

# TF DA DJPPR: 3-session Workshop

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2025-04-28

```
# Open directory: ctrl + shift + H
getwd()

## [1] "/Users/arifpras/Library/CloudStorage/OneDrive-Kemenkeu/01_Kemenkeu/TF_DataAnalytics"

# data/2023-24/gws/merged_gw.csv --> raw

tic()

# Method 1: Directly read the CSV file from URL
players00 <- read.csv("https://raw.githubusercontent.com/vaastav/Fantasy-Premier-League/refs/heads/master/data/2023-24/gws/merged_gw.csv")

toc()

## 0.698 sec elapsed

# View the first few rows
head(players00)
```

```
##           name position      team  xP assists bonus bps
## 1      Femi Seriki    DEF Sheffield Utd 0.5      0      0      0
## 2    Jack Hinshelwood  MID      Brighton 1.5      0      0      0
## 3      Jadon Sancho    MID      Man Utd 3.0      0      0      4
## 4 Rhys Norrington-Davies DEF Sheffield Utd 0.1      0      0      0
## 5      Vitaly Janelt  MID      Brentford 2.1      0      0      6
## 6      Ionuț Radu     GK      Bournemouth 2.4      0      0      0
## clean_sheets creativity element expected_assists expected_goal_involvements
## 1           0          0.0      653           0.00                      0.00
## 2           0          0.0      621           0.00                      0.00
## 3           0         11.3      397           0.05                      0.05
## 4           0          0.0      487           0.00                      0.00
## 5           0         11.5      105           0.01                      0.03
## 6           0          0.0      607           0.00                      0.00
## expected_goals expected_goals_conceded fixture goals_conceded goals_scored
## 1           0.00                   0.00      7              0              0
## 2           0.00                   0.00      4              0              0
## 3           0.00                   1.08     10              0              0
## 4           0.00                   0.00      7              0              0
## 5           0.02                   1.26      8              2              0
## 6           0.00                   0.00      3              0              0
## ict_index influence      kickoff_time minutes opponent_team own_goals
## 1         0.0      0.0 2023-08-12T14:00:00Z      0              8              0
## 2         0.0      0.0 2023-08-12T14:00:00Z      0             12              0
## 3         2.3      3.8 2023-08-14T19:00:00Z     22             20              0
```

```
## 4      0.0      0.0 2023-08-12T14:00:00Z      0      8      0
## 5      4.3     14.6 2023-08-13T13:00:00Z     90     18      0
## 6      0.0      0.0 2023-08-12T14:00:00Z      0     19      0
##   penalties_missed penalties_saved red_cards round saves selected starts
## 1              0              0      0      1      0      0      0
## 2              0              0      0      1      0     822      0
## 3              0              0      0      1      0    83993      0
## 4              0              0      0      1      0    6456      0
## 5              0              0      0      1      0    6508      1
## 6              0              0      0      1      0    8745      0
##   team_a_score team_h_score threat total_points transfers_balance transfers_in
## 1              1              0      0              0              0      0
## 2              1              4      0              0              0      0
## 3              0              1      8              1              0      0
## 4              1              0      0              0              0      0
## 5              2              2     17              2              0      0
## 6              1              1      0              0              0      0
##   transfers_out value was_home yellow_cards GW
## 1              0     40      True              0  1
## 2              0     45      True              0  1
## 3              0     70      True              0  1
## 4              0     40      True              0  1
## 5              0     55      True              0  1
## 6              0     45      True              0  1
```

```
tic()
# Method 2: Download first, then read
download.file(url = "https://raw.githubusercontent.com/vaastav/Fantasy-Premier-League/refs/heads/master/merged_gw.csv",
              destfile = "merged_gw.csv")

# Then read the downloaded file
players00 <- read.csv("merged_gw.csv")
toc()
```

```
## 3.933 sec elapsed
```

```
# Method 3: Using readr from tidyverse
# if (!require("readr")) install.packages("readr")
# library(readr)

tic()
players00 <- read_csv("https://raw.githubusercontent.com/vaastav/Fantasy-Premier-League/refs/heads/master/merged_gw.csv")
toc()
```

```
## 0.458 sec elapsed
```

```
# spec(players00)
```

```
# str(players00)
glimpse(players00)
```

```
## Rows: 29,725
## Columns: 41
## $ name      <chr> "Femi Seriki", "Jack Hinshelwood", "Jadon S~
## $ position  <chr> "DEF", "MID", "MID", "DEF", "MID", "GK", "M~
## $ team      <chr> "Sheffield Utd", "Brighton", "Man Utd", "Sh~
## $ xP        <dbl> 0.5, 1.5, 3.0, 0.1, 2.1, 2.4, 0.5, 4.1, 0.0~
```

```
## $ assists <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0~
## $ bonus <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0~
## $ bps <dbl> 0, 0, 4, 0, 6, 0, 3, 0, 0, 0, 0, 0, 1, 15, ~
## $ clean_sheets <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0~
## $ creativity <dbl> 0.0, 0.0, 11.3, 0.0, 11.5, 0.0, 0.0, 0.0, 0~
## $ element <dbl> 653, 621, 397, 487, 105, 607, 655, 354, 417~
## $ expected_assists <dbl> 0.00, 0.00, 0.05, 0.00, 0.01, 0.00, 0.01, 0~
## $ expected_goal_involvements <dbl> 0.00, 0.00, 0.05, 0.00, 0.03, 0.00, 0.01, 0~
## $ expected_goals <dbl> 0.00, 0.00, 0.00, 0.00, 0.02, 0.00, 0.00, 0~
## $ expected_goals_conceded <dbl> 0.00, 0.00, 1.08, 0.00, 1.26, 0.00, 0.00, 0~
## $ fixture <dbl> 7, 4, 10, 7, 8, 3, 7, 1, 6, 10, 1, 4, 9, 9, ~
## $ goals_conceded <dbl> 0, 0, 0, 0, 2, 0, 0, 0, 0, 0, 0, 0, 1, 0~
## $ goals_scored <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0~
## $ ict_index <dbl> 0.0, 0.0, 2.3, 0.0, 4.3, 0.0, 0.0, 0.0, 0.0, 0.0~
## $ influence <dbl> 0.0, 0.0, 3.8, 0.0, 14.6, 0.0, 0.0, 0.0, 0.0, 0.~
## $ kickoff_time <dtm> 2023-08-12 14:00:00, 2023-08-12 14:00:00, ~
## $ minutes <dbl> 0, 0, 22, 0, 90, 0, 3, 0, 0, 0, 0, 0, 24, 7~
## $ opponent_team <dbl> 8, 12, 20, 8, 18, 19, 8, 6, 2, 14, 13, 5, 7~
## $ own_goals <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0~
## $ penalties_missed <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0~
## $ penalties_saved <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0~
## $ red_cards <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0~
## $ round <dbl> 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1~
## $ saves <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0~
## $ selected <dbl> 0, 822, 83993, 6456, 6508, 8745, 0, 488362, ~
## $ starts <dbl> 0, 0, 0, 0, 1, 0, 0, 0, 0, 0, 0, 0, 0, 1, 0~
## $ team_a_score <dbl> 1, 1, 0, 1, 2, 1, 1, 3, 1, 0, 3, 1, 1, 1, 2~
## $ team_h_score <dbl> 0, 4, 1, 0, 2, 1, 0, 0, 5, 1, 0, 4, 1, 1, 2~
## $ threat <dbl> 0, 0, 8, 0, 17, 0, 0, 0, 0, 0, 0, 0, 0, 3, ~
## $ total_points <dbl> 0, 0, 1, 0, 2, 0, 1, 0, 0, 0, 0, 0, 1, 2, 0~
## $ transfers_balance <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0~
## $ transfers_in <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0~
## $ transfers_out <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0~
## $ value <dbl> 40, 45, 70, 40, 55, 45, 45, 75, 45, 45, 40, ~
## $ was_home <lg1> TRUE, TRUE, TRUE, TRUE, TRUE, TRUE, TRUE, F~
## $ yellow_cards <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0~
## $ GW <dbl> 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1~
```

```
colSums(is.na(players00))
```

```
##          name          position
##          0              0
##          team          xP
##          0              0
##          assists        bonus
##          0              0
##          bps            clean_sheets
##          0              0
##          creativity      element
##          0              0
##          expected_assists expected_goal_involvements
##          0              0
##          expected_goals   expected_goals_conceded
##          0              0
##          fixture          goals_conceded
```

```
##          0          0
##      goals_scored      ict_index
##          0          0
##      influence      kickoff_time
##          0          0
##      minutes      opponent_team
##          0          0
##      own_goals      penalties_missed
##          0          0
##      penalties_saved      red_cards
##          0          0
##      round      saves
##          0          0
##      selected      starts
##          0          0
##      team_a_score      team_h_score
##          0          0
##      threat      total_points
##          0          0
##      transfers_balance      transfers_in
##          0          0
##      transfers_out      value
##          0          0
##      was_home      yellow_cards
##          0          0
##      GW
##          0
```

```
# https://www.premierleague.com/news/3537201
```

```
teams00 <- read_csv("https://raw.githubusercontent.com/vaastav/Fantasy-Premier-League/refs/heads/master
```

```
glimpse(teams00)
```

```
## Rows: 20
## Columns: 21
## $ code      <dbl> 3, 7, 91, 94, 36, 90, 8, 31, 11, 54, 14, 102, 43~
## $ draw      <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ form      <lgl> NA, NA, NA, NA, NA, NA, NA, NA, NA, NA, NA, NA, NA, ~
## $ id        <dbl> 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13, 14, 1~
## $ loss      <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ name      <chr> "Arsenal", "Aston Villa", "Bournemouth", "Brentf~
## $ played    <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ points    <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ position  <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ short_name <chr> "ARS", "AVL", "BOU", "BRE", "BHA", "BUR", "CHE",~
## $ strength  <dbl> 5, 4, 3, 3, 3, 2, 3, 3, 3, 3, 4, 2, 5, 3, 3, ~
## $ team_division <lgl> NA, NA, NA, NA, NA, NA, NA, NA, NA, NA, NA, NA, NA, ~
## $ unavailable <lgl> FALSE, FALSE, FALSE, FALSE, FALSE, FALSE, FALSE, ~
## $ win       <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ strength_overall_home <dbl> 1350, 1160, 1100, 1100, 1100, 1045, 1125, 1070, ~
## $ strength_overall_away <dbl> 1365, 1285, 1100, 1100, 1210, 1050, 1190, 1100, ~
## $ strength_attack_home <dbl> 1370, 1140, 1055, 1110, 1070, 1050, 1080, 1080, ~
## $ strength_attack_away <dbl> 1370, 1220, 1130, 1055, 1180, 1050, 1150, 1120, ~
## $ strength_defence_home <dbl> 1330, 1180, 1145, 1090, 1135, 1040, 1170, 1060, ~
```

```
## $ strength_defence_away <dbl> 1360, 1350, 1075, 1150, 1240, 1050, 1230, 1085, ~
## $ pulse_id <dbl> 1, 2, 127, 130, 131, 43, 4, 6, 7, 34, 10, 163, 1~
```

## Data Cleaning

```
# select()

teams01 <- teams00 %>%
  select(id, name, short_name)

# right_join(., by = c(" " = " "))
# rename (new_name = old_name)
# relocate

players01 <- players00 %>%
  left_join(teams01, by = c("opponent_team" = "id")) %>%
  rename(
    "name" = name.x,
    "opponent_long" = name.y,
    "opponent_short" = short_name
  ) %>%
  relocate(opponent_long, opponent_short, .after = opponent_team)

# mutate
# unselected
# janitor::clean_names

players02 <- players01 %>%
  mutate("value_dec" = value/10) %>%
  relocate(value_dec, .after = value) %>%
  select(-value) %>%
  janitor::clean_names()

# arrange
# recode old = new

players03 <- players02 %>%
  arrange(team, position, name, gw) %>%
  mutate(position_long = recode (
    position,
    GK = "01gk ",
    DEF = "02def ",
    MID = "03mid ",
    FWD = "04fwd "
  )) %>%
  relocate(position_long, .after = position)

unique(players03$position_long)

## [1] "02def " "04fwd " "01gk " "03mid "

# if_else
# str_squish
```

```

players04 <- players03 %>%
  mutate(was_home_dv = if_else(was_home, 1, 0)) %>%
  mutate(across(where(is.character), str_squish)) %>%
  arrange(team, desc(position_long), name, gw)

unique(players04$position_long)

## [1] "04fwd" "03mid" "02def" "01gk"

# function

squish_all_chars <- function(df) {
  message("Squishing all character columns...")
  df %>% mutate(across(where(is.character), str_squish))
}

players05 <- squish_all_chars(players03)

## Squishing all character columns...

unique(players05$position_long)

## [1] "02def" "04fwd" "01gk" "03mid"

(players06 <- players04 %>%
  filter(was_home_dv == 1))

## # A tibble: 14,867 x 45
##   name      position position_long team    x_p assists bonus   bps clean_sheets
##   <chr>      <chr>      <chr>      <chr> <dbl>   <dbl> <dbl> <dbl>      <dbl>
## 1 Eddie Nk~ FWD      04fwd      Arse~   2.4     0     2    26         1
## 2 Eddie Nk~ FWD      04fwd      Arse~   6.5     0     0    24         0
## 3 Eddie Nk~ FWD      04fwd      Arse~    5     0     0     8         0
## 4 Eddie Nk~ FWD      04fwd      Arse~    3     0     0     0         0
## 5 Eddie Nk~ FWD      04fwd      Arse~   2.2     0     0    -1         1
## 6 Eddie Nk~ FWD      04fwd      Arse~   7.3     0     3    77         1
## 7 Eddie Nk~ FWD      04fwd      Arse~   5.8     0     0     2         0
## 8 Eddie Nk~ FWD      04fwd      Arse~   1.7     0     0    -2         0
## 9 Eddie Nk~ FWD      04fwd      Arse~   1.9     1     0    15         0
## 10 Eddie Nk~ FWD      04fwd      Arse~   1.7     0     0     1         0
## # i 14,857 more rows
## # i 36 more variables: creativity <dbl>, element <dbl>, expected_assists <dbl>,
## #   expected_goal_involvements <dbl>, expected_goals <dbl>,
## #   expected_goals_conceded <dbl>, fixture <dbl>, goals_conceded <dbl>,
## #   goals_scored <dbl>, ict_index <dbl>, influence <dbl>, kickoff_time <dtm>,
## #   minutes <dbl>, opponent_team <dbl>, opponent_long <chr>,
## #   opponent_short <chr>, own_goals <dbl>, penalties_missed <dbl>, ...

(players06 <- players04 %>%
  filter(team == "MUN" | opponent_short == "NFO"))

## # A tibble: 1,464 x 45
##   name      position position_long team    x_p assists bonus   bps clean_sheets
##   <chr>      <chr>      <chr>      <chr> <dbl>   <dbl> <dbl> <dbl>      <dbl>
## 1 Eddie Nk~ FWD      04fwd      Arse~   2.4     0     2    26         1
## 2 Eddie Nk~ FWD      04fwd      Arse~    3     0     0     2         0
## 3 Folarin ~ FWD      04fwd      Arse~   1.5     0     0     0         0

```

```
## 4 Folarin ~ FWD      04fwd      Arse~  0      0      0      0      0
## 5 Gabriel ~ FWD      04fwd      Arse~  0      0      0      0      0
## 6 Gabriel ~ FWD      04fwd      Arse~  8      1      2     31      1
## 7 Albert S~ MID      03mid      Arse~  2.1    0      0      0      0
## 8 Bradley ~ MID      03mid      Arse~  0.5    0      0      0      0
## 9 Bukayo S~ MID      03mid      Arse~  3.4    0      3     37      0
## 10 Bukayo S~ MID     03mid      Arse~  7      0      3     35      0
## # i 1,454 more rows
## # i 36 more variables: creativity <dbl>, element <dbl>, expected_assists <dbl>,
## #   expected_goal_involvements <dbl>, expected_goals <dbl>,
## #   expected_goals_conceded <dbl>, fixture <dbl>, goals_conceded <dbl>,
## #   goals_scored <dbl>, ict_index <dbl>, influence <dbl>, kickoff_time <dtm>,
## #   minutes <dbl>, opponent_team <dbl>, opponent_long <chr>,
## #   opponent_short <chr>, own_goals <dbl>, penalties_missed <dbl>, ...
```

```
(players06 <- players04 %>%
  filter(was_home_dv == 1 & team == "Man Utd"))
```

```
## # A tibble: 790 x 45
##   name      position position_long team    x_p assists bonus    bps clean_sheets
##   <chr>      <chr>      <chr>      <chr> <dbl>    <dbl> <dbl> <dbl>      <dbl>
## 1 Anthony ~ FWD      04fwd      Man ~    0.7      0      0      0      0
## 2 Anthony ~ FWD      04fwd      Man ~    1.2      0      0      3      0
## 3 Anthony ~ FWD      04fwd      Man ~    1.8      0      0      6      0
## 4 Anthony ~ FWD      04fwd      Man ~    1.2      0      0      5      0
## 5 Anthony ~ FWD      04fwd      Man ~    1.2      0      0      1      0
## 6 Anthony ~ FWD      04fwd      Man ~    0.5      0      0      3      0
## 7 Anthony ~ FWD      04fwd      Man ~    2        0      0      3      0
## 8 Anthony ~ FWD      04fwd      Man ~    4        0      0      0      0
## 9 Anthony ~ FWD      04fwd      Man ~    3.5      0      0      1      0
## 10 Anthony ~ FWD     04fwd      Man ~    0.2      0      0      0      0
## # i 780 more rows
## # i 36 more variables: creativity <dbl>, element <dbl>, expected_assists <dbl>,
## #   expected_goal_involvements <dbl>, expected_goals <dbl>,
## #   expected_goals_conceded <dbl>, fixture <dbl>, goals_conceded <dbl>,
## #   goals_scored <dbl>, ict_index <dbl>, influence <dbl>, kickoff_time <dtm>,
## #   minutes <dbl>, opponent_team <dbl>, opponent_long <chr>,
## #   opponent_short <chr>, own_goals <dbl>, penalties_missed <dbl>, ...
```

```
(players06 <- players04 %>%
  filter(was_home_dv == 1, team == "Man Utd"))
```

```
## # A tibble: 790 x 45
##   name      position position_long team    x_p assists bonus    bps clean_sheets
##   <chr>      <chr>      <chr>      <chr> <dbl>    <dbl> <dbl> <dbl>      <dbl>
## 1 Anthony ~ FWD      04fwd      Man ~    0.7      0      0      0      0
## 2 Anthony ~ FWD      04fwd      Man ~    1.2      0      0      3      0
## 3 Anthony ~ FWD      04fwd      Man ~    1.8      0      0      6      0
## 4 Anthony ~ FWD      04fwd      Man ~    1.2      0      0      5      0
## 5 Anthony ~ FWD      04fwd      Man ~    1.2      0      0      1      0
## 6 Anthony ~ FWD      04fwd      Man ~    0.5      0      0      3      0
## 7 Anthony ~ FWD      04fwd      Man ~    2        0      0      3      0
## 8 Anthony ~ FWD      04fwd      Man ~    4        0      0      0      0
## 9 Anthony ~ FWD      04fwd      Man ~    3.5      0      0      1      0
## 10 Anthony ~ FWD     04fwd      Man ~    0.2      0      0      0      0
```

```
## # i 780 more rows
## # i 36 more variables: creativity <dbl>, element <dbl>, expected_assists <dbl>,
## #   expected_goal_involvements <dbl>, expected_goals <dbl>,
## #   expected_goals_conceded <dbl>, fixture <dbl>, goals_conceded <dbl>,
## #   goals_scored <dbl>, ict_index <dbl>, influence <dbl>, kickoff_time <dtm>,
## #   minutes <dbl>, opponent_team <dbl>, opponent_long <chr>,
## #   opponent_short <chr>, own_goals <dbl>, penalties_missed <dbl>, ...
```

```
(players06 <- players04 %>%
  filter(was_home_dv == 1, team %in% c("Arsenal", "Liverpool", "Man City")))
```

```
## # A tibble: 1,949 x 45
##   name      position position_long team    x_p assists bonus   bps clean_sheets
##   <chr>      <chr>      <chr>      <chr> <dbl>   <dbl> <dbl> <dbl>      <dbl>
## 1 Eddie Nk~ FWD      04fwd      Arse~ 2.4     0     2    26         1
## 2 Eddie Nk~ FWD      04fwd      Arse~ 6.5     0     0    24         0
## 3 Eddie Nk~ FWD      04fwd      Arse~ 5       0     0     8         0
## 4 Eddie Nk~ FWD      04fwd      Arse~ 3       0     0     0         0
## 5 Eddie Nk~ FWD      04fwd      Arse~ 2.2     0     0    -1         1
## 6 Eddie Nk~ FWD      04fwd      Arse~ 7.3     0     3    77         1
## 7 Eddie Nk~ FWD      04fwd      Arse~ 5.8     0     0     2         0
## 8 Eddie Nk~ FWD      04fwd      Arse~ 1.7     0     0    -2         0
## 9 Eddie Nk~ FWD      04fwd      Arse~ 1.9     1     0    15         0
## 10 Eddie Nk~ FWD      04fwd      Arse~ 1.7     0     0     1         0
```

```
## # i 1,939 more rows
## # i 36 more variables: creativity <dbl>, element <dbl>, expected_assists <dbl>,
## #   expected_goal_involvements <dbl>, expected_goals <dbl>,
## #   expected_goals_conceded <dbl>, fixture <dbl>, goals_conceded <dbl>,
## #   goals_scored <dbl>, ict_index <dbl>, influence <dbl>, kickoff_time <dtm>,
## #   minutes <dbl>, opponent_team <dbl>, opponent_long <chr>,
## #   opponent_short <chr>, own_goals <dbl>, penalties_missed <dbl>, ...
```

```
(players06 <- players04 %>%
  filter(was_home_dv == 1, gw >= 19))
```

```
## # A tibble: 8,386 x 45
##   name      position position_long team    x_p assists bonus   bps clean_sheets
##   <chr>      <chr>      <chr>      <chr> <dbl>   <dbl> <dbl> <dbl>      <dbl>
## 1 Eddie Nk~ FWD      04fwd      Arse~ 1.7     0     0     1         0
## 2 Eddie Nk~ FWD      04fwd      Arse~ 2.8     1     0    16         0
## 3 Eddie Nk~ FWD      04fwd      Arse~ 1.7     0     0     0         0
## 4 Eddie Nk~ FWD      04fwd      Arse~ 0       0     0     8         0
## 5 Eddie Nk~ FWD      04fwd      Arse~ 1.5     0     0     0         0
## 6 Eddie Nk~ FWD      04fwd      Arse~ 1.8     0     0    -1         0
## 7 Eddie Nk~ FWD      04fwd      Arse~ 1.3     0     0     0         0
## 8 Eddie Nk~ FWD      04fwd      Arse~ 3       0     0     0         0
## 9 Eddie Nk~ FWD      04fwd      Arse~ 1.2     0     0     0         0
## 10 Eddie Nk~ FWD      04fwd      Arse~ 1       0     0     0         0
```

```
## # i 8,376 more rows
## # i 36 more variables: creativity <dbl>, element <dbl>, expected_assists <dbl>,
## #   expected_goal_involvements <dbl>, expected_goals <dbl>,
## #   expected_goals_conceded <dbl>, fixture <dbl>, goals_conceded <dbl>,
## #   goals_scored <dbl>, ict_index <dbl>, influence <dbl>, kickoff_time <dtm>,
## #   minutes <dbl>, opponent_team <dbl>, opponent_long <chr>,
## #   opponent_short <chr>, own_goals <dbl>, penalties_missed <dbl>, ...
```



```
(players06 <- players04 %>%
  filter(gw >= 10 & gw <= 20))
```

```
## # A tibble: 8,152 x 45
##   name      position position_long team    x_p assists bonus   bps clean_sheets
##   <chr>      <chr>      <chr>      <chr> <dbl>  <dbl> <dbl> <dbl>      <dbl>
## 1 Eddie Nk~ FWD      04fwd      Arse~   7.3    0    3    77         1
## 2 Eddie Nk~ FWD      04fwd      Arse~   6.3    0    0     1         0
## 3 Eddie Nk~ FWD      04fwd      Arse~   5.8    0    0     2         0
## 4 Eddie Nk~ FWD      04fwd      Arse~   1.8    0    0     3         0
## 5 Eddie Nk~ FWD      04fwd      Arse~   1.7    0    0    -2         0
## 6 Eddie Nk~ FWD      04fwd      Arse~   1.8    0    0     0         0
## 7 Eddie Nk~ FWD      04fwd      Arse~   1.3    0    0     2         0
## 8 Eddie Nk~ FWD      04fwd      Arse~   1.9    1    0    15         0
## 9 Eddie Nk~ FWD      04fwd      Arse~   1.2    0    0    -2         0
## 10 Eddie Nk~ FWD      04fwd      Arse~   1.7    0    0     1         0
## # i 8,142 more rows
## # i 36 more variables: creativity <dbl>, element <dbl>, expected_assists <dbl>,
## #   expected_goal_involvements <dbl>, expected_goals <dbl>,
## #   expected_goals_conceded <dbl>, fixture <dbl>, goals_conceded <dbl>,
## #   goals_scored <dbl>, ict_index <dbl>, influence <dbl>, kickoff_time <dtm>,
## #   minutes <dbl>, opponent_team <dbl>, opponent_long <chr>,
## #   opponent_short <chr>, own_goals <dbl>, penalties_missed <dbl>, ...
```

```
(players06 <- players04 %>%
  filter(between(gw, 10, 20)))
```

```
## # A tibble: 8,152 x 45
##   name      position position_long team    x_p assists bonus   bps clean_sheets
##   <chr>      <chr>      <chr>      <chr> <dbl>  <dbl> <dbl> <dbl>      <dbl>
## 1 Eddie Nk~ FWD      04fwd      Arse~   7.3    0    3    77         1
## 2 Eddie Nk~ FWD      04fwd      Arse~   6.3    0    0     1         0
## 3 Eddie Nk~ FWD      04fwd      Arse~   5.8    0    0     2         0
## 4 Eddie Nk~ FWD      04fwd      Arse~   1.8    0    0     3         0
## 5 Eddie Nk~ FWD      04fwd      Arse~   1.7    0    0    -2         0
## 6 Eddie Nk~ FWD      04fwd      Arse~   1.8    0    0     0         0
## 7 Eddie Nk~ FWD      04fwd      Arse~   1.3    0    0     2         0
## 8 Eddie Nk~ FWD      04fwd      Arse~   1.9    1    0    15         0
## 9 Eddie Nk~ FWD      04fwd      Arse~   1.2    0    0    -2         0
## 10 Eddie Nk~ FWD      04fwd      Arse~   1.7    0    0     1         0
## # i 8,142 more rows
## # i 36 more variables: creativity <dbl>, element <dbl>, expected_assists <dbl>,
## #   expected_goal_involvements <dbl>, expected_goals <dbl>,
## #   expected_goals_conceded <dbl>, fixture <dbl>, goals_conceded <dbl>,
## #   goals_scored <dbl>, ict_index <dbl>, influence <dbl>, kickoff_time <dtm>,
## #   minutes <dbl>, opponent_team <dbl>, opponent_long <chr>,
## #   opponent_short <chr>, own_goals <dbl>, penalties_missed <dbl>, ...
```

```
# specific column
```

```
(players06 <- players04 %>%
  filter(is.na(position_long)))
```

```
## # A tibble: 0 x 45
## # i 45 variables: name <chr>, position <chr>, position_long <chr>, team <chr>,
## #   x_p <dbl>, assists <dbl>, bonus <dbl>, bps <dbl>, clean_sheets <dbl>,
```

```
## # creativity <dbl>, element <dbl>, expected_assists <dbl>,
## # expected_goal_involvements <dbl>, expected_goals <dbl>,
## # expected_goals_conceded <dbl>, fixture <dbl>, goals_conceded <dbl>,
## # goals_scored <dbl>, ict_index <dbl>, influence <dbl>, kickoff_time <dtm>,
## # minutes <dbl>, opponent_team <dbl>, opponent_long <chr>, ...
```

```
# all columns
(players06 <- players04 %>%
  filter(if_any(everything(), is.na)))
```

```
## # A tibble: 0 x 45
## # i 45 variables: name <chr>, position <chr>, position_long <chr>, team <chr>,
## # x_p <dbl>, assists <dbl>, bonus <dbl>, bps <dbl>, clean_sheets <dbl>,
## # creativity <dbl>, element <dbl>, expected_assists <dbl>,
## # expected_goal_involvements <dbl>, expected_goals <dbl>,
## # expected_goals_conceded <dbl>, fixture <dbl>, goals_conceded <dbl>,
## # goals_scored <dbl>, ict_index <dbl>, influence <dbl>, kickoff_time <dtm>,
## # minutes <dbl>, opponent_team <dbl>, opponent_long <chr>, ...
```

```
(
  players07 <- players04 %>%
    group_by(team) %>%
    mutate(points_avgteam = mean(total_points)) %>%
    ungroup()
)
```

```
## # A tibble: 29,725 x 46
##   name      position position_long team    x_p assists bonus   bps clean_sheets
##   <chr>      <chr>      <chr>      <chr> <dbl>   <dbl> <dbl> <dbl>      <dbl>
## 1 Eddie Nk~ FWD      04fwd      Arse~ 2.4     0     2    26         1
## 2 Eddie Nk~ FWD      04fwd      Arse~ 7        1     0     6         1
## 3 Eddie Nk~ FWD      04fwd      Arse~ 6.5     0     0    24         0
## 4 Eddie Nk~ FWD      04fwd      Arse~ 5        0     0     8         0
## 5 Eddie Nk~ FWD      04fwd      Arse~ 4        0     0     3         1
## 6 Eddie Nk~ FWD      04fwd      Arse~ 3        0     0     0         0
## 7 Eddie Nk~ FWD      04fwd      Arse~ 3.2     1     0    16         1
## 8 Eddie Nk~ FWD      04fwd      Arse~ 2.2     0     0    -1         1
## 9 Eddie Nk~ FWD      04fwd      Arse~ 2.8     0     0    -3         0
## 10 Eddie Nk~ FWD      04fwd      Arse~ 7.3     0     3    77         1
## # i 29,715 more rows
## # i 37 more variables: creativity <dbl>, element <dbl>, expected_assists <dbl>,
## # expected_goal_involvements <dbl>, expected_goals <dbl>,
## # expected_goals_conceded <dbl>, fixture <dbl>, goals_conceded <dbl>,
## # goals_scored <dbl>, ict_index <dbl>, influence <dbl>, kickoff_time <dtm>,
## # minutes <dbl>, opponent_team <dbl>, opponent_long <chr>,
## # opponent_short <chr>, own_goals <dbl>, penalties_missed <dbl>, ...
```

```
(
  players07 <- players04 %>%
    group_by(team) %>%
    summarise(points_avgteam = mean(total_points)) %>%
    ungroup() %>%
    arrange(desc(points_avgteam))
)
```

```
## # A tibble: 20 x 2
```

```
##      team          points_avgteam
##      <chr>          <dbl>
##  1 Man City          1.80
##  2 Arsenal           1.64
##  3 Liverpool         1.36
##  4 West Ham          1.24
##  5 Everton           1.22
##  6 Crystal Palace    1.20
##  7 Fulham            1.17
##  8 Aston Villa       1.17
##  9 Newcastle         1.12
## 10 Spurs             1.12
## 11 Bournemouth       1.06
## 12 Brentford         1.01
## 13 Man Utd           0.993
## 14 Wolves            0.913
## 15 Brighton          0.910
## 16 Chelsea           0.865
## 17 Burnley           0.754
## 18 Luton             0.743
## 19 Nott'm Forest     0.685
## 20 Sheffield Utd     0.659
```

```
(
  players07 <- players04 %>%
    group_by(team, name, position) %>%
    summarise(
      points_sumplayer = sum(total_points),
      minutes_played = sum(minutes),
      .groups = "drop") %>%
    ungroup() %>%
    arrange(desc(points_sumplayer))
)
```

```
## # A tibble: 893 x 5
##   team      name      position points_sumplayer minutes_played
##   <chr>    <chr>    <chr>          <dbl>          <dbl>
##  1 Chelsea  Cole Palmer  MID             243            2607
##  2 Man City  Phil Foden   MID             230            2860
##  3 Aston Villa Ollie Watkins FWD             228            3222
##  4 Arsenal   Bukayo Saka  MID             226            2922
##  5 Man City  Erling Haaland FWD             217            2553
##  6 Spurs     Son Heung-min MID             213            2934
##  7 Liverpool Mohamed Salah MID             211            2531
##  8 Arsenal   Martin Ødegaard MID             186            3098
##  9 Newcastle Anthony Gordon MID             183            2896
## 10 Arsenal   Benjamin White DEF             182            2987
## # i 883 more rows
```

```
(
  players08 <- players07 %>%
    relocate(position, .before = team) %>%
    group_by(position, team) %>%
    arrange(desc(points_sumplayer)) %>%
    slice_head(n=2) %>%

```

```

ungroup()
)

## # A tibble: 160 x 5
##   position team      name      points_sumplayer minutes_played
##   <chr>    <chr>    <chr>          <dbl>          <dbl>
## 1 DEF      Arsenal  Benjamin White      182            2987
## 2 DEF      Arsenal  William Saliba      164            3420
## 3 DEF      Aston Villa Ezri Konsa Ngoyo      91            3069
## 4 DEF      Aston Villa Lucas Digne       85            2405
## 5 DEF      Bournemouth Marcos Senesi     102            2239
## 6 DEF      Bournemouth Illia Zabarnyi      84            3330
## 7 DEF      Brentford  Nathan Collins      84            2649
## 8 DEF      Brentford  Ethan Pinnock       77            2521
## 9 DEF      Brighton  Lewis Dunk          89            2869
## 10 DEF     Brighton  Jan Paul van Hecke   61            2368
## # i 150 more rows

```

```

(
  players08 <- players07 %>%
    relocate(position, .before = team) %>%
    group_by(position, team) %>%
    slice_max(order_by = points_sumplayer, n = 2) %>%
    ungroup()
)

```

```

## # A tibble: 170 x 5
##   position team      name      points_sumplayer minutes_played
##   <chr>    <chr>    <chr>          <dbl>          <dbl>
## 1 DEF      Arsenal  Benjamin White      182            2987
## 2 DEF      Arsenal  William Saliba      164            3420
## 3 DEF      Aston Villa Ezri Konsa Ngoyo      91            3069
## 4 DEF      Aston Villa Lucas Digne       85            2405
## 5 DEF      Aston Villa Pau Torres       85            2462
## 6 DEF      Bournemouth Marcos Senesi     102            2239
## 7 DEF      Bournemouth Illia Zabarnyi      84            3330
## 8 DEF      Brentford  Nathan Collins      84            2649
## 9 DEF      Brentford  Ethan Pinnock       77            2521
## 10 DEF     Brighton  Lewis Dunk          89            2869
## # i 160 more rows

```

Challenge: Find the Top 20 Players per Position (based on their average points per game, not total points)

```

(
  players09 <- players04 %>%
    filter(minutes != 0) %>%
    group_by(team, position_long, name) %>%
    summarise(
      count_played = n(),
      minutes_played = sum(minutes),
      points_sumplayer = sum(total_points),
      points_avgplayer = mean(total_points),
      .groups = "drop"
    ) %>%
    relocate(position_long, name, team) %>%

```

```

group_by(position_long) %>%
slice_max(order_by = points_avgplayer, n = 20) %>%
ungroup()
)

## # A tibble: 80 x 7
##   position_long name          team count_played minutes_played points_sumplayer
##   <chr>         <chr>         <chr>      <int>         <dbl>         <dbl>
## 1 01gk         Mark Travers Bour~         4          360          19
## 2 01gk         Arijanet Mu~ Burn~        10          900          47
## 3 01gk         David Raya ~ Arse~        32         2880         135
## 4 01gk         Jordan Pick~ Ever~        38         3420         153
## 5 01gk         Alisson Ram~ Live~        28         2520         107
## 6 01gk         Nick Pope    Newc~        15         1345          57
## 7 01gk         Alphonse Ar~ West~        31         2700         116
## 8 01gk         Robert Sânc~ Chel~        16         1433          59
## 9 01gk         Daniel Bent~ Wolv~         5          382          18
## 10 01gk        Bernd Leno   Fulh~        38         3420         133
## # i 70 more rows
## # i 1 more variable: points_avgplayer <dbl>

```

```

(
players10 <- players04 %>%
  filter(minutes != 0) %>%
  group_by(team, position, name) %>%
  summarise(
    count_played = n(),
    minutes_played = sum(minutes),
    points_sumplayer = sum(total_points),
    points_avgplayer = mean(total_points),
    value_avg = mean(value_dec),
    ict_avg = mean(ict_index),
    .groups = "drop") %>%
  ungroup() %>%
  relocate(position, name, team) %>%
  group_by(position) %>%
  slice_max(order_by = points_sumplayer, n = 10) %>%
  # mutate(position_rank = row_number(desc(points_sumplayer))) %>%
  mutate(position_rank = min_rank(desc(points_sumplayer))) %>%
  ungroup()
)

```

```

## # A tibble: 40 x 10
##   position name          team count_played minutes_played points_sumplayer
##   <chr>     <chr>         <chr>      <int>         <dbl>         <dbl>
## 1 DEF      Benjamin White  Arse~        37         2987         182
## 2 DEF      William Saliba  Arse~        38         3420         164
## 3 DEF      Gabriel dos Sant~ Arse~        36         3042         149
## 4 DEF      Pedro Porro     Spurs        35         3090         136
## 5 DEF      Jarrad Branthwai~ Ever~        35         3116         124
## 6 DEF      Joško Gvardiol  Man ~        28         2327         123
## 7 DEF      Kyle Walker     Man ~        32         2766         123
## 8 DEF      Fabian Schär    Newc~        36         3055         123
## 9 DEF      Trent Alexander-- Live~        28         2153         122
## 10 DEF     Joachim Andersen Crys~        38         3416         121

```

```
## # i 30 more rows
## # i 4 more variables: points_avgplayer <dbl>, value_avg <dbl>, ict_avg <dbl>,
## #   position_rank <int>

(
  players11 <- players10 %>%
    pivot_longer(
      cols = count_played:position_rank,
      names_to = "variable01",
      values_to = "value01"
    )
)

## # A tibble: 280 x 5
##   position name      team variable01 value01
##   <chr>    <chr>    <chr>   <chr>      <dbl>
## 1 DEF      Benjamin White Arsenal count_played 37
## 2 DEF      Benjamin White Arsenal minutes_played 2987
## 3 DEF      Benjamin White Arsenal points_sumplayer 182
## 4 DEF      Benjamin White Arsenal points_avgplayer 4.92
## 5 DEF      Benjamin White Arsenal value_avg 5.69
## 6 DEF      Benjamin White Arsenal ict_avg 4.30
## 7 DEF      Benjamin White Arsenal position_rank 1
## 8 DEF      William Saliba Arsenal count_played 38
## 9 DEF      William Saliba Arsenal minutes_played 3420
## 10 DEF     William Saliba Arsenal points_sumplayer 164
## # i 270 more rows

writexl::write_xlsx(x = list(table_wide = players10, table_long = players11),
  path = "fpldataset.xlsx")

# write_csv(players10, "fpldataset_tablewide.csv")
```

## Data Viz

```
# Load nord palette (if needed)
# pacman::p_load(nord, scico, colorspace)

plot01 <- players10 %>%
  mutate(position = fct_relevel(position, "GK", "DEF", "MID", "FWD")) %>%
  group_by(position) %>%
  slice_max(order_by = points_sumplayer, n = 5) %>%
  ungroup() %>%
  arrange(desc(points_sumplayer)) %>%
  ggplot() +
  geom_point(
    aes(
      x = reorder(name, ict_avg),
      y = points_sumplayer,
      color = factor(team),
      size = ict_avg,
      shape = position
    )
  ) +
```

```

scale_shape_manual(values = c("GK" = 17, "DEF" = 15, "MID" = 18, "FWD" = 3)) +
colorspace::scale_color_discrete_qualitative(palette = "Dark 3") +
scale_size_continuous(range = c(1, 5)) +
coord_flip() +
labs(
  title = "Who Ruled the Pitch?",
  subtitle = "Top 5 Players by Position in PL 2023/2024\n",
  caption = "\nVisualized by Task Force Data Analytics - DJPPR | Data: github.com/vaastav | April 2023",
  x = "Ranked by ICT Index\n",
  y = "\nTotal Points"
) +
guides(
  size = guide_legend("ICT Index", override.aes = list(color = "white")),
  color = guide_legend("Team"),
  shape = guide_legend("Position", override.aes = list(color = "white"))
) +
theme_minimal(base_family = "sans") +
theme(
  plot.background = element_rect(fill = "#1b1f23", color = NA),
  panel.background = element_rect(fill = "#1b1f23", color = NA),
  panel.grid.major.y = element_line(color = "#22282C"),
  panel.grid.major.x = element_line(color = "#22282C"),
  panel.grid.minor = element_blank(),

  plot.title = element_text(hjust = 0, size = 18, face = "bold", color = "white"),
  plot.subtitle = element_text(hjust = 0, size = 16, color = "gray90"),
  plot.caption = element_text(hjust = 0, size = 11, color = "gray70"),
  plot.title.position = "plot",
  plot.caption.position = "plot",

  axis.text.x = element_text(size = 12, color = "gray80"),
  axis.text.y = element_text(size = 12, color = "gray80"),
  axis.title.x = element_text(size = 11, color = "gray70"),
  axis.title.y = element_text(size = 11, color = "gray70"),
  axis.ticks = element_blank(),

  legend.background = element_rect(fill = "#1b1f23", color = NA),
  legend.title = element_text(size = 11, color = "white"),
  legend.text = element_text(size = 11, color = "gray85"),
  legend.key = element_rect(fill = "#1b1f23"),
  legend.key.size = unit(0.5, "cm"),
  legend.spacing = unit(1, "cm"),
  legend.position = "right",

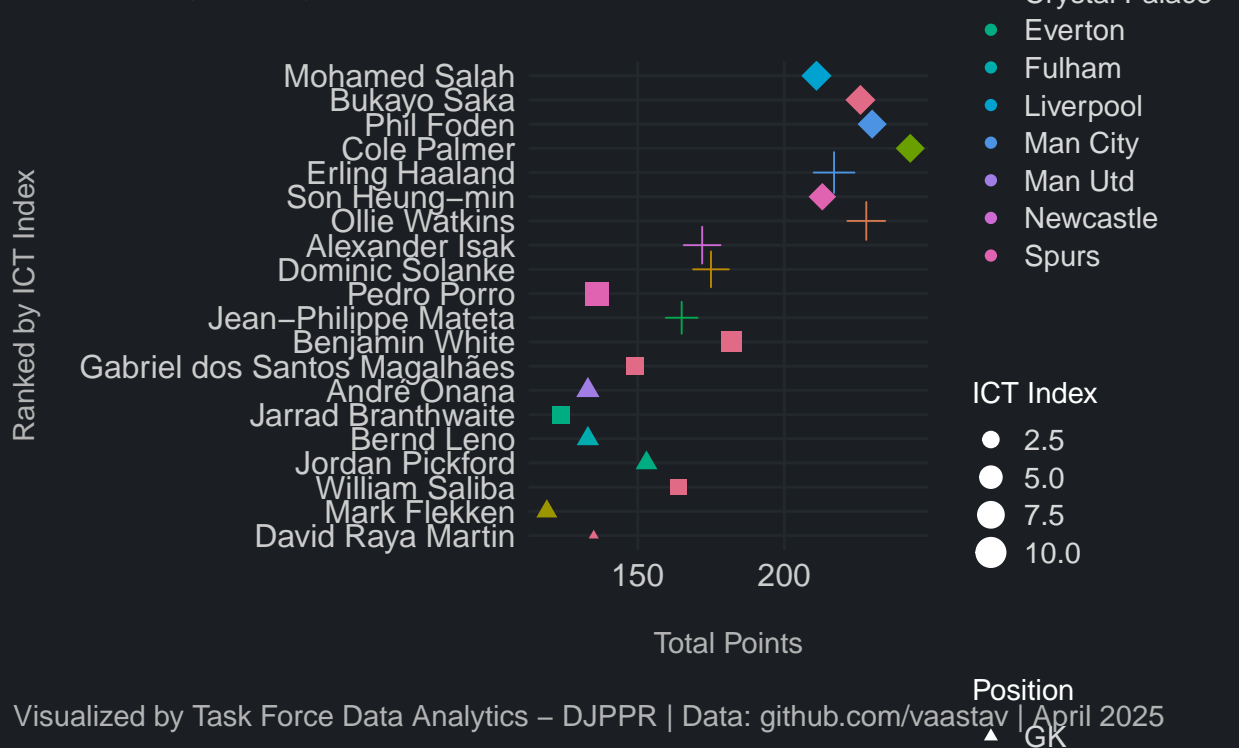
  strip.text.x = element_text(size = 12, color = "white"),
  panel.ontop = FALSE,
  panel.spacing = unit(1, "lines")
)

```

plot01

# Who Ruled the Pitch?

## Top 5 Players by Position in PL 2023/2024



```
ggsave(
  filename = "20250428_plot01_darkmode.png",
  plot = plot01,
  width = 3840,
  height = 2160,
  units = "px",
  dpi = 300
)

# ggsave(
#   filename = "20250428_rcourse_plot01.pdf",
#   plot = plot01,
#   device = cairo_pdf,
#   width = 297,
#   height = 210,
#   units = "mm"
# )
```

— END —