```
In [545...
            import pandas as pd
            import numpy as np
            import matplotlib.pyplot as plt
            import seaborn as sns
            from sklearn.preprocessing import StandardScaler
In [479... | df = pd.read_csv('datasetpremier.csv')
 In []: Heatmap ดู Correlation ของค่าต่าง ๆ
In [481... | selected_columns = ['Age', 'MP', 'Starts', 'Min', '90s',
                                                                                        'Gls', 'As
                                       'PK', 'PKatt', 'CrdY', 'CrdR', 'xG', 'npxG', 'x
                                       'PrgC', 'PrgP', 'PrgR', 'Gls_90', 'Ast_90']
            corr_matrix = df[selected_columns].corr()
            plt.figure(figsize=(15, 8))
            sns.heatmap(corr_matrix, cmap="coolwarm", annot=True, fmt=".2f", li
            plt.title("Correlation Matrix of Selected Player Stats")
            plt.show()
                                       Correlation Matrix of Selected Player Stats
            Age - 1.00 0.24 0.24 0.25 0.25 0.03 0.07 0.01 0.01 0.17 0.07 0.03 0.04 0.07 -0.02
                                                                            0.15 0.01 -0.02 0.01
            MP - 0.24 1.00
                           0.93 0.93
                                   0.50 0.53 0.22 0.22 0.65
                                                            0.51 0.53 0.58 0.59
                                                                            0.68 0.56
           Starts - 0.24
                                    0.47 0.52 0.23 0.23 0.68
                                                            0.47 0.48 0.56 0.55
                                                                            0.71
                                                                                0.49
            Min - 0.25 0.93
                       1.00
                           1.00 1.00
                                    0.46 0.51 0.23 0.23 0.67
                                                            0.46 0.48
                                                                   0.56 0.54
                                                                            0.71 0.49
                                                                                                   - 0.8
               0.25 0.93 1.00
                           1.00
                                   0.46 0.51
                                           0.23
                                                0.23 0.67
                                                                    0.56
                                                                        0.54
                                                                                0.49
                0.03 0.50 0.47 0.46 0.46
            Gls
                                        0.61 0.63
                                                0.63 0.26
                                                                    0.66
                                                                        0.58
                                                                            0.37
                                                                                0.69 0.62 0.25
                   0.53 0.52 0.51 0.51
                                    0.61
                                            0.39
                                                0.38
                                                    0.39
                                                            0.61
                                                                        0.70
                                                                            0.61
                                                                                0.73
             PK -
                   0.22 0.23 0.23 0.23 0.63 0.39
                                           1.00 0.99
                                                            0.66 0.53
                                                                   0.45 0.31
                                                                            0.24 0.39 0.34
               0.01 0.22 0.23 0.23 0.23 0.63 0.38 0.99 1.00
                                                                    0.46
                   0.25 0.27 0.29
                                                                    0.39
                                                                            0.61 0.30
                                                                        0.37
                                                                                   0.04
           CrdY
                                            -0.02 -0.02 0.25
                                                                                                   - 0.4
                   0.51 0.47 0.46 0.46
                                                   0.27
            xG -
                                        0.61
                                            0.66
                                                0.69
                                                                    0.66
                                                                        0.58
                                                                            0.36
                                                                                    0.54
                                        0.60 0.53
                                                            0.99
                                                                    0.65 0.59 0.35
                   0.53 0.48 0.48 0.48
                                                0.56
                                                   0.29
                   0.58 0.56 0.56 0.56 0.66 0.90 0.45 0.46 0.39 0.03
            xAG
                                                            0.66 0.65 1.00
                                                                            0.66
                                                                                    0.32 0.45
           PrgC
                -0.02 0.59 0.55 0.54 0.54 0.58 0.70 0.31
                                                0.31 0.37
                                                            0.58 0.59
                                                                            0.57
                                                                                    0.28
                                                                                                   0.2
                   0.68 0.71
           PraP
                               0.71 0.37 0.61 0.24 0.24 0.61
                                                            0.36 0.35 0.66 0.57
                           0.71
                                                                                0.46
           PraR -
                   0.56 0.49 0.49 0.49 0.69
                                        0.73 0.39 0.39 0.30 -0.01
                                                            0.71 0.72
                                                                           0.46
                                                                                    0.37 0.36
                                       0.28 0.34 0.34 0.04
                                                                   0.32 0.28 0.08
                                                       -0.03
                                                            0.54 0.54
                                                                                0.37 1.00
                           0.09 0.09 0.25 0.57 0.16 0.16 0.09 0.03 0.26 0.26 0.45 0.33 0.20
          Ast 90 -
                                                                                0.36 0.18 1.00
                                            PK PKatt CrdY CrdR
                                                                        PrgC PrgP PrgR Gls 90 Ast 90
In [485... average_age_by_team = df.groupby('Team')['Age'].mean().round(2).res
            average_age_by_team.rename(columns={'Age': 'Average Age'}, inplace='
            print(average_age_by_team)
            plt.figure(figsize=(10, 6))
            ax = sns.barplot(x="Average Age", y="Team", data=average_age_by_tea
            for i, v in enumerate(average_age_by_team['Average Age']):
                  ax.text(v + 0.1, i, str(v), color='black', va='center')
            plt.title("Average Players' Age of Each Team")
            plt.xlabel("Average Age")
```

```
plt.ylabel("Team")
plt.xticks(rotation=0)
plt.show()
```

```
Team
                         Average Age
0
               Arsenal
                                24.80
1
           Aston Villa
                                25,26
2
           Bournemouth
                                24.63
3
             Brentford
                                25.29
4
              Brighton
                                24.37
5
               Burnley
                                24.29
6
               Chelsea
                                22.03
7
       Crystal Palace
                                25.65
8
               Everton
                                25.62
9
                Fulham
                                27.16
10
             Liverpool
                                23.83
            Luton Town
11
                                25.89
12
      Manchester City
                                25.52
13
    Manchester United
                                24.52
14
     Newcastle United
                                25.34
15
    Nottingham Forest
                                25.27
     Sheffield United
16
                                24.14
    Tottenham Hotspur
                                24.17
17
18
      West Ham United
                                27.00
19
        Wolverhampton
                                24.59
                                Average Players' Age of Each Team
```

24.8 Arsenal 25.26 Aston Villa Bournemouth 24.63 25.29 Brentford 24.37 Brighton 24.29 Burnley 22.03 Chelsea 25.65 Crystal Palace 25.62 Everton 27.16 Fulham 23.83 Liverpool 25.89 Luton Town 25.52 Manchester City Manchester United 24.52 25.34 Newcastle United 25.27 Nottingham Forest Sheffield United 24.14 Tottenham Hotspur 24.17 West Ham United

```
In [487... position_count = df.groupby(['Team', 'Pos']).size().unstack(fill_va

plt.figure(figsize=(12, 6))
    sns.heatmap(position_count, annot=True, cmap="YlGnBu", fmt='d')
    plt.title("Number of Players by Position in Each Team")
    plt.xlabel("Position")
    plt.ylabel("Team")
    plt.show()
```

10

15

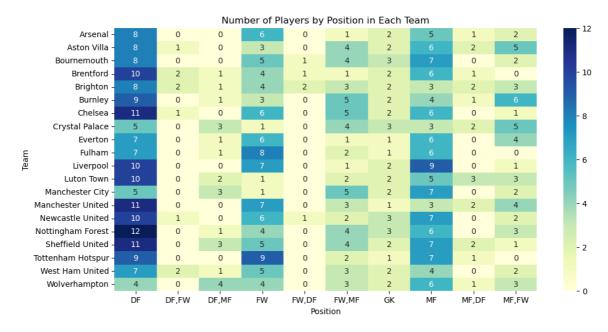
Average Age

20

Wolverhampton

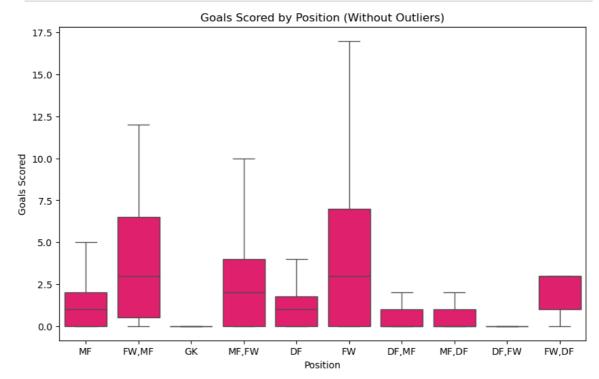
24.59

25



```
In [ ]: Boxplot หาค่าผิดปกติ
Boxplot: เปรียบเทียบจำนวนประตู (Gls) ตามตำแหน่ง
```

```
In [489...
plt.figure(figsize=(10, 6))
sns.boxplot(x=df["Pos"], y=df["Gls"], color="#FF0065", showfliers=F
plt.title("Goals Scored by Position (Without Outliers)")
plt.xlabel("Position")
plt.ylabel("Goals Scored")
plt.show()
```



```
In [491... df['Player'].unique()
```

Out[491... array(['Rodri', 'Phil Foden', 'Ederson', 'Julián Álvarez', 'Kyle W alker',

'Bernardo Silva', 'Erling Haaland', 'Rúben Dias', 'Manuel A kanji',

'Joško Gvardiol', 'Nathan Aké', 'Jeremy Doku', 'Mateo Kovač

```
ić',
       'Kevin De Bruyne', 'John Stones', 'Jack Grealish', 'Rico Le
wis',
       'Matheus Nunes', 'Stefan Ortega', 'Oscar Bobb', 'Kalvin Phi
llips',
'Sergio Gómez', 'Aymeric Laporte', 'Cole Palmer', 'James Mc
atee',
       'Virgil van Dijk', 'Luis Díaz', 'Alexis Mac Allister',
       'Mohamed Salah', 'Alisson', 'Trent Alexander-Arnold',
       'Dominik Szoboszlai', 'Darwin Núñez', 'Wataru Endo',
       'Andrew Robertson', 'Joe Gomez', 'Cody Gakpo', 'Ibrahima Ko
naté',
       'Curtis Jones', 'Diogo Jota', 'Jarell Quansah', 'Ryan Grave
nberch',
       'Harvey Elliott', 'Caoimhín Kelleher', 'Conor Bradley',
       'Joël Matip', 'Kostas Tsimikas', 'Bobby Clark', 'Stefan Baj
cetic',
       'Ben Doak', 'Jayden Danns', 'Owen Beck', 'Thiago Alcántar
a',
       'James McConnell', 'Kaide Gordon', 'William Saliba', 'Decla
n Rice',
       'Martin Ødegaard', 'Ben White', 'Bukayo Saka', 'Gabriel Mag
alhães',
       'David Raya', 'Kai Havertz', 'Gabriel Martinelli',
       'Oleksandr Zinchenko', 'Leandro Trossard', 'Gabriel Jesus',
       'Jakub Kiwior', 'Takehiro Tomiyasu', 'Eddie Nketiah', 'Jorg
inho',
       'Thomas Partey', 'Aaron Ramsdale', 'Emile Smith Rowe',
       'Fabio Vieira', 'Reiss Nelson', 'Jurriën Timber', 'Cédric S
oares',
       'Mohamed Elneny', 'Ethan Nwaneri', 'Conor Gallagher',
       'Moisés Caicedo', 'Nicolas Jackson', 'Axel Disasi', 'Thiago
Silva',
       'Enzo Fernández', 'Đorđe Petrović', 'Raheem Sterling',
       'Levi Colwill', 'Marc Cucurella', 'Malo Gusto', 'Mykhailo M
udryk',
       'Robert Sánchez', 'Benoît Badiashile', 'Noni Madueke',
       'Trevoh Chalobah', 'Ben Chilwell', 'Armando Broja', 'Reece
James',
       'Lesley Ugochukwu', 'Christopher Nkunku', 'Carney Chukwueme
ka',
       'Alfie Gilchrist', 'Ian Maatsen', 'Cesare Casadei', 'Roméo
Lavia',
       'Deivid Washington', 'Mason Burstow', 'Joshua Acheampong',
       'Alex Matos', 'Jimi Tauriainen', 'Bruno Guimarães', 'Fabian
Schär',
       'Anthony Gordon', 'Dan Burn', 'Sean Longstaff', 'Alexander
Isak',
       'Kieran Trippier', 'Miguel Almirón', 'Martin Dúbravka',
       'Sven Botman', 'Nick Pope', 'Joelinton', 'Lewis Miley',
       'Jacob Murphy', 'Jamaal Lascelles', 'Valentino Livramento', 'Elliot Anderson', 'Callum Wilson', 'Emil Krafth', 'Lewis H
all',
       'Harvey Barnes', 'Sandro Tonali', 'Joe Willock', 'Loris Kar
ius',
       'Matt Targett', 'Matt Ritchie', 'Ben Parkinson', 'Paul Dumm
```

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ett',
       'Alex Murphy', 'Joe White', 'Amadou Diallo', 'Michael Ndiwe
ni',
       'Guglielmo Vicario', 'Pedro Porro', 'Son Heung-min',
       'Cristian Romero', 'Dejan Kulusevski', 'Destiny Udogie',
       'Micky van de Ven', 'Pape Matar Sarr', 'James Maddison',
       'Yves Bissouma', 'Brennan Johnson', 'Richarlison',
       'Rodrigo Bentancur', 'Ben Davies', 'Emerson', 'Timo Werne
r',
       'Pierre Højbjerg', 'Oliver Skipp', 'Giovani Lo Celso',
       'Radu Drăgușin', 'Bryan Gil', 'Manor Solomon', 'Eric Dier',
       'Ivan Perišić', 'Davinson Sánchez', 'Alejo Véliz', 'Dane Sc
arlett',
       'Mikey Moore', 'Jamie Donley', 'André Onana', 'Diogo Dalo
t',
       'Bruno Fernandes', 'Alejandro Garnacho', 'Marcus Rashford',
       'Rasmus Højlund', 'Casemiro', 'Kobbie Mainoo', 'Aaron Wan-B
issaka',
        'Scott McTominay', 'Harry Maguire', 'Raphaël Varane',
        'Jonny Evans', 'Antony', 'Victor Lindelöf', 'Christian Erik
sen',
       'Luke Shaw', 'Sofyan Amrabat', 'Lisandro Martínez', 'Mason
Mount',
       'Anthony Martial', 'Sergio Reguilón', 'Amad Diallo', 'Willy Kambwala', 'Facundo Pellistri', 'Hannibal Mejbri',
       'Omari Forson', 'Jadon Sancho', 'Ethan Wheatley',
       'Donny van de Beek', 'Daniel Gore', 'Ollie Watkins', 'Ezri
Konsa',
       'John McGinn', 'Douglas Luiz', 'Emiliano Martínez', 'Pau To
rres',
       'Lucas Digne', 'Moussa Diaby', 'Matty Cash', 'Leon Bailey',
       'Diego Carlos', 'Boubacar Kamara', 'Youri Tielemans',
       'Clément Lenglet', 'Álex Moreno', 'Nicolò Zaniolo', 'Jacob
Ramsey',
       'Morgan Rogers', 'Robin Olsen', 'Jhon Durán', 'Tim Iroegbun
am',
       'Calum Chambers', 'Leander Dendoncker', 'Tyrone Mings', 'Omari Kellyman', 'Philippe Coutinho', 'Bertrand Traoré',
       'Cameron Archer', 'Kaine Kesler-Hayden', 'Finley Munroe',
       'Jaden Philogene Bidace', 'Vladimír Coufal', 'Emerson Palmi
eri',
       'Jarrod Bowen', 'James Ward-Prowse', 'Tomáš Souček', 'Kurt
Zouma',
       'Alphonse Areola', 'Lucas Paquetá', 'Edson Álvarez',
       'Mohammed Kudus', 'Nayef Aguerd', 'Michail Antonio',
       'Konstantinos Mavropanos', 'Łukasz Fabiański', 'Angelo Ogbo
nna',
       'Saïd Benrahma', 'Ben Johnson', 'Aaron Cresswell', 'Pablo F
ornals',
       'Danny Ings', 'Maxwel Cornet', 'Divin Mubama', 'George Eart
hy',
       'Thilo Kehrer', 'Kaelan Casey', 'Joachim Andersen',
       'Tyrick Mitchell', 'Jordan Ayew', 'Jefferson Lerma',
       'Jean-Philippe Mateta', 'Eberechi Eze', 'Chris Richards',
       'Marc Guéhi', 'Joel Ward', 'Will Hughes', 'Sam Johnstone',
       'Dean Henderson', 'Odsonne Édouard', 'Jeffrey Schlupp',
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'Daniel Muñoz', 'Adam Wharton', 'Nathaniel Clyne', 'Michael
Olise',
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'James Tomkins', 'Remi Matthews', 'Bernd Leno', 'Antonee Ro
binson',
       'Andreas Pereira', 'João Palhinha', 'Timothy Castagne',
       'Calvin Bassey', 'Alex Iwobi', 'Willian', 'Tosin Adarabioy
ο',
       'Rodrigo Muniz', 'Raúl Jiménez', 'Tim Ream', 'Bobby Reid',
       'Harry Wilson', 'Issa Diop', 'Harrison Reed', 'Tom Cairne
у',
       'Saša Lukić', 'Kenny Tete', 'Carlos Vinícius', 'Adama Traor
é',
       'Luke Harris', 'Fodé Ballo-Touré', 'Aleksandar Mitrović',
       'Jordan Pickford', 'James Tarkowski', 'Jarrad Branthwaite',
       'James Garner', 'Dwight McNeil', 'Abdoulaye Doucouré',
       'Vitaliy Mykolenko', 'Ashley Young', 'Dominic Calvert-Lewi
n',
       'Jack Harrison', 'Idrissa Gana Gueye', 'Amadou Onana',
       'Ben Godfrey', 'Nathan Patterson', 'Beto', 'Séamus Colema
n',
       'Arnaut Danjuma', 'Michael Keane', 'André Gomes', 'Lewis Do
bbin',
       'Youssef Chermiti', 'Neal Maupay', 'Thomas Cannon',
       'Tyler Onyango', 'Lewis Warrington', 'Pascal Groß', 'Lewis
Dunk',
       'Jan Paul van Hecke', 'Simon Adingra', 'Billy Gilmour',
       'Bart Verbruggen', 'Danny Welbeck', 'João Pedro', 'Igor',
       'Joël Veltman', 'Jason Steele', 'Facundo Buonanotte',
       'Kaoru Mitoma', 'Evan Ferguson', 'Carlos Baleba',
       'Pervis Estupiñán', 'Adam Webster', 'Adam Lallana', 'James
Milner',
       'Tarig Lamptey', 'Jack Hinshelwood', 'Solly March', 'Jakub
Moder',
       'Mahmoud Dahoud', 'Julio Enciso', 'Ansu Fati', 'Valentín Ba
rco',
       'Odeluga Offiah', "Mark O'Mahony", 'Benicio Boaitey',
       'Illia Zabarnyi', 'Dominic Solanke', 'Ryan Christie', 'Net
ο',
       'Lewis Cook', 'Marcos Senesi', 'Justin Kluivert', 'Adam Smi
th',
       'Marcus Tavernier', 'Antoine Semenyo', 'Milos Kerkez',
       'Lloyd Kelly', 'Philip Billing', 'Max Aarons', 'Dango Ouatt
ara',
       'Alex Scott', 'Luis Sinisterra', 'Chris Mepham', 'Mark Trav
ers',
       'Joe Rothwell', 'Enes Ünal', 'David Brooks', 'Ionut Radu',
       'Jaidon Anthony', 'Tyler Adams', 'James Hill', 'Kieffer Moo
re',
       'Hamed Junior Traorè', 'Romain Faivre', 'Dominic Sadi',
       'Max Kilman', 'Nélson Semedo', 'José Sá', 'Mario Lemina',
       'João Gomes', 'Toti Gomes', 'Matheus Cunha', 'Rayan Aït—Nou
ri',
       'Craig Dawson', 'Hwang Hee-chan', 'Pablo Sarabia', 'Pedro N
eto',
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'Tommy Doyle', 'Jean-Ricner Bellegarde', 'Matt Doherty',
       'Santiago Bueno', 'Boubacar Traoré', 'Hugo Bueno',
       'Daniel Bentley', 'Fábio Silva', 'Leon Chiwome', 'Nathan Fr
aser',
       'Sasa Kalajdzic', 'Tawanda Chirewa', 'Jonny Castro',
       'Enso Gonzalez', 'Mark Flekken', 'Vitaly Janelt',
       'Christian Nørgaard', 'Nathan Collins', 'Yoane Wissa',
       'Ethan Pinnock', 'Mathias Jensen', 'Mads Roerslev', 'Bryan
Mbeumo',
       'Kristoffer Ajer', 'Ivan Toney', 'Keane Lewis-Potter', 'Ben
Mee',
       'Mathias Jørgensen', 'Frank Onyeka', 'Aaron Hickey',
       'Mikkel Damsgaard', 'Saman Ghoddos', 'Yehor Yarmoliuk',
       'Rico Henry', 'Kevin Schade', 'Shandon Baptiste',
       'Thomas Strakosha', 'Michael Olakigbe', 'Josh Dasilva',
       'Myles Peart-Harris', 'Morgan Gibbs-White', 'Murillo',
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s Wood',
       'Danilo', 'Ola Aina', 'Orel Mangala', 'Nicolás Domínguez',
       'Neco Williams', 'Willy Boly', 'Matt Turner', 'Matz Sels',
       'Moussa Niakhate', 'Harry Toffolo', 'Ibrahim Sangaré',
       'Taiwo Awoniyi', 'Serge Aurier', 'Gonzalo Montiel',
       'Andrew Omobamidele', 'Divock Origi', 'Nuno Tavares',
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lipe',
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engi',
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gbene',
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       'Tom Lockyer', 'Marvelous Nakamba', 'Jacob Brown',
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s',
       'Fred Onyedinma', 'Mads Juel Andersen', 'Cauley Woodrow',
       'Luke Berry', 'Joseph Johnson', 'James Shea', 'Zack Nelso
n',
       'Sander Berge', "Dara O'Shea", 'James Trafford', 'Zeki Amdo
uni',
       'Vitinho', 'Charlie Taylor', 'Wilson Odobert', 'Josh Brownh
ill',
       'Josh Cullen', 'Lyle Foster', 'Jacob Bruun Larsen',
       'Maxime Estève', 'Lorenz Assignon', 'Jordan Beyer',
       'Luca Koleosho', 'Jóhann Berg Guðmundsson', 'Ameen Al-Dakhi
l',
       'Arijanet Muric', 'David Datro Fofana', 'Connor Roberts',
       'Jay Rodriguez', 'Hannes Delcroix', 'Aaron Ramsey', 'Hjalmar Ekdal', 'Mike Trésor', 'Anass Zaroury', 'Benson Ma
nuel',
       'Nathan Redmond', 'Jack Cork', 'Michael Obafemi',
       'Han-Noah Massengo', 'Gustavo Hamer', 'Jayden Bogle',
       'Jack Robinson', 'Vinicius Souza', 'Anel Ahmedhodžić',
       'Wes Foderingham', 'Auston Trusty', 'Oliver Norwood',
       'Oliver McBurnie', 'Ben Osborn', 'Ben Brereton', 'Andre Bro
```

```
oks',
                   'George Baldock', 'Oliver Arblaster', 'Luke Thomas',
                   'William Osula', 'Ivo Grbić', 'Mason Holgate', 'Yasser Laro
           uci',
                   'John Egan', 'Max Lowe', 'Anis Ben Slimane', 'Bénie Adama T
           raore',
                   'Rhian Brewster', 'Chris Basham', 'Tom Davies',
                   'Rhys Norrington-Davies', 'John Fleck', 'Sam Curtis',
                   'Daniel Jebbison', 'Antwoine Hackford', 'Sydie Peck', 'Ryan
           One'],
                 dtype=object)
 In []: การแสดงผลการทำประตู (Goals) กับ Expected Goals (xG) (Scatter Plot)
          การแสดงผลการทำประตู (Gls) และค่าสถิติที่คาดการณ์ (Expected Goals, xG)
 In []:
In [493... | df['Player'] = df['Player'].str.strip().str.lower()
          df[df['Player'].str.contains('virgil van dijk')]
Out [493...
               Player Nation Pos Age MP Starts
                                                       Min 90s Gls Ast ... Ast_9
                virgil
                                                 36 3177.0 35.3 2.0
           25
                 van nl NED
                               DF 32.0
                                          36
                                                                       2.0 ...
                                                                                  0.0
                 dijk
          1 rows × 34 columns
In [495... df['Nation'].unique()
Out[495... array(['es ESP', 'eng ENG', 'br BRA', 'ar ARG', 'pt POR', 'no NO
           R',
                   'ch SUI', 'hr CRO', 'nl NED', 'be BEL', 'de GER', 'co COL',
                   'eq EGY', 'hu HUN', 'uy URU', 'jp JPN', 'sct SCO', 'fr FR
           Α',
                   'ie IRL', 'nir NIR', 'cm CMR', 'gr GRE', 'wls WAL', 'ua UK
           R',
                   'pl POL', 'it ITA', 'gh GHA', 'ec ECU', 'sn SEN', 'rs SRB',
                   'al ALB', 'se SWE', 'py PAR', 'sk SVK', 'kr KOR', 'ml MLI', 'dk DEN', 'ro ROU', 'il ISR', 'ma MAR', 'ci CIV', 'tn TUN', 'jm JAM', 'bf BFA', 'cz CZE', 'mx MEX', 'dz ALG', 'us USA',
                   'ng NGA', 'gw GNB', 'tr TUR', 'ga GAB', 'at AUT', 'zw ZIM'
                             'ir IRN', 'gd GRN', 'nz NZL', 'cr CRC',
                                                                         'za RSA',
                   'cd COD',
                   'tg TOG', 'is ISL', 'xk KVX', 'ao ANG', 'ba BIH', 'cl CH
           I'],
                 dtype=object)
In [497...
          Nation_counts = df["Nation"].value_counts()
          print("Number of players from each Nation:")
          print(Nation_counts)
          plt.figure(figsize=(12,6))
          sns.barplot(x=Nation_counts.index, y=Nation_counts.values,palette="
          plt.xticks(rotation=90)
```

```
plt.xlabel("Nation")
plt.ylabel("Number of Players")
plt.title("Players by Nation")
plt.show()
```

Number of players from each Nation:

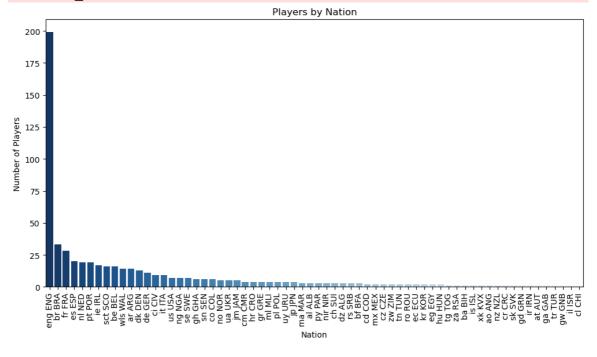
Nation eng ENG 199 br BRA 33 fr FRA 28 es ESP 20 nl NED 19 ga GAB 1 tr TUR 1 gw GNB 1 il ISR 1 cl CHI 1

Name: count, Length: 66, dtype: int64

/var/folders/fg/bz8nn0xj1tj4z45g40xf_hf00000gn/T/ipykernel_79919/409 5907148.py:6: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set `legend =False` for the same effect.

sns.barplot(x=Nation_counts.index, y=Nation_counts.values,palette
="Blues_r")



In [499... Nation_counts.index

```
Out[499... Index(['eng ENG', 'br BRA', 'fr FRA', 'es ESP', 'nl NED', 'pt PO
          R', 'ie IRL',
                  'sct SCO', 'be BEL', 'wls WAL', 'ar ARG', 'dk DEN', 'de GE
          R', 'ci CIV',
                  'it ITA', 'us USA', 'ng NGA', 'se SWE', 'gh GHA', 'sn SEN',
          'co COL',
                  'no NOR', 'ua UKR', 'jm JAM', 'cm CMR', 'hr CRO', 'gr GRE',
          'ml MLI',
                  'pl POL', 'uy URU', 'jp JPN', 'ma MAR', 'al ALB', 'py PAR',
          'nir NIR',
                  'ch SUI', 'dz ALG', 'rs SRB', 'bf BFA', 'cd COD', 'mx MEX',
          'cz CZE',
                  'zw ZIM', 'tn TUN', 'ro ROU', 'ec ECU', 'kr KOR', 'eg EGY',
          'hu HUN',
                  'tg TOG', 'za RSA', 'ba BIH', 'is ISL', 'xk KVX', 'ao ANG',
          'nz NZL',
                  'cr CRC', 'sk SVK', 'gd GRN', 'ir IRN', 'at AUT', 'ga GAB',
          'tr TUR',
                  'gw GNB', 'il ISR', 'cl CHI'],
                dtype='object', name='Nation')
         import matplotlib.pyplot as plt
          import seaborn as sns
          continent_map = {
              # Europe
              "ENG": "Europe", "FRA": "Europe", "ESP": "Europe", "NED": "Euro
              "IRL": "Europe", "SCO": "Europe", "BEL": "Europe", "WAL": "Euro
"GER": "Europe", "ITA": "Europe", "SWE": "Europe", "UKR": "Euro
              "GRE": "Europe", "ALB": "Europe", "POL": "Europe", "SVK": "Euro
              "SUI": "Europe", "SRB": "Europe", "ROU": "Europe", "CZE": "Euro
              "KVX": "Europe", "BIH": "Europe", "AUT": "Europe", "TUR": "Euro
              # South America
              "BRA": "South America", "ARG": "South America", "COL": "South A
              "URU": "South America", "ECU": "South America", "PAR": "South A
              "CHI": "South America",
              # North America
              "MEX": "North America", "USA": "North America", "CRC": "North A
              "JAM": "North America", "GRN": "North America",
              # Africa
              "GHA": "Africa", "SEN": "Africa", "CIV": "Africa", "CMR": "Afri
              "BFA": "Africa", "ALG": "Africa", "NGA": "Africa", "GNB": "Afri
              "ZIM": "Africa", "COD": "Africa", "RSA": "Africa", "TOG": "Afri
              "EGY": "Africa", "MAR": "Africa", "TUN": "Africa", "DZA": "Afri
              # Asia
              "JPN": "Asia", "KOR": "Asia", "IRN": "Asia", "ISR": "Asia",
              # Oceania
              "NZL": "Oceania"
          }
          def extract_country_code(nation_str):
```

```
return nation_str.split()[-1]
df["Country_Code"] = df["Nation"].apply(extract_country_code)

df["Continent"] = df["Country_Code"].map(continent_map)
df["Continent"].value_counts()
print("Number of players by Continent:")
print(continent_counts)
plt.figure(figsize=(10, 6))
sns.barplot(x=continent_counts.index, y=continent_counts.values,pal
plt.xlabel("Continent")
plt.ylabel("Number of Players")
plt.title("Players by Continent")
plt.show()
```

Number of players by Continent:

Continent

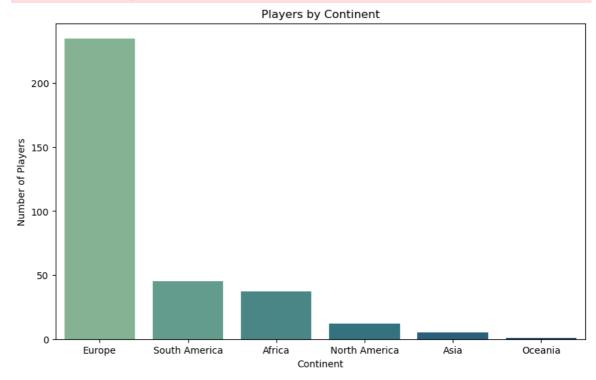
Europe 235
South America 45
Africa 37
North America 12
Asia 5
Oceania 1

Name: count, dtype: int64

/var/folders/fg/bz8nn0xj1tj4z45g40xf_hf00000gn/T/ipykernel_79919/218 4331400.py:49: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set `legend =False` for the same effect.

sns.barplot(x=continent_counts.index, y=continent_counts.values,pa
lette="crest")



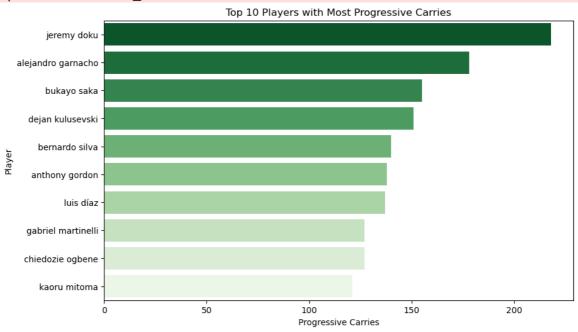
In [505... top_10_progressive_carries = df[['Player', 'Team', 'PrgC']].sort_va

```
plt.figure(figsize=(10, 6))
sns.barplot(x='PrgC', y='Player', data=top_10_progressive_carries,
plt.title('Top 10 Players with Most Progressive Carries')
plt.xlabel('Progressive Carries')
plt.ylabel('Player')
plt.show()
```

/var/folders/fg/bz8nn0xj1tj4z45g40xf_hf00000gn/T/ipykernel_79919/169
1219761.py:5: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `y` variable to `hue` and set `legend =False` for the same effect.

sns.barplot(x='PrgC', y='Player', data=top_10_progressive_carries,
palette='Greens_r')



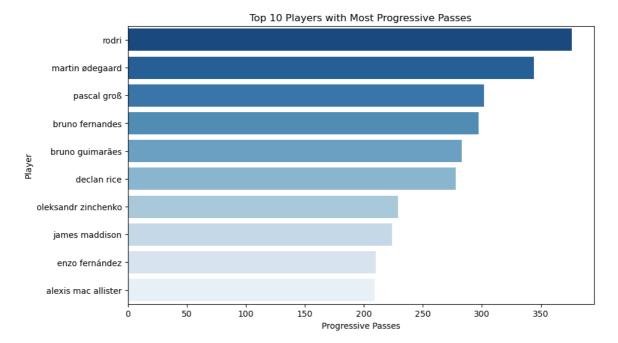
```
In [507... top_10_progressive_passers = df[['Player', 'Team', 'PrgP']].sort_va

plt.figure(figsize=(10, 6))
    sns.barplot(x='PrgP', y='Player', data=top_10_progressive_passers,
    plt.title('Top 10 Players with Most Progressive Passes')
    plt.xlabel('Progressive Passes')
    plt.ylabel('Player')
    plt.show()
```

/var/folders/fg/bz8nn0xj1tj4z45g40xf_hf00000gn/T/ipykernel_79919/218 053844.py:4: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `y` variable to `hue` and set `legend =False` for the same effect.

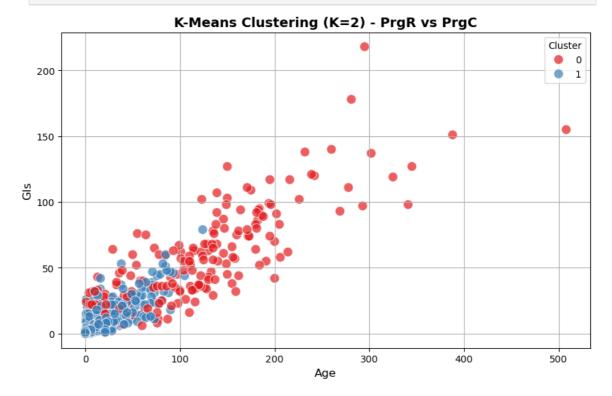
sns.barplot(x='PrgP', y='Player', data=top_10_progressive_passers,
palette='Blues_r')



```
In [509... df.columns
```

```
In [571...
        from sklearn.cluster import KMeans
         from sklearn.preprocessing import StandardScaler
         import matplotlib.pyplot as plt
         import seaborn as sns
        'PrgC', 'PrgP', 'PrgR', 'Gls_90', 'Ast_90']
         df_cluster = df.dropna(subset=features)
         scaler = StandardScaler()
         df_scaled = scaler.fit_transform(df_cluster[features])
         kmeans = KMeans(n_clusters=2, random_state=0, n_init=10)
         df_cluster['Cluster'] = kmeans.fit_predict(df_scaled)
         plt.figure(figsize=(10, 6))
         sns.scatterplot(x=df_cluster["PrgR"], y=df_cluster["PrgC"], hue=df_
                       palette="Set1", alpha=0.7, s=100)
         plt.xlabel("Age", fontsize=12)
         plt.ylabel("Gls", fontsize=12)
         plt.title("K-Means Clustering (K=2) - PrgR vs PrgC", fontsize=14, f
         plt.legend(title="Cluster")
```

plt.grid(True)
plt.show()



- In []: 1.
- .. Cluster 0 (สีแดง):
 - ผู้เล่นที่มีจำนวน Progressive Runs (PrgR) และ Progressive
 - อาจเป็นกลุ่มผู้เล่นที่มีสไตล์ชอบครองบอลและพาบอลไปข้างหน้าเป็นหลัก
 - มักเป็นนักเตะในตำแหน่ง ปีก (Winger) หรือ กองกลางตัวรุก (Atta
 - 2. Cluster 1 (สีฟ้า):
 - ผู้เล่นที่มีจำนวน Progressive Runs (PrgR) และ Progressive
 - อาจเป็นผู้เล่นแนวรับที่เน้นการจ่ายบอลสั้น ๆ หรือนักเตะที่มีบทบาทไม่สูง
 - มักเป็นนักเตะในตำแหน่ง กองหลัง (Defender) หรือ กองกลางตัวรับ

In [511... df_cluster.head()

Out [511...

	Player	Nation	Pos	Age	MP	Starts	Min	90s	Gls	Ast	•••	G
0	Rodri	es ESP	MF	27.0	34	34	2931.0	32.6	8.0	9.0		
1	Phil Foden	eng ENG	FW,MF	23.0	35	33	2857.0	31.7	19.0	8.0	•••	
2	Ederson	br BRA	GK	29.0	33	33	2785.0	30.9	0.0	0.0	•••	
3	Julián Álvarez	ar ARG	MF,FW	23.0	36	31	2647.0	29.4	11.0	8.0	•••	
4	Kyle Walker	eng ENG	DF	33.0	32	30	2767.0	30.7	0.0	4.0		

5 rows × 35 columns

In [535... cluster_summary = df_cluster.groupby('Cluster')[features].mean()

cluster_summary['count'] = df_cluster['Cluster'].value_counts() cluster_summary Out [535... MP Starts Min 90s C Age Cluster 24.063348 0 25.954751 29.203620 2122.529412 23.582353 2.2624 **1** 24.066225 10.115894 4.894040 476.625828 5.296026 0.3576 **2** 25.298246 32.894737 27.438596 2418.228070 26.864912 10.3333 In [564... df_cluster['PrgR'].max() Out [564... 508.0 In []: In [560... df_cluster[(df_cluster['PrgC']>=200)&(df_cluster['Age']<=23)]</pre> Out [560... Gн **Player Nation** Min 90s Gls Ast Pos Age MP Starts PK_ jeremy 11 be BEL FW,MF 21.0 29 0 18 1595.0 17.7 3.0 8.0 doku 1 rows × 37 columns In [566... | df_cluster[(df_cluster['PrgR']>=400)&(df_cluster['Age']<=23)]</pre> Out [566... G+ Player Nation Pos Age MP Starts Min 90s Gls Ast PK_ eng bukayo 59 21.0 35 35 2919.0 32.4 16.0 9.0 0. saka **ENG** 1 rows × 37 columns In [517... df.head()

Out[517		Player	Nation	Pos	Age	MP	Starts	Min	90s	Gls	Ast	•••	P
	0	rodri	es ESP	MF	27.0	34	34	2931.0	32.6	8.0	9.0	•••	
	1	phil foden	eng ENG	FW,MF	23.0	35	33	2857.0	31.7	19.0	8.0		
	2	ederson	br BRA	GK	29.0	33	33	2785.0	30.9	0.0	0.0		
	3	julián álvarez	ar ARG	MF,FW	23.0	36	31	2647.0	29.4	11.0	8.0	•••	
	4	kyle walker	eng ENG	DF	33.0	32	30	2767.0	30.7	0.0	4.0		
	5 ro	ws × 36 d	columns										
In [521	# แยกตำแหน่งออกเป็นหลายคอลัมน์และใส่ค่า 1/0 position_dummies = df['Pos'].str.get_dummies(sep='/') # รวมเข้ากับ DataFrame เดิม df_cluster = pd.concat([df_cluster, position_dummies], axis=1)												
In [523	<pre>df_cluster.head(5) df_cluster['Min'].max</pre>												
Out[523	1 2 3 4 57 57 57 57	278 264 276 5 2 6 2 7 1 8 1	67.0 85.0 17.0 67.0 28.0 21.0 13.0 10.0				2931.	Ø					
In [573	<pre>import pandas as pd from sklearn.model_selection import train_test_split from sklearn.ensemble import RandomForestClassifier from sklearn.metrics import accuracy_score, classification_report, import matplotlib.pyplot as plt df['Transfer_Chance'] = ((df['G+A_90'] > 0.5) & (df['Min'] < 1000)) features = df[['Age', 'Min', 'G+A_90', 'xG_90', 'xAG_90']] target = df['Transfer_Chance'] X_train, X_test, y_train, y_test = train_test_split(features, targe) model = RandomForestClassifier(n_estimators=100, random_state=42)</pre>)))	

```
model.fit(X_train, y_train)
         y_pred = model.predict(X_test)
         print("Accuracy:", accuracy_score(y_test, y_pred))
         print(classification_report(y_test, y_pred))
         mae = mean_absolute_error(y_test, y_pred)
         print(f"Mean Absolute Error (MAE): {mae:.4f}")
         df['Transfer_Probability'] = model.predict_proba(features)[:, 1]
         top_5_transfers = df.sort_values(by='Transfer_Probability', ascendi
         print(top_5_transfers[['Player', 'Age', 'Min', 'G+A_90', 'xG_90',
        Accuracy: 1.0
                      precision
                                    recall f1-score
                                                       support
                   0
                           1.00
                                      1.00
                                                           168
                                                1.00
                   1
                            1.00
                                      1.00
                                                1.00
                                                             6
                                                           174
                                                1.00
            accuracy
                                                           174
                           1.00
                                      1.00
                                                1.00
           macro avg
                           1.00
                                      1.00
                                                1.00
                                                           174
        weighted avg
        Mean Absolute Error (MAE): 0.0000
                       Player
                                Age
                                       Min G+A_90 xG_90
                                                           xAG_90
        307
                 adama traoré 27.0 377.0
                                               1.19
                                                      0.36
                                                              0.17
        447
                 kevin schade 21.0 333.0
                                               0.81
                                                      0.32
                                                              0.19
        223
                                                      0.38
                                                              0.06
                   ihon durán 19.0 475.0
                                               0.95
        388
                    enes ünal 26.0 328.0
                                               1.10
                                                      0.80
                                                              0.28
        448
             shandon baptiste 25.0 229.0
                                               0.79
                                                      0.35
                                                              0.08
             Transfer Probability
        307
                              0.99
        447
                              0.98
        223
                              0.98
        388
                              0.97
        448
                              0.96
In [587... | import pandas as pd
         import numpy as np
         from sklearn.model_selection import train_test_split, cross_val_sco
         from sklearn.linear_model import LinearRegression
         from sklearn.metrics import mean_squared_error, r2_score, make_scor
         import matplotlib.pyplot as plt
         import seaborn as sns
         features = ['Age', 'MP', 'xG', 'npxG', 'PrgP', 'PrgC']
         X = df[features]
         y = df['Gls']
         player_names = df['Player']
         X_train, X_test, y_train, y_test, player_train, player_test = train
             X, y, player_names, test_size=0.2, random_state=42)
```

```
model = LinearRegression()
         model.fit(X_train, y_train)
         kf = KFold(n splits=5, shuffle=True, random state=42)
         mse_scorer = make_scorer(mean_squared_error)
         cv_scores = cross_val_score(model, X, y, cv=kf, scoring=mse_scorer)
         print(f'Cross Validation Scores (MSE): {cv_scores}')
         print(f'Average MSE: {np.mean(cv_scores):.2f}')
         print(f'Root Mean Squared Error (RMSE): {np.sqrt(np.mean(cv_scores)
         y_pred = model.predict(X_test)
         print(f'Mean Squared Error (MSE): {mean_squared_error(y_test, y_pre
         print(f'Root Mean Squared Error (RMSE): {np.sqrt(mean_squared_error
         print(f'R-squared (R2): {r2_score(y_test, y_pred):.2f}')
         comparison = pd.DataFrame({
             'Player': player_test,
             'Actual': y_test,
             'Predicted': y_pred
         }).reset_index(drop=True)
         comparison['Error'] = comparison['Actual'] - comparison['Predicted']
         print(comparison[['Player', 'Actual', 'Predicted', 'Error']].head(1
        Cross Validation Scores (MSE): [1.35445256 1.57103467 2.31105668 1.3
        3356356 1.78656411]
        Average MSE: 1.67
        Root Mean Squared Error (RMSE): 1.29
        Mean Squared Error (MSE): 1.35
        Root Mean Squared Error (RMSE): 1.16
        R-squared (R^2): 0.93
                     Player Actual Predicted
                                                   Error
        0
                                0.0 -0.072453 0.072453
                 sam curtis
        1
          nathaniel clyne
                                0.0 0.106243 -0.106243
        2
                ian maatsen
                               0.0 0.694573 -0.694573
        3
          marcus rashford
                              7.0 7.287379 -0.287379
        4
                               1.0 2.560460 -1.560460
                 ryan yates
                                0.0 -0.374227 0.374227
        5
                 bernd leno
        6
              luca koleosho
                               1.0 2.094824 -1.094824
        7 mikkel damsgaard
                                0.0 0.914575 -0.914575
        8
               ivan perišić
                                0.0 0.042549 -0.042549
        9 łukasz fabiański
                                0.0 -0.192322 0.192322
In [601... | import pandas as pd
         import numpy as np
         from sklearn.model_selection import train_test_split, cross_val_sco
         from sklearn.linear_model import LogisticRegression
         from sklearn.metrics import accuracy_score, classification_report,
         import matplotlib.pyplot as plt
         import seaborn as sns
         df['Overperformer'] = (df['Gls'] > df['xG']).astype(int)
         features = ['Age', 'MP', 'npxG', 'PrgP', 'PrgC', 'Gls_90', 'Ast_90'
```

```
X = df[features]
 y = df['Overperformer']
 X_train, X_test, y_train, y_test = train_test_split(X, y, test_size
 model = LogisticRegression(max_iter=1000, random_state=42)
 model.fit(X_train, y_train)
 y_pred = model.predict(X_test)
 print(f'Accuracy: {accuracy_score(y_test, y_pred):.2%}')
 print(classification_report(y_test, y_pred))
 df['Predicted Overperformer'] = model.predict(X)
 overperformers = df[df['Predicted_Overperformer'] == 1]
 print("Top 10 Overperformers:")
 print(overperformers[['Player', 'Gls', 'xG']].sort_values(by='Gls',
Accuracy: 87.07%
                           recall f1-score
              precision
                                              support
           0
                   0.87
                             0.97
                                       0.92
                                                   86
           1
                   0.86
                             0.60
                                       0.71
                                                   30
                                                  116
                                       0.87
    accuracy
                             0.78
                                       0.81
                                                  116
   macro avg
                   0.87
weighted avg
                   0.87
                             0.87
                                       0.86
                                                  116
Top 10 Overperformers:
                   Player
                            Gls
                                   xG
83
              cole palmer
                           22.0
                                 18.2
117
           alexander isak 21.0
                                20.3
1
               phil foden 19.0
                                10.3
28
            mohamed salah 18.0
                                 21.2
146
            son heung-min 17.0
                                12.0
265
     jean-philippe mateta 16.0
                                 10.9
59
              bukayo saka 16.0
                                15.5
458
               chris wood 14.0
                                11.9
              kai havertz 13.0
62
                                 12.3
404
            matheus cunha 12.0
                                  9.5
```

In []: