



I Guess We are from Very Different Backgrounds: Attitudes Towards Social Justice and Intergenerational Educational Mobility in European Societies

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Abstract

This paper addresses the relationship between intergenerational educational mobility and attitudes in relation to fairness in European societies. The dimensions of fairness considered capture a broader notion of social justice by targeting four distinct principles: equality, equity, need and entitlement (Hülle et al., *Social Indicators Research* 136:663–692, 2018). We investigate how attitudes towards those principles differ across individuals who experienced upward, stable, or downward trajectories of educational mobility in relation to their parents. To offer a comparative framework, we use nationally representative surveys of public opinion from 29 countries who participated in the 2018 round of the European Social Survey (ESS), which included a unique battery of questions on attitudes towards fairness. Using Mobility Contrast Models (MCMs), we identify the independent role of educational mobility in shaping attitudes regarding four types of fairness, which encapsulate the broader concept of social justice. We explore notable variation at the country level, although the pooled sample indicates that upward mobility significantly predicts a higher support for the principle of equality. In addition, this relationship is stronger among the more upwardly mobile (i.e., a greater difference between a respondent's education and that of their parent).

Keywords Social justice · Education · Mobility · European social survey · Attitudes · Inequality

1 Introduction

Inequality and social justice are a focus of two interrelated literatures. First, research has tracked a notable rise in social and economic inequality and underlined the implications of this trajectory for many (Savage, 2021). Second, a global development policy agenda emerged, which focused on policy-oriented approaches to address the observed trend towards greater inequality (Fukuda-Parr, 2019). Both trends in the literature are broadly

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interested in reducing inequality as a pathway towards greater social justice. However, empirical evidence—relevant for both for work on trends in inequality and that which seeks to intervene—remains limited particularly in regards to public perception. We know relatively little about how inequalities shape individuals perception of social justice and the key determinants of those views (Benson et al., 2021). This limited insight is increasingly relevant as several studies reveal clear social and political consequences of attitudinal responses to a drift away from social justice and inequality (Adriaans, 2023). That said, there is a welcome and emergent literature that has considered the determinant of welfare attitudes (Oorschot et al., 2022), attitudes towards income inequality (Clark & D’Ambrosio, 2015) and social justice (Adriaans & Fourré, 2022; Reyes & Gasparini, 2022; Steele & Breznau, 2019). This work adds an important dimension by considering multiple generations. The intention is to offer a key perspective that assesses the role of intergenerational mobility, specifically educational, using an international comparative approach.

Specifically, two main contributions result. First, the focus on intergenerational mobility provides a more complete understanding of the influence of social stratification by assessing social positions not only within but also across generations. Secondly, this approach also underlines the importance of education as a social process that goes beyond human capital acquisition, shaping perceptions and normative attitudes. In this sense, intergenerational mobility in educational attainment translates into more than a change in material conditions (i.e. occupation, income) but also a mechanism that shapes views on societal equity and social justice. What emerges is an approach driven by the following core research question:

Does the experience of upward, stable or downward mobility shape attitudes regarding the principles of social justice?

In subsequent sections, we briefly discuss previous studies about the impact of intergenerational educational mobility as well as research on determinants of attitudes towards social justice. This is followed by a description of the methods and data utilised in this analysis. Finally, we return to the question above when we report the main results underlining the research and policy implications of the findings.

2 Literature Review

Several works over the past decades provide evidence that one’s position within a stratified social order shapes their views about inequality, social justice and welfare (e.g. Alwin & Krosnick, 1991; Jasso, 2021; Rodon & Sanjaume-Calvet, 2020; Svallfors, 2012). The general conclusion is that individuals who share the same social position would also share a similar view about the prevailing socioeconomic order. But what happens when an individual changes their position within this stratified order? Under conditions of mobility, the link between social position and perception is less clear as it is determined by both one’s original and destination positions.

Education is an ideal process to investigate these questions as educational mobility is a widely validated measure of societal fluidity (Chevalier et al., 2009). For some, educational mobility is a subset of a broader process of social mobility, reflecting the idea that upward intergenerational mobility is reflective of a more equitable society where one’s social origins are less determinant of outcomes (Esping-Andersen, 2015; Hout & DiPrete, 2006). In addition, formal education institutions in contemporary European societies provide the

main space in which socialisation (i.e., the introduction of the rules/norms/expectations of society) occurs, which is a crucial dimension of attitudinal formation (Davis, 1982; Spruyt & Kuppens, 2015). Similarly, some studies have also pointed out the role of educational mobility on perception of social phenomena. For instance, educational attainment is seen as an important predictor for openness towards globalisation, but as Kunst et al. (2023) show using European Social Survey data, there is an enduring influence of parental educational level on the respondents' views. Using the same data, Creighton et al. (2022) found that upward educational mobility can moderate antipathy towards immigration. Gros (2003) shows that perceived inequality is determined by the educational system, which is shaped by social mobility. Some point out that education is no longer a clear engine of mobility (Brown, 2013), particularly in contexts where there is less mobility due to higher levels of schooling among the origin generation (i.e., parents) enabled by the rapid expansion of educational systems. In these contexts, education might not predict social position as much as it does in moments/context where the expansion of educational systems has been slower or more recent (Breen, 2010; Marshall & Swift, 1993).

Social mobility studies have mainly measured the perception of fairness of personal experience. For instance, individuals with similar educational backgrounds may hold different views about the fairness of their conditions based on their experiences of intergenerational educational mobility. Lavrijssen and Nicaise (2016) have demonstrated that educational mobility can predict individuals' perceptions of educational fairness. While studies often measure the level of fairness experienced by individuals, there is often a lack of understanding regarding what individuals actually mean by fairness or how they prefer to frame it. In fact, there has been limited exploration of the principles of fairness on redistributive policy (Rodon & Sanjaume-Calvet, 2020). Consequently, there is a need to place greater emphasis on the underlying principles of fairness that individuals utilize to frame their perspectives.

Educational mobility not only influences individuals' reflexive views based on their personal circumstances but also shapes their non-reflexive perceptions of fundamental normative principles regarding distributional justice. In highly stratified societies like the United States, Heiserman et al. (2020) found that perceived economic mobility shapes respondents' perception of fairness but not inequality. This suggests that in certain contexts, high social mobility can foster tolerance for inequality. Our perception of how society should allocate resources—to ourselves and others—is meaningful and plausibly determined by our own experience of mobility (Reyes & Gasparini, 2022). Voting behaviour also reflects divergent preferences for distributive policies depending on social mobility, as highlighted by Piketty (1995) and specifically on the direction of educational mobility, as noted by McNeil (McNeil, 2022). Torul, Oztunali, and Yildirim (2018) predicted preferences for distributive policies and found that individuals with lower educational mobility tend to favour the principle of equality less. They used single variable from European Values Survey (2018) on income level with the exclusive options.¹ However, it is important to recognize that conflicting perceptions regarding distributive principles can coexist within society (Rodon & Sanjaume-Calvet, 2020). To better capture this conflict, Hülle (2018) developed the Order-Related Justice Scale, which allows for a more nuanced understanding of individuals' preferences for redistributive principles. Despite these developments, the impact of educational mobility on perceptions of the fairness of distributive principles remains

¹ A 10-point scale was used, ranging from "Incomes should be made more equal" [1] to "There should be greater incentives for individual effort" [10].

largely unexplored. Therefore, there is a need for further research in this area to shed light on the role of educational mobility in shaping individuals' perspectives on the fairness of distributive principles.

3 Methods

3.1 Data

The analysis is based on the rotating module of the European Social Survey (ESS)² Round 9 on justice and fairness. The analytical sample of this study includes representative samples from all the 29 participating countries.³ Respondents who were still plausibly completing their formal education (i.e., aged 24 or younger) were excluded. This decision, which is common in the literature, is due to the need to maximally capture completed schooling and results in a final sample of 44,583 observations. For all variables that were used in this analysis, the proportion of missing values was lower than 5%. However, considering that we expect that missing values, particularly in relation to parental education, is affected by respondent characteristics (e.g. age, income), we replaced missing responses using an iterative multiple imputation method based on the random forest algorithm introduced by Stekhoven and Bühlmann (2012).⁴ The main tables of this paper are reproduced in the Appendix using a reduced sample from the original data after listwise deletion. Although some differences can be observed in the number of statistically significant effects comparing the imputed and the reduced sample, the results are consistent across methods.

3.2 Measuring Social Justice

The theoretical framework underlying the outcome of interest (i.e., social justice) emphasises the importance of an individuals' normative orientation in relation to how society *should* be organised in order to explain objective conditions of inequality and social justice (Hadler, 2005). Following this principle, Hülle et al. (2018) propose a quantitative assessment of these expectations termed the Basic Social Justice Orientations (BSJO). This is a scale that includes questions validated originally using a number of social surveys in Germany, which were later tested in the field in different European contexts (Adriaans, 2023; Van Hootegeem et al., 2021).

The BSJO is derived from a set of questions aimed at assessing the following four principles of social justice using a terminology of fairness:: i) the idea that everyone should receive the same in a society (equality) ii) the idea that benefits and responsibilities should be distributed according to individual investments (equity); iii) the idea that everyone

² The European Social Survey (ESS) is a biennial cross-national survey of attitudes and employs cross-sectional, probability samples that are representative of the population aged 15 and above living in private households in each country.

³ Austria, Belgium, Bulgaria, Switzerland, Cyprus, Czechia, Germany, Denmark, Estonia, Spain, Finland, France, United Kingdom, Croatia, Hungary, Ireland, Iceland, Italy, Lithuania, Latvia, Montenegro, Netherlands, Norway, Poland, Portugal, Serbia, Sweden, Slovenia, and Slovakia.

⁴ All imputation is done using the R Package 'MissRanger' (Mayer, 2023), which improves the computational performance of the algorithm and combines it with predictive mean matching avoiding the imputation of values that are not present in the observed data.

should get enough to cover basic needs; and iv) the idea that benefits or burdens should be allocated according to achieved status such as gender, education, occupation, or origin (entitlement) (Hülle et al., 2018). The support for these principles were evaluated through the level of agreement in relation to four statements that were preceded by the following question:

“There are many different views as to what makes a society fair or unfair. How much do you agree or disagree with each of the following statements?”⁵

The exact wording of the statements and their respective associated principles are shown in Table 1 and correspond directly to each of the four principles defined by Hülle et al. (2018). The result is a broad scale of perception of social justice built upon a foundation that uses the more approachable terminology of fairness.

3.3 Measuring Intergenerational Educational Mobility

International comparative work on education must overcome non-trivial, country-level variation in educational systems. The best approach is to rely on the International Standard Classification of Education (ISCED) (UNESCO Institute for Statistics, 2012), which is the approach taken in the ESS. However, instead of a direct replication of the ISCED levels that are intended for comparative work at a global scale, the ESS devises a scheme that is more nuanced and takes into account some of the unique features of the European context (Schneider, 2020). To facilitate comparability, the measure of education considers information on ‘programme orientation’, ‘programme duration’ and ‘order in the national degree and qualification structure’. At the same time, it reduces the number of ISCED levels as to aggregate levels for which the distinction is not relevant in contemporary Europe. An example of this is the combination of “less than primary education” and “primary education” into a single category. The result is a seven-level measure of attained education (*eisced*) that includes the following categories: (L1) less than lower secondary; (L2) lower secondary; (L3) lower tier upper secondary; (L4) upper tier upper secondary; (L5) advanced vocational, sub-degree; (L6) lower tertiary education, BA level; and (L7) higher tertiary education, > =MA level. This measure is available for both respondents and respondents’ parents. Of note, parental education refers to highest attained education as reported by the respondent. When relevant, the highest education among both parents is the one used.

The ESS-adapted ISCED measure of education offers a consistent and comparable measure for the the pooled sample of all countries. However, due to the relatively small sample sizes found within countries for some levels of schooling, the available scale was altered to allow for enough observations in each cell to permit the population of a mobility table. For all international comparative analysis, the educational attainment is captured by the following three categories: until lower secondary (L1 and L2); upper secondary (L3 and L4); and advanced vocational, lower and higher tertiary (L5, L6, L7). This default recoding of the educational variable was applied to 19 countries only.⁶

⁵ The responses were recorded through a 5-point agreement scale with the following options: “Agree strongly”, “Agree”, “Neither agree nor disagree”, “Disagree”, and “Disagree strongly”. The original scale was inverted so higher values denote higher level of agreement, ranging from 1 to 5.

⁶ Austria, Belgium, Bulgaria, Switzerland, Cyprus, Germany, Denmark, Finland, France, United Kingdom, Croatia, Hungary, Ireland, Lithuania, Montenegro, Netherlands, Poland, Serbia, and Slovenia.

Table 1 Wording of the outcome variables and respective social justice principle

Principle	Variable	Wording
Equality	Sofdst	A society is fair when income and wealth are equally distributed among all people
Equity	Softrwk	A society is fair when hard-working people earn more than others
Need	Sofrpr	A society is fair when it takes care of those who are poor and in need regardless of what they give back to society
Entitlement	Sofrprv	A society is fair when people from families with social status enjoy privileges in their lives between

The remaining 10 countries⁷ had their education variables recoded slightly differently to account for contextual factors, as the focus of the analysis is not comparing attainment but comparing mobility trajectories (i.e., the difference in attained education between respondents and their parents). In Italy, Portugal and Spain, for instance, the following three levels were created as more than half of the distribution for parental education is located at the lowest level: primary (L1); lower and upper secondary (L2, L3 L4); and advanced vocational, lower and higher tertiary (L5, L6, L7). One of the advantages of these three-level scales is that it provides separation for meaningful qualitative differences in completed schooling. For example, the upward mobility from secondary to tertiary education is qualitatively different than mobility within the secondary level (lower tier and upper tier), considering all the educational and cultural differences between secondary school and universities.

The result is measure of education that allows for respondents' own education to be directly compared to the generation prior (i.e., their parents) and the completed education of respondents' and their parents in other country contexts. This permits an internationally comparable measure of intergenerational educational mobility, which offers a unique opportunity to consider cross-country variation in family-level educational trajectories and, moreover, the link between these trajectories and the outcome of interest—social justice.

3.4 Sociodemographic and Socioeconomic Attributes of the Individual

Although observational data is limited, to better identify the role of the hypothetical explanatory mechanism of interest (i.e., intergenerational educational mobility), we take into consideration a number of empirically relevant sociodemographic and socioeconomic attributes of the individual such as age, gender and perception of household income. Previous studies have indicated that the sociodemographic attributes of gender and age are relevant variables to explain attitudes and perceptions about fairness and justice with women showing stronger support for principles related to equality and need and men supporting more principles of equity and entitlement (Adriaans & Targa, 2023; Hülle et al., 2018).

As for socioeconomic measures, we consider the current material conditions of respondents, which are one of the major influences for normative views about equality (Benson et al., 2021; Clark & D'Ambrosio, 2015). Although the ESS asks respondents their household income, there is a notably high proportion of missing values for this variable (*hinctnta*) with 23% of cases without a valid answer in the pooled sample, and up to 40% in countries like Italy and Hungary. Therefore, we used an attitudinal measure that provides a subjective assessment of the respondents' material circumstances. Participants were asked which of the following sentences best described their "feeling about their household income nowadays": "Living comfortably on present income", "Coping on present income", "Finding it difficult on present income", or "Finding it very difficult on present income". The result is, in some ways, more relevant for assessing perception of fairness as it offers a relative view—rather than an absolute measure of earned income—of socioeconomic wellbeing.

Of course, country contexts are different in more ways than can be observed by straightforward sociodemographic and socioeconomic measures of the individual. As the key explanatory measure (i.e., intergenerational educational mobility) is directly observed, we

⁷ Czechia, Estonia, Spain, Iceland, Italy, Latvia, Norway, Portugal, Sweden, and Slovakia.

Table 2 Wording of the outcome variables and respective social justice principle. *Source* European Social Survey (Round 9)

	Equality		Equity		Need		Entitlement	
	Mean	Std. Error	Mean	Std. Error	Mean	Std. Error	Mean	Std. Error
<i>Educ. attainment (Resp.)</i>								
L1	3.67	(0.01)	3.92	(0.01)	3.88	(0.01)	2.20	(0.01)
L2	3.51	(0.01)	4.01	(0.01)	3.89	(0.01)	2.13	(0.01)
L3	3.08	(0.01)	3.94	(0.01)	3.92	(0.01)	2.09	(0.01)
<i>Educ. attainment (Parent.)</i>								
L1	3.58	(0.01)	3.96	(0.01)	3.87	(0.01)	2.12	(0.01)
L2	3.34	(0.01)	3.99	(0.01)	3.90	(0.01)	2.15	(0.01)
L3	3.07	(0.01)	3.95	(0.01)	3.94	(0.01)	2.14	(0.01)
<i>Mobility direction</i>								
Downward	3.36	(0.02)	3.99	(0.01)	3.91	(0.01)	2.30	(0.02)
Nonmobile	3.41	(0.01)	3.95	(0.01)	3.90	(0.01)	2.14	(0.01)
Upward	3.39	(0.01)	3.98	(0.01)	3.89	(0.01)	2.08	(0.01)
<i>Age group</i>								
25–44	3.33	(0.01)	3.95	(0.01)	3.86	(0.01)	2.17	(0.01)
45–64	3.39	(0.01)	3.97	(0.01)	3.91	(0.01)	2.10	(0.01)
65+	3.48	(0.01)	3.99	(0.01)	3.92	(0.01)	2.13	(0.01)
<i>Gender</i>								
Female	3.44	(0.01)	3.93	(0.01)	3.89	(0.01)	2.14	(0.01)
Male	3.35	(0.01)	4.00	(0.01)	3.90	(0.01)	2.13	(0.01)
<i>Feeling about income</i>								
Very difficult	3.80	(0.02)	3.95	(0.02)	4.02	(0.02)	2.12	(0.02)
Difficult	3.72	(0.01)	3.94	(0.01)	3.91	(0.01)	2.09	(0.01)
Coping	3.46	(0.01)	3.96	(0.01)	3.85	(0.01)	2.15	(0.01)
Living comfortably	3.08	(0.01)	3.98	(0.01)	3.93	(0.01)	2.13	(0.01)
Full sample	3.40	(0.01)	3.96	(0)	3.89	(0)	2.13	(0)

elected to account for between country differences for all 29 participating countries using country fixed effects (Allison, 2009).

Table 2 shows the mean values and standard error of the outcome variable by selected covariates. As alluded to in the section describing the intergenerational educational mobility, the three-level measure of education of in Table 2 was used for the analysis by country. The analysis of the pooled sample, which included all 29 countries used the original 7-level scale (*eisced*).

A few points stand out from the descriptive statistics presented in Table 2. First, there is clearly less overall support for the principle of Entitlement and stronger support for the principle of Equity, which goes in the same direction of a pattern observed elsewhere (e.g., Adriaans et al., 2020). Second, the sociodemographic and socioeconomic attributes match their expected relationship to the four measures of social justice. For instance, women tend to give more emphasis to the principle of Equality whereas men tend to emphasise Equity. In addition, older respondents and those with worse economic conditions tend to support the principle of Equality more compared to younger respondents and those with better economic conditions, respectively. Finally, in relation to the targeted explanatory mechanism

(i.e., intergenerational educational mobility), there is a higher support for Equality among those with lower educational attainment and also those whose parents also have lower educational attainment. In terms of mobility, more mobile respondents present lower average support for the principle of Equality compared to nonmobile ones. These descriptive trends are limited in the extent to which they can be interpreted. To offer greater precision and clearer tests of difference, we turn to a multivariate approach.

3.5 Mobility Contrast Model (MCM)

An interest in mobility—both occupational and educational—is not new. Initial strategies to investigate the effect of social mobility on social outcomes compared the average values in outcomes of interest between mobile and non-mobile individuals. However, as initially argued by Duncan (2018), mobility is a dynamic process that involves both origin status (e.g., parental education) and a destination status (e.g., one's own education), which should not be considered independently. To jointly account for origin and destination status, the most common approach to date is the Diagonal Mobility Model (DMM), which is sometimes referred to as the Diagonal Reference Model (DRM), which emerged in the 1980s (Sobel, 1981, 1985). The innovation of the model is the possibility of separating the role of mobility from that of the origin and destination statuses and, as such, the DMM enjoys widespread usage in the literature on social, educational, and occupational stratification (Creighton et al., 2022; e.g., Zang et al., 2023).

However, as demonstrated by Luo (2022), DMMs can be limited in two ways. First, the accuracy of the estimation is affected in cases where there is a significant proportion of mobile individuals. Because the model relies on the observed values of the non-mobile individuals as reference, which constitutes the diagonal in the underlying mobility table, too much mobility can make the reference unreliable. In our pooled sample, about two thirds of the respondents are mobile, which is a cause for concern. Secondly, although DMMs provide a parsimonious and insightful estimate to evaluate importance/weight of origin and destination education in its equation, they do not discriminate between heterogeneous effects of mobility, which can result from the direction of the move (upward vs. downward) or range of the mobility, defined by the number of levels between origin and destination.

To deal with these methodological concerns, we adopted a more recent approach called Mobility Contrast Model (MCM), which was recently developed by Luo (2022). If the mobility effects are similar among mobility groups, both the DMM and the MCM should provide similar results. However, we expect to observe different effects on social justice attitudes depending on the direction and range of mobility, as indicated in the descriptive statistics in Table 2. In this sense, the MCM is the preferred approach as it addresses our concerns regarding the heterogeneous effects in two ways.

First, this new approach extends the traditional mobility models by making it possible to estimate different effect sizes and/or effects that occur in opposite directions for each cell of the mobility table. This is done by running a set of interactions between the origin and destination status. The DMM, on the other hand, summarises these effects into one estimate, which can be problematic considering the exploratory nature of our study. For instance, one could expect that a respondent who completed tertiary level education whose parents did not complete primary education may have different views about social justice in comparison to another respondent who also experience upward mobility but whose parents completed secondary school.

In addition, by providing estimates based on a set of interactions between origin and destination status, as opposed to the DMM in which the diagonal values are used as reference, the MCM provides improved and more comparable estimates to large-scale intergenerational mobility, which is relevant for our study where substantial mobility is found across more than 40,000 observations.

4 Results

As alluded before, the analysis involves two sequential steps. The first comprises the estimation of mobility effects on the four outcome variables using the pooled sample, which includes the samples from all 29 participating countries. The second analyses the sample from each country separately. The model specification and covariates are the same for both analyses, with the exception of the change in the measure of intergenerational educational mobility, which is described in more detail in Sect. 3.3.

4.1 Mobility Effects (All Countries)

Table 3 reports the estimates, as coefficients in a mobility table, for the pooled model that includes samples from all 29 countries. The first clear result is that there are notable differences in the relationship between intergenerational educational mobility and attitudes towards social justice depending on the principle being assessed—Equity vs. Equality vs. Need vs. Entitlement. That said, some general patterns emerge. For example, with few exceptions, no mobility path is a significant predictor of support for the principles of Equity, Need or Entitlement. The only prominent exception is for downward mobility and Need, where a trajectory that moves from the highest level of completed education for the parent (i.e., Level 7) to a lower level (i.e., Level 3) for the respondent significantly predicts greater support. An effect in a similar magnitude is also detected for another downward trajectory in the same principle (from Level 5 to Level 2).

The principle of Equality stands out as the analysis provides evidence that intergenerational educational mobility has a meaningful and significant association. The strongest relationship is found among those who finished the Level 6 and whose parents completed either the lowest educational level ($\beta=0.226$, $p<0.01$), or the second lowest level ($\beta=0.224$, $p<0.05$). These are individuals experiencing a notably high level of upward intergenerational educational mobility. The observed increase in the effect size (from L5 to L6) also suggests that greater upward mobility results in increasing support for the principle of Equality. No significant downward mobility effects were detected in the model.

Although not reported in Table 3, it is worth noting that the sociodemographic and socioeconomic measures follow the pattern first observed in the descriptive statistics in Table 2. For example, women tend to support the principle of Equality more ($\beta=0.039$, $p<0.001$) and the principle of Equity less ($\beta=-0.037$, $p<0.001$) compared to men. For the other two measures of social justice (i.e., Need and Entitlement), no meaningful relationship was observed. Those with a worse perception of socioeconomic conditions also report, on average, greater support for both the principle of Equality and Need. Older respondents support the principle of Equity and Need more than younger respondents, and support less the principle of Entitlement.

For the direct association between educational attainment—of the parent and respondent—and social justice, only two levels for the principle of Equality indicate a significant

Table 3 Mobility effects for each justice principle. *Source* European social survey (Round 9)

Parental educ. level	Respondents' educational level						
	L1	L2	L3	L4	L5	L6	L7
<i>Equality</i>							
L1	–	–0.014	0.03	0.163	0.223*	0.224*	0.026
L2	–0.052	–	0.108	0.079	0.168*	0.226**	0.147
L3	–0.126	–0.024	–	0.005	–0.057	–0.139	–0.022
L4	–0.127	–0.068	0.028	–	–0.095	–0.064	–0.008
L5	0.265	0.208	–0.045	–0.084	–	–0.102	0.052
L6	0.12	0.089	–0.045	–0.064	–0.121	–	–0.107
L7	0.009	–0.103	0.011	–0.011	–0.031	–0.058	–
<i>Equity</i>							
L1	–	–0.145	–0.142	–0.218*	–0.165	–0.132	–0.133
L2	–0.117	–	0.005	0.072	0.101	0.042	0.036
L3	0.012	0.026	–	–0.04	0.051	0.02	–0.068
L4	0.133	–0.081	–0.031	–	–0.035	–0.013	0.077
L5	–0.121	–0.024	0.037	0.168**	–	–0.035	0.002
L6	0.082	0.087	0.078	–0.033	–0.022	–	0.021
L7	–0.053	0.072	–0.012	–0.013	0.005	0.053	–
<i>Need</i>							
L1	–	–0.014	–0.076	0.006	–0.051	–0.015	–0.114
L2	–0.253	–	–0.055	0.004	0.005	0.003	0.003
L3	0.118	–0.08	–	–0.051	0.014	–0.028	0.028
L4	–0.128	0.021	–0.004	–	0.047	–0.023	0.001
L5	0.032	0.19*	0.039	0.087	–	0.034	0.089
L6	0.147	0.002	–0.115	–0.099	0.106	–	–0.01
L7	0.081	–0.122	0.208**	0.05	–0.124	0.027	–
<i>Entitlement</i>							
L1	–	0.025	0.109	0.03	0.111	0.185	0.104
L2	–0.077	–	0.001	–0.09	0.032	0.049	–0.022
L3	0.172	–0.001	–	–0.099	–0.068	–0.029	–0.079
L4	0.016	0.034	0.061	–	0.02	–0.051	0.118*
L5	0.015	0.04	0.116	0.155	–	–0.002	0.081
L6	0.231	–0.015	–0.118	–0.048	–0.032	–	–0.151*
L7	–0.306	–0.032	–0.117	0.103	–0.01	–0.1	–

* $p < .05$, ** $p < .01$, *** $p < .001$

difference compared to the other levels. Specifically, respondents whose parents had less than a lower secondary degree tend to support the principle of equality more compared to respondents whose parents had a master or doctoral degree ($\beta = 0.119$, $p < 0.001$). Regarding respondents' own educational attainment, no clear pattern was observed across the principles of Equity, Need and Entitlement. However, for the principle of Equality, those with an educational attainment lower than upper secondary, tend to support this principle more compared to those with master and doctoral degree. Furthermore, those with

post-secondary vocational education and bachelor's degree are predicted to show lower support for Equality compared to those with the highest level of educational attainment. The complete model, including estimates for all included sociodemographic and socioeconomic measures, is shown in the Appendix.

Overall, the estimates generated by the MCM for the pooled sample offer two important insights in relation to our research question. First and foremost, we find evidence that individuals who experienced upward mobility show stronger support for general principle that *everyone should receive the same in a society*. Considering the large sample size, the absence of significant effects for the other three social justice principles assessed in this study is also meaningful, indicating that educational mobility affects the views on Equality, but not necessarily views on Equity, Need, or Entitlement.

Finally, the MCM allows us to compare the effects between different paths of mobility. If we look at the model for the principle of Equality, mid-to-high upward mobility emerges as the type of mobility that is associated with the principle of equality. No significant effects were found for either the highest or short paths of upward mobility. This suggests that views on equality are influenced only by significantly different educational experiences (e.g., completing a bachelor's degree with parents who finished primary school) but not completely different (such as having doctoral degree and having a parent without primary level education).

4.2 Mobility Effects (By Country)

Let's consider the general pattern in the analysis of the pooled sample. Those whose origins lie in the lowest levels, and destination in the mid to highest levels, were shown to have a meaningfully greater support that society should be defined by greater social equality (see Sect. 3.2). The within-country models depicted in Fig. 1 indicate that a pattern similar to that observed for the pooled models (Table 3) can be observed in Bulgaria (BG), France (FR) or Germany (DE), where maximum upward mobility (i.e., Level 1 to Level 3) is associated with an additional 0.3, 0.3 and 0.4 units in the scale of Equality respectively ($p < 0.05$, $p < 0.05$ and $p < 0.01$). Interestingly, the opposite mobility trajectory (downward mobility from Level 3 to Level 1) is also associated with a stronger support for Equality both in Bulgaria ($p < 0.001$) and Germany ($p < 0.05$). This supports the idea that mobility, regardless of the direction, plays an influential role in views about the social principle of Equality. In this sense, individuals in these countries who experience, either through their background or current situation, a different status put more emphasis on Equality, following the hypothesis of empathy as an antecedent of social justice attitudes (Cartabuke et al, 2019).

However, not all countries match the general pattern in Europe observed in the pooled sample. In two cases, Sweden (SE) and Slovakia (SK), upward mobility from Level 1 to Level 2 or Level 3, is associated with lower support for Equality. This shows a notable country-level difference in relation to the effects of mobility on support for Equality that would be unobserved in the pooled model with country fixed effects. In addition, the cases from three Balkan countries in this model present evidence on the qualitative differences between mobility groups. In Croatia (HR), for instance, significant effects were found only for groups with one-step mobility—downward and upward—whereas no significant relationship was found across groups with greater intergenerational mobility (i.e., a change in two levels). Montenegro (ME) and Serbia (RS), on the other hand, present an equivalent pattern of downward mobility. Respondents from these countries who experienced mobility

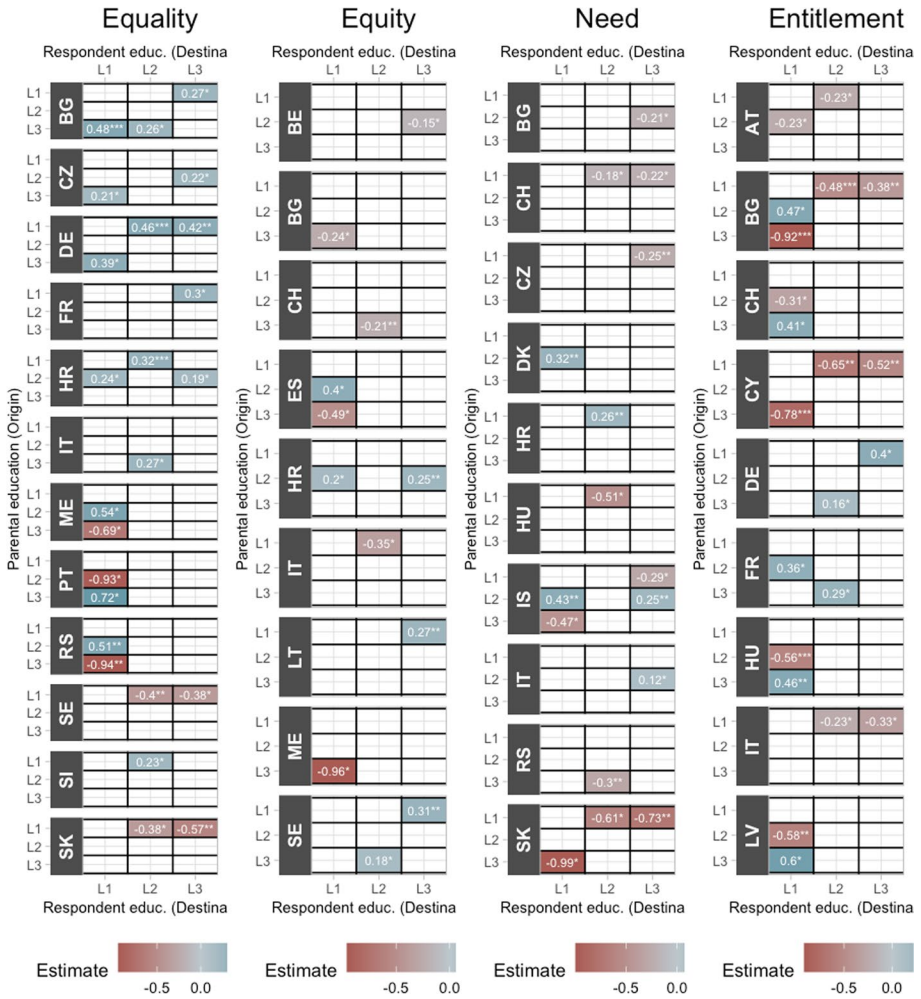


Fig. 1 Mobility effects for each justice principle by country. *Source* European social survey (Round 9). *Notes* * $p < .05$, ** $p < .01$, *** $p < .001$

from Level 2 to Level 1 (one step) show significantly higher support for Equality, whereas those who moved from Level 3 to Level 1 (two steps) show significantly lower support.

For the principles of Equity and Need, there are divergent mobility effects across countries, but the direction of the effect seems consistent within countries. Taking these two models together, we found 11 countries where mobility predicts exclusively lower support for the principle, and 6 countries where mobility predicts exclusively greater support. Only in 2 countries (Spain and Iceland) both negative and positive mobility effects were detected.

Finally, the model for principle of Need suggests a different pattern compared to the models of the other three principles in one aspect. Whereas for the other principles the significant mobility effects are roughly balanced between downward and upward trajectories, the effects of mobility on support for Entitlement seems to be concentrated in the

downward trajectory (12 cells) as opposed to the upward trajectory (6 cells). The samples from 7 countries⁸ out of a total of 29 participating countries, did not indicate any statistically significant mobility effect.⁹ Figure 1 shows the coefficients of the mobility effects for all the remaining countries.

As expected, the analysis by country points to a more nuanced and complex view of the relationship between intergenerational educational mobility and attitudes towards social justice. Any attempt to explain findings for a single country would require a further examination of social processes that lie beyond the scope of this work. However, this analysis by country is relevant insofar that it reveals a general pattern for the principle of Equality and reinforces the hypothesized qualitative differences between distinct mobility paths.

5 Discussion

The book 'Normal People' by Sally Rooney (2018) offers a literary portrayal of the social phenomenon observed in this study. Connel, one of the main characters, comes from a working-class family in the country side and is admitted to study in a prestigious university in the capital. The story develops around his relationship with Marianne, who is also studying at the same university and is from a wealthy background with her mother being the employer of Connel's mother. In a passage of the book, they are having a coffee together after receiving the news that both of them got a scholarship, but one of Marianne's friend did not get it. After a discussion about merit that exposed different views on who deserves scholarships and why, Connel suggests that their views differ due to their trajectories: "I guess we're from very different backgrounds" (Rooney, 2018, p. 123).

The theme of a relationship across different social classes is surely not new. But this story in particular unveils subtleties about two individuals who had similar formal education (studying in the same secondary school and university) but whose parents had different educational and social experiences and how this affects their views of society, and which distributive justice principle is fair.

Does education make any difference in the perception of distributive justice? The idea that the ethical norms and values instilled through education can act as a counterbalance to the profit-driven dynamics inherent in capitalist systems as suggested by Durkheim first, in his seminal works *Professional Ethics and Civic Morals* (2013) in late nineteenth century. He distinguished professions that come with education from occupations. Formal structures such as educational institutions would determine individual behaviour. Veblen (1921) in his work "The Engineers and The Price System," also associated professions required education with ethics. He contended that the professional ethic embodies a commitment to advancing human knowledge and creativity, standing in stark contrast to the profit-oriented motives that often characterize capitalist pursuits. Their positive attribution to education as an autonomous variable has been criticized especially after the reactionary modernism that took place under the control of Nazi governance (Herf, 1984).

The effect of education on norms requires a more relational aspect. Educational mobility allows us to expand our understanding. How educational mobility predicts the perception of educational fairness is examined (Lavrijsen & Nicaise 2016). However, the role of

⁸ Estonia, Finland, United Kingdom, Ireland, Netherlands, Norway, and Poland.

⁹ Of note, the Appendix presents the coefficients for the mobility effects across all countries and outcomes for all variables included in the models.

educational mobility on the perception of fairness of distributive policies remains largely unexplored. The analysis presented in this work offers empirical evidence about the influence of those educational trajectories. After assessing the relationship between intergenerational educational mobility and support for different Social Justice principles in 29 European countries, we found that upward mobility is associated with higher support for the idea that a society is fair when income and wealth are equally distributed among all people.

To put this in perspective it is helpful to return to the initial research question—Does the experience of upward, stable or downward mobility shape attitudes regarding the principles of social justice? The answer is definitively yes, but the nuance is important. Our analysis shows that different combinations of origin and destination levels of education enable people to engage with different perceptions of distributive justice. This also proves that educational mobility of any kind does not always lead to a particular ideology and invites other types of variables about social origin to understand the difference between different types of educational mobilities.

First, mobility is not universally relevant for our perception of fairness. Equity, Need, and Entitlement—all meaningful dimensions of social justice—indicated little direct association with the pattern of mobility overall and within countries. In other words, social justice is perhaps too broad a concept to definitively link to educational mobility in Europe. It would be worth exploring other dimensions of mobility (e.g., occupational) to draw a clearer picture of the overall link between mobility and social justice. This heterogeneous pattern, which is observed across dimensions of social justice and country contexts, underlines the methodological contribution of the work.

The difference in the level of intergenerational mobility may lead to different results in the perception of distributive justice. Clark and D'Angelo (2010) concluded in their study that upwardly mobile people based on Goldthorpe's class category (Goldthorpe et al., 1987) tend to support egalitarian distributive policies, however, they also find that in contexts where social mobility is too high, people are less supportive of re-distribution. Similarly, other work has found that those with higher income are less supportive of social justice and redistribution (Hülle et al., 2018). Our analysis contributes to mobility discussions by addressing the level of intergenerational educational mobility and its relationship to perception of justice. Specifically, the Mobility Contrast Model (MCM) permits different associations between perception of distinct dimensions of social justice and educational mobility depending on the direction and range of the observed mobility. This approach proved useful as the results indicate that the direction and degree of mobility (i.e., the distance between origin and destination educational attainment) mattered. Other widely used approaches such as the Diagonal Mobility Model (DMM) do not offer variation in the estimates by distinct mobility trajectories to emerge.

What determines mobility has also an affect on perception. Mobility would be predicted not by individual effort but by the competition for better social or economic positions (Brown, 2013). The opportunities that education brings might be limited by a phenomenon labelled the “opportunity trap” (Brown, 2003) where educational attainment increases, but does not translate into social mobility in terms of class (Blanden & Macmillan, 2016; Chevalier et al., 2003; Chow & Guppy, 2021). More recent work in Spain has pointed out that social origins can directly determine success in the labour market, defined by low-education children with high-education parents being more successful than less advantaged peers in attaining managerial roles (Bernardi and Gil-Hernández 2021). This work builds on a larger base of research on the direct effect of social origins (e.g., Torche, 2011; Bernardi and Ballarino, 2016; Laurison and Friedman, 2016; Gugushvili, Bukodi and Goldthorpe, 2017; Fiel, 2020).

Further study would require a focus on the relationship between educational mobility, other mobility types (income, class, occupation), indicators of inequality in the context and their effects on welfare attitudes to be able to capture the strength/weakness of educational institutions to transmit certain approaches about social order. The quality of education is another variable related to the formation of perception as the inequalities in income (e.g., Lee & Lee, 2021) and the level of educational investment that is dependent upon income level (e.g., Hassler et al., 2007) have been shown to have an effect on educational level and quality of education.

Although this work is an important step toward introducing mobility into our understanding of social justice—or at least how social justice is perceived—there are a number of limitations that deserve mention. First, upward mobility for education is constrained by an identifiable ceiling. In short, once the origin generation reaches tertiary schooling, the destination generation, at best, can reproduce the attainment of their parents. Of course, one could explore school quality or prestige, but an attainment-based mobility approach does not offer that sort of insight. Second, education is only an imperfect proxy for socialization into distinct views of social justice, defined by the measures of fairness included in this work. There are limits to assuming uniformity in experience across such diverse country settings and the variation in the country-specific models suggest that within-country differences matter. Third, the origin/parental education is measured using the recall of the respondent (i.e., the destination). The question is reasonable, and recall would plausibly be quite good, but the measure does not indicate influence so the role of the most educated parent is never made explicit.

Overall, we consider this work to clearly show the relevance and importance of using flexible and powerful models to assess the role of educational mobility on four indicators of social justice. Despite the limitations, the general patterns that some dimensions of social justice are linked to mobility patterns, particularly when economic factors are taken into account. To the extent that how fair society is perceived is relevant, understanding the opportunities for intergenerational educational mobility can lead to a more positive view of social justice more broadly in a society is a valuable lesson.

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Data Availability and Code Availability All analyses are fully reproducible using the dataset and code available at this repository: https://github.com/danielcapistrano/cci_edmobility

Declarations

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References

- Adriaans, J. (2023). Fairness of earnings in Europe: The consequences of unfair under- and overreward for life satisfaction. *European Sociological Review*, 39(1), 118–131. <https://doi.org/10.1093/esr/jcac044>
- Adriaans, J., & Fourré, M. (2022). Basic social justice orientations—measuring order-related justice in the European Social Survey Round 9. *Measurement Instruments for the Social Sciences*, 4(1), 11. <https://doi.org/10.1186/s42409-022-00040-3>
- Adriaans, J., & Targa, M. (2023). Gender differences in fairness evaluations of own earnings in 28 European countries. *European Societies*, 25(1), 107–131. <https://doi.org/10.1080/14616696.2022.2083651>
- Adriaans, J., Bohmann, S., Targa, M., Liebig, S., Hinz, T., Jasso, G., Kittel, B., & Sabbagh, C. (2020). *Justice and fairness in europe: Topline results from round 9 of the european social survey*. 10. https://www.europeansocialsurvey.org/docs/findings/ESS9_toplines_issue_10_fairness.pdf
- Allison, P. D. (2009). *Fixed Effects Regression Models*. SAGE Publications, Inc. <https://doi.org/10.4135/9781412993869>
- Alwin, D. F., & Krosnick, J. A. (1991). Aging, cohorts, and the stability of sociopolitical orientations over the life span. *American Journal of Sociology*, 97(1), 169–195. <https://doi.org/10.1086/229744>
- Benson, R., Duffy, B., Hesketh, R., & Hewlett, K. (2021). *Attitudes to inequalities: The IFS deaton review*. <https://ifs.org.uk/inequality/wp-content/uploads/2021/09/Attitudes-to-inequalities.pdf>
- Breen, R. (2010). Educational expansion and social mobility in the 20th century. *Social Forces*, 89(2), 365–388. <https://doi.org/10.1353/sof.2010.0076>
- Brown, P. (2013). Education, opportunity and the prospects for social mobility. *British Journal of Sociology of Education*, 34(5–6), 678–700. <https://doi.org/10.1080/01425692.2013.816036>
- Cartabuke, M., Westerman, J. W., Bergman, J. Z., Whitaker, B. G., Westerman, J., & Beekun, R. I. (2019). Empathy as an antecedent of social justice attitudes and perceptions. *Journal of Business Ethics*, 157(3), 605–615. <https://doi.org/10.1007/s10551-017-3677-1>
- Chevalier, A., Denny, K., & McMahon, D. (2009). A Multi-country Study of Inter-generational Educational Mobility. In P. Dolton, R. Asplund, & E. Barth (Eds.), *Education and Inequality Across Europe* (pp. 260–281). Edward Elgar Publishing. <https://doi.org/10.4337/9781035305582.00020>
- Clark, A. E., & D'Ambrosio, C. (2015). Attitudes to Income Inequality. In *Handbook of Income Distribution* (Vol. 2, pp. 1147–1208). Elsevier. <https://doi.org/10.1016/B978-0-444-59428-0.00014-X>
- Creighton, M. J., Capistrano, D., & Da Silva Pedrosa, M. (2022). Educational mobility and attitudes towards migration from an international comparative perspective. *Journal of International Migration and Integration*. <https://doi.org/10.1007/s12134-022-00977-8>
- Davis, J. A. (1982). Achievement variables and class cultures: Family, schooling, job, and forty-nine dependent variables in the cumulative GSS. *American Sociological Review*, 47(5), 569–586. <https://doi.org/10.2307/2095159>
- Duncan, O. D. (2018). Methodological Issues in the Analysis of Social Mobility. In S. Lipset (Ed.), *Social Structure and Mobility in Economic Development*. Routledge. <https://doi.org/10.4324/9781351306249>
- Esping-Andersen, G. (2015). Welfare regimes and social stratification. *Journal of European Social Policy*, 25(1), 124–134. <https://doi.org/10.1177/0958928714556976>
- European Social Survey. (2018). *ESS Round 9 Module on Justice and Fairness—Question Design Final Module in Template*. ESS ERIC Headquarters c/o City, University of London. https://www.europeansocialsurvey.org/docs/round9/questionnaire/ESS9_justice_final_module_template.pdf
- Fukuda-Parr, S. (2019). Keeping out extreme inequality from the SDG agenda—the politics of indicators. *Global Policy*, 10(S1), 61–69. <https://doi.org/10.1111/1758-5899.12602>
- Groß, M. (2003). Educational systems and perceived social inequality. *European Societies*, 5(2), 193–225. <https://doi.org/10.1080/1461669032000076892>
- Hadler, M. (2005). Why do people accept different income ratios?: a multi-level comparison of thirty countries. *Acta Sociologica*, 48(2), 131–154. <https://doi.org/10.1177/0001699305053768>
- Heiserman, N., Simpson, B., & Willer, R. (2020). Judgments of economic fairness are based more on perceived economic mobility than perceived inequality. *Socius*, 6, 2378023120959547. <https://doi.org/10.1177/2378023120959547>
- Herf, J. (1984). The engineer as ideologue: Reactionary modernists in Weimar and Nazi Germany. *Journal of Contemporary History*, 19, 631–648. <https://doi.org/10.1177/002200948401900403>
- Hout, M., & DiPrete, T. A. (2006). What we have learned: RC28's contributions to knowledge about social stratification. *Research in Social Stratification and Mobility*, 24(1), 1–20. <https://doi.org/10.1016/j.rssm.2005.10.001>
- Hülle, S., Liebig, S., & May, M. J. (2018). Measuring Attitudes toward distributive justice: The basic social justice orientations scale. *Social Indicators Research*, 136(2), 663–692. <https://doi.org/10.1007/s11205-017-1580-x>

- Jasso, G. (2021). New results linking inequality and justice. *The Journal of Mathematical Sociology*, 45(1), 1–21. <https://doi.org/10.1080/0022250X.2020.1715970>
- Kunst, S., Kuhn, T., & van de Werfhorst, H. G. (2023). As the twig is bent, the tree is inclined? The role of parental versus own education for openness towards globalisation. *European Union Politics*, 24(2), 264–285. <https://doi.org/10.1177/14651165221140230>
- Luo, L. (2022). Heterogeneous effects of intergenerational social mobility: An improved method and new evidence. *American Sociological Review*, 87(1), 143–173. <https://doi.org/10.1177/00031224211052028>
- Marshall, G., & Swift, A. (1993). Social-class and social-justice. *British Journal of Sociology*, 44(2), 187–211. <https://doi.org/10.2307/591217>
- Mayer, M. (2023). *missRanger: Fast imputation of missing values* [Manual]. <https://CRAN.R-project.org/package=missRanger>
- McNeil, A. (2022). *Intergenerational social mobility and anti-system support: The journey matters* (No. 75). International Inequalities Institute, London School of Economics; Political Science. eprints.lse.ac.uk/113496/
- Oorschot, W. van, Laenen, T., Roosma, F., & Meuleman, B. (2022). Recent advances in understanding welfare attitudes in Europe. In *Social Policy in Changing European Societies* (pp. 202–217). Edward Elgar Publishing. <https://www.elgaronline.com/display/book/9781802201710/book-part-9781802201710-21.xml>
- Piketty, T. (1995). Social mobility and redistributive politics. *The Quarterly Journal of Economics*, 110(3), 551–584. <https://doi.org/10.2307/2946692>
- Reyes, G., & Gasparini, L. (2022). Are fairness perceptions shaped by income inequality? Evidence from Latin America. *The Journal of Economic Inequality*, 20(4), 893–913. <https://doi.org/10.1007/s10888-022-09526-w>
- Rodon, T., & Sanjaume-Calvet, M. (2020). How Fair Is It? An experimental study of perceived fairness of distributive policies. *The Journal of Politics*, 82(1), 384–391. <https://doi.org/10.1086/706053>
- Rooney, S. (2018). *Normal people*. Faber & Faber.
- Savage, M. (2021). *The return of inequality: Social change and the weight of the past*. Harvard University Press.
- Schneider, S. L. (2020). *Guidelines for the measurement of educational attainment in the European Social Survey*. GESIS. https://www.europeansocialsurvey.org/docs/methodology/ESS_guidelines_for_the_measurement_of_educational_attainment_ed2.pdf
- Sobel, M. E. (1981). Diagonal mobility models: A substantively motivated class of designs for the analysis of mobility effects. *American Sociological Review*, 46(6), 893–906. <https://doi.org/10.2307/2095086>
- Sobel, M. E. (1985). Social mobility and fertility revisited: Some new models for the analysis of the mobility effects hypothesis. *American Sociological Review*, 50(5), 699–712. <https://doi.org/10.2307/2095383>
- Spruyt, B., & Kuppens, T. (2015). Education-based thinking and acting? Towards an identity perspective for studying education differentials in public opinion and political participation. *European Journal of Cultural and Political Sociology*, 2(3–4), 291–312. <https://doi.org/10.1080/23254823.2016.1150689>
- Steele, L. G., & Breznau, N. (2019). Attitudes toward redistributive policy: An Introduction. *Societies*, 9(3), 50. <https://doi.org/10.3390/soc9030050>
- Stekhoven, D. J., & Bühlmann, P. (2012). MissForest—non-parametric missing value imputation for mixed-type data. *Bioinformatics*, 28(1), 112–118. <https://doi.org/10.1093/bioinformatics/btr597>
- Svallfors, S. (Ed.). (2012). *Contested Welfare States: Welfare Attitudes in Europe and Beyond*. Stanford University Press. <https://doi.org/10.11126/stanford/9780804782524.001.0001>
- Torul, O., Oztunali, O., & Yildirim, U. S. (2018). Intergenerational Educational Mobility and Preferences for Redistribution in Europe. *Working Papers*. <https://ideas.repec.org/p/bou/wpaper/2018-07.html>
- Turner, B. S., & Durkheim, E. (2013). *Professional ethics and civic morals*. Routledge.
- UNESCO Institute for Statistics. (2012). *International standard classification of education: ISCED 2011*. UNESCO Institute for Statistics. <http://www.uis.unesco.org/Education/Documents/isced-2011-en.pdf>
- Van Hootegem, A., Meuleman, B., & Abts, K. (2021). Measuring public support for distributive justice principles: Assessing the measurement quality of the basic social justice orientations scale. *International Journal of Public Opinion Research*, 33(4), 986–997. <https://doi.org/10.1093/ijpor/edaa041>
- Veblen, T. (1921). *The Engineers and The Price System*. Viking.
- Zang, E., Sobel, M. E., & Luo, L. (2023). The mobility effects hypothesis: Methods and applications. *Social Science Research*, 110, 102818. <https://doi.org/10.1016/j.ssresearch.2022.102818>

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