

Social Design Engineering Series

SDES-2015-25

Characterizing voluntary donations for natural disaster mitigation in a third world country: A case of Bangladesh

Shibly Shahrier Kochi University of Technology

Koji Kotani Kochi University of Technology Research Center for Social Design Engineering, Kochi University of Technology

14th December, 2015

School of Economics and Management Research Center for Social Design Engineering Kochi University of Technology

KUT-SDE working papers are preliminary research documents published by the School of Economics and Management jointly with the Research Center for Social Design Engineering at Kochi University of Technology. To facilitate prompt distribution, they have not been formally reviewed and edited. They are circulated in order to stimulate discussion and critical comment and may be revised. The views and interpretations expressed in these papers are those of the author(s). It is expected that most working papers will be published in some other form.

Characterizing voluntary donations for natural disaster mitigation in a third world country: A case of Bangladesh

Shibly Shahrier^{*} Koji Kotani^{† ‡}

December 12, 2015

Abstract

Voluntary donation is a major source of public goods provision in the developed countries. Likewise, voluntary donations may be able to contribute to public problems in third world countries such as natural disaster mitigation. However, voluntary sector in third world countries has not been studied, and thus this paper addresses voluntary donations in Bangladesh with a specific eye on natural disaster mitigation. To this end, we conducted a questionnaire survey of 1000 respondents and elicited (i) a willingness to donate their labor (labor donation) and (ii) a willingness to pay (money donation) to collective countermeasures for avoiding the damages from cyclones and associated disasters. With this data, we analyze labor and money donations in relation to socio-economic variables such as income, education, family structure, and occupation using bivariate probit and Tobit regressions. The analysis finds that age, family structure, education, income and occupation are important determinants for Bangladeshi people to decide between labor and money donations as well as their respective amount. The poor and less educated households with the occupations of higher natural resource dependence are identified to contribute a large portion of overall donations via labor. The rich and more educated people are willing to donate money and little labor, but the magnitude of donations is rather small. In summary, labor and money donations exhibit the relation of substitutability with respect to most socio-economic variables, and education and income do not positively affect overall donations in Bangladesh. This finding is in sharp contrast with the studies in USA or Europe, and illustrates a possibility that labor donation is an important channel to natural disaster mitigation that should be utilized for public betterment in third world countries.

Key Words: Voluntary donation; natural disaster; third world country

^{*}School of Economics and Management, Kochi University of Technology

[†]Professor, School of Economics and Management, Kochi University of Technology, 2-22 Eikokuji-cho, Kochi-shi, Kochi, 780-0844, Japan (e-mail: kojikotani757@gmail.com).

[‡]Research Center for Social Design Engineering, Kochi University of Technology.

Contents

1	Introduction	3
2	Cyclones and our study region	6
3	Data and methodology	9
4	Empirical results4.1Summary statistics4.2Labor and money donation in relation to socio-economic factors	13 13 16
5	Conclusion	21
6	Bibliography	23
Li	st of Figures	26
Li	st of Tables	29

1 **Introduction**

Voluntary donation is regarded as one of the major sources for public goods provision in many 2 developed countries. For instance, in USA, the government has yielded complacent tax policy to 3 voluntary donation for promoting philanthropy since 1917. This illustrates that philanthropy is an 4 important activity in USA and has played a vital role to provide various social needs along with the 5 government (Brown and Lankford, 1992, Beldad et al., 2015). Likewise, in Europe, many types 6 of charities have been organized to meet diverse social challenges (Wright, 2001, Wiepking, 2009, 7 Bauer et al., 2013, Beldad et al., 2015). Voluntary donation activities have taken different forms 8 in developed countries, and a number of researches have analyzed various voluntary donations in 9 USA and Europe. However, no papers have studied the voluntary donation behaviors in developing 10 countries.¹ 11

It is important to characterize voluntary donations in third world countries mainly for two rea-12 sons. First, it adds some extra knowledge in the literature of voluntary donation behavior since the 13 donation behavior in developing countries could be different from those of the developed countries. 14 For instance, the necessity for this type of research focusing on developing countries is pointed out 15 by Henrich et al. (2010). Second, it might contribute to some imperative public problems in third 16 world countries. For instance, natural disaster and climatic changes are the major threats for many 17 developing countries and collective disaster mitigation plan is claimed to be urgent (Emanuel, 18 2005, Schiermeier, 2011b,a). In the process of mitigation planning and implementation, local peo-19 ple's cooperation is essential, and disaster mitigation cannot be sustainable without their volun-20 tary donation (Mileti, 1999, Dorcey and McDaniels, 2001, Godschalk et al., 2003, Pearce, 2003). 21 Therefore, we address the issue of characterizing the voluntary donation behavior in a third world 22 country, Bangladesh, for natural disaster mitigation. 23

In any voluntary activities, the two channels of labor and money donations are the most conventional practices (Bauer et al., 2013). These two are important measures for people's cooperation to disaster mitigation activities. Moreover, voluntary labor donation is expected to be high con-

¹In this paper, developing countries are interchangeably used as third world countries.

sidering an economic structure in the disaster-susceptible areas of Bangladesh. This expectation 27 is in line with other disaster-mitigation or -recovery cases in other countries. For instance, labor 28 donation was a major force for the recovery of the 2011 earthquake off the Pacific coast of Tohoku, 29 Japan and the 2004 Tsunami of the west coast of Sumatra, Indonesia. Despite its importance, labor 30 donation for natural disaster mitigation has not been addressed in the literature. Thus, we address 31 the labor donation in addition to money donation. 32

A notable number of past works characterize the voluntary donation behavior in USA and 33 Europe considering labor and money donations as the two major channels (see, e.g., Menchik 34 and Weisbrod, 1987, Brown and Lankford, 1992, Duncan, 1999, Feldman, 2010, Cappellari et al., 35 2011, Bauer et al., 2013). These studies generally find a positive relationship between income 36 and money donation as well as between income and labor donation. Consequently, the overall 37 donation is identified to increase in USA and Europe when household income rises. The same 38 tendency applies to education in the sense that more educated people donate more of both labor 39 and money for charitable activities. 40

Another focus in the literature on labor and money donations is the effect of price of donations. 41 Brown and Lankford (1992) discover a complementary relationship between money and labor 42 donations with respect to the price of money giving (opportunity cost for time or money giving 43 such as wage) in USA. Duncan (1999) develops a theoretical model in which labor and money 44 donations are perfectly substitute with respect to the price of money giving in the equilibrium, 45 whereas his empirical result shows that labor and money donations change in the same direction, 46 i.e, complementarity. On the other hand, Feldman (2010) has found that labor and money donations 47 are substitute. In European contexts, Cappellari et al. (2011) find complementary relation between 48 labor and money donations, whereas Bauer et al. (2013) establish substitutability relation. In 49 summary, labor and money donations have a tendency to change in the same direction with respect 50 to income and education, but not necessarily with respect to the price of money giving in USA or 51 European countries. 52

53

In the context of natural disaster mitigation, there are only a few works that analyze voluntary

donations toward collective disaster mitigation. Markantonis et al. (2013) elicit willingness to pay 54 for avoiding the damage of severe flooding in Greece, and find that experts and hunters are willing 55 to pay more than farmers. Luo and Levi (2013) analyze the determinants to induce participation 56 for collective disaster mitigation programs in China. They report that farmers usually pay a lot of 57 attention to the non-engineering practices of mitigation, but not to engineering practices. Actual 58 willingness to participate is identified to be quite low, although education and professional skills 59 can positively influence the decision to participate. Similarly to Markantonis et al. (2013), Ghan-60 barpour et al. (2014) elicit and analyze people's willingness to pay toward flood management in 61 relation to risk perception and socio-economic factors in Iran. They conclude that the willingness 62 to pay is higher for those who have high income and high level of risk perception. 63

No past literature has addressed voluntary donations to natural disaster mitigation, considering 64 both labor and money donations within a single framework. Also there is no previous research to 65 characterize voluntary donations toward disaster mitigation in the third world countries, such as 66 Bangladesh. Nevertheless, given the increased threats of natural disasters and climatic changes, 67 organizing a collective countermeasure by means of voluntary donation is urgent and an important 68 policy agenda. Given this state of affairs, we examine voluntary donation behavior in the third 69 world countries, and characterize both labor and money donations with a specific eye on natural 70 disaster mitigation. 71

To this end, we conducted a questionnaire survey of 1000 households and elicited willingness to donate (i) labor and (ii) money to collective disaster mitigation in the disaster-susceptible areas of Bangladesh.² With this data, we analyze labor and money donations in relation to major

²This research differs from the previous works in another direction since we have applied the hypothetical values of labor and money donation while in previous studies the true values of money giving and labor giving has been used. Since voluntary activities have never been organized for natural disasters and such data are not available in Bangladesh, we rely on hypothetical values of labor donation and money donation. However, for valuing public goods, demand of better environmental quality, and to quantify the required compensation or damage caused by environmental deterioration, use of contingent valuation method (hereafter, CVM) has been regarded as one of the best ways (see, e.g., Mitchell and Carson, 1988, Alberini and Kahn, 2009). Several studies use CVM to computes the willingness to pay for avoiding manmade or natural disaster given the past experience of such calamities (see, e.g., Brown et al., 1996, Carson et al., 2003, Cooper et al., 2004, Martin-Ortega et al., 2011, Markantonis et al., 2013, Ghanbarpour et al., 2014). These previous works suggest that when people have enough experiences with which preferences are well established such as in the case of natural disasters, an open-ended question format in CVM method is recommended. Therefore, in this study, we have employed an open-ended question format to identify the hypothetical values of labor

socio-economic variables, such as income, education, family structure, age and occupation, us-75 ing bivariate probit and Tobit regressions.³ This paper differs from the previous studies in USA 76 and European contexts, because philanthropies and charities in USA and Europe can be consid-77 ered luxury activities in comparison to the donation activities for disaster mitigation in third world 78 countries. Natural disaster directly harms people's wealth and life and therefore, and provision 79 of natural disaster mitigation is a necessary good for the people living in the disaster-susceptible 80 areas of third world countries. Thus, our analysis provides a unique contribution to the existing lit-81 erature by comparing how donation behavior to disaster mitigation in third world countries might 82 be different from that to charity in the developed countries and by providing policy implication of 83 how disaster mitigation should be organized by voluntary donations. 84

⁸⁵ 2 Cyclones and our study region

Bangladesh is the most vulnerable county to forceful cyclones and tropical storms (Government 86 of Bangladesh, 2010). Continental and triangular shapes at the head of Bay are found to be the 87 reasons for larger weights of storm surges in Bangladesh (Dasgupta et al., 2010). Dasgupta et al. 88 (2010) mention that due to cyclonic storm hazards, the costal belt of Bangladesh is the most deadly 89 lethal zone among the top ten cyclone prone zones in the world. Moreover, it has been predicted 90 that the intensity and frequency of cyclone will increase in future (Ali, 1996). High tidal surge 91 followed by a cyclone is another issue that is liable for a significant portion of the total damage 92 (Dasgupta et al., 2010). 93

About 10% of world's total cyclones are generated in the bay of Bengal (Ali, 1996). In between 1877 to 2009, 159 cyclones hit Bangladesh; 48 storms among them were very severe (Government of Bangladesh, 2010). Cyclone caused 450000 deaths and huge amount of economic loss since

and money donation to collective countermeasures against cyclonic disasters, since we believe that local people have gone through enough experiences of natural disasters in our study regions.

³We also elicited risk perception to climate from the respondents in our survey following Ghanbarpour et al. (2014), but most of them simply answered "high risk perception" which do not show enough variation to be included in the analysis. Therefore, we did not include them in statistical analysis. Here, we report that almost all respondents consider natural disaster and climatic changes as high risk for their life.

⁹⁷ 1970. Cyclone AILA is the latest severe cyclonic storm that hit the coast of Bangladesh on May ⁹⁸ 25, 2009 (United Nation, 2010). The storm wind speed was 65-75 mph, which was formed in ⁹⁹ the bay of Bengal on May 23, 2009 (Kumar et al., 2010). By the next two days, it had been ¹⁰⁰ intensified to a catagoty-1 severe cyclonic storm. The AILA's timing coincided with the moonless ¹⁰¹ day's highest tidal water level which caused high tidal surges up to 6.5 meters (United Nation, ¹⁰² 2010). Because of this high tidal wave, the economic damage and human sufferings are far higher ¹⁰³ than those from any other cyclone.

The most severely affected areas are four upazilas of Khulna and Satkhira districts, namely, 104 Dakope, Koyra, Shyamnagar and Asasuni (United Nation, 2010).⁴ United Nation (2010) reports 105 the damages by cyclone AILA as follows; initially, it caused 190 deaths, and 7100 injuries. Due 106 to the gigantic high tidal wave followed by the storm wind, 1742km of embankment network 107 was fully destroyed which led to heavy flooding and washed away a huge number of households, 108 livestock, standing crops, homestead-vegetables and fisheries including shrimp-ghers.⁵ In four 109 severely affected unions, almost 90-100% households were fully or partially damaged. Moreover, 110 2233km and 6621km of roads were fully and partially damaged, respectively. The 445 educational 111 facilities were damaged, and 500000 students lost their opportunities of education. Among 203932 112 households in four severely affected upazilas, 201000 households faced the damage of their latrines 113 and sanitation systems. The 80% of the total livestock and almost the total arable land have been 114 destroyed. One of the main income-generating activities in the affected areas before cyclone was 115 fisheries, such as shrimp cultivation and fish hunting from natural sources. However, approxi-116 mately 38885*ha* of sweet water fisheries and shrimp-ghers were destroyed during cyclone AILA. 117 Most of the fishermen lost their fishing boats and nets and many of them had to sell their boats and 118 given up their business for maintaining their daily cost of living. 119

The major prolonged effect after cyclone AILA is the increased level of land salinity. Destruction of the whole embankment network causes prolonged inundation and stagnation of saline water

⁴Upazila is the second lowest administrative unit in Bangladesh.

⁵"Shrimp-gher" indicates a special pond and the associated occupation for shrimp cultivation in the coastal regions of Bangladesh.

on the cultivable land. One year after this catastrophe, it has been found that only a minor portion 122 of the arable land is ready for cultivation (United Nation, 2010). This high level of land salinity 123 resulted in a 70-80% loss of agricultural productivity and reduces the shrimp cultivation produc-124 tivity by 1880kq/ha (United Nation, 2010). It has been reported that the farmers have cultivated 125 rice for the first time in 2013 after cyclone AILA, and our survey was conducted at the harvesting 126 period of their first cultivation. During our survey, the farmers have reported that the level of land 127 salinity still remains much higher than the level of land salinity before cyclone AILA. People in the 128 affected areas still suffer from scarcity of drinking water. During the dry season in Khulna district, 129 households need to spend 16% of its monthly income only for sweet drinking water (Shaha, 2014). 130 These stories convey how the negative impacts from cyclone AILA prolong. 131

132

[Figure 1 about here.]

Our study regions are the two most severely affected areas or unions of Dacope upazila in 133 Khulna district, namely, Kamarkhola, and Sutarkhali, respectively (figure 1).⁶ Dacope upazila is 134 located between 22°24' and 22°40' north latitudes and in-between 89°24' and 89°35' east longi-135 tudes. The total land area of Dacope upazila is $992km^2$ where total land areas of Kamarkhola 136 and Sutarkhali are 7214 acre, 12092 acre, respectively (Bangladesh Bureau of Statistics, 2011). In 137 Bangladesh, the coastal areas of Khulna and Satkhira districts are divided or separated into pold-138 ers. Polders are embankment-bounded areas and this network of embankments protects these areas 139 from storm surges. Kamarkhola and Sutarkhali unions are located in polder 32. These two unions 140 are surrounded by river Shibsa and Dhaki in the west and north, in the east Sutarkhali, Chunkuri, 141 and Bhadra (Bangladesh Water Development Board, 2013). Kamarkhola and Sutarkhali are the 142 two mostly affected unions among the seventeen cyclone affected unions of Khulna and Satkhira 143 districts. Based on United Nations Development Program (2009), in Dacope upazila, 94000 people 144 and 22000 households were affected. The 3200 households and 16000 people, 8000 households 145 and 40000 people were severely affected in Kamarkhola, and Sutarkhali, respectively. That implies 146 that in Kamarkhola, Sutarkhali and Tildanga, 90% and 100% of households were damaged. 147

⁶A union is the lowest administrative unit in Bangladesh.

3 Data and methodology

We run questionnaire surveys of 1000 respondents in the selected areas between December 25, 2013 and January 5, 2014. Our respondents are the household heads, and we identify per household money and/or labor donations for cyclonic disaster mitigation, considering a case of cyclone AILA. One might wonder that the object for valuation can be considered a private bad. However, a cyclone is a public bad, and any type of cyclone disaster mitigation necessitates collective countermeasures that are considered non-excludable and non-rival for avoiding the damages. Therefore, a valuation problem is similar to valuing public goods in the literature of environmental economics.

The questionnaires have been pretested by interviewing 70 household heads in the pilot survey 156 prior to the final survey. Furthermore, for finalizing the way of valuation and several other issues, 157 we consulted CVM experts. Based on the outcomes of the pilot survey and consultation with CVM 158 experts, we refine the contents and wording of the final questionnaire. The main goal of our study 159 is to elicit donations of each household for cyclonic disaster mitigation through the two channels 160 of money and/or labor. In our final survey, we first ask the possible components of damages due to 161 natural disasters such as cyclones and whether each component has been damaged during cyclone 162 AILA. We listed twelve kinds of damages that could be considered the major ones: 1. shelters, 2. 163 schools and education, 3. roads, 4. embankment, 5. sanitation, 6. standing crop and food stock, 164 7. livestock, 8. shrimp-gher and fishery, 9. health, 10. fishing boat and net, 11. land quality 165 due to salinity intrusion (land salinity), and 12. water quality due to salinity intrusion. Next, 166 we ask whether the respondent is willing to donate any amount of money and/or labor for damage 167 mitigation, considering the possible components of damage he/she recalls in the previous question. 168 We asked respondents to think that the labor and money donations expressed in the survey 169 shall be utilized or used for the disaster mitigation such as infrastructures and publicly organized 170 programs. The vehicle for eliciting money donations (labor donations) to collective disaster mit-17 igation is an extra fee per month or year (extra hours of voluntary labor per month or year). We 172 employ an open-ended question format, and a series of these procedures basically follows Markan-173

tonis et al. (2013) and Ghanbarpour et al. (2014).⁷ One unique and different feature in this survey 174 from Markantonis et al. (2013) and Ghanbarpour et al. (2014) is to give respondents the options to 175 choose labor and/or money as well as to specify their corresponding quantities. Respondents have 176 four options to express their willingness to donate: (1) labor > 0 and money > 0, (2) labor > 0177 and money = 0, (3) labor = 0 and money > 0, (4) labor = money = 0. This idea is motivated by 178 the fact that many local people may want to donate labor rather than money to disaster mitigation 179 or both. In the pilot survey, we have found that giving two options of labor and money donations 180 to respondents was effective in an open-ended questionnaire format. 181

Our final questionnaire consists of three sections. In the first section, we introduce about our-182 selves and ask questions about respondents' perceptions to a qualitative change of climate variables 183 and natural disasters, such as an increase in temperature, rainfall and frequency of cyclones. The 184 questions are asked because we are interested in the relation between people's perceptions and 185 degree of voluntary donation for disaster mitigation. The second section comprises three subsec-186 tions. In first subsection, we ask respondents to think about the possible components of cyclone 187 damages. In the second subsection, we ask whether he/she chooses labor and/or money donations, 188 and elicits the corresponding amount of donations in an open-ended format. In the third subsec-189 tion, we prepare the questions to clarify the motives behind their answers. The final section gathers 190 respondents' socio-economic information, such as their occupation, education, income, a number 191 of household members and so on. 192

We have collected a total of 1000 samples where 320 and 680 samples from the two unions of Dacope upazila, namely Kamarkhola and Sutarkhali, respectively. The number of samples has been chosen based on the proportion of number of households in these two unions. The total

⁷In fact, which elicitation formats to use can be an issue in valuing public goods especially when respondents do not have any experience of "consuming" the public goods to formulate their preference. However, in our case, respondents have sufficiently experienced cyclones, storms and related disasters, and they did not have any difficulty expressing their willingness to contribute. As mentioned earlier, in a similar type of situations, open-ended question formats have been used in previous studies (see, e.g., Markantonis et al., 2013, Ghanbarpour et al., 2014), while we could have used some other methods of CVMs such as double-bounded dichotomous choice methods. However, there are numerous previous works that justify the use of open-ended elicitation formats when people are familiar with the public goods (Mitchell and Carson, 1988, Brown et al., 1996, Carson et al., 2003, Alberini and Kahn, 2009, Martin-Ortega et al., 2011, Markantonis et al., 2013, Ghanbarpour et al., 2014). Therefore, we have determined to use the open-ended methods.

number of households in Kamarkhola and Sutharkhali were 3559 and 7536, respectively in 2011
(Bangladesh Bureau of Statistics, 2011). Therefore, 32.29% and 67.71% of the total sample has
been collected from Kamarkhola, and Surtarkhali, respectively.

To implement random sampling, we follow the procedures used in Himelein et al. (2013, 2014), 199 called geographic cluster sampling. Prior to our final survey, first we observe human movement 200 and frequency of households within our study area using GIS technology. Based on the house-201 hold numbers, first, we divided each of the unions into five sub-regions with the same number of 202 households (figure 2). We visited the study field twice before starting our survey. In the process 203 of our field visit, we took some help from local experts since it was impossible for us to reach and 204 obtain information about frequency of households. With the help of GIS technology and informa-205 tion obtained through field visits, we segregate each of the subregions into several equal stratums 206 and pick a starting point in each stratum for starting our survey. After the segregation, we started 207 the survey subregion by subregion (figure 2). In each stratum, we sent a group of two researchers. 208 Among them, the one were the trained interviewer, and the last one was a local expert and they 209 cover a whole stratum. From each stratum of a subregion, we randomly collect the same number 210 of samples. 211

One might wonder that a particular group of people, such as rich people, in these regions live 212 only in a specific area. For example, rich and educated people might tend to live in some specific 213 districts or residential areas such as in Europe, USA or Japan. However, this is not the case in the 214 study regions. All types of people are well mixed and almost equally distributed over the districts 215 where figure 2 confirms our argument. It shows that most of the households are situated adjacent 216 to embankment networks, and the middle areas surrounded by the households boundary are arable 217 lands. In this light, we can say that natural disasters, such as cyclone AILA, are equally likely to 218 affect people as a "public bad" in the study region. 219

220

[Figure 2 about here.]

Following the previous research such as in Cappellari et al. (2011) and Bauer et al. (2013), we apply a bivariate probit regression to characterize a combination of binary choices for labor and/or

money. The model is specified as follows:

$$d_{ki} = \boldsymbol{\delta}_k \mathbf{x}_{ik} + \beta_{k1} I_i + \beta_{k2} I_i^2 + \epsilon_k, \quad k = \{\ell, m\}, i = \{1, \dots, n\},$$
(1)

$$(\epsilon_{\ell}, \epsilon_m) \sim N[\mathbf{0}, \mathbf{\Omega}]$$
 (2)

where $d_{\ell i}$ and $d_{m i}$ are binary choice variables of labor or/and money donations for individual *i*, respectively, I_i is a household's income, \mathbf{x}_{ik} is a vector of independent variables and ϵ_{ℓ} and ϵ_m are error terms for labor and money donations, respectively, with mean 0 and covariance matrix Ω with covariance ρ . Finally, $\beta_{kj} = \{\beta_{\ell j}, \beta_{m j}\}$ for j = 1, 2 and $\delta_k = \{\delta_{\ell}, \delta_m\}$ are parameters to be estimated for each regression of labor and money donations. A bivariate probit regression model takes account of the correlation between ϵ_{ℓ} and ϵ_m via estimating ρ .

In addition to the bivariate regressions, we also apply Tobit regressions for labor and money donations to quantify the impact of independent variables on donations. The Tobit regressions employ the same independent variables as in the bivariate probit regression, and the dependent variables are the quantity of labor and money donations where zero donations for labor and money occupy some considerable portion. A set of independent variables included in the regression analysis contains area of the house, arable land each household owns, occupations for household heads, house ownership, family structure, income, household heads' education and age.

The difference between the other models and our model is inclusion of wage rate for labor. 234 Most of empirical studies include wage rates as a proxy of opportunity cost for time (price of money 235 giving) (see, e.g., Menchik and Weisbrod, 1987, Brown and Lankford, 1992, Cappellari et al., 2011, 236 Bauer et al., 2013). Our model does not contain the variable because many people of our sample 237 in the study region are indigenous in the sense that their life is autonomous (simply harvest and 238 eat) and largely dependent on the degree of uncertainty associated with natural environment and 239 disasters. In that sense, many respondents do not have "regular" wage and thus, we cannot quantify 240 wage rates in the same way other papers do in the developed countries. What we can do best is 241 to control occupations by putting a dummy variable for each. In this way, the opportunity cost for 242

time is somewhat controlled.

The intent of running bivariate probit and Tobit regressions is to see how incomes and other 244 explanatory variables affect money and labor donations within a single framework. For example, 245 when income increases, how does it affect money and labor donations at the same time? That 246 is to identify the substitutability or complementarity between labor and money donation when an 247 independent variable changes. Most vulnerable people against natural disasters in the third world 248 countries are indigenous. Voluntary donations from such people have neither been organized, it 249 is nor addressed about how indigenous and vulnerable people seek to cooperate against natural 250 disasters. Therefore, we do this research through eliciting the donations from local people in the 251 coastal areas of Bangladesh. 252

253 4 Empirical results

4.1 Summary statistics

Table 1 presents respondents' choices for labor and/or money donations for cyclonic disas-255 ter mitigation. Among 1000 respondents, 938 (98.3%) respondents are willing to donate either 256 money or labor to the collective countermeasures against cyclonic and associated disaster mitiga-257 tion. Hence, the only 17 respondents (1.7%) are not willing to donate any amount of both labor and 258 money. The 452 respondents choose to donate only money, and 109 respondents choose to donate 259 only labor. Finally, 422 respondents choose some amount of both labor and money to express their 260 total donations. Compared with other studies that elicit labor and/or money donations for public 26 goods, the response rate of nonzero donations in our study is high (see, e.g., Alberini and Kahn, 262 2009). 263

264

[Table 1 about here.]

Table 2 presents summary statistics of the variables. The mean and median of household labor and money donations are 112.21 hours/year, 64.00 hours/year and BDT 1,099.51/year, 600.00/year, respectively. The mean and median of labor donations are much more than our expectation, while those of money donations are lower. In the study areas, monthly household incomes are relatively low compared to other areas of Bangladesh (mean of BDT 7516 and median of BDT 6000). For instance, average household monthly income in capital city, Dhaka, is reported to be BDT 35000. This implies that relatively poor people reside in our study areas and is vulnerable to natural disasters.

273

[Table 2 about here.]

Average education (mean 4.746 and median 5) indicates that the level of education is very low 274 in our study region and most of the people do not go to college or university. In case of household 275 arable land, high standard deviation (SD) and gap between mean and median indicate that some 276 households in this region have significantly greater amount of arable land than the other house-277 holds. With respect to age, six categories are prepared because most people in rural Bangladesh 278 do not care about their exact age and cannot even answer it (See footnote 2 in table 2). The 76% 279 people are aged less than 50 years and 53% people are aged less than 40 years in this region which 280 means a significant proportion of the household heads are working-age people. In case of fam-281 ily structure, the number of single family is dominant over the number of joint family. However, 282 the proportion of joint family (24.80%) is high compared with that in other areas of Bangladesh. 283 Finally, the most notable fact in table 2 is the mix of fixed and temporary occupations. It shows 284 that only 53% of the household heads fall in fixed occupation where they are hired as a fixed po-285 sition. It is in sharp contrast with the occupational structure of developed countries or urban areas 286 of Bangladesh. 287

Table 3 presents the statistics of household income, labor and money donations per occupation. These statistics have been separately shown across occupations since the features of occupational structure are different from those of developed countries or urban areas, and it is expected that occupations explain a significant portion of the total variation in our final result. The nature of our study region is characterized by the high degree of vulnerability, the uncertainty to natural disasters, close vicinity and dependence on natural resources such as mangrove forests.

[Table 3 about here.]

In this research, we categorize subjects' occupations into (0) day labor, (1) natural resource 295 dependence, (2) farmer, (3) business, trade and service, and (4) shrimp-gher owner. "Day labor" 296 respondents mainly work in construction or small scale industries, depending on society's current 297 needs. They also work under the sea boat owners to collect wood, honey and crabs from the 298 nearby forests. During rice cultivation seasons, they work as agricultural labor. Respondents at 299 "natural resource dependence" comprise the fishermen, crab hunters, honey collectors, beekeepers 300 and wood collectors as their main job. Respondents at "farmer" include those who engage in large, 301 medium, or small scale farming activities as their main job. They own land or borrow it from 302 others for cultivation. Respondents at "business, trade and service" include all the businessmen, 303 government and non-government service holders, middlemen in fishing business and fishing boat 304 owners. "Shrimp-gher owners" are those who cultivate shrimp in their own ponds which are called 305 "gher." The third row in table 3 shows the number of respondents that belong to each category of 306 occupations. 307

Table 3 reveal that businessmen and the shrimp-gher owners are relatively high-income people, 308 while day labors, farmers and natural resource dependents are low-income people in this region. 309 In particular, the shrimp-gher owners are the highest-income people followed by business and 310 service, farmer, natural resource dependents and day labor categories. The third row in table 3 311 shows that people with high-income occupations tend to be more educated with exception that 312 shrimp-gher owners (5.68 years of schooling) are less-educated than businessmen (7.68 years of 313 schooling). Table 3 also demonstrates the summary statistics of labor and money donations across 314 occupations. They show that households with high-income occupations (highly educated) tend to 315 choose more money donation, whereas households with low-income occupations (less educated) 316 choose more labor donation. For instance, labor donation is the highest and money donation is 317 lowest for day labor. However, shrimp-gher owners donate the lowest amount of labor and the 318 highest amount of money. 319

4.2 Labor and money donation in relation to socio-economic factors

321

322

[Table 4 about here.]

[Table 5 about here.]

The estimations of bivariate probit and Tobit regressions for labor and money donations have 323 been presented in table 4. Based on the results in table 4, the marginal effects of independent 324 variables are reported in table 5 under the assumption that the other explanatory variables are at 325 their means.⁸ Since our interest is on the impact of independent variables on labor and money 326 donations, we focus on reporting the marginal effects of independent variables for both bivariate 327 probit and Tobit regressions in table 5. Overall, table 5 reveals that household income, age, family 328 structure, and occupation dummies (categories) are the significant predictors of both labor and 329 money donations, while education and occupation types are significant only in labor donation. 330

Our analysis shows that rich people tend to choose more money and less labor donations, 331 whereas poor people donate more labor and less money. The bivariate probit regression estimates 332 a 1.6% increase and a 2.7% decline in the probability of choosing money and labor, respectively, 333 when income increases by BDT 1,000 per month. Similarly, Tobit regression estimates that a BDT 334 1,000 increase in per month household income is associated with a BDT 312.99 rise and a 10.49-335 hours decline per year in money and labor, respectively. Regarding education, it appears that less 336 educated people donate more labor than more educated people, while money donation does not 337 show any strong association with respect to education (Tobit regression result in table 5). 338

Overall, our results suggest that income and education does not affect both labor and money donations in a positive direction. The effects of income and education on labor and money donations in our regression results are different from the studies in USA or Europe that find an increase

⁸We use the command "c.income##c.income" in Stata 13 to incorporate the nonlinear effect of income on dependent variable both for bivariate probit and Tobit regression. Furthermore, in our regression, we include both of occupation type and occupation category as independent variables since for every occupational category, fixed-occupation and temporary-occupation holders are mixed up due to special structures of a labor market in our study region. For instance, many businessmen fall in the category of temporary occupation since their business is a seasonal business. On the other hand, many of the semi-skilled day labor are considered "fixed occupation" because they sell their physical labor in a specific sector such as shrimp cultivation without seasonality.

in both labor and money donations with respect to income and education (see, e.g., Menchik and
Weisbrod, 1987, Brown and Lankford, 1992, Freeman, 1997, Fiorillo, 2009, Cappellari et al., 2011,
Bauer et al., 2013). However, our result is not surprising when we consider special contextual issues, socioeconomic and cultural situations in Bangladesh. We provide more detailed explanations
for this later.

Concerning the effect of family structure, the bivariate probit regression shows that joint-family 347 households are likely to choose more labor and less money. Tobit regression also confirms the 348 same tendency that, on the average, single-family households' money donation is higher and labor 349 donation is less than that of joint-family households' by BDT 611.44 and by 27.00 hours per year, 350 respectively. Joint-family households usually have more working-age members in a house and 351 therefore, they have a tendency to donate more labor. On the other hand, single-family households 352 have less working-age members and thus they have a tendency to donate less labor and more 353 money. 354

With respect to age, our analysis shows that people donate more in their early ages. A 4.7% fall 355 in the likelihood of choosing labor has been estimated when one category in household heads' age 356 increases. Tobit estimation also implies 13.05 hours and BDT 99.38 reductions per year in labor 357 and money donations, respectively, in relation to a one-category rise in household heads' age. Yet 358 again, this finding is not in line with past literature in Europoe or USA showing that both of labor 359 and money donations increases in ages (Cappellari et al., 2011, Bauer et al., 2013). However, our 360 result could be intuitively interpreted by considering the donations to natural disaster mitigation as 361 investments. For instance, the respondents in our study are potential victims of natural disasters. 362 Therefore, younger respondents have stronger incentives to make investments by donating labor 363 and/or money to natural disaster mitigation, because they can maximize the long-run return from 364 such early investments (Menchik and Weisbrod, 1987). In this sense, our result with respect to age 365 is quite plausible. 366

The bivariate probit estimation demonstrates that households with fixed occupation household heads are more likely to choose labor than that of the households with temporary occupation by

17

³⁶⁹ 25.8%. Tobit regression estimates that fixed occupation households donate more labor per year on ³⁷⁰ the average by 104.69 hours, relative to the temporary occupation. This result reflects the fact that ³⁷¹ household with fixed occupation can easily allocate specific amount of time to donation activities ³⁷² since he/she has less uncertainty over income and regular working hours.

Occupation dummies are also identified to perform as vital predictors. Relative to day labor 373 households, natural resource-dependent households and farmers are more likely to choose money 374 by 10.2% and 4.0%, respectively. While possibility of choosing labor is lower by 15.8%, 35.9%, 375 28.9% and 67.87%, respectively, for farmer, business and service, natural resource dependent and 376 shrimp-gher owner than that of the day labor. Tobit estimation identifies an increase in money 377 donation by BDT 774.15, BDT 772.05 and BDT 1249.08 on the average by the farmer, business 378 and service, natural resource dependent households, respectively, compared to that of the day 379 labor. On the other hand, farmer, business, and service, natural resource dependent, and shrimp-380 gher owner households donate 34.57, 130.85, 72.76, and 255.27 hours less labor than that of the 381 day labor households, respectively. 382

The regression results associated with occupation dummies confirm that households of oc-383 cupations with less natural resource dependence tend to choose more money, and households of 384 occupations with high natural resource dependence donate more labor. Day labor households do-385 nate the highest amount of labor per year, while shrimp-gher owners and business and service 386 households donate less labor. Therefore, the degree of natural resource dependence in occupations 387 is another key for people to choose labor and/or money donations. Day labor, farmer and natural 388 resource dependent households heavily depend on the availability of natural resources and prone 389 to natural uncertainty for their livelihood, implying that their income fluctuate due to natural and 390 climate events. 391

Among the occupations, day labor occupation is the most physical labor intensive followed by the natural resource dependent and farmer, while it does not mean that each occupation is under labor-time constraint. Households with these occupation donate more labor than that of the business, and service, and shrimp-gher owner households. This predisposition comes from the

18

nature of the occupations, for instance, day labors, natural resource dependents, and farmers are habituated with hard physical labor for their livelihood and do not hesitate to donate labor. On the other hand, businessmen, service holders and shrimp-gher owners are comparatively highly educated and are not habituated with heavy physical labor. In addition, they consider labor donation to natural disaster mitigation as low-class types of works on the basis of Bangladeshi culture or customs. Due to these reasons, rich and more educated people choose to donate more money and little money, while poor and less educated people choose to donate more labor and less money.

Overall, with fewer exceptions, the bivariate probit and Tobit regressions show the consistent 403 results each other. The estimated ρ value of -0.384 (significant at 1% level) in the bivariate pro-404 bit regression indicates a significant and negative association between labor and money donations. 405 Similarly, the effect of income and other explanatory variables on labor and money donations 406 implies the substitutability between labor and money donations as well. Finally, to see the sub-407 stitutability effect of independent variables on labor and money donations on the same basis, we 408 convert labor donation to monetary term and compare it with money donation based on the regres-409 sion results. For this, we use the conversion rate of BDT 37.50 per labor hour and compare the 410 "monetary labor donation" with money donation. The BDT 37.50 is the minimum wage in the 41 study region and the lowest conversion rate. 412

The conversion computation based on our Tobit regressions finds that a BDT 1000 rise in per 413 month household income leads to a BDT 80.57/year decline in total donation. A fall in "mone-414 tized" labor is more significant than an increase in money donation with respect to the income. 415 This finding is striking and in contrast with the studies in Europe and USA since they find a pos-416 itive association between the income and the overall donation. Our results clarify that the labor 417 is an important channel and significant for total donation. Overall, the poor and less educated 418 households with the occupations of higher natural resource dependence are identified to contribute 419 a large portion of overall donations via labor. The rich and more educated people are willing to do-420 nate money and little labor, but the magnitude of donations is rather small. In summary, labor and 421 money donations exhibit the relation of substitutability with respect to most socio-economic vari-422

ables, and education and income do not positively affect overall donations for disaster mitigationin Bangladesh.

There are several important factors to explain the results of donation behavior to natural disaster 425 mitigation in Bangladesh. Donation for charities in USA and Europe is qualitatively different from 426 donation to disaster mitigation in our study areas. Natural disasters directly harm local people's 427 wealth and earning. Thus, local people are the direct victims of natural disasters and their donation 428 to natural disaster mitigation is considered "investments" and directed toward the reduction of 429 future losses from disasters. Donation behaviors are based on people's strong desire to improve 430 or to stabilize their future life and it is a main motivation. In USA or Europe, philanthropies and 431 charities are considered important social contributions and luxury goods, inducing the rich and 432 educated people to donate more of both labor and money (Andreoni, 2006). 433

In the study region, people who are the most vulnerable to climatic changes and associated 434 disasters are poor and less educated people with high natural resource dependence, whereas rich 435 and educated people with less natural resource dependence are not so vulnerable because their life 436 does not depend on nature. Poor and less educated people with high natural resource dependence 437 are those who do not have any option to migrate, and are required to cooperate with neighboring 438 people for survival through the activities of fishing, hunting and harvesting foods on a daily basis. 439 In other words, the best practice for such people to survive is to cooperate with others in the 440 neighborhood. Our data analysis confirms that poor and less educated people with high natural 441 resource dependence contribute a large portion of total donation via labor, reflecting their best 442 strategy of cooperation in their daily life even for natural disaster mitigation. 443

The rich and educated people with less natural resource dependence in the study regions usually consider labor donations to natural disaster mitigation as low-class types of works and thus are not willing to do so. They even have an option to migrate to other areas because their skills and wealth enable to do so. In addition, they are not required to cooperate with "neighboring" people, because they earn income through their own business and office works. This type of differences in their daily life appears to reflect our result that rich and more educated people with low natural resource dependence donate only money, but the magnitude is small, compared to poor and less educated people with high natural dependence. Those who are likely to suffer from natural disasters in more serious ways are motivated to donate more, that is, poor and less educated people with high natural dependence. These types of contextual differences in natural resource dependence, income and education could be considered the main logic behind our result.

455 **5** Conclusion

This paper analyzes people's labor and money donations in relation to socio-economic factors 456 in third world countries with a specific eye on cyclonic disaster mitigation. Moreover, it examines 457 the substitutability or complementarity between labor and money donations in relation to income 458 and other socio-economic factors. We are motivated to do so since collective countermeasures 459 to protect the coastal people of Bangladesh from cyclonic disasters is urgent, and in the process 460 of mitigation planning and implementation, it is important to identify how disaster-susceptible 461 people are willing to donate. To analyze the donation behavior of local people to natural disaster 462 mitigation, we conducted surveys of 1000 households and analyzed the data through bivariate 463 probit and Tobit regressions to see how labor and money donations are related to socio-economic 464 factors compared to the donation behaviors observed in USA and Europe. 465

The analysis finds that age, family structure, education, income and occupation are important 466 determinants for Bangladeshi people to decide between labor and money donations as well as 467 their respective amount. The poor and less educated households with the occupations of higher 468 natural resource dependence are identified to contribute a large portion of overall donations via 469 labor. The rich and more educated people are willing to donate money and little labor, but the 470 magnitude of donations is rather small. In summary, labor and money donations exhibit the relation 471 of substitutability with respect to most socio-economic variables, and education and income do not 472 positively affect overall donations in Bangladesh. This finding is in sharp contrast with the studies 473 in USA or Europe. 474

This study demonstrates that people's donation behaviors for the case of natural disaster mitiga-475 tion in a developing country could be considered different from those for the charities in developed 476 countries. We confirm an importance of labor donations from our statistical analysis, which is 477 quite consistent with disaster mitigation activities for other cases all over the world. Public mitiga-478 tion programs that organize labor and money donations from people are not well established in the 479 study regions of Bangladesh and many third world countries, whereas such collective countermea-480 sures against climatic change and associated disasters are urgent. Considering our finding in this 481 research, there should be some possibility of successful development for sustainable and collective 482 disaster mitigation practices by fully utilizing labor donations in each locality. 483

It is our belief that the qualitative result in this research gives some insights to more general cases. As our result suggests, labor could be identified as a major channel of the donation for many disaster mitigation. For instance, planting trees, green belting and community forest projects can be well organized beforehand through labor donations as cyclonic disaster mitigation in both developing countries. Such projects require constant donation from the local community when local people are motivated to donate to such mitigation projects that stabilize or improve their life in communities.

We relied on elicited labor and money donations to analyze the behavior since it is impossible to observe the "actual" labor and money donation behaviors in our study areas. Considering this nature of elicited labor and money, there might be hypothetical biases that could be considered one limitation in our study. However, our respondents are those who have experienced frequent natural disasters, in particular, cyclones and storms, and could answer the labor and money donations effectively without any incentive to tell a lie.⁹ Hence, the hypothetical biases for labor and money donations are expected to be rather small.

⁹More specifically, the possible bias could have been upward. However, such an upward bias (i.e., concerns for overestimation) for labor donations and money donations shall not be a serious concern in this research, because reported values of labor donations and money donations elicited especially from poor people appear to be quite plausible and understandable on the basis of their daily life styles and price levels in that region.

6 Bibliography

Alberini, A. and Kahn, J. R., editors (2009). Handbook on contingent valuation. Edward Elgar.

- Ali, A. (1996). Vulnerability of Bangladesh to climate change and sea level rise through tropical cyclones and storm surges. *Water, air, and soil pollution*, 92:171–179.
- Andreoni, J. (2006). Philanthropy. In Kolm, S. and Ythier, J., editors, *Handbook of giving, reciprocity and altruism*, volume 2, chapter 18, pages 1201–1269. Elsivier.
- Bangladesh Bureau of Statistics (2011). District statistics, Khulna, 2011.
- Bangladesh Water Development Board (2013). Resettlement action plan, volume II.
- Bauer, T. K., Bredtmann, J., and Schmidt, C. M. (2013). Time vs. money—The supply of voluntary labor and chritatable donations across Europe. *European journal of political economy*, 32:80– 94.
- Beldad, A., Gosselt, J., Hegner, S., and Leuhuis, R. (2015). Generous but not morally obliged? Determinants of Dutch and American donars' repeat donation intention (REPDON). *Voluntas: International journal of voluntary and nonprofit organizations*, 26:442–465.
- Brown, E. and Lankford, H. (1992). Gifts of money and gifts of time: Estimating the effects of tax prices and available time. *Journal of public economics*, 47:321–341.
- Brown, T. C., Champ, P. A., Bishop, R. C., and McCollum, D. W. (1996). Which response format reveals the truth about donations to a public good? *Land economics*, 72:152–166.
- Cappellari, L., Ghinetti, P., and Turati, G. (2011). On time and money donations. *Journal of socio-economics*, 40:853–867.
- Carson, R. T., Mitchell, R. C., Hanemann, M., Kopp, R. J., Presser, S., and Ruud, P. A. (2003). Contingent valuation and lost passive use: Damages from the Exxon Valdez oil spill. *Environmental and resource economics*, 25:257–286.
- Cooper, P., Poe, G. L., and Bateman, I. J. (2004). The structure of motivation for contingent values: A case study of lake water quality improvement. *Ecological economics*, 50:69–82.
- Dasgupta, S., Huq, M., Khan, Z. H., Ahmed, M. M., Mukherjee, N., Khan, M. F., and Pandey, K. (2010). Vulnerability of Bangladesh to cyclones in a changing climate: Potential damages and adaptation cost. Policy research working paper 5280.
- Dorcey, A. H. J. and McDaniels, T. (2001). Great expectations, mixed results: Trends in citizen involvement in Canadian environmental performance. In *Governing the environment*. Toronto university press.
- Duncan, B. (1999). Modeling charitable contributions of time and money. *Journal of public economics*, 72:213–242.

- Emanuel, K. (2005). Increasing destructiveness of tropical cyclones over the past 30 years. *Nature*, 436:686–688.
- Feldman, N. E. (2010). Time is money: Choosing between chartitable activities. American economic journal: Economic policy, 2:103–130.
- Fiorillo, D. (2009). Volunteer labour supply: Micro-econometric evidence from Italy. In Musella, M. and Destefanis, S., editors, *Paid and unpaid labour in the social economy. An international perspective*, AIEL Series in Labour Economics, chapter 10, pages 165–181. AIEL.
- Freeman, R. B. (1997). Working for nothing: The supply of volunteer labor. *Journal of labor* economics, 15:140–160.
- Ghanbarpour, M., Saravi, M. M., and Salimi, S. (2014). Floodplain inundation analysis combined with contingent valuation: Implications for sustainable flood risk management. *Water resources management*, 28:2491–2505.
- Godschalk, D. R., Bordy, S., and Burby, R. (2003). Public participation in natural hazard mitigation policy formation: Challenges for comprehensive planning. *Journal of environmental planning and management*, 46:733–754.
- Government of Bangladesh (2010). National plan for disaster management 2010-2015. Technical report, Government of Bangladesh.
- Henrich, J., Heine, S. J., and Norenzayan, A. (2010). The weirdest people in the world? *Behavioral and brain sciences*, 33:61–135.
- Himelein, K., Eckman, S., and Murray, S. (2013). The use of random geographic cluster sampling to survey pastoralists. World Bank policy research working paper 6589.
- Himelein, K., Eckman, S., and Murray, S. (2014). Sampling nomads: A new technique for remote, hard-to-reach and mobile population. *Journal of official statistics*, 30:191–213.
- Kumar, U., Baten, M. A., Masud, A. A., Osman, K. S., and Rahman, M. (2010). Cyclone AILA: One year on natural disaster to human sufferings. Technical report, Unnayan Onneshan.
- Luo, X. and Levi, A. E. (2013). Factors influencing willingness to participate in disaster reduction. *Natural hazards*, 66:1243–1255.
- Markantonis, V., Meyer, V., and Lienhoop, N. (2013). Evaluation of the environmental impacts of extreme floods in the Evros river basin using contingent valuation method. *Natural hazards*, 69:1535–1549.
- Martin-Ortega, J., Brouwer, R., and Aiking, H. (2011). Application of a value-based equivalency method to assess environmental damage compensation under the European environmental liability directive. *Journal of environmental management*, 92:1461–1470.
- Menchik, P. L. and Weisbrod, B. A. (1987). Volunteer labor supply. *Journal of public economics*, 32:159–183.

- Mileti, D. (1999). *Disasters by design: A reassessment of natural hazards in the United States.* Joseph Henry Press.
- Mitchell, R. C. and Carson, R. T. (1988). Using surveys to value public goods: The contingent valuation method. RFF Press.
- Pearce, L. (2003). Disaster management and community planning and public participation: How to achieve sustainable hazard mitigation. *Natural hazards*, 28:211–228.
- Schiermeier, Q. (2011a). Extreme measures. Nature, 477:148–149.
- Schiermeier, Q. (2011b). Increased flood risk linked to global warming. Nature, 470:316.
- Shaha, P. S. (2014). The cost of drinking water in the coast is even higher than that of Dhaka city. Daily Prothom Alo. In Bengali.
- United Nation (2010). Cyclone AILA: Joint UN mutlisector assessment and response framework. Technical report, United Nation.
- United Nations Development Program (2009). Field visit report on selected AILA affected areas. Technical report, United Nations Development Program.
- Wiepking, P., editor (2009). The state of giving research in Europe. Pallas publication.
- Wright, K. (2001). Generosity vs. altruism: Philanthropy and charity in the United States and United Kingdom. Voluntas: International journal of voluntary and nonprofit organizations, 12(4):399–416.

List of Figures

1	Geography of study regions where "sunderban" indicates mangrove forest areas	27
2	Segregation of the study area for randomization	28



Figure 1: Geography of study regions where "sunderban" indicates mangrove forest areas



Figure 2: Segregation of the study area for randomization

List of Tables

1	Frequencies of choices for labor and/or money donations	30
2	Summary statistics of the variables	31
3	Household income, labor and money donation per occupation	32
4	Bivariate and Tobit regressions	33
5	Marginal effects of bivariate and Tobit regressions	34

		Labor 0 1		Total
				iotai
Monov	0	17	109	126
Money	1	452	422	874
Total		469	531	1000

Table 1: Frequencies of choices for labor and/or money donations

Variables	Mean	Median	SD	Min	Max
Money donation (BDT/year)	1099.51	600.00	1835.74	0.00	19000
Labor donation (hours/year)	112.21	64.00	122.33	0.00	440.00
Household income per month (1000 BDT)	7.51	6.00	5.16	1.00	50.00
Area of the household shelter (Katha)	5.72	3.00	11.88	0.00	300.00
Arable land for a household (Katha)	48.10	8.00	325.17	0.00	10000.00
Age ¹	1.56	1.00	1.34	0.00	5.00
Fixed occupation (0 or 1)	0.53	1.00	0.49	0.00	1.00
House ownership (0 or 1)	0.78	1.00	0.41	0.00	1.00
Single family ²	0.75	1.00	0.43	0.00	1.00
Education (years)	4.75	5.00	4.14	0.00	16.00
¹ Age is coded as 0, 1, 2, 3, 4, 5 when the ra 40-49, 50-59, 60-69 and more than 70, res	nge for th pectively.	e househol This codir	d head's a ig is made	ge is 1 ² due to	1-30, 31-39, the fact that

variables
of the
statistics
Summary
Table 2:

most people do not care about their exact age in rural Bangladesh. ² It is a dummy variable taking 1 with a single family. When it is a joint family, it is 0.

Ctation		Occupatic	sue			O.rom11
Stausurcs	Day labor	Natural resource dependence	Farmers	Business	Shrimp-gher	Overall
# of respondents	184	191	421	182	22	1000
Average years of schooling	2.26	3.48	5.09	7.68	5.68	4.74
Household income (BDT/me	onth)					
Average	5168	6126	7902	8850	20795	7516
Median	5000	6000	7000	8000	20000	0009
SD	1924	2416	4984	4676	15038	5158
Min	2000	2000	1500	2000	1000	1000
Max	12000	20000	35000	25000	50000	50000
Labor donation (hours/year)						
Average	179	98	125	38	25	112
Median	200	0	128	0	0	64
SD	101	127	124	85	75	122
Min	0	0	0	0	0	0
Max	368	440	405	385	312	440
Money donation (BDT/year)						
Average	153	1158	1186	1538	3210	1099
Median	50	1000	545	1000	2350	009
SD	213	1509	2017	2030	2828	1835
Min	0	0	0	0	0	0
Max	1050	19000	16500	15700	10500	19000

•	er occupation
	on p(
	lonati
	noney c
-	and r
	labor
	come,
	d E
	Į
	ousel
ļ	Н
	<u>e</u>
Ē	lab

	Bivaria	te probit	Tol	oit
	Money	Labor	Money	Labor
Household income (BDT 1000)	0.27***	-0.11^{***}	386.73***	-16.10^{***}
	(0.059)	(0.026)	(44.32)	(3.84)
Household income squared	-0.0050*	0.0030***	-4.91^{***}	0.37***
-	(0.0030)	(0.0010)	(1.24)	(0.11)
Area of the house (katha)	-0.012*	0.0050	-4.08	0.86
	(0.0060)	(0.0050)	(4.75)	(0.84)
Arable land (katha)	-0.000	-0.0020 **	0.32**	-0.22
	(0.0020)	(0.0010)	(0.166)	(0.17)
Age	-0.10**	-0.12^{***}	-99.38***	-13.05^{***}
	(0.045)	(0.034)	(40.85)	(5.05)
Fixed occupation (ref. temporary)	-0.318^{**}	0.647***	17.36	104.69***
	(0.16)	(0.099)	(111.29)	(15.56)
House ownership (ref. no ownership)	0.27*	0.071	-14.06	27.43*
	(0.15)	(0.13)	(137.39)	(16.94)
Single family (ref. joint)	0.59***	-0.20*	611.44***	-27.00*
	(0.16)	(0.11)	(144.49)	(16.38)
Education	0.035*	-0.041^{***}	18.14	-7.29***
	(0.019)	(0.013)	(13.22)	(1.87)
Occupation (ref. day labor)				
Farmer	0.86***	-0.40^{***}	774.15***	-34.57^{**}
	(0.15)	(0.14)	(120.97)	(15.47)
Business & service	0.82***	-0.90^{***}	772.05***	-130.85^{***}
	(0.22)	(0.18)	(163.85)	(25.63)
Natural resource dependence	1.29***	-0.72^{***}	1249.08***	-72.76^{***}
	(0.21)	(0.15)	(184.48)	(19.83)
Shrimp-gher owner	5.89	-1.70^{***}	586.15	-255.27 ***
	(14.69)	(0.413)	(515.78)	(75.70)
Constant	-1.29^{***}	1.36***	-2668.82^{***}	187.44***
	(0.39)	(0.24)	(345.43)	(32.75)
ρ	-0.3	38***		
Log likelihood	-82	14.47		
<i>F</i> -statistics			25.29	27.59
Wald χ^2	64	3.79		

Table 4: Bivariate and Tobit regression	ns
---	----

***significant at the 1 percent level, **at the 5 percent level and *at the 1 percent level.

	Bivari	ate probit	To	obit
	Money	Labor	Money	Labor
Household income (BDT 1000)	0.016*	-0.027***	312.98***	-10.49***
	(0.0090)	(0.0070)	(31.86)	(2.73)
Area of the house (katha)	-0.0010	0.0020	-4.08	0.86
	(0.0010)	(0.0020)	(4.75)	(0.84)
Arable land (katha)	-0.000	-0.001*	0.32**	-0.22
	(0.000)	(0.000)	(0.166)	(0.17)
Age	-0.0080	-0.047^{***}	-99.38^{***}	-13.05^{***}
	(0.0060)	(0.014)	(40.85)	(5.05)
Fixed occupation (ref. temporary)	-0.025	0.26***	17.36	104.69***
	(0.18)	(0.039)	(111.29)	(15.56)
House ownership (ref. no ownership)	0.21	0.028	-14.06	27.43*
	(0.16)	(0.050)	(137.39)	(16.94)
Single family (ref. joint)	0.047*	-0.080*	611.44***	-27.00*
	(0.027)	(0.044)	(144.49)	(16.38)
Education	0.003	-0.017***	18.14	-7.29^{***}
	(0.002)	(0.005)	(13.22)	(1.87)
Occupation (ref. day labor)				
Farmer	0.067*	-0.158***	774.15***	-34.57 **
	(0.040)	(0.058)	(120.97)	(15.47)
Business & service	0.064	-0.36^{***}	772.05***	-130.85^{***}
	(0.044)	(0.071)	(163.85)	(25.63)
Natural resource dependence	0.102*	-0.29^{***}	1249.08***	-72.76^{***}
	(0.062)	(0.061)	(184.48)	(19.83)
Shrimp-gher owner	0.46	-0.68^{***}	586.15	-255.27 ***
-	(0.89)	(0.16)	(515.78)	(75.70)

Table 5: Marginal effects of bivariate and Tobit regressions

***significant at the 1 percent level, **at the 5 percent level and *at the 1 percent level.