## Cultural diversity and team performance in the Italian Serie A

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## Abstract

Cultural diversity features prominently in management studies. A diverse range of skills and perspectives can produce innovation and a greater variety of solutions to day to day problems. At the same time, however, the same heterogeneous approaches and experiences can result in communication and coordination problems, lack of trust and intra/intergroup conflict. We analyse a newly constructed dataset on team composition and performance for 29 teams, 1,238 players and 1,899 matches in the Italian Serie A with information on the players' place of origin, talent, position, demographics, manager experience and other factors. We compute indices of fractionalization and polarization and find that both measures of diversity have a strong and persistent negative effect on game scores and player objective performance ratings. This research provides new important insights into the drawbacks of cultural heterogeneity in the workplace and calls for more indepth analyses of the nexus diversity-performances on team performance.

### 1. Introduction

Team diversity is the level of diversity of organizational groups (Milliken and Martins, 1996). It occurs when individuals with different identities, background and experience stay close and interact with each other. Teams can be diverse with regard to various characteristics including gender; age; race, ethnicity and nationality; personal characteristics and values; educational, functional and occupational background; industry experience; organizational memberships; organizational tenure; and group tenure (Milliken and Martins, 1996).

The issue of cultural diversity is one of the most fast-growing fields of research in social science. As the population in modern societies became substantially more heterogeneous along traditional dimensions such as national origin or ethnicity, several studies have investigated whether the overall performance of a team of workers is fostered by the heterogeneity of its members' cultural or national backgrounds (Fisher Ellison et al., 2010; Van Praag and Hoogendoorn, 2012; Trax at al., 2012; Kahane et al., 2013).

Yet, whether diversity has a positive or negative effect on the performances of a team is still a puzzling issue and the studies on organisational theory do not offer a clear-cut answer. Horowitz and Horowitz (2007, p. 98) recalls diversity is often provided as a "*double-edged sword*". Team diversity can potentially create positive team outcomes through enhanced organisational synergy, improving its performance, as individuals' heterogeneous backgrounds bring along their various skills, experiences, and abilities in their daily interactions. At the same time, however, heterogeneous work environments are often characterised by cultural barriers which raise transaction costs and lack of trust, which in turn may reduce the overall performance of the team. Therefore, whether the gains from diversity outweigh its costs should be considered as an empirical question.

Our paper analyses all teams' performance measured objectively and consistently in all matches played in Serie A, the top Italian football division, over a period of five seasons from 2009/10 to 2013/14. We consider cultural diversity at team level, controlling some factors, such as team members, individual skills and team average skills, manager attributes, and team composition that can have an impact on team performance.

This is a very interesting and timely issue as cultural diversity increased considerably in football after the 1995 European Court of Justice's definition of football as an economic activity. This guarantees the free movement of European football players within the European Union without imposing any limitations (Szymanski, 2000). This decision, the so-called Bosman ruling, gave clubs the opportunity to explore the labour market of football worldwide and to hire foreign players to enhance their success by exploiting the specific strengths of individuals with different cultural backgrounds and diverse skills, as football education is focused on different tactics (Lanfranchi and Taylor, 2001).

Using data on teams' line-up including the potential substitutes, a range of empirical models and two indexes of heterogeneity, we find that team performance is consistently and negatively affected by diversity.

# 2. Relevant literature and theoretical framework

Most of the theoretical literature generally supports the claim that diversity is added-value and its effect is conditioned by the nature of tasks, the extent of potential communication problems, and the scope for gain from creativity derived from differences (Lazear, 1999). On this matter, the diversity of teams has drawn great attention in the literature (Sakuda, 2012). Yet the empirical evidence is inconsistent as some studies found no effects of diversity on performances (Webber and Donahue, 2001), while others documented that diversity is positively (Higgins et al., 2005) or negatively correlated with performance (Carson et al., 2004; Haas and Nuesch, 2012).

Similarly, in psychology and management studies, diversity on organizational productivity and individual and team performance have both negative and positive impact (Joshi and Roh, 2009; van Knippenberg and Schippers, 2007). In a study at a firm-level, Hamilton et al. (2003) finds that more heterogeneous teams were more productive, holding average ability constant, which is consistent with mutual team learning and intra-team bargaining. At the team and workgroup level, the positive effects of diversity are facilitated by multiple factors, including effective leadership and workgroup social identification (Homan et al., 2007; Kearney and Gebert, 2009).

If we focus specifically on the effect of cultural diversity on team performance, numerous scholars have analysed it (Early ad Mosakowski, 2000; Gibson, 1999; Milliken and Martins, 1996; Stahl et al., 2010; Thomas, 1999; Zhou and Shi, 2011). A key positive argument is that multiple perspectives and experiences favour creativity, adaptability, innovation, and higher quality problem solutions (McLeod et al., 1996; Wieserma and Bantel, 1992). Conversely, the similarity-attraction paradigm suggests that workers are appealed to collaborate with who share similar value, principles, and attitudes (Williams and O'Reilly, 1998). According to social identity theory (Tajfel, 1982), more culturally different individuals tend to categorize themselves into specific groups and to negatively assess and judge others as outsiders to maintain a positive social identity.

However, literature findings are conflicting. While there is evidence of positive effects of culturally heterogeneous teams in some studies (Cox et al., 1991; Elron, 1997; Gibson, 1999), others highlight negative effects (Govindarajan and Gupta, 2001; Henderson, 2005; Millhous, 1999) or revealed curvilinear relationship between cultural diversity and team performance (Early and Mosakowski, 2000). Similarly, in the team management literature, cultural heterogeneity may not only positively influence team performance but also have negative effects (Chevier, 2003; Maznevski and Chudoba, 2000). This ambiguity is also

present in the conflict management literature (Elron, 1997; Henderson, 2005) as well as in studies analysing motivation and trust building (Di Stefano and Moznevski, 2000).

Maderer et al. (2014) argue that four main methodological limitations suggest this inconsistent evidence. First, several studies used student samples (Chatman and Flynn, 2001; Harrison et al., 2002; Jehn and Mannix, 2001; Thomas, 1999; Watson et al., 1993; Zhou and Shi, 2011), whose findings are hardly compared to real-life teams who face numerous time restrictions and economic constraints (Berg and Holtbrugge, 2010). Second, teams are often selected only for the reason of the study (Cox et al., 1991; Gibson, 1999; Kilduff et al., 2000; Thomas et al., 1996), and they might behave more artificially than teams with both a history and future cooperation (Earley and Mosakowski, 2000; Pelled et al., 1999). Third, the concept of cultural diversity is often not adequately aligned with diverse and multiple approaches to measure team performance: subjective performance ratings (Earley and Mosakowski, 2000; Pelled et al., 1999); the number and the quality of ideas/solutions generated (McLeod et al., 1996; Watson et al., 1993); or psychological commitment, number of absences, job satisfaction, and the intention to stay (Tsui et al., 1992; Verkuyten et al., 1993). Finally, different conditions under which teams operate are not sufficiently considered, as the nature of the task is seen as a possible moderator and culturally heterogeneous teams tend to perform successfully when their tasks are well defined, demand - coordinated activities, and require simple responses (Stewart, 2006; Stahl et al., 2009).

In comparison with previous research, the analysis of football teams' diversity has some advantages. Exhaustive information on players' and teams' characteristics and performance are very accurate and readily available, and this allows much more detailed analyses than any other industry (Kahn, 2000). Then, players' contract duration in a club ranges between a minimum of a year and a maximum of 6 years. Thus, players work together for a comparatively long period of time, which allows assessing time effects.

There literature on diversity in team sports is still marginal as Table 1 reveals. An analysis of multiple seasons in American basketball and baseball conducted by Timmerman (2000) suggested that racial and age diversity for basketball players had negative performance effects but none for baseball. In a study on high-school basketball players, Ninham (2009) found that passing decisions were affected by players' race, probably explained by preferential treatment and difficulty in communication. Considering the gains to NHL hockey teams from employing culturally diverse players, Kahane et al. (2013) argue that teams are more successful when their European players came from the same country. Examining the determinants of team performance, as opposed to individual performance, in the Tour de France, Prinz and Wicker (2016) found that diversity within a team in terms of age, nationality, has no impact on team performance in the Tour de France.

Author(s) and	Data	Dependent	Results		
year of	Dutu	variable/estimation technique	Results		
publication					
Timmerman	NBA basketball		Age diversity and racial diversity were		
(2000)	and MLB		negatively associated with basketball		
	baseball from		team performance. Diversity on both		
	1950 to 1997		variables was unrelated to baseball team		
Drandac	German	The final replying of each team	performance.		
Brandes, Franck and	Bundesliga	The final ranking of each team in each football season/OLS	The influence of national diversity among team members on team performance		
Theiler (2009)	from 2001 to	regression	depends on the nature of the underlying		
mener (2005)	2006		task.		
Haas and	German	Team points, goal difference	Multinational teams perform worse than		
Nuesch (2012)	Bundesliga	and expert evaluation/OLS	teams with less national diversity		
	from 1999 to	regression			
	2006				
Kahane,	Hockey NHL	Team win percentage, team	When teams have players from a wide		
Longley and Simmons	from 2001 to 2008	points percentage and goal	array of European countries, integration		
(2013)	2008	difference/OLS regression	costs associated with language and cultural differences may start to override		
(2013)			any gains from diversity		
Ingersoll,	UEFA	Per-game goal	More diverse teams outperform less		
Malesky and	Champions	differential/OLS regression	diverse teams		
Saiegh (2013)	League from				
	2003 to 2013				
Ben-Ner, Licht	German	Games goals conceded, games	The diversity effect is small and is		
and Park	Bundesliga from 2000 to	goal scoreds and player game	identified when teams are disaggregated		
(2013)	2010	performance rating/OLS regression	into subgroups, by domestic versus foreign players, by position, and by joint		
	2010		tenure spent together on the team		
Maderer,	Big five	Points to market value	Cultural heterogeneous teams are less		
Holtbrugge	European	defined as the average	successful than teams that consist of		
and Tassilo	leagues in	number of points per match	players with the same nationality.		
(2014)	season	divided by the market value of			
	2008/09	the team/OLS regression			
Prinz, J. and	Tour de France	Numbers of riders completing	Diversity in terms of tenure significantly		
Wicker, P.	from 2004 to	the race and standardized	adds to team performance, while diversity		
(2016)	2013	team rank/ OLS regression	in terms of skills (proxied by body mass		
			index) decreases performance. Diversity		
			in terms of age, nationality, language,		
			previous Tour participations and stage		
			wins has no significant effect on team performance		
			performance		

#### Table 1: List of publications on diversity in sport

In football, the majority of studies have focused on the effect of team diversity in the German Bundesliga. Brandes et al. (2009) argue that cultural heterogeneity does not have a significant impact on season league standing. However, by testing it according to players' role, a significantly negative result is evidence on the defense. Haas and Nuesch (2012) found negative effects of national origin diversity on game level team outcomes in terms of points per game, goal differences per game, and average subjective player rating per game.

Ben-Ner et al. (2013) found both positive and negative performance effects at the game level associated with diversity linked to contingencies of task, tenure, and place of origin. Specifically, the effects of diversity on performance are positive for defense and negative for offense. Maderer et al. (2014), using a structure-leadership-performance model and focusing on the big five European Leagues during the season 2008/09, find that cultural diversity has a negative impact on team performance measured in terms of the ratio points per game to clubs' market value.

As we can see, this literature has been facing severe difficulties in attempting to establish the very direction of the effect of diversity on performances in the workplace. This is still a contentious issue and in the next section we will try to address this question by means of a novel and extensive dataset on football teams and compare two indexes of diversity, the issue considered next.

## 3. Indices of diversity

To capture the degree of diversity within a team, we use two indices: the fractionalization and the polarization. Empirical economic studies on diversity mostly use the Ethnolinguistic Fractionalization Index (ELF) or simply fractionalization index (Alesina and La Ferrara, 2005; Ottaviano and Peri, 2006), which measures the probability of two randomly selected individuals in society belonging to different groups (Desmet et al., 2009). As a variation of the Herfindall-Hirschman concentration Index (HHI), it equals 0 when all players are from the same category and grows as diversity rises; approaching 1, as the number of players increases and each player belongs to a different category. In our paper, we employ a measure of diversity based on players' 60 nationalities represented among the 1,238 players, and on average only half of the players are Italian born in each match. An index of fractionalization can be written as:

(1) Fractionalization = 
$$1 - \sum_{i=1}^{n} \pi_i^2 = \sum_{i=1}^{n} \pi_i (1 - \pi_i)$$

Yet, while this measure of heterogeneity has drawn a vast interest, an alternative index of diversity, called polarization, was originally introduced by Reynal-Querol (2002) as:

(2) Polarization = 
$$4 \sum_{i=1}^{n} \pi_{i}^{2} (1 - \pi_{i})$$

This index efficiently assesses how far the distribution of the groups is from a bipolar situation where there two sub-groups within the same team of equal size as is the case of team *Catania Calcio* in our sample. Using this alternative index serves as a way of capturing the presence of intra-group tensions. Economic models of rent-seeking suggests that social costs are higher and social tensions emerge more easily when the population is distributed in two equally-sized groups, therefore when society is highly polarized. For this reason, we

use the indexes of polarization and fractionalization to capture the potential for conflicting behaviours and tensions in heterogeneous teams.

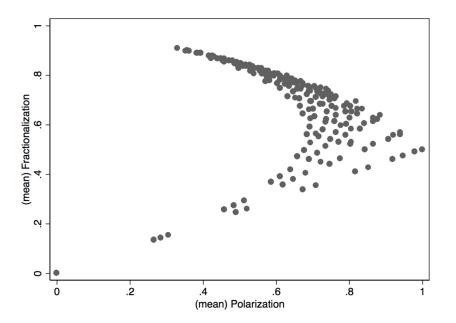


Figure 1: Team Fractionalization vs Polarization in Italian Serie A (2009-2014)

We follow the standard procedure and multiply the index by 4 so as to make it range between 0 and 1. When there are only two groups, both indexes equal the same score. Yet, when we move to three groups, the relationship between these indexes breaks down. Figure 1 shows the scatterplot of fractionalization versus polarization using our data source. For low levels of fractionalization, the correlation with polarization is positive, whereas for intermediate levels of fractionalization, the correlation is zero. High levels of fractionalization are negatively correlated with the polarization.

# 4. Data and empirical strategy

The top tier Italian football league is Serie A and it comprises 18 clubs that compete to win the league title, the so-called Scudetto. Each of the 20 Serie A team plays 38 games per season, playing each of the other team twice, once at home and once away. At the end of the season, the top six teams qualify for European competitions, whereas the bottom three teams are relegated to Serie B.

Our dataset includes five Serie A seasons from 2009/10 to 2013/14 with a total of 3802 player game observations in 1,899 games with 29 different teams, and 238 unique players who played at least in one game during our sample period. While performance data were provided by Panini Digital, the official Serie A data provider, players' personal information and demographic characteristics were collected from the football website Soccer Association.

Whether we consider either the season or the match level, sporting success is the main target for any professional football. Team league table position in terms of points attained is likely the most common measure with the appropriate normalization methods. However, in our context, the analysis is carried out at match level and we opt for the main team performance as shown in table 2: team's final game results and game goal difference. These two variables are the main dependent variable for our empirical analysis on cultural diversity on football teams.

Variable	Mean (S.D.)	Variable description
Team results	0.999 (0.861)	Team's final game result
Goal difference	1.260 (1.066)	Difference between goals made and goals taken by a team in the single game

## Table 2: Team performance dependent variables at game level

We strive to control for a host of variables potentially affecting the outcome of the match. We include the IVG, a measure of a player's performance calculated and owned by Panini Digital, which allows us to control for the average quality of the individual players in each match. The index is rated on a 0 to 30 scale based on several metrics weighted in function of the player's position using the same rating scheme across all games: number and quality of passes, goals, saves, tackles, and more, collected continuously in each game.

#### Table 3: Independent variables

Variable	Mean	Variable description
Wages	(S.D.) 42973.470 (25723.880)	Team seasonal payroll in thousands of Euros
Capacity	0.560 (0.190)	Ratio between the game attendance, measured by the number of tickets sold plus seasonal ticket holders per match, and the stadium capacity
Manager Age	49.426 (4.909)	Age of the club's manager
Manager Experience	126.570 (83.570)	Number of games managed by the club's manager
Tenure	1.805 (2.628)	Number of seasons played by a player in the current team
IVG	17.703 (3.413)	Players' performance index
Home	0.500 (0.30)	Dummy variable that takes the value of 1 if team plays a home game and 0 otherwise

In Table 3, we present the other variables that are adjusted to the level and period of analysis and that arguably may affect team.

Time spent together by members of a team may have multiple and conflicting effects on the role of diversity on the quality of their collaboration as common goals and shared experiences may help forge a common identity that bridges over players' place of origin identities (Allport, 1954; Chen and Chen, 2011; Chatman and Flynn, 2001). Differences among diverse members may fade away thus weakening the negative effect of diversity on social preferences towards out-group members. From this perspective, collaboration will be improved over time. Furthermore, longer joint tenure improves communication as team members learn each other's styles and reduce misunderstandings. Harrison et al. (2002) argue that evident aspects of diversity have less negative impacts over time because individuals spend more time together to know one another more and therefore rely on relatively automatic social categorisation processes, and deep level diversity become more pronounced with more negative effects over time. Schippers et al. (2003) and Kurtulus (2011) find that team tenure enhance the beneficial effects of the diversity-performance relationship. For this reason, we include tenure on team in our model. Manager (coach) age and experience and stadium size are also included together with each team payrolls to control clubs characteristics.

#### 5. Empirical strategy

With the exception of the match results, all the continuous variables are transformed into logs to reduce proportionally the variance and the effect of outliers. We estimate the following equation.

(3) 
$$lnY_{imt} = \alpha Frac_{imt} + \beta Pol_{imt} + \sum_n \delta_n ln X_{imt} + \mu_i + \mu_t + \epsilon_{imt}$$

with i = 1,..., 29 is the team, m = 1,... 1,899, is the match and t = 1,...,5 as our data, from 2009 to 2014, is organized in 5 seasons.  $lnY_{imt}$  is the performance of the team i. We use two measures of team performances: 1) the result of the match, coded as 2 if the team won, 1 in case of a draw, and 0 when a team loses; and 2) the difference between goals scored and goals conceded.  $Frac_{imt}$  and  $Pol_{imt}$  are the levels of fractionalization and polarization; X is a vector of explanatory variables and  $\delta_n$  is the associated coefficient vector; and  $\epsilon_{imt}$  is the error term. We control for the capacity of the stadium, home, wages, manager age, manager experience, tenure seasons, tenure games, IVG and the interaction between Home and capacity. Game level diversity (as opposed to season-level) is usually affected by a large number of exogenous factors (or shocks) such as injuries, illness, disciplinary suspensions by the soccer federation, international responsibilities of players who are members of national teams, and factors beyond the control of the manager.

For each dependent variable, six regression analyses are shown in Table 4 and 5. We use

both ordered probit models (models 1-3) as well as OLS models (models 4-6) as a robustness check. We also include a full set of time dummies,  $\mu_t$ , that control for unobservable seasonal effects, and team fixed effects  $\mu_i$ . First, since the indexes are correlated for extreme levels of fractionalization and polarization, we include them first separately. In both tables, columns 1 and 4 contain all the control variables plus the fractionalization index. Similarly, columns 2 and 5 only include the polarization index with the same control variables. Yet, Ager and Bruckner (2013) claims that the estimates do not capture independent effects and suffer from an omitted variables bias. For this reason, we also consider them jointly in columns 3 and 6. We control for group-wise heteroscedasticity and serial correlation by reporting robust standard errors clustered on teams. It is relevant to note that we use a linear-log model i.e., we take the log values of fractionalization and polarization and we keep the dependent variables in their original scale. This specification is useful in the presence of diminishing marginal returns and it is easy to interpret.

### 6. Results

The goal of each team is to win by scoring more goals than conceding and thus earnings three league points. Winning at a greater goal difference means greater success and helps with league standing when teams are tied in terms of number of points. The diversity variables and team characteristics vary from game to game depending on the specific game line-up, manager variables change when manager changes, or are incremental (experience). Our empirical results are reported in Tables 4 and 5, whose difference is in the dependent variable. While Table 4 reports the performance in terms of match result, assigning 0 to Lose, 1 to Draw and 2 to Win, in Table 5 we explain the difference in goals (goal scored-goals conceded) as the other dependent variable, also treated as a categorical and ordered variable.

Diversity indexes are always negatively correlated with performances. The benchmark regression in Column 1 of Tables 4 and 5 suggests that the fractionalization index is statistically significantly associated with team result and goal difference, and average team tenure as well as manager experience has no significant moderating effect on this relationship.

Amongst the control variables, team wages and IVG have a positively and statistically significant impact on the dependent variables on the match results and the goal difference score. This evidence confirms that top spending clubs are more likely to win. Similarly, playing at home provide a considerable advantage as the estimations are also positively and statistically significant.

Variables	(1)	(2)	(3)	(4)	(5)	(6)
	**		*	**		*
Wages Home	0.383**	0.309	0.346*	0.231**	0.187	0.208 <sup>*</sup>
	(0.177)	(0.188)	(0.191)	(0.107)	(0.113)	(0.114)
	0.755***	0.763***	0.756***	0.506***	0.510***	0.506***
	(0.149)	(0.149)	(0.149)	(0.091)	(0.091)	(0.091)
<b>.</b>	0.006	0.005	0.005	0.025	0.026	0.025
Capacity	(0.128)	(0.125)	(0.127)	(0.084)	(0.081)	(0.083)
Home x	-0.478**	-0.487**	-0.480**	-0.352**	-0.356**	-0.352**
Capacity	(0.222)	(0.222)	(0.221)	(0.132)	(0.132)	(0.131)
	-0.481	-0.438	-0.499	-0.274	-0.250	-0.284
Manager Age	(0.325)	(0.312)	(0.320)	(0.197)	(0.190)	(0.194)
Manager	0.018	0.018	0.021	0.011	0.011	0.012
Experience	(0.016)	(0.016)	(0.016)	(0.009)	(0.009)	(0.009)
Tenure	-0.002	0.021	0.015	-0.003	0.010	0.007
Seasons	(0.106)	(0.097)	(0.099)	(0.065)	(0.059)	(0.061)
IVG	9.883***	9.859***	9.885***	5.984***	5.978***	5.984***
	(0.558)	(0.554)	(0.558)	(0.272)	(0.268)	(0.271)
Fractionalizat	-0.797***		-0.705**	-0.468**		-0.414**
ion	(0.294)		(0.324)	(0.171)		(0.188)
Polarization		-0.683*	-0.454		-0.409	-0.279
		(0.410)	(0.431)		(0.241)	(0.255)

Table 4: Ordered Probit and OLS Models of Team Result, 2010-2014

Dependent variable is team result: 0 if Lose, 1 if Draw, 2 if Win

Models 1-3 are Ordered Probit. Models 4-6 are OLS. \* p < 0.10, \*\* p < 0.05, \*\*\* p < 0.01. Season and Team fixed effects are included. Robust standard errors are given in parentheses clustered by Team.

Regarding manager variables, manager experience is not significant in both tables' estimations. Conversely, manager age has a negative and significant impact on goal difference. This implies that older manager might perform worse than younger ones.

Variables	(1)	(2)	(3)	(4)	(5)	(6)
Wages	0.343 <sup>**</sup> (0.140)	0.256 <sup>*</sup> (0.140)	0.294 <sup>**</sup> (0.141)	0.442 <sup>**</sup> (0.182)		0.378 <sup>**</sup> (0.183)
Home	0.642 <sup>***</sup> (0.111)	0.648 <sup>***</sup> (0.110)	0.642 <sup>***</sup> (0.110)	0.839 <sup>***</sup> (0.145)		
Capacity	0.005 (0.137)	0.005 (0.133)	0.003 (0.136)	0.012 (0.183)		
Home x Capacity	-0.358 <sup>**</sup> (0.174)	-0.365 <sup>**</sup> (0.174)	-0.358 <sup>**</sup> (0.173)			
Manager Age	-0.537 <sup>**</sup> (0.240)	-0.498 <sup>**</sup> (0.228)	-0.559 <sup>**</sup> (0.233)	-0.700 <sup>**</sup> (0.313)		-0.729 <sup>**</sup> (0.305)
Manager Experience	0.014 (0.014)	0.015 (0.014)		0.018 (0.018)		
Tenure Seasons	-0.046 (0.091)	-0.018 (0.082)	-0.023 (0.084)	-0.060 (0.120)		
IVG	9.929 <sup>***</sup> (0.506)	9.911 <sup>***</sup> (0.503)	9.934 <sup>****</sup> (0.506)		12.965 <sup>***</sup> (0.617)	
Fractionalization	-0.862 <sup>***</sup> (0.243)		-0.744 <sup>***</sup> (0.271)	-1.140 <sup>***</sup> (0.322)		-0.985 <sup>**</sup> (0.359)
Polarization		-0.841 <sup>***</sup> (0.323)	-0.608 <sup>*</sup> (0.353)		-1.104 <sup>**</sup> (0.421)	
N 3800						

Table 5: Ordered Probit and OLS Models of Goal difference, 2009-2014

Dependent variable is Delta of goals (goals scored-goals conceded)

Models 1-3 are Ordered Probit. Models 4-6 are OLS. \* p < 0.10, \*\* p < 0.05, \*\*\* p < 0.01. Season and Team fixed effects are included. Robust standard errors are given in parentheses clustered by Team.

There is no notable difference between fractionalization and polarization, as both indexes have the same direction. Using two different measure of performance does not seem to affect the results. However, when we include them together in table 4, polarization is no longer significant, whereas in table 5 both retain their statistical significance at conventional levels. This should be expected as the two measures are correlated and therefore the interpretation is ambiguous. This makes us less confident in the validity of the results when both indexes were included jointly in the regressions. This issue is also acknowledged in some of the recent literature on the topic (Ager and Bruckner, 2013). In light of this issue, we need to be careful in interpreting the models where both indexes were included jointly. Using an OLS model yields empirical estimates that are similar in statistical significance to those obtained using Probit models. The substantive interpretation of the coefficients in the

OLS model reveals that a 10 percent increase in fractionalization reduces both the result by 0.05 points and difference in goals by 0.11. The effect of polarization is in the same order of magnitude. These results support previous studies on multicultural teams which find that cultural diversity is damaging for tasks with low complexity and greater time constraints (Cox et al., 1991; Jehn, 1995; McLeod et al., 1996; Pelled et al., 1999).

The fact that some control variables are not significant, such as capacity and manager experience, is not surprising, as our models are very conservative and the combined inclusion of time and team fixed effects soak up most of their explanatory power.

Some variables have a negative sign such as the age of the manager and the interaction between Home and Capacity. Regarding the first variable, the age of the manager has a negative impact as it might be related to the fact that old manager tends to work for teams that fight to avoid relegation and they might adopt a more conservative style. The second variable might be explained by the fact that stadia attendance in Italian Serie A is very low due to reasons that stadia are old and unsafe to attract large audience. For this reason, top clubs mostly play in half-empty stadium and middle and bottom clubs fill their stadium when they host top clubs. Hence, it is plausible that there is a negative significance between home stadium capacity and team performance.

# 7. Discussion and conclusions

A multitude of factors affects how well individuals who are diverse in teams of their place of origin collaborate on various tasks. Diversity may affect incentives, communication and creativity arising from different groups within a team that act in the interest of the group versus their individual and collective decisions. The literature on diversity has generated findings that show both positive and negative effects of diversity on performance.

This paper examines the relationship between the cultural heterogeneity of football teams and their success at match level. Firstly, the current literature on multicultural football teams was examined to identify the most relevant variables in this research context. While previous research is mainly focused on the German Bundesliga, the composition of football team line-up in terms of cultural diversity is analysed in the Italian Serie A, thus offering a wider and more consistent picture of the effects of cultural diversity in this context. Afterwards, we developed a model to test an archival dataset of 1238 players of 29 clubs along 1,899 matches in the Italian Serie A. In contrast to the main literature, we analysed real-life teams that are characterized by a relatively stable composition over a longer period of time.

We found that diversity matters and has unfavourable effects. The place-of-origin diversity of team line-up has discernible association with match results and goal difference. Performance effects of diversity at the team level can be identified when the role of joint tenure on time spent together in the team is incorporated in individual games. Our evidence supports that cultural diversity has a negative effect on team success, thus supporting the similarity–attraction theory, in contrast to previous studies which showed that cultural diversity has either no impact or a positive impact on the sporting success of football teams (Brandes et al., 2009). This means that more cultural diverse teams are less successful than more cultural homogenous teams.

A future research direction should have a closer look on the impact of language on team process and sporting success (Chen et al., 2006; Henderson, 2005). Football requires intensive communication between the team members on the field as well as by the coach. Thus, it can be expected that language skills of players and coaches may moderate the relationship between the cultural diversity of a team and team success in a positive way.

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