# Egocentric Norm Adoption\*

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#### Abstract

Social norms pervade human behavior, but the importance of any norm is usually open to interpretation. This paper provides experimental evidence showing that people perceive the relevance of norms egocentrically: they believe in norms that are good for them in the sense that they would personally profit from these norms if everybody adhered to them. Many previous experiments have studied conflicting norms and have shown that people favor principles that allow them to be selfish. This paper also presents a (virtual) laboratory experiment in which subjects face conflicting norms. However, they decide over others instead of themselves, while their own payoffs depend on further participants' choices in the same decision contexts. Despite the absence of any personal motives, subjects deciding over others rely more intensively on normative principles that align with their own interests. Afterward, we ask subjects to predict the decisions of others, who might have different interests. Beliefs display the same kind of bias as found for decisions, pointing towards an unconscious mechanism. Survey answers provide further support for the importance of egocentrism: subjects who report pronounced perspective-taking are less biased.

Keywords: egocentrism, experiment, fairness, social norms

**JEL codes:** C91, D63, D91, Z13

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## 1 Introduction

When do people consider certain social norms to be important and adopt them as part of their behavior? Answering this question is instrumental in predicting choices, understanding how social norms evolve, and designing institutions. In fact, important social phenomena can often not be explained by pure self-interest, such as donations, volunteering, and honesty. Ample experimental evidence has confirmed the presence of these behaviors in non-strategic settings, such as giving in the dictator game, contributions in the public goods game, and honesty at a monetary cost (Fischbacher and Föllmi-Heusi, 2013). Social norms, defined by Ostrom (2000) as "shared understandings about actions that are obligatory, permitted, or forbidden" (pp. 143), are a widely used explanation for such behaviors (López-Pérez, 2008; Kessler and Leider, 2012; Kimbrough and Vostroknutov, 2016). The literature on strong reciprocity (Fehr and Gächter, 2000; Falk and Fischbacher, 2006) has extensively studied how people enforce social norms by rewarding behavior that complies with social norms and punishing behavior that violates them, even if this is costly (Fehr and Gächter, 2000). Other work has explored the precise nature of what people consider to be fair (Konow, 2003), e.g., contrasting egalitarians and libertarians (Cappelen et al., 2007).

Our paper is concerned with when and why people consider certain norms important. The leading explanation is evolution through selection by fitness, i.e., reproductive success (Becker, 1976; Güth and Kliemt, 1998), or imitation of successful others (Sugden, 1989; Richerson and Boyd, 2005). An example of such cultural evolution is that people today have less egalitarian gender norms if their ancestors traditionally used the plow, which facilitated labor division between women and men in agricultural societies (Alesina, Giuliano, and Nunn, 2013). Within the evolutionary process, individuals do not reason about the sense of norms. This paper proposes a complementary view by which people actively consider the implications of social norms. According to egocentric norm adoption, people judge the importance of a norm by its consequences and focus on their private outcomes. Of course, the consequences of a norm follow not only from a person's own behavior but, importantly, also from others' behavior. We suggest that people are inclined to adopt a norm if the outcome that it implies is favorable and subconsciously base their judgment chiefly on the outcome for themselves. Thus, if a person wants others to follow a specific norm, simply because the consequences would be good for her, she will feel that the corresponding norm is objectively important and adhere to it herself. We present an experiment with an identification strategy that exploits the role played by others and the presence of egocentrism. The design has the following features: First, subjects are affected by others' choices. Second, they also decide in the same decision contexts themselves but over others, such that they are not affected by their own decisions. Third, subjects' interests are exogenously varied, i.e., they are randomly allocated to roles that profit or lose

from certain norms. Only if people judge the importance of norms by their consequences and do so in an egocentric manner, subjects should make decisions over others that favor their own roles. We find clear evidence for such behavior.

In the experiment, pairs of subjects are randomly assigned to groups. For the two members of each group, subjects from other groups choose allocations of points. The possible allocations involve tradeoffs between two different fairness norms, where each of the principles favors one of the group members. Subjects decide over the allocations in other groups along a circle: Group 1 decides over Group 2, Group 2 over Group 3,  $\ldots$ , and Group N over Group 1. Therefore, no subject can influence their own payoff. Egocentric norm adoption would predict that subjects favor the fairness principle from which they would profit themselves, despite holding no stakes in their own decisions. The experiment consists of two decision contexts: the EF Procedure trades-off equality against efficiency, while the EQ Procedure involves equality and equity, i.e., the principle of accountability.<sup>2</sup> Subjects have distinct roles for each procedure that determine from which respective normative principle they profit, and the roles of subjects in adjoining groups are crossed. Consequently, each subject shares exactly one role with each player over whom she decides. This feature allows us to distinguish the context-specific effect proposed in this paper, whereby subjects' own interests matter, from any person-specific effects, like favoritism towards a specific player. The experiment's main result is that subjects' decisions over others are biased in favor of their own roles, thereby favoring one of the players in the EF Procedure and the other player in the EQ Procedure. After the subjects have decided, we elicit their beliefs about the choices of others, not conditioning on roles. Beliefs show very similar biases to those observed for decisions, suggesting that the main effect arises mostly unconsciously. As part of the questionnaires at the end of the experiment, we measure different aspects of empathy. In line with the interpretation of egocentrism driving the results, we find that decisions are less biased among subjects who report pronounced perspective-taking.

This paper's experiment provides evidence for egocentric norm adoption in the tradeoff between pairs of norms that are in conflict. A related paper by Hofmeier and Neuber (2019) is concerned with how the norm of helping is traded-off against material self-interest, depending on how much people require help themselves. In the experiment, senders can pay money to avoid that receivers have to eat different food items containing dried insects. They know what receivers would be willing to pay for themselves, which mutes the role of beliefs. All subjects act as senders but might be selected to act as receivers at the end of the experiment. The main result is that people pay more for others if they also pay more for themselves. This relationship holds between different subjects

<sup>&</sup>lt;sup>1</sup>Throughout the paper, we will denote the tradeoff between equality and efficiency as a *fairness* tradeoff, although efficiency in itself might not be considered a fairness criterion. However, efficiency is nonetheless relevant for fairness judgments (see Konow, 2001).

<sup>&</sup>lt;sup>2</sup>For the empirical relevance of different fairness views, see Konow (2003) and Cappelen et al. (2007).

and also exists within individual subjects' decisions across different items. Subjects are thus imperfectly empathic in acting not only upon receivers' preferences but also upon their own. Egocentric norm adoption can explain this finding: people feel obliged to help others if they want to receive help themselves. The experiments presented in the current paper and in Hofmeier and Neuber (2019) both stress the negative side of egocentric norm adoption, i.e., its egocentric aspect. Applied, e.g., to politics, the mechanism is a likely explanation for inefficient disagreement about fairness standards and distributive policies. However, egocentric norm adoption also has (perhaps primarily) a positive side, which is the aspect of norm adoption: people do think about how they would feel about their behavior themselves and therefore adhere to norms. In the experiment by Hofmeier and Neuber, this is indeed quite apparent: Many people are willing to give substantive amounts, just not optimally targeted at the receiver-item-combinations where the benefit for others would be largest. Egocentric norm adoption can thus have positive consequences in many social situations and, in particular, promote cooperation between individuals with shared interests. It can, e.g., motivate people to vote in large elections because they would like others who share their political preferences to do the same. More generally, egocentric norm adoption can help overcome collective action problems and supplying public goods because people in these situations depend on mutual help.<sup>3</sup>

The present paper is related to multiple strands of literature that previously have been mostly unconnected. First, it is related to the literature on motivated reasoning and beliefs (Kunda, 1987, 1990; Oster, Shoulson, and Dorsey, 2013; Bénabou and Tirole, 2016). In particular, an extensive literature has been concerned with motivated beliefs in the domain of fairness. In an early contribution, Messick and Sentis (1979) find evidence for self-serving fairness views in a hypothetical setting regarding the remuneration for work conducted with another person who has worked for a longer or shorter time, respectively. In the economic literature, Konow (2000) elicits fairness views as real decisions over allocations between others. Konow shows that subjects who behaved unfairly due to selfish incentives subsequently adjust their fairness views and interprets this as proof for cognitive dissonance reduction (Festinger, 1957; Akerlof and Dickens, 1982).<sup>4</sup> Dana, Weber, and Kuang (2007) add "moral wiggle room" to the dictator game by reducing transparency and find decreased giving. Several further contributions have studied how people who are facing monetary incentives to behave unfairly exhibit more selfishness under circumstances which permit sustaining a positive self-image (Gino, Norton, and Weber, 2016). Among the identified kinds of "excuses" are competing (fairness) norms (Rodriguez-Lara and Moreno-Garrido, 2012; Bicchieri and Chavez, 2013; Barron, Stüber, and Veldhuizen, 2019; Kassas and Palma, 2019), sharing the benefits of unethical behavior with others

<sup>&</sup>lt;sup>3</sup>This explanation is complementary to other contributing factors such as altruism (Becker, 1974), warm glow (Andreoni, 1990), and reciprocity (Fehr and Gächter, 2000; Falk and Fischbacher, 2006).

<sup>&</sup>lt;sup>4</sup>However, Cerrone and Engel (2019) show that revealing one's fairness view is not sufficient to eliminate subsequent selfish behavior.

(Gino, Ayal, and Ariely, 2013), possible misdemeanor of those to be treated unfairly (Di Tella et al., 2015), ambiguity or risk over the efficacy of prosocial behavior (Haisley and Weber, 2010; Exley, 2016), and supposed mistakes in decision making (Exley and Kessler, 2019). In all of these contributions, biases in fairness views are induced by direct monetary incentives. Self-serving fairness views have also been documented in bargaining contexts, contributing to bargaining impasse between parties who do not sufficiently appreciate the other side's arguments (Thompson and Loewenstein, 1992; Loewenstein et al., 1993; Babcock et al., 1995; Babcock and Loewenstein, 1997; for a successful replication, see Hippel and Hoeppner, 2019). This bias is in line with research showing that people who successfully convince themselves of a particular argument in their favor are better at convincing others (Smith, Trivers, and Hippel, 2017; Schwardmann and Weele, 2019), for which Schwardmann, Tripodi, and Weele (2019) provide additional evidence in the field setting of a debating competition.<sup>5</sup> Our paper contributes to the above literature by demonstrating bias in a context without any motives that would conflict with objective fairness. In the experiment, subjects do not need to legitimize any past actions, their decisions do not affect their payoffs, and they do not need to be convincing. Instead, a given subject could do what she objectively believes to be fair and—maybe—hope that others disagree with her view, thereby allocating more points to her than her own decisions would imply. The subject could even think that receiving more points than she would allocate to someone in her own position would happen to be a fair outcome, perhaps because she feels especially deserving as a person or is in particular need of money. The observed bias is evidence that such reasoning is not the whole story. Epley and Caruso (2004) have suggested that people are convinced of self-serving ethical judgments as a result of egocentrically biased affective reactions (see Zajonc, 1980; Haidt, 2001; Slovic et al., 2002) that are automatic and unconscious. This paper agrees and shows that egocentric perceptions of potential outcomes do not just affect how people feel about narrowly-defined situations that involve themselves. Instead, egocentrism also translates into people's actions and how they treat others, apparently because it alters different norms' perceived importance. The experiment thereby shows that egocentrism can have consequences in situations where people could genuinely claim that they are free from any "conflict of interest." A judge in a court

<sup>&</sup>lt;sup>5</sup>Concerning the mechanism behind self-persuasion, Babcock et al. (1995) show that the egocentric bias in fairness views is reduced to statistical insignificance when subjects only learn about their roles after having read the instructions, i.e., self-persuasion seems to work through differential information encoding. Similarly, in the context of self-interested financial advice, Gneezy et al. (2020) show that self-deception about the truly best options is more pronounced when advisors know about the selfish incentives already before they make their private evaluations. Zimmermann (2020) empirically shows that another mechanism to arrive at motivated beliefs is selective memory. The findings show that creating and sustaining motivated beliefs is an active mental process.

<sup>&</sup>lt;sup>6</sup>Regarding the aspect of unconsciousness, a psychological literature has been concerned with how judgments regarding, e.g., the quality of an applicant, can be "contaminated" by affective reactions (Wilson and Brekke, 1994), finding that people's awareness of their internal processes is insufficient to overcome the resulting biases. Relatedly, Bocian and Wojciszke (2014) show that others' immoral behavior is judged less harshly by observers if the latter themselves profited from the behavior.

case, e.g., might not know either of the involved parties, not hold any private interests in the matter under review, and not be prejudiced. Maybe, however, the judge shares certain case-relevant features with one of the parties (e.g., being female or male in the context of gender discrimination). In light of this paper's findings, the judge's decision could still be biased.

The paper is thus also related to a second strand of literature concerned with ingroup-out-group bias. This research area started from the observation that experimental subjects tend to favor other subjects from their own group over subjects from other groups even when the criteria used to form groups are "minimal" (Tajfel, Billig, and Bundy, 1971; Billig and Tajfel, 1973). This finding is now commonly explained with social identity theory (SIT; Turner, Brown, and Tajfel, 1979). The latter starts from the premise that part of individuals' identity is their social identity, which they derive from group memberships. People increase their self-esteem by adopting more favorable beliefs about in-group members than out-group members, as evident in ratings (Mullen, Brown, and Smith, 1992), and treating the former better than the latter. Owing to the observations that individuals usually belong to many social groups and that those groups overlap, there is an interest in the effect of crossing group categorizations between individuals (Brown and Turner, 1979), i.e., the relations between in-groups, single out-groups, and double-outgroups. An additive pattern seems to prevail: in evaluations, people behave as if they count the number of dimensions in which another person belongs to their ingroup and subtract the number of out-groups to which the same person belongs (Crisp and Hewstone, 1999). Chen and Li (2009) examine the effects of minimal groups within the setting of commonly used paradigms of experimental economics. They find that, relative to out-group members, members of a subject's in-group experience more altruism, increased positive reciprocity, and decreased negative reciprocity. Our paper relates to this literature in that egocentric norm adoption can give rise to a phenomenon akin to ingroup—out-group bias. People treat others well if they share the same economic interests. If economic interests in a particular situation coincide among some pairs of people and differ for others, discrimination arises between "interest groups." The experiment rules out classical in-group-out-group bias by ensuring that subjects in adjoining groups always share precisely one role. Therefore, both group members for whom a player chooses an allocation are in one of her in-groups and one of her out-groups, such that SIT would not make any prediction for differential treatment. The crossing of roles also implies that egocentric norm adoption favors a different participant for each of the two decisions that a subject makes.

Finally, the present research is related to a mostly theoretical literature on "Kantian" behavior, which proposes that human behavior is following a version of Kant's categorical imperative to "[a]ct only in accordance with that maxim through which you can at the same time will that it become a universal law" (Kant, 1996, p. 73). Loosely speaking, the

economic literature says that a subject has Kantian moral concerns if she prefers using strategies that would benefit her also if everyone else also adopted them. Roemer (2010) shows that in the presence of externalities, equilibria arising from Kantian maximization dominate Nash equilibria. Alger and Weibull (2013) show that under assortative matching of individuals who interact, evolution should converge to a mixture of selfish and Kantian preferences. Leeuwen, Alger, and Weibull (2019) empirically investigate the presence of deontological preferences. They do so by letting subjects play both roles in different twoplayer dilemmas, eliciting their beliefs about others' strategies, and structurally estimating subjects' preferences. Intuitively, Kantian preferences predict strategies that would work especially well if subjects played with themselves in different roles. In the sequential prisoner's dilemma, e.g., those cooperating as the first mover also tend to cooperate with a higher probability as the second mover.<sup>8</sup> As has been shown by Blanco et al. (2014), this correlation can, to a large extent, be explained by beliefs about others' behavior, i.e., by false consensus, but not entirely. Since there is no experimental treatment involved, several different preference-based explanations for this finding are possible (see Blanco et al., 2014). A latent class analysis conducted by Leeuwen, Alger, and Weibull (2019) indicates that deontological preferences do well in explaining the observed patterns. Like the literature on Kantian behavior, this paper proposes that people mainly care about their own outcomes and exhibit rule-based behavior. Conceptually, we bridge the above literature to the much larger literature on social norms, an obvious ingredient of rule-based behavior. Moreover, we suggest that the process of selecting behavioral rules is not highly abstract, as the reference to Immanuel Kant would suggest, but mainly unconscious, which is confirmed by our finding of biased beliefs. Empirically, our identification strategy does not exploit patterns within the strategies that subjects choose but uses the aspect of egocentrism, which has played no role in the previous experiments. Since roles are assigned exogenously, egocentric norm adoption is cleanly identified. The results from our experiment show that egocentrism plays a vital role in how people select behavioral rules. This property is clearly opposed to the idea of deontological ethics but apparently a more realistic characterization of people's intuitive behavior.

The remainder of this paper is organized as follows: Section 2 introduces the design in detail. The derivation of the hypotheses follows in Section 3. Section 4 presents the main results. Subsequently, Section 5 conducts an analysis of heterogeneity in the observed effects. Finally, Section 6 summarizes the paper and provides a discussion of other contexts in which egocentric norm adoption might be important.

<sup>&</sup>lt;sup>7</sup>See also Bergstrom (1995) for an early contribution and Alger and Weibull (2019) for a review.

<sup>&</sup>lt;sup>8</sup>A similar approach is used by Costa-Gomes, Ju, and Li (2019), who find what they call "role-reversal consistency."

## 2 Experiment

The experiment's design is such that subjects' self-interest is aligned or opposed to certain kinds of choices in decision contexts that subjects are facing themselves. However, their own decisions are entirely irrelevant for their payoffs—a feature that was made highly salient throughout the experiment.

### 2.1 Design

A multiple of four participants takes part in each experimental session. Pairs of participants are randomly allocated to groups, numbered consecutively from 1 to N. In each group, one participant is called *Player X* and the other *Player Y*. All participants receive a fixed participation fee of €4 and, during the experiment, points that are each worth €0.01. Importantly, no player makes any decision regarding their own group. Instead, groups decide over players in other groups along a circle, i.e., Group 1 decides for Group 2, Group 2 decides for Group 3,  $\dots$ , and Group N decides for Group 1. Every player makes two decisions over allocations of points for the players in the respective succeeding group, each one according to a different procedure. One decision is about the tradeoff between equality and efficiency (EF Procedure); the other is about the tradeoff between equality and equity, i.e., attribution of responsibility (EQ Procedure). For the EF Procedure, one player in each group takes the role that profits from efficiency, while the other player profits from equality. In the paper, we denote the former role by A and the latter by B. For the EQ Procedure, we denote roles by a and b, where Role a profits from equity and Role b from equality. The labels of roles do not appear in the instructions, and they are determined independently of subjects' names (X and Y). The instructions do not use the labels for the procedures, either. Instead, these are called "Procedure 1" and "Procedure 2," depending on their randomly determined order on the subject-level. Any two players in any two adjoining groups share exactly one role. Figure 1 visualizes this structure, where tuples after players' names denote their roles in the EF and the EQ Procedure, respectively.

$$\cdots \Rightarrow \begin{array}{c} X \colon \ (A,a) \\ Y \colon \ (B,b) \end{array} \Rightarrow \begin{array}{c} X \colon \ (A,b) \\ Y \colon \ (B,a) \end{array} \Rightarrow \begin{array}{c} X \colon \ (B,b) \\ Y \colon \ (A,a) \end{array} \Rightarrow \begin{array}{c} X \colon \ (B,a) \\ Y \colon \ (A,b) \end{array} \Rightarrow \cdots$$

Figure 1: Example for Roles in Successive Groups

Estimation Task The EQ Procedure requires that subjects can contribute to the success of their groups. Therefore, all subjects have to engage in an estimation task. The task precedes all other instructions of the experiment, and we tell subjects that a precise estimate will increase their chances of receiving additional money during the experiment.

On their computer screens, subjects see a three-second countdown, after which they see an image for two seconds. The image shows a certain number of blue dots on a yellow background. Immediately after the image has disappeared, subjects have 15 seconds to enter an estimate for the number of dots that they saw. Their task is to minimize the absolute difference between their estimate and the actual number of dots. Before the actual task, subjects complete an identical trial task with a different number of dots. The respective images that subjects see are the same for all participants, showing 40 dots for the trial task and 53 for the actual task. Neither of these numbers is revealed to subjects.

After the estimation task, subjects learn about the experiment's basic setup, i.e., the circular decision structure. The instructions spell out precisely who makes decisions concerning the group to which they belong themselves and for which group they will make decisions. A highlighted box emphasizes that they will in no way be able to influence the allocation of points within their own group. Players first learn about names and roles within their own group and the potential payoff consequences for themselves and their partners. Afterward, they are informed about the structure of the group for which they decide. This order mimics typical real-life situations in which people know about their interests (e.g., being rich or poor) before considering a particular decision problem (voting over a redistributive policy measure).

Efficiency (EF) Procedure The EF procedure concerns the tradeoff between equality in points that are allocated to both players of a group vs. efficiency in terms of total points for both group members. The possible allocations of points are shown in Table 1.

Table 1: Payoffs for the EF Procedure

#	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20
	200																			
B	200	190	180	170	160	150	140	130	120	110	100	90	80	70	60	50	40	30	20	10
$\sum$	400	490	565	630	685	735	780	820	855	885	911	933	951	966	978	987	993	997	999	1,000

Columns show the 20 options among which subjects can choose for their respective succeeding groups. The row below the option numbers shows the points that the player in Role A receives as part of each allocation. This number is strictly increasing over options but in decreasing increments, i.e., the number of points mimics a strictly concave function. Increases start at 100 points and decrease to a minimum of eleven points. The number of points that the player in Role B receives equals that of the other player only for the first option and then decreases in constant increments from 200 down to 10. The

<sup>&</sup>lt;sup>9</sup>The task of estimating the number of dots follows the one used in Fliessbach et al. (2007). However, the original task asks subjects to make the binary judgment of whether the number of dots was higher or lower than a given integer. Asking for a specific estimate instead allows for a more fine-grained assessment of performance, thereby avoiding ties between pairs of subjects.

bottom row shows the total number of points, which ranges from 400 to 1,000. Relative to the fully equal outcome therefore, efficiency can be increased by a factor of up 2.5. However, efficiency gains decrease from 90 points going from Option 1 to Option 2 to just a one-point difference between options 19 and 20. Thus, going from lower to higher options, inequality increases at diminishing returns in terms of efficiency.

Equity (EQ) Procedure At the beginning of the experiment, all players engaged in an estimation task, which they were told would increase their chances of getting additional money (see above). The estimates that subjects gave are used for the EQ Procedure in which the estimate of the player in Role a is compared to the estimate of another player from a non-adjoining group. If the estimate of the player in Role a was better than the other estimate, the group receives 1,000 points, and otherwise, it receives no points. The estimate of the player in Role a having secured the points, one allocation needs to be chosen from the 20 options provided in Table 2.

Table 2: Payoffs for the EQ Procedure

#	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20
$\overline{a}$	500	525	550	575	600	625	650	675	700	725	750	775	800	825	850	875	900	925	950	975
b	500	475	450	425	400	375	350	325	300	275	250	225	200	175	150	125	100	75	50	25

As for the EF procedure, Option 1 implements equality of points between roles, i.e., players. For every further option, 25 points are added for the player in Role a (who secured the points) and the same number of points is deducted from the player in Role b (whose performance is irrelevant for the group). Thus higher-numbered options constitute allocations which reflect accountability for the total points that the group received, i.e., a reward for the player who won the points.

The instructions display the potential payoffs like Tables 1 and 2, except that participants see the names of players (X and Y) instead of roles. The row for Player X is always on top and that for Player Y below, i.e., the two rows might be reversed. Subjects have to correctly answer three sets of control questions while reading through the instructions, for which they can reread the relevant previous screens. The first set of questions follows the information about their own group. These questions refer to the experiment's structure, the assignment of roles in the subjects' own groups. For two example options,

<sup>&</sup>lt;sup>10</sup>The fact that subjects cannot learn about their performance and that everybody took part in the same task under the same conditions mutes any self-esteem motives.

<sup>&</sup>lt;sup>11</sup>The fixed and transparent order facilitates understanding. Subjects find their own payoff in the same row for both procedures. By favoring their own roles, players once give advantage to the subject sharing their own row and once to the subject whose payoff is displayed in the other row.

subjects have to fill in the amounts of points that both players in their group would receive. A corresponding second set of questions is presented after subjects have learned about the situation within the groups over which they decide. The last set of control questions regards the crossed roles between groups and the below information about the implementation of payoffs.

At the end of the experiment, the computer conducts a three-step random procedure to implement a subset of decisions. First, it randomly chooses one of the two procedures. Second, it determines whether decisions come from either all even- or all odd-numbered groups. Third, it determines one subject within each relevant group and implements their respective decisions. Thus, for 50% of subjects, a decision made by another subject is implemented. The 25% of subjects whose own decisions become relevant themselves receive 1,000 points.<sup>12</sup> For the remaining 25% of subjects, their payoff depends on another task independent of their own decisions (see the paragraph on belief elicitation below). After they have correctly answered the last set of control questions, subjects have to make the decisions for the respective succeeding group, one after the other in the subjective-specific order. No option is preselected.

Belief Elicitation After the two decisions, we elicit players' beliefs about choices by others. Specifically, we ask them to guess the average of the choices that subjects from other groups in their session have made for groups that, in terms of the role compositions, are identical to the one for which they have decided themselves. If the decision of a subject's group partner is implemented, i.e., with a probability of 25%, the guess's accuracy determines their payoff. Average choices within the same session are calculated for each procedure, separately for even- and odd-numbered groups, and excluding each subject's own group.<sup>13</sup> Subjects then receive 500 points if their guess is precisely correct and 250 points as long as the correct answer falls into the range of the five options closest to their guess. We elicit the beliefs with tables that look exactly like the ones for the decisions. The tables highlight the range of options for which the currently selected option would still imply 250 points.<sup>14</sup>

 $<sup>^{12}</sup>$ For these subjects, the compensation is thus fixed and thereby independent of their roles. Moreover, the number of points that deciding subjects receive (1,000) is always larger than the payoff for any of the two subjects over whom they decide. These design properties alleviate concerns that subjects' decisions over others might depend on expectations about their own payoffs, e.g., due to aversion towards inequality (Fehr and Schmidt, 1999; Bolton and Ockenfels, 2000). Also note that if subjects in Roles B and b should choose more equal options because they wanted to reduce the gap to subjects in Roles A and a (in the succeeding group) in expectations, we should observe a negative correlation between choices and beliefs. As Section 4.2 will show, the opposite is the case.

 $<sup>^{13}</sup>$ This procedure makes sure that the relevant other subjects decided over groups that, abstracting from players' names (who was X and who was Y), are identical to the one for which the respective participant was deciding herself. It also ensures that the roles of comparison subjects are balanced, i.e., that the different roles are present in equal numbers.

<sup>&</sup>lt;sup>14</sup>For options towards either end of the scale, the interval for which subjects receive 250 points becomes asymmetric around the reported belief. This asymmetry ensures that subjects whose true beliefs are at the extremes have no mechanic incentive to adjust their answers towards the center.

Questionnaires The experiment proceeds with a survey asking subjects about fundamental sociodemographic characteristics like age, gender, and income. Moreover, participants complete several questionnaires on personality, preferences, and values. The details with the corresponding results are presented in Section 5. Finally, subjects learn their payoffs and the details of how it came about.

Let us conclude this description of the experimental design by pointing out two noteworthy features that allow for a clean identification of egocentric norm adoption. First, the experiment's structure ensures that subjects' choices do not affect those players on whom their own payoffs depend, avoiding considerations of reciprocity (Fehr and Gächter, 2000; Falk and Fischbacher, 2006). Second, the experimental design comprises two different procedures, such that each player has two roles. Own roles and roles of subjects for whom players decide are crossed, such that players share exactly one role with each subject over which they decide. Thereby, we distinguish the effect of egocentric norm adoption from ingroup-out-group bias in the sense of SIT. According to the latter, preferential treatment is due to elevated attitudes towards in-group members relative to out-group members. Such reasoning is focused on others, and it would take into account both of a subject's two roles (hence the interest in how people aggregate crossed categorizations; see Section 1). If both procedures were equally relevant for identity, SIT would predict no effect. If one procedure were more important than the other, SIT would predict that a given player favors the same subject in both decisions. In contrast, people who egocentrically adopt norms are not focused on others but themselves. Preferential treatment is not attached to other people but an individual's roles. Therefore, in the experiment, egocentric norm adoption predicts that a given player favors a different subject for each procedure, i.e., always the one who shares the player's respective own role.

### 2.2 Procedure

The experiment was run from May 13 until May 20, 2020, and implemented as a virtual lab experiment. Seventeen sessions with either 20 or 24 subjects resulted in a total of 372 participants who completed the experiment. Participants were recruited from the subject pool of the BonnEconLab using the software hroot (Bock, Baetge, and Nicklisch, 2014). The experiment's language was German, and we invited only German-speaking subjects. Participants were mostly university students, and around 60% of subjects were women. For details of the sample composition, see Table B.1 in the appendix. Subjects participated via the Internet. The experiment was programmed using oTree (Chen, Schonger, and Wickens, 2016), such that subjects could access it through their web browser using

 $<sup>^{15}</sup>$ We had to exclude four of the 376 participants who initially started the experiment because they either stopped working on the experiment or were unable to answer some of the control questions.

their own devices.<sup>16</sup> They received individual links, such that it was impossible for any subject to participate more than once. Since we ran the experiment during the first phase of the COVID-19 pandemic, subjects presumably participated from home (the university library, e.g., was closed at the time). Contrary to typical online experiments, however, and just as in a usual laboratory experiment, subjects attended specific experimental sessions. They had to take part in the experiment at a pre-specified time and date, other participants in the respective same session were taking part simultaneously, and an experimenter was available to answer questions. On the introduction screen, we gave subjects contact details which they could use in case of questions. The experimenter was available via email, telephone, or text.<sup>17</sup> Subjects had already received the contact details before the experiment as part of the automated email communications (invitation, an email with the personal link, reminder). Several subjects asked questions during the experiment, and all contact methods were used.

# 3 Hypotheses

The paper's main hypothesis is that participants make decisions favoring their own role for the respective procedure. To understand the reasoning behind this conjectured effect in the absence of material incentives or, in fact, *any* instrumental or otherwise self-serving motives, we develop a simple formal framework that attributes biased fairness views not to motivated cognition but the (partial) inability to abstract from one's own role. From the gained insights, we derive the paper's hypotheses.

#### 3.1 Formal Framework

The starting point is that, while considering the possible choice options, an agent experiences an affective reaction determined by her fairness views but also by the payoff implied for her own relevant role because her perspective is inherently subjective. Her fairness views and level of subjectivity are, however, imperfectly known to the agent. Instead, she knows what "feels best" for her. When being confronted with the choice that she has to make over others, she tries to empathize with those affected. She thus engages in the underlying normative trade-off and tries to learn about the importance of the involved norms. For this, she uses her affective reactions and asks how they came about. If she is perfectly capable of perspective-taking, she fully realizes the extent of

<sup>&</sup>lt;sup>16</sup>The invitation stated that subjects were required to use a regular desktop or laptop computer. In principle, however, the experiment was also fully functional on smaller devices such as smartphones or tablets.

<sup>&</sup>lt;sup>17</sup>In contrast to using an online conference platform, these contact methods allowed for one-to-one communication between subjects and the experimenter.

<sup>&</sup>lt;sup>18</sup>If she did not care about the people over whom she decides, she would choose randomly.

subjectivity underlying her reactions, backs-out her true fairness-views, and takes an unbiased decision. However, if she is affected by some degree of egocentrism, i.e., her ability of perspective-taking is imperfect, she underestimates the influence of subjectivity. She arrives at fairness-views that depend on her own roles and at corresponding choices that are egocentrically biased.

#### 3.1.1 Basic Setup

The agent makes one choice for the EF and one for the EQ Procedure,  $c_{EF}$  and  $c_{EQ}$ , respectively. We assume that the choice set for both procedures is the interval [1, 20], i.e., the agent can choose intermediate options. When considering a given option for one of the procedures, the agent experiences an affective reaction depending on her own respective payoff and the violation of the two norms that are relevant in the respective procedure. We denote by  $role_{EF} \in \{A, B\}$  the agent's role in the EF Procedure and by  $role_{EQ} \in \{a, b\}$  her role in the EQ Procedure. The agent's affective reaction functions for the two procedures are given by the following equations.

$$React_{EF}(c_{EF}) = \alpha Pay(c_{EF}, role_{EF}) - \beta_1 Ineff(c_{EF}) - Inequal_{EF}(c_{EF})$$
 (1)

$$React_{EQ}(c_{EQ}) = \alpha Pay(c_{EQ}, role_{EQ}) - \beta_2 Unfair(c_{EQ}) - Inequal_{EQ}(c_{EQ})$$
 (2)

The influence of the payoff for the own role is determined by the level of subjectivity  $\alpha \geq 0$  and the relative weights attached to the efficiency and the fairness norms are  $\beta_1 > 0$  and  $\beta_2 > 0$ , respectively. For Roles A and a, the function Pay is strictly increasing in the choice while, for Options B and b, it is strictly decreasing. Thus, it may simply correspond to numbers of points. Ineff and Unfair are both strictly decreasing and strictly convex, as higher options are (decreasingly) more efficient or allocate more points to the responsible player, respectively. On the other hand,  $Inequal_{EF}$  and  $Inequal_{EQ}$  are both strictly increasing and convex, as higher options imply increasingly unequal payoffs for players. Moreover, we assume that all of the functions are differentiable.

The agent's intuitive reactions are thus best for some options  $\tilde{c}_{EF}$ ,  $\tilde{c}_{EQ} \in (1, 20)$ . The agent knows how her reactions came about up to the three parameters. In scrutinizing the reasons for her reactions, she forms beliefs  $\tilde{\alpha}$ ,  $\tilde{\beta}$ ,  $\tilde{\gamma}_1$ , and  $\tilde{\gamma}_2$  about the parameters which, assuming an interior solution, must obey the first order conditions for Equations 1 and 2. The set of solutions is not atomic, and different combinations of parameters can rationalize the intuitive optimum. For example, a high value of  $\tilde{c}_{EF}$  for an agent in Role A could be due to strong subjectivity (large  $\alpha$ ) or due to strong efficiency concerns (large  $\beta_1$ ). The agent starts her inference from prior beliefs about the true parameter values that follow independent Normal distributions with standard deviations of one. For the beliefs about  $\beta_1$  and  $\beta_2$ , the means are the respective true values, while for belief about  $\alpha$ , the mean is attenuated by  $e \in [0, 1]$ , i.e., the inability to abstract from one's personal

vantage point. Thus, the prior belief is given by  $\mathcal{N}((1-e)\alpha,1)$ . Her beliefs are the values that are most likely given her prior beliefs and the two first-oder conditions.

#### **Lemma 1.** Assume that $\alpha, e > 0$ . Then:

- 1. The agent underestimates her level of subjectivity, i.e.,  $\tilde{\alpha} < \alpha$ .
- 2. The agent's updated fairness views are egocentrically biased.
  - (a) If she is in Role A,  $\tilde{\beta}_1 > \beta_1$ . Otherwise, i.e., if she is in Role B,  $\tilde{\beta}_1 < \beta_1$ .
  - (b) If she is in Role a,  $\tilde{\beta}_2 > \beta_2$ . Otherwise, i.e., if she is in Role b,  $\tilde{\beta}_2 < \beta_2$ .

Lemma 1 formally captures the intuition of egocentric norm adoption: an agent who profits from efficiency-oriented decisions by others will tend to consider this normative principle important. In contrast, an agent who personally loses from efficient allocations will tend to object to the principle. Similarly, an agent who profits from equity-oriented decisions will support the corresponding principle more strongly than an agent who loses from them.

#### 3.1.2 Combining the Procedures

The above framework considers the decisions for the two procedures independently, which suffices for the main predictions. Note, however, that both the EF Procedure and the EQ Procedure involve equality as an overlap in the involved fairness norms, aligned with the interest of roles B and b, respectively. Thus, a participant with Roles B and b always profits from equality, while one with roles Roles B and a or Roles A and b profits from equality according to one procedure and loses in the other. Lastly, the private interest of a participant with roles Roles A and a is always opposed to equality. Using this feature, the setup allows for insights into how egocentrically adopted norms can spill over from their source to other contexts. Formally, let us modify Equations 1 and 2 in the following way:

$$React_{EF}(c_{EF}) = \alpha Pay(c_{EF}, role_{EF}) - \beta_1 Ineff(c_{EF}) - \gamma Inequal_{EF}(c_{EF})$$
 (3)

$$React_{EQ}(c_{EQ}) = \alpha Pay(c_{EQ}, role_{EQ}) - \beta_2 Unfair(c_{EQ}) - \gamma Inequal_{EQ}(c_{EQ})$$
 (4)

In contrast to the previous assumptions from Equations 1 and 2, the agent now also forms a belief about the importance of equality,  $\gamma$ . This creates a connection between the two procedures regarding the relative importance of the involved norms, just as it has been

<sup>&</sup>lt;sup>19</sup>One could also interpret this assumption in the sense of cognitive dissonance. Subjects would then find it implausible that a wedge exists between their affective reactions and their true fairness judgments. The results on perspective-taking in Section 5 support the interpretation in the sense of egocentrism.

intuitively discussed above. As before, the agent knows her true reaction functions up to the now four parameters. All beliefs are the same as before, and the prior belief about  $\gamma$  also follows a Normal distribution with a standard deviation of one, centered around the true value. From the modified assumptions follow the below results.

**Lemma 2.** Assume positive subjectivity and egocentrism  $(\alpha, e > 0)$ . Then:

- 1. The agent underestimates her level of subjectivity, i.e.,  $\tilde{\alpha} < \alpha$ .
- 2. The agent's updated fairness views are egocentrically biased.
  - (a) For roles A and a, it holds that  $\tilde{\gamma} < \gamma$ . Moreover,  $\tilde{\beta}_1 > \beta_1$  and/or  $\tilde{\beta}_2 > \beta_2$ .
  - (b) For roles B and b, it holds that  $\tilde{\gamma} > \gamma$ . Moreover,  $\tilde{\beta}_1 < \beta_1$  and/or  $\tilde{\beta}_2 < \beta_2$ .

- (c) For roles A and b, it holds that  $\tilde{\beta}_1 > \beta_1$  and  $\tilde{\beta}_2 < \beta_2$ .
- (d) For roles B and a, it holds that  $\tilde{\beta}_1 < \beta_1$  and  $\tilde{\beta}_2 > \beta_2$ .

Proof in Appendix A.1.

Lemma 2 states that an agent who always loses if others are taking equality-oriented decisions applies a weight to equality that is biased downward. Moreover, there is an upward bias in at least one of the weights that she assigns to the opposing norms, i.e., efficiency and equity. The opposite is true for an agent who always gains from equality. We can make no statement about the weight attached to equality for agents who gain from equality-oriented decisions in one procedure and lose from them in the other. However, for the respective opposing norm that is involved, the same applies as in Lemma 1: agents who benefit from decisions that emphasize efficiency or equity consider the respective norms important, while they otherwise exhibit a downward bias in the attached weight.

#### 3.2 Predictions

In making her decisions, the agent tries to be impartial and therefore omits considerations regarding her own role. Using the basic setup of Section 3.1.1, the objective functions that she wants to maximize are Equations 1 and 2, setting the value of  $\alpha$  to zero. In the objective functions that the she actually maximizes, however, the unknown parameters  $\beta_1$  and  $\beta_2$  are substituted by the agent's egocentrically biased beliefs  $\tilde{\beta}_1$  and  $\tilde{\beta}_2$ , respectively. We again assume interior solutions and use that, by the assumptions from Section 3.1.1 the utility functions is concave. Under these conditions, the agent's choices  $c_{EF}^*$  and  $c_{EQ}^*$  are uniquely identified by the following first-order conditions.

$$-\tilde{\beta}_1 \operatorname{Ineff}'(c_{EF}^*) - \operatorname{Inequal}'_{EF}(c_{EF}^*) = 0$$
$$-\tilde{\beta}_2 \operatorname{Unfair}'(c_{EQ}^*) - \operatorname{Inequal}'_{EQ}(c_{EQ}^*) = 0$$

Both optima are strictly increasing in the values of  $\tilde{\beta}_1$  and  $\tilde{\beta}_2$ . In conjunction with the egocentric biases shown in Lemma 1, this leads to the main hypothesis of the paper.

**Hypothesis 1.** For both procedures, subjects make choices favoring their own respective roles.

To test the hypothesis formally, denote by  $r_i^{EF} \in \{A, B\}$  the role of subject i for the EF Procedure and by  $r_i^{EQ} \in \{a, b\}$  her role for the EQ Procedure. The subject's choice for the EF Procedure is denoted by  $c_{i,EF}^*$  and the one for EQ Procedure by  $c_{i,EQ}^*$ . Hypothesis 1 was preregistered, and in the pre-analysis plan we committed to running the two following regressions:

$$c_{i,EF}^* = \delta_0 + \delta_1 1_A \left( r_i^{EF} \right) + \epsilon_{i,q} \tag{5}$$

$$c_{i,EQ}^* = \zeta_0 + \zeta_1 1_a (r_i^{EQ}) + \eta_{i,g}$$
 (6)

The terms  $1_A(r_i^{EF})$  and  $1_a(r_i^{EQ})$  denote indicator functions for roles A and a, respectively. Since subjects in roles A and a would profit from higher-ordered choices by the respective sending group, egocentric norm adoption predicts that both  $\delta_1$  and  $\zeta_1$  should be positive. Note that the hypothesis includes logical conjunction ("and"), i.e., both coefficients need to be positive. In Appendix A.2, we show that an upper bound for the joint one-sided p-value is provided by the average of the separate two-sided p-values. This result means that if both coefficients are significantly positive in separate OLS regressions, the null hypothesis of either coefficient being weakly negative can be rejected.

An agent who loses from equality in both procedures (i.e., whose roles are A and a) will initially feels attracted to high choice options. As has been shown in Lemma 2, she will view this as strong evidence that she cares little about equality and a lot about at least one of the other norms. The converse is, of course, true for an agent with roles B and b. On the other hand, agents who profit from equality in one procedure and lose from it in the other will notice that their initially preferred choices are somewhat contradictory as one seems to reflect strong concern about equality while the other does not. These observations lead to the last hypothesis.

**Hypothesis 2.** Among participants whose private interests are aligned with or opposed to equality for both procedures, the effect of their own roles is larger than among other participants.

In other words, we expect spillovers of roles to the respective other decision context, i.e., a positive effect of Role A on the decision for the EQ Procedure and, similarly, a positive effect of Role a on the choice for the EF Procedure.

In the formal framework introduced here, the bias in choices arises unconsciously and is accompanied by distorted beliefs about fairness. Research on the *false-consensus effect* 

has shown that people typically overestimate the extent to which others share their views, which in the context of this experiment would mean that they project their own bias upon others. We thus have a further hypothesis.

**Hypothesis 3.** Similarly to decisions, beliefs about others' decisions are biased in favor of subjects' respective roles.

Since people probably do not fully project their own views upon others but will moderate their predictions to some degree, we expect the effects for beliefs to be a bit smaller than those for the respective decisions.

## 4 Main Results

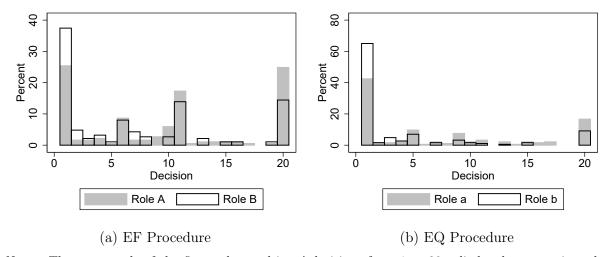
This section presents the main results of the experiment, starting with the decisions in Section 4.1 and proceeding with the analysis of beliefs in Section 4.2. Section 4.3 discusses further observations.

#### 4.1 Decisions

Figure 2 visualizes the decisions that subjects made in the experiment. The two panels are identically constructed, with Figure 2a on the left displaying the distribution of decisions for the EF Procedure and Figure 2b on the right showing the decisions for the EQ Procedure. In displaying the distributions of decisions, the panels differentiate between the two relevant roles for the respective procedure. For the EF procedure, these are Role A (shaded), profiting from efficiency, and Role B (light), profiting from equality. For the EQ procedure, the relevant roles are a, which is favored by the equity principle, and b, again benefiting from equality. For both procedures and irrespective of roles, the distributions of decisions reveal multiple peaks: one at Option 1, i.e., full equality, one at 20, i.e., least equality, and in the case of the EF procedure, another one at Option 11, which is one of the two options that are closest to the center.

In line with Hypothesis 1, differences that depend on subjects' roles are apparent within both procedures. For the EF Procedure, the median of the chosen options by subjects in Role A is 10, while for subjects in Role B it is only 6. Similarly, the average option chosen by those in Role A is 9.81 and only 7.21 for subjects in Role B, a difference of 0.37 standard deviations. These numbers suggest that, indeed, subjects who would themselves profit from others choosing high options choose higher options themselves than subjects who would personally profit from low options.

Table 3 analyses the data in a regression framework, regressing subjects' choices on their roles. Its first two columns show the estimates for the central regressions equations, i.e., Equations 5 and 6. For the EF Procedure, Column 1 shows that the above-mentioned



Notes: The two panels of the figure show subjects' decisions from 1 to 20 split by the respective relevant roles. The left panel shows the data for the EF Procedure. Role A (shaded) profits from higher options while Role B (light) profits from lower options. Similarly, the right panel shows the data for the EQ Procedure. Role a (shaded) profits from higher options while Role b (light) profits from lower options.

Figure 2: Decisions by Role

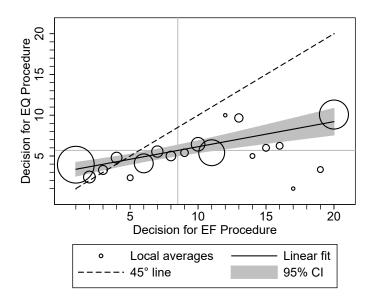
difference in means of 2.6 is statistically significant at any conventional level (p < 0.001; two-sided). The same qualitative result of higher choices by subjects in Role A is also confirmed by a non-parametric Mann–Whitney U test (p < 0.001; two-sided). The results for the EQ Procedure are qualitatively identical and in quantitative terms slightly stronger. Here, the median option chosen by subjects in Role a is 5, while it is 1 for subjects in Role b. The means are 7.25 and 4.11, respectively. The difference between the latter values corresponds to 0.47 standard deviations and is thus even larger than the one observed for the EF Procedure. Column 2 of Table 3 shows that this difference is significant (p < 0.001; two-sided), and the result is again confirmed by a Mann–Whitney U test (p < 0.001; two-sided). Together, the results from both procedures provide clear support for Hypothesis 1, namely for egocentric norm adoption: subjects tend to follow fairness evaluations such that, if the same standards were adopted by everybody, they would personally profit—and their respective group partners would lose.

While the analyses in Columns 1 and 2 have considered subjects' choices for the two procedures in isolation, it is natural to think that they are related. In particular, the fairness tradeoffs in both procedures involve the criterion of equality, once weighted against efficiency (EF Procedure), and the other time against the equity principle (EQ Procedure). Suppose a subject puts a strong emphasis on equality. In that case, this should manifest itself in low choices for both procedures. On the other hand, one would expect a subject who does not consider equality important to make high choices for both procedures. Thus, choices for the two procedures to be correlated among subjects. Figure 3 displays the empirical relationship between the two decisions that subjects are making. For every option for the EF Procedure on the horizontal axis, the vertical axis shows the respective

Table 3: Decisions

Dependent variable	Decision for succeeding group								
Model	O.	LS	SUR						
Procedure	EF	EQ	$\overline{EF}$	EQ					
	(1)	(2)	(3)	(4)					
Role $A$	2.602*** (0.727)		2.609*** (0.722)	1.304* (0.674)					
Role $a$		3.140*** (0.680)	$1.224^*$ $(0.722)$	3.147*** (0.674)					
Constant	7.209*** (0.498)	4.108*** (0.428)	6.593*** (0.625)	3.456*** (0.584)					
Observations $R^2$	372 0.033	372 0.055	372 0.041	372 0.064					

Notes: Heteroscedasticity-consistent standard errors in parentheses. \* p < 0.1, \*\*\* p < 0.05, \*\*\* p < 0.01.



Notes: The figure groups subjects by their decisions for the EF Procedure. For each option on the horizontal axis, the figure plots the respective subjects' average decisions for the EQ Procedure on the vertical axis. The sizes of circles correspond to the respective numbers of subjects. The dashed line indicates 45 degrees. The gray lines indicate the averages of decisions for the EF Procedure (vertical) and the EQ Procedure (horizontal). The solid black line represents the linear fit from an OLS regression, and the shaded area around it corresponds to the 95% confidence interval based on heteroscedasticity-consistent standard errors.

Figure 3: Relationship Between the Two Decisions

players' average decisions for the EQ Procedure. The sizes of circles correspond to the relative number of subjects. We observe a clear positive trend. The upward-sloping regression line confirms the positive relationship. It is based on the disaggregated data and corresponds to a correlation of 0.33 (p < 0.001, two-sided). The correlation cannot be due to roles, since those are independent.

Given that subjects seem to be consistent in how much weight they attribute to the equality norm in their two decisions, it is useful to consider both procedures jointly for two reasons. First, Hypothesis 2 predicts spillover effects of roles across procedures because the biased weight attached to equality should affect both decisions. Second, the residuals in Columns 1 and 2 are positively correlated. Conditional on roles, subject choosing high or low options for the EF Procedure also tend to do the same for the EQ Procedure. Taking into account this correlation structure by estimating equations jointly in a seemingly unrelated regressions (SUR) framework (Zellner, 1962) can improve the precision of estimates. Columns 3 and 4 of Table 3 again consider the EF Procedure and the EQ Procedure, respectively, but they are jointly estimated using SUR and include the effects of both roles. Since the roles in the two procedures are independent, the coefficients of Role A for the EF Procedure and Role a for the EQ Procedure remain virtually unchanged compared to Columns 1 and 2, and the standard errors are slightly smaller.<sup>20</sup> The two other coefficients capture the spillover effects. As predicted by Hypothesis 2, both point estimates are positive and consistent with the interpretation that changes in subjects' fairness judgments induced by roles carry over to the respective other procedure similarly to preexisting differences between different individuals.<sup>21</sup> Individually, both spillover coefficients are weakly statistically significant (p < 0.1), and they are jointly significant at the five percent level (p = 0.04).

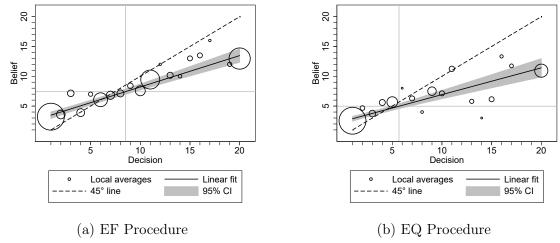
#### 4.2 Beliefs

An important question is whether the egocentric behavior of subjects is conscious or, as assumed in the formal framework presented in Section 3, unconscious, i.e., whether and to which extent subjects realize that their decisions deviate from their true fairness convictions. To address this point, we next analyze subjects' beliefs about average choices made by others.

Figure 4 allows for an important first observation. The construction of both panels follows Figure 3 in Section 4.1 above, plotting average beliefs for subjects depending on

<sup>&</sup>lt;sup>20</sup>The point estimates slightly differ because, as mentioned earlier in Footnote 15, four subjects did not complete the experiment, and roles are therefore not precisely independent anymore. The slight empirical correlations between roles are random, and the implications for estimates minimal.

 $<sup>^{21}</sup>$ Multiplying the effect from Column 1 in Table 3 with the slope of the regression line in Figure 3 (0.31), one would expect an effect of Role A for the EQ Procedure of 0.80. Similarly, the respective prediction for the effect of Role a for Procedure EF would be 1.08. The observed values in Columns 3 and 4 of Table 3 are comparable to these predictions and even slightly larger.

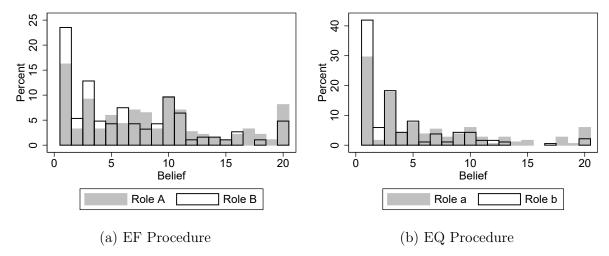


Notes: The two panels of the figure group subjects by their decisions for the EF Procedure and the EQ Procedure, respectively. For each option on the horizontal axes, the panels plot the respective subjects' average beliefs about others' decisions for the same procedure on the vertical axes. The sizes of circles correspond to the respective numbers of subjects. The dashed lines indicate 45 degrees. The gray lines indicate the averages of decisions for decisions (vertical) and beliefs (horizontal). The solid black lines represent linear fits from OLS regressions, and the shaded areas around them correspond to the 95% confidence intervals based on heteroscedasticity-consistent standard errors.

Figure 4: Beliefs vs. Decisions

their decisions. Figure 4a on the left shows the relationship for the EF Procedure and Figure 4b on the right does the same for the EQ Procedure. The gray lines that run vertically and horizontally indicate average decisions and beliefs, respectively. In both panels, they intersect below the dashed 45-degree lines, meaning that average beliefs are lower than average decisions for both the EF Procedure and the EQ Procedure (p < 0.001and p = 0.01, respectively) Thus, subjects typically expect others to assign a higher relative weight to equality than they do themselves. In both instances, there exists a clear positive correlation between choices and beliefs (p < 0.001), with slopes of 0.53 for the EF Procedure and 0.45 for the EQ Procedure. It is unlikely that these relationships stem from cognitive dissonance reduction as, e.g., in Konow (2000). That is, first, because beliefs were elicited using an incentivized procedure (see Section 2), i.e., it would have been costly for subjects to bias their beliefs. And, second, because there was no selfish motive that subjects could wish to conceal. Thus, the positive associations between decisions and beliefs are better interpreted as reflecting the well-established false consensus effect (Ross, Greene, and House, 1977): people have a fundamental disposition that others' convictions are more similar to their own than they actually are.

The latter was the premise under which Hypothesis 3 was derived, which states that egocentric biases should also be present in beliefs. As Figure 5 shows, this is the case. The two panels replicate those of Figure 2, replacing choices with beliefs about others' choices. For both procedures, the distributions of beliefs feature more weight at values around the center than it is observed for choices. This is consistent with individuals forming beliefs



Notes: The two panels of the figure show subjects' beliefs about others' average decisions from 1 to 20 split by the respective relevant roles. The left panel shows the data for the EF Procedure. Role A (shaded) would profit from higher options while Role B (light) would profit from lower options. Similarly, the right panel shows the data for the EQ Procedure. Role a (shaded) would profit from higher options while Role b (light) would profit from lower options.

Figure 5: Beliefs by Roles

by using their own choices as anchors and then adjusting them towards more moderate values. With respect to role differences, however, the pattern is the same as for choices: Subjects in roles A and a (shaded) expect higher choices than those in roles B or b (light), respectively. The visual impression is confirmed by the corresponding regression coefficients presented in Columns 1 and 2 of Table 4. Both the effect of Role A for the EF Procedure and the one of Role a for the EQ Procedure are positive and statistically significant (p < 0.01 and p < 0.001). In terms of standard deviations, the effects amount to 0.32 for the EF Procedure 0.42 for the EQ Procedure, which are relative sizes that are very close to those found for decisions.<sup>22</sup>

For decisions, Figure 3 has established a strong positive correlation of 0.33 between the two procedures. The corresponding relationship between subjects' beliefs is also clearly positive (p < 0.001, two-sided), but the correlation coefficient only amounts to 0.18 is thereby much smaller than the one for decisions (see Figure B.1 in the appendix). In light of this finding, it is not surprising that the spillover effects in beliefs reported in Columns 3 and 4 of Table 4 are small and indistinguishable from zero. However, the point estimates are still positive, and the fact that they are statistically insignificant is, of course, no evidence against their existence. Instead, it points towards insufficient statistical power for identifying this subtle effect.

Overall, the analysis of beliefs yields patterns that are very similar to those for deci-

<sup>&</sup>lt;sup>22</sup>The expected sizes of coefficients as the result of treatment effects on decisions and relationship between decision and beliefs can be calculated following the same logic as for spillover in Footnote 21 by multiplying the respective effects found for decisions with the slopes from Figure 4. The predicted effects for beliefs amount to 1.37 for the EF Procedure and to 1.41 for the EQ Procedure. The actually observed effects are similar to these predictions and—just as observed for spillovers in Table 3—even a bit larger.

Table 4: Beliefs

Dependent variable	Belief about others' average decisions									
Model	0.	LS	SUR							
Procedure	EF	EQ	$\overline{EF}$	EQ						
	(1)	(2)	(3)	(4)						
Role A	1.849*** (0.585)		1.852*** (0.582)	0.231 (0.508)						
Role $a$		2.102*** (0.510)	0.639 $(0.582)$	2.103*** (0.508)						
Constant	6.497*** (0.390)	3.925*** (0.299)	$6.176^{***} $ $(0.504)$	3.809*** (0.440)						
Observations $R^2$	372 0.026	372 0.044	372 0.029	372 0.045						

*Notes:* Heteroscedasticity-consistent standard errors in parentheses. \* p < 0.1, \*\* p < 0.05, \*\*\* p < 0.01.

sions, and effect sizes are about as large as if the exogenously induced treatment effects had been due to preexisting differences between subjects (which is, of course, ruled out by random assignment to roles). Thus, the results suggest that the treatment effects arise (perhaps entirely) unconsciously and that subjects are mainly unaware of the egocentrism in their fairness judgments.

#### 4.3 Further Observations

The experiment allows for some further noteworthy insights. One of these is that subjects' choices do not seem to be significantly driven by concerns about ex-ante equality. Note that the implications of high choices in terms of procedural fairness are different between affected groups in which one of the players has Roles A and a (parallel groups) and other (crossed) groups. For crossed groups, high choices offset each other from an ex-ante perspective, because both subjects profit from inequality in one procedure and lose from it in the other. For parallel groups, however, ex-ante inequality from high choices cumulates, since one subject profits from inequality in both procedures, while the other loses in both. Thus, one could expect that decisions over players in crossed groups, i.e., those made by subjects in parallel groups, should generally be higher and more strongly positively correlated. Empirically, however, there is no indication for any such differences. The distributions of decisions do not significantly differ between the group types (p = 0.28)for the EF Procedure and p = 1.00 for the EQ procedure; Kolmogorov-Smirnov test, two-sided). Moreover, the positive correlation between decisions exists for both group types separately (p < 0.001 and p < 0.01, respectively), and there is no evidence for a difference in the correlations' magnitudes (p = 0.32). These insights are relevant because

the spillover effects of roles in Columns 3 and 4 of Tables 3 and 4, respectively, are identified by differences between crossed and parallel groups. In the latter, the effects of roles are larger. The above discussion suggests that the differences are not reflecting concerns about ex-ante equality but are indeed interpreted best as evidence for spillover effects.

By the experiment's design, roles do not induce differential proximity between players in adjoining groups, due to crossed roles. However, independently of roles, the design deliberately induces nominal groups by referring to players in each group as X and Y. Thus, participants decide over allocations between one player with the same name as themselves and one with a different name. In this dimension, the experiment mimics research on discrimination between minimal groups in social psychology (Tajfel, Billig, and Bundy, 1971; Billig and Tajfel, 1973) and economics (Chen and Li, 2009). If subjects favored their nominal in-group, they should choose a high option for EF Procedure if the receiving player sharing their name is in Role A, and a high option for the EQ procedure if the player is in Role a. In line with the literature, subjects exhibit significant nominal in-group bias in both procedures (p < 0.01 for the EF and p < 0.001 for the EQ Procedure, see Columns 1 and 2 of Table B.2 in the appendix). The effect sizes are smaller than the ones estimated for roles, although the differences are not significant. For beliefs, the corresponding effects are similar but weaker. Both estimated coefficients are positive, and the EQ procedure's effect is significant (p < 0.001, see Columns 3 and 4 of Table B.2). Since names were determined independently of roles, the estimated effects of roles and names are virtually unaffected by including the respective regressors jointly (see Table B.3).

A potential concern in many experiments involving human subjects is experimenter demand. It denotes the possibility that subjects try to conform to the experimenters' expectations. This experiment's design mitigates such concerns to the largest possible extent. An important design property is that treatment effects are identified betweensubjects, as opposed to within-subjects. The between-subject design avoids making subjects aware of the treatment differences or their own counterfactual behavior. In fact, in studying group bias, Chen and Li (2009) rely mainly on a within-subject design and use a between-subject treatment specifically to mitigate experimenter demand effects. As discussed above, this experiment studies (nominal) group bias as well, and this decision was, in part, also made to conceal the purpose of the design. Should subjects have tried to guess the research hypotheses, they might have ended up with the wrong one, or they would have had to balance multiple conflicting motives. Under these conditions, it seems implausible that the observed effects could be as large as observed in our data. For specific "demand treatments," De Quidt, Haushofer, and Roth (2018) find average effects of 0.13 standard deviations. In contrast, the effects observed in this experiment are multiple times as large. The effects are also present for beliefs, which we elicited with an incentivized procedure. Here, subjects would have had to give up their own money to conform to expectations. The data also generally seem well-behaved. For example, Table B.4 in the appendix shows that the randomly determined order of procedures matters for effect sizes in a conceivable way: effects on decisions are stronger for the respective procedure that comes first, although not significantly. Lastly, the next section will show that the treatment effects are not mainly due to a few subjects making extreme decisions but caused by the bulk of subjects exhibiting moderate bias.

## 5 Heterogeneity

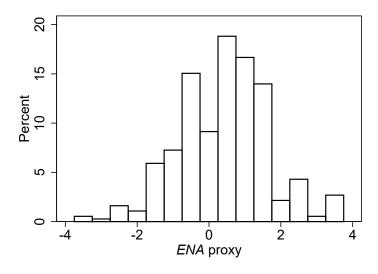
This section aims to relate the observed bias induced by roles to relevant personal attributes of subjects. In terms of determinants, we consider the role of different aspects of empathy as well as prosociality. Regarding outcomes, we study the relationship with progressivism and political orientation on the left–right spectrum.

A challenge for studying individual heterogeneity in the display of egocentric norm adoption is that the treatment effects of roles are identified not within but only between subjects. We therefore first discuss how the two decisions that any subject is taking can be converted into a single individual-specific proxy of egocentric norm adoption, denoted by ENA. We start from the self-evident fact that, if there were no treatment effect, it would make no difference for a given subject's decisions to which roles she has been assigned. The average choices conditional on roles would thus coincide with the unconditional average answers. A measure for how much a particular choice contributes to the treatment effect is thus given by how much it deviates from the unconditional average choice in the direction that favors the subject's relevant role. Therefore, we calculate for every decision its deviation from the average of choices for the respective procedure. For better comparability across procedures, we further divide the differences by the respective standard deviation, i.e., we transform subjects' choices into z-scores denoted by  $z_i^{\it EF}$  and  $z_i^{EQ}$  for the EF Procedure and the EQ Procedure. The ENA proxy is then constructed by adding the respective z-score if a subject has the relevant roles A or a and by subtracting it if the role is B or b. Using the indicator function  $1_A(r_i^{EF})$  for whether subject i's role for the EF Procedure is A and the analogously defined indicator functions for the three remaining procedure–role combinations, we thus calculate the ENA proxy as follows:

$$ENA_i \equiv \left[1_A \left(r_i^{EF}\right) - 1_B \left(r_i^{EQ}\right)\right] z_i^{EF} + \left[1_a \left(r_i^{EF}\right) - 1_b \left(r_i^{EQ}\right)\right] z_i^{EQ} \tag{7}$$

Deviations that are aligned with a subject's relevant role contribute to higher values of ENA, while deviations that are opposed to the relevant role lead to a decrease. A subject who makes average decisions for both procedures receives a value of zero, irrespective of her roles. On the other hand, a subject who, e.g., makes a high decision for the

EF Procedure and a low decision for the EQ Procedure receives a large positive value if her roles are A and b, values closer to zero if her roles are A and a or B and b, and a large negative value of ENA if her roles are B and a. For any individual subject, a high or low value of the ENA proxy can, of course, be entirely due to her true fairness convictions, which might happen to coincide or conflict with the interests of her roles, leading to noise in the proxy. However, the proxy is informative when considering many subjects jointly.



*Notes:* The figure shows the distribution of the *ENA* proxy calculated according to Equation 7 for the full sample, using a bin width of 0.5.

Figure 6: Distribution of the *ENA* proxy

Figure 6 shows the distribution of the ENA proxy in the full sample. Its mean value is 0.42, which is by construction equal to the mean of the two treatment effects in terms of standard deviations (0.37 for the EF Procedure and 0.47 for the EQ Procedure; see Section 4.1). In line with the previous findings, this positive average is significantly different from zero (p < 0.001, two-sided t-test). The figure shows that the positive average value, i.e., the effects of roles, is not mainly driven by a few subjects at the extremes but importantly also by many subjects who exhibit moderate levels of bias in the direction of their roles' interests. When restricting the sample to, e.g., only those 262 out of 372 subjects for whom the value of the ENA proxy lies in the interval [-1.5, 1.5], the average value is still significantly positive (p < 0.001, two-sided t-test).<sup>23</sup>

#### 5.1 Survey Measures

After the main experiment, subjects completed several questionnaires that were selected to measure potentially relevant personal characteristics. Below, we introduce the elicited

 $<sup>^{23}</sup>$ In particular, the restriction excludes all subjects who favor their own roles to the largest possible extent, i.e., those with Roles A and a choosing Option 20 for both procedures, with Roles A and b choosing Option 20 for the EF Procedure and Option 1 for the EQ Procedure, with Roles B and a choosing Options 1 and 20, respectively, and with Roles B and b choosing Option 1 for both procedures.

classes of characteristics.

**Empathy** From a conceptual perspective, empathy is the personality trait that is most directly relevant for the effect under study. To measure empathy, we use the wellestablished Interpersonal Reactivity Index (IRI) developed by Davis (1980), which consists of four subscales. The first, perspective-taking, should be of particular importance for nonegocentric behavior (Davis, 1983). The IRI measures perspective-taking with questions such as "I believe that there are two sides to every question and try to look at them both" (p. 11). Higher scores thus indicate that people typically make an effort to "put themselves in others' shoes," i.e., that they should tend to abstract from their roles in the experiment. Second, fantasy measures people's tendency to identify with fictitious characters, e.g., in books or movies. Third, empathic concern captures the extent to which people feel for others who are in need. Fourth, personal distress addresses whether people feel anxious when they witness others' suffering. While the first three aspects usually have a positive connotation, the last one tends to inhibit compassionate behavior because it makes people turn away from others' problems. Therefore, people who are themselves advantaged and prone to personal distress could avoid thinking about disadvantaged others and exhibit pronounced egocentrism.

**Prosociality** The experiment in this paper aims to show a bias that speaks of egocentrism. In contrast, the design mutes the role of egoism with the absence of selfish incentives. However, to study the role of prosociality empirically, we included the qualitative item for altruism, positive reciprocity, and trust from the Preference Survey Module (Falk et al., 2016; Falk et al., 2018).

Values A leading approach in modern moral philosophy to understand how moral values vary across the political spectrum is Moral Foundations Theory (MFT) (Haidt and Joseph, 2004; Haidt and Graham, 2007; Graham, Haidt, and Nosek, 2009), which traces (cultural) differences in ethical judgments to the respective weights attached to five distinct dimensions of moral intuitions: harm/care, i.e., being compassionate with those in need; fairness/reciprocity; ingroup/loyalty; authority/respect; and purity/sanctity. We included the 30-item Moral Foundations Questionnaire (MFQ) that was created by a group of researchers around the developers of MFT.<sup>24</sup> As suggested by the developers, we

<sup>&</sup>lt;sup>24</sup>The questionnaire is publicly available on the web (https://moralfoundations.org/questionnaires/; retrieved in May 2020).

aggregate the five subscales into a single measure of progressivism.<sup>25</sup>

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progressivism = (harm/care + fairness/reciprocity) \div 2
- (ingroup/loyalty + authority/respect + purity/sanctity) \div 3
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We also include a simple question about people's political attitude on scale from left to right (European Social Survey, 2014). The variables progressivism and political attitude turn out to be highly correlated in the expected direction (r = -0.51, p < 0.001). Conceptually, we consider the above measures of values as potential outcomes of egocentric norm adoption. In contrast, the personality traits of empathy and prosociality are plausible determinants.

Personality Controls As control variables, we include the qualitative preference items by Falk et al. (2016) for risk preferences, time preferences, and negative reciprocity. Moreover, the questionnaires included the Big Five personality inventory, which is probably the most widely used framework to study people's personalities. Specifically, we use a translation of the 15-item BFI-S scale developed by Gerlitz and Schupp (2005). The Big Five traits are: openness, capturing interest in new experiences; conscientiousness, encompassing whether a person is determined and organized; extraversion, i.e, how much people like to engage with others; agreeableness, measuring altruistic motivation and cooperative behaviors; and neuroticism, referring to emotional instability and anxiety.

**Demographic Controls** The elicited sociodemographic controls are subjects' gender (female, male, or diverse) and age, enrollment at a university, and gross monthly income in euros. The latter is converted into log income as  $\ln(income + 1)$ .

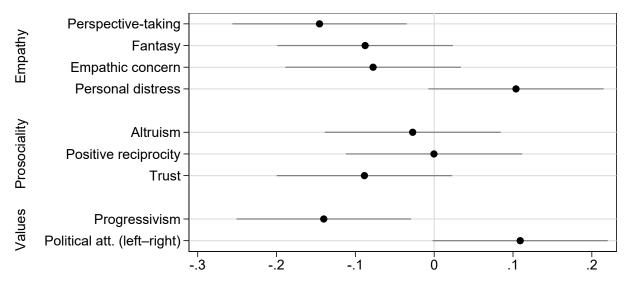
Studying heterogeneity in subjects' behavior is more demanding than the previous analyses in Section 4 for two reasons: First, individual subjects' behavior can have stronger effects on results, since the sample is—intuitively—split, and the resulting subsamples are smaller than the full one. Second, we use answers to unincentivized survey questions, which some subjects might not have taken very seriously or had difficulty answering. Therefore, we restrict the sample to individuals who had no major difficulties understanding the experiment and took answering the survey questions seriously. The experiment included several control questions, and subjects could only progress once they had answered them all correctly. We automatically recorded the number of incorrectly submitted questions. We exclude those subjects above the 90<sup>th</sup> percentile of the distribution of mistakes. After the questionnaires, we asked subjects about the reliability of their answers.

 $<sup>^{25}</sup>$ A very similar measure is used by Enke (2020), who excludes the purity/sanctity dimension and focuses on communal vs. universal values in the context of political competition. In our data, these two measures based on the same questionnaire have a correlation of 0.96, i.e., they hardly differ.

We exclude subjects how gave answers below the tenth percentile. These restrictions leave us with 312 subjects, for whom all previous results from Section 4 replicate. Results for the full sample are provided in Appendix B.

## 5.2 Observed Heterogeneity

Figure 7 considers the correlations between the ENA and the different measures of empathy, prosociality, and values. For the four dimensions of empathy, a pattern arises that



Notes: The figure shows the Pearson correlation coefficient for the ENA proxy introduced in Equation 7 and the respective survey measure. Gray bars indicate 95% confidence intervals. The analysis excludes subjects above the 90<sup>th</sup> percentile in the distribution of mistakes in the control questions and those whose self-reported reliability regarding the survey answers lies below the 10<sup>th</sup> percentile, leaving 312 subjects.

Figure 7: Correlations with the *ENA* Proxy

is consistent with the theoretical predictions: the three "positive" facets of empathy—perspective-taking, fantasy, and empathic concern—are negatively correlated with egocentric norm adoption, i.e., higher empathy in these regards leads to lower egocentric bias. On the other hand, the "negative" side of empathy—personal distress—leads to a stronger egocentric bias, potentially because subjects avoid thinking about being in a position that would upset them. The correlation with perspective-taking, which is the opposite of egocentrism, is significantly negative (p = 0.01, two-sided), and the correlation with personal distress is (weakly) significantly positive (p = 0.07, two-sided). The correlations with fantasy and empathic concern are not statistically significant (p > 0.1, two-sided). We observe a significant correlation for neither of the prosociality measures (p > 0.1). In particular, the correlation between the ENA proxy and altruism is close to zero, consistent with the irrelevance of selfishness. For moral values, we find a negative correlation with the ENA proxy for progressivism (p = 0.01), constructed using the MFQ. People holding liberal values thus seem to exhibit less of the egocentric bias than conservatives. Consistent with this finding, people leaning to the political right show a stronger

bias than those leaning to the left (p = 0.05).<sup>26</sup> While the significance of the correlation with progressivism only holds in the restricted sample used in this section, the qualitative results for empathy and prosociality are the same for the full sample (see Figure B.2 in the appendix). Interestingly, among the demographic control variables (age, female vs. male, student, and log income; not shown), no significant correlations with the *ENA* proxy are observed.

The analysis of heterogeneity is deliberately descriptive and does not aim at making causal claims. However, because many of the variables considered above are correlated, it would be interesting to see if the observed correlations with the potential determinants, i.e., with the different facts of empathy and prosociality, merely reflect different symptoms of maybe just a single underlying relationship or whether they also hold conditionally on each other. We therefore employ a multivariate regression framework. The first columns shows the results of regressing the ENA dummy simultaneously on all four facets of empathy, as in all other columns controlling for other personality characteristics (see Section 5.1 above) and showing standardized coefficients. The estimates confirm the insights from Figure 7. Strong perspective-taking is associated with a smaller egocentric bias in decision making (p = 0.02). The coefficients for fantasy and empathic concern point towards the same direction but remain insignificant (p > 0.1), while the positive association between the ENA proxy and personal distress is now significant (p < 0.01). Column 2 considers the three measures of prosociality and does not find significant coefficients for either of them. Column 3 considers the variables pertaining to empathy and prosociality jointly. The estimates remain stable and the only minor qualitative change is that the negative coefficient for trust becomes (weakly) statistically significant (p = 0.07). The final column adds demographic controls for capturing further influences that might not be accounted for by the personality controls. However, the effect on estimates is negligible. The coefficients for all control variables can be found in Table B.5 in the appendix. All of the qualitative results from the Table replicate also for the full sample of all 372 participants (see Table B.6 in the appendix).

Overall, the main result is that empathy significantly contributes to explaining differences in the effects of roles. The empirical associations between egocentric norm adoption and empathy are consistent with the theory that underlies the used measures. The association between the strength of the egocentric bias and perspective-taking is negative, and the association with personal distress is positive.

<sup>&</sup>lt;sup>26</sup>Progressivism and political attitude are strongly correlated in my data (r - 0.51) in the full and r = -0.49 in the restricted sample; both p < 0.001, two-sided). The correlations of progressivism and universalism in the data is r = 0.96 (p < 0.001). The results using the two variables are very similar but stronger for progressivism (which uses more items).

Table 5: Heterogeneity

Dependent variable	ENA proxy								
	(1)	(2)	(3)	(4)					
Perspective-taking	-0.179** (0.0748)		-0.176** (0.0754)	-0.185** (0.0754)					
Fantasy	-0.0755 $(0.0728)$		-0.0999 $(0.0760)$	-0.0886 $(0.0786)$					
Empathic concern	-0.0303 $(0.0718)$		-0.00779 $(0.0783)$	-0.0109 $(0.0792)$					
Personal distress	0.236*** (0.0718)		0.248*** (0.0712)	$0.261^{***} $ $(0.0719)$					
Altruism		-0.0442 $(0.0635)$	-0.00313 $(0.0713)$	-0.00408 (0.0718)					
Positive reciprocity		0.0111 $(0.0608)$	$0.0400 \\ (0.0601)$	$0.0473 \\ (0.0611)$					
Trust		-0.0956 $(0.0620)$	-0.111* (0.0606)	-0.104* (0.0618)					
Personality controls Demographic controls	Yes No	Yes No	Yes No	Yes Yes					
Observations $R^2$	312 0.108	$312 \\ 0.054$	312 0.120	312 0.130					

Notes: The table reports standardized coefficients. Heteroscedasticity-consistent standard errors in parentheses. \*p < 0.1, \*\*p < 0.05, \*\*\*p < 0.01. The analysis excludes subjects above the 90<sup>th</sup> percentile in the distribution of mistakes in the control questions and those whose self-reported reliability regarding the survey answers lies below the 10<sup>th</sup> percentile, leaving 312 subjects. The personality controls are risk and time preferences along with the Big Five traits. The demographic controls are gender (categories: female, male, and diverse), age and squared age, a dummy for being enrolled at university, and the log of monthly gross income in euros, calculated as  $\ln(income + 1)$ .

## 6 Discussion

This paper has provided experimental evidence for the phenomenon of egocentric norm adoption. If people would benefit from others following certain norms, they adopt these principles themselves. The experiment's central property was that people's own decisions were in no way relevant for their own payoffs but that subjects depended on others' choices in the same decision contexts. Subjects within groups of two players received points according to two procedures. One of these implied a tradeoff between equality and efficiency, and the other involved the norms of equality and equity. Depending on their respective roles, subjects personally gained from one of the norms involved in a procedure and lost from the other. The players of each group decided over the subjects in the respective succeeding groups along a circle. The roles of players (in terms of favoring norms) were crossed, such that players shared exactly one role with each subject over which they decided. We found an egocentric bias for both procedures, and corresponding biases of similar size also in subjects' beliefs about others' behavior. The heterogeneity analysis provides additional support for egocentrism as the critical driving force behind the treatment effects of roles: the bias is largest among subjects who report weak perspectivetaking.

Future research on egocentric norm adoption could delve even deeper into its underlying mechanism. Regarding the mechanism, this paper has focused on unconscious egocentrism, which is empirically supported by the results for perspective-taking. However, the findings of this paper would also be compatible with multiple mechanisms being at work simultaneously. The biases in decisions could, in part, also result from subjects confusing diagnostic with causal contingencies (Quattrone and Tversky, 1984; Shafir and Tversky, 1992), whereby subjects would try to "induce" a desired behavior by others with their own actions. Similarly, the results for decisions and beliefs could to some extent reflect "wishful thinking" (see, e.g., Mijovic-Prelec and Prelec, 2010; Engelmann et al., 2019). Future work could adapt this paper's experimental design but put some subjects into a position where a non-human random device like a computer determines their own payoffs. If subjects' decisions partly also reflect a direct concern with others' choice behavior, the egocentric biases should become smaller.

For methodology, the paper's findings and those by Hofmeier and Neuber (2019) caution against the equivalent use of elicitation procedures for social preferences with or without role uncertainty. Iriberri and Rey-Biel (2011) and Zhan, Eckel, and Grossman (2020) find increased pro-sociality in (modified) dictator games when it is ex-ante uncertain whether a given subject will be paid as dictator according to one of her own decisions or as a receiver according to a decision by another subject. Egocentric norm adoption can accommodate these findings, and it implies more. Whenever subjects play multiple games within an experiment, researchers who want to avoid bias should be aware that

interests can induce norms, potentially creating spillovers between different contexts.

The idea of "acting like one would want others to act" is related to the concept of rule-utilitarianism advocated as a normative principle by Harsanyi (1977). Thereby "an individual act should be considered to be morally right if it conforms to the correct moral rule applying to this type of situation – regardless of whether it is the act that will or will not yield the highest possible social utility on this particular occasion" (p. 32). In particular, Harsanyi applies the logic of rule-utilitarianism to voting contexts. He shows that, if people were following rule-utilitarianism, this would to some extent resolve the paradox of voting, which describes the seemingly irrational behavior of people who incur the costs of voting in large elections (e.g., in terms of time) while almost certainly not being pivotal for the outcome (Downs, 1957). Rule-utilitarianism is an abstract normative concept that is probably unfamiliar to most potential voters. In contrast, egocentric norm adoption is grounded in people's intuition. It could explain why people sometimes resemble rule-utilitarians: like the subjects in the experiment by Hofmeier and Neuber (2019), they incur costs because they would like others to do the same. In the examples discussed by Harsanyi (1977), votes must exceed a certain threshold for the socially optimal option to be implemented, e.g., because a fixed number of votes is cast in favor of the respective alternative option that is socially suboptimal. Harsanyi does not discuss how these votes come about. Under the label of ethical voting, some contributions have made suggestions for positive theories that resolve the paradox of voting. Feddersen and Sandroni (2006a, 2006b) and Coate and Conlin (2004) develop closely related models of voting over two alternative options. Both approaches assume ethical voters who follow rules that they would want to be followed by everybody who favors the same option as they do themselves, taking as given the behavior of non-ethical voters and ethical voters who favor the opposite option.<sup>27</sup> However, one might still be puzzled why people who behave ethically in terms of incurring (individually useless) voting costs should disagree on the optimal policy. Egocentric norm adoption offers an explanation: people consider options as fair from which they would personally profit, i.e., the selfish option subjectively is perceived as ethically demanded. Thus, a parsimonious behavioral principle explains prosocial behavior in turning out to vote and selfish behavior in terms of supported policies.

The models by Feddersen and Sandroni (2006a, 2006b) and Coate and Conlin (2004) both feature heterogeneous costs of voting. The rules that ethical voters adopt prescribe voting if and only if voting costs do not exceed a certain threshold value. That is because ethical voters aim at maximizing the utility of a group, and winning by an excessive margin would be wasteful. Thus, in the above models, heterogeneity enables coordination

<sup>&</sup>lt;sup>27</sup>The two models differ in the objectives that individuals pursue: in the model by Feddersen and Sandroni (2006a), ethical voters maximize the utility of all people, while Coate and Conlin (2004) assume that they maximize only the utility of those people who share their own preferences, i.e., of those who are in their group.

between voters who favor the same option. However, this model implication is at odds with experiments on public goods games that feature heterogeneity and find that heterogeneity reduces efficiency (see Fischbacher, Schudy, and Teyssier, 2014 and references therein). <sup>28</sup> Contrary to rule-utilitarianism, egocentric norm adoption is in line with these results since it implies that people will opt for sets of rules in their own favor. Incorporating egocentric rule-following into voting models and testing the resulting predictions would be a further exciting subject of future research.

Beyond voting, many other real-world phenomena can be understood more clearly when considering the egocentric nature of norm adoption. Arguably the most important collective action problem of our time is the fight against global warming, i.e., in particular the need to reduce global carbon dioxide emissions. It is true for all countries that unilateral action is pointless from a self-interested and strictly (act-) utilitarian perspective, as costs are high and private returns (for a given country) are low. This insight applies to China and the United States, which account for 29.7% and 13.9% of global emissions in 2019, respectively (Crippa et al., 2019), but even more so, e.g., to the Marshall Islands, which are a small country in the Pacific Ocean that is part of Micronesia. However, the country is itself endangered by rising sea levels and has announced a plan for reducing carbon dioxide emissions to zero by 2050 (Malo, 2018). It is conceivable that behind this step mainly stands the wish that other countries should do the same, thereby hopefully securing the islands' future existence. In this context, the egocentric adoption of norms is also closely linked to setting an example (cf. Gächter et al., 2012; Gächter, Nosenzo, and Sefton, 2013). Indeed, Bicchieri et al. (2020) show that observing others breaching a norm erodes people's own propensity to comply with the norm, and others who obey a norm heighten compliance. This finding suggests that acting upon norms that one would want others to follow can be useful in the long-term. If one's behavior is observable, it indeed increases the chance that others will follow the norm too. Thus, egocentric norms adoption might be an evolutionary selected, automatic way of endorsing norms.

In 2020, people worldwide have been able to watch new norms emerge in real-time in the course of the COVID-19 pandemic. Face masks have become ubiquitous, although they are not mainly protecting the wearer herself but instead other people of whom many are strangers. In light of this paper's findings, the relative ease of wearing face masks emerging as a new social norm is probably due to almost everybody wanting others to wear them (holding for almost all informed individuals). The finding implies that stressing differences in vulnerability between sociodemographic groups might be counterproductive in terms of communication. Undue emphasis on the fact that young people are in less danger of dying from COVID-19 might hamper sustaining social norms crucial for containing the pandemic.

<sup>&</sup>lt;sup>28</sup>Similarly, Kube et al. (2015) find that heterogeneity also makes it more difficult for subjects to agree on efficiency-enhancing institutions, i.e., sets of mandatory rules.

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## Appendix A Theoretical Details

## A.1 Proofs

*Proof of Lemma 1.* The first order conditions for Equations 1 and 2 are as follows.

$$\tilde{\alpha} Pay'(\tilde{c}_{EF}, role_{EF}) - \tilde{\beta}_1 Ineff'(\tilde{c}_{EF}) - Inequal'_{EF}(\tilde{c}_{EF}) = 0$$
  
 $\tilde{\alpha} Pay'(\tilde{c}_{EQ}, role_{EQ}) - \tilde{\beta}_2 Unfair'(\tilde{c}_{EQ}) - Inequal'_{EQ}(\tilde{c}_{EQ}) = 0$ 

Choose any  $\tilde{c}_{EF}$ ,  $\tilde{c}_{EQ} \in (1, 20)$  and fix  $\alpha$  at a positive value such that the two remaining true fairness parameters that follow from the first-order conditions are also strictly positive.

$$\beta_{1} = \frac{\alpha Pay'(\tilde{c}_{EF}, role_{EF}) - Inequal'_{EF}(\tilde{c}_{EF})}{Ineff'(\tilde{c}_{EF})},$$

$$\beta_{2} = \frac{\alpha Pay'(\tilde{c}_{EQ}, role_{EQ}) - Inequal'_{EQ}(\tilde{c}_{EQ})}{Unfair'(\tilde{c}_{EQ})}.$$

Recall that the agent's prior beliefs about the values of the unknown parameters are independently normally distributed with standard deviations of one. The expected values are the true values for  $\beta_1$  and  $\beta_2$ , while it is  $(1-e)\alpha$  for  $\alpha$ , with  $e \in [0,1]$ . Thus, the likelihood of any set of values under the prior beliefs is

$$\mathcal{L} = \phi(\tilde{\alpha} - (1 - e)\alpha) \times \phi(\tilde{\beta}_1 - \beta_1) \times \phi(\tilde{\beta}_2 - \beta_2),$$

where  $\phi$  denotes the probability density function of the standard normal distribution. The agent maximizes the corresponding log likelihood subject to the first order conditions.

$$\max_{\tilde{\alpha},\tilde{\beta}_{1},\tilde{\beta}_{2}} Constant - \frac{(\tilde{\alpha} - (1 - e)\alpha)^{2} + (\tilde{\beta}_{1} - \beta_{1})^{2} + (\tilde{\beta}_{2} - \beta_{2})^{2}}{2}$$
s.t.  $\tilde{\alpha} Pay'(\tilde{c}_{EF}, role_{EF}) - \tilde{\beta}_{1} Ineff'(\tilde{c}_{EF}) - Inequal'_{EF}(\tilde{c}_{EF}) = 0$ 

$$\tilde{\alpha} Pay'(\tilde{c}_{EQ}, role_{EQ}) - \tilde{\beta}_{2} Unfair'(\tilde{c}_{EQ}) - Inequal'_{EQ}(\tilde{c}_{EQ}) = 0$$

In the below notation, derivatives of functions are indicated by small letters and the affective choice as an argument of the functions is omitted. Moreover, define

$$D = ineff^{2} \left( unfair^{2} + pay(role_{EQ})^{2} \right) + unfair^{2} pay(role_{EF})^{2}.$$

Observe that D is always strictly positive. The unique solution of the maximization problem has the following properties.

$$\tilde{\alpha} - \alpha = -\frac{e \,\alpha \, ineff^2 \, unfair^2}{D} \tag{A.1}$$

$$\tilde{\beta}_1 - \beta_1 = -\frac{e \alpha ineff unfair^2 pay(role_{EF})}{D}$$

$$\tilde{\beta}_2 - \beta_2 = -\frac{e \alpha ineff^2 unfair pay(role_{EQ})}{D}$$
(A.2)

$$\tilde{\beta}_2 - \beta_2 = -\frac{e \,\alpha \, ineff^2 \, unfair \, pay(role_{EQ})}{D} \tag{A.3}$$

Part 1 of the lemma follows from Equation A.1. Parts 2a and 2b follow from Equations A.2 and A.3. 

*Proof of Lemma 2.* The first order conditions for Equations 3 and 4 are as follows.

$$\tilde{\alpha} Pay'(\tilde{c}_{EF}, role_{EF}) - \tilde{\beta}_1 Ineff'(\tilde{c}_{EF}) - \tilde{\gamma} Inequal'_{EF}(\tilde{c}_{EF}) = 0$$
  
 $\tilde{\alpha} Pay'(\tilde{c}_{EQ}, role_{EQ}) - \tilde{\beta}_2 Unfair'(\tilde{c}_{EQ}) - \tilde{\gamma} Inequal'_{EO}(\tilde{c}_{EQ}) = 0$ 

Choose any  $\tilde{c}_{EF}$ ,  $\tilde{c}_{EQ} \in (1, 20)$  and fix  $\alpha$  at a positive and  $\gamma$  at a strictly positive value such that the two remaining true fairness parameters that follow from the first-order conditions are also strictly positive.

$$\beta_{1} = \frac{\alpha Pay'(\tilde{c}_{EF}, role_{EF}) - \gamma Inequal'_{EF}(\tilde{c}_{EF})}{Ineff'(\tilde{c}_{EF})},$$

$$\beta_{2} = \frac{\alpha Pay'(\tilde{c}_{EQ}, role_{EQ}) - \gamma Inequal'_{EQ}(\tilde{c}_{EQ})}{Unfair'(\tilde{c}_{EQ})}.$$

Recall that the agent's prior beliefs about the values of the unknown parameters are independently normally distributed with standard deviations of one. The expected values are the true values for  $\beta_1$ ,  $\beta_2$ , and  $\gamma$ , while it is  $(1-e)\alpha$  for  $\alpha$ , with  $e \in [0,1]$ . Thus, the likelihood of any set of values under the prior beliefs is

$$\mathcal{L} = \phi(\tilde{\alpha} - (1 - e)\alpha) \times \phi(\tilde{\beta}_1 - \beta_1) \times \phi(\tilde{\beta}_2 - \beta_2) \times \phi(\tilde{\gamma} - \gamma) ,$$

where  $\phi$  denotes the probability density function of the standard normal distribution. The agent maximizes the corresponding log likelihood subject to the first order conditions.

$$\max_{\tilde{\alpha},\tilde{\beta}_{1},\tilde{\beta}_{2},\tilde{\gamma}} Constant - \frac{(\tilde{\alpha} - (1 - e)\alpha)^{2} + (\tilde{\beta}_{1} - \beta_{1})^{2} + (\tilde{\beta}_{2} - \beta_{2})^{2} + (\tilde{\gamma} - \gamma)^{2}}{2}$$
s.t.  $\tilde{\alpha} Pay'(\tilde{c}_{EF}, role_{EF}) - \tilde{\beta}_{1} Ineff'(\tilde{c}_{EF}) - \tilde{\gamma} Inequal'_{EF}(\tilde{c}_{EF}) = 0$ 

$$\tilde{\alpha} Pay'(\tilde{c}_{EQ}, role_{EQ}) - \tilde{\beta}_{2} Unfair'(\tilde{c}_{EQ}) - \tilde{\gamma} Inequal'_{EQ}(\tilde{c}_{EQ}) = 0$$

In the below notation, derivatives of functions are indicated by small letters and the

affective choice as an argument of the functions is omitted. Moreover, define

$$D = ineff^{2} \left( unfair^{2} + inequal_{EQ}^{2} + pay(role_{EQ})^{2} \right)$$

$$+ unfair^{2} \left( inequal_{EF}^{2} + pay(role_{EF})^{2} \right)$$

$$+ \left( inequal_{EF} pay(role_{EQ}) - inequal_{EQ} pay(role_{EF}) \right)^{2}.$$

Observe that D is always strictly positive. The unique solution of the maximization problem has the following properties.

$$\tilde{\alpha} - \alpha = -\frac{e \alpha \left[ ineff^2 \left( unfair^2 + inequal_{EQ}^2 \right) + unfair^2 inequal_{EF}^2 \right]}{D}$$
(A.4)

$$e \alpha ineff \left[ \left( unfair^2 + inequal_{EQ}^2 \right) pay(role_{EF}) - inequal_{EF} inequal_{EQ} pay(role_{EQ}) \right]$$

$$\tilde{\beta}_1 - \beta_1 = -\frac{-inequal_{EF} inequal_{EQ} pay(role_{EQ})}{D}$$
(A.5)

$$e \alpha unfair \left[ \left( ineff^2 + inequal_{EF}^2 \right) pay(role_{EQ}) \right]$$

$$\tilde{\beta}_2 - \beta_2 = -\frac{-inequal_{EF} inequal_{EQ} pay(role_{EF})}{D}$$
(A.6)

$$\tilde{\gamma} - \gamma = -\frac{e \,\alpha \left(ineff^2 \,inequal_{EQ} \,pay(role_{EQ}) + unfair^2 \,inequal_{EF} \,pay(role_{EF})\right)}{D} \tag{A.7}$$

Part 1 of the Lemma directly follows from Equation A.4. The results for  $\tilde{\gamma}$  of Parts 2a and 2b directly follow from Equation A.7. To see both statements' results for  $\beta_1$ and  $\beta_2$ , observe that  $inequal_{EQ}^2 pay(role_{EF}) < inequal_{EF} inequal_{EQ} pay(role_{EQ})$  implies that  $inequal_{EF}^2 pay(role_{EQ}) > inequal_{EF} inequal_{EQ} pay(role_{EF})$ . Thus, for roles (A, a), it cannot hold that  $\tilde{\beta}_1 < \beta_1$  and at the same time  $\tilde{\beta}_2 < \beta_2$ . Conversely, for roles (B, b), it cannot hold that  $\tilde{\beta}_1 > \beta_1$  and at the same time  $\tilde{\beta}_2 > \beta_2$ . Parts 2c and 2d directly follow from Equations A.5 and A.6. 

## A.2Hypothesis Testing

We conduct the following statistical hypothesis test:

$$H_0: \delta_1 \le 0 \lor \zeta_1 \le 0$$
  
 $H_1: \delta_1 > 0 \land \zeta_1 > 0$ 

Thus, we want to reject the Null hypothesis of either coefficient being weakly negative, i.e., we want to establish that both coefficients are strictly positive. Note that in Equations 5 and 6,  $1_A(r_i^{EF})$  and  $1_a(r_i^{EQ})$  are statistically independent, since all combinations or roles appear with exactly the same frequencies in the experiment. Moreover,  $\epsilon_i$  and  $\eta_i$  are each pairwise statistically independent of both  $1_A(r_i^{EF})$  and  $1_a(r_i^{EQ})$ , since assignment to roles is randomized.

To understand the implications of the above discussion for the hypothesis test, consider

the following scenario: we have estimated the two regression equations 5 and 6 and retrieved the p-values  $p_{\delta}$  and  $p_{\zeta}$  referring to the two-sided significance tests of  $\delta_1$  and  $\zeta_1$ , respectively. The p-value referring to the above hypothesis test is the probability of either of the two t-values under  $H_0$  ( $t_{\delta}^0$  and  $t_{\zeta}^0$ ) being as large as they are ( $t_{\delta}$  and  $t_{\zeta}$ ), with at least one of  $\delta_1$  and  $\zeta_1$  being smaller than zero.

$$p = P(t_{\delta}^{0} \geq t_{\delta} \wedge t_{\zeta}^{0} \geq t_{\zeta} \mid \delta_{1} \leq 0 \vee \zeta_{1} \leq 0)$$

$$= P(t_{\delta}^{0} \geq t_{\delta} \wedge t_{\zeta}^{0} \geq t_{\zeta} \mid \delta_{1} \leq 0) \times P(\delta_{1} \leq 0 \mid \delta_{1} \leq 0 \vee \zeta_{1} \leq 0)$$

$$+ P(t_{\delta}^{0} \geq t_{\delta} \wedge t_{\zeta}^{0} \geq t_{\zeta} \mid \zeta_{1} \leq 0) \times P(\zeta_{1} \leq 0 \mid \delta_{1} \leq 0 \vee \zeta_{1} \leq 0)$$

$$- P(t_{\delta}^{0} \geq t_{\delta} \wedge t_{\zeta}^{0} \geq t_{\zeta} \mid \delta_{1} \leq 0 \wedge \zeta_{1} \leq 0) \times P(\delta_{1} \wedge \zeta_{1} \leq 0 \mid \delta_{1} \leq 0 \vee \zeta_{1} \leq 0)$$

$$\leq P(t_{\delta}^{0} \geq t_{\delta} \wedge t_{\zeta}^{0} \geq t_{\zeta} \mid \delta_{1} \leq 0) + P(t_{\delta}^{0} \geq t_{\delta} \wedge t_{\zeta}^{0} \geq t_{\zeta} \mid \zeta_{1} \leq 0)$$

$$\leq P(t_{\delta}^{0} \geq t_{\delta} \wedge t_{\zeta}^{0} \geq t_{\zeta} \mid \delta_{1} = 0 \wedge \zeta_{1} \rightarrow \infty) + P(t_{\delta}^{0} \geq t_{\delta} \wedge t_{\zeta}^{0} \geq t_{\zeta} \mid \delta_{1} \rightarrow \infty \wedge \zeta_{1} = 0)$$

$$= P(t_{\delta}^{0} \geq t_{\delta} \mid \delta_{1} = 0) + P(t_{\zeta}^{0} \geq t_{\zeta} \mid \zeta_{1} = 0)$$

$$= \frac{p_{\delta} + p_{\zeta}}{2}$$

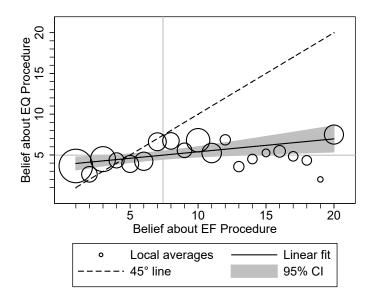
The average of the separate two-sided p-values from the OLS regressions is thus an upper bound for p-value of the joint hypothesis test.

## Appendix B Empirical Details

Table B.1: Sample Composition

	Obs.	Mean	Median	Min.	Max.
Age	372	25.583	24	18	72
Female	369	0.599	1	0	1
University student	372	0.836	1	0	1
Income	372	741.185	600	0	3500
Log income	372	6.220	6.398595	0	8.160804

*Notes:* Log income is calculated as ln(income + 1)



Notes: The figure groups subjects by their beliefs about others' average decisions for the EF Procedure. For each option on the horizontal axis, the figure plots the respective subjects' average belief about others' decisions for the EQ Procedure on the vertical axis. The sizes of circles correspond to the respective numbers of subjects. The dashed line indicates 45 degrees. The gray lines indicate the averages of beliefs about the EF Procedure (vertical) and the EQ Procedure (horizontal). The solid black line represents the linear fit from an OLS regression, and the shaded area around it corresponds to the 95% confidence interval based on heteroscedasticity-consistent standard errors.

Figure B.1: Relationship Between the Two Predictions

Table B.2: Nominal Group Bias in Decisions

Dependent variable	Decision		Belief	
Procedure	EF	$\overline{EQ}$	$\overline{EF}$	EQ
	(1)	(2)	(3)	(4)
Same name is $A$	2.086*** (0.731)		0.958 (0.590)	
Same name is $a$		2.441*** (0.687)		1.715*** (0.513)
Constant	$7.454^{***}$ $(0.503)$	$4.457^{***} \\ (0.437)$	6.935*** (0.417)	4.118*** (0.300)
Observations $R^2$	372 0.022	372 0.033	372 0.007	372 0.029

Notes: Heteroscedasticity-consistent standard errors in parentheses. \* p < 0.1, \*\* p < 0.05, \*\*\* p < 0.01.

Table B.3: Nominal Group Bias in Decisions (with Roles)

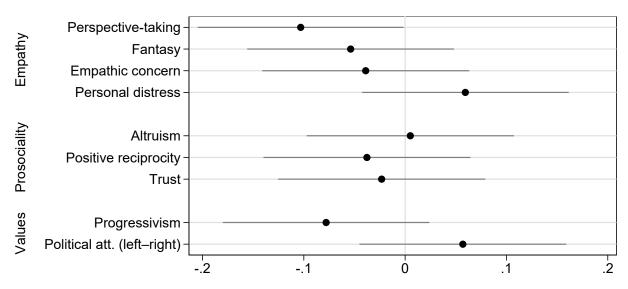
Dependent variable	Decision		riable Decision		Be	Belief	
Procedure	EF	EQ	EF	EQ			
	(1)	(2)	(3)	(4)			
Same name is $A$	2.086*** (0.720)		0.958 (0.583)				
Same name is $a$		2.441*** (0.669)		$1.715^{***} \\ (0.502)$			
Role A	$2.602^{***}$ $(0.720)$		1.849*** (0.583)				
Role a		3.140*** (0.669)		$2.102^{***} \\ (0.502)$			
Constant	6.160*** (0.617)	2.887*** (0.439)	6.016*** (0.500)	3.067*** (0.367)			
Observations $R^2$	$372 \\ 0.055$	$372 \\ 0.087$	372 0.033	$372 \\ 0.073$			

Notes: Heteroscedasticity-consistent standard errors in parentheses. \* p < 0.1, \*\* p < 0.05, \*\*\* p < 0.01.

Table B.4: Order Effects

Dependent variable	Decision		Belief	
Procedure	EF	EQ	$\overline{EF}$	EQ
	(1)	(2)	(3)	(4)
Role A	3.576*** (1.006)		2.502*** (0.825)	
Role $A \times EQ$ first	-1.946 (1.453)		-1.292 (1.166)	
Role a		2.603*** (1.001)		2.808*** (0.712)
Role $a \times EQ$ first		$   \begin{array}{c}     1.107 \\     (1.357)   \end{array} $		-1.427 (1.020)
EQ first	1.170 $(0.992)$	-1.048 (0.848)	0.885 $(0.778)$	0.727 $(0.598)$
Constant	6.596*** (0.688)	4.615*** (0.662)	$6.034^{***}$ $(0.544)$	3.573*** (0.410)
Observations $R^2$	372 0.038	372 0.058	372 0.030	372 0.049

Notes: Heteroscedasticity-consistent standard errors in parentheses. \* p < 0.1, \*\* p < 0.05, \*\*\* p < 0.01.



Notes: The figure shows the Pearson correlation coefficient for the ENA proxy introduced in Equation 7 and the respective survey measure. Gray bars indicate 95% confidence intervals.

Figure B.2: Correlations with ENA Proxy (Full Sample)

Table B.5: Heterogeneity (showing controls)

Dependent variable		ENA	proxy	
	(1)	(2)	(3)	(4)
Perspective-taking	-0.179** (0.0748)		-0.176** (0.0754)	-0.185** (0.0754)
Fantasy	-0.0755 $(0.0728)$		-0.0999 (0.0760)	-0.0886 (0.0786)
Empathic concern	-0.0303 (0.0718)		-0.00779 (0.0783)	-0.0109 (0.0792)
Personal distress	0.236*** (0.0718)		0.248*** (0.0712)	0.261*** (0.0719)
Altruism		-0.0442 (0.0635)	-0.00313 (0.0713)	-0.00408 (0.0718)
Positive reciprocity		0.0111 (0.0608)	$0.0400 \\ (0.0601)$	0.0473 $(0.0611)$
Trust		-0.0956 (0.0620)	-0.111* (0.0606)	-0.104* (0.0618)
Risk taking	0.143** (0.0587)	0.169*** (0.0626)	0.155** (0.0605)	0.159** (0.0623)
Patience	0.0495 $(0.0593)$	0.00174 $(0.0621)$	0.0224 $(0.0627)$	0.0292 $(0.0661)$
Negative reciprocity	-0.125** (0.0586)	-0.117* (0.0632)	-0.126** (0.0600)	-0.138** (0.0612)
Openness	0.0326 $(0.0599)$	-0.0219 (0.0578)	0.0302 $(0.0593)$	$0.0362 \ (0.0623)$
Conscientiousness	0.139** (0.0604)	0.112* (0.0636)	0.142** (0.0619)	0.145** (0.0644)
Extraversion	-0.0189 (0.0601)	-0.0474 (0.0601)	-0.0272 (0.0609)	-0.0265 (0.0614)
Agreeableness	0.0663 $(0.0713)$	0.0186 $(0.0745)$	0.0772 $(0.0733)$	0.0839 (0.0761)
Neuroticism	-0.0674 (0.0709)	0.0199 $(0.0595)$	-0.0919 (0.0721)	-0.0808 (0.0730)
Female				-0.127 (0.128)
Other gender				-0.378 (0.343)
Age				0.113 (0.232)
$ m Age^2$				-0.000352 (0.000394)
University student				-0.0448 (0.0762)
Log income				$0.0340 \ (0.0601)$
Personality controls Demographic controls	Yes No	Yes No	Yes No	Yes Yes
Observations $R^2$	312 0.108	312 0.054	312 0.120	312 0.130

Notes: The table reports standardized coefficients. Heteroscedasticity-consistent standard errors in parentheses. \*p < 0.1, \*\*p < 0.05, \*\*\*p < 0.01. The analysis excludes subjects above the 90<sup>th</sup> percentile in the distribution of mistakes in the control questions and those whose self-reported reliability regarding the survey answers lies below the 10<sup>th</sup> percentile, leaving 312 subjects. The personality controls are risk and time preferences along with the Big Five traits. The demographic controls are gender (categories: female, male, and diverse), age and squared age, a dummy for being enrolled at university, and the log of monthly gross income in euros, calculated as  $\ln(income + 1)$ .

Table B.6: Heterogeneity (Full Sample)

Dependent variable	ENA proxy			
	(1)	(2)	(3)	(4)
Perspective-taking	-0.152** (0.0700)		-0.151** (0.0706)	-0.158** (0.0709)
Fantasy	-0.0320 $(0.0655)$		-0.0378 $(0.0665)$	-0.0337 $(0.0681)$
Empathic concern	0.0102 $(0.0703)$		0.0276 $(0.0769)$	0.0278 $(0.0776)$
Personal distress	0.161** (0.0681)		0.166** (0.0685)	$0.170^{**} $ $(0.0694)$
Altruism		-0.0148 $(0.0578)$	0.00246 $(0.0642)$	0.00503 $(0.0646)$
Positive reciprocity		-0.0320 $(0.0522)$	-0.0183 $(0.0527)$	-0.0141 $(0.0538)$
Trust		-0.0463 $(0.0568)$	-0.0570 $(0.0556)$	-0.0541 $(0.0561)$
Personality controls Demographic controls	Yes No	Yes No	Yes No	Yes Yes
Observations $R^2$	372 0.075	372 0.044	372 0.078	372 0.083

Notes: The table reports standardized coefficients. Heteroscedasticity-consistent standard errors in parentheses. \*p < 0.1, \*\*p < 0.05, \*\*\*p < 0.01. The personality controls are risk and time preferences along with the Big Five traits. The demographic controls are gender (categories: female, male, and diverse), age and squared age, a dummy for being enrolled at university, and the log of monthly gross income in euros, calculated as  $\ln(income + 1)$ .