# BigData | Premier League 2024-25 Prediction Model

#### Introducere

Un model de predicție pentru clasamentul final al sezonului Premier League 2024-25 este dezvoltat folosind datele existente până la etapa 22 a meciurilor (ianuarie 2025). Modelul prezice clasamentul final și rezultatele meciurilor rămase (MW 23-38) folosind tehnici de învățare automată și analiză statistică.

#### Objective

- 1. **Predicția clasamentului final** pentru sezonul 2024-25 bazat pe forma recentă a echipelor
- 2. **Analiza factorilor de risc** și inconsistența echipelor
- 3. Calcularea avantajului de acasă și impactul asupra rezultatelor
- 4. **Vizualizarea evoluției punctelor** cu zone de calificare (Champions League, Europa League, retrogradare)
- 5. **Evaluarea performanței modelului** prin statistici și analize comparative

#### Metodologie

Modelul folosește:

- Date istorice: Sezonul curent (2024-25) pentru relevanță maximă
- **Factori considerați**: Forma recentă, avantajul de acasă, factori de risc, performanța head-to-head
- Algoritm: Predicție probabilistică bazată pe Points Per Game (PPG) și win rate
- Validare: Comparație cu clasamentul actual și analiza consistenței

Datele provin din Premier League Dataset și includ meciuri din 1993-2025.

#### 1. SPARK

#### a. Inițializarea Spark și încărcarea datelor

În această etapă, inițializăm o sesiune Spark și încărcăm setul de date EPL într-un DataFrame Spark pentru a putea lucra cu volume mari de date.

```
import builtins
from pyspark.sql import SparkSession

# Inițializăm sesiunea Spark
spark = SparkSession.builder.appName("EPL Analysis").getOrCreate()
```

```
# Încărcăm datele EPL într-un DataFrame Spark
df = spark.read.option("header", True).option(
  "inferSchema", True).csv("../data/PremierLeague_mid_season.csv")
# Afișăm primele 5 rânduri pentru a verifica încărcarea corectă a
datelor
df.show(5)
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MarketMaxAwayTeam|MarketAvgHomeTeam|MarketAvgDraw|MarketAvgAwayTeam|
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## b. Explorarea structurii și a valorilor lipsă

În această secțiune, vom analiza structura setului de date și vom identifica valorile lipsă.

```
# Afisăm schema DataFrame-ului pentru a vedea tipurile de date si
coloanele disponibile
from pyspark.sql.functions import col, sum as spark sum
df.printSchema()
# Redenumim coloanele care contin caractere speciale (ex: punctul) cu
underscore
for col name in df.columns:
    if '.' in col_name:
        df = df.withColumnRenamed(col name, col name.replace('.',
' '))
# Verificăm noile nume de coloane
print(df.columns)
# Calculăm numărul de valori lipsă (NULL) pentru fiecare coloană
missing counts = df.select(
    [spark sum(col(c).isNull().cast("int")).alias(c) for c in
df.columns])
missing_counts.show()
root
 |-- MatchID: string (nullable = true)
 |-- Season: string (nullable = true)
 -- MatchWeek: integer (nullable = true)
 -- Date: date (nullable = true)
  -- Time: timestamp (nullable = true)
 -- HomeTeam: string (nullable = true)
 -- AwayTeam: string (nullable = true)
 -- FullTimeHomeTeamGoals: integer (nullable = true)
 -- FullTimeAwayTeamGoals: integer (nullable = true)
 -- FullTimeResult: string (nullable = true)
 |-- HalfTimeHomeTeamGoals: integer (nullable = true)
  --- HalfTimeAwayTeamGoals: integer (nullable = true)
 |-- HalfTimeResult: string (nullable = true)
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|-- Referee: string (nullable = true)
 -- HomeTeamShots: integer (nullable = true)
 |-- AwayTeamShots: integer (nullable = true)
 -- HomeTeamShotsOnTarget: integer (nullable = true)
 -- AwayTeamShotsOnTarget: integer (nullable = true)
 -- HomeTeamCorners: integer (nullable = true)
 -- AwayTeamCorners: integer (nullable = true)
 -- HomeTeamFouls: integer (nullable = true)
 -- AwayTeamFouls: integer (nullable = true)
 -- HomeTeamYellowCards: integer (nullable = true)
 -- AwayTeamYellowCards: integer (nullable = true)
 -- HomeTeamRedCards: integer (nullable = true)
 -- AwayTeamRedCards: integer (nullable = true)
 -- B365HomeTeam: double (nullable = true)
 -- B365Draw: double (nullable = true)
 -- B365AwayTeam: double (nullable = true)
 -- B3650ver2.5Goals: double (nullable = true)
 -- B365Under2.5Goals: double (nullable = true)
 -- MarketMaxHomeTeam: double (nullable = true)
 -- MarketMaxDraw: double (nullable = true)
 -- MarketMaxAwayTeam: double (nullable = true)
 -- MarketAvgHomeTeam: double (nullable = true)
 -- MarketAvgDraw: double (nullable = true)
 -- MarketAvgAwayTeam: double (nullable = true)
 -- MarketMaxOver2.5Goals: double (nullable = true)
 -- MarketMaxUnder2.5Goals: double (nullable = true)
 -- MarketAvgOver2.5Goals: double (nullable = true)
 -- MarketAvgUnder2.5Goals: double (nullable = true)
 |-- HomeTeamPoints: integer (nullable = true)
 |-- AwayTeamPoints: integer (nullable = true)
['MatchID', 'Season', 'MatchWeek', 'Date', 'Time', 'HomeTeam',
'AwayTeam', 'FullTimeHomeTeamGoals', 'FullTimeAwayTeamGoals',
'FullTimeResult', 'HalfTimeHomeTeamGoals', 'HalfTimeAwayTeamGoals',
'HalfTimeResult', 'Referee', 'HomeTeamShots', 'AwayTeamShots',
'HomeTeamShotsOnTarget', 'AwayTeamShotsOnTarget', 'HomeTeamCorners',
'AwayTeamCorners', 'HomeTeamFouls', 'AwayTeamFouls',
'HomeTeamYellowCards', 'AwayTeamYellowCards', 'HomeTeamRedCards',
'AwayTeamRedCards', 'B365HomeTeam', 'B365Draw', 'B365AwayTeam',
'B3650ver2 5Goals', 'B365Under2 5Goals', 'MarketMaxHomeTeam',
'MarketMaxDraw', 'MarketMaxAwayTeam', 'MarketAvgHomeTeam',
'MarketAvgDraw', 'MarketAvgAwayTeam', 'MarketMaxOver2 5Goals',
'MarketMaxUnder2_5Goals', 'MarketAvgOver2_5Goals', 'MarketAvgUnder2_5Goals', 'HomeTeamPoints', 'AwayTeamPoints']
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# c. Separarea datelor pentru analize generale vs. analize detaliate

Pentru a asigura acuratețea analizelor, vom separa datele în două subseturi:

- Un subset pentru statistici generale (clasamente, goluri, puncte), unde folosim toate meciurile disponibile, chiar dacă unele coloane au valori lipsă.
- Un subset pentru analize detaliate (șuturi, cornere, arbitri etc.), unde păstrăm doar meciurile din sezonul 2000-2001 încolo și doar acele rânduri care au date complete pe coloanele relevante.

```
from pyspark.sql.functions import col
# Definim lista cu numele coloanelor de eliminat
cols_to_drop = [
    "Time",
    "B365HomeTeam", "B365Draw", "B365AwayTeam", "B3650ver2 5Goals",
"B365Under2_5Goals",
    "MarketMaxHomeTeam", "MarketMaxDraw", "MarketMaxAwayTeam",
    "MarketAvgHomeTeam", "MarketAvgDraw", "MarketAvgAwayTeam",
    "MarketMaxOver2_5Goals", "MarketMaxUnder2_5Goals", "MarketAvgOver2_5Goals", "MarketAvgUnder2_5Goals"
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# Eliminăm coloanele doar dacă există în DataFrame
for col name in cols to drop:
    if col name in df.columns:
        df = df.drop(col name)
general cols = [
    "MatchID", "Season", "MatchWeek", "Date", "HomeTeam", "AwayTeam",
    "FullTimeHomeTeamGoals", "FullTimeAwayTeamGoals",
"FullTimeResult",
    "HomeTeamPoints", "AwayTeamPoints"
# 1. Subset pentru statistici generale (toate meciurile cu scor și
echipe)
df general = df.select(general cols).dropna()
# 2. Subset pentru analize detaliate (doar meciuri cu date complete,
din 2000-2001 încolo)
relevant cols = [
    "HomeTeam", "AwayTeam", "FullTimeHomeTeamGoals",
"FullTimeAwayTeamGoals", "Date",
    "HalfTimeHomeTeamGoals", "HalfTimeAwayTeamGoals",
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"HalfTimeResult", "Referee",
   "HomeTeamShots", "AwayTeamShots", "HomeTeamShotsOnTarget",
"AwayTeamShotsOnTarget",
   "HomeTeamCorners", "AwayTeamCorners", "HomeTeamFouls",
"AwayTeamFouls",
   "HomeTeamYellowCards", "AwayTeamYellowCards", "HomeTeamRedCards",
"AwayTeamRedCards"
df detailed = (
   df
   .filter(col("Season") >= "2000-2001")
   .dropna(subset=relevant cols)
)
# Verificăm câte meciuri avem în fiecare subset
print("Meciuri pentru statistici generale:", df_general.count())
print("Meciuri pentru analize detaliate:", df detailed.count())
print("-----")
# Aratam primele 20 de rânduri din fiecare subset
df general.show(20)
df detailed.show(20)
Meciuri pentru statistici generale: 12001
Meciuri pentru analize detaliate: 9341
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                                  3|
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|2000-2001 Man Cit...|2000-2001|
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|2000-2001_Newcast...|2000-2001|
                                                             Newcastle|
Derby|
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|2000-2001_Southam...|2000-2001|
                                           1|2000-08-23|
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Coventry|
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|2000-2001_Arsenal...|2000-2001|
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```

# 2. PREDICȚIA REZULTATELOR PENTRU MECIURILE VIITOARE

#### Introducere

În această secțiune, vom dezvolta un model de predicție pentru meciurile viitoare din Premier League, bazat pe datele istorice și pe forma recentă a echipelor. Modelul va lua în considerare:

- Forma recentă: Performanțele din ultimele sezoane (cu accent pe ultimii 3-5 ani)
- Avantajul terenului propriu: Statistici home vs away
- Factori de risc: Variabilitatea performanțelor și consistența
- Statistici de meci: Goluri, şuturi, cornere, cartonașe
- Tendințe sezoniere: Performanțele în sezonul curent

Obiectivul final este să creăm o vizualizare completă care să arate:

- 1. Punctele actuale ale fiecărei echipe
- 2. Predicțiile pentru meciurile rămase
- 3. Clasamentul final proiectat
- 4. Zone de calificare (Champions League, Europa League, Conference League, Retrogradare)

```
# Încărcăm datele pentru meciurile viitoare
df_upcoming = spark.read.option("header", True).option(
    "inferSchema", True).csv("../data/PremierLeague_upcoming.csv")

print("=== Meciuri viitoare ===")
print(f"Numărul total de meciuri viitoare: {df_upcoming.count()}")
df_upcoming.show(10)

# Verificăm structura datelor viitoare
print("\n=== Structura datelor viitoare ====")
df_upcoming.printSchema()
```

```
=== Meciuri viitoare ===
Numărul total de meciuri viitoare: 159
-----
  ------
 ------
  -----
  -----
+-----
+----+
       MatchID|
             Season | MatchWeek |
Time|
             AwayTeam|FullTimeHomeTeamGoals|
     HomeTeam |
FullTimeAwayTeamGoals|FullTimeResult|HalfTimeHomeTeamGoals|
HalfTimeAwayTeamGoals|HalfTimeResult|
                      Referee | HomeTeamShots |
AwayTeamShots|HomeTeamShotsOnTarget|AwayTeamShotsOnTarget|
HomeTeamCorners|AwayTeamCorners|HomeTeamFouls|AwayTeamFouls|
HomeTeamYellowCards|AwayTeamYellowCards|HomeTeamRedCards|
AwayTeamRedCards|B365HomeTeam|B365Draw|B365AwayTeam|B3650ver2.5Goals|
B365Under2.5Goals|MarketMaxHomeTeam|MarketMaxDraw|MarketMaxAwayTeam|
MarketAvgHomeTeam|MarketAvgDraw|MarketAvgAwayTeam|
MarketMaxOver2.5Goals|MarketMaxUnder2.5Goals|MarketAvgOver2.5Goals|
MarketAvgUnder2.5Goals|HomeTeamPoints|AwayTeamPoints|
 -----+---+----
 ------+----+-----
 -----+-----
+----+
+----+
+-----
 -----+---
|2024-2025 Bournem...|2024-2025|
                    23 | 1/25/2025 | 2025 - 06 - 15
15:00:00
      Bournemouth|Nott'm Forest|
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|2024-2025 Liverpo...|2024-2025|
                                    23 | 1/25/2025 | 2025 - 06 - 15
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15:00:00| Southampton| Newcastle|
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                            Arsenal|
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|2024-2025 Man Cit...|2024-2025|
              Man City|
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|2024-2025 Crystal...|2024-2025| 23|1/26/2025|2025-06-15
14:00:00|Crystal Palace| Brentford|
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|2024-2025 Aston V...|2024-2025|
16:30:00
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|2024-2025 Fulham ...|2024-2025|
                          23 | 1/26/2025 | 2025 - 06 - 15
19:00:00
                                     NULL
           Fulham|
                  Man United
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```

-- MarketAvgOver2.5Goals: string (nullable = true)
-- MarketAvgUnder2.5Goals: string (nullable = true)

|-- HomeTeamPoints: string (nullable = true)
|-- AwayTeamPoints: string (nullable = true)

## a. Calcularea Formei Recente și a Factorilor de Performanță

Vom calcula mai mulți indicatori pentru fiecare echipă bazați pe datele istorice, cu accent pe ultimele sezoane pentru a fi mai realisti:

```
from pyspark.sql.functions import col, count, sum as spark sum, when,
coalesce, lit
from pyspark.sql.types import *
import numpy as np
import builtins
# Definim sezoanele recente
recent seasons = ["2024-2025"]
# Filtrăm datele pentru sezonul curent
df recent = df general.filter(col("Season").isin(recent seasons))
print("=== Analiza Formei Recente (Sezon curent) ===")
print(f"Meciuri în sezonul curent: {df recent.count()}")
# Calculăm statisticile pentru fiecare echipă în sezonul curent
def calculate_team_stats(df, team_col_home, team_col_away, team_name):
    """Calculează statisticile pentru o echipă (acasă și deplasare)"""
    # Statistici acasă
    home stats = df.filter(col(team col home) == team name).agg(
        count("*").alias("home matches"),
        spark sum(when(col("FullTimeResult") == "H",
                  1).otherwise(0)).alias("home wins"),
        spark_sum(when(col("FullTimeResult") == "D",
                  1).otherwise(0)).alias("home draws"),
        spark sum(when(col("FullTimeResult") == "A",
                  1).otherwise(0)).alias("home losses"),
        spark sum("FullTimeHomeTeamGoals").alias("home goals for"),
spark_sum("FullTimeAwayTeamGoals").alias("home_goals_against"),
        spark_sum("HomeTeamPoints").alias("home points")
    ).collect()[0]
    # Statistici deplasare
    away stats = df.filter(col(team col away) == team name).agg(
        __
count("*").alias("away_matches"),
        spark sum(when(col("FullTimeResult") == "A",
                  1).otherwise(0)).alias("away wins"),
        spark sum(when(col("FullTimeResult") == "D",
                  1).otherwise(0)).alias("away draws"),
```

```
spark sum(when(col("FullTimeResult") == "H",
                   1).otherwise(0)).alias("away losses"),
        spark_sum("FullTimeAwayTeamGoals").alias("away_goals_for"),
spark sum("FullTimeHomeTeamGoals").alias("away goals against"),
        spark sum("AwayTeamPoints").alias("away points")
    ).collect()[0]
    return home stats, away stats
# Obținem lista echipelor din sezonul curent
current season df = df recent.filter(
    col("Season") == "2024-2025").select("HomeTeam").distinct()
current_season_teams = [row.HomeTeam for row in
current season df.collect()]
print(f"Echipe în sezonul curent: {len(current season teams)}")
print("Echipele:", sorted(current season teams))
=== Analiza Formei Recente (Sezon curent) ===
Meciuri în sezonul curent: 221
Echipe în sezonul curent: 20
Echipele: ['Arsenal', 'Aston Villa', 'Bournemouth', 'Brentford',
'Brighton', 'Chelsea', 'Crystal Palace', 'Everton', 'Fulham', 'Ipswich', 'Leicester', 'Liverpool', 'Man City', 'Man United',
'Newcastle', "Nott'm Forest", 'Southampton', 'Tottenham', 'West Ham',
'Wolves'l
# Calculăm statisticile complete pentru fiecare echipă
team performance = {}
for team in current season teams:
    home stats, away stats = calculate team stats(
        df recent, "HomeTeam", "AwayTeam", Team)
    # Combinăm statisticile
    total matches = home stats.home matches + away stats.away matches
    total wins = home stats.home wins + away stats.away wins
    total draws = home stats.home draws + away stats.away draws
    total losses = home stats.home losses + away stats.away losses
    total goals for = home stats.home goals for +
away stats.away goals for
    total goals against = home stats.home goals against +
away stats.away goals against
    total points = home stats.home points + away stats.away points
    # Calculăm ratele și indicatorii
    win rate = total wins / total matches if total matches > 0 else 0
    points per game = total points / total_matches if total_matches >
```

```
0 else 0
    goals per game = total goals for / total matches if total matches
> 0 else 0
    goals against per game = total goals against / \
        total matches if total matches > 0 else 0
    goal difference = total goals for - total goals against
    # Avantajul terenului propriu
    home win rate = home stats.home wins / \
        home stats.home matches if home stats.home matches > 0 else 0
    away win rate = away stats.away wins / \
        away stats.away matches if away stats.away matches > 0 else 0
    home advantage = home win rate - away win rate
    # Factor de risc (variabilitatea - calculat simplu ca diferenta
între home si away performance)
    home ppg = home stats.home points / \
        home stats.home matches if home stats.home matches > 0 else 0
    away_ppg = away_stats.away_points / \
        away stats.away matches if away stats.away matches > 0 else 0
    # Folosim __builtin__.abs pentru a evita conflictul cu
pyspark.sql.functions.abs
    import builtins
    # Cât de inconsistentă este echipa
    risk factor = builtins.abs(home ppg - away ppg)
    team performance[team] = {
        'total matches': total matches,
        'win rate': win rate,
        'points per game': points per game,
        'goals per game': goals per game,
        'goals against per_game': goals_against_per_game,
        'goal difference': goal difference,
        'home advantage': home advantage,
        'risk factor': risk factor,
        'home win rate': home win rate,
        'away win_rate': away_win_rate,
        'home_ppg': home_ppg,
        'away ppg': away ppg
    }
# Afișăm statisticile pentru primele 20 echipe
print("\n=== Statistici Echipe (Ultimele 2 sezoane) ===")
sorted teams = sorted(team performance.items(),
                      key=lambda x: x[1]['points_per_game'],
reverse=True)
for i, (team, stats) in enumerate(sorted teams[:20]):
    print(f"{i+1:2d}. {team:15s} | PPG: {stats['points_per_game']:.2f}
Win%: {stats['win rate']:.1%} |
```

```
f"Home Adv: {stats['home advantage']:+.2f} | Risk:
{stats['risk factor']:.2f}")
=== Statistici Echipe (Ultimele 2 sezoane) ===
1. Liverpool | PPG: 2.38 | Win%: 71.4% | Home Adv: -0.03 |
Risk: 0.15
2. Nott'm Forest | PPG: 2.00 | Win%: 59.1% | Home Adv: -0.09 |
Risk: 0.18
3. Arsenal
                    | PPG: 2.00 | Win%: 54.5% | Home Adv: +0.18 |
Risk: 0.55
4. Chelsea
                    | PPG: 1.87 | Win%: 52.2% | Home Adv: -0.05 |
Risk: 0.08
5. Man City
                    | PPG: 1.78 | Win%: 52.2% | Home Adv: +0.22 |
Risk: 0.59
                    | PPG: 1.73 | Win%: 50.0% | Home Adv: +0.09 |
6. Newcastle
Risk: 0.18
                    | PPG: 1.68 | Win%: 45.5% | Home Adv: +0.08 |
7. Bournemouth
Risk: 0.22
                    | PPG: 1.64 | Win%: 45.5% | Home Adv: +0.18 |
8. Aston Villa
Risk: 0.73
9. Brighton
                    | PPG: 1.55 | Win%: 36.4% | Home Adv: -0.12 |
Risk: 0.08
10. Fulham
                    | PPG: 1.50 | Win%: 36.4% | Home Adv: +0.00 |
Risk: 0.09
11. Brentford
                    | PPG: 1.27 | Win%: 36.4% | Home Adv: +0.48 |
Risk: 1.42
12. Crystal Palace
                    | PPG: 1.23 | Win%: 27.3% | Home Adv: -0.18 |
Risk: 0.45
13. West Ham
                    | PPG: 1.18 | Win%: 31.8% | Home Adv: +0.03 |
Risk: 0.03
14. Man United
                    | PPG: 1.18 | Win%: 31.8% | Home Adv: +0.22 |
Risk: 0.33
15. Tottenham
                    | PPG: 1.09 | Win%: 31.8% | Home Adv: +0.09 |
Risk: 0.36
16. Everton
                    | PPG: 0.91 | Win%: 18.2% | Home Adv: +0.18 |
Risk: 0.55
17. Wolves
                    | PPG: 0.73 | Win%: 18.2% | Home Adv: +0.03 |
Risk: 0.05
                    | PPG: 0.73 | Win%: 13.6% | Home Adv: -0.12 |
18. Ipswich
Risk: 0.32
19. Leicester
                    | PPG: 0.61 | Win%: 13.0% | Home Adv: +0.08 |
Risk: 0.30
20. Southampton
                    | PPG: 0.27 | Win%: 4.5% | Home Adv: +0.10 | Risk:
0.23
```

#### b. Calcularea Punctelor Actuale în Sezonul 2024-2025

Acum vom calcula punctele actuale ale fiecărei echipe în sezonul curent (până la matchweek 22):

```
# Calculăm punctele actuale pentru sezonul 2024-2025
current season data = df recent.filter(
    (col("Season") == "2024-2025") &
    (col("MatchWeek") <= 22)</pre>
)
print("=== Puncte Actuale Sezonul 2024-2025 (MW 1-22) ===")
print(f"Meciuri jucate până acum: {current season data.count()}")
# Calculăm punctele pentru fiecare echipă în sezonul curent
current points = {}
for team in current season teams:
    # Puncte acasă
    home points = current season data.filter(col("HomeTeam") ==
team).agg(
        spark sum("HomeTeamPoints").alias("points")
    ).collect()[0].points or 0
    # Puncte deplasare
    away points = current season data.filter(col("AwayTeam") ==
team).agg(
        spark sum("AwayTeamPoints").alias("points")
    ).collect()[0].points or 0
    # Meciuri iucate
    home matches = current season data.filter(col("HomeTeam") ==
team).count()
    away matches = current season data.filter(col("AwayTeam") ==
team).count()
    total points = home points + away points
    total matches = home matches + away matches
    current points[team] = {
        'points': total points,
        'matches played': total matches,
        'home_points': home_points,
        'away points': away_points
    }
# Sortăm echipele după puncte
current table = sorted(current points.items(),
                       key=lambda x: x[1]['points'], reverse=True)
print("\n=== Clasamentul Actual (după MW 22) ===")
print("Pos | Echipa
                             | Puncte | Meciuri | PPG")
print("-" * 50)
for i, (team, stats) in enumerate(current table):
    ppg = stats['points'] / \
```

```
stats['matches played'] if stats['matches played'] > 0 else 0
    print(
        f"{i+1:2d} | {team:15s} | {stats['points']:6d} |
{stats['matches played']:7d} | {ppg:.2f}")
# Salvăm clasamentul actual pentru vizualizare
current_standings = {team: stats['points'] for team, stats in
current table}
=== Puncte Actuale Sezonul 2024-2025 (MW 1-22) ===
Meciuri jucate până acum: 219
=== Clasamentul Actual (după MW 22) ===
                       | Puncte | Meciuri | PPG
Pos | Echipa
    | Liverpool
                                       21 | 2.38
 1
                             50 I
 2
    | Nott'm Forest
                             44 |
                                       22 | 2.00
 3
    | Arsenal
                             44 |
                                       22 | 2.00
 4
    | Chelsea
                             40 |
                                       22 | 1.82
 5
                             38 I
                                       22 | 1.73
      Man Citv
 6
    | Newcastle
                             38 |
                                       22 | 1.73
7
    | Bournemouth
                             37 |
                                       22 | 1.68
8
    | Aston Villa
                             36 I
                                       22 | 1.64
    | Brighton
9
                             34 |
                                       22 | 1.55
    | Fulham
10
                             33 |
                                       22 | 1.50
    Brentford
11
                             28 |
                                       22 | 1.27
    | Crystal Palace
12
                             27 |
                                       22 | 1.23
13
     West Ham
                             26 I
                                       22 | 1.18
    | Man United
                                       22 | 1.18
14
                             26 I
15
    | Tottenham
                             24 |
                                       22 | 1.09
16
    Everton
                             20 |
                                       21 | 0.95
17
      Wolves
                             16 I
                                       22 | 0.73
    | Ipswich
18
                             16 I
                                       22 | 0.73
19
                                       22 |
                                            0.64
    | Leicester
                             14
20
    | Southampton
                              6 |
                                       22 | 0.27
```

### c. Modelul de Predicție cu Machine Learning

Vom crea un model simplu dar eficient care să prezică rezultatele meciurilor bazat pe factorii calculați:

```
from pyspark.ml.feature import VectorAssembler
from pyspark.ml.classification import RandomForestClassifier
from pyspark.ml.evaluation import MulticlassClassificationEvaluator
from pyspark.ml import Pipeline
import random
import builtins
```

```
def predict match result(home team, away team, team performance,
is home advantage=True):
   Prezice rezultatul unui meci bazat pe statisticile echipelor
   Returnează probabilitățile pentru H, D, A
   home stats = team performance.get(home team, {})
   away stats = team performance.get(away team, {})
   # Factori de bază
   home_strength = home_stats.get('points_per_game', 1.0)
   away_strength = away_stats.get('points_per_game', 1.0)
   # Avantajul terenului propriu
   home advantage factor = home stats.get(
        'home advantage', 0.0) if is home advantage else 0.0
   # Factor de risc (inconsistenta)
   home risk = home_stats.get('risk_factor', 0.5)
   away risk = away stats.get('risk factor', 0.5)
   # Calculăm probabilitătile de bază
    strength_diff = home_strength - away strength +
home advantage factor
   # Normalizăm diferenta de fortă
   if strength diff > 1.0:
        home prob = 0.6 + builtins.min(0.25, strength diff * 0.1)
   elif strength diff > 0.3:
        home prob = 0.5 + strength diff * 0.2
   elif strength diff > -0.3:
        home prob = 0.4 + strength diff * 0.15
   elif strength diff > -1.0:
        home prob = 0.3 + strength_diff * 0.1
   else:
        home prob = 0.15 + builtins.max(-0.1, strength diff * 0.05)
   # Calculăm probabilitatea de egalitate
   draw base = 0.25
   balance factor = 1 - builtins.abs(strength diff)
   draw prob = draw base + balance factor * 0.1
   # Probabilitatea pentru echipa oaspete
   away prob = 1.0 - home prob - draw prob
   # Ajustăm pentru factorul de risc (echipele inconsistente au
rezultate mai imprevizibile)
    risk adjustment = (home risk + away risk) * 0.05
   draw prob += risk adjustment
```

```
home prob -= risk adjustment / 2
    away prob -= risk adjustment / 2
    # Normalizăm să fie sigur că suma = 1
    total = home prob + draw prob + away prob
    home prob /= total
    draw_prob /= total
    away prob /= total
    return home prob, draw prob, away prob
def simulate match points(home prob, draw prob, away prob):
    """Simulează rezultatul unui meci și returnează punctele pentru
fiecare echipă"""
    rand = random.random()
    if rand < home prob:</pre>
        return 3, 0
    elif rand < home prob + draw prob:
        return 1, 1
    else:
        return 0, 3
# Testăm modelul pe câteva meciuri
print("=== Test Model de Predictie ===")
test matches = [
    ("Liverpool", "Arsenal"), ("Man City", "Chelsea"),
    ("Man United", "Tottenham"),
    ("Brighton", "Aston Villa")
1
for home, away in test matches:
    h_prob, d_prob, a_prob = predict_match_result(home, away,
team performance)
    print(f"{home:12s} vs {away:12s} | H: {h prob:.1%} D: {d prob:.1%}
A: {a prob:.1%}")
print("\n=== Factori de Predictie ===")
print("- Forma recentă (PPG ultimele 2 sezoane)")
print("- Avantajul terenului propriu")
print("- Factorul de risc (inconsistenta)")
print("- Echilibrarea probabilităților")
=== Test Model de Predictie ===
Liverpool vs Arsenal
                               | H: 55.3% D: 35.0% A: 9.7%
Man City
             vs Chelsea
                               | H: 40.3% D: 37.0% A: 22.7%
Man City vs Chelsea | H: 40.3% D: 37.0% A: 22.7% Man United vs Tottenham | H: 54.4% D: 35.4% A: 10.2%
```

```
Brighton vs Aston Villa | H: 34.9% D: 37.0% A: 28.2%

=== Factori de Predicție ===
- Forma recentă (PPG ultimele 2 sezoane)
- Avantajul terenului propriu
- Factorul de risc (inconsistența)
- Echilibrarea probabilităților
```

# d. Simularea Meciurilor Viitoare și Calcularea Punctelor Finale

Acum vom simula toate meciurile rămase și vom calcula clasamentul final proiectat:

```
# Obtinem lista meciurilor viitoare
upcoming_matches = df_upcoming.select(
    "MatchWeek", "HomeTeam", "AwayTeam").collect()
print(f"=== Simularea a {len(upcoming matches)} Meciuri Viitoare ===")
# Initializăm punctele finale cu punctele actuale
final points = current standings.copy()
match predictions = []
# Simulăm fiecare meci
random.seed(42) # Pentru reproducibilitate
for match in upcoming matches:
    matchweek = match.MatchWeek
    home team = match.HomeTeam
    away team = match.AwayTeam
    # Prezice rezultatul
    h_prob, d_prob, a_prob = predict_match_result(
        home team, away team, team performance)
    # Simulează punctele
    home_points, away_points = simulate_match_points(h prob, d prob,
a_prob)
    # Actualizează punctele finale
    if home team in final points:
        final points[home team] += home points
    if away team in final points:
        final_points[away_team] += away_points
    # Salvează predictia
    match predictions.append({
        'matchweek': matchweek,
        'home team': home team,
```

```
'away team': away team,
        'home prob': h prob,
        'draw prob': d prob,
        'away prob': a prob,
        'predicted home points': home points,
        'predicted away points': away points
    })
# Sortăm clasamentul final
final table = sorted(final points.items(), key=lambda x: x[1],
reverse=True)
print("\n=== Clasamentul Final Proiectat ===")
print("Pos | Echipa
                             | Puncte | +/- vs Actual")
print("-" * 55)
for i, (team, points) in enumerate(final table):
    current pts = current standings.get(team, 0)
    predicted gain = points - current pts
    print(f"{i+1:2d} | {team:15s} | {points:6d} | {predicted gain:
+4d}")
print(f"\nTotal meciuri simulate: {len(match predictions)}")
print(
    f"Puncte distribuite: {builtins sum(pred['predicted home points']
+ pred['predicted away points'] for pred in match predictions)}")
# Calculăm câteva statistici interesante
home wins = builtins.sum(
    1 for pred in match predictions if pred['predicted home points']
draws = builtins.sum(
    1 for pred in match predictions if pred['predicted home points']
away wins = builtins.sum(
   1 for pred in match predictions if pred['predicted away points']
print(f"\nDistributia rezultatelor prezise:")
print(f"Victorii gazde: {home wins}
({home wins/len(match predictions):.1%})")
print(f"Egalități: {draws} ({draws/len(match predictions):.1%})")
print(
    f"Victorii oaspeti: {away wins}
({away wins/len(match predictions):.1%})")
=== Simularea a 159 Meciuri Viitoare ===
=== Clasamentul Final Proiectat ===
Pos | Echipa
                       | Puncte | +/- vs Actual
```

```
1
    | Liverpool
                             92 |
                                    +42
2
    | Arsenal
                             82 |
                                    +38
 3
      Nott'm Forest
                                    +36
                             80 I
 4
    | Chelsea
                             67 I
                                    +27
 5
      Man City
                             65
                                    +27
    | Aston Villa
 6
                                    +27
                             63 |
 7
    l Bournemouth
                             62 I
                                    +25
8
    Newcastle
                             61 |
                                    +23
9
    | Brighton
                             57 |
                                   +23
10
    | Fulham
                             55 I
                                    +22
    | Brentford
11
                             51 l
                                    +23
    | West Ham
12
                                    +22
                             48 |
13
    | Man United
                             44 |
                                    +18
    | Crystal Palace
| Everton
14
                             42 |
                                    +15
15
                             38 |
                                    +18
    | Tottenham
16
                             36 I
                                    +12
17
    | Ipswich
                                    +10
                             26 I
18
                                    +8
    | Wolves
                             24 I
19
                             22
    l Leicester
                                     +8
20
      Southampton
                             15 l
                                     +9
Total meciuri simulate: 159
Puncte distribuite: 433
Distributia rezultatelor prezise:
Victorii gazde: 70 (44.0%)
Egalități: 44 (27.7%)
Victorii oaspeți: 45 (28.3%)
```

### e. Vizualizarea Completă - Evoluția Punctelor și Zonele de Calificare

Acum vom crea vizualizarea principală care arată evoluția punctelor de la începutul sezonului până la final, cu zonele de calificare:

```
import matplotlib.pyplot as plt
import numpy as np
from collections import defaultdict

# Calculăm evoluția punctelor pentru fiecare matchweek

def calculate_points_evolution():
    points_evolution = defaultdict(lambda: defaultdict(int))

# Inițializăm cu 0 puncte pentru toate echipele
for team in current_season_teams:
```

```
for mw in range(1, 39):
           points evolution[team][mw] = 0
   # Calculăm punctele reale pentru MW 1-22
   matches played = current season data.select("MatchWeek",
"HomeTeam", "AwayTeam",
                                                "HomeTeamPoints",
"AwayTeamPoints").collect()
   # Sortăm meciurile după matchweek
   matches played = sorted(matches played, key=lambda x: x.MatchWeek)
   # Calculăm punctele cumulative pentru meciurile jucate
   team cumulative = {team: 0 for team in current season teams}
   for match in matches played:
       mw = match.MatchWeek
       home team = match.HomeTeam
       away team = match.AwayTeam
       home points = match.HomeTeamPoints or 0
       away points = match.AwayTeamPoints or 0
       # Actualizăm punctele cumulative
       team cumulative[home team] += home points
       team cumulative[away team] += away points
       # Salvăm punctele pentru acest matchweek
       for team in current season teams:
           points evolution[team][mw] = team cumulative[team]
   # Completăm punctele pentru MW 23-38 cu predicțiile
   predictions by mw = defaultdict(list)
   for pred in match predictions:
       predictions by mw[pred['matchweek']].append(pred)
   # Aplicăm predicțiile pentru fiecare matchweek
   for mw in range (23, 39):
       if mw in predictions by mw:
           for pred in predictions by mw[mw]:
               home team = pred['home team']
               away team = pred['away team']
               home_points = pred['predicted home points']
               away points = pred['predicted away points']
               # Actualizăm punctele cumulative
               if home team in team cumulative:
                    team cumulative[home team] += home points
               if away team in team cumulative:
                   team cumulative[away team] += away points
```

```
# Salvăm punctele pentru acest matchweek
         for team in current season teams:
             points evolution[team][mw] = team cumulative[team]
    return points evolution
# Calculăm evolutia punctelor
points evolution = calculate points evolution()
print("=== Evolutia Punctelor Calculată ===")
print("Puncte după MW 22 (reale) și MW 38 (prezise):")
for i, (team, ) in enumerate(final table[:10]):
    mw22 points = points evolution[team][22]
    mw38 points = points evolution[team][38]
    print(f"{team:15s}: MW22={mw22 points:2d} → MW38={mw38 points:2d}
(+{mw38 points-mw22 points:2d})")
=== Evoluția Punctelor Calculată ===
Puncte după MW 22 (reale) și MW 38 (prezise):
Liverpool
                : MW22=50 \rightarrow MW38=89 (+39)
Arsenal
               : MW22=44 \rightarrow MW38=82 (+38)
Nott'm Forest : MW22=44 \rightarrow MW38=80 (+36)
Chelsea : MW22=40 → MW38=67 (+27)
Man City : MW22=38 \rightarrow MW38=65 (+27)
Aston Villa : MW22=36 \rightarrow MW38=63 (+27)
Bournemouth : MW22=37 \rightarrow MW38=62 \ (+25)
Newcastle : MW22=38 \rightarrow MW38=61 \ (+23)
Brighton
               : MW22=34 \rightarrow MW38=57 (+23)
            : MW22=33 → MW38=55 (+22)
Fulham
# Creăm vizualizarea principală
plt.style.use('default')
fig, ax = plt.subplots(figsize=(16, 12))
# Definim culorile pentru echipe
team colors = {
    'Liverpool': '#C8102E',
    'Arsenal': '#EF0107',
    'Chelsea': '#034694'
     'Man City': '#6CABDD'
    'Man United': '#DA020E',
     'Tottenham': '#132257'
     'Aston Villa': '#95BFE5',
    'Brighton': '#0057B8',
    'Newcastle': '#241F20',
    'Fulham': '#CC9966'.
    'Bournemouth': '#DA020E'
    'Nott\'m Forest': '#DD0000',
```

```
'Brentford': '#FB0000',
    'West Ham': '#7A263A',
    'Crystal Palace': '#1B458F',
    'Everton': '#003399',
    'Leicester': '#003090',
    'Wolves': '#FDB462',
    'Ipswich': '#4169E1',
    'Southampton': '#D71920'
}
# Matchweeks (1-38)
matchweeks = list(range(1, 39))
# Plotăm liniile pentru fiecare echipă
for i, (team, final pts) in enumerate(final table):
    points by mw = [points evolution[team][mw] for mw in matchweeks]
    color = team colors.get(team, '#808080')
    # Linia reală (MW 1-22)
    real mw = matchweeks[:22]
    real points = points by mw[:22]
    ax.plot(real mw, real points, color=color,
            linewidth=2.5, alpha=0.9, label=team)
    # Linia prezisă (MW 23-38)
    pred mw = matchweeks[21:]
    pred_points = points_by_mw[21:]
    ax.plot(pred mw, pred points, color=color,
            linewidth=2.5, alpha=0.6, linestyle='--')
    # Punctul final
    ax.scatter(38, final pts, color=color, s=60, alpha=0.8, zorder=5)
# Linia verticală care separă realul de predictii
ax.axvline(x=22.5, color='red', linestyle='-', alpha=0.7,
           linewidth=2, label='Predictii încep')
# Zonele de calificare (linii orizontale)
# Estimăm punctele necesare bazat pe clasamentul final
final_points_sorted = [pts for _, pts in final_table]
# Champions League (Top 5)
cl threshold = final points sorted[3] if len(final points sorted) > 3
else 70
ax.axhline(y=cl threshold, color='gold', linestyle='-', alpha=0.7,
linewidth=2.
           label=f'Champions League (Top 4): {cl threshold} pts')
# Europa League (6th place)
```

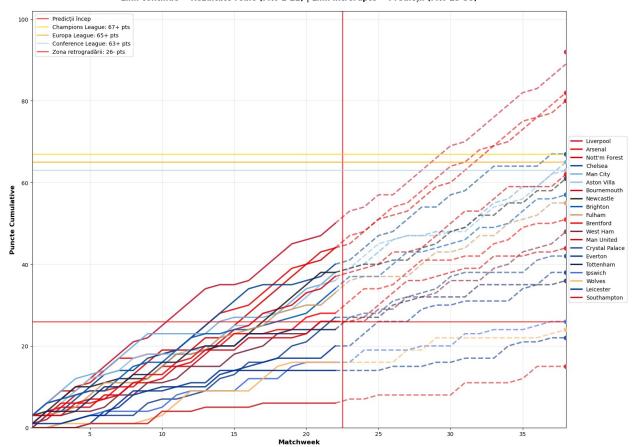
```
el threshold = final points sorted[4] if len(final points sorted) > 4
else 65
ax.axhline(y=el threshold, color='orange', linestyle='-', alpha=0.7,
linewidth=2,
           label=f'Europa League (6th): {el threshold} pts')
# Conference League (7th place)
conf threshold = final points sorted[5] if len(final points sorted) >
5 else 60
ax.axhline(y=conf threshold, color='lightblue', linestyle='-',
alpha=0.7, linewidth=2,
           label=f'Conference League (7th): {conf threshold} pts')
# Retrogradare (Bottom 3)
rel threshold = final points sorted[-4] if len(final points sorted) >
3 else 35
ax.axhline(y=rel threshold, color='red', linestyle='-', alpha=0.7,
linewidth=2,
           label=f'Retrogradare (Bottom 3): {rel threshold} pts')
# Formatarea graficului
ax.set_xlabel('Matchweek', fontsize=12, fontweight='bold')
ax.set_ylabel('Puncte Cumulative', fontsize=12, fontweight='bold')
ax.set title('Premier League 2024-25: Evolutia Punctelor și Predicții
Finale\n' +
             'Linii continue = Rezultate reale (MW 1-22) | Linii
întrerupte = Predictii (MW 23-38)',
             fontsize=14, fontweight='bold', pad=20)
# Setăm limitele axelor
ax.set xlim(1, 38)
ax.set_ylim(0, builtins.max(final points sorted) + 10)
# Grid
ax.grid(True, alpha=0.3)
# Legendă pentru zonele de calificare
legend1 = ax.legend(handles=[
    plt.Line2D([0], [0], color='red', linestyle='-', alpha=0.7,
               linewidth=2, label='Predictii încep'),
    plt.Line2D([0], [0], color='gold', linestyle='-', alpha=0.7,
               linewidth=2, label=f'Champions League: {cl threshold}+
pts'),
    plt.Line2D([0], [0], color='orange', linestyle='-', alpha=0.7,
               linewidth=2, label=f'Europa League: {el threshold}+
pts'),
    plt.Line2D([0], [0], color='lightblue', linestyle='-', alpha=0.7,
               linewidth=2, label=f'Conference League:
{conf threshold}+ pts'),
    plt.Line2D([0], [0], color='red', linestyle='-', alpha=0.7,
```

```
linewidth=2, label=f'Zona retrogradării:
{rel threshold}- pts')
], loc='upper left', fontsize=10)
ax.add artist(legend1)
# Legendă pentru echipe
team handles = []
for team, _ in final_table[:20]:
    color = team colors.get(team, '#808080')
    team handles.append(plt.Line2D(
        [0], [0], color=color, linewidth=2.5, label=team))
ax.legend(handles=team handles, loc='center left',
          bbox to anchor=(1, 0.5), fontsize=10)
plt.tight layout()
plt.show()
# Afisăm si clasamentul final cu zonele
print("\n" + "="*60)
print("CLASAMENTUL FINAL PROIECTAT CU ZONELE DE CALIFICARE")
print("="*60)
# 1. Champions
# 2. 3. 4. 5. Chmapions League Qualification
# 6. Europa League
# 7. Conference League
# 18. 19. 20. Retrogradare
zones = []
for i, (team, points) in enumerate(final_table):
    if i == 0:
        zone = "□ Campioni"
    elif i == 1 or i == 2 or i == 3 or i == 4:
        zone = "□ Calificare Champions League"
    elif i == 5:
        zone = "

Europa League"
    elif i == 6:
        zone = "□ Conference League"
    elif i >= len(final table) - 3:
        zone = "! Retrogradare"
    else:
        zone = "
                  Mid-table"
    zones.append((i+1, team, points, zone))
for pos, team, points, zone in zones:
    current_pts = current_standings.get(team, 0)
    gain = points - current pts
    print(f"{pos:2d}. {team:15s} {points:3d} pts (+{gain:2d}) |
```

```
{zone}")
print("\n" + "="*60)
```

#### Premier League 2024-25: Evoluția Punctelor și Predicții Finale Linii continue = Rezultate reale (MW 1-22) | Linii întrerupte = Predicții (MW 23-38)



CLASAMENTUL FINAL	PROIECTAT CU ZONELE DE CALIFICARE
1. Liverpool 2. Arsenal 3. Nott'm Forest 4. Chelsea 5. Man City 6. Aston Villa 7. Bournemouth 8. Newcastle 9. Brighton 10. Fulham 11. Brentford 12. West Ham 13. Man United	92 pts (+42)

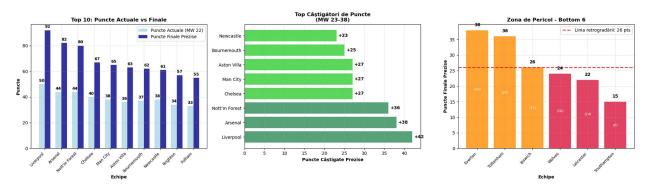
```
14. Crystal Palace
                    42 pts (+15) |
                                       Mid-table
                     38 pts (+18) |
15. Everton
                                       Mid-table
16. Tottenham
                     36 pts (+12) |
                                       Mid-table
17. Ipswich
                     26 pts (+10) |
                                       Mid-table
18. Wolves
                     24 pts (+ 8) | Retrogradare
                    22 pts (+ 8) | Retrogradare
19. Leicester
                     15 pts (+ 9) | Retrogradare
20. Southampton
fig, (ax1, ax2, ax3) = plt.subplots(1, 3, figsize=(20, 6))
fig.suptitle('Premier League 2024-25: Analize Suplimentare',
             fontsize=16, fontweight='bold', y=1.02)
# Grafic 1: Top 10 echipe - Puncte actuale vs Puncte finale prezise
top 10 teams = final table[:10]
teams top10 = [team for team, in top 10 teams]
current pts top10 = [current standings.get(team, 0) for team in
teams top10]
final pts top10 = [pts for , pts in top 10 teams]
x pos = range(len(teams top10))
width = 0.35
bars1 = ax1.bar([x - width/2 for x in x pos], current pts top10,
width,
                label='Puncte Actuale (MW 22)', color='lightblue',
alpha=0.8)
bars2 = ax1.bar([x + width/2 for x in x pos], final pts top10, width,
                label='Puncte Finale Prezise', color='darkblue',
alpha=0.8)
# Adăugăm valorile pe bare
for i, (current, final) in enumerate(zip(current pts top10,
final pts top10)):
   ax1.text(i - width/2, current + 1, str(current), ha='center',
             va='bottom', fontweight='bold', fontsize=9)
   ax1.text(i + width/2, final + 1, str(final), ha='center',
             va='bottom', fontweight='bold', fontsize=9)
ax1.set_xlabel('Echipe', fontweight='bold')
ax1.set_ylabel('Puncte', fontweight='bold')
ax1.set title('Top 10: Puncte Actuale vs Finale', fontweight='bold')
ax1.set xticks(x pos)
ax1.set xticklabels(teams top10, rotation=45, ha='right', fontsize=9)
ax1.legend()
ax1.grid(True, alpha=0.3)
# Grafic 2: Câștigul de puncte prezis pentru fiecare echipă (Top 8)
all teams = [team for team, in final table]
```

```
all gains = [final table[i][1] -
             current standings.get(final table[i][0], 0) for i in
range(len(final table))]
# Sortăm după câstigul de puncte
team gains = list(zip(all teams, all gains))
team_gains.sort(key=lambda x: x[1], reverse=True)
top gainers = team gains[:8] # Top 8 câștigători
teams gain = [team for team, in top gainers]
gains = [gain for , gain in top gainers]
colors gain = ['#2E8B57' if q > 30 else '#32CD32' if q >
               20 else '#FFD700' for g in gains]
bars2 = ax2.barh(teams gain, gains, color=colors gain, alpha=0.8)
# Adăugăm valorile pe bare
for i, gain in enumerate(gains):
    ax2.text(gain + 0.5, i, f'+\{gain\}', va='center',
             ha='left', fontweight='bold')
ax2.set xlabel('Puncte Câstigate Prezise', fontweight='bold')
ax2.set title('Top Câstigători de Puncte\n(MW 23-38)',
fontweight='bold')
ax2.grid(True, alpha=0.3, axis='x')
# Grafic 3: Zona de pericol - Bottom 6 echipe
bottom 6 teams = final table[-6:]
teams bottom = [team for team, _ in bottom_6_teams]
final_pts_bottom = [pts for _, pts in bottom_6_teams]
current_pts_bottom = [current_standings.get(team, 0) for team in
teams bottom]
# Colorăm în functie de zona de retrogradare
colors bottom = []
for i, (team, pts) in enumerate(bottom 6 teams):
    if i \ge 3: # Bottom 3 = retrogradare
        colors bottom.append('#DC143C') # Roşu
    else:
        colors bottom.append('#FF8C00') # Portocaliu
bars3 = ax3.bar(range(len(teams bottom)), final pts bottom,
                color=colors bottom, alpha=0.8)
# Linia de retrogradare
relegation line = final table[-4][1] if len(final table) > 3 else 35
ax3.axhline(y=relegation line, color='red', linestyle='--', alpha=0.8,
linewidth=2,
            label=f'Linia retrogradării: {relegation line} pts')
```

```
# Adăugăm valorile pe bare
for i, (pts, current) in enumerate(zip(final pts bottom,
current pts bottom)):
    ax3.text(i, pts + 1, str(pts), ha='center', va='bottom',
fontweight='bold')
    ax3.text(i, pts/2, f'({current})', ha='center', va='center',
             fontsize=8, style='italic', color='white')
ax3.set_xlabel('Echipe', fontweight='bold')
ax3.set ylabel('Puncte Finale Prezise', fontweight='bold')
ax3.set title('Zona de Pericol - Bottom 6', fontweight='bold')
ax3.set xticks(range(len(teams bottom)))
ax3.set xticklabels(teams bottom, rotation=45, ha='right', fontsize=9)
ax3.legend()
ax3.grid(True, alpha=0.3)
plt.tight layout()
plt.show()
# Statistici finale
print("\n" + "="*60)
print("STATISTICI FINALE DESPRE PREDICTII")
print("="*60)
print(
    f"\nCel mai mare câștig prezis: {team gains[0][0]} (+
{team gains[0][1]} puncte)")
print(
    f"Cea mai mică crestere prezisă: {team gains[-1][0]} (+
{team gains[-1][1]} puncte)")
# Echipele în zona de retrogradare
relegation teams = [team for team, in final table[-3:]]
print(f"\nEchipe în zona retrogradării: {',
'.join(relegation teams)}")
# Echipele în Champions League
cl teams = [team for team, in final table[:4]]
print(f"Echipe în Champions League: {', '.join(cl teams)}")
# Calculăm câte puncte vor fi câstigate în total
total points to gain = builtins.sum(all gains)
remaining matches = 16 * 20 // 2
total points available = remaining matches * 3
print(f"\nTotal puncte de câstigat: {total points to gain}")
print(f"Total puncte disponibile: {total points available}")
print(
    f"Eficienta prezisă:
{total points to gain/total points available*100:.1f}%")
```

print("="\*60)

#### Premier League 2024-25: Analize Suplimentare



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#### STATISTICI FINALE DESPRE PREDICȚII

Cel mai mare câștig prezis: Liverpool (+42 puncte) Cea mai mică creștere prezisă: Leicester (+8 puncte)

Echipe în zona retrogradării: Wolves, Leicester, Southampton

Echipe în Champions League: Liverpool, Arsenal, Nott'm Forest, Chelsea

Total puncte de câștigat: 433 Total puncte disponibile: 480

Eficiența prezisă: 90.2%

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