Analysis of in-game stats: Comparison between Top 3 leagues in Europe & LATAM representative leagues in Season 23-24

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1 Summary & Objective

The project has the objective to compare the in-game stats/performance of the players grouped by the top 3 leagues in europe vs 3 of the most important leagues in LATAM (Brasileirao was excluded but might as well be taken into account).

For this project, the leagues to be analyzed are the following:

Top 3 europe leagues: - Premier League - Serie A - La Liga

LATAM Leagues: - Liga MX - Argentina LPF - MLS

Disclaimer: This project was made for educational purposes only. Data belongs to Wyscout. Special thanks to https://github.com/griffisben for pulling the data. If anyone deserves credit for this project, it's him.

Full repository with code at: https://github.com/EmanuelNovelo/Big-Data-MCD-2024/blob/main/Notebooks/stats-spider-analysis.ipynb

The project was made using basic python libraries: - numpy - pandas - matplotlib - sklearn etc.

PySpark was used for almost all the tasks, this was completely unnecessary, but I wanted to practice with it, also I like working with schemas.

Summary of the final number of players analyzed by league across all positions:

• La Liga: 475 players

• Premier League: 453 players

Liga MX: 510 playersMLS: 686 playersSerie A: 496 players

• Argentina LPF: 836 players

This count includes forwards, midfielders, defenders, and goalkeepers from each league.

1.1 About the Data

The data represents in-game stats of the players of all leagues (Football-soccer) throughout the 2023-2024 season. Data also has player's personal information and demographics. Along the next lines of code, exploratory analysis on data and its schemas were performed to understand each leagues' information and data types.

Some important observations regarding 4 particular columns: - 'Team' - 'Team within timeframe' - 'Competition' - 'league'

'Team' refers to the Team the player is currently playing for, while 'Team within timeframe' refers to the team the player was playing for during the timeframe of the data. 'Competition' referes to the league the player is currently playing in, while 'league' refers to the league the player was playing in during the timeframe of the data.

2 Creating subsets of the data by Position: Forwards, Midfielders, Defenders, Goalkeepers

After subsetting the data, we can now calculate the statistics and obtain information by each Position sub-group.

Each Position sub-group has particular coolumns or stats that are relevant to them and representative. The selection of the columns will depend on the analysis to be performed. For this particular example the next columns will be selected:

2.1 Descriptive statistics by position group

```
==== FORWARDS =====
Distinct Primary positions (8) in forwards:
+----+
|Primary position|
+----+
AMF
RAMF
LWF
LW
|RW
LAMF
RWF
Distinct Leagues (6) in forwards:
+----+
League
+----+
|LaLiga
|PremierLeague|
|LigaMX
MLS
|SerieA
|ArgentinaLPF |
```

Total observations in forwards: 1331 Count of NA values per column in forwards: |Full name|Team|Team within selected timeframe|Competition|League|Primary position | Age | Market value | Matches played | Minutes played | Foot | Goals per 90 | Shots per 90|Dribbles per 90|Successful dribbles, %|Touches in box per 90|Assists per 90|xG per 90| 10 10 10 10 10 10 10 10 10 10 10 10 10 10 10 10 10 10 ____+ ==== MIDFIELDERS ===== Distinct Primary positions (5) in midfielders: +----+ |Primary position| +----+ LCMF |RCMF3 RCMF DMF ILCMF3 Distinct Leagues (6) in midfielders: +----+ League +----+ |LaLiga |PremierLeague| |LigaMX

+----+

MLS	1					
SerieA						
ArgentinaLPF	1					
+	_+					
Total observa	tions in mi	dfielders: 605				
C+ NA	-1	i	J			
	-	olumn in midfield				
		· -+				
+		+				
Full name Te	am Team wit	hin selected time	eframe Comp	etition Leag	que Primary	
		e Matches played	_	-	•	
		y passes per 90 :				
90 Received p	asses per 9	O Progressive ru	ns per 90			
++	+		+		+	
++		+	+-	+	+	
		-+		+-		
+		+			1.0	
	10	1.0	10	10	10	
10 10	10	10	10	10	10	10
10	10	10		10		10
1 1	_		_	_	_	
+						
+		-+				
+				·		
==== DEFENDE	RS ====					
	v -	ns (10) in defend	ders:			
+						
Primary posi						
+	+					
LWB	l I					
RCB3	l I					
LB5 LB	l I					
RB	l I					
LCB	i I					
RCB	i					
CB	i					
RB5	i					
RWB	İ					

+----+

Distinct	_	(6)	in defend	ers:						
League	1									
+	League 									
Total ob	servatio	ons in	n defender	s: 1252						
		_	er column							
++-		+-		+		+-	+			 +
Full name position defensive won, % S +	me Team Age Man e action liding t	Team rket v is per tackle	es per 90 	lected ti hes playe ceptions Shots blo	meframed Minut	e Comp tes pl Aeria er 90 -+	ayed H l duel Fouls 	Foot S Ls per per 9 +	uccessi 90 Aei 0 +	
10 10 10 10	10	0 0	0 0	10	10	10	10	10 1		
++-		+-		+		+-	+			
===== GO.	ALKEEPEI	RS ===	===							
Distinct	-	_	tions (1)	in goalk	eepers	:				
Primary	positio	on								
+ GK										

```
+----+
League
+----+
LaLiga
|PremierLeague|
|LigaMX
IMLS
|SerieA
|ArgentinaLPF |
+----+
Total observations in goalkeepers: 268
Count of NA values per column in goalkeepers:
-----+-----+-----+-----+-----+
|Full name|Team|Team within selected timeframe|Competition|League|Primary
position | Age | Market value | Matches played | Minutes played | Foot | Conceded goals per
90|Save rate, %|xG against per 90|Prevented goals per 90|Exits per 90|
-----+-----+-----+-----+
     10
10
       10
                        10
                                  10
        10
                                       10
10
 10
                10
                        10
                           10
10
         10
                     10
                            1
==== FORWARDS =====
+----+
League
       |count|
+----+
|LaLiga
       |182 |
|PremierLeague|180
|LigaMX
       1205
MLS
       261
|SerieA
       |170 |
|ArgentinaLPF |333
+----+
```

Distinct Leagues (6) in goalkeepers:

==== MIDFIELD	ERS ====
+	++ count
+	
LaLiga	75
PremierLeague	
LigaMX	89
MLS	109
SerieA	100
ArgentinaLPF	
+	++
==== DEFENDER	S ====
+	
League	count
+	++
	178
PremierLeague	172
LigaMX	180
MLS	254
SerieA	182
ArgentinaLPF	
+ GOALKEEP	
+	++
League +	count
LaLiga	40
PremierLeague	
LigaMX	36
MLS	62
SerieA	44
ArgentinaLPF	150

+----+

3 Spider Diagrams by group of Leagues and Positions

To determine the main characteristics of each position group, we can calculate the average values for key performance metrics. We will calculate the mean values for each column in the subset DataFrames. Variables will be chosen based on the next criteria: Objective by position. - Forward: Evaluate the ability to score goals, create chances and contribute to the team's attack. - Midfielder: Evaluate distribution, creattion of chances, defensive contribution and ability to create attacks. - Defender: Evaluate ability to stop attacks, win duels, and block actions. - Goalkeeper: Evaluate ability to stop shots, air duels, and defensive contribution.

3.1 Obtaining the summary statistics for each subset

Aggregated	metrics	for	Forwards:
------------	---------	-----	-----------

	Mean	Media	n Mi	.n		Max	
Age 2	2.567919e+01	25.0	0 16.	0 4.0	0000	00e+01	
Market value 7	.407476e+06	1800000.0	0 0.	0 1.8	3000	00e+08	
Matches played 2	2.083546e+01	21.0	0 1.	0 4.2	2000	00e+01	
Minutes played 1	.266137e+03	1061.0	0 46.	0 3.8	3040	00e+03	
Goals per 90 1	.994741e-01	0.1	60.	0 1.9	9600	00e+00	
Shots per 90 1	.790075e+00	1.7	50.	0 8.3	3800	00e+00	
Dribbles per 90 3	3.754290e+00	3.2	90.	0 1.4	1420	00e+01	
Successful dribbles, % 4	.872772e+01	50.0	0 0.	0 1.0	0000	00e+02	
Touches in box per 90 2	2.806957e+00	2.7	4 0.	0 9.6	3000	00e+00	
Assists per 90 9	.839970e-02	0.0	60.	0 1.6	3100	00e+00	
xG per 90 2	2.307288e-01	0.2	0 0.	0 1.	5300	00e+00	
Aggregated metrics for Mi	dfielders:						
	M	ean Me	dian	Min		N	ſax
Age	2.611074e	+01 2	6.00	17.00	3.	800000e+	-01
Market value	6.271322e	+06 150000	0.00	0.00	1.	200000e+	-08
Matches played	2.240661e	+01 2	5.00	1.00	4.	300000e+	-01
Minutes played	1.555547e	+03 146	6.00	45.00	4.	101000e+	-03
Passes per 90	3.947326e	+01 3	7.70	12.72	7.	759000e+	-01
Accurate passes, %	8.443757e	+01 8	5.18	59.46	9.	796000e+	01
Key passes per 90	2.137851e	-01	0.17	0.00	2.	000000e+	-00
xA per 90	6.236364e	-02	0.04	0.00	4.	300000e-	01
Progressive passes per 90	5.448777e	+00	5.26	0.00	1.	133000e+	-01
Received passes per 90	2.759835e	+01 2	5.78	6.14	6.	600000e+	-01
Progressive runs per 90	1.062050e	+00	0.89	0.00	5.	180000e+	-00
Aggregated metrics for De	efenders:						
		Me	an	Med	dian	Min	\
Age		2.651038e+	01	26	.000	16.00	
Market value		5.438958e+	06 15	00000	.000	0.00	
Matches played		2.054153e+	01	22	.000	1.00	
Minutes played		1.629850e+	03	1600	.500	45.00	
Successful defensive acti	ons per 90	8.958786e+	00	8	. 870	1.02	
Interceptions per 90		4.448339e+	00	4	.415	0.00	
Aerial duels per 90		3.131086e+	00	2	. 890	0.00	
Aerial duels won, $\%$		4.977273e+	01	51	.000	0.00	

Sliding tackles per 90	3.790176e-01	0	.290	0.00			
Shots blocked per 90	3.876757e-01	0	.330	0.00			
Fouls per 90		9.662220e-01	0	.900	0.00		
		Max					
Age		3.900000e+01					
Market value		1.000000e+08					
Matches played		4.200000e+01					
Minutes played		4.057000e+03					
Successful defensive ac	ctions per 90	2.009000e+01					
Interceptions per 90		1.011000e+01					
Aerial duels per 90		1.579000e+01	1				
Aerial duels won, $\%$		1.000000e+02					
Sliding tackles per 90		4.030000e+00					
Shots blocked per 90		2.710000e+00					
Fouls per 90		4.250000e+00					
Aggregated metrics for	Goalkeepers:						
	Mean	Median	Min		Max		
Age	2.942910e+01	29.000	18.000	4.300	000e+01		
Market value	4.226213e+06	1000000.000	0.000	4.500	000e+07		
Matches played	1.855597e+01	17.000	1.000	4.200	000e+01		
Minutes played	1.832701e+03	1664.500	52.000	4.166	000e+03		
Conceded goals per 90	1.290896e+00	1.200	0.000	3.670	000e+00		
Save rate, %	6.847175e+01	69.505	0.000	1.000	000e+02		
xG against per 90	1.246642e+00	1.170	0.070	3.830	000e+00		
Prevented goals per 90	-4.369030e-02	-0.009	-1.197	1.781	000e+00		
Exits per 90	1.233694e+00	1.205	0.000	4.640	000e+00		

3.2 Standardize the data to prepare it for Graphs

The metrics shown below were the ones chosen as representative for each position group.

The RobustScaler is an effective scaling technique for datasets with outliers or variables that exhibit different ranges and distributions, which is often the case in sports metrics. Here's why it is particularly useful and why it's a good choice for your analysis. Unlike the MinMaxScaler, which scales the data based on the minimum and maximum values, or the StandardScaler, which centers and scales data based on mean and standard deviation, the RobustScaler leverages the median and interquartile range (IQR) (i.e., the range between the 25th and 75th percentiles). By using the median and IQR, the RobustScaler is less sensitive to outliers, meaning that extreme values in your data won't overly influence the scaling process. This is especially important in sports datasets, where outliers (like exceptionally high performance metrics for certain players) can skew the scaling when using other methods. The RobustScaler centers the data around the median and scales based on the IQR, which provides a robust measure of central tendency and dispersion. For example, metrics such as "Goals per 90" or "Successful Dribbles %" can vary widely, and the scaling via IQR helps these metrics remain meaningful in visual comparisons.

⁼⁼⁼⁼ FORWARDS =====

League: ArgentinaLPF

Teams (110): Atlético Tucumán, Racing Club, Belgrano, Rosario Central, Banfield, Corinthians, Seattle Sounders, Benfica, Argentinos Juniors, Ceará, Independiente, Celta de Vigo, Lanús, San Lorenzo, Unión Santa Fe, River Plate, Godoy Cruz, Barracas Central, CF Montréal, Talleres Córdoba, Defensa y Justicia, Ñublense, Lecce, Platense, Sporting Cristal, Vasco da Gama, Santos Laguna, Huracán, Necaxa, Unión La Calera, Newell's Old Boys, Gimnasia La Plata, Colón, Vélez Sarsfield, Olimpia, Mamelodi Sundowns, Boca Juniors, Instituto, Fortaleza, Genoa, Juárez, Everton, Athletico Paranaense, Tigre, Basel, Bologna, Grêmio, Estudiantes, Pachuca, Sarmiento, Al Ittihad Kalba, Fiorentina, Beroe, Racing, Cerro Largo, Querétaro, Neftchi, Macará, Sportivo Luqueño, Cusco, Coquimbo Unido, Central Córdoba SdE, Estudiantes Caseros, Rotonda, Athens Kallithea, New York City, O'Higgins, Gimnasia Jujuy, Quilmes, Santos, Botoşani, Deportivo Madryn, Arsenal, Volos NFC, Boston River, Aldosivi, Anderlecht, Inter Miami, Liverpool, Atlanta, Peñarol, Atlético Rafaela, Kifissia, Orenburg, Rosario Central Res., Almagro, PAS Giannina, Nacional Asunción, Junior, Asteras Tripolis, Unión Española, Independiente Res., Deportivo Táchira, Colón Res., Vélez Sársfield Res., Deportivo Pereira, Tristán Suárez, Atlanta United, Defensa y Justicia Res., San Lorenzo Res., Alvarado, Delfin, Nueva Chicago, Gimnasia Mendoza, Newell's Old Boys Res., Racing Club Res., Argentino Merlo, Godoy Cruz Res., Llaneros, Rampla Juniors

Teams within selected timeframe (28): Atlético Tucumán, Instituto, Belgrano, Rosario Central, Banfield, Talleres Córdoba, Lanús, Estudiantes, Argentinos Juniors, Newell's Old Boys, Independiente, Godoy Cruz, San Lorenzo, Central Córdoba SdE, River Plate, Barracas Central, Gimnasia La Plata, Huracán, Arsenal, Colón, Defensa y Justicia, Platense, Tigre, Racing Club, Vélez Sarsfield, Unión Santa Fe, Boca Juniors, Sarmiento

Total players: 333

League: LaLiga

Teams (37): Barcelona, Girona, Valencia, Sevilla, Celta de Vigo, Athletic Bilbao, Rayo Vallecano, Getafe, Deportivo Alavés, Atlético Madrid, Cádiz, Mallorca, Villarreal, Granada, Almería, Osasuna, Las Palmas, Real Madrid, Real Betis, Real Sociedad, Bayern München, Botafogo, Benfica, Real Valladolid, Bayer Leverkusen, Palmeiras, Sheffield United, Nice, Bournemouth, Cardiff City, Recreativo Granada, Valencia Mestalla, Salernitana, Leganés, Racing Ferrol, Alcorcón, Atlético Mineiro U20

Teams within selected timeframe (20): Barcelona, Girona, Valencia, Sevilla, Celta de Vigo, Athletic Bilbao, Rayo Vallecano, Getafe, Deportivo Alavés, Atlético Madrid, Cádiz, Mallorca, Villarreal, Granada, Almería, Osasuna, Las Palmas, Real Madrid, Real Betis, Real Sociedad

Total players: 182

League: LigaMX

Teams (55): Guadalajara, Cruz Azul, Pumas UNAM, Tigres UANL, Juárez, Necaxa, Querétaro, América, Club Tijuana, León, Puebla, Monterrey, Atlas, Toluca, Mazatlán, Santos Laguna, Atlético de San Luis, Pachuca, Millonarios, Talleres Córdoba, Portland Timbers, Athletico Paranaense, Cruzeiro, Fortaleza, Columbus

Crew, Corinthians, Fluminense, Barcelona, Racing Club, Pachuca U23, Juárez U23, Atlético Nacional, CSKA Moskva, Estudiantes, Independiente, Mazatlán U23, América U23, Atlético de San Luis U23, Toluca U23, Atlas U23, Santos, León U23, Real Oviedo, Lanús, Santos Laguna U23, Peñarol, Cruz Azul U23, Atlanta United, Club Tijuana U23, Necaxa U23, Vélez Sarsfield, Monterrey U23, Celaya, Tigres UANL U23, Unión Española

Teams within selected timeframe (18): Guadalajara, Cruz Azul, Pumas UNAM, Tigres UANL, Juárez, Necaxa, Querétaro, América, Club Tijuana, León, Puebla, Monterrey, Atlas, Toluca, Mazatlán, Santos Laguna, Atlético de San Luis, Pachuca Total players: 205

League: MLS

Teams (83): Sporting KC, SJ Earthquakes, Philadelphia Union, Nashville SC, Los Angeles FC, Seattle Sounders, Cincinnati, Columbus Crew, Atlanta United, DC United, Vancouver Whitecaps, Monterrey, New England, Houston Dynamo, Orlando City, New York City, Toronto, Los Angeles Galaxy, Hellas Verona, Minnesota United, Dallas, Chicago Fire, Austin FC, Nacional, Portland Timbers, Fortaleza, Real Salt Lake, Como, Charlotte FC, New York RB, CF Montréal, Colorado Rapids, Al Fateh, Inter Miami, Al Rayyan, St. Louis City, Granada, Atlético de San Luis, Real Valladolid, Fehérvár, Flamengo, Fluminense, Vélez Sarsfield, Libertad, Cangzhou Mighty Lions, Trabzonspor, Bandırmaspor, Medellín, Platense, Lugano, América de Cali, AEK Athens, Sochi, Samsunspor, Juárez U23, Mazatlán, Junior, Hull City, Guadalajara, Banfield, Horsens, Udinese, Olimpia, San Lorenzo, Sporting Gijón, Oulu, Universidad Católica, Club Tijuana, Vasco da Gama, San Antonio, Charleston Battery, Tampa Bay Rowdies, Neftchi, Viborg, Orange County SC, Shenzhen Peng City, Larne, Gillingham, Ventura County, Las Vegas Lights, Minnesota United II, Toronto II, Orlando City B Teams within selected timeframe (29): Sporting KC, SJ Earthquakes, Philadelphia Union, Nashville SC, Los Angeles FC, Seattle Sounders, Cincinnati, Columbus Crew, Atlanta United, DC United, Vancouver Whitecaps, New England, Houston Dynamo, Orlando City, New York City, Toronto, Los Angeles Galaxy, Charlotte FC, Minnesota United, Dallas, Chicago Fire, Austin FC, Portland Timbers, New York RB, Real Salt Lake, St. Louis City, CF Montréal, Colorado Rapids, Inter Miami Total players: 261

League: PremierLeague

Teams (38): Bournemouth, Aston Villa, Nottingham Forest, Chelsea, Manchester United, West Ham United, Tottenham Hotspur, Newcastle United, Everton, Arsenal, Luton Town, Manchester City, Liverpool, Fulham, Crystal Palace, Brentford, Wolverhampton Wanderers, Brighton, Burnley, Sheffield United, Olympique Lyonnais, Real Betis, Nantes, Galatasaray, Southampton, Rangers, Eintracht Frankfurt, Granada, Wolverhampton Wanderers U21, Hull City, Leeds United, Sevilla, Hajduk Split, Peterborough United, Borussia Dortmund, Exeter City, Brighton U21, West Ham United U21

Teams within selected timeframe (20): Bournemouth, Aston Villa, Nottingham Forest, Chelsea, Manchester United, West Ham United, Tottenham Hotspur, Newcastle United, Everton, Arsenal, Luton Town, Manchester City, Liverpool, Fulham, Crystal Palace, Brentford, Wolverhampton Wanderers, Brighton, Burnley,

Sheffield United Total players: 180

League: SerieA

Teams (35): Frosinone, Genoa, Sassuolo, Torino, Hellas Verona, Salernitana, Bologna, Lazio, Napoli, Roma, Internazionale, Atalanta, Udinese, Monza, Milan, Empoli, Lecce, Cagliari, Juventus, Fiorentina, Como, Olympiacos Piraeus, Hajduk Split, Orlando City, Mallorca, Ankaragücü, Racing Santander, Malmö FF, Rijeka, Norwich City, Bari, Montpellier, Nottingham Forest, Almería, Everton Teams within selected timeframe (20): Frosinone, Genoa, Sassuolo, Torino, Hellas Verona, Salernitana, Bologna, Lazio, Napoli, Roma, Internazionale, Atalanta, Udinese, Monza, Milan, Empoli, Lecce, Cagliari, Juventus, Fiorentina Total players: 170

==== MIDFIELDERS =====

League: ArgentinaLPF

Teams (69): Belgrano, San Lorenzo, Instituto, Johor Darul Ta'zim, Unión Santa Fe, Monterrey, Atlético Tucumán, Independiente, Newell's Old Boys, Estudiantes, Racing Club, Platense, Tigre, Lanús, Medellín, Botafogo SP, Argentinos Juniors, Banfield, Vélez Sarsfield, Riga FC, Barracas Central, Palmeiras, Olympiacos Piraeus, Boca Juniors, Huracán, Defensa y Justicia, Racing, Toluca, Sarmiento, Porto, General Caballero JLM, Gimnasia La Plata, Unión La Calera, Independiente del Valle, Rosario Central, Colón, Talleres Córdoba, River Plate, Liverpool, Panetolikos FC, Atlético Mineiro, Olimpia, Leganés, Central Córdoba SdE, Sport Recife, Tacuary, Salernitana, O'Higgins, Godoy Cruz, New York City, Cobreloa, Volos NFC, Udinese, Nacional, Club Atlético Mitre, Huachipato, Cerro Largo, Peñarol, Racing Club Res., Independiente Res., Quilmes, Unión Española, Newell's Old Boys Res., La Serena, Carlos Mannucci, Lanús Res., Arsenal, Ben Hur, San Martín San Juan

Teams within selected timeframe (28): Belgrano, Barracas Central, Instituto, San Lorenzo, Central Córdoba SdE, Estudiantes, Platense, Independiente, Newell's Old Boys, Unión Santa Fe, Banfield, Racing Club, Tigre, Atlético Tucumán, River Plate, Lanús, Colón, Argentinos Juniors, Vélez Sarsfield, Arsenal, Huracán, Boca Juniors, Defensa y Justicia, Sarmiento, Gimnasia La Plata, Rosario Central, Talleres Córdoba, Godoy Cruz

Total players: 167

League: LaLiga

Teams (21): Valencia, Getafe, Girona, Las Palmas, Cádiz, Real Madrid, Real Sociedad, Villarreal, Atlético Madrid, Granada, Celta de Vigo, Mallorca, Sevilla, Osasuna, Rayo Vallecano, Barcelona, Almería, Celta de Vigo B, Vojvodina, Sevilla Atlético, Brighton

Teams within selected timeframe (17): Valencia, Getafe, Girona, Las Palmas, Cádiz, Real Madrid, Real Sociedad, Villarreal, Atlético Madrid, Granada, Celta de Vigo, Mallorca, Sevilla, Osasuna, Rayo Vallecano, Barcelona, Almería Total players: 75

League: LigaMX

Teams (29): América, Tigres UANL, Guadalajara, Puebla, Cruz Azul, Pumas UNAM, Querétaro, Santos Laguna, Club Tijuana, Pachuca, Mazatlán, Necaxa, Monterrey, Atlas, Toluca, Juárez, León, Cruzeiro, Everton, Atlético de San Luis, Godoy Cruz, Nacional, Juárez U23, Independiente, Monterrey U18, Pachuca U23, Universidad Guadalajara, Puebla U23, América U23

Teams within selected timeframe (18): América, Tigres UANL, Guadalajara, Puebla, Cruz Azul, Pumas UNAM, Querétaro, Santos Laguna, Club Tijuana, Pachuca, Mazatlán, Necaxa, Monterrey, Atlas, Toluca, Juárez, León, Atlético de San Luis Total players: 89

League: MLS

Teams (44): Columbus Crew, Houston Dynamo, Sporting KC, Los Angeles FC, SJ Earthquakes, Colorado Rapids, Cincinnati, DC United, Charlotte FC, New England, Al Hazem, Portland Timbers, Austin FC, St. Louis City, Real Salt Lake, CF Montréal, Los Angeles Galaxy, Vancouver Whitecaps, Philadelphia Union, New York RB, Nashville SC, Dallas, Atlanta United, Toronto, Chicago Fire, Inter Miami, Barcelona, Gaziantep, Middlesbrough, Toulouse, Rangers, New York City, Maccabi Haifa, Seattle Sounders, Birmingham Legion, Tampa Bay Rowdies, San Antonio, Vitória Guimarães, PEC Zwolle, North Texas, Las Vegas Lights, Portland Timbers II, Stabæk, Chicago Fire II

Teams within selected timeframe (26): Columbus Crew, Houston Dynamo, Sporting KC, Los Angeles FC, SJ Earthquakes, Colorado Rapids, Cincinnati, DC United, Charlotte FC, New England, Portland Timbers, Austin FC, St. Louis City, Real Salt Lake, CF Montréal, Los Angeles Galaxy, Vancouver Whitecaps, Philadelphia Union, New York RB, Nashville SC, Dallas, Toronto, Inter Miami, New York City, Minnesota United, Chicago Fire

Total players: 109

League: PremierLeague

Teams (19): Newcastle United, Arsenal, Brighton, Aston Villa, Everton, Burnley, Brentford, Wolverhampton Wanderers, Sheffield United, Liverpool, Crystal Palace, Manchester United, Olympique Lyonnais, Luton Town, Stuttgart, Bournemouth, Nottingham Forest, Blackburn Rovers, Napoli

Teams within selected timeframe (15): Newcastle United, Arsenal, Brighton, Aston Villa, Everton, Burnley, Brentford, Wolverhampton Wanderers, Sheffield United, Liverpool, Crystal Palace, Manchester United, Nottingham Forest, Luton Town, Bournemouth

Total players: 65

League: SerieA

Teams (25): Roma, Napoli, Udinese, Monza, Genoa, Juventus, Lecce, Atalanta, Frosinone, Internazionale, Cagliari, Bologna, Empoli, Hellas Verona, Torino, Lazio, Salernitana, Milan, Granada, Sassuolo, Fenerbahçe, Palermo, RB Leipzig, Galatasaray, Roma U19

Teams within selected timeframe (19): Roma, Napoli, Udinese, Monza, Genoa, Juventus, Lecce, Atalanta, Frosinone, Internazionale, Cagliari, Bologna, Empoli,

Hellas Verona, Torino, Lazio, Salernitana, Milan, Sassuolo Total players: 100

==== DEFENDERS =====

League: ArgentinaLPF

Teams (94): Colón, Godoy Cruz, Instituto, Talleres Córdoba, Atlético Tucumán, San Lorenzo, Rosario Central, Gimnasia La Plata, Argentinos Juniors, Belgrano, Huracán, Sarmiento, Junior, Lanús, Cerro Porteño, Boca Juniors, Independiente, Platense, Banfield, San Martín Mendoza, Arsenal, Unión Santa Fe, Udinese, Universidad de Chile, Newell's Old Boys, Defensa y Justicia, River Plate, Athletico Paranaense, Barracas Central, Racing Club, Cruz Azul, Fortaleza, Deportivo Madryn, Vélez Sarsfield, Estudiantes, Peñarol, Santos Laguna, Olympiacos Piraeus, Nacional Asunción, Zrinjski, Central Córdoba SdE, Unión La Calera, Universidad Católica, Tigre, Vasco da Gama, Union Saint-Gilloise, Anderlecht, Werder Bremen, O'Higgins, Criciúma, Salernitana, Deportes Iquique, Pafos, Cienciano, Brighton, Santa Fe, Melgar, Sport Boys, Pachuca, San Martín San Juan, Club Atlético Mitre, Libertad, Inter Miami, U Craiova 1948, Talleres Remedios, Delfin, San Miguel, Aucas, América de Cali, Audax Italiano, Temperley, Sporting Cristal, Gimnasia Mendoza, Deportivo Maipú, San Martín Tucumán, Colo Colo, Patronato, Gimnasia Jujuy, Gimnasia La Plata Res., Águilas Doradas, Argentinos Juniors Res., Atromitos, Guaraní, Defensa y Justicia Res., Atlanta, Racing Club Res., Belgrano Res., Botafogo, Los Angeles Galaxy, Arsenal Res., Estudiantes Res, Talleres de Córdoba U18, Lanús Res., Unión Santa Fe Res. Teams within selected timeframe (28): Colón, Godoy Cruz, Instituto, Talleres Córdoba, Atlético Tucumán, San Lorenzo, Rosario Central, Gimnasia La Plata, Barracas Central, Belgrano, Huracán, Sarmiento, Central Córdoba SdE, Tigre, Independiente, Lanús, Arsenal, Platense, Banfield, Unión Santa Fe, Vélez Sarsfield, Newell's Old Boys, Defensa y Justicia, River Plate, Estudiantes, Racing Club, Boca Juniors, Argentinos Juniors

Total players: 286

League: LaLiga

Teams (38): Las Palmas, Granada, Valencia, Girona, Celta de Vigo, Barcelona, Athletic Bilbao, Rayo Vallecano, Deportivo Alavés, Atlético Madrid, Real Madrid, Osasuna, Getafe, Almería, Cádiz, Real Sociedad, Sevilla, Mallorca, Real Betis, Villarreal, Reims, Botafogo, Villarreal B, Celta de Vigo B, Gent, Albacete, Real Sociedad B, Milan, Mirandés, Al Ittihad, Barcelona B, Elche, Shanghai Shenhua, Al Shabab, Getafe B, Betis Deportivo, Fenerbahçe, Spartak Moskva
Teams within selected timeframe (20): Las Palmas, Granada, Valencia, Girona, Celta de Vigo, Barcelona, Athletic Bilbao, Rayo Vallecano, Deportivo Alavés, Atlético Madrid, Real Madrid, Osasuna, Getafe, Almería, Cádiz, Real Sociedad, Sevilla, Mallorca, Real Betis, Villarreal

Total players: 178

League: LigaMX

Teams (36): Atlético de San Luis, Tigres UANL, Necaxa, Pumas UNAM, Mazatlán,

León, Guadalajara, Atlas, Querétaro, Puebla, Cruz Azul, Monterrey, Pachuca, América, Toluca, Club Tijuana, Juárez, Santos Laguna, Los Angeles FC, Corinthians, América de Cali, Peñarol, Real Oviedo, Juárez U23, Tlaxcala, Metropolitanos, Querétaro U23, Venados, Wanderers, Tapatío, Puebla U23, Toluca U23, Cruz Azul U23, Forge, Club Tijuana U23, El Paso Locomotive Teams within selected timeframe (18): Atlético de San Luis, Tigres UANL, Necaxa, Pumas UNAM, Mazatlán, León, Guadalajara, Atlas, Querétaro, Puebla, Cruz Azul, Monterrey, Pachuca, América, Toluca, Club Tijuana, Juárez, Santos Laguna Total players: 180

League: MLS

Teams (66): Columbus Crew, Seattle Sounders, New England, Orlando City, Cruzeiro, Atlanta United, Philadelphia Union, SJ Earthquakes, Vancouver Whitecaps, Nashville SC, New York RB, Corinthians, Colorado Rapids, Real Salt Lake, Minnesota United, Los Angeles FC, Austin FC, Portland Timbers, Dallas, St. Louis City, Sporting KC, Charlotte FC, Houston Dynamo, Cincinnati, Toronto, Chicago Fire, CF Montréal, Inter Miami, New York City, Tigres UANL, Talleres Córdoba, Fluminense, Vélez Sarsfield, Bahia, Ajaccio, Universitatea Craiova, DC United, Eupen, Motherwell, Los Angeles Galaxy, Heracles, Poole Town, Olimpia, Häcken, Pachuca, Crvena Zvezda, Haka, PAS Giannina, FC Košice, Columbus Crew 2, Rhode Island, Valour FC, Triestina, Kortrijk, Oakland Roots, Atlético Ottawa, Portland Timbers II, Deportivo Saprissa, Atlanta United II, Minnesota United II, SJ Earthquakes II, Birmingham Legion, Barcelona B, Inter Miami II, Toronto II, Zlín

Teams within selected timeframe (29): Columbus Crew, Seattle Sounders, New England, Orlando City, Cincinnati, Atlanta United, Philadelphia Union, SJ Earthquakes, Vancouver Whitecaps, Nashville SC, New York RB, Los Angeles FC, Colorado Rapids, Real Salt Lake, Minnesota United, Austin FC, Portland Timbers, Dallas, St. Louis City, Sporting KC, Charlotte FC, Houston Dynamo, Chicago Fire, CF Montréal, Inter Miami, New York City, Toronto, Los Angeles Galaxy, DC United

Total players: 254

League: PremierLeague

Teams (28): Wolverhampton Wanderers, Arsenal, Everton, Crystal Palace, Bournemouth, Fulham, Liverpool, Manchester United, West Ham United, Tottenham Hotspur, Aston Villa, Newcastle United, Brighton, Luton Town, Nottingham Forest, Sheffield United, Manchester City, Brentford, Chelsea, Burnley, Middlesbrough, Galatasaray, Leeds United, Beşiktaş, Borussia Dortmund, Bayern München, Brighton U21, Monaco

Teams within selected timeframe (20): Wolverhampton Wanderers, Arsenal, Everton, Crystal Palace, Bournemouth, Fulham, Liverpool, Manchester United, West Ham United, Tottenham Hotspur, Aston Villa, Newcastle United, Brighton, Luton Town, Nottingham Forest, Sheffield United, Manchester City, Brentford, Chelsea, Burnley

Total players: 172

League: SerieA

Teams (31): Empoli, Lecce, Udinese, Napoli, Juventus, Lazio, Cagliari, Torino, Roma, Atalanta, Milan, Frosinone, Salernitana, Monza, Sassuolo, Fiorentina, Bologna, Hellas Verona, Internazionale, Genoa, Tottenham Hotspur, Como, Flamengo, Salzburg, Santos Laguna, Schalke 04, Montpellier, Slavia Praha, Fatih Karagümrük, Servette, Genoa U19

Teams within selected timeframe (20): Empoli, Lecce, Udinese, Napoli, Juventus, Lazio, Cagliari, Torino, Roma, Atalanta, Milan, Frosinone, Salernitana, Monza, Sassuolo, Fiorentina, Bologna, Hellas Verona, Internazionale, Genoa Total players: 182

==== GOALKEEPERS =====

League: ArgentinaLPF

Teams (37): Racing Club, Argentinos Juniors, Independiente, Vélez Sarsfield, Talleres Córdoba, River Plate, Newell's Old Boys, Rosario Central, Panetolikos FC, Belgrano, Atlético Tucumán, Municipal, Granada, Bolívar, Boca Juniors, Cerro Porteño, Instituto, Lanús, Estudiantes, Barracas Central, Huracán, Necaxa, Gimnasia La Plata, Aldosivi, San Lorenzo, Aucas, Unión Santa Fe, Atlético Nacional, Defensa y Justicia, Olimpo, Unión La Calera, Tigre, Tacuary, Arsenal, Deportes Iquique, Colón, Ferro Carril Oeste Teams within selected timeframe (28): Banfield, Godoy Cruz, Independiente, Atlético Tucumán, Talleres Córdoba, River Plate, Newell's Old Boys, Rosario Central, Huracán, Belgrano, Gimnasia La Plata, Platense, Arsenal, Racing Club, San Lorenzo, Colón, Barracas Central, Boca Juniors, Argentinos Juniors, Instituto, Lanús, Central Córdoba SdE, Unión Santa Fe, Sarmiento, Defensa y Justicia, Vélez Sarsfield, Tigre, Estudiantes

Total players: 50

League: LaLiga

Teams (23): Getafe, Girona, Atlético Madrid, Rayo Vallecano, Valencia, Real Sociedad, Las Palmas, Villarreal, Mallorca, Athletic Bilbao, Deportivo Alavés, Almería, Osasuna, Real Betis, Celta de Vigo, Sevilla, Real Madrid, Real Valladolid, Barcelona, Cádiz, Betis Deportivo, Granada, Al Hilal Teams within selected timeframe (20): Getafe, Girona, Atlético Madrid, Rayo Vallecano, Valencia, Real Sociedad, Las Palmas, Villarreal, Mallorca, Athletic Bilbao, Deportivo Alavés, Almería, Osasuna, Real Betis, Celta de Vigo, Sevilla, Real Madrid, Granada, Barcelona, Cádiz

Total players: 40

League: LigaMX

Teams (20): Pumas UNAM, América, Monterrey, León, Toluca, Puebla, Atlas, Pachuca, Tigres UANL, Mazatlán, Atlético de San Luis, Club Tijuana, Necaxa, Santos Laguna, Cruz Azul, Guadalajara, Querétaro, Juárez, Audax Italiano, El Paso Locomotive

Teams within selected timeframe (18): Pumas UNAM, América, Monterrey, León, Toluca, Puebla, Atlas, Pachuca, Tigres UANL, Mazatlán, Atlético de San Luis, Club Tijuana, Necaxa, Santos Laguna, Cruz Azul, Guadalajara, Querétaro, Juárez

Total players: 36

League: MLS

Teams (35): Houston Dynamo, Columbus Crew, Cincinnati, New York RB, Seattle Sounders, St. Louis City, Vancouver Whitecaps, Austin FC, Nashville SC, Orlando City, Inter Miami, Dallas, CF Montréal, Real Salt Lake, Atlanta United, Philadelphia Union, Minnesota United, Chicago Fire, Charlotte FC, Los Angeles Galaxy, DC United, New York City, SJ Earthquakes, Chelsea, Colorado Rapids, Sporting KC, Toronto, Portland Timbers, San Antonio, Sarpsborg 08, New England, Cesena, Vitesse, Los Angeles FC, Toronto II

Teams within selected timeframe (29): Houston Dynamo, Columbus Crew, Cincinnati, New York RB, Seattle Sounders, St. Louis City, Vancouver Whitecaps, Austin FC, Nashville SC, Orlando City, Inter Miami, Dallas, CF Montréal, Real Salt Lake, Atlanta United, Philadelphia Union, Minnesota United, Chicago Fire, Charlotte FC, Los Angeles FC, DC United, New York City, SJ Earthquakes, New England, Colorado Rapids, Sporting KC, Toronto, Portland Timbers, Los Angeles Galaxy Total players: 62

League: PremierLeague

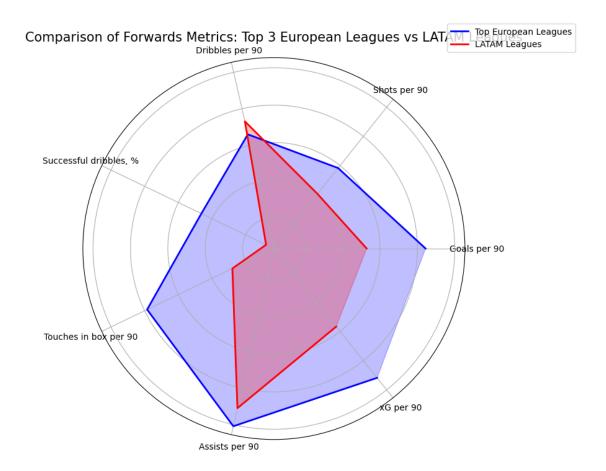
Teams (19): Tottenham Hotspur, Fulham, Manchester United, Everton, Luton Town, Brentford, Aston Villa, Wolverhampton Wanderers, Bournemouth, Arsenal, Manchester City, West Ham United, Liverpool, Burnley, Newcastle United, Chelsea, Brighton, Crystal Palace, Nottingham Forest
Teams within selected timeframe (19): Tottenham Hotspur, Fulham, Manchester United, Everton, Luton Town, Brentford, Aston Villa, Wolverhampton Wanderers, Bournemouth, Arsenal, Manchester City, West Ham United, Liverpool, Burnley, Newcastle United, Chelsea, Brighton, Crystal Palace, Nottingham Forest Total players: 36

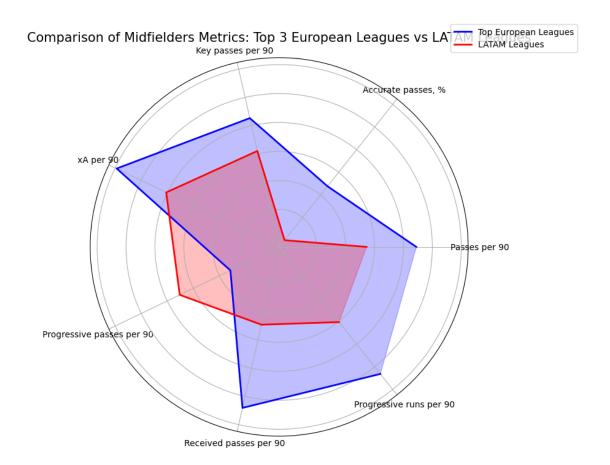
League: SerieA

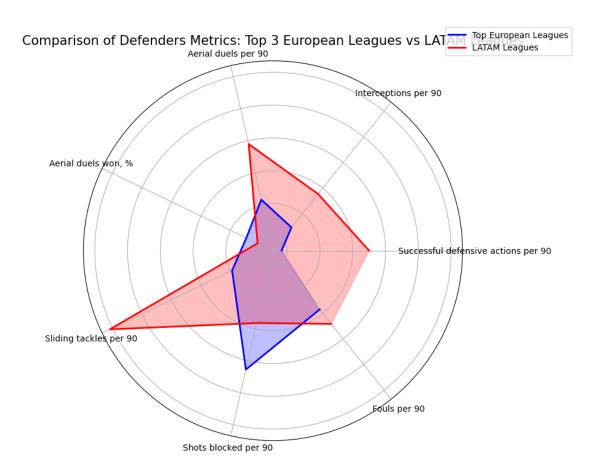
Teams (20): Lecce, Hellas Verona, Genoa, Torino, Sassuolo, Juventus, Internazionale, Fiorentina, Bologna, Monza, Cagliari, Frosinone, Napoli, Lazio, Milan, Atalanta, Roma, Empoli, Udinese, Salernitana
Teams within selected timeframe (20): Lecce, Hellas Verona, Genoa, Torino, Sassuolo, Juventus, Internazionale, Fiorentina, Bologna, Monza, Cagliari, Frosinone, Napoli, Lazio, Milan, Atalanta, Roma, Empoli, Udinese, Salernitana Total players: 44

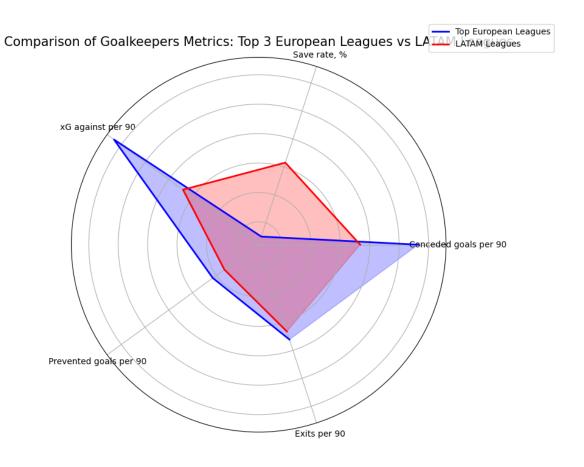
3.3 Creation of the Spider Plot

A spider plot is a graphical method of displaying multivariate data in the form of a two-dimensional chart of three or more quantitative variables represented on axes starting from the same point. Reference: https://en.wikipedia.org/wiki/Radar_chart By this, we will be able to identify how the groups of Leagues are performing in each position group.









3.4 Players that contribute the most to each Position.

Top contributors for Forwards:

	Full name	Team	\
356	Sergio Gómez Martín Manches	ter City	
43	Vinícius José Paixão de Oliveira Júnior Rea	l Madrid	
252	Jérémy Doku Manches	ter City	
336	Manor Solomon Tottenham	Hotspur	
296	Timo Werner Tottenham	Hotspur	
520	Marcelo Javier Correa Est	udiantes	
821	Emmanuel Iwe Minnesota U	nited II	
824	Ronald Donkor New	York RB	
575	Juan Camilo Hernández Suárez Colum	bus Crew	
572	Denis Bouanga Los An	geles FC	
	Team within selected timeframe Primary position Mark	et value	\
356	Manchester City LAMF \$10	,000,000	
43	Real Madrid CF \$180	,000,000	
252	Manchester City LAMF \$65	,000,000	

336 296 520 821 824 575 572	Tottenham Hotspur Tottenham Hotspur Santos Laguna Minnesota United New York RB Columbus Crew Los Angeles FC	LAMF LAMF CF LW LW CF LWF	\$13,000,000 \$17,000,000 \$1,500,000 \$0 \$0 \$10,000,000 \$6,000,000	
356 43 252 336 296 520 821 824 575 572	Contribution Score 1.703355 1.584309 1.577975 1.569641 1.354659 1.880927 Copa de la 1.608465 1.546454 1.476523 1.434228	Competition Premier League LaLiga Premier League Premier League Premier League Liga Profesional MLS Next Pro MLS MLS MLS	League PremierLeague LaLiga PremierLeague PremierLeague PremierLeague LigaMX MLS MLS MLS MLS MLS	\
356 43 252 336 296 520 821 824 575 572	Group Top European Leagues LATAM Leagues LATAM Leagues LATAM Leagues LATAM Leagues LATAM Leagues LATAM Leagues			

Top contributors for Midfielders:

\	Team	Full name		
	Real Madrid	Luka Modrić	33	
	Brighton	Pascal Groß	77	
	Liverpool	Harvey Elliott	102	
	Atlético Madrid	Rodrigo Javier De Paul	23	
	Internazionale	Hakan Çalhanoğlu	358	
	América	Álvaro Fidalgo Fernández	140	
	Houston Dynamo	Héctor Miguel Herrera López	233	
	América	Richard Rafael Sánchez Guerrero	168	
	Los Angeles Galaxy	Gastón Brugman Duarte	270	
	Everton	Omar Andrés Fernández Frasica	194	

	Team within selected	${\tt timeframe}$	Primary	position	Marke	t va	lue \	
33	Re	eal Madrid		RCMF3	\$6,	000,	000	
77		${\tt Brighton}$		LCMF	\$8,	000,	000	
102		Liverpool		RCMF3	\$35,	000,	000	
23	Atléti	ico Madrid		RCMF3	\$30,	000,	000	
358	Inter	rnazionale		DMF	\$45,	000,	000	
140		América		LCMF	\$8,	000,	000	
233	Houst	on Dynamo		LCMF	\$2,	800,	000	
168		América		RCMF	\$6,	000,	000	
270	Los Angel	les Galaxy		LCMF	\$2,	000,	000	
194		León		RCMF3	\$1,	000,	000	
	Contribution Score	Compe	etition	Le	eague			Group
33	2.140335		LaLiga	La	aLiga	Top	European	Leagues
77	1.909100	Premier	League	PremierLe	eague	Top	European	Leagues
102	1.747426	Premier	League	PremierLe	eague	Top	European	Leagues
23	1.605814	I	La Liga	La	aLiga	Top	European	Leagues
358	1.437930	5	Serie A	Se	erieA	Top	European	Leagues
140	1.866876	I	Liga MX	Li	igaMX		LATAM	Leagues
233	1.713833		MLS		MLS		LATAM	Leagues
168	1.520374	I	Liga MX	Li	igaMX		LATAM	Leagues
270	1.242282		MLS		MLS		LATAM	Leagues
194	1.215859	Primera Di	ivisión	Li	igaMX		LATAM	Leagues

Top contributors for Defenders:

	Full name	Team	١
946	Ahmed Touba	Lecce	
342	James Hill	Bournemouth	
963	Pietro Comuzzo	Fiorentina	
160	Mamadou Mbaye	Cádiz	
949	Jérôme Boateng	Salernitana	
1246	Elías Agustín Ramirez	Club Atlético Mitre	
1244	Álvaro Agustín Lagos	Atlético Tucumán	
1241	Pablo Ezequiel Aranda	Lanús Res.	
1219	Leonel Di Plácido	Botafogo	
778	Ousman Jabang	CF Montréal	

	Team within	selected timeframe	Primary	position	Market value	\
946		Lecce		LCB	\$1,600,000	
342		Bournemouth		LB	\$2,000,000	
963		Fiorentina		LCB	\$0	
160		Cádiz		LCB	\$400,000	
949		Salernitana		CB	\$400,000	
1246		Gimnasia La Plata		RWB	\$0	
1244		Atlético Tucumán		RB	\$175,000	

1241		Lanús	RB	\$0	
1219		Lanús	RB	\$500,000	
778	C	F Montréal	RCB3	\$0	
	Contribution Score		Competition	League	\
946	1.446647		Serie A	SerieA	
342	1.406109	Pr	emier League	PremierLeague	
963	1.399121		Serie A	SerieA	
160	1.239974		LaLiga	LaLiga	
949	1.235491		Serie A	SerieA	
1246	2.507106	Prim	era Nacional	${\tt ArgentinaLPF}$	
1244	2.169053	Liga Profesion	al de Fútbol	ArgentinaLPF	
1241	2.121551	Re	serve League	ArgentinaLPF	
1219	1.862870		Serie A	ArgentinaLPF	
778	1.627827		MLS	MLS	
	Grou	ın			
946	Top European League	-			
342	Top European League				
963	Top European League				
160	Top European League				
949	Top European League				
1246	LATAM League				
1244	LATAM League				
1241	LATAM League				
1219	LATAM League				
778	LATAM League				
	-				
Тор со	ontributors for Goall	xeepers:			
1					
		Full name		Team \	
216		Simone Perilli		Verona	
38	Jaume Do	ménech Sánchez		alencia	
75		Loris Karius	Newcastle		
65		Arijanet Murić		Burnley	
70		Robin Olsen	Asto	n Villa	

	Full name	Team \
216	Simone Perilli	Hellas Verona
38	Jaume Doménech Sánchez	Valencia
75	Loris Karius	Newcastle United
65	Arijanet Murić	Burnley
70	Robin Olsen	Aston Villa
167	James Pantemis	CF Montréal
170	Andrew Tarbell	Houston Dynamo
255	Cristopher Javier Fiermarin Forlán D	efensa y Justicia
171	Thomas Hasal Va	ncouver Whitecaps
107	Héctor Hipólito Holguín Pérez	Santos Laguna
	Team within selected timeframe Primary	position Market value \
216	Hellas Verona	GK \$200,000
38	Valencia	GK \$800,000
75	Newcastle United	GK \$1,000,000

65	Burnley	GK	\$7,000,000		
70	Aston Villa	GK	\$1,500,000		
167	CF Montréal	GK	\$400,000		
170	Houston Dynamo	GK	\$150,000		
255	Defensa y Justicia	GK	\$300,000		
171	Vancouver Whitecaps	GK	\$500,000		
107	Santos Laguna GK		\$400,000		
	Contribution Score	Competition	League	\	
216	2.398890	Serie A	SerieA		
38	1.823741	La Liga	LaLiga		
75	1.768737	Premier League	PremierLeague		
65	1.556083	Premier League	PremierLeague		
70	1.129541	Premier League	PremierLeague		
167	1.379058	MLS	MLS		
170	1.037262	MLS	MLS		
255	1.002228 Liga Profe	sional de Fútbol	${\tt ArgentinaLPF}$		
171	0.957285	MLS	MLS		
107	0.915153	Liga MX	${\tt LigaMX}$		
	Group				
216	Top European Leagues				
38	Top European Leagues				
75	Top European Leagues				
65	Top European Leagues				
70	Top European Leagues				
167	LATAM Leagues				
170	LATAM Leagues				
255					
171	LATAM Leagues				
107	LATAM Leagues				

3.5 Considerations

Some players may have a high contribution score but we must take into account minutes / matches played, another approach could be to filter only players who have played over certain amount of matches and/or minutes. Antoher important consideration is that at first the Min Max scaler was used to standarize the variables, but then it was changed to Robust Scaler.

4 Conclusions

To conclude the analysis, we can observe in general that Top 3 Europe leagues tend to have higher performance in almost every aspect of the game compared to LATAM leagues. This is evident in the aggregated metrics, the spider charts, and the top contributors' analysis.

4.1 Highlights by Position Group - Personal perspective

4.1.1 Forwards:

- European forwards tend to excel in metrics related to offensive effectiveness, especially in shots per 90, goals per 90, and touches in the box per 90, reflecting a more aggressive attacking approach.
- LATAM forwards show strengths in successful dribbles percentage, indicating technical proficiency in one-on-one situations. However, they lag in metrics tied directly to goal-scoring efficiency, such as xG (expected goals) and shots per 90.

4.1.2 Midfielders:

- European midfielders outperform in key passing metrics, including key passes per 90 and passes per 90, suggesting a structured playmaking style with high passing accuracy.
- LATAM midfielders demonstrate relatively high progressive passes, highlighting creative contributions despite fewer overall passes, which may imply a more direct style with lower possession but impactful plays.

4.1.3 Defenders:

- LATAM defenders show higher averages in aerial duels per 90, Sliding tackles and successful defensive actions, emphasizing a physical style with more focus on defensive actions. But also high proportion of Fouls.
- European defenders excel in intercepting and blocking metrics, showing a more controlled and tactical approach, which aligns with the structured defensive systems often seen in top European leagues.

4.1.4 Goalkeepers:

- European goalkeepers lead in metrics related Prevented goals and Exits, but also have a higher Conceded goals and xG against (Expected goals against).
- LATAM goalkeepers, excel in Save rate %, even having conceded fewwer goals.

4.1.5 Overall Summary:

- European leagues generally focus on metrics that reflect structured, possession-based play, with high performance in passing, goal-scoring efficiency, and defensive positioning.
- LATAM leagues display a more direct and physically engaging style, with strengths in dribbling, aerial duels, and creative assists, though they may be less efficient in metrics that benefit from structured tactics or defensive depth.

4.2 What's next

- 1. A lot of different configurations in the analysis can be made, particularly with the selection of main variables and the scaler method.
- 2. Further and deeper analysis must be made in regard to data quality, since observations may still have issues to resolve.