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# Why (Field) Experiments on Unethical Behavior Are Important

Comparing Stated and Revealed Behavior

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### Why (Field) Experiments on Unethical Behavior Are Important: Comparing Stated and Revealed Behavior

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#### **Abstract**

Understanding unethical behavior is essential to many phenomena in the real world. The vast majority of existing studies have relied on stated behavior in surveys and some on incentivized experiments in the laboratory. In this paper, we carry out a field experiment in a unique setting. A survey more than one year before the field experiment allows us to compare stated unethical behavior with revealed behavior in the same situation. Our results indicate a strong discrepancy between stated and revealed behavior. This suggests that, given a natural setting, people may actually behave inconsistently with the way in which they otherwise "brand" themselves. Our findings raise cautions about the interpretation of stated behavioral measures commonly used in research on unethical behavior.

**Key Words:** C93, D01, D03

JEL Codes: honesty, kindness, guilt, field experiment, behavioral economics

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#### Why (Field) Experiments on Unethical Behavior Are Important: Comparing Stated and Revealed Behavior

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#### 1. Introduction

There are many decisions in which agents have to choose between behaving honestly or following an ethics code and being dishonest. Unethical or dishonest behavior can come, for instance, in the form of lying, cheating, or pursuing one's own self-interest instead of following a focal social convention or norm. Economists are mainly interested in situations in which dishonest behavior provides higher monetary payoffs than honest behavior. In the tradition of Becker (1968), the usual assumption is that humans engage in unethical acts if those acts maximize monetary payoffs without negative consequences. However, it is straightforward to extend the individual utility function by a term that introduces (psychological) costs of lying or cheating. Then, individuals trade off the benefits of an unethical act and its costs, and they should refrain from profitable acts of cheating if total costs are higher than benefits (Gneezy 2005; Abeler et al. 2014; Ariely 2012; Rosenbaum et al. 2014; Kajackaite and Gneezy 2016).

There is a quickly growing literature in economics studying the determinants of the trade-off between ethical and unethical behavior in various domains. We know that there is considerable individual heterogeneity in the inclination to lie or cheat; and circumstances, framing, the monetary consequences of the trade-off, beliefs about the norm, peer behavior, and many other aspects matter in the decision. The vast majority of the relevant studies rely on laboratory experiments (for early examples, see Gneezy 2005; Sutter 2009; Houser et al. 2012;

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Fischbacher and Föllmi-Heusi 2013). The problem with naturally occurring data in the context of unethical behavior is that dishonest behavior or cheating (such as tax evasion, fraud, cheating on one's spouse, or lying about a signal that is important to another person) often cannot be observed or can only be observed partially, creating all sorts of problems with the interpretation of data. Randomized controlled trials (RCTs) in the field are a potential remedy, but so far they have been very scarce when it comes to studying dishonest behavior. Among the few recent exceptions in economics are Shu et al. (2012), Azar et al. (2013), and Pruckner and Sausgruber (2013).

Our study has three objectives. First, we want to add to the scarce existing evidence on unethical or dishonest behavior in the field, based on an RCT. We use a very natural setup to assess honesty and moral/ethical behavior in the field, and participants do not know that they are part of an experiment. Second, we have the unique opportunity to link revealed behavior in a moral dilemma in our RCT with stated behavior based on a survey conducted more than one year before the field experiment. This link can be made on the individual level, and it allows us to assess the correlation between stated behavior and revealed behavior in a moral context. As far as we know, we are the first to do so, and our specific setup (the stated question embedded in a much larger survey and the long time between eliciting stated behavior and revealed behavior) makes it very unlikely that participants draw a connection between the survey and the experiment, excluding concerns regarding a potential preference for consistent behavior across the two elicitation methods. Third, we assess the impact of different "frames" (and some additional incentives) on the inclination to behave ethically. Our RCT provides three frames: a neutral frame, a kindness frame, and a frame that we call "guilt". We are able to analyze which of these frames elicits the most honest behavior.

In the following, we discuss our threefold contributions in turn. As mentioned, the economics literature using RCTs to study unethical behavior in the field is limited. Haan and Kooreman (2002) study the likelihood of paying for candy bars by company employees in an honor system and find that a large proportion of employees do not pay and that their average payments decline over time. Levitt (2006) uses a similar setup to investigate honesty in paying

<sup>&</sup>lt;sup>1</sup> Obviously, the set of existing papers depends on the breadth of the definition of unethical and ethical behavior. Here, we do not discuss studies that look at charitable giving and allocation decisions, because all existing field experiments are concerned with donations (giving money) rather than, as in our case, dishonesty in keeping somebody else's money. There is also a literature on credence goods that is related to our research. Balafoutas et al. (2013) study the behavior of cab drivers in terms of fare dodging or taking detours when the passenger signals that he or she is a foreigner.

for bagels and donuts by corporate employees. He observes that average payment for bagels declines with a rise in the price and increases with the fraction of uneaten donuts and bagels. More recently, Shu et al. (2012) analyze moral pledges when signing forms and show that signing a form with a proof of honest intent at the beginning rather than at the end of the form increases honest reporting. Pruckner and Sausgruber (2013) look at stealing of newspapers from dispatch units on the street. They also show that reminders regarding morality increase the level of honesty, while recaps of the legal norm have no significant effect on behavior. Azar et al. (2013) implement a field experiment that, in spirit, is close to our setup, even though our focus is very different. They let restaurant waiters intentionally return too much change to customers and show that those who receive 10 extra Shekels (about USD 3) are less likely to return them to the waiter than those who receive 40 extra Shekels (about USD 12).<sup>2</sup>

In Abeler et al. (2014), the dice-throw paradigm (see Fischbacher and Föllmi-Heusi 2013) is used to study lying in a representative sample using telephone interviews. They observe surprisingly little evidence for lying among the respondents on the telephone, but the unusual request to throw dice and report the result to a stranger on the phone might have contributed to this result, despite the monetary incentives to report high numbers.<sup>3</sup> Hanna and Wang (2013) provide an interesting result that is based on a laboratory experiment, but where laboratory behavior is linked to real-world decision making. They use the dice-throwing task to predict whether dishonest students are more likely to indicate that they want to work in the public sector, which is indeed the case. They also find that cheating in the dice-throwing task among public workers is associated with more corrupt behavior of these officials.

In a somewhat similar vein, Franzen and Pointner (2014) look at the correlation between dictator giving behavior in the laboratory and honesty in returning an intentionally misdirected letter containing money. Indeed, dictator giving is associated with more honesty. Also, Kröll and Rustagi (2015) investigate the relationship between honest behavior in a laboratory task and in the real world. They find that dishonest milkmen (measured by a version of the dice-throw experiment) cheat more than honest milkmen by adding much more water to the milk.

<sup>2</sup> In a somewhat less controlled fashion, Reader's Digest magazine "lost" twelve wallets in each of 16 cities around the world and checked how many of them were actually returned to the owner (http://www.rd.com/slideshows/most-

honest-cities-lost-wallet-test/view-all/).

<sup>&</sup>lt;sup>3</sup> Bucciol et al. (2013) look at free-riding in public transportation in Italy. In their sample, 43% of passengers do not pay. However, the motivation to cheat in situations that involve a company or a public organization might be different than in a bilateral interaction among equal individuals.

Our second, and probably our main, contribution is related to the association between stated and revealed behavior in a moral context. Understanding this association is very relevant for the researcher. If answers to appropriate survey questions are highly correlated with revealed behavior, the former would be clearly more desirable than the latter: non-incentivized surveys are usually cheaper and less intrusive, and they usually imply fewer ethical concerns. However, if the correlation is weak (see e.g., Bertrand and Mullainathan 2001), it seems warranted to incur the various costs of conducting field experiments to gain more knowledge on moral behavior. There is a related discussion on the external validity of laboratory experiments in the field (e.g., Levitt and List 2007; Falk and Heckman 2009). Our focus here is not on the stability of behavior when going from the laboratory to the field (lab-field),<sup>4</sup> but on the comparison between two situations in the field (field-field) with different incentives.

The association between stated and revealed behavior is obviously a relevant general issue in any research that relies on surveys. One example is the long and ongoing debate regarding the usefulness of stated preference methods in general and contingent valuation studies in particular for assessing non-use values when valuing the environment (Diamond and Hausman 1994; Hausman 1994; Hausman 2012; Kling et al. 2012). Some of the findings of the current study might thus be relevant beyond the realm of moral decision-making.

Our third contribution, related to the framing of the decision making situation, investigates whether a kind act or the induction of guilt can reduce the inclination to behave unethically, compared to a baseline (control) condition. We draw on a large literature on the framing of donation decisions (Falk 2007; List 2011; Alpízar and Martinsson 2012; Kube et al. 2012) and want to see whether some of the results from this literature also apply to a setup which is not about giving, but about keeping something that does not belong to oneself. We explain the details of our framing variation in Section 3, after we have introduced the general setup.

Our empirical results indicate that there is only a weak association between stated and revealed behavior. Thus, relying on stated behavior when drawing policy conclusions is far from optimal. Interestingly, people deviate from their stated behavior in two directions – they behave honestly even though they stated earlier that they would be dishonest, and they behave dishonestly even though they stated that they would be honest – but the bulk of our observations go in the expected direction of stated honesty and revealed dishonesty. Our survey allowed the

<sup>&</sup>lt;sup>4</sup> See, for instance, Kröll and Rustagi (2015) or Dai et al. (2016) for recent contributions in a similar general context as ours.

response "not sure what to do," which was chosen by less than 10% of the respondents, but this group turned out to be by far the most honest in the RCT.

With regard to the framing, we show that the actual levels of honesty or dishonesty are easily malleable. The specific effects depend on the framing that decision makers face, but we think that the general result of malleability, which also has been shown in laboratory experiments and in the few existing field experiments in economics on dis/honest behavior, carries over to our setting. Socio-economic background variables and individual uncertainty preferences are weak predictors of ethical or unethical behavior in our data.

The rest of this paper is organized as follows. Section 2 describes the details of our field setup and our empirical identification assumptions. In Section 3, the design of our RCT is discussed, and Section 4 provides our empirical results. Finally, Section 5 discusses our findings and concludes the paper.

#### 2. Measuring Honesty in the Field

Both stated and revealed behavior will be related to unintended or potentially misdirected monetary transfers using mobile phone banking in Tanzania. Our variable of interest is the individual inclination to return an unintended transfer to the sender, despite the fact that the sender cannot enforce such a return. Hence, the return is voluntary, but we will use different one-time messages to induce returning the money. We will call returning the money ethical behavior and keeping the money (despite a request to return it) unethical, although this classification might not be fully appropriate in every single case.

Because we draw heavily on the mobile phone banking system in Tanzania, we first describe how it works. The use of mobile phone banking in Tanzania has grown rapidly since its first introduction in 2008. According to the central Bank of Tanzania, by December 2013, the country had more than 30 million registered mobile phone bank accounts, of which more than 11 million were recorded as active (BoT 2014). A recent survey by InterMedia (2013) asserts that 65% of households owned at least one account as of January 2013. Importantly, within only one month (December 2013), mobile money transfer businesses in the country performed transactions worth more than Tanzanian Shillings (TZS) 3 trillion (equaling USD 1.8 billion) (Di Castri and Gidvani 2014).

Because of the large customer base and number of transactions in a day, unintended transfers are common. It is easy to make a mistake and transfer the money to person A instead of person B. The sender may then immediately learn about the mistake when (s)he receives a text message from the service provider confirming the transaction to a "wrong" number (or name).

When this happens, the sender will have to ask the recipient to send back the money. The recipient then decides whether to send the money back or just keep it. In contrast to bank transfers, a mobile phone transfer cannot simply be recalled—a fact that both the sender and the receiver are well aware of.

Have you ever sent some money by Have you ever received some money by mistake to someone you did not intend to mistake from someone you do not know ...? ...? 200 181 186 200 150 150 100 100 50 50 29 23 16 15 0 0 No Yes Not sure/no No Yes Not sure/no response response

Figure 1: Past Experience with Unintended Mobile Phone Based Money Transfers

Source: Authors' construction based on survey data from <br/>blinded for anonymity>.

Figure 1 presents data from two survey questions,<sup>5</sup> asking whether respondents have either sent or received money by mistake through their mobile phone accounts within the past year. It is obvious that incorrect transfers are common. More than 50 out of 225 respondents have either sent money unintentionally or received money from a source that had sent it unintentionally, and three had experienced both within a year.

While not returning money in such circumstances is a crime in countries such as the UK and the US, the legal obligation is vague in Tanzania. The situation is even worse in the mobile phone banking system. For example, Airtel Telephone Company states in its terms of service that any amount of "airtel-money" transferred erroneously by the customer shall remain the sole responsibility of the customer and the company will have no liability whatsoever regarding the transaction.<sup>6</sup>

<sup>&</sup>lt;sup>5</sup> Data are based on a multi-purpose survey, aimed at assessing the adoption and impact of a climate-friendly agricultural technology, called the System of Rice Intensification (SRI). Details are provided in Section 3.

<sup>&</sup>lt;sup>6</sup> See http://www.airtel.in/personal/money/terms-of-use and http://africa.airtel.com/wps/wcm/connect/africarevamp/Tanzania/AirtelMoney/faq/.

Our identifying assumption stipulates that whether or not the recipient sends back the money is mainly an ethical question. One potential concern is whether what we capture is indeed a measure of dishonesty. People could be risk averse, i.e., worried that they may be caught and legally charged for theft should they decide to keep the money. In response, it is important to note that the mobile bank system in Tanzania was introduced prior to the establishment of a regulatory framework by the central bank to govern its operations (Di Castri and Gidvani 2014). Upon the initial proposal by Vodacom Telephone Company, the central bank issued a so-called "letter of no objection" to the company and voiced its intention that a legal framework would be formulated later. To date, there exists no legal framework governing mobile banking transactions, and the recipient can hardly be charged with legal offenses in such circumstances. Also, as mentioned, mobile phone companies articulate that any amount transferred erroneously by the customer shall remain the sole responsibility of the customer. It is thus generally perceived that the probability of being caught and legally prosecuted is close to zero.

A related concern, even in the absence of formal punishment, is that the sender could privately look for the recipient and punish that person. However, in the mobile phone framework in Tanzania, the search costs to the sender are too high to pursue such a motive. It is very difficult to obtain information on the whereabouts of the recipient, although mobile phone accounts are registered. This is common knowledge to both parties. Given the setup, it is not surprising that a good share of mistakenly transferred money never gets returned to the sender. Further, in case risk or ambiguity preferences do nonetheless matter, our data also allow us to directly control for their influence.

#### 3. Participants, Experimental Design, and Hypotheses

#### 3.1 Participants

We conducted our field experiment with 225 randomly selected heads of farming households from rural Tanzania (specifically from eight villages of the Morogoro region) in November 2014. Our participants took part in a large, multi-purpose survey, involving a monetarily incentivized elicitation of risk, ambiguity and time preferences in September 2013. The survey involved 338 randomly selected households. During the survey, each participant was asked whether s/he owns an active mobile phone account that is registered for mobile phone banking. About 90 percent (302 participants) provided an affirmative answer, and the remaining household heads indicated that they usually use either relatives' or neighbors' phones to make calls or carry out such transactions. The mobile phone numbers used by all participants were recorded in the survey, regardless of who owned the phone. This high share of access to the

system motivated the use of mobile phone banking to deliver delayed payments for a time preference elicitation experiment in 2013.

In order to study unethical behavior, we ran the experiment, including only those respondents who reported privately owning a mobile phone account, while dropping those who used another person's account. Three days prior to the start of the experiment, we conducted a pre-test of the recorded numbers to check whether they were still active and registered for mobile phone banking. We did it twice on that day (November, 3<sup>rd</sup>, 2014), calling from different phone numbers which were not used in the actual experiment. From this pre-test, 226 phone numbers were found to be still active and registered for mobile phone banking. We then randomly assigned 225 farmers into three treatment groups.

#### 3.2 Experimental Design

To conduct our experiment, we bought and registered nine different mobile phone simcards, three from each of the three major mobile phone companies providing service in the area (Vodacom, Airtel, and Tigo). In order to avoid any potential bias due to the sex of the sender, all numbers were registered with male names, given that 93% of the participating household heads in the experiment are male. None of the sim-cards had been used during the payment for the survey and preference elicitation in 2013. We then topped up the accounts with money and sent the money to the farmer. Each received exactly the same amount of money, TZS 20,000 (equivalent to about USD 12).8 Once the money is sent, the network system sends back a confirmation message that a specified sum of money has been sent to the owner of a particular mobile phone. We then immediately sent a text message to the receiver asking them to return the money (less TZS 500 covering the transaction cost). Our three "framing" treatments differ in the message sent (see Table 1). We used sim-cards registered under the same service provider as that of a given participant/recipient. This enabled us to confirm the names of our participants on their accounts before we made the transfer; hence, we could be sure that we were sending the money to the right person. Delivery status of the sent messages provided an extra confirmation of the transfer.

<sup>7</sup> During the experiment and even two days later, the money and text message could not be delivered to one of the 226 subjects. We dropped the observation, leaving us with 225 participants.

<sup>&</sup>lt;sup>8</sup> The average household expenditure on daily basic needs in our study area was TZS 4,500 at the time of the survey. Hence, the transferred amount corresponds to more than four days of expenditures for an average household.

Our three treatments vary the message to the receiver of the transfer. The CONTROL treatment implements a friendly but rather neutral message to the receiver. It reads "Hi, I have just transferred TZS 20,000 to your m-pesa (or tigo-pesa, etc) account. I was not supposed to send it to you. Could you kindly transfer back TZS 19,500 and use TZS 500 for the transfer fee? Thank you very much." Our KINDNESS treatment intends to invoke reciprocity by giving a "gift" to the recipient. The message is very similar (see Table 1), but we invite the recipient to keep TZS 5,000 (plus the fee of TZS 500) and only return TZS 14,500 to the sender. We chose 25% as a share to be retained, because it seemed a good compromise between being large enough to really matter for the recipient and still small enough to make it worthwhile for the sender to make the offer (see also Fehr and Gächter 2000). The third treatment, GUILT, aims to induce a stronger feeling of guilt in the recipient. We alter the message by stating that the money was intended for one of the largest orphanage centers in Tanzania, the *Msimbazi Orphanage Centre*, to help poor children. The total amount of money returned by the subjects in this treatment later on was indeed donated to the Msimbazi Orphanage Centre in Dar es Salaam, Tanzania.

Table 1: Treatments in the Field Experiment: English Translation of the Sent Messages

Treatment	Message sent
CONTROL	Hi, I have just transferred TZS. 20,000 to your m-pesa (or tigo-pesa, etc)
	account. I was not supposed to send it to you. Could you kindly transfer back
	TZS. 19,500 and use TZS.500 for the transfer fee? Thank you very much.
KINDNESS	Hi, I have just transferred TZS. 20,000 to your m-pesa (or tigo-pesa, etc) account. I was not supposed to send it to you. Could you kindly transfer at least
	14,500 back to me and you may keep TZS 5000 as my token of appreciation?
	Thank you very much.
GUILT	Hi, I have just transferred TZS. 20,000 to your m-pesa (or tigo-pesa, etc) account. I was not supposed to send it to you but rather to the head of Msimbazi Orphanage Centre to help those poor orphan children. Could you kindly transfer back TZS. 19,500 and use TZS.500 for the transfer fee? Thank you very much.

The experiment was conducted within 20 hours divided into two days starting from the afternoon of November 6<sup>th</sup> to the morning of November 7<sup>th</sup>, 2014. In order to minimize spillover

of the information across participants within the same village, we made sure, to the extent possible, that all the participants within the same village were sent the money on the same day and at the same hour<sup>9</sup>. Although mistaken transactions are common, behavior of experimental participants could be biased if they knew in advance of another person who received the same amount of money and a similar message. Participants were never contacted again, and telephone numbers were deleted after a couple of weeks.

In the survey in September 2013, we asked all participants a hypothetical question on what they would do in case they received TZS 100,000 (about USD 59 at the time of the survey) in their account by mistake. The answer to this question is used in the comparison between stated and revealed behavior. The survey also allows us to control for background variables such as income, education, religious attitudes, and uncertainty preferences.

We decided to actually send "only" TZS 20,000 instead of TZS 100,000, after realizing from the results in the survey that TZS 20,000 is already equivalent to about four days of household expenditure. The larger amount could have created too much attention in the villages, with people talking about it, and it also would have induced a much more severe moral dilemma for the participants, which we wanted to avoid for research ethics reasons.

#### 3.3 Predictions

In line with the existing literature, we expect some returns in CONTROL. Notice that ethical behavior in our cases requires an active decision, whereas doing nothing implies unethical behavior. This is in contrast to many other studies in which a decision has to be taken, and doing nothing is not an option. Hence, *a priori* it is difficult to predict the inclination to return the money. With respect to the KINDNESS treatment, it is also not clear what behavioral response the gift is likely to induce. It could increase the propensity to return the money (see, for instance, Falk 2007; Kube et al. 2012) unless the monetary gift crowds out an intrinsic inclination to return (i.e., crowds out the potential warm glow from returning the money; see, e.g., Mellström and Johannesson 2010, with respect to blood donations). Return levels could even be lower than in CONTROL due to self-image concerns, but our working hypothesis is that recipients are more likely to return in KINDNESS than in CONTROL.

<sup>9</sup> We tested whether the day on which the experiment was conducted matters for the probability of returning the money. The results presented in Table 6 below suggest statistically zero correlation.

Some recent laboratory experiments conducted in developed countries suggest that people's revealed level of honesty may be affected when they learn that a third party is likely to be affected by their behavior, either positively or negatively (e.g., Gino and Pierce 2009; Wiltermuth 2011; Gino et al. 2013; Kajackaite and Gneezy 2016). Other studies have revealed that induced guilt can significantly affect how a person may behave toward others (e.g., Cunningham et al. 1980; Rebega et al. 2013). Whether our treatment variation really induces guilt or some similar feelings is a question on its own. For ease of reference, we refer to the treatment as GUILT, but it may well be that other aspects play a role. We expect return rates to be higher in GUILT than in CONTROL, assuming that the treatment indeed induced feelings associated with guilt or compassion among the recipients. We remain agnostic with regard to the relationship between the return rates in KINDNESS and GUILT.

<u>Hypothesis 1:</u> In contrast to selfish predictions, there is a positive return rate in CONTROL.

<u>Hypothesis 2:</u> A "gift" in the form of an offer to share money in KINDNESS increases the return rate significantly over the one in CONTROL.

<u>Hypothesis 3:</u> Inducing guilt in the recipient by stating a good cause for which the money was intended increases the return rate in GUILT significantly over the one in CONTROL

Now we turn to our central research question concerning the relationship between stated and revealed behavior. It is difficult to predict the relationship between stated and revealed behavior when it comes to moral issues. We are not aware of a previous study that addresses this aspect in a comparable way. Assuming that surveys can elicit truthful answers even in sensitive contexts, we expect that there is a correlation between stated and revealed behavior on the individual level, but that the correlation is far from perfect. We can also speculate about the specific form of the correlation. It seems reasonable to assume that those who indicate in the survey that they will be dishonest will indeed behave dishonestly. For those who indicate that they will behave honestly and return the money, we can expect to see some to follow their stated behavior and some to deviate (potentially because they stated the socially desirable behavior but are not willing to follow it when they are put in the real situation).

<u>Hypothesis 4:</u> Stated and revealed behaviors in all three treatments are correlated on the individual level. Stating being dishonest is expected to be strongly correlated with revealed behavior, while stating being honest is expected to be weakly correlated with revealed behavior.

#### 3.4 Research Ethics Aspects

Laboratory and field experiments on cheating and moral behavior create a trade-off from the perspective of research ethics. They naturally put decision makers into situations that involve a moral conflict. It is particularly this conflict that one wants to study, and we argue that the moral conflict is significant, but not as severe as to generate serious psychological discomfort in our case. Note that any resource allocation experiment (such as the dictator game) involves a similar conflict.

In our case, we link data from a questionnaire with decisions after the receipt of the money. To address our main research question (summarized in Hypothesis 4), it is necessary to make this link on the individual level without the consent of participants. The latter is the case in many field experiments in economics. The potential psychological effect of the study on participants seems acceptable because it is expected to be very limited. All safeguards regarding anonymity (removal of mobile phone numbers and names from the data after the completion of the experiment) have been implemented.<sup>10</sup>

All experiments on unethical behavior inside and outside the laboratory also involve an intentionally misleading signal regarding the real intention of the experimenters. The dice-throw paradigm signals that researchers are interested in dice throws, but they are actually interested in cheating. Losing one's wallet to study return behavior signals that the loss was by mistake, but actually it was intentional. The same is true for our transfers (and the messages). Notice that the money stated to be for the orphanage and returned by the recipients in treatment GUILT was actually transferred to the orphanage after the experiment.

#### 4. Experimental Results

We organize the results from our study along the following lines. In Section 4.1, we look at an overview of descriptive variables on the return levels in order to address Hypotheses 1-3. In Section 4.2, we empirically link stated behavior in the survey with revealed behavior in the field experiment. Finally, in Section 4.3, we take another look at the determinants of unethical behavior.

<sup>&</sup>lt;sup>10</sup> The University of Dar es Salaam's Research Board (a body similar to IRBs) approved the experiment.

#### 4.1 Descriptive Overview

We have 13 out 225 cases in which we are not sure whether the person received the money. For the descriptive overview, we proceed on the assumption that those 13 people indeed got the transfer. Later on, we will drop them for robustness checks, but we will always indicate clearly when we do this.

Our random allocation to the three treatments seems to have been successful. Out of 24 comparisons, only one – household daily spending – was significantly different between the CONTROL and GUILT groups (see Table A.1 in the Appendix, where means and standard deviations for relevant variables are also displayed).

When we look at return levels, we note that most people who returned money returned the requested amount. In CONTROL, a total of 18 participants returned money, of whom 10 returned the requested amount of TZS 19,500, five returned TZS 19,000 and three returned TZS 20,000. In KINDNESS, we observe more variation, with returns between TZS 14,500 and 20,000 among those who returned money. In the GUILT treatment, 24 participants returned TZS 19,500, four returned TZS 20,000 and the remaining 47 nothing. Given the lack of variation in individual return levels when a positive amount is returned, which is deliberately induced by our setup, we consider return a binary variable. Both KINDNESS and GUILT result in higher return rates and total amount returned compared to CONTROL. Return rates were highest in the KINDNESS treatment, but given that many of those returning the money in the KINDNESS treatment kept the 'gift' of TZS 5,000, the total amount returned was highest from the GUILT treatment.

Table 2 provides an overview of the averages in the three treatments and the results of two-sided significance tests. In general, we find that 34.7 % of our sample returned some money to the sender. Only 24% of the participants in CONTROL returned the requested amount (or a very similar amount). Consistent with Hypothesis 1, this is clearly above zero – it is more than just behavioral noise – although the great majority did not return the transfer.

Result 1: Consistent with Hypothesis 1, some recipients in the CONTROL treatment returned a positive amount of money to the sender, although a majority does not return anything.

KINDNESS induces a higher return rate, consistent with Hypothesis 2. The rate almost doubles to 42.7% compared to CONTROL, and the difference between the two treatments is highly significant. Offering a "gift" induced reciprocity. In addition, the mean amount returned is greater in KINDESS, although the difference is not significant at conventional levels. The mean returned amount is TZS 6,661 in KINDNESS, compared to a mean returned amount of TZS

4,667 in CONTROL. Despite the lack of significance, the benefit of the "gift" obviously outweighs its costs on average.

Result 2: KINDNESS induces significantly higher return rates than CONTROL, and the sender is better off on average in KINDNESS. This is despite the lower absolute amounts returned as a consequence of the "gift".

	Number of		Probability of	p-value of	Returned	p-value of
Treatment	observations	Returned	returning	FE-test	amount	MWU-test
CONTROL	75	18	24,0%	-	4,667	-
KINDNESS	75	32	42,7%	0.02**	6,661	0.23
GUILT	75	28	37,3%	0.11	7,567	0.03**
All	225	78	34,7%			

**Table 2: Distribution of Return Rate by Treatment** 

Note: The p-values refer to two-sided Fischer exact (FE) and Mann-Whitney-U (MWU) tests for the differences in proportions and in means (medians) between the control group and the treatment groups.

Treatment GUILT lies in between. It induces a return rate of 37.3%, which is higher than the rate in CONTROL, as proposed in Hypothesis 3, but the difference between GUILT and CONTROL misses conventional levels of significance. On the other hand, GUILT creates the highest average amount returned among the three treatments, at TZS 7,567, which is significantly higher than in CONTROL and is consistent with Hypothesis 3.

Result 3: GUILT induces higher return rates than CONTROL. It shows the highest average returned amounts of all three treatments

The general impression is that both treatments work in the same direction. From the perspective of the return rate, treatment KINDNESS works best, whereas from the perspective of the average amount returned, treatment GUILT works better, because the cost of the gift cannot be compensated by the higher return rate in KINDNESS, when compared to GUILT.

#### 4.2 Do People Act As They Brand Themselves? Stated versus Revealed Honesty

Table 3 provides a comparison of the fractions from the stated honesty and from the revealed honesty. We pool data from all treatments for Table 3, but qualitatively there is not much difference. However, we assume that sending back TZS 14,500 in the KINDNESS treatment means sending back the entire amount. At first sight, it seems that the stated levels of honesty correspond at least somewhat with the actual behavior. Those who said that they would return the entire amount actually did so more often than those who said that they would keep all the money, but the difference is small and not statistically significant. Interestingly, almost one-

<sup>\*\*</sup> significant at the 1% level.

third (29.6%) of the 24% who said they would keep the entire amount actually sent the entire requested amount back. The highest actual return rate is shown by those who indicated in the survey that they were not sure what they would do. It is interesting that this is the group that is most honest when it comes to actual behavior, but the absolute number of people is relatively small (20 respondents), and therefore we do not want to over-interpret the result. In our sample, 67.1% stated that they would return at least some of the money, but the actual fraction is 35.1%. Hence, we find that on average 2/3 of our participants claim to be honest, but only 1/3 actually behave in an honest way.

Table 3: Share of Those Who Returned the Money (i.e., Revealed Honesty), by Type of Survey Promise (i.e., Stated Honesty)

	Stated honesty: Distribution	Fraction that returned requested amount
Send the entire amount back	45.3%	37.3%
Send some of money back	21.8%	28.6%
Not sure what to do	8.9%	55.0%
Keep the entire amount	24.0%	29.6%

Table 4 combines the data from the survey (in columns) with the data from the field experiment (in rows). For instance, 38 people who said that they would keep the entire amount actually kept the entire amount; 16 of those sent some or the entire amount back. Table 4 excludes the category "not sure what to do," because it does not exist for revealed behavior. One can see that there are deviations from the stated behavior in both directions – some people are more honest in reality compared to their stated behavior ("positive surprise") and some are less honest ("negative surprise") – but the second case is more frequent. If we also exclude the category "send some money back," which is the one that is most difficult to assess in comparisons between stated and revealed behavior in our setup, we have 156 observations. Of those, 16 (10%) surprised positively and 65 (42%) surprised negatively. The remaining 75 (48%) behave as indicated in the survey.

Table 4: Transition Matrix from Stated Honesty to Revealed Honesty (Excluding the Survey Category "Not Sure What To Do")

Stated	Keep the entire	Send some of	Send the entire
Revealed	amount	money back	amount back
Keep the entire amount	38	35	65
Send some money back	16	1.4	03
Send the entire amount back	10	14	37
Number of observations	54	49	102

The real test of the concept is whether the stated behavior has predictive power for the actual behavior. In Table 5, we run a set of regressions to address this issue. There are several ways to look at the data. We look at the entire sample (225 observations), without excluding those for whom we are not entirely sure whether they received the money (13 observations). The sensitivity analysis for the smaller sample with 212 observations is provided in the appendix. We use a binary variable as the dependent variable, because all other options seem inferior for several reasons. First, the returned amount is a strangely distributed variable. Second, the vast majority of participants returned either the entire requested amount or nothing. The few exceptions who returned more or less than the requested amount do not change the picture. Third, a probit regression is easier to interpret than other models such as hurdle models. To make sure that the results are robust – in particular, with respect to the interaction of dummy variables – we provide OLS estimates in the appendix.

Table 5 displays some results indicating a connection between stated and revealed behavior. The important thing to notice is that the reference group comprises those respondents who stated in the survey that they did not know what they would do upon receiving the transfer. People who answered that they would "send some money back" or "keep the entire amount" are significantly less likely to actually return money compared to the group "I don't know". However, there is clearly no significant difference in the likelihood of returning money between the three main categories "send the entire amount back", "send some money back", and "keep the entire amount." These results are robust to the inclusion of treatment dummies and to our controls for further background variables, such as socio-economic indicators, as well as risk and ambiguity attitudes. This means that the category "Not sure what to do" stands out and that other categories are not too informative in predicting real behavior.

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<sup>&</sup>lt;sup>11</sup> This group includes those for whom, although the system sent the money to their account, for some reason we did not receive the delivery notification status of our treatment message. Because we closed our phone numbers just a few days after the experiment, we could not observe the actual delivery day of the message.

Table 5. Estimation Results from Probit Models (Marginal Effects)—Revealed Honesty

Dependent variable Dummy: Money Returned	[1]	[2]	[3]	[4]	[5]	[6]	[7]
STATED:	0.03			-0.17		-0.16	
Send the entire amount back	(0.06)	-	-	(0.11)	-	(0.11)	-
STATED:		-0.08		-0.23**		-0.22**	
Send some of money back	-	(0.07)	-	(0.10)	-	(0.10)	-
STATED:			-0.07	-0.22**		-0.20*	
Keep the entire amount	-	-	(0.07)	(0.10)	-	(0.10)	-
STATED AMOUNT index	-	-	-	-	0.03 (0.08)	-	0.02 (0.08)
Treatment KINDNESS	-	-	-	-	-	0.18** (0.08)	0.19**
Treatment GUILT	-	-	-	-	-	0.15* (0.08)	0.14* (0.08)
Number of observations	225	225	225	225	225	225	225

We also tried to create an index for stated honesty by arbitrarily assigning the value 0 to "keep the entire amount", 0.5 to "send some money back", 1 to "send the entire amount back", and 0.25 to "not sure what to do". The index is not significant in any specification, and its coefficient remains far from significant levels, even if one excludes the 20 observations for the category "not sure what to do", because their assignment to a value of 0.25 seems most arbitrary.

In general, results do not change when we interact the treatment dummies with the answer categories from the survey, although in some cases the significance of coefficients for main effects vanishes. Overall, it seems that the stated behavior has little predictive power for what people actually do in our experiment when they face the same situation in real life. To what extent is this conclusion in line with the finding in Table 4, which shows that 48% behave as stated? On average, there is some consistency, but this consistency does not necessarily lead to strong predictive power. One issue to bear in mind is the handling of the category "send some money back" (and to a lesser extent the category "not sure what to to"). Depending on how these categories are handled, the consistency level goes either up or down. The above-mentioned 48% is more or less the upper boundary, and any other definition or assignment would reduce average consistency levels.

Result 4: The predictive power of stated behavior for actual behavior is weak in our experiment. Indeed, there is an asymmetry: while about 70% of those who indicated that they would not send the money back stuck to their stated behavior, only about 36% of those who said that they would return the money actually did so.

One possibility is to extend Tables 4 and 5 by regressing background and treatment variables on a dummy capturing consistency of answers regarding stated and revealed behavior. We have done so in different specifications. However, it appears that our sample is not large enough to show a clear relationship between any of the background variables – be they socioeconomic or preference-based – and consistency. This is not surprising. One would expect that any potential relationship is more subtle and would only show up in a much larger sample. 12

#### 4.3 Determinants of Honesty

Finally, we want to address the determinants of honesty. In this sub-section, we look at observable characteristics that predict whether people return money, and we disregard their stated behavior. Table 6 gives the results of probit models with a binary variable for returned money as the dependent variable. Again, the sensitivity analyses, using OLS and the restricted sample, are provided in the appendix.

Table 6 indicates that age and years of schooling are positively associated with being honest. The relationship between age and ethical behavior seems to be inversely U-shaped, indicated by the negative sign of the squared term. These results do not change when we control for income or household expenditures. Household expenditures and income are never significant in the regression. We also tried to control for religious activity as a determinant, but it was always far from significant.

Finally, our claim that uncertainty attitudes would not play a role in the decision to return money is confirmed in the data. The two coefficients for risk and ambiguity attitudes are far from being significant in Model [3] in Table 6.

<sup>&</sup>lt;sup>12</sup> Results are available on request.

Table 6. Estimation Results from Probit Models (Marginal Effects)—Revealed Honesty:

Determinants

Dependent variable Dummy: Money Returned	[1]	[2]	[3]
A ~~	0.000	0.034*	0.035*
Age	(0.002)	(0.019)	(0.200)
A an agreement		-0.0004*	-0.0004*
Age squared	-	(0.0002)	(0.0002)
Vacus of schooling		0.021*	0.022*
Years of schooling	-	(0.012)	(0.012)
Risk aversion			-0.003
RISK aversion	-	-	(0.128)
A malai avritav arragai au			-0.161
Ambiguity aversion	-	-	(0.127)
First day of experiment			0.053
(dummy)	-	-	(0.065)
Transfer and KINIDNECC	0.200**	0.205**	0.200**
Treatment KINDNESS	(0.081)	(0.082)	(0.082)
Treatment CI III T	0.143*	0.143*	0.136*
Treatment GUILT	(0.082)	(0.082)	(0.083)
Number of observations	225	225	225

Result 5: Age and years of schooling have a significant influence on the revealed level of honesty in our sample.

The regression models in Table 6 also nicely show the positive effect of our framing conditions. Taken together, they increased the likelihood of returning money by 60% or 16 percentage points, from 24% to 40%. After all, the inclination to behave honestly seems to be influenced quite strongly by the frame in which the decision is taken.

#### 5. Discussion and Conclusion

We have used a unique setting to link stated honesty to revealed honesty on the individual level in a naturally occurring situation in the field that creates a moral dilemma between being honest and accepting a monetary gain for being dishonest. Our main result indicates a strong discrepancy between stated and revealed behavior or, in other words, a weak association between words and actions.

First of all, our findings indicate that hypothetical surveys on ethical and unethical behaviors poorly reflect the actions taken in the same real-world situations. As a consequence, it seems important to use experiments, and in particular field experiments, to study the

determinants of unethical behavior and to assess the effects of potential interventions to support and maintain ethical behavior. Our experiment is not the only one showing that revealed ethical and unethical behavior is quite malleable in response to the circumstances and the incentives, but it is, to our knowledge, the first one that is able to fully control for the comparison between stated and revealed behavior. Interestingly, we observe deviations between stated and revealed behavior in both directions, toward being more honest than self-stated and toward being less honest than stated. This indicates that there is a certain expected noise in behavior that might also be attributed to the time that passed between the survey and the experiment, but importantly there is also a clear bias. The case of stating honesty and actually behaving dishonestly is more than four times as frequent in relative terms than the opposite case. Hence, simple random variation in behavior over time cannot explain the data pattern that we observe.

We have also ruled out explanations based on the fear of formal and informal punishment that might be differently salient in the abstract survey situation and the real-world decision. First, we argue that our institutional setup is unlikely to give rise to such fears. Second, if participants nonetheless perceived the situation as risky, participants should become more honest in the actual decision than in the hypothetical survey response. Third, controlling for risk and ambiguity attitudes as potential determinants of behavior when receiving money, which should matter if participants perceived the situation as risky or uncertain, does not change our results, and the measures for uncertainty in the regressions are far from being significant in any specification.

We note that the group of participants who responded "Not sure what to do" in the survey was actually by far the most honest group when it came to actual behavior. However, they comprised slightly less than 10% of our sample. If this particular finding is robust, which has to be established in future work, one can imagine question techniques in surveys that might be helpful in increasing the predictability of survey answers. Surveys will always be important tools in the social sciences, but one has to be careful not to over-interpret their predictive power, in particular when it comes to moral behavior.

With regard to the mechanisms implemented in our treatments, guilt works as expected, and giving a gift to induce people to return the money does not crowd out the intrinsic inclination to return the transfer. Both have a positive effect on the propensity to return the transfer.

Finally, we do not want to over-interpret the levels of dishonesty in our results. Because being honest required an active choice, whereas being dishonest did not require any action, our dishonesty levels are comparatively high. There might be similar situations in other domains (e.g., when one is requested to inform authorities that one does not fulfill the criteria to receive specific social benefits anymore), but the levels observed in our study clearly do not carry over to all ethical decisions.

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#### **Appendix**

Table A.1: Means (Standard Deviations) of Main Pre-treatment Variables

	Full				CONTROL vs.		
Variable	sample	CONTROL	KINDNESS	GUILT	KINDNESS <sup>a</sup>	vs. GUILT <sup>a</sup>	
Age	43.41	43.79	42.25	44.20	0.39	0.70	
	(11.427)	(11.038)	(11.859)	(11.430)	0.57	0.70	
Years of schooling	8.49	8.37	8.53	8.56	0.99	0.72	
	(2.727)	(2.735)	(2.952)	(2.511)	0.77	0.72	
Male dummy	0.93	0.96	0.93	0.89	0.47	0.12	
	(0.258)	(0.197)	(0.251)	(0.311)	0.47	0.12	
Household (HH) size	4.62	4.75	4.53	4.59	0.48	0.57	
	(1.819)	(1.846)	(1.833)	(1.794)	0.40	0.57	
HH daily spending	4.51	4.29	4.20	5.04	0.60	0.01**	
(in TZS 1,000)	(2.098)	(1.986)	(2.119)	(2.111)	0.00	0.01	
HH annual off-farm	509.68	449.57	402.80	676.66	0.56	0.28	
income (in TZS 1,000)	(1070.9)	(942.792)	(691.56)	(1435.7)	0.50	0.20	
Experience: money sent	0.13	0.12	0.13	0.13	0.81	0.81	
erroneously (dummy)	(0.336)	(0.327)	(0.342)	(0.342)			
Experience: money rec'd	0.10	0.09	0.11	0.11	0.79	0.79	
erroneously (dummy)	(0.304)	(0.293)	(0.311)	(0.311)			
Alcoholic beverage daily	0.15	0.15	0.15	0.16	1.00	0.82	
(dummy)	(0.359)	(0.356)	(0.356)	(0.369)			
Religious (dummy)	0.17	0.12	0.19	0.20	0.26	0.18	
	(0.375)	(0.327)	(0.392)	(0.403)			
Risk attitude [0,1];	0.56	0.52	0.57	0.58	0.30	0.19	
0.5=risk neutral	(0.270)	(0.283)	(0.255)	(0.273)			
Ambiguity attitude [-1,1]; 0=ambiguity neutral	0.00 (0.282)	0.03 (0.339)	-0.01 (0.253)	-0.01 (0.249)	0.13	0.76	
Observations	225	75	75	75	75	75	
Cosci vations				,,,	,,,		

<sup>&</sup>lt;sup>a</sup> P-values for two-sided Mann-Whitney-U-test.

<sup>\*\*</sup> significant on the 1%-level.

Table 5a. Estimation Results from Probit Model (Marginal Effects)—Revealed Honesty (212 Observations)

Dependent variable							
<b>Dummy: Money</b>	[1]	[2]	[3]	[4]	[5]	[6]	<b>[7</b> ]
Returned							
STATED: Send the entire amount back	0.02 (0.07)	-	-	-0.20* (0.11)	-	-0.20* (0.11)	-
STATED: Send some of money back	-	-0.09 (0.088 )	-	- 0.26** (0.10)	-	- 0.26** (0.10)	-
STATED: Keep the entire amount	-	-	0.045 (0.08)	-0.23** (0.10)	-	-0.21* (0.11)	-
STATED AMOUNT index	-	-	-	-	0.01 (0.08)	-	-0.01 (0.08)
Treatment KINDNESS	-	-	-	-	-	0.19** (0.09)	0.20** (0.08)
Treatment GUILT	-	-	-	-	-	0.18** (0.09)	0.17** (0.08)
Number of observations	212	212	212	212	212	212	212

Table 5b. Estimation Results from OLS Model—Revealed Honesty (Full Sample)

Dependent variable							
<b>Dummy: Money</b>	[1]	[2]	[3]	[4]	[5]	[6]	[7]
Returned							
STATED:	0.03			-0.19		-0.18	
Send the entire amount	(0.06)	-	-	(0.12)	-	(0.12)	-
back	(0.00)			(0.12)		(0.12)	
STATED:		-0.08		-0.26**		-0.25*	
Send some of money back	-	(0.08)	-	(0.13)	-	(0.13)	-
STATED:			-0.07	-0.25**		-0.22*	
Keep the entire amount	-	-	(0.07)	(0.12)	-	(0.12)	-
STATED AMOUNT index					0.03		0.01
STATED AMOUNT index	-	-	-	-	(0.08)	-	(0.08)
Total WINDNESS						0.17**	0.19**
Treatment KINDNESS	-	-	-	-	-	(0.08)	(0.08)
Transfer and CIIII T						0.14*	0.13*
Treatment GUILT	-	-	-	-	-	(0.08)	(0.08)
Number of observations	225	225	225	225	225	225	225

Note: \*\*\* denotes significance at the 1% level, \*\* at the 5% level and \* at the 10% level. Standard errors in parentheses.

Table 5c. Estimation Results from OLS Model—Revealed Honesty (212 Observations)

Dependent variable							
<b>Dummy: Money</b>	[1]	[2]	[3]	[4]	[5]	[6]	[7]
Returned							
STATED: Send the entire amount back	0.02 (0.07)	-	-	-0.22* (0.12)	-	-0.21* (0.12)	-
STATED: Send some of money back	-	-0.09 (0.09)	-	-0.30** (0.13)	-	0.29** (0.13)	-
STATED: Keep the entire amount	-	-	- 0.05 (0.08)	-0.27** (0.13)	-	-0.24* (0.13)	-
STATED AMOUNT index	-	-	-	-	0.01 (0.08)	-	-0.01 (0.08)
Treatment KINDNESS	-	-	-	-	-	0.17** (0.08)	0.19** (0.08)
Treatment GUILT	-	-	-	-	-	0.16** (0.08)	0.16** (0.08)
Number of observations	212	212	212	212	212	212	212

Table 6a. Estimation Results from Probit Models (Marginal Effects)—Revealed Honesty: Determinants (212 Observations)

Dependent variable Dummy: Money Returned	[1]	[2]	[3]
Age	0.001 (0.003)	0.035* (0.021)	0.036* (0.207)
Age squared	-	0.0004* (0.0002)	-0.0004* (0.0002)
Years of schooling	-	0.021 (0.013)	0.022* (0.013)
Risk aversion	-	-	-0.012 (0.132)
Ambiguity aversion	-	-	-0.210 (0.134)
Treatment KINDNESS	0.203** (0.084)	0.204** (0.085)	0.203** (0.086)
Treatment GUILT	0.169** (0.085)	0.163* (0.085)	0.162* (0.086)
Number of observations	212	212	212

Note: \*\*\* denotes significance at the 1% level, \*\* at the 5% level and \* at the 10% level. Standard errors in parentheses.

Table 6b. Estimation Results from OLS Models—Revealed Honesty: Determinants (Full sample)

Dependent variable Dummy: Money Returned	[1]	[2]	[3]
Age	0.001 (0.003)	0.031* (0.018)	0.032* (0.018)
Age squared	-	- 0.0003* (0.0002)	-0.0003* (0.0002)
Years of schooling	-	0.019* (0.012)	0.020* (0.012)
Risk aversion	-	-	-0.010 (0.126)
Ambiguity aversion	-	-	-0.147 (0.120)
Treatment KINDNESS	0.188** (0.077)	0.194** (0.077)	0.190** (0.077)
Treatment GUILT	0.133* (0.077)	0.132* (0.077)	0.126 (0.077)
Number of observations	225	225	225

Table 6c. Estimation Results from OLS Models—Revealed Honesty: Determinants (212 Observations)

Dependent variable Dummy: Money Returned	[1]	[2]	[3]
Age	0.001	0.032*	0.032*
	(0.003)	(0.019)	(0.019)
Age squared	-	-0.0003	-0.0003*
		(0.0002)	(0.0002)
Years of schooling	-	0.019	0.020*
		(0.012)	(0.012)
Risk aversion	-	-	-0.013
			(0.129)
Ambiguity aversion	-	-	-0.184
			(0.123)
Treatment KINDNESS	0.191**	0.191**	0.186**
	(0.080)	(0.080)	(0.080)
Treatment GUILT	0.157*	0.150*	0.144*
	(0.080)	(0.080)	(0.080)
Number of observations	212	212	212

Note: \*\*\* denotes significance at the 1% level, \*\* at the 5% level and \* at the 10% level. Standard errors in parentheses.