TRUE),
         total_yards_per_game = sum(c(yards1yr+yards2yr), na.rm = TRUE) / total_player_game_count,
         total_yards_after_catch_per_game = sum(c(yards_after_catch1yr + yards_after_catch2yr), na.rm =
                                                 total_player_game_count,
         total_targets_per_game = sum(c(targets1yr + targets2yr), na.rm = TRUE) / total_player_game_cou
         total_targeted_qb_rating = sum(c(targeted_qb_rating1yr+targeted_qb_rating2yr), na.rm = TRUE) /
         games2yr = (player_game_count2yr / sum(c(player_game_count2yr + player_game_count1yr), na.rm =
         grades_hands_drop = sum(c((games2yr*grades_hands_drop2yr)+((1-games2yr)*grades_hands_drop1yr))
                                  na.rm = TRUE),
         grades_hands_fumble = sum(c((games2yr*grades_hands_fumble2yr)+((1-games2yr)*grades_hands_fumble
                                    na.rm = TRUE),
         grades_offense = sum(c((games2yr*grades_offense2yr)+((1-games2yr)*grades_offense1yr)), na.rm =
         grades_pass_route = sum(c((games2yr*grades_pass_route2yr)+((1-games2yr)*grades_pass_route1yr))
                                  na.rm = TRUE))
#2016 Stats of 2017 DC
dc_2017 <- c("Jalen Rowell", "Austin Carr", "Dede Westbrook", "Mike Williams",
             "Zay Jones", "Carlos Henderson", "Corey Davis", "Taywan Taylor",
             "Jamir Tillman" , "Tanner Gentry" , "Trent Taylor" , "John Ross" ,
             "Chad Hansen" , "Kenny Golladay" , "Jordan Westerkamp" ,
             "Nicholas Norris" , "Jordan Frysinger" , "Drew Wolitarsky" ,
             "Josh Reynolds" , "Thomas Sperbeck" , "Eugene Lewis" , "Daikiel Shorts" , "Ryan Switzer" , "Noel Thomas" , "Isaiah Ford" ,
             "Isaiah McKenzie" , "Malachi Dupre" , "Keon Hatcher" , "Edgar Poe" ,
             "Zach Pascal", "Amba Etta-Tawo", "BJ Johnson III", "Amara Darboh", "R.J. Shelton", "Marcus Kemp", "KeVonn Mabon", "Drew Morgan",
             "Josh Atkinson", "Al-Damion Riles", "Tim Patrick", "Chris Godwin",
             "Sebastian Smith" , "K.D. Cannon" , "Josh Malone" , "Ricky Jones" ,
             "Fred Ross" , "Keevan Lucas" , "Tim Crawley" , "Noah Brown" ,
             "River Cracraft" , "Jerome Lane" , "ArDarius Stewart" , "Shelton Gibson" ,
```

```
"Zach Yousey", "Robert Davis", "JuJu Smith-Schuster", "Garrett Juergens",
              "Dameon Gamblin" , "Rodney Adams" , "Josh Magee" , "Stacy Coley" , "Callen Hightower", "Bug Howard" , "Brandon Reilly" , "Tim White" ,
             "Dontre Wilson", "Hasaan Henderson", "Marcus McGill", "Austin Duke",
              "Bobo Wilson" , "Darreus Rogers" , "Torii Hunter Jr." , "Travis Rudolph",
              "Kendall Sanders" , "Jacorey Warrick" , "Tony Stevens" , "Austin Hays",
              "Chance Allen" , "JoJo Natson" , "Cole Freytag" , "Gabe Marks" ,
              "Jhajuan Seales", "Corey Jones", "DeAndre Lane", "Mitchell Paige",
              "Cory Butler-Byrd", "Michael Henry", "D.J. Thompson", "Carrington Thompson",
             "Travin Dural", "JaBryce Taylor", "Damore'ea Stringfellow",
"Artavis Scott", "Montay Crockett", "Nate Cole", "Jordan Reid",
              "Jared Johnson" , "Nate Phillips" , "Jalen Williams" , "Dwayne Stanford" ,
              "Alonzo Moore" , "Kermit Whitfield" , "Chris Black" , "Devin Lauderdale" ,
              "Ahmad Fulwood" , "Temuchin Hodges" , "Teldrick Morgan" , "Michael Clark" ,
              "Dan Jonah" , "Mack Hollins" , "Robert Wheelwright" , "Riley McCarron" ,
              "Jared Mapps" , "Ishmael Adams" , "Jehu Chesson" , "Josh Knight" ,
              "Colby Pearson", "Cody Hollister", "Nick Kurtz", "Ajalen Holley",
              "DeAngelo Yancey" , "Frederick Gammage" , "Demetrius Frazier")
dc_2017_2 <- c("Larry Dace III", "Stephon Brown", "Anthony Nash", "Jake Maulhardt",
                "Andrew Scanlan", "Ishmael Zamora", "D'Vario Montgomery", "Domonique Young",
                "Shug Oyegunle", "Aaron Peck", "Deon-Tay McManus", "Cywettnie Brown",
                "Levern Jacobs" , "Jamari Staples" , "Ryan Timmons" , "Robert Ruiz" ,
                "Eric Judge", "Michael Rector", "James Quick", "Alvin Cornelius",
                "Marquise Ricard" , "Dominique Reed" , "Bernard Davis" , "Bug Rivera" ,
                "Malcolm Lewis", "Dontez Ford", "Deante Burton", "Cameron Decell",
                "Mitchell Juergens", "Tyler Cooperwood", "De'Quan Hampton",
                "Drew Bishop", "Justin Hunt", "Speedy Noil", "Rokeem Williams",
                "Andre Patton", "Ernest Calhoun", "Aregeros Turner", "Kevin Davis",
                "Willie Robinson" , "Monty Madaris" , "Zach Wright" , "Charles Chandler" ,
                "Jesse Kroll" , "Thaddeous Thompson" , "Chris Lewis" , "Taylor Oldham" ,
                "Trey Griffey", "Brisly Estime", "Bra'Lon Cherry", "Keeon Johnson",
                "Francis Owusu", "Quincy Adeboyejo", "Victor Bolden Jr.", "Andrew Rodriguez",
                "Bilal Marshall" , "Ronnie Moore" , "Tony Thomas" , "Ethan Cortazzo",
                "Tyrian Taylor", "Zach Grant", "Kendrick Mathis", "Shawn Brickley",
                "Jeremy Tabuyo" , "Curtis Anderson III" , "Jarvis Baxter" , "Jarell Aaron" ,
                "Patrick Worstell" , "Darian Williams" , "Ricky Seals-Jones" ,
                "Ryan Smith" , "Boone Niederhofer" , "Justin Hardee" ,
                "Kevin Kutchera", "Cameron Posey", "Corey Smith", "Kenneth Walker III", "Tre' Perrier", "Dondre Daley", "Jaquan White", "Austin Moses", "Chaz Anderson", "Kenny Buyers", "Isaac Whitney", "Reggie Davis"
                , "Grant Newell" , "Tyre'oune Holmes" , "Daniel Hurd" , "Deante Gray"
                , "Reginald Davis III" , "Samajie Grant" , "Dennis Andrews" , "Alex Mut"
                , "Austin Stewart" , "Kennedy Williams" , "Sterling Stowers" ,
                "Aaron Hepp" , "Jerico Richardson" , "Taijuan Thomas" , "Lynx Hawthorne" \,
                , "Fred Nixon" , "Rod Ducksworth" , "Hayden Jones" , "Tyrone Williams"
                 "Keigan Williams" , "Brandon Bishop" , "Carlton Agudosi" ,
                "Shakiem Barbel", "Gio Pascascio", "Gehrig Dieter", "Chris Thompson", "Edward Pope", "Latevius Rayford", "Malcolm Robinson",
                "Michael Martens", "Devon Breaux", "Devonte Mathis", "John Thompson",
                "Anthony Rice", "Clayton Glasper", "D.J. Taylor", "Malcolm Culmer",
                "Sam Shisso", "Marcus Davis", "Eric Laurent", "Jeffrey Coprich",
                "Brian Lemelle", "Conner Smith", "Darrion Pollard")
```

```
dc2017_stats2016 <- stats_2016 %>%
  filter(player %in% dc_2017 | player %in% dc_2017_2 & position == "WR") %>%
  left_join(stats_2015, by = c("player", "player_id", "position"),
            suffix = c("_draft", "_pre")) |>
  rowwise() %>%
  mutate(total_yards = yards_draft + yards_pre,
         total_catch_percent = sum(c(receptions_draft + receptions_pre), na.rm=TRUE) / sum(c(targets_dr
                                                                                            na.rm = TRUE
         total_target_percent = sum(c(targets_draft + targets_pre), na.rm = TRUE) / sum(c(routes_draft +
                                                                                         na.rm = TRUE),
         total_route_percent = sum(c(routes_draft + routes_pre), na.rm = TRUE) / sum(c(pass_plays_draft
                                                                                      na.rm = TRUE),
         total_drop_percent = sum(c(drops_draft+drops_pre), na.rm = TRUE) / sum(c(targets_draft+targets
         total_yprr = yprr_draft + yprr_pre,
         total_first_downs = sum(c(first_downs_draft+first_downs_pre), na.rm = TRUE),
         total_yards_per_reception = sum(c(yards_per_reception_draft+yards_per_reception_pre), na.rm = '
         total_yards_after_catch_per_reception = sum(c(yards_after_catch_per_reception_draft+
                                                        yards_after_catch_per_reception_pre), na.rm = TR
         total_player_game_count = sum(c(player_game_count_draft+player_game_count_pre), na.rm = TRUE),
         total_touchdowns = sum(c(touchdowns_draft+touchdowns_pre), na.rm = TRUE),
         total_yards_per_game = ((sum(c(yards_draft,yards_pre), na.rm = TRUE)) / total_player_game_coun
         total_yards_after_catch_per_game = ((sum(c(yards_after_catch_draft+ yards_after_catch_pre), na
                                               total_player_game_count),
         total_targets_per_game = ((sum(c(targets_draft+targets_pre), na.rm = TRUE)) / total_player_gam
         total_targeted_qb_rating = sum(c(targeted_qb_rating_draft+targeted_qb_rating_pre), na.rm = TRU
         games_draft = (player_game_count_draft / sum(c(player_game_count_draft+ player_game_count_pre)
         grades_hands_drop = sum(c((games_draft*grades_hands_drop_draft),((1-games_draft)*grades_hands_
                                 na.rm = TRUE),
         grades_hands_fumble = sum(c((games_draft*grades_hands_fumble_draft)+((1-games_draft)*grades_hands_fumble_draft)
                                   na.rm = TRUE),
         grades_offense = sum(c((games_draft*grades_offense_draft)+((1-games_draft)*grades_offense_pre)
         grades_pass_route = sum(c((games_draft*grades_pass_route_draft)+((1-games_draft)*grades_pass_r
                                 na.rm = TRUE)
pro_2017 <- read_csv("data/2017_pro_stats.csv")</pre>
## Rows: 481 Columns: 45
## -- Column specification ---
## Delimiter: ","
## chr (3): player, position, team_name
## dbl (42): player_id, player_game_count, avg_depth_of_target, avoided_tackles...
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
dc_2017_pro_stats <- pro_2017 %>%
  inner_join(pro_2018, by = c("player", "position", "player_id"), suffix = c("1yr", "2yr"))
dc_2017_stats <- inner_join(dc_2017_pro_stats, dc2017_stats2016, by = c("player_id", "player", "position
  select(-c(grades_pass_block1yr, grades_pass_block2yr)) |>
  rowwise() %>%
  mutate(total_yards = yards1yr + yards2yr,
         total_catch_percent = sum(c(receptions1yr + receptions2yr), na.rm=TRUE) / sum(c(targets1yr + t
```

```
na.rm = TRUE
         total_target_percent = sum(c(targets1yr + targets2yr), na.rm = TRUE) / sum(c(routes1yr + route
                                                                                        na.rm = TRUE),
         total_route_percent = sum(c(routes1yr + routes2yr), na.rm = TRUE) / sum(c(pass_plays1yr + pass
                                                                                     na.rm = TRUE),
         total_drop_percent = sum(c(drops1yr+drops2yr), na.rm = TRUE) / sum(c(targets1yr+targets2yr), n
         total_yprr = yprr1yr + yprr2yr,
         total first downs = sum(c(first downs1yr+first downs2yr), na.rm = TRUE),
         total_yards_per_reception = sum(c(yards_per_reception1yr+yards_per_reception2yr), na.rm = TRUE
         total_yards_after_catch_per_reception = sum(c(yards_after_catch_per_reception1yr+
                                                       yards_after_catch_per_reception2yr), na.rm = TRU
         total_player_game_count = sum(c(player_game_count1yr+player_game_count2yr), na.rm = TRUE),
         total_touchdowns = sum(c(touchdowns1yr+touchdowns2yr), na.rm = TRUE),
         total_yards_per_game = sum(c(yards1yr+yards2yr), na.rm = TRUE) / total_player_game_count,
         total_yards_after_catch_per_game = sum(c(yards_after_catch1yr + yards_after_catch2yr), na.rm =
                                               total_player_game_count,
         total_targets_per_game = sum(c(targets1yr + targets2yr), na.rm = TRUE) / total_player_game_cou
         total_targeted_qb_rating = sum(c(targeted_qb_rating1yr+targeted_qb_rating2yr), na.rm = TRUE) /
         games2yr = (player_game_count2yr / sum(c(player_game_count2yr + player_game_count1yr), na.rm =
         grades_hands_drop = sum(c((games2yr*grades_hands_drop2yr)+((1-games2yr)*grades_hands_drop1yr))
                                 na.rm = TRUE),
         grades_hands_fumble = sum(c((games2yr*grades_hands_fumble2yr)+((1-games2yr)*grades_hands_fumble
                                   na.rm = TRUE),
         grades_offense = sum(c((games2yr*grades_offense2yr)+((1-games2yr)*grades_offense1yr)), na.rm =
         grades pass route = sum(c((games2yr*grades pass route2yr)+((1-games2yr)*grades pass route1yr))
                                 na.rm = TRUE))
#2015 Stats of 2016 DC
dc_2016 <- c("Josh Doctson", "Rashard Higgins", "Daniel Braverman",
             "Sterling Shepard", "Corey Coleman", "Tyler Boyd", "Garrett Brown",
             "Leonte Carroo", "Tajae Sharpe", "De'Marcus Ayers", "Malcolm Mitchell",
             "Alex Erickson", "Shaq Washington", "Jordan Payton", "Aaron Burbridge",
             "Mike Thomas", "Laquon Treadwell", "Devin Lucien", "Michael Thomas",
             "Nelson Spruce", "Pharoh Cooper", "Ricardo Louis", "Canaan Severin",
             "Keyarris Garrett", "Teddy Ruben", "Hunter Sharp", "Bralon Addison",
             "Dezmon Epps", "Quinshad Davis", "Jakeem Grant", "Andre Booker",
             "Casey Martin", "J.D. McKissic", "Jamal Robinson", "De'Runnya Wilson",
             "Rashawn Scott", "Shane Williams-Rhodes", "Jenson Stoshak",
             "Ron Willoughby", "Chris Brown", "David Glidden", "Thomas Duarte",
             "Will Fuller V", "Roger Lewis Jr.", "Imani Davis", "Jaydon Mickens",
             "Robbie Anderson", "Jared Dangerfield", "Pierre Youngblood-Ary",
             "Jordan Thompson", "Ed'Marques Batties", "Darius Powe", "K.J. Maye",
             "Kody Cook", "Johnny Jackson", "Rashon Ceaser", "Josh Grady",
             "Tres Houston", "Tevaun Smith", "Paul Turner", "Kenny Lawler",
             "Jordan Williams-Lambert", "Devon Blackmon", "Bryce Treggs",
             "Von Pearson", "Max Morrison", "Cayleb Jones", "Carlos Wiggins",
             "Brandon Sheperd", "C.J. Best", "Charone Peake", "Antwane Grant",
             "Mitch Mathews", "Chris Moore", "Trevor Davis", "Simms McElfresh",
             "Johnny Holton", "DeAndre Reaves", "Cody Core", "Alonzo Russell",
             "Donovan Harden", "Maurice Morgan", "Ben Lewis", "Jeff Greene",
             "Damien Washington", "David Mellstrom", "Kolby Listenbee",
             "Demarcus Robinson", "Braxton Miller", "Jemond Hazely", "Johnathon Johnson",
             "Malachi Jones", "Dennis Parks", "Jordan Fredrick", "Devin Fuller",
             "Mose Frazier", "Davonte Allen", "Brandon Swindall", "Terenn Houk",
```

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"Richard Mullaney", "Alex Ludowig", "T.J. Thorpe", "Macgarrett Kings Jr.",
             "Dom Williams", "Shane Mikesky", "Bubba Poole", "Danny Anthrop",
             "DeAnthony Arnett", "Herve Coby", "Kenneth Scott", "Justin Berger",
             "Quinton Pedroza", "Tommylee Lewis", "Daje Johnson", "Devon Cajuste",
             "Maurice Harris", "Chris Kearney", "Montez McGuire", "D'haquille Williams",
             "Joe Hansley", "Geronimo Allison", "Tre' Parmalee", "Jordan Bergstrom",
             "Gary Chambers", "K.J. Brent", "DeAndre Bell", "Trey Page", "Hansell Wilson",
             "Carlos Harris", "Clinton Taylor", "Thomas Wilson", "Brad Pearson",
             "Byron Marshall", "Rollins Stallworth", "D.J. Foster", "Alex Chisum",
             "Amir Carlisle", "Quenton Bundrage", "Ryan Burbrink", "Jay Lee", "Durron Neal",
             "David Richards", "Devonte Robinson", "Nathan Sassaman", "John Christopher",
             "Sanford Seay", "Mekale McKay", "Andre Davis", "Valdez Showers",
             "Marvin Shinn", "Bobo Beathard", "Max McCaffrey", "Damon Graham",
             "Jafus Gaines", "Aaron Grubb", "Marvin Hall", "Jalin Marshall",
             "Dustin Creel", "Kevin Asante", "Tevin Jones", "Roger Dixon",
             "Kyle Klein", "Christian Jones", "Andrew Pratt", "Bryan Holmes",
             "Jarvis Bentley", "Aaron Criswell", "Elgin Long", "Octavious Andrews",
             "Kishon Wilcher", "Logan Sweet", "Herb Waters", "NaQuan Brown",
             "Jamal Turner", "Brandon Oliver", "Ryan Garrey", "Ja' Juan Story",
             "Avery Sweeting", "Tony Ray Parnell", "Brandon Smith", "Jordan Bianchi",
             "Hayden Daniels", "Brandon Shippen", "Danny Woodson II", "Daniel Lilienthal",
             "Conner Floyd", "Alvonta Jenkins", "Marquez North", "P.J. Howard IV",
             "Kawmae Sawyer", "Tanner McEvoy", "Andrew Stone", "Terrell Johnson",
             "Demitri Knowles", "AJ Troup", "Stanton Weber", "Kris Strange",
             "Marken Michel", "Ryan Longoria", "Juwan Brescacin", "Tyler Scott",
             "K.D. Edenfield", "Chris Shillings", "Cody Blanc", "Melvin Ray", "Joe Morrow",
             "Connor Arlia", "Shamier Jeffery", "Marcus Johnson", "Claude Garrett",
             "Taariq Allen", "Christian Collis", "Joshua Bowen", "Wesley Leftwich",
             "Andre Sims", "KJ Myers", "Tyler Trosin", "Rayvean Moore", "Darius Joseph",
             "Miles Shuler", "Bobby Swigert", "Kurt Henderson", "Nyiakki Height",
             "Marquis Bundy", "David Dudeck", "Carlton Heard", "D.J. Vinson",
             "Garrett Kidd", "Kenny Bias", "Tyler Baker", "Kendrick Roberts", "Ian Dixon",
             "Justin Johnson")
dc_2016_2 <- c("Sabian Holmes", "Kendrick Singleton", "Cameron Dickerson",
               "Jacob Hillyer", "Kris Kentera", "Anthony Williams", "Kameron Doolittle",
               "Autrey Golden", "Christian Tober", "Derek Keaton", "Josh Boyle")
dc2016 stats2015 <- stats 2015 %>%
  filter(player %in% dc_2016 | player %in% dc_2016_2 & position == "WR") %>%
  left_join(stats_2014, by = c("player", "player_id", "position"),
            suffix = c("_draft", "_pre")) %>%
  rowwise() %>%
  mutate(total_yards = yards_draft + yards_pre,
         total_catch_percent = sum(c(receptions_draft + receptions_pre), na.rm=TRUE) / sum(c(targets_dr
                                                                                           na.rm = TRUE
         total_target_percent = sum(c(targets_draft + targets_pre), na.rm = TRUE) / sum(c(routes_draft +
                                                                                        na.rm = TRUE),
         total_route_percent = sum(c(routes_draft + routes_pre), na.rm = TRUE) / sum(c(pass_plays_draft
                                                                                     na.rm = TRUE),
         total_drop_percent = sum(c(drops_draft+drops_pre), na.rm = TRUE) / sum(c(targets_draft+targets
         total_yprr = yprr_draft + yprr_pre,
         total_first_downs = sum(c(first_downs_draft+first_downs_pre), na.rm = TRUE),
```

```
total_yards_per_reception = sum(c(yards_per_reception_draft+yards_per_reception_pre), na.rm = '
         total_yards_after_catch_per_reception = sum(c(yards_after_catch_per_reception_draft+
                                                        yards_after_catch_per_reception_pre), na.rm = TR
         total_player_game_count = sum(c(player_game_count_draft+player_game_count_pre), na.rm = TRUE),
         total_touchdowns = sum(c(touchdowns_draft+touchdowns_pre), na.rm = TRUE),
         total_yards_per_game = ((sum(c(yards_draft,yards_pre), na.rm = TRUE)) / total_player_game_coun
         total_yards_after_catch_per_game = ((sum(c(yards_after_catch_draft+ yards_after_catch_pre), na
                                               total_player_game_count),
         total_targets_per_game = ((sum(c(targets_draft+targets_pre), na.rm = TRUE)) / total_player_gam
         total_targeted_qb_rating = sum(c(targeted_qb_rating_draft+targeted_qb_rating_pre), na.rm = TRU
         games_draft = (player_game_count_draft / sum(c(player_game_count_draft+ player_game_count_pre)
         grades_hands_drop = sum(c((games_draft*grades_hands_drop_draft),((1-games_draft)*grades_hands_
                                 na.rm = TRUE),
         grades_hands_fumble = sum(c((games_draft*grades_hands_fumble_draft)+((1-games_draft)*grades_hands_fumble_draft)
                                   na.rm = TRUE),
         grades_offense = sum(c((games_draft*grades_offense_draft)+((1-games_draft)*grades_offense_pre)
         grades_pass_route = sum(c((games_draft*grades_pass_route_draft)+((1-games_draft)*grades_pass_r
                                 na.rm = TRUE))
pro_2016 <- read_csv("data/2016_pro_stats.csv")</pre>
## Rows: 490 Columns: 45
## -- Column specification --
## Delimiter: ","
## chr (3): player, position, team_name
## dbl (42): player_id, player_game_count, avg_depth_of_target, avoided_tackles...
\mbox{\tt \#\#} i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
dc_2016_pro_stats <- pro_2016 %>%
  inner_join(pro_2017, by = c("player", "position", "player_id"), suffix = c("1yr", "2yr"))
dc_2016_stats <- inner_join(dc_2016_pro_stats, dc2016_stats2015, by = c("player_id", "player", "position")
  select(-c(grades_pass_block1yr, grades_pass_block2yr)) |>
  rowwise() %>%
  mutate(total_yards = yards1yr + yards2yr,
         total_catch_percent = sum(c(receptions1yr + receptions2yr), na.rm=TRUE) / sum(c(targets1yr + t
                                                                                            na.rm = TRUE
         total_target_percent = sum(c(targets1yr + targets2yr), na.rm = TRUE) / sum(c(routes1yr + route
                                                                                         na.rm = TRUE),
         total_route_percent = sum(c(routes1yr + routes2yr), na.rm = TRUE) / sum(c(pass_plays1yr + pass
                                                                                      na.rm = TRUE),
         total_drop_percent = sum(c(drops1yr+drops2yr), na.rm = TRUE) / sum(c(targets1yr+targets2yr), n
         total_yprr = yprr1yr + yprr2yr,
         total_first_downs = sum(c(first_downs1yr+first_downs2yr), na.rm = TRUE),
         total_yards_per_reception = sum(c(yards_per_reception1yr+yards_per_reception2yr), na.rm = TRUE
         total_yards_after_catch_per_reception = sum(c(yards_after_catch_per_reception1yr+
                                                        yards_after_catch_per_reception2yr), na.rm = TRU
         total_player_game_count = sum(c(player_game_count1yr+player_game_count2yr), na.rm = TRUE),
         total_touchdowns = sum(c(touchdowns1yr+touchdowns2yr), na.rm = TRUE),
         total_yards_per_game = sum(c(yards1yr+yards2yr), na.rm = TRUE) / total_player_game_count,
         total_yards_after_catch_per_game = sum(c(yards_after_catch1yr + yards_after_catch2yr), na.rm =
                                                total_player_game_count,
```

```
total_targets_per_game = sum(c(targets1yr + targets2yr), na.rm = TRUE) / total_player_game_cou
         total_targeted_qb_rating = sum(c(targeted_qb_rating1yr+targeted_qb_rating2yr), na.rm = TRUE) /
         games2yr = (player_game_count2yr / sum(c(player_game_count2yr + player_game_count1yr), na.rm =
         grades_hands_drop = sum(c((games2yr*grades_hands_drop2yr)+((1-games2yr)*grades_hands_drop1yr))
                                 na.rm = TRUE),
         grades_hands_fumble = sum(c((games2yr*grades_hands_fumble2yr)+((1-games2yr)*grades_hands_fumble
                                   na.rm = TRUE),
         grades_offense = sum(c((games2yr*grades_offense2yr)+((1-games2yr)*grades_offense1yr)), na.rm =
         grades_pass_route = sum(c((games2yr*grades_pass_route2yr)+((1-games2yr)*grades_pass_route1yr))
                                 na.rm = TRUE)
#2014 Stats of 2015 DC
dc_2015 <- c("Amari Cooper", "Tyler Lockett", "DeVante Parker",</pre>
 "Jonathon Rumph", "Nelson Agholor", "Tony Lippett", "DeAndre Smelter",
 "Titus Davis", "Justin Hardy", "Jaelen Strong", "Darren Waller",
 "Rashad Greene Sr.", "Devin Smith", "Curry Sexton", "Kenny Bell",
 "Bud Sasser", "Tommy Shuler", "Ezell Ruffin", "Stefon Diggs",
 "Matthew Miller", "Kevin White", "Jordan Taylor", "John Harris",
 "Michael McNeely", "Joshua McCain", "Cam Worthy", "David Frazier",
 "Lucky Whitehead", "Andre Davis", "Sammie Coates", "Vince Mayle",
 "Christopher Harper", "Ty Montgomery", "Da'Ron Brown", "Antonio Vaughan",
 "Chris Conley", "Geremy Davis", "Jamison Crowder", "Darius Jennings",
 "Shane Wynn", "Jeff Trojan", "Keiwone Malone", "Jalen Claiborne",
 "Josh Harper", "Vince Sanders", "Bradley Marquez", "Lynquez Blair",
 "Breshad Perriman", "Devin Funchess", "Phillip Dorsett", "Miles Gooch",
 "Marcus Henry", "Kyle Prater", "Andrew Turzilli", "Keith Mumphery",
 "Quan Bray", "Jordan Leslie", "Rannell Hall", "Michael Bennett",
 "Shakim Phillips", "Clay Fuller", "Ronald Butler", "Devante Davis",
 "Ian Hamilton", "Jarrod West", "Isiah Myers", "Jack Rhoades",
 "Jalen Fitzpatrick", "Dominic Rufran", "Willie McNeal", "Levi Norwood",
 "Chandler Worthy", "Antwan Goodley", "Earon Holmes", "J.J. Worton",
 "Jordan Davis", "Deontay Greenberry", "DeAndrew White", "Eli Rogers",
 "Josh Reese", "Joel German", "Kentrellis Showers", "Javess Blue",
 "Malcome Kennedy", "Devin Clarke", "Demarco Robinson", "Jarred Haggins",
 "George Farmer", "E.J. Scott", "Hunter Lee", "Tyler McCulloch", "Jimmie Hunt",
 "Matt James", "Richy Turner", "Kenzee Jackson", "Devon Hughes",
 "Jameon Lewis", "Nick Jones", "Manasseh Garner", "Jamarcus Nelson",
 "Zach D'Orazio", "Sterling Griffin", "Tyler Duncan", "Jaxon Shipley",
 "Jacob Carter", "Mario Hull", "Demetrius Wilson", "Ben Ijah", "Nigel King",
 "Willie Byrn", "Jeric Magnant", "Jordan Pratt", "Deon Long",
 "Cameron Peterson", "Adrian Henderson", "Tacoi Sumler", "Keith Sconiers",
  "Chris Humphrey", "David Porter Jr.")
dc_2015_2 <- c("Nick Stoner", "Issac Blakeney", "Mario Alford",</pre>
  "Isaac Fruechte", "Markese Triplett", "Marcus Cunningham", "Kasen Williams",
  "Keanon Lowe", "Maudrecus Humphrey", "Justyn Shackleford", "Daniel Spencer",
  "Glenn Coleman", "Josiah Monroe", "Kevonte Martin-Manley", "Zach Walker",
  "Damond Powell", "Scott Harding", "Joe Craig", "Kendall Brock",
  "Kaelin Clay", "John Chelf", "Dres Anderson", "Nick Harwell", "William Boyd",
  "Andre Lewis", "Kai De La Cruz", "Brendan Dudeck", "Kevin Weatherspoon",
  "Marcellus Mack", "L.T. Smith", "Alex Kenney", "Dwight Macon",
  "D.D. Goodson", "Johnathan Loyd", "Keanu Nelson", "Isaiah Roundtree",
  "Kenzel Doe", "Darius Terrell", "Chase Cochran", "Brandon Terry",
  "Charles Lovett", "Damiere Byrd", "Maika Mataele", "Tony Jones",
  "B.J. Chitty", "Shane Ros", "Ralph David Abernathy IV", "Terome Grant",
```

```
"Trey Norman", "Jack Spady", "Markeith Ambles", "Tyler Williams",
  "Der'rikk Thompson", "Christion Jones", "Quinton Dunbar", "Rickey Galvin",
  "John Jakubik", "Brent Mitcham", "Martize Barr", "Deshon Foxx",
  "Jeremé Jones", "Kristoff Williams", "Donnie King Jr.", "Michael Erdman",
  "Jackie Williams", "Jabari Carr", "Aaron Bradley", "Brandon Freeman",
  "Austin Hill", "Daniel Bradbury", "Drake Whitehurst", "Andrew Maass",
  "Christian Green", "Kinderick Dent", "Greg Watson", "Seth Grubb",
  "Jarrad Shaw", "Lonnie Turner", "Clinton Jones", "Justin Olack",
  "Adam Shapiro", "Wayne Beadle", "Landon Smith", "Jeremiah Kobena",
  "Demetrius Evans", "DiAndre Campbell", "Jeffrey Jay", "Chris Perkins",
  "Heath Jackson", "Keenan Montgomery", "Evan Spencer", "Jarvis West",
  "Chevaughn Lawrence", "Daniel Rodriguez", "Stephen Nelson", "Kam Jones",
  "T.J. Glover", "Michaelee Harris", "Craig Wilkins", "Adam Humphries",
  "Rahmaan Patterson", "Matt Milton", "Kenny Harrison",
  "Courtney Williams", "Robert Johnson", "John Dunmore", "Malcolm Trail",
  "Tyler Allen", "Deonte Welch", "Jake Howton", "Justin McCay",
  "Adrian Flemming", "William Dukes", "Bryan Underwood", "Trey Wilkins",
  "Gavin Otte", "Carl Caldwell", "Ross Apo", "Logan Hutton", "Jordan Duval",
  "LeKendrick Williams", "Dallas Burroughs", "Corey Dennis", "Andre Debose")
dc2015_stats2014 <- stats_2014 %>%
  filter(player %in% dc_2015 | player %in% dc_2015_2 & position == "WR")
```

Combine College Stats

Pro Stats

Model Response Variables

To measure success

```
full_data$playedA_Yr <- with(full_data, ifelse(player_game_count1yr > 0 | player_game_count2yr > 0, 1,
full_data$scoredTouchDown <- with(full_data, ifelse(touchdowns1yr > 0 | touchdowns2yr > 0, 1, 0))
full_data$decentStarter <- with(full_data, ifelse(yards1yr > 100 | yards2yr > 100, 1, 0))
full_data$greatStarter <- with(full_data, ifelse(yards1yr > 500 | yards2yr > 500, 1, 0))
full_data$eliteStarter <- with(full_data, ifelse(yards1yr > 1000 | yards2yr > 1000 | (yards1yr + yards1)
response_data <- full_data %>%
    select(player_id, playedA_Yr, scoredTouchDown, decentStarter, greatStarter, eliteStarter)
```

Predicting NFL Success for NFL Players

*more interested in modeling Elite starter and great starter, might need to add some more response variables for higher thresholds

```
full_data %>%
head()
```

```
##
               player player_id position team_name1yr player_game_count1yr
## 1 Sterling Shepard
                            10674
                                         WR
## 2
           Tyler Boyd
                            10689
                                         WR
                                                     CIN
                                                                             16
## 3 Robbie Anderson
                                         WR.
                                                     NYJ
                                                                             16
                            11254
                                                     CLV
                                                                             10
## 4
        Corey Coleman
                            10649
                                        WR.
## 5
        Charone Peake
                           10875
                                        WR
                                                     NYJ
                                                                             13
## 6
        Ricardo Louis
                           10748
                                        WR.
                                                     CLV
                                                                             14
     avg_depth_of_target1yr avoided_tackles1yr caught_percent1yr
## 1
                         9.8
                                                8
## 2
                         9.0
                                                2
                                                                71.1
## 3
                        16.9
                                                3
                                                                56.0
## 4
                        15.5
                                                8
                                                                53.2
                                                4
                                                                57.6
## 5
                         9.5
## 6
                        10.8
                                                4
                                                                56.3
##
     contested_catch_rate1yr contested_receptions1yr contested_targets1yr
## 1
                          100
                                                       3
## 2
                            50
                                                       1
                                                                             2
                                                       2
                                                                             4
## 3
                            50
                           NA
                                                       0
                                                                             0
## 4
## 5
                           100
                                                       1
                                                                             1
## 6
                            50
##
     declined_penalties1yr drop_rate1yr drops1yr first_downs1yr franchise_id1yr
## 1
                          1
                                     10.4
                                                  8
                          0
                                                                                    7
## 2
                                      5.3
                                                  3
                                                                 33
```

```
## 3
                                      12.5
                                                                                    22
                           0
                                                                   18
## 4
                           1
                                      10.8
                                                   4
                                                                   17
                                                                                     8
                                                   2
## 5
                           0
                                       9.5
                                                                    7
                                                                                    22
## 6
                           0
                                      14.3
                                                   3
                                                                    7
                                                                                     8
##
     fumbles1yr grades_hands_drop1yr grades_hands_fumble1yr grades_offense1yr
## 1
                                   53.3
                                                            82.0
## 2
               1
                                   74.0
                                                            80.4
                                                                                65.1
## 3
                                   39.2
                                                            34.3
                                                                                58.0
               1
## 4
               0
                                   51.9
                                                            77.5
                                                                                61.7
## 5
               0
                                   58.1
                                                            74.4
                                                                                59.0
## 6
               1
                                   43.3
                                                            27.4
                                                                                57.9
##
     grades_pass_route1yr inline_rate1yr inline_snaps1yr interceptions1yr
## 1
                       66.2
                                        0.1
                                                            1
                                                                               3
## 2
                       64.4
                                        0.8
                                                            4
## 3
                       56.4
                                        1.7
                                                            8
                                                                               5
                                                                               3
## 4
                       61.9
                                        0.0
                                                            0
## 5
                       57.7
                                        0.0
## 6
                       57.1
                                        0.0
                                                            0
##
     longest1yr pass_block_rate1yr pass_blocks1yr pass_plays1yr penalties1yr
## 1
              32
                                  0.1
                                                    1
                                                                  692
## 2
              30
                                  0.2
                                                    1
                                                                  510
                                                                                  1
## 3
              52
                                  0.0
                                                    0
                                                                  476
                                                                                  1
## 4
                                  0.0
                                                    0
                                                                  379
                                                                                  3
              58
## 5
              27
                                  0.0
                                                    0
                                                                  239
                                                                                  0
                                                                  222
## 6
              42
                                  0.5
                                                    1
     receptions1yr route_rate1yr routes1yr slot_rate1yr slot_snaps1yr
## 1
                 69
                              94.9
                                          657
                                                        85.3
## 2
                 54
                              94.3
                                           481
                                                        88.4
                                                                        451
## 3
                 42
                              95.6
                                           455
                                                        11.1
                                                                         53
## 4
                 33
                              95.0
                                           360
                                                                         20
                                                         5.3
                              95.0
                                                        77.0
## 5
                 19
                                           227
                                                                        184
## 6
                 18
                              94.6
                                           210
                                                        21.6
                                                                         48
     targeted_qb_rating1yr targets1yr touchdowns1yr wide_rate1yr wide_snaps1yr
## 1
                        82.7
                                                       8
                                                                  14.6
                                     112
## 2
                        82.3
                                      76
                                                       1
                                                                  10.8
                                                                                   55
## 3
                        62.5
                                      75
                                                       2
                                                                  86.8
                                                                                  413
## 4
                        70.2
                                      62
                                                       3
                                                                  94.7
                                                                                  359
## 5
                        48.3
                                      33
                                                       0
                                                                  23.0
                                                                                   55
                                      32
## 6
                        62.6
                                                       0
                                                                  78.4
                                                                                  174
     yards1yr yards_after_catch1yr yards_after_catch_per_reception1yr
##
                                  265
                                                                        3.9
## 2
           603
                                  213
## 3
           587
                                  118
                                                                        2.8
## 4
           413
                                  100
                                                                        3.0
## 5
           186
                                   73
                                                                        3.8
## 6
           205
                                   93
     yards_per_reception1yr yprr1yr team_name2yr player_game_count2yr
## 1
                                 1.14
                         10.8
                                                 NYG
## 2
                         11.2
                                  1.25
                                                 CIN
                                                                          10
## 3
                         14.0
                                  1.29
                                                 NYJ
                                                                          16
## 4
                         12.5
                                  1.15
                                                 CLV
                                                                          9
                                                                          3
## 5
                          9.8
                                  0.82
                                                 NYJ
## 6
                         11.4
                                  0.98
                                                 CLV
                                                                         15
     avg_depth_of_target2yr avoided_tackles2yr caught_percent2yr
```

```
## 1
                         8.9
                                                               71.1
## 2
                         6.9
                                               1
                                                               71.0
## 3
                                               5
                                                               56.8
                        13.6
## 4
                        14.5
                                               2
                                                               46.0
## 5
                         2.0
                                               0
                                                              100.0
## 6
                        14.2
                                               3
                                                               49.1
     contested_catch_rate2yr contested_receptions2yr contested_targets2yr
                         63.6
                                                     14
## 1
## 2
                         75.0
                                                      3
                                                                            4
## 3
                         30.8
                                                      8
                                                                           26
                                                      7
## 4
                         58.3
                                                                           12
## 5
                                                      0
                                                                            0
                           NA
                         45.5
                                                      5
     declined_penalties2yr drop_rate2yr drops2yr first_downs2yr franchise_id2yr
                          0
                                      6.3
                                                 4
                                                                36
## 2
                                                 3
                                                                                  7
                          0
                                     12.0
                                                                 14
## 3
                          1
                                      8.7
                                                 6
                                                                36
                                                                                 22
## 4
                          0
                                                                 16
                                     14.8
                                                                                  8
## 5
                          0
                                      0.0
                                                 0
                                                                 1
                                                                                 22
                                                 7
## 6
                          0
                                     20.6
                                                                 18
     fumbles2yr grades_hands_drop2yr grades_hands_fumble2yr grades_offense2yr
                                 69.8
                                                          45.8
## 2
              0
                                 49.3
                                                          74.9
                                                                             62.0
## 3
              0
                                 60.3
                                                          80.9
                                                                             71.4
## 4
                                 37.7
                                                          75.5
                                                                             60.4
              0
                                 64.7
                                                          61.2
                                                                             57.8
## 6
              0
                                 27.5
                                                          76.1
                                                                             53.1
     grades_pass_route2yr inline_rate2yr inline_snaps2yr interceptions2yr
                      70.6
                                      0.4
                                                          2
## 2
                      61.5
                                       0.5
                                                          1
                                                                            1
## 3
                      72.6
                                       0.0
                                                                            5
                                                          0
## 4
                      61.9
                                       0.0
                                                                            3
## 5
                      62.6
                                       0.0
## 6
                      52.0
                                       0.0
                                                          0
     longest2yr pass_block_rate2yr pass_blocks2yr pass_plays2yr penalties2yr
## 1
             77
                                0.0
                                                  0
                                                               467
## 2
             49
                                0.0
                                                  0
                                                               219
                                                                               0
## 3
             69
                                0.0
                                                  0
                                                               520
                                                                               3
                                                                               5
## 4
             44
                                0.3
                                                               312
## 5
              3
                                0.0
                                                  0
                                                                12
## 6
             37
                                0.2
                                                  1
                                                               406
     receptions2yr route_rate2yr routes2yr slot_rate2yr slot_snaps2yr
## 1
                59
                             94.0
                                         439
                                                     83.3
## 2
                22
                             94.5
                                         207
                                                      87.2
                                                                      191
## 3
                63
                             94.6
                                         492
                                                      28.1
                                                                      146
## 4
                 23
                             93.6
                                         292
                                                      7.4
                                                                       23
## 5
                             83.3
                                                      33.3
                 1
                                          10
## 6
                27
                             91.4
                                         371
                                                      20.7
     targeted_qb_rating2yr targets2yr touchdowns2yr wide_rate2yr wide_snaps2yr
## 1
                                                     2
                      106.0
                                    83
                                                               15.6
## 2
                                                     2
                                                                                27
                       99.5
                                     31
                                                               12.3
## 3
                       87.0
                                                     7
                                    111
                                                               71.5
                                                                               372
                                                     2
## 4
                       54.2
                                     50
                                                               92.3
                                                                               288
## 5
                       79.2
                                                     0
                                      1
                                                               66.7
                                                                                 8
```

```
54.9
                                                                79.3
                                                                                 322
## 6
                                     55
                                                      0
     yards2yr yards_after_catch2yr yards_after_catch_per_reception2yr
## 1
          731
                                 303
## 2
          225
                                  93
                                                                       4.2
## 3
          941
                                 285
                                                                       4.5
## 4
          305
                                  27
                                                                       1.2
## 5
             3
                                   1
                                                                       1.0
## 6
          357
                                  83
                                                                       3.1
     yards_per_reception2yr yprr2yr team_name_draft player_game_count_draft
## 1
                        12.4
                                 1.67
                                              OKLAHOMA
## 2
                        10.2
                                 1.09
                                            PITTSBURGH
                                                                               12
## 3
                         14.9
                                 1.91
                                                TEMPLE
                                                                               14
## 4
                         13.3
                                 1.04
                                                                               12
                                                BAYLOR
## 5
                                 0.30
                         3.0
                                               CLEMSON
                                                                               15
## 6
                        13.2
                                 0.96
                                                AUBURN
                                                                               13
     caught_percent_draft drop_rate_draft drops_draft first_downs_draft
## 1
                      72.9
                                        4.4
                                                        4
                                                                          64
## 2
                                                        5
                                                                          52
                      71.8
                                         5.1
## 3
                      58.3
                                                                          39
                                        13.6
                                                       11
## 4
                      63.8
                                        11.9
                                                       10
                                                                          51
## 5
                      61.7
                                         9.1
                                                        5
                                                                          31
## 6
                      56.8
                                        11.5
                                                        6
     grades_hands_drop_draft grades_hands_fumble_draft grades_offense_draft
## 1
                         83.4
                                                      76.4
## 2
                         81.9
                                                      68.7
                                                                            89.9
## 3
                         46.4
                                                      55.7
                                                                            73.1
## 4
                          56.9
                                                      79.5
                                                                            90.0
## 5
                          65.9
                                                      73.9
                                                                            72.1
## 6
                          56.8
                                                      27.5
                                                                            76.0
     grades_pass_route_draft pass_plays_draft receptions_draft route_rate_draft
## 1
                         90.8
                                             469
                                                                86
                                                                                 95.5
## 2
                          90.3
                                             361
                                                                 94
                                                                                 95.8
## 3
                         74.6
                                             429
                                                                70
                                                                                 93.0
                                                                 74
## 4
                          90.4
                                             367
                                                                                 93.2
## 5
                         70.4
                                             388
                                                                50
                                                                                 95.4
## 6
                          80.8
                                             212
                                                                 46
                                                                                 96.2
     routes_draft targeted_qb_rating_draft targets_draft touchdowns_draft
## 1
               448
                                        135.9
                                                         118
## 2
                                                                             6
               346
                                         91.1
                                                         131
                                                                             7
## 3
               399
                                         92.3
                                                         120
## 4
               342
                                        133.1
                                                         116
                                                                            20
               370
## 5
                                         95.9
                                                          81
                                                                             5
## 6
               204
                                         93.5
     yards_draft yards_after_catch_draft yards_after_catch_per_reception_draft
## 1
             1289
                                        495
## 2
                                                                                 4.4
             940
                                        418
## 3
             939
                                        298
                                                                                 4.3
                                        569
## 4
             1365
                                                                                 7.7
             723
                                        269
## 5
                                                                                 5.4
## 6
             717
                                        198
                                                                                 4.3
     yards_per_reception_draft yprr_draft team_name_pre player_game_count_pre
## 1
                                       2.88
                                                  OKLAHOMA
                           15.0
## 2
                                                PITTSBURGH
                            10.0
                                        2.72
                                                                                 13
## 3
                            13.4
                                                                                 NA
                                        2.35
                                                       <NA>
```

```
3.99
## 4
                            18.4
                                                     BAYLOR
                                                                                 10
## 5
                            14.5
                                        1.95
                                                    CLEMSON
                                                                                  7
                                                     AUBURN
## 6
                            15.6
                                        3.51
                                                                                 12
##
     caught_percent_pre drop_rate_pre drops_pre first_downs_pre
## 1
                    62.2
                                     1.9
## 2
                    64.5
                                     6.0
                                                  5
                                                                   1
## 3
                      NA
                                      NA
                                                 NA
                                                                  NA
## 4
                    70.3
                                     9.9
                                                  7
                                                                   1
## 5
                    70.6
                                     0.0
                                                  0
                                                                   0
## 6
                    67.7
                                    19.2
                                                  5
                                                                   0
     grades_hands_drop_pre grades_hands_fumble_pre grades_offense_pre
## 1
                                                  75.9
                                                                       85.8
                       88.0
## 2
                        75.5
                                                  59.8
                                                                       90.3
## 3
                          NA
                                                    NA
                                                                         NA
## 4
                        58.0
                                                  77.2
                                                                       81.3
## 5
                        82.2
                                                  68.5
                                                                       62.3
## 6
                       37.2
                                                  76.5
                                                                       68.3
     grades_pass_route_pre pass_plays_pre receptions_pre route_rate_pre routes_pre
## 1
                       86.9
                                                                                      252
                                         262
                                                          51
                                                                         96.2
## 2
                                                                                      326
                       91.6
                                         343
                                                          78
                                                                         95.0
## 3
                         NA
                                          NA
                                                          NA
                                                                           NA
                                                                                       NA
## 4
                        83.8
                                         324
                                                           64
                                                                         96.3
                                                                                      312
## 5
                                                                         97.7
                       63.2
                                         128
                                                           12
                                                                                      125
## 6
                        61.8
                                         122
                                                                         95.9
                                                                                      117
     targeted_qb_rating_pre targets_pre touchdowns_pre yards_pre
## 1
                       103.2
                                        82
                                                         5
                                                                  970
## 2
                        107.4
                                       121
                                                         8
                                                                 1257
## 3
                                                        NA
                           NA
                                        NA
                                                                   NA
## 4
                                        91
                        146.9
                                                        11
                                                                 1119
## 5
                        107.2
                                        17
                                                         2
                                                                  129
## 6
                        125.9
                                        31
                                                         3
                                                                  261
     yards_after_catch_pre yards_after_catch_per_reception_pre
## 1
                         343
                                                                6.7
## 2
                         506
                                                                6.5
## 3
                         NA
                                                                 NA
## 4
                         421
                                                                6.6
## 5
                          49
                                                                4.1
## 6
                         160
                                                                7.6
     yards_per_reception_pre yprr_pre total_yards total_catch_percent
## 1
                          19.0
                                    3.85
                                                 1477
                                                                 0.6564103
## 2
                          16.1
                                    3.86
                                                  828
                                                                 0.7102804
                                                 1528
## 3
                            NA
                                      NA
                                                                 0.5645161
## 4
                          17.5
                                    3.59
                                                  718
                                                                 0.5000000
## 5
                          10.8
                                    1.03
                                                  189
                                                                 0.5882353
## 6
                          12.4
                                    2.23
                                                  562
                                                                 0.5172414
     total_target_percent total_route_percent total_drop_percent total_yprr
## 1
                 0.1779197
                                       0.9456428
                                                           0.06153846
                                                                             2.81
## 2
                 0.1555233
                                       0.9437586
                                                          0.05607477
                                                                             2.34
## 3
                 0.1964097
                                       0.9508032
                                                           0.06451613
                                                                             3.20
## 4
                 0.1717791
                                       0.9435601
                                                           0.07142857
                                                                             2.19
## 5
                 0.1434599
                                       0.9442231
                                                          0.05882353
                                                                             1.12
                 0.1497418
## 6
                                       0.9251592
                                                          0.11494253
                                                                             1.94
     total_first_downs total_yards_per_reception
## 1
                     82
                                                23.2
```

```
## 2
                    47
                                              21.4
## 3
                    54
                                              28.9
## 4
                    33
                                              25.8
                     8
## 5
                                              12.8
## 6
                    25
                                              24.6
##
     total_yards_after_catch_per_reception total_player_game_count
                                                                  28
## 2
                                        8.1
                                                                  26
## 3
                                        7.3
                                                                  32
## 4
                                                                  19
                                        4.2
## 5
                                        4.8
                                                                  16
## 6
                                        8.3
                                                                  29
     total_touchdowns total_yards_per_game total_yards_after_catch_per_game
## 1
                                   52.75000
                                                                    20.285714
## 2
                    3
                                   31.84615
                                                                    11.769231
## 3
                    9
                                   47.75000
                                                                    12.593750
## 4
                    5
                                   37.78947
                                                                      6.684211
## 5
                    0
                                   11.81250
                                                                      4.625000
## 6
                    0
                                   19.37931
                                                                      6.068966
     total_targets_per_game total_targeted_qb_rating games_draft grades_hands_drop
## 1
                   6.964286
                                                94.35
                                                        0.5652174
                                                                             59.78214
## 2
                   4.115385
                                                 90.90
                                                         0.4800000
                                                                             64.50000
## 3
                                                74.75
                   5.812500
                                                               Inf
                                                                             49.75000
## 4
                                                 62.20
                   5.894737
                                                         0.5454545
                                                                             45.17368
## 5
                                                 63.75
                   2.125000
                                                         0.6818182
                                                                             59.33750
                   3.000000
                                                58.75
                                                         0.5200000
     grades_hands_fumble grades_offense grades_pass_route games2yr Team Date
##
                67.77857
                                                  67.92857 0.3928571 NYG 2016
## 1
                                67.96786
## 2
                78.28462
                                63.90769
                                                   63.28462 0.3846154 CIN 2016
## 3
                57.60000
                                64.70000
                                                   64.50000 0.5000000 ARI 2016
## 4
                76.55263
                                61.08421
                                                   61.90000 0.4736842
                                                                        FA 2016
## 5
                71.92500
                                58.77500
                                                   58.61875 0.1875000
                                                                        FA 2016
## 6
                52.58966
                                55.41724
                                                   54.46207 0.5172414
                                         Hand X40. Yard Vertical Broad Bench Power5
##
       Title Height Weight
                                Arm
## 1 Combine
                 70
                    196 30.38000 9.750000 4.480000
                                                            41.0
                                                                   123
## 2 Combine
                 74
                       203 32.00000 9.750000 4.580000
                                                            34.0
                                                                   119
                                                                           11
                                                                                   1
## 3 Pro Day
                 75
                       190 31.87483 9.409438 4.340000
                                                            36.5
## 4 Combine
                 71
                       193 30.25000 9.000000 4.486941
                                                            40.5
                                                                   129
                                                                           17
                                                                                   1
## 5 Combine
                 74
                       209 34.00000 9.250000 4.450000
                                                            35.5
                                                                   122
                       215 32.38000 9.500000 4.430000
## 6 Combine
                                                            38.0
     playedA_Yr scoredTouchDown decentStarter greatStarter eliteStarter
## 1
              1
                                              1
                                                           1
                                                                         0
## 2
              1
                               1
                                             1
                                                           1
                                                                         0
                                                                         0
## 3
              1
                               1
                                                           1
                                             1
                                                                         0
              1
                               1
                                              1
                                                           0
## 5
                               0
                                                           0
                                                                         0
              1
                                              1
```

```
good_starter_nfl <- full_data %>%
select(-c(player_id, player, position, team_name_draft, scoredTouchDown, playedA_Yr, decentStarter, e
```

elite_starter_nfl <- full_data %>%
 select(-c(player_id, player, position, team_name_draft, scoredTouchDown, playedA_Yr, decentStarter, g

Predicting NFL Success for Players at Combine

*more interested in modeling great and good starter, played a year, contributor

```
combine_data <- combine_college_data %>%
  merge(response data, by = 'player id', all.x = TRUE) %>%
  distinct(player_id, .keep_all = TRUE) %>%
  drop_na(grades_offense_pre) %>%
  mutate(playedA_Yr = as.factor(coalesce(playedA_Yr, 0)),
         scoredTouchDown = as.factor(coalesce(scoredTouchDown, 0)),
         decentStarter = as.factor(coalesce(decentStarter, 0)),
         greatStarter = as.factor(coalesce(greatStarter, 0)),
         eliteStarter = as.factor(coalesce(eliteStarter, 0)))
combine_cleaned <- combine_data |>
  select(-c(Shuttle, Cone, Bench))
combine cleaned$X40.Yard[is.na(combine cleaned$X40.Yard)]<-mean(combine cleaned$X40.Yard,na.rm=TRUE)
combine_cleaned$Arm[is.na(combine_cleaned$Arm)]<-mean(combine_cleaned$Arm, na.rm=TRUE)
combine_cleaned$Broad[is.na(combine_cleaned$Broad)]<-mean(combine_cleaned$Broad, na.rm=TRUE)
combine_cleaned$Vertical[is.na(combine_cleaned$Vertical)] <-mean(combine_cleaned$Vertical, na.rm=TRUE)
combine_cleaned$Hand[is.na(combine_cleaned$Hand)] <-mean(combine_cleaned$Hand, na.rm=TRUE)
install.packages("caret")
## Installing package into '/home/guest/R/x86_64-pc-linux-gnu-library/4.2'
## (as 'lib' is unspecified)
snap model com <- combine cleaned %>%
  select(-c(player_id, player, position, team_name_draft, scoredTouchDown, decentStarter, greatStarter,
set.seed(1)
index<-createDataPartition(snap model com$playedA Yr,p=0.7,list=FALSE)
train<-snap_model_com[index,]</pre>
test <- snap model com[-index,]
snap_model_com_res <- glm(playedA_Yr~., data=train, family = "binomial")</pre>
## Warning: glm.fit: algorithm did not converge
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
summary(snap_model_com_res)
##
## Call:
## glm(formula = playedA_Yr ~ ., family = "binomial", data = train)
##
## Deviance Residuals:
          Min
                               Median
                                                3Q
                                                           Max
                       10
## -1.102e-04 -2.100e-08 -2.100e-08
                                        2.100e-08
                                                     1.056e-04
##
```

```
## Coefficients: (8 not defined because of singularities)
##
                                         Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                                        4.474e+04 1.474e+08 0.000
## player_game_count_draft
                                                               0.000
                                                                        1.000
                                       -5.744e+01 4.451e+05
## caught_percent_draft
                                        3.361e+01 7.780e+04
                                                               0.000
                                                                        1.000
## drop rate draft
                                        1.221e+02 5.385e+04
                                                               0.002
                                                                        0.998
## drops draft
                                        1.319e+02 3.431e+05
                                                               0.000
                                                                        1.000
## first_downs_draft
                                       -3.579e+01 4.528e+04 -0.001
                                                                        0.999
## grades_hands_drop_draft
                                       4.224e+01 9.810e+04
                                                               0.000
                                                                        1.000
## grades_hands_fumble_draft
                                        4.534e+01 7.614e+03
                                                               0.006
                                                                        0.995
## grades_offense_draft
                                      -2.808e+02 1.340e+05 -0.002
                                                                        0.998
                                        2.491e+02 1.364e+05
## grades_pass_route_draft
                                                               0.002
                                                                        0.999
                                        3.993e+01 1.912e+05
## pass_plays_draft
                                                               0.000
                                                                        1.000
                                       3.418e+01 2.121e+04
                                                               0.002
                                                                        0.999
## receptions_draft
## route_rate_draft
                                       2.648e+02 3.697e+05
                                                               0.001
                                                                        0.999
## routes_draft
                                      -3.902e+01 2.131e+05
                                                               0.000
                                                                        1.000
                                                               0.000
## targeted_qb_rating_draft
                                      -1.391e+00 1.715e+04
                                                                        1.000
## targets draft
                                        4.293e+01 1.518e+04
                                                               0.003
                                                                        0.998
## touchdowns_draft
                                        6.173e+00 1.087e+04
                                                               0.001
                                                                        1.000
                                       -6.101e+00 6.664e+03
## yards draft
                                                              -0.001
                                                                        0.999
## yards_after_catch_draft
                                        2.469e+00 2.423e+03
                                                               0.001
                                                                        0.999
## yards_after_catch_per_reception_draft 1.779e+01 1.882e+05
                                                               0.000
                                                                        1.000
## yards_per_reception_draft
                                        1.448e+02 8.433e+04
                                                               0.002
                                                                        0.999
                                       -1.589e+02 1.481e+06
                                                               0.000
## yprr draft
                                                                        1.000
                                                               0.000
## player_game_count_pre
                                      -8.655e+01 3.769e+05
                                                                        1.000
## caught_percent_pre
                                      -2.549e+01 8.007e+04
                                                               0.000
                                                                        1.000
## drop_rate_pre
                                      -6.433e+01 3.547e+04
                                                              -0.002
                                                                        0.999
                                       2.237e+01 1.081e+05
## drops_pre
                                                               0.000
                                                                        1.000
## first_downs_pre
                                        4.299e-01 1.002e+04
                                                               0.000
                                                                       1.000
## grades_hands_drop_pre
                                      -2.251e+01 5.460e+04
                                                               0.000
                                                                        1.000
                                       5.053e+01 7.981e+03
## grades_hands_fumble_pre
                                                               0.006
                                                                        0.995
## grades_offense_pre
                                      -2.563e+02 1.386e+05
                                                              -0.002
                                                                        0.999
## grades_pass_route_pre
                                       2.099e+02 1.343e+05
                                                               0.002
                                                                        0.999
                                      -4.736e+01 1.331e+05
                                                               0.000
## pass_plays_pre
                                                                        1.000
## receptions_pre
                                        2.403e+01 7.184e+04
                                                               0.000
                                                                        1.000
## route_rate_pre
                                       5.793e+00 4.548e+05
                                                               0.000
                                                                        1.000
## routes pre
                                       5.124e+01 1.363e+05
                                                               0.000
                                                                        1.000
## targeted_qb_rating_pre
                                       5.415e+00 5.425e+03
                                                               0.001
                                                                        0.999
## targets_pre
                                        1.471e+01 2.610e+04
                                                               0.001
                                                                        1.000
## touchdowns_pre
                                       -1.131e+01 7.926e+04
                                                               0.000
                                                                        1.000
                                       -1.573e+00 1.759e+03 -0.001
## yards pre
                                                                        0.999
                                       -5.074e-01 1.902e+03
## yards_after_catch_pre
                                                               0.000
                                                                        1.000
## yards_after_catch_per_reception_pre
                                        1.030e+02 3.409e+04
                                                               0.003
                                                                        0.998
                                                              -0.002
## yards_per_reception_pre
                                       -1.108e+02 6.153e+04
                                                                        0.999
                                       -2.685e+02 5.904e+05
                                                               0.000
## yprr_pre
                                                                        1.000
                                               NA
                                                          NA
                                                                  NA
## total_yards
                                                                           NA
                                                               0.000
## total_catch_percent
                                       -6.322e+03 1.372e+07
                                                                        1.000
                                       6.163e+03 1.400e+07
                                                               0.000
## total_target_percent
                                                                        1.000
## total_route_percent
                                       -3.517e+04 1.899e+08
                                                               0.000
                                                                        1.000
## total_drop_percent
                                       -9.263e+03 6.741e+06
                                                              -0.001
                                                                        0.999
                                                          NA
                                                                  NA
## total_yprr
                                               NΑ
                                                                           NΑ
## total_first_downs
                                                                  NA
                                               NA
                                                          NA
                                                                           NA
## total_yards_per_reception
                                               NΑ
                                                          NA
                                                                  NA
                                                                           NA
## total_yards_after_catch_per_reception
                                               NA
                                                          NA
                                                                  NA
                                                                           NA
```

```
## total_player_game_count
                                                 NA
                                                            NA
                                                                             NA
## total_touchdowns
                                                 NΑ
                                                            NΑ
                                                                    NΑ
                                                                             NΑ
## total yards per game
                                          1.084e+02 1.004e+05
                                                                 0.001
                                                                          0.999
## total_yards_after_catch_per_game
                                         -5.403e+01 9.335e+04
                                                                          1.000
                                                                -0.001
## total_targets_per_game
                                         -1.315e+03 2.010e+05
                                                                -0.007
                                                                          0.995
## total targeted qb rating
                                                            NA
                                                                    NA
                                                 NΑ
                                                                             NA
## grades hands drop
                                          3.780e+00 1.219e+05
                                                                 0.000
                                                                          1.000
                                         -8.835e+01 2.923e+04 -0.003
## grades_hands_fumble
                                                                          0.998
## grades offense
                                         6.052e+02 2.818e+05
                                                                 0.002
                                                                          0.998
                                         -4.867e+02 2.887e+05 -0.002
## grades_pass_route
                                                                          0.999
## Power5_draft1
                                          3.909e+01 6.554e+04
                                                                 0.001
                                                                          1.000
                                         -1.726e+01 3.286e+04
## Date
                                                                -0.001
                                                                          1.000
## TitlePro Day
                                         -3.861e+02 4.501e+05 -0.001
                                                                          0.999
## Height
                                         -6.615e+00 5.734e+04
                                                                0.000
                                                                          1.000
## Weight
                                         2.056e+00 6.439e+03
                                                                 0.000
                                                                          1.000
## Arm
                                         -5.435e+01 1.516e+05
                                                                 0.000
                                                                          1.000
## Hand
                                         -1.717e+02 1.941e+05 -0.001
                                                                          0.999
## X40.Yard
                                         -4.460e+02 5.965e+05
                                                                -0.001
                                                                          0.999
## Vertical
                                          3.091e+01 2.933e+04
                                                                 0.001
                                                                          0.999
                                          8.345e-01 5.983e+03
## Broad
                                                                 0.000
                                                                          1.000
##
## (Dispersion parameter for binomial family taken to be 1)
##
       Null deviance: 2.3776e+02 on 183 degrees of freedom
## Residual deviance: 2.4848e-07 on 120 degrees of freedom
     (3 observations deleted due to missingness)
## AIC: 128
## Number of Fisher Scoring iterations: 25
pred <- predict(snap_model_com_res, test, type = "response")</pre>
## Warning in predict.lm(object, newdata, se.fit, scale = 1, type = if (type == :
## prediction from a rank-deficient fit may be misleading
pred <- as.integer(pred>0.5)
conf_snap_1 <- confusionMatrix(as.factor(pred),test$playedA_Yr)</pre>
conf snap 1
## Confusion Matrix and Statistics
##
##
             Reference
## Prediction 0 1
            0 30 14
##
            1 22 12
##
##
##
                  Accuracy : 0.5385
##
                    95% CI: (0.4218, 0.6521)
##
      No Information Rate: 0.6667
##
      P-Value [Acc > NIR] : 0.9932
##
##
                     Kappa: 0.0357
##
```

```
Mcnemar's Test P-Value: 0.2433
##
##
              Sensitivity: 0.5769
##
              Specificity: 0.4615
##
           Pos Pred Value: 0.6818
           Neg Pred Value: 0.3529
##
               Prevalence: 0.6667
##
##
           Detection Rate: 0.3846
##
     Detection Prevalence: 0.5641
##
        Balanced Accuracy: 0.5192
##
##
         'Positive' Class: 0
##
set.seed(1)
snap_model_com2 <- snap_model_com %>%
 select(total_yards, total_catch_percent, total_target_percent, total_route_percent, total_drop_percen
index<-createDataPartition(snap_model_com2$playedA_Yr,p=0.7,list=FALSE)
train<-snap_model_com2[index,]</pre>
test<-snap_model_com2[-index,]</pre>
snap_model_com2_res <- glm(playedA_Yr~., data=train, family = "binomial")</pre>
summary(snap_model_com2_res)
##
## Call:
## glm(formula = playedA_Yr ~ ., family = "binomial", data = train)
## Deviance Residuals:
##
      Min
                                  3Q
                10
                     Median
                                         Max
  -2.0378 -0.6888 -0.2533
                              0.6177
                                       2.7134
##
## Coefficients:
##
                                         Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                                       -15.479408 28.531671 -0.543 0.58745
                                                              1.010 0.31244
## total_yards
                                         0.003746
                                                    0.003709
## total_catch_percent
                                       -21.905152
                                                   8.884256 -2.466 0.01368 *
                                        36.948502 25.271006
                                                             1.462 0.14372
## total_target_percent
## total_route_percent
                                        -0.518359 21.887565 -0.024 0.98111
                                        58.382298 31.678751
## total_drop_percent
                                                              1.843 0.06534
                                        -2.891597 1.329052 -2.176 0.02958 *
## total_yprr
## total_first_downs
                                        -0.027434 0.016304 -1.683 0.09245 .
## total_yards_per_reception
                                        0.242409
                                                               2.665 0.00771 **
## total_yards_after_catch_per_reception
                                                    0.090971
                                         0.191500
                                                    0.243657
                                                               0.786 0.43190
## total_player_game_count
## total_touchdowns
                                        -0.117801
                                                    0.078383 -1.503 0.13287
                                                               0.559 0.57632
## total_yards_per_game
                                         0.064985
                                                    0.116301
                                        -1.204014
                                                    0.677875
                                                              -1.776 0.07571
## total_targets_per_game
                                         0.068526 0.034444
                                                              1.990 0.04665 *
## total_targeted_qb_rating
                                                    0.077659
                                                              1.828 0.06751
## grades_hands_drop
                                         0.141980
                                         0.012763
                                                               0.669 0.50339
## grades_hands_fumble
                                                    0.019074
                                         0.043497
                                                    0.207140
                                                               0.210 0.83368
## grades_offense
## grades_pass_route
                                         0.230877 0.225154
                                                               1.025 0.30517
                                                               0.929 0.35277
## Power5_draft1
                                         0.537470 0.578408
## Height
                                         0.073072 0.164893
                                                             0.443 0.65766
```

```
## Weight
                                           0.019820
                                                      0.022723
                                                                 0.872 0.38306
## Arm
                                           0.049955 0.255638
                                                                 0.195 0.84507
                                          -0.524630
                                                      0.562346 -0.933 0.35086
## Hand
## X40.Yard
                                          -5.531470
                                                      2.743037
                                                                -2.017 0.04374 *
## Broad
                                           0.017730
                                                      0.032728
                                                                 0.542 0.58800
## Vertical
                                           0.088620
                                                      0.088446
                                                                 1.002 0.31636
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
      Null deviance: 240.30 on 186 degrees of freedom
##
## Residual deviance: 157.59 on 160 degrees of freedom
## AIC: 211.59
##
## Number of Fisher Scoring iterations: 6
pred_2 <- predict(snap_model_com2_res, test, type = "response")</pre>
pred_2 <- as.integer(pred_2>0.5)
conf_snap_2 <- confusionMatrix(as.factor(pred_2),test$playedA_Yr)</pre>
conf_snap_2
## Confusion Matrix and Statistics
##
##
             Reference
## Prediction 0 1
##
            0 39 13
##
            1 13 14
##
##
                  Accuracy : 0.6709
##
                    95% CI: (0.556, 0.7725)
##
      No Information Rate: 0.6582
##
      P-Value [Acc > NIR] : 0.4578
##
##
                     Kappa: 0.2685
##
##
   Mcnemar's Test P-Value: 1.0000
##
##
              Sensitivity: 0.7500
               Specificity: 0.5185
##
##
            Pos Pred Value: 0.7500
##
            Neg Pred Value: 0.5185
##
                Prevalence: 0.6582
##
            Detection Rate: 0.4937
##
      Detection Prevalence: 0.6582
##
         Balanced Accuracy: 0.6343
##
##
          'Positive' Class: 0
##
decent_starter_com <- combine_cleaned %>%
  select(-c(player_id, player, position, team_name_draft, scoredTouchDown, playedA_Yr, greatStarter, el
```

```
set.seed(2)
index<-createDataPartition(decent_starter_com$decentStarter,p=0.7,list=FALSE)
train<-decent_starter_com[index,]</pre>
test<-decent_starter_com[-index,]</pre>
decent_starter_com_res <- glm(decentStarter~., data=train, family = "binomial")</pre>
```

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

```
summary(decent starter com res)
```

```
##
## Call:
## glm(formula = decentStarter ~ ., family = "binomial", data = train)
## Deviance Residuals:
                       Median
                                    3Q
       Min
                 1Q
                                            Max
## -2.03392 -0.40434 -0.03734
                               0.21910
                                        2.75779
## Coefficients: (8 not defined because of singularities)
                                        Estimate Std. Error z value Pr(>|z|)
                                       8.650e+01 1.973e+02 0.438
## (Intercept)
                                                                   0.6611
## player_game_count_draft
                                      2.334e+00 9.354e-01
                                                            2.495
                                                                   0.0126 *
## caught_percent_draft
                                     -1.325e-01 3.339e-01 -0.397
                                                                   0.6915
## drop_rate_draft
                                    -1.915e-01 7.334e-01 -0.261
                                                                   0.7940
## drops_draft
                                      1.891e+00 8.552e-01 2.211
                                                                   0.0271 *
## first_downs_draft
                                    -2.634e-01 1.667e-01 -1.580 0.1141
## grades hands drop draft
                                     4.176e-01 4.044e-01 1.033 0.3018
## grades_hands_fumble_draft
                                     1.781e-01 1.679e-01 1.061
                                                                   0.2888
## grades offense draft
                                      1.061e+00 3.064e+00 0.346
                                                                   0.7291
## grades_pass_route_draft
                                    -6.424e-01 3.047e+00 -0.211
                                                                   0.8330
## pass_plays_draft
                                    -8.071e-02 3.033e-01 -0.266 0.7902
                                      6.231e-01 2.733e-01 2.280 0.0226 *
## receptions_draft
                                      1.631e+00 1.719e+00 0.949 0.3426
## route_rate_draft
## routes_draft
                                     8.554e-02 3.140e-01 0.272 0.7853
## targeted_qb_rating_draft
                                      1.497e-02 4.545e-02 0.329
                                                                   0.7419
                                    -4.930e-01 2.822e-01 -1.747
## targets_draft
                                                                   0.0806 .
                                     -2.215e-01 1.852e-01 -1.196
## touchdowns_draft
                                                                   0.2319
## yards_draft
                                    -2.004e-02 2.832e-02 -0.708
                                                                   0.4791
## yards_after_catch_draft
                                      1.614e-02 2.573e-02 0.627
                                                                   0.5305
## yards_after_catch_per_reception_draft 5.612e-01 6.960e-01
                                                           0.806
                                                                   0.4201
## yards_per_reception_draft
                                      1.247e+00 6.037e-01
                                                            2.066
                                                                   0.0389 *
                                     -2.154e+00 4.149e+00 -0.519 0.6036
## yprr_draft
## player_game_count_pre
                                      2.147e+00 9.549e-01 2.249
                                                                   0.0245 *
                                     -3.622e-01 2.797e-01 -1.295
## caught percent pre
                                                                   0.1954
## drop_rate_pre
                                    -6.755e-01 5.140e-01 -1.314
                                                                   0.1888
## drops pre
                                      7.740e-01 5.697e-01 1.359
                                                                   0.1742
## first_downs_pre
                                     6.873e-02 4.067e-02 1.690
                                                                   0.0910
                                      1.285e-01 3.190e-01 0.403
## grades_hands_drop_pre
                                                                   0.6872
## grades_hands_fumble_pre
                                     1.793e-01 1.773e-01 1.011
                                                                   0.3118
## grades_offense_pre
                                      1.028e+00 3.109e+00
                                                           0.331
                                                                   0.7410
                                     -9.195e-01 3.083e+00 -0.298
## grades_pass_route_pre
                                                                   0.7655
## pass_plays_pre
                                     -2.678e-02 3.108e-01 -0.086
                                                                   0.9313
```

```
## receptions_pre
                                       3.483e-01 2.400e-01 1.452
                                                                     0.1466
                                       2.147e+00 1.229e+00 1.747
## route_rate_pre
                                                                     0.0807 .
## routes_pre
                                                                     0.9661
                                      -1.391e-02 3.272e-01 -0.042
## targeted_qb_rating_pre
                                       3.248e-03 4.386e-02 0.074
                                                                     0.9410
                                     -5.804e-01 2.495e-01 -2.327
## targets_pre
                                                                     0.0200 *
                                      6.685e-02 2.214e-01 0.302 0.7627
## touchdowns pre
                                      2.969e-02 2.731e-02 1.087 0.2770
## yards pre
                                     -3.896e-03 2.269e-02 -0.172
## yards_after_catch_pre
                                                                     0.8636
## yards_after_catch_per_reception_pre 1.568e+00 7.139e-01 2.196
                                                                     0.0281 *
## yards_per_reception_pre
                                      -9.308e-01 5.224e-01 -1.782
                                                                     0.0748
## yprr_pre
                                      -5.538e+00 3.612e+00 -1.533 0.1253
## total_yards
                                              NΑ
                                                        NA
                                                                NA
                                                                         NA
## total_catch_percent
                                      -3.426e+01 4.792e+01 -0.715
                                                                     0.4746
## total_target_percent
                                     -5.472e+01 7.241e+01 -0.756
                                                                     0.4499
                                     -5.256e+02 3.294e+02 -1.596
## total_route_percent
                                                                     0.1106
## total_drop_percent
                                      -4.006e+01 1.047e+02 -0.383
                                                                     0.7020
## total_yprr
                                              NA
                                                        NA
                                                                NA
                                                                         NΑ
## total first downs
                                              NA
                                                        NA
                                                                NA
                                                                         NA
                                                                NA
## total_yards_per_reception
                                              NΑ
                                                        NΑ
                                                                         NΑ
## total_yards_after_catch_per_reception
                                              NA
                                                         NA
                                                                NA
                                                                         NA
## total_player_game_count
                                              NA
                                                        NA
                                                                NA
                                                                         NΔ
## total touchdowns
                                              NΑ
                                                        NA
## total_yards_per_game
                                      5.080e-02 7.206e-01 0.071
                                                                     0.9438
## total_yards_after_catch_per_game
                                       -5.235e-01 6.298e-01 -0.831
                                                                     0.4058
                                       7.531e+00 5.943e+00 1.267
## total_targets_per_game
                                                                     0.2051
## total_targeted_qb_rating
                                              NA
                                                        NA
                                                                NA
                                                                         NA
                                     -3.876e-01 5.961e-01 -0.650
                                                                     0.5156
## grades_hands_drop
                                      -3.793e-01 3.358e-01 -1.129
## grades_hands_fumble
                                                                     0.2587
## grades_offense
                                     -1.052e-01 6.139e+00 -0.017
                                                                     0.9863
## grades_pass_route
                                      2.600e-01 6.122e+00
                                                            0.042
                                                                     0.9661
                                     -1.071e-01 9.748e-01 -0.110
## Power5_draft1
                                                                     0.9125
## Height
                                       6.147e-01 3.095e-01 1.986
                                                                     0.0470 *
## Weight
                                      -7.575e-02 4.880e-02 -1.552
                                                                     0.1206
                                       2.452e-01 4.123e-01
                                                            0.595
## Arm
                                                                     0.5520
                                       -1.667e+00 1.081e+00 -1.543
## Hand
                                                                     0.1229
## X40.Yard
                                       -5.782e+00 5.259e+00 -1.099
                                                                    0.2716
## Vertical
                                       2.053e-01 1.458e-01 1.408
                                                                     0.1590
## Broad
                                       3.139e-02 2.762e-02 1.136
                                                                     0.2558
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
      Null deviance: 226.57 on 186 degrees of freedom
## Residual deviance: 101.60 on 125 degrees of freedom
## AIC: 225.6
## Number of Fisher Scoring iterations: 8
pred_dec <- predict(decent_starter_com_res, test, type = "response")</pre>
## Warning in predict.lm(object, newdata, se.fit, scale = 1, type = if (type == :
```

prediction from a rank-deficient fit may be misleading

```
pred_dec <- as.integer(pred_dec>0.5)
conf_dec <- confusionMatrix(as.factor(pred_dec), test$decentStarter)</pre>
conf_dec
## Confusion Matrix and Statistics
##
##
             Reference
## Prediction 0 1
##
            0 46 11
            1 9 12
##
##
##
                  Accuracy : 0.7436
##
                    95% CI: (0.6321, 0.8358)
##
       No Information Rate: 0.7051
       P-Value [Acc > NIR] : 0.2710
##
##
##
                     Kappa: 0.3674
##
##
   Mcnemar's Test P-Value: 0.8231
##
##
               Sensitivity: 0.8364
##
               Specificity: 0.5217
##
            Pos Pred Value : 0.8070
##
            Neg Pred Value: 0.5714
##
                Prevalence: 0.7051
##
            Detection Rate: 0.5897
##
      Detection Prevalence: 0.7308
##
         Balanced Accuracy: 0.6791
##
##
          'Positive' Class: 0
##
set.seed(2)
decent_starter_com2 <- decent_starter_com %>%
  select(total_yards, total_catch_percent, total_target_percent, total_route_percent, total_drop_percent
index<-createDataPartition(decent_starter_com2$decentStarter,p=0.7,list=FALSE)
train<-decent_starter_com2[index,]</pre>
test<-decent_starter_com2[-index,]</pre>
decent_starter_com2_res <- glm(decentStarter~., data=train, family = "binomial")</pre>
summary(decent_starter_com2_res)
##
## glm(formula = decentStarter ~ ., family = "binomial", data = train)
##
## Deviance Residuals:
       Min
                10 Median
                                    30
                                            Max
## -2.1712 -0.6498 -0.2697 0.4792
                                         2.4121
##
## Coefficients:
##
                                            Estimate Std. Error z value Pr(>|z|)
                                           12.527932 29.279321 0.428 0.66874
## (Intercept)
```

```
## total yards
                                         0.001986
                                                   0.004748
                                                              0.418 0.67576
## total_catch_percent
                                       -19.427403 8.828657 -2.200 0.02777 *
                                                              0.325 0.74507
## total target percent
                                        7.566070 23.269776
                                     -40.735643 23.228878 -1.754 0.07949
## total_route_percent
## total_drop_percent
                                       70.108000 31.705112
                                                              2.211 0.02702 *
## total yprr
                                       -1.855030 1.279909 -1.449 0.14724
## total first downs
                                                             0.994 0.32003
                                        0.020272 0.020386
                                       -0.104399 0.134447 -0.777 0.43745
## total_yards_per_reception
## total_yards_after_catch_per_reception 0.264236
                                                   0.094945
                                                              2.783 0.00539 **
## total_player_game_count
                                                              0.604 0.54605
                                         0.184812
                                                   0.306141
## total_touchdowns
                                        -0.033726
                                                   0.077500 -0.435 0.66343
                                                             0.111 0.91137
## total_yards_per_game
                                         0.015386
                                                   0.138234
## total_targets_per_game
                                        -0.566301 0.680850 -0.832 0.40555
                                         0.042907
                                                             1.144 0.25259
## total_targeted_qb_rating
                                                   0.037503
## grades_hands_drop
                                         0.196265
                                                   0.078286
                                                              2.507 0.01218 *
                                                   0.020169 -0.163 0.87024
## grades_hands_fumble
                                        -0.003295
                                                              2.240 0.02507 *
## grades_offense
                                         0.542966
                                                   0.242367
## grades pass route
                                       -0.307082
                                                   0.251826 -1.219 0.22269
## Power5_draft1
                                        -0.035586 0.587581 -0.061 0.95171
                                         0.222541
## Height
                                                   0.168369
                                                              1.322 0.18625
                                        -0.015194 0.025377 -0.599 0.54933
## Weight
## Arm
                                         0.172274 0.259128
                                                              0.665 0.50616
                                        -0.354861
                                                   0.519368 -0.683 0.49445
## Hand
                                        -4.378687
## X40.Yard
                                                   2.747316 -1.594 0.11098
## Broad
                                         0.007465
                                                   ## Vertical
                                         0.078267
                                                   0.078576 0.996 0.31922
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
##
      Null deviance: 226.57 on 186 degrees of freedom
## Residual deviance: 150.31 on 160 degrees of freedom
## AIC: 204.31
## Number of Fisher Scoring iterations: 6
pred_dec_2 <- predict(decent_starter_com2_res, test, type = "response")</pre>
pred_dec_2 <- as.integer(pred_dec_2>0.5)
conf_dec_2 <- confusionMatrix(as.factor(pred_dec_2),test$decentStarter)</pre>
conf_dec_2
## Confusion Matrix and Statistics
##
##
            Reference
## Prediction 0 1
##
           0 46 13
           1 10 10
##
##
##
                 Accuracy : 0.7089
##
                   95% CI: (0.5958, 0.8057)
##
      No Information Rate: 0.7089
##
      P-Value [Acc > NIR] : 0.5560
##
```

```
##
                    Kappa: 0.2665
##
##
   Mcnemar's Test P-Value: 0.6767
##
##
              Sensitivity: 0.8214
##
              Specificity: 0.4348
           Pos Pred Value: 0.7797
##
           Neg Pred Value: 0.5000
##
               Prevalence: 0.7089
##
##
            Detection Rate: 0.5823
##
      Detection Prevalence: 0.7468
##
         Balanced Accuracy: 0.6281
##
##
          'Positive' Class: 0
##
great_starter_com <- combine_cleaned %>%
 select(-c(player_id, player, position, team_name_draft, scoredTouchDown, playedA_Yr, decentStarter, e
set.seed(3)
index<-createDataPartition(great_starter_com$greatStarter,p=0.7,list=FALSE)
train<-great_starter_com[index,]</pre>
test<-great_starter_com[-index,]</pre>
great_starter_com_res <- glm(greatStarter~., data=train, family = "binomial")</pre>
## Warning: glm.fit: algorithm did not converge
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
summary(great_starter_com_res)
##
## Call:
## glm(formula = greatStarter ~ ., family = "binomial", data = train)
##
## Deviance Residuals:
##
         Min
                      1Q
                              Median
                                               3Q
                                                         Max
## -6.128e-05 -2.100e-08 -2.100e-08 -2.100e-08
                                                    5.545e-05
## Coefficients: (8 not defined because of singularities)
##
                                          Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                                          1.042e+04 5.517e+07
                                                                0.000
                                                                         1.000
## player_game_count_draft
                                         6.922e+01 2.100e+05
                                                                0.000
                                                                         1.000
                                         2.813e+01 3.677e+04
                                                                0.001
                                                                         0.999
## caught_percent_draft
## drop_rate_draft
                                         2.972e+01 3.221e+04
                                                                0.001
                                                                         0.999
## drops_draft
                                         6.103e+01 6.174e+04
                                                                0.001
                                                                         0.999
## first_downs_draft
                                        -2.230e+00 1.293e+04
                                                                0.000 1.000
                                         6.355e+00 2.875e+04
                                                                0.000
## grades_hands_drop_draft
                                                                         1.000
## grades_hands_fumble_draft
                                         2.977e+01 2.324e+04
                                                                0.001
                                                                          0.999
## grades_offense_draft
                                         1.008e+02 2.638e+05
                                                               0.000
                                                                         1.000
                                        -7.401e+01 2.612e+05
                                                               0.000
                                                                         1.000
## grades_pass_route_draft
                                         1.657e+01 3.807e+04
## pass_plays_draft
                                                               0.000
                                                                         1.000
```

```
## receptions_draft
                                        1.444e+01 4.200e+04
                                                                0.000
                                                                         1.000
                                        -1.067e+02 1.424e+05 -0.001
                                                                         0.999
## route_rate_draft
## routes_draft
                                        -1.941e+01 4.087e+04
                                                                0.000
                                                                         1.000
                                        -3.008e-01 1.162e+04
## targeted_qb_rating_draft
                                                                0.000
                                                                         1.000
## targets_draft
                                        -6.759e+00 4.162e+04
                                                                0.000
                                                                         1.000
                                        1.270e+01 2.479e+04
                                                                0.001
## touchdowns draft
                                                                         1.000
## yards draft
                                        -1.426e+00 2.860e+03
                                                                0.000
                                                                         1.000
                                         3.405e-01 3.023e+03
## yards_after_catch_draft
                                                                0.000
                                                                         1.000
## yards_after_catch_per_reception_draft 1.922e+01 1.003e+05
                                                                0.000
                                                                         1.000
## yards_per_reception_draft
                                        3.267e+01 9.916e+04
                                                                0.000
                                                                         1.000
## yprr_draft
                                        -2.925e+02 3.275e+05
                                                               -0.001
                                                                         0.999
                                         1.914e+02 1.218e+05
                                                                0.002
## player_game_count_pre
                                                                         0.999
                                        -1.045e+01 2.918e+04
                                                                0.000
                                                                         1.000
## caught_percent_pre
                                         5.579e+00 8.636e+04
                                                                0.000
## drop_rate_pre
                                                                         1.000
                                         6.957e+01 7.904e+04
                                                                0.001
## drops_pre
                                                                         0.999
                                         3.797e+00 4.439e+03
                                                                0.001
                                                                         0.999
## first_downs_pre
                                                                0.000
## grades_hands_drop_pre
                                        -1.991e+00 4.868e+04
                                                                         1.000
## grades_hands_fumble_pre
                                        2.739e+01 2.804e+04
                                                                0.001
                                                                         0.999
                                         2.101e+01 2.771e+05
                                                                0.000
## grades_offense_pre
                                                                         1.000
## grades_pass_route_pre
                                         7.598e+00 2.837e+05
                                                                0.000
                                                                         1.000
## pass_plays_pre
                                         4.080e+01 4.205e+04
                                                                0.001
                                                                         0.999
                                         2.225e+01 3.970e+04
                                                                0.001
## receptions_pre
                                                                         1.000
                                        3.407e+01 7.864e+04
                                                                0.000
## route_rate_pre
                                                                         1.000
                                        -4.240e+01 4.661e+04 -0.001
## routes_pre
                                                                         0.999
## targeted_qb_rating_pre
                                        -9.444e-01 3.196e+03
                                                                0.000
                                                                         1.000
## targets_pre
                                        -3.355e+01 4.506e+04 -0.001
                                                                         0.999
                                        -8.974e-01 1.218e+04
                                                                0.000
                                                                         1.000
## touchdowns_pre
                                                                0.000
## yards_pre
                                         2.621e-01 4.637e+03
                                                                         1.000
                                        -1.568e+00 3.535e+03
                                                                0.000
## yards_after_catch_pre
                                                                         1.000
## yards_after_catch_per_reception_pre
                                         1.445e+02 5.194e+04
                                                                0.003
                                                                         0.998
## yards_per_reception_pre
                                        -8.082e+01 5.992e+04
                                                               -0.001
                                                                         0.999
## yprr_pre
                                         5.859e+01 8.360e+05
                                                                0.000
                                                                         1.000
## total_yards
                                                NA
                                                           NA
                                                                   NA
                                                                            NA
                                        -4.658e+03 6.531e+06
                                                               -0.001
                                                                         0.999
## total_catch_percent
## total_target_percent
                                        -1.850e+03 6.519e+06
                                                                0.000
                                                                         1.000
                                        2.834e+04 4.033e+07
## total_route_percent
                                                                0.001
                                                                         0.999
                                       -8.077e+03 2.877e+07
## total_drop_percent
                                                                0.000
                                                                         1.000
## total_yprr
                                                                   NA
                                                NΔ
                                                           NΑ
                                                                            NΑ
## total_first_downs
                                                NA
                                                           NA
                                                                   NA
                                                                            NΑ
                                                NA
                                                           NA
                                                                   NA
                                                                            NA
## total_yards_per_reception
## total_yards_after_catch_per_reception
                                                NA
                                                                            NA
## total_player_game_count
                                                NA
                                                           NA
                                                                   NA
                                                                            NA
## total_touchdowns
                                                NA
                                                                   NA
                                                                            NA
                                         3.754e+01 8.342e+04
                                                                0.000
                                                                         1.000
## total_yards_per_game
                                                                0.000
## total_yards_after_catch_per_game
                                        -2.044e+01 6.858e+04
                                                                         1.000
                                         9.968e+01 7.578e+05
                                                                0.000
                                                                         1.000
## total_targets_per_game
## total_targeted_qb_rating
                                                NA
                                                           NA
                                                                   NA
                                                                            NA
                                         2.333e+03 5.945e+06
## games_draft
                                                                0.000
                                                                         1.000
## grades_hands_drop
                                         1.408e+01 7.285e+04
                                                                0.000
                                                                         1.000
## grades_hands_fumble
                                        -5.283e+01 5.325e+04
                                                               -0.001
                                                                         0.999
                                                                0.000
## grades_offense
                                       -9.316e+01 5.241e+05
                                                                         1.000
## grades_pass_route
                                        4.544e+01 5.310e+05
                                                                0.000
                                                                         1.000
## Power5 draft1
                                        1.207e+01 7.104e+04
                                                                0.000
                                                                         1.000
                                        -1.976e+01 1.789e+04 -0.001
## Date
                                                                         0.999
```

```
-5.350e+01 1.195e+05
## TitlePro Day
                                                                 0.000
                                                                          1.000
## Height
                                          1.621e+01 2.283e+04
                                                                 0.001
                                                                          0.999
## Weight
                                         -3.758e+00 3.932e+03 -0.001
                                                                          0.999
                                          2.583e+01 3.060e+04
                                                                 0.001
                                                                          0.999
## Arm
## Hand
                                          2.804e+01 9.358e+04
                                                                 0.000
                                                                          1.000
## X40.Yard
                                          6.749e+02 2.956e+05
                                                                 0.002
                                                                          0.998
## Vertical
                                          1.952e+01 2.213e+04
                                                                 0.001
                                                                          0.999
                                          3.080e+00 2.148e+03
## Broad
                                                                 0.001
                                                                          0.999
##
## (Dispersion parameter for binomial family taken to be 1)
##
##
      Null deviance: 1.6761e+02 on 185 degrees of freedom
## Residual deviance: 6.9062e-08 on 121 degrees of freedom
     (2 observations deleted due to missingness)
## AIC: 130
##
## Number of Fisher Scoring iterations: 25
pred_great <- predict(great_starter_com_res, test, type = "response")</pre>
## Warning in predict.lm(object, newdata, se.fit, scale = 1, type = if (type == :
## prediction from a rank-deficient fit may be misleading
pred_great <- as.integer(pred_great>0.5)
conf_great <- confusionMatrix(as.factor(pred_great),test$greatStarter)</pre>
conf_great
## Confusion Matrix and Statistics
##
##
             Reference
## Prediction 0 1
            0 43
##
            1 21 4
##
##
                  Accuracy: 0.6184
##
                    95% CI: (0.4998, 0.7275)
##
      No Information Rate: 0.8421
##
      P-Value [Acc > NIR] : 1.00000
##
##
                     Kappa: 0.0036
##
   Mcnemar's Test P-Value: 0.02586
##
##
               Sensitivity: 0.6719
##
               Specificity: 0.3333
##
            Pos Pred Value: 0.8431
##
            Neg Pred Value: 0.1600
##
                Prevalence: 0.8421
##
            Detection Rate: 0.5658
##
     Detection Prevalence: 0.6711
##
         Balanced Accuracy: 0.5026
##
##
          'Positive' Class: 0
##
```

```
set.seed(1)
great_starter_com2 <- great_starter_com %>%
 select(total_yards, total_target_percent, total_route_percent, total_drop_percent, total_yprr, total_
index<-createDataPartition(great_starter_com2$greatStarter,p=0.7,list=FALSE)
train<-great_starter_com2[index,]</pre>
test<-great_starter_com2[-index,]</pre>
great_starter_com2_res <- glm(greatStarter~., data=train, family = "binomial")</pre>
summary(great starter com2 res)
##
## Call:
## glm(formula = greatStarter ~ ., family = "binomial", data = train)
## Deviance Residuals:
       Min
                 10
                       Median
                                    3Q
                                             Max
## -2.02726 -0.49535 -0.27349 -0.06297
                                         3.13976
## Coefficients:
##
                                        Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                                      -75.876298 31.166393 -2.435 0.0149 *
## total_yards
                                       -0.001651
                                                 0.005072 -0.325
                                                                     0.7449
## total_target_percent
                                       46.024536 30.298888
                                                            1.519
                                                                    0.1288
## total_route_percent
                                     -15.248270 17.549708 -0.869
                                                                    0.3849
## total_drop_percent
                                      90.868528 48.440140
                                                            1.876
                                                                    0.0607
                                                 1.599068 -2.449
## total_yprr
                                       -3.916860
                                                                    0.0143 *
## total_first_downs
                                        0.013007 0.019148
                                                            0.679
                                                                    0.4970
## total_yards_per_reception
                                        0.311365 0.127901 2.434 0.0149 *
## total_yards_after_catch_per_reception 0.216172 0.094729 2.282 0.0225 *
                                        0.306727
## total_player_game_count
                                                  0.377723 0.812
                                                                    0.4168
## total_touchdowns
                                       -0.125568 0.085177 -1.474
                                                                     0.1404
## total_yards_per_game
                                       0.082197 0.152587 0.539
                                                                    0.5901
## total_targets_per_game
                                       -0.133977 0.773990 -0.173
                                                                    0.8626
## total_targeted_qb_rating
                                        0.081660 0.041551
                                                            1.965
                                                                    0.0494 *
## grades_hands_drop
                                       ## grades_hands_fumble
                                       -0.041248 0.024327 -1.696 0.0900 .
                                        0.207687
                                                  0.237377 0.875
## grades_offense
                                                                     0.3816
## grades_pass_route
                                        0.066750
                                                  0.251618
                                                            0.265
                                                                     0.7908
## Power5_draft1
                                        0.208495
                                                  0.669296 0.312
                                                                     0.7554
## Height
                                        0.473006
                                                  0.199517 2.371
                                                                     0.0178 *
## Weight
                                       -0.043439
                                                  0.027201 -1.597
                                                                     0.1103
## Arm
                                        0.322431
                                                  0.291931
                                                            1.104
                                                                    0.2694
                                                            1.308 0.1909
## Hand
                                        0.877814 0.671164
## X40.Yard
                                       -4.549636
                                                  3.411974 -1.333
                                                                    0.1824
                                                            1.073
## Broad
                                        0.019586
                                                  0.018258
                                                                     0.2834
## Vertical
                                        0.087968
                                                  0.096228
                                                             0.914
                                                                     0.3606
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
      Null deviance: 168.33 on 187 degrees of freedom
## Residual deviance: 114.90 on 162 degrees of freedom
## AIC: 166.9
```

```
##
## Number of Fisher Scoring iterations: 7
pred_great_2 <- predict(great_starter_com2_res, test, type = "response")</pre>
pred_great_2 <- as.integer(pred_great_2>0.5)
conf_great_2 <- confusionMatrix(as.factor(pred_great_2),test$greatStarter)</pre>
conf_great_2
## Confusion Matrix and Statistics
##
##
             Reference
## Prediction 0 1
            0 55 8
##
##
            1 11 4
##
##
                  Accuracy: 0.7564
                    95% CI: (0.646, 0.8465)
##
       No Information Rate: 0.8462
##
       P-Value [Acc > NIR] : 0.9870
##
##
##
                     Kappa: 0.1512
##
##
   Mcnemar's Test P-Value: 0.6464
##
##
               Sensitivity: 0.8333
##
               Specificity: 0.3333
##
            Pos Pred Value: 0.8730
##
            Neg Pred Value: 0.2667
##
                Prevalence: 0.8462
            Detection Rate: 0.7051
##
##
      Detection Prevalence: 0.8077
##
         Balanced Accuracy: 0.5833
##
          'Positive' Class: 0
##
```

Predicting NFL Success for Players in College

more interested in modeling great and decent starter, played a year, contributor

```
player_id
                          player position team_name_draft player_game_count_draft
## 1
         10649
                   Corey Coleman
                                        WR.
                                                     BAYLOR
                                                                                   12
## 2
         10655
                                        WR
                                                 NOTRE DAME
                                                                                   13
                   Will Fuller V
## 3
         10656
                                                        TCU
                                                                                   10
                    Josh Doctson
                                        WR
## 4
         10657 Laquon Treadwell
                                        WR
                                                   OLE MISS
                                                                                   13
## 5
         10674 Sterling Shepard
                                        WR
                                                   OKLAHOMA
                                                                                   13
         10681
                 Michael Thomas
                                        WR
                                                 OHIO STATE
                                                                                   13
     caught_percent_draft drop_rate_draft drops_draft first_downs_draft
##
## 1
                      63.8
                                       11.9
                                                      10
## 2
                      62.0
                                       12.7
                                                       9
                                                                         40
## 3
                      72.2
                                        7.1
                                                       6
                                                                         62
## 4
                      67.2
                                        9.9
                                                       9
                                                                         54
## 5
                                                       4
                      72.9
                                        4.4
                                                                         64
                                                       4
## 6
                      67.5
                                        6.7
     grades_hands_drop_draft grades_hands_fumble_draft grades_offense_draft
## 1
                         56.9
                                                     79.5
                                                                           90.0
## 2
                         53.3
                                                     74.8
                                                                           77.2
## 3
                                                     76.3
                         77.4
                                                                            92.9
## 4
                         63.2
                                                     56.3
                                                                            85.3
## 5
                                                     76.4
                         83.4
                                                                           91.5
## 6
                         73.5
                                                     74.3
                                                                           83.4
     grades_pass_route_draft pass_plays_draft receptions_draft route_rate_draft
## 1
                         90.4
                                            367
                                                                74
## 2
                         75.7
                                            458
                                                                62
                                                                                94.5
## 3
                                            347
                                                                78
                                                                                93.7
                         93.0
## 4
                         85.2
                                            494
                                                                82
                                                                                95.1
## 5
                         90.8
                                            469
                                                                86
                                                                                95.5
## 6
                         83.4
                                            320
                                                                                96.3
     routes_draft targeted_qb_rating_draft targets_draft touchdowns_draft
## 1
              342
                                       133.1
                                                        116
## 2
              433
                                       124.6
                                                        100
                                                                            14
## 3
              325
                                       149.2
                                                        108
                                                                            14
## 4
              470
                                       106.9
                                                        122
                                                                            11
## 5
               448
                                       135.9
                                                        118
                                                                            11
## 6
              308
                                       133.7
                                                         83
##
     yards_draft yards_after_catch_draft yards_after_catch_per_reception_draft
## 1
            1365
                                       569
## 2
            1259
                                       414
                                                                                6.7
## 3
            1327
                                       310
                                                                                4.0
                                       442
## 4
            1148
                                                                                5.4
## 5
            1289
                                       495
                                                                                5.8
## 6
             781
                                       271
     yards_per_reception_draft yprr_draft team_name_pre player_game_count_pre
## 1
                                       3.99
                           18.4
                                                    BAYLOR
                                                                                10
## 2
                           20.3
                                       2.91
                                                NOTRE DAME
                                                                                13
## 3
                           17.0
                                       4.08
                                                       TCU
                                                                                13
## 4
                                       2.44
                                                  OLE MISS
                                                                                 9
                           14.0
## 5
                                       2.88
                                                  OKLAHOMA
                                                                                10
                           15.0
## 6
                           13.9
                                       2.54
                                                OHIO STATE
                                                                                15
##
     caught_percent_pre drop_rate_pre drops_pre first_downs_pre
## 1
                    70.3
                                    9.9
                                                7
                                                                  1
                                                                  0
## 2
                    68.5
                                   12.6
                                                11
## 3
                    60.7
                                    3.0
                                                 2
                                                                  0
                                                 3
## 4
                    66.2
                                    5.8
```

```
## 5
                    62.2
                                    1.9
                                                 1
                                                                   0
## 6
                    73.0
                                    1.8
                                                 1
                                                                   0
##
     grades_hands_drop_pre grades_hands_fumble_pre grades_offense_pre
                                                 77.2
## 1
                       58.0
## 2
                       53.7
                                                 75.8
                                                                      75.0
## 3
                       81.8
                                                 29.6
                                                                      75.9
## 4
                       75.4
                                                 74.3
                                                                      75.2
                                                 75.9
                                                                      85.8
## 5
                       88.0
## 6
                       89.0
                                                 47.4
                                                                      77.6
##
     grades_pass_route_pre pass_plays_pre receptions_pre route_rate_pre routes_pre
                       83.8
                                         324
                                                          64
                                                                        96.3
                                                                                     312
## 2
                       76.8
                                                          76
                                                                        95.7
                                         533
                                                                                     510
## 3
                                                                                     440
                       75.0
                                         461
                                                          65
                                                                        95.4
## 4
                       75.6
                                         319
                                                                        96.2
                                                                                     307
                                                          49
## 5
                       86.9
                                         262
                                                          51
                                                                        96.2
                                                                                     252
## 6
                       78.7
                                         303
                                                          54
                                                                        96.4
                                                                                     292
##
     targeted_qb_rating_pre targets_pre touchdowns_pre yards_pre
## 1
                       146.9
                                       91
                                                        11
## 2
                       136.0
                                       111
                                                        15
                                                                 1094
## 3
                       126.6
                                       107
                                                        11
                                                                 1018
## 4
                       115.7
                                        74
                                                         5
                                                                  638
## 5
                       103.2
                                        82
                                                         5
                                                                  970
                                        74
                                                                  799
## 6
                       130.6
                                                         9
     yards_after_catch_pre yards_after_catch_per_reception_pre
##
## 1
                         421
## 2
                         420
                                                               5.5
                                                               5.6
## 3
                         361
## 4
                         313
                                                               6.4
## 5
                         343
                                                               6.7
## 6
                         413
                                                               7.6
##
     yards_per_reception_pre yprr_pre total_yards total_catch_percent
## 1
                         17.5
                                   3.59
                                                2484
                                                                 0.6666667
## 2
                                                2353
                          14.4
                                   2.15
                                                                 0.6540284
## 3
                          15.7
                                   2.31
                                                2345
                                                                 0.6651163
## 4
                          13.0
                                   2.08
                                                1786
                                                                 0.6683673
## 5
                          19.0
                                   3.85
                                                2259
                                                                 0.6850000
## 6
                          14.8
                                   2.74
                                                1580
                                                                 0.7006369
##
     total_target_percent total_route_percent total_drop_percent total_yprr
## 1
                 0.3165138
                                      0.9464544
                                                          0.08212560
                                                                            7.58
## 2
                                                                            5.06
                 0.2237540
                                      0.9515641
                                                          0.09478673
## 3
                 0.2810458
                                      0.9467822
                                                          0.03720930
                                                                            6.39
## 4
                 0.2522523
                                      0.9557196
                                                          0.06122449
                                                                            4.52
## 5
                 0.2857143
                                                          0.02500000
                                                                            6.73
                                      0.9575923
## 6
                 0.2616667
                                      0.9630819
                                                          0.03184713
                                                                            5.28
     total_first_downs total_yards_per_reception
## 1
                     52
                                               35.9
## 2
                                               34.7
                     40
## 3
                     62
                                               32.7
## 4
                     55
                                               27.0
## 5
                     64
                                               34.0
## 6
                     39
                                               28.7
     total_yards_after_catch_per_reception total_player_game_count
##
## 1
                                         14.3
                                                                     22
## 2
                                         12.2
                                                                     26
```

```
## 3
                                       9.6
                                                                 23
## 4
                                       11.8
                                                                 22
## 5
                                       12.5
                                                                 23
                                       12.4
## 6
                                                                 28
##
     total_touchdowns total_yards_per_game total_yards_after_catch_per_game
## 1
                   31
                                112.90909
                                                                    45.00000
## 2
                                                                    32.07692
                                  90.50000
## 3
                   25
                                 101.95652
                                                                    29.17391
## 4
                   16
                                  81.18182
                                                                    34.31818
## 5
                   16
                                  98.21739
                                                                    36.43478
## 6
                   18
                                  56.42857
                                                                    24.42857
##
     total_targets_per_game total_targeted_qb_rating games_draft grades_hands_drop
## 1
                   9.409091
                                               140.00
                                                       0.5454545
                                                                           57,40000
## 2
                   8.115385
                                               130.30 0.5000000
                                                                           53.50000
## 3
                   9.347826
                                               137.90 0.4347826
                                                                           79.88696
## 4
                   8.909091
                                               111.30
                                                       0.5909091
                                                                           68.19091
## 5
                   8.695652
                                               119.55
                                                        0.5652174
                                                                           85.40000
## 6
                   5.607143
                                               132.15
                                                        0.4642857
                                                                           81.80357
##
     grades_hands_fumble grades_offense grades_pass_route Power5_draft Power5_pre
## 1
               78.45455
                               86.04545
                                                 87.40000
## 2
               75.30000
                               76.10000
                                                 76.25000
                                                                      1
                                                                                  1
## 3
               49.90435
                              83.29130
                                                 82.82609
                                                                                  1
## 4
                               81.16818
                                                 81.27273
               63.66364
                                                                      1
                                                                                  1
                76.18261
                               89.02174
                                                 89.10435
## 5
                                                                                  1
## 6
                59.88929
                               80.29286
                                                  80.88214
                                                                                  1
    playedA_Yr scoredTouchDown decentStarter greatStarter eliteStarter
## 1
                              1
                                             1
                                                          0
              0
                                            0
                                                          0
                                                                       0
## 2
                                                                       0
## 3
                              1
                                            1
                                                          1
              1
## 4
                              0
                                            1
                                                          0
                                                                       0
              1
## 5
              1
                              1
                                             1
                                                          1
                                                                       0
## 6
              0
                                                          0
                                                                       0
snap_model_coll_df <- college_data %>%
  select(-c(player_id, player, position, team_name_draft, scoredTouchDown, decentStarter, greatStarter,
decent_starter_coll_df <- college_data %>%
  select(-c(player_id, player, position, team_name_draft, scoredTouchDown, playedA_Yr, greatStarter, el
great_starter_coll_df <- college_data %>%
  select(-c(player_id, player, position, team_name_draft, scoredTouchDown, playedA_Yr, decentStarter, e
set.seed(1)
index<-createDataPartition(snap_model_coll_df$playedA_Yr,p=0.7,list=FALSE)
train<-snap_model_coll_df[index,]</pre>
test<-snap_model_coll_df[-index,]</pre>
snap_model_coll <- glm(playedA_Yr~., data=train, family = "binomial")</pre>
summary(snap_model_coll)
##
## Call:
```

glm(formula = playedA_Yr ~ ., family = "binomial", data = train)

```
##
## Deviance Residuals:
      Min
                10
                     Median
                                          Max
##
  -2.2086 -0.2554 -0.0776 -0.0138
                                       3.5581
## Coefficients: (8 not defined because of singularities)
                                          Estimate Std. Error z value Pr(>|z|)
                                        -42.691838 51.015206 -0.837
## (Intercept)
                                                                       0.4027
## player_game_count_draft
                                          1.049727
                                                    0.576480
                                                               1.821
                                                                       0.0686
## caught_percent_draft
                                        -0.114606
                                                    0.130669 -0.877
                                                                       0.3804
## drop_rate_draft
                                         0.107275
                                                    0.153704
                                                               0.698
                                                                       0.4852
                                                    0.247654
                                                               1.474
## drops_draft
                                         0.365025
                                                                       0.1405
## first_downs_draft
                                        -0.071116
                                                    0.062931 -1.130
                                                                       0.2585
                                         0.109276
## grades_hands_drop_draft
                                                    0.115506
                                                               0.946
                                                                       0.3441
                                                    0.074645
                                                               1.126
## grades_hands_fumble_draft
                                         0.084031
                                                                       0.2603
## grades_offense_draft
                                        -0.067607
                                                    0.833723
                                                              -0.081
                                                                       0.9354
                                                               0.039
## grades_pass_route_draft
                                         0.031468
                                                    0.813659
                                                                       0.9691
## pass_plays_draft
                                        -0.077109
                                                    0.117768
                                                              -0.655
                                                                       0.5126
                                        -0.014868
                                                    0.086408 -0.172
## receptions_draft
                                                                       0.8634
## route_rate_draft
                                        -0.474070
                                                    0.540199 -0.878
                                                                       0.3802
## routes_draft
                                         0.070161
                                                    0.122967
                                                               0.571
                                                                       0.5683
                                         0.031912
                                                               1.562
## targeted_qb_rating_draft
                                                    0.020427
                                                                       0.1182
                                         0.158991
                                                               1.433
## targets_draft
                                                    0.110969
                                                                       0.1519
                                                    0.094677 -0.149
## touchdowns draft
                                         -0.014137
                                                                       0.8813
## yards draft
                                         -0.010216
                                                    0.010155 -1.006
                                                                       0.3144
                                                    0.010234 -0.291
## yards_after_catch_draft
                                         -0.002976
                                                                       0.7712
## yards_after_catch_per_reception_draft -0.082367
                                                    0.241946 -0.340
                                                                       0.7335
## yards_per_reception_draft
                                          0.234516
                                                    0.165024
                                                               1.421
                                                                       0.1553
                                                    1.689318 -0.573
## yprr_draft
                                         -0.968257
                                                                       0.5665
## player_game_count_pre
                                         -0.313893
                                                    0.589625 -0.532
                                                                       0.5945
## caught_percent_pre
                                         -0.068278
                                                    0.060188
                                                              -1.134
                                                                       0.2566
## drop_rate_pre
                                         -0.165699
                                                    0.121593 -1.363
                                                                       0.1730
## drops_pre
                                        -0.237408
                                                    0.209318 -1.134
                                                                       0.2567
                                                               0.308
                                         0.004595
                                                    0.014934
                                                                       0.7583
## first_downs_pre
## grades_hands_drop_pre
                                        -0.052139
                                                    0.115713
                                                              -0.451
                                                                       0.6523
## grades_hands_fumble_pre
                                        0.105032
                                                    0.072452
                                                               1.450
                                                                       0.1471
## grades_offense_pre
                                         0.235073
                                                    0.788323
                                                               0.298
                                                                       0.7656
## grades_pass_route_pre
                                        -0.287980
                                                    0.772319 -0.373
                                                                       0.7092
                                         0.063191
                                                    0.092813
                                                               0.681
## pass_plays_pre
                                                                       0.4960
                                                    0.084957 -1.044
## receptions_pre
                                        -0.088683
                                                                       0.2965
                                                               0.272
## route_rate_pre
                                         0.075762
                                                    0.278805
                                                                       0.7858
                                        -0.071365
                                                    0.097478 -0.732
                                                                       0.4641
## routes_pre
## targeted_qb_rating_pre
                                         0.033440
                                                    0.018302
                                                               1.827
                                                                       0.0677
                                                    0.102030
                                                               1.611
## targets_pre
                                          0.164384
                                                                       0.1072
## touchdowns_pre
                                         -0.031453
                                                    0.102490 -0.307
                                                                       0.7589
                                         -0.004705
                                                    0.009786 -0.481
## yards_pre
                                                                       0.6306
## yards_after_catch_pre
                                         -0.008916
                                                    0.009973 -0.894
                                                                       0.3713
## yards_after_catch_per_reception_pre
                                          0.036004
                                                    0.164212
                                                               0.219
                                                                       0.8265
## yards_per_reception_pre
                                         -0.104765
                                                    0.138798
                                                              -0.755
                                                                       0.4504
## yprr_pre
                                         -1.349522
                                                    1.266751
                                                              -1.065
                                                                       0.2867
## total_yards
                                               NA
                                                          NA
                                                                  NA
                                                                           NA
## total_catch_percent
                                          4.579795 15.389699
                                                               0.298
                                                                       0.7660
                                        -7.519418 24.213991
## total_target_percent
                                                              -0.311
                                                                       0.7562
## total_route_percent
                                         59.696991 82.027840
                                                               0.728
                                                                       0.4668
```

```
40.485027 29.800687
                                                                1.359
                                                                        0.1743
## total_drop_percent
## total_yprr
                                                NA
                                                           NA
                                                                   NΑ
                                                                            NΑ
                                                NA
## total first downs
                                                           NA
                                                                   NA
                                                                            NA
## total_yards_per_reception
                                                NΑ
                                                           NA
                                                                   NA
                                                                            NA
## total_yards_after_catch_per_reception
                                                NA
                                                           NA
                                                                   NA
                                                                            NA
## total_player_game_count
                                                NA
                                                           NA
                                                                   NA
                                                                            NA
## total touchdowns
                                                           NA
                                                                   NA
                                                NA
                                                                            NA
## total_yards_per_game
                                          0.239162
                                                     0.254156
                                                                0.941
                                                                        0.3467
                                          0.218943
## total_yards_after_catch_per_game
                                                     0.234595
                                                                0.933
                                                                        0.3507
                                         -2.635227
                                                     2.417822 -1.090
                                                                        0.2757
## total_targets_per_game
## total_targeted_qb_rating
                                                NA
                                                           NA
                                                                   NA
                                                                            NA
                                        -18.001466 21.635138 -0.832
                                                                        0.4054
## games_draft
                                          0.074586 0.193744
                                                               0.385 0.7003
## grades_hands_drop
## grades_hands_fumble
                                         -0.190009 0.143884 -1.321
                                                                        0.1866
## grades_offense
                                          0.080618 1.650037
                                                               0.049
                                                                        0.9610
                                          0.215906 1.614243
                                                                0.134
## grades_pass_route
                                                                        0.8936
                                          2.007177 0.481188
## Power5_draft1
                                                                4.171 3.03e-05
##
## (Intercept)
## player_game_count_draft
## caught_percent_draft
## drop_rate_draft
## drops_draft
## first downs draft
## grades_hands_drop_draft
## grades_hands_fumble_draft
## grades_offense_draft
## grades_pass_route_draft
## pass_plays_draft
## receptions_draft
## route_rate_draft
## routes_draft
## targeted_qb_rating_draft
## targets_draft
## touchdowns draft
## yards_draft
## yards after catch draft
## yards_after_catch_per_reception_draft
## yards_per_reception_draft
## yprr_draft
## player_game_count_pre
## caught_percent_pre
## drop_rate_pre
## drops_pre
## first_downs_pre
## grades_hands_drop_pre
## grades_hands_fumble_pre
## grades_offense_pre
## grades_pass_route_pre
## pass_plays_pre
## receptions_pre
## route_rate_pre
## routes_pre
## targeted_qb_rating_pre
```

```
## targets_pre
## touchdowns_pre
## yards pre
## yards_after_catch_pre
## yards_after_catch_per_reception_pre
## yards_per_reception_pre
## yprr_pre
## total_yards
## total_catch_percent
## total_target_percent
## total_route_percent
## total_drop_percent
## total_yprr
## total_first_downs
## total_yards_per_reception
## total_yards_after_catch_per_reception
## total_player_game_count
## total touchdowns
## total_yards_per_game
## total_yards_after_catch_per_game
## total_targets_per_game
## total_targeted_qb_rating
## games_draft
## grades_hands_drop
## grades_hands_fumble
## grades_offense
## grades_pass_route
## Power5_draft1
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
##
       Null deviance: 437.59 on 750 degrees of freedom
## Residual deviance: 231.72 on 695 degrees of freedom
     (32 observations deleted due to missingness)
## AIC: 343.72
##
## Number of Fisher Scoring iterations: 9
set.seed(12321)
snap_model_coll_df2 <- snap_model_coll_df %>%
  select(total_yards, total_catch_percent, total_target_percent, total_route_percent, total_drop_percen
index<-createDataPartition(snap_model_coll_df2$playedA_Yr,p=0.7,list=FALSE)
train<-snap_model_coll_df2[index,]</pre>
test <- snap_model_coll_df2[-index,]
snap_model_coll_2 <- glm(playedA_Yr~., data=train, family = "binomial")</pre>
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
summary(snap_model_coll_2)
```

##

```
## Call:
## glm(formula = playedA_Yr ~ ., family = "binomial", data = train)
## Deviance Residuals:
      Min
                1Q
                    Median
                                 3Q
                                         Max
## -2.5203 -0.2614 -0.1064 -0.0336
                                      3.1842
## Coefficients:
                                         Estimate Std. Error z value Pr(>|z|)
##
                                       -40.990653 17.231426 -2.379 0.017368
## (Intercept)
## total_yards
                                         0.001121
                                                    0.002676
                                                             0.419 0.675440
                                       -12.395593
                                                    5.882604 -2.107 0.035104
## total_catch_percent
## total_target_percent
                                        17.170663 12.837720
                                                              1.338 0.181054
## total_route_percent
                                        14.227273 15.368739
                                                              0.926 0.354587
                                        29.020991 20.607355
                                                             1.408 0.159047
## total_drop_percent
## total_yprr
                                        -0.810107
                                                  0.724940 -1.117 0.263789
## total_first_downs
                                        -0.006886
                                                    0.013113 -0.525 0.599521
## total_yards_per_reception
                                         0.008915
                                                    0.082938
                                                              0.107 0.914401
## total_yards_after_catch_per_reception
                                                              1.002 0.316374
                                         0.062363
                                                    0.062243
## total_player_game_count
                                         0.251147
                                                    0.173116
                                                              1.451 0.146852
## total_touchdowns
                                        ## total_yards_per_game
                                         0.042474
                                                    0.086857
                                                              0.489 0.624837
                                                    0.415799 -1.016 0.309838
## total_targets_per_game
                                        -0.422270
                                                    0.023469
                                                              2.009 0.044543
## total_targeted_qb_rating
                                         0.047148
## games draft
                                         3.583940
                                                    2.738533
                                                             1.309 0.190633
## grades_hands_drop
                                         0.101012
                                                    0.053617
                                                              1.884 0.059571
## grades_hands_fumble
                                         0.005421
                                                    0.015036
                                                              0.361 0.718462
## grades_offense
                                         0.098440
                                                    0.131483
                                                              0.749 0.454047
                                                              0.101 0.919390
## grades_pass_route
                                         0.014669
                                                    0.144949
## Power5_draft1
                                         1.475763
                                                    0.420777
                                                              3.507 0.000453
##
## (Intercept)
## total_yards
## total_catch_percent
## total_target_percent
## total_route_percent
## total_drop_percent
## total_yprr
## total_first_downs
## total_yards_per_reception
## total_yards_after_catch_per_reception
## total_player_game_count
## total touchdowns
## total_yards_per_game
## total_targets_per_game
## total_targeted_qb_rating
## games_draft
## grades_hands_drop
## grades_hands_fumble
## grades_offense
## grades_pass_route
## Power5 draft1
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

```
##
## (Dispersion parameter for binomial family taken to be 1)
##
       Null deviance: 443.16 on 782 degrees of freedom
##
## Residual deviance: 245.61 on 762 degrees of freedom
## AIC: 287.61
## Number of Fisher Scoring iterations: 9
set.seed(1)
snap_model_coll_df3 <- snap_model_coll_df %>%
 select(total_yards, total_target_percent, total_drop_percent, total_yprr, total_yards_after_catch_per
index<-createDataPartition(snap model coll df2$playedA Yr,p=0.7,list=FALSE)
train<-snap_model_coll_df3[index,]</pre>
test <- snap model coll df3[-index,]
snap_model_coll_3 <- glm(playedA_Yr~., data=train, family = "binomial")</pre>
summary(snap_model_coll_3)
##
## Call:
## glm(formula = playedA_Yr ~ ., family = "binomial", data = train)
## Deviance Residuals:
       Min
                 1Q
                        Median
                                      3Q
                                               Max
## -2.67730 -0.31400 -0.14818 -0.05553
                                           2.99673
## Coefficients:
##
                                          Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                                        -2.398e+01 5.795e+00 -4.138 3.5e-05
## total_yards
                                        -6.105e-04 2.283e-03 -0.267 0.789166
## total_target_percent
                                         9.840e+00 1.022e+01 0.963 0.335699
                                         9.550e+00 1.827e+01
## total_drop_percent
                                                               0.523 0.601237
## total_yprr
                                        -7.736e-01 5.357e-01 -1.444 0.148737
## total_yards_after_catch_per_reception 7.874e-02 5.184e-02 1.519 0.128765
                                         2.433e-01 1.493e-01 1.630 0.103178
## total_player_game_count
## total touchdowns
                                         5.188e-02 4.875e-02 1.064 0.287280
## total_yards_per_game
                                         8.370e-02 7.398e-02 1.131 0.257866
## total_targets_per_game
                                        -5.262e-01 3.456e-01 -1.522 0.127946
## total_targeted_qb_rating
                                         3.515e-03 1.728e-02 0.203 0.838800
                                         5.004e+00 2.408e+00 2.078 0.037729
## games_draft
## grades_hands_drop
                                         1.107e-02 4.210e-02 0.263 0.792524
                                         1.348e-01 5.466e-02 2.466 0.013670
## grades_offense
                                         1.365e+00 3.798e-01 3.594 0.000325
## Power5_draft1
##
## (Intercept)
## total_yards
## total_target_percent
## total_drop_percent
## total vprr
## total_yards_after_catch_per_reception
## total_player_game_count
## total_touchdowns
## total_yards_per_game
```

total_targets_per_game

```
## total_targeted_qb_rating
## games_draft
## grades_hands_drop
## grades_offense
## Power5_draft1
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
       Null deviance: 443.16 on 782 degrees of freedom
## Residual deviance: 273.81 on 768 degrees of freedom
## AIC: 303.81
##
## Number of Fisher Scoring iterations: 8
pred_snap <- predict(snap_model_coll_3, test, type = "response")</pre>
pred_snap <- as.integer(pred_snap>0.5)
conf_snap <- confusionMatrix(as.factor(pred_snap),test$playedA_Yr)</pre>
conf_snap
## Confusion Matrix and Statistics
##
             Reference
##
## Prediction 0 1
##
           0 303 16
##
            1
              4 11
##
##
                  Accuracy : 0.9401
##
                    95% CI: (0.909, 0.963)
##
       No Information Rate: 0.9192
##
       P-Value [Acc > NIR] : 0.09201
##
##
                     Kappa: 0.4946
##
    Mcnemar's Test P-Value: 0.01391
##
##
               Sensitivity: 0.9870
##
##
               Specificity: 0.4074
##
            Pos Pred Value: 0.9498
            Neg Pred Value: 0.7333
##
##
               Prevalence: 0.9192
            Detection Rate: 0.9072
##
##
      Detection Prevalence: 0.9551
##
         Balanced Accuracy: 0.6972
##
          'Positive' Class: 0
##
##
set.seed(1)
decent_starter_coll_df2 <- decent_starter_coll_df %>%
  select(total_yards, total_catch_percent, total_target_percent, total_route_percent, total_drop_percen
index<-createDataPartition(decent_starter_coll_df2$decentStarter,p=0.7,list=FALSE)
```

```
train<-decent_starter_coll_df2[index,]</pre>
test<-decent_starter_coll_df2[-index,]</pre>
decent_starter_coll_df2 <- glm(decentStarter~., data=train, family = "binomial")</pre>
summary(decent_starter_coll_df2)
##
## Call:
## glm(formula = decentStarter ~ ., family = "binomial", data = train)
## Deviance Residuals:
##
       Min
                                    ЗQ
                 10
                       Median
                                             Max
## -2.01008 -0.23119 -0.07938 -0.02221
                                         3.13985
##
## Coefficients:
##
                                        Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                                      -3.140e+01 1.660e+01 -1.892 0.05854 .
## total_yards
                                      2.795e-03 3.046e-03 0.918 0.35871
## total_catch_percent
                                     -1.564e+01 6.108e+00 -2.560 0.01045 *
                                       1.904e+01 1.567e+01
                                                            1.215 0.22444
## total_target_percent
## total_route_percent
                                      6.612e+00 1.572e+01
                                                            0.421 0.67405
## total_drop_percent
                                      1.782e+01 2.072e+01 0.860 0.38997
## total_yprr
                                     -8.769e-01 8.026e-01 -1.092 0.27461
                                      7.123e-04 1.332e-02
## total first downs
                                                            0.053 0.95737
## total_yards_after_catch_per_reception 2.001e-01 6.389e-02 3.132 0.00174 **
## total_player_game_count
                                      2.602e-01 2.104e-01 1.237 0.21619
## total touchdowns
                                     -2.125e-02 6.222e-02 -0.341 0.73274
                                      2.492e-02 1.037e-01 0.240 0.81004
## total_yards_per_game
## total_targets_per_game
                                     -4.499e-01 4.801e-01 -0.937 0.34873
                                       5.400e-02 2.732e-02 1.976 0.04812 *
## total_targeted_qb_rating
## games_draft
                                       9.086e+00 4.020e+00
                                                            2.260 0.02382 *
## grades_hands_drop
                                       6.725e-02 5.483e-02 1.227 0.21996
                                                            0.113 0.90988
## grades_hands_fumble
                                       1.856e-03 1.640e-02
                                       2.758e-01 1.530e-01
                                                            1.803 0.07144
## grades_offense
## grades_pass_route
                                     -2.097e-01 1.689e-01 -1.242 0.21428
## Power5_draft1
                                       1.422e+00 4.460e-01 3.188 0.00143 **
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
##
      Null deviance: 398.18 on 782 degrees of freedom
## Residual deviance: 209.89 on 762 degrees of freedom
## AIC: 251.89
##
## Number of Fisher Scoring iterations: 9
set.seed(1)
decent_starter_coll_df2 <- decent_starter_coll_df %>%
  select(total_yards, total_target_percent, total_drop_percent, total_yprr, total_yards_after_catch_per
index<-createDataPartition(decent_starter_coll_df2$decentStarter,p=0.7,list=FALSE)
train<-decent_starter_coll_df2[index,]</pre>
test<-decent starter coll df2[-index,]
```

```
decent_starter_coll_2 <- glm(decentStarter~., data=train, family = "binomial")</pre>
summary(decent_starter_coll_2)
##
## Call:
## glm(formula = decentStarter ~ ., family = "binomial", data = train)
## Deviance Residuals:
       Min
                  1Q
                        Median
                                     3Q
                                              Max
                                          3.15033
## -1.67708 -0.25420 -0.11299 -0.04376
## Coefficients:
##
                                         Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                                                    6.170599 -2.746 0.006040
                                       -16.941980
## total_yards
                                         0.002777
                                                    0.002854 0.973 0.330586
## total target percent
                                        14.146895 13.023101
                                                             1.086 0.277350
## total_drop_percent
                                        -9.072099 22.251638 -0.408 0.683490
## total yprr
                                        -1.008886
                                                   0.683437 -1.476 0.139892
## total_yards_after_catch_per_reception 0.193209 0.054933
                                                              3.517 0.000436
## total_player_game_count
                                         0.130294
                                                    0.179295
                                                              0.727 0.467407
                                                              0.772 0.440246
## total_touchdowns
                                                    0.055585
                                         0.042900
## total_yards_per_game
                                         0.007639
                                                    0.092780
                                                              0.082 0.934379
## total_targets_per_game
                                        -0.447130 0.431074 -1.037 0.299621
## total_targeted_qb_rating
                                        0.009581 0.021482
                                                             0.446 0.655590
                                        ## grades_hands_drop
## grades_offense
                                         0.127492
                                                    0.061731
                                                               2.065 0.038896
                                         1.148162 0.411041
                                                             2.793 0.005217
## Power5_draft1
##
## (Intercept)
                                       **
## total_yards
## total_target_percent
## total_drop_percent
## total yprr
## total_yards_after_catch_per_reception ***
## total_player_game_count
## total_touchdowns
## total_yards_per_game
## total_targets_per_game
## total_targeted_qb_rating
## grades_hands_drop
## grades_offense
## Power5_draft1
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
```

Null deviance: 398.18 on 782 degrees of freedom

Residual deviance: 227.52 on 769 degrees of freedom

Number of Fisher Scoring iterations: 9

AIC: 255.52

```
pred_decent <- predict(decent_starter_coll_2, test, type = "response")</pre>
pred_decent <- as.integer(pred_snap>0.5)
conf_decent <- confusionMatrix(as.factor(pred_decent),test$decentStarter)</pre>
conf_decent
## Confusion Matrix and Statistics
##
##
             Reference
## Prediction 0 1
##
            0 304 15
##
            1
              7 8
##
##
                  Accuracy : 0.9341
##
                    95% CI: (0.902, 0.9583)
##
       No Information Rate: 0.9311
##
       P-Value [Acc > NIR] : 0.4693
##
##
                     Kappa: 0.3878
##
##
  Mcnemar's Test P-Value: 0.1356
##
##
               Sensitivity: 0.9775
##
               Specificity: 0.3478
##
            Pos Pred Value: 0.9530
##
            Neg Pred Value: 0.5333
##
                Prevalence: 0.9311
##
            Detection Rate: 0.9102
##
      Detection Prevalence: 0.9551
##
         Balanced Accuracy: 0.6627
##
##
          'Positive' Class: 0
##
set.seed(1)
great_starter_coll_df2 <- great_starter_coll_df %>%
  select(total_yards, total_target_percent, total_route_percent, total_drop_percent, total_yprr, total_
index<-createDataPartition(great_starter_coll_df2$greatStarter,p=0.7,list=FALSE)
train<-great_starter_coll_df2[index,]</pre>
test<-great_starter_coll_df2[-index,]</pre>
great_starter_coll_1 <- glm(greatStarter~., data=train, family = "binomial")</pre>
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
summary(great_starter_coll_1)
##
## glm(formula = greatStarter ~ ., family = "binomial", data = train)
## Deviance Residuals:
       Min
                 1Q Median
                                   3Q
                                           Max
## -1.4688 -0.1819 -0.0516 -0.0078
                                        3.3781
```

```
##
## Coefficients:
##
                                        Estimate Std. Error z value Pr(>|z|)
                                      -41.447023 23.210437 -1.786 0.07415
## (Intercept)
## total_yards
                                       -0.002783
                                                 0.004397 -0.633 0.52675
                                      28.962163 23.814180
## total_target_percent
                                                           1.216 0.22392
## total_route_percent
                                       2.074316 21.746924 0.095 0.92401
                                      20.066263 33.068275 0.607 0.54397
## total_drop_percent
## total_yprr
                                      -1.243429 1.232186 -1.009 0.31291
## total_first_downs
                                        ## total_yards_per_reception
                                        ## total_yards_after_catch_per_reception -0.010424 0.077543 -0.134 0.89306
## total_player_game_count
                                        0.498748 0.332015
                                                           1.502 0.13305
## total_touchdowns
                                      -0.043984 0.068809 -0.639 0.52268
                                       0.070178 0.136677
                                                           0.513 0.60763
## total_yards_per_game
                                        0.270271
## total_targets_per_game
                                                  0.698075
                                                            0.387 0.69863
                                       0.065024 0.030247
                                                            2.150 0.03158 *
## total_targeted_qb_rating
## grades hands drop
                                       0.048689 0.078717 0.619 0.53622
                                      ## grades_hands_fumble
## grades_offense
                                        0.020068 0.194315
                                                            0.103 0.91775
## grades_pass_route
                                        0.003048 0.206575
                                                            0.015 0.98823
## Power5_draft1
                                                            2.511 0.01203 *
                                        1.360195 0.541640
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
      Null deviance: 260.96 on 782 degrees of freedom
## Residual deviance: 156.37 on 764 degrees of freedom
## AIC: 194.37
##
## Number of Fisher Scoring iterations: 10
set.seed(1)
great_starter_coll_df2 <- great_starter_coll_df %>%
 select(total_yards, total_target_percent, total_drop_percent, total_yprr, total_yards_after_catch_per
index<-createDataPartition(great_starter_coll_df2$greatStarter,p=0.7,list=FALSE)
train<-great_starter_coll_df2[index,]</pre>
test<-great_starter_coll_df2[-index,]</pre>
great_starter_coll_2 <- glm(greatStarter~., data=train, family = "binomial")</pre>
summary(great_starter_coll_2)
##
## Call:
## glm(formula = greatStarter ~ ., family = "binomial", data = train)
## Deviance Residuals:
##
                                    3Q
       Min
                 1Q
                       Median
                                            Max
## -1.65278 -0.20380 -0.07558 -0.01670
                                         3.11871
##
## Coefficients:
##
                                        Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                                      -2.010e+01 9.168e+00 -2.193
                                      -7.314e-04 3.999e-03 -0.183
## total_yards
                                                                    0.8549
```

```
## total_target_percent
                                        -1.425e+00 1.197e+01 -0.119
                                                                        0.9052
## total_drop_percent
                                        -2.040e+01 3.012e+01 -0.677
                                                                        0.4981
                                         1.886e-01 4.334e-01
## total yprr
                                                                0.435
                                                                        0.6634
## total_yards_after_catch_per_reception -1.203e-02 7.505e-02 -0.160
                                                                        0.8726
## total_player_game_count
                                         4.108e-01 3.042e-01
                                                                1.350
                                                                        0.1769
## total touchdowns
                                        -4.645e-02 6.906e-02 -0.673
                                                                        0.5012
## total_yards_per_game
                                         2.217e-02 1.044e-01
                                                               0.212
                                                                        0.8318
## total_targets_per_game
                                         3.887e-01 4.243e-01
                                                                0.916
                                                                        0.3596
## total_targeted_qb_rating
                                         5.026e-02 2.699e-02
                                                               1.862
                                                                        0.0626 .
                                        -6.416e-02 6.702e-02 -0.957
## grades_hands_drop
                                                                        0.3384
## grades_offense
                                         5.302e-02 7.555e-02
                                                                0.702
                                                                        0.4828
                                         1.166e+00 5.087e-01
                                                                2.291
## Power5_draft1
                                                                        0.0219 *
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
##
       Null deviance: 260.96 on 782 degrees of freedom
## Residual deviance: 163.60 on 769 degrees of freedom
## AIC: 191.6
##
## Number of Fisher Scoring iterations: 10
pred_great <- predict(great_starter_coll_2, test, type = "response")</pre>
pred_great <- as.integer(pred_great>0.50)
conf_great <- confusionMatrix(as.factor(pred_decent),test$greatStarter)</pre>
conf_great
## Confusion Matrix and Statistics
##
##
            Reference
## Prediction
              0 1
           0 309 10
##
##
            1 13
##
##
                 Accuracy: 0.9311
##
                   95% CI: (0.8985, 0.9558)
      No Information Rate: 0.9641
##
##
      P-Value [Acc > NIR] : 0.9988
##
##
                    Kappa: 0.1127
##
##
   Mcnemar's Test P-Value: 0.6767
##
##
              Sensitivity: 0.9596
##
              Specificity: 0.1667
##
            Pos Pred Value: 0.9687
##
           Neg Pred Value: 0.1333
##
               Prevalence: 0.9641
##
           Detection Rate: 0.9251
##
      Detection Prevalence: 0.9551
##
         Balanced Accuracy: 0.5631
##
          'Positive' Class: 0
##
```

##

combine_stats %>%
 arrange(X40.Yard) %>%
 head() %>%
 kable()

Name	Team	Date	Title H	leight	Weight	Arm	Hand	X40.Yar	Shuttle	Cone	Vertical	Broad	Bench
John Ross	FA	2017	Combine	71	190	31.5	8.75	4.22	NA	NA	37.0	133	NA
Breshad	TB	2015	Pro	74	215	NA	NA	4.24	NA	NA	36.5	127	18
Perriman			Day										
Darrius	FA	2009	Combine	74	210	NA	NA	4.25	4.18	6.80	38.5	125	16
Heyward-Bey													
Anthony	CLE	2021	Pro	72	186	31.5	9.38	4.25	4.25	7.13	32.0	123	0
Schwartz			Day										
Marquise	SEA	2013	Combine	69	179	31.5	8.63	4.27	NA	NA	NA	132	13
Goodwin													
Henry Ruggs	FA	2020	Combine	72	190	30.5	10.13	4.27	NA	NA	42.0	131	NA