## Heterogeneous substitutability preferences

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**Abstract:** We study the heterogeneity of preferences regarding the limited substitutability of environmental public goods vis-a-vis private consumption goods and how it may affect the economic valuation of environmental public goods. We show theoretically that mean marginal willingness to pay for an environmental public good decreases in society's mean substitutability preference and increases in the heterogeneity of individual-level substitutability preferences. We then introduce an experimental framework to elicit individual-level substitutability preferences directly, which we apply to studying the heterogeneity of general population preferences regarding the trade-off between market goods and forest ecosystem services. We estimate preference parameters for around 1,500 individuals and document substantial preference heterogeneity. The majority of preferences imply a complementary relationship, with a median elasticity of substitutability preferences may considerably increase the societal value attached to environmental public goods. These findings are relevant for environmental cost-benefit analysis and for the comprehensive accounting of public natural capital.

## **JEL-Classification:** Q51, Q56, H41, D64, C99

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# 1 Introduction

Limited substitutability of nature's services is at the heart of the sustainability debate and has long been recognized as a key determinant for the economic valuation of environmental goods and services (e.g., Krutilla 1967, Hanemann 1991, Gerlagh and van der Zwaan 2002, Neumayer 2010, Traeger 2011, Drupp et al. 2024a). So far, however, the theoretical literature has mainly focused on implications of limited substitutability between market and non-market goods for environmental valuation or for estimating the social cost of carbon in representative agent or equal-preference models, thereby neglecting the role of heterogeneous substitutability preferences (e.g., Baumgärtner et al. 2017a, Drupp and Hänsel 2021). Relatedly, empirical estimates of substitution preferences have relied on indirect evidence informed by income elasticities of willingness-to-pay (WTP) derived from aggregate-level data (e.g., Drupp 2018, Drupp et al. 2024b, Conte et al. 2025). No study that we are aware of has elicited the elasticity of substitution between market and non-market goods directly and studied its heterogeneity across individuals.

In this paper, we address these gaps by theoretically and empirically studying heterogeneous substitutability preferences between environmental public goods and private consumption goods and their implications for the economic value of environmental public goods. We start by exploring how heterogeneous preferences affect a first-order approximation of society's aggregate marginal WTP for environmental public goods in the simplest possible theoretical framework. We then turn to our main contribution, to estimate individual substitutability preferences—for the first time directly—with a large scale online experiment that posits trade-offs between market goods or income and forest ecosystem services across four treatments that contrast incentivized versus hypothetical as well as private versus public settings. Using empirical preference estimates from almost 1,500 participants from the general population in Germany, we illustrate our theoretical results for how the heterogeneity in substitutability preferences affects the economic value of nature in society.

In the first part of this paper, we extend a basic equal-preference model that provides a closed-form solution of how a first-order approximation of mean marginal WTP depends on income, the environmental service level as well as fundamental preference parameters (e.g., Ebert 2003, Baumgärtner et al. 2017a, Smith 2023). Specifically, we consider a continuum of individuals that derive utility from a pure-public good and a private consumption good in a constant elasticity of substitution (CES) form. We assume that individuals differ in their perception of how well environmental public goods are substitutable by or complementary to private goods or income. For reasons of analytical tractability, we derive results for the inverse of the elasticity of substitution, which we refer to as the 'elasticity of complementarity', as it measures the degree of an individual's complementarity preference.<sup>1</sup> We find that an increase in the *mean* complementarity preference *increases* mean marginal WTP for environmental public goods. Furthermore, an increase in the *heterogeneity* of complementarity preferences (an increase in the mean-preserving spread) also *increases* mean marginal WTP for environmental public goods (except for the special case in which the availability of public and private goods is the same). Thus, an environmental public good is more valuable from a societal perspective—holding the average degree of complementarity fixed—the stronger individuals differ in their complementarity preferences. When assuming that complementarity preferences are normally distributed within society, we can show that compared to the standard case of homogeneous preferences—considering heterogeneous preferences exponentially increases the societal value of environmental public goods.

In the second part of this paper, we introduce an experimental framework to study individual complementarity preference given by the elasticity of complementarity (or its

<sup>&</sup>lt;sup>1</sup>Our modeling approach is related to Gollier (2019), who studies the effect of uncertain substitutability of environmental goods on the ecological discount rate in a dynamic context and shows that an increase in risk concerning substitutability decreases the ecological discount rate. While uncertainty of the average substitutability preferences may get resolved over time as knowledge improves, such as through investments into knowledge that targets the degree of substitutability (e.g., Fenichel and Zhao 2015), the heterogeneity of substitutability preferences may remain considerable within society and, importantly, is also relevant in a static and deterministic context.

inverse, the elasticity of substitution) between market goods and non-market environmental goods for the first time directly. While substantial heterogeneity in preferences across individuals has been documented for other key preference parameters, such as risk, time or fairness preferences (e.g. Andersen et al. 2008, Barsky et al. 1997, Falk et al. 2018, Fisman et al. 2015, Von Gaudecker et al. 2011), we are not aware of empirical studies directly eliciting individual preferences for the limited substituability between market consumption goods and environmental public goods.<sup>2</sup> The prior literature has so far drawn on an indirect relationship between the income elasticity of WTP and the elasticity of complementarity (or substitution) to estimate the latter from variation of WTP and income across individuals (e.g., Barbier et al. 2017, Drupp 2018, Martini and Tiezzi 2014) or across non-market valuation studies (e.g., Jacobsen and Hanley 2009, Heckenhahn and Drupp 2024, Conte et al. 2025). Besides a few exceptions, this literature has found income elasticities of WTP, and thus elasticities of complementarity, between zero and unity, implying that the goods are perceived as substitutes.

With our experiment, we seek to estimate substitutability preferences directly at the individual level. To this end, we consider trade-offs between (private or public) income and donations to plant forest trees, either real or hypothetical. Our design is informed by the literature on the elicitation of fairness preferences (e.g., Andreoni and Miller 2002, Fisman et al. 2007, 2015) and on drivers of donations in giving behavior (e.g., Bartels et al. 2024, Huck et al. 2015, Karlan and List 2007, Kesternich et al. 2016). While studies employing modified dictator games have so far focused on monetary trade-offs across individuals, estimating preferences for balancing equity and efficiency between a giver and a receiver, the donations literature has explored the effect of varying prices of giving using between-subject designs, but without estimating heterogeneous elasticities of substitution between keeping and giving at the individual level.

<sup>&</sup>lt;sup>2</sup>Other revealed or stated preference approaches, such as hedonic pricing (e.g., Kuminoff et al. 2013) or choice experiments (e.g., Brouwer et al. 2010), have explored preference heterogeneity, but we have found no case where the elasticity of substitution or complementarity between market and non-market goods has been elicited or estimated directly.

We elicit heterogeneous substitutability or complementarity preferences between environmental goods and income empirically in an online experiment drawing on a large general population sample. Specifically, we employ a modified, generalized dictator game and ask more than 2,000 Germans to repeatedly choose their preferred consumption allocation between a public environmental good and income. Through variations in the relative prices across decision tasks we then estimate preferences of a CES utility function for around 1,500 individuals with well-behaved preferences. We allocate participants to four treatment arms to assess the sensitivity of our estimates with respect to the experimental setting. Treatments differ in whether the choices are incentivized or hypothetical and whether the chosen income is paid out to the individuals themselves or to the public (to the German Finance Ministry). We document substantial heterogeneity in substitutability preferences.<sup>3</sup> The majority of individual preferences imply a complementary relationship, with a median elasticity of substitution (complementarity) of around 0.4 (2.5). Substitutability preferences vary only mildly across treatments and do not systematically differ along income or measures of environmental preferences.

In the final step of the paper, we bring our theoretical insights and empirical estimates together and illustrate how accounting for heterogeneity in substitutability preferences increases mean marginal WTP for environmental public goods in society as compared to the standard case of equal preferences. This illustration indicates large effect sizes, if the measured complementarity preferences heterogeneity is observed in a situation where the environmental good is slightly more scarce than human-made consumption goods. While solely illustrative, our results imply that accounting for heterogeneous substitutability preferences may have important implications for future non-market valuation, policy appraisal and accounting (e.g., Bastien-Olvera and Moore 2021, Bastien-Olvera et al. 2024, Drupp and Hänsel 2021, Drupp et al. 2024a, Sterner and Persson 2008).

<sup>&</sup>lt;sup>3</sup>The 5–95 percentiles ranges for our estimated elasticity of complementarity range from 0.37 to 261.48, which is large in comparison to other isoelastic preference estimates (e.g., risk or inequality aversion). For instance, the 5–95 percentile ranges of the CES equality-efficiency parameter in Fisman et al. (2015) range from 0.03 to 9.50, while they range from 0.05 to 3.80 in Choi et al. (2007).

The rest of this paper is structured as follows. In Section 2, we present a simple stylized model, where individuals have heterogeneous substitutability preferences and present theoretical results. We first consider the impact of a mean preserving spread and then specify the elasticity of complementarity to be normally distributed to obtain closed-form solutions to explore their impact on the societal mean marginal WTP. In Section 3, we introduce our experimental design, the preference parameter estimation strategy as well as its application in an online experiment with a large general population sample. Finally, in Section 4, we bring our theory and empirical data together. Sections 5 and 6 close by discussing limitations of our analyses and by drawing conclusions.

# 2 Theory

## 2.1 Model

To focus the analysis on the role of heterogeneous substitutability preferences between an environmental public good and a private consumption good, we consider the simplest possible framework. A society that consists of a continuum of individuals, labeled i = $1, \ldots, n$ , and a single time period. Individuals derive utility from consuming a private, market-traded good, C, and an environmental public good, E, which is non-rival and non-excludable in consumption, so that all households benefit from the same quantity. Preferences are homothetic, and both goods are assumed to be normal goods. Utility is ordinal and preferences are represented by a constant-elasticity-of-substitution (CES) utility function, which is strictly concave:

$$U_i(C, E; \eta_i) = \left(\alpha C^{1-\eta_i} + (1-\alpha) E^{1-\eta_i}\right)^{\frac{1}{1-\eta_i}},\tag{1}$$

where  $\alpha \in (0, 1)$  is the utility share of the private, market-traded good and  $\eta_i \in (0, \infty)$  is individual *i*'s inverse of the elasticity of substitution between the environmental public good and the private consumption good. The parameter  $\eta_i$  captures the limited degree of substitutability or the increasing degree of complementarity. We thus refer to it as the *elasticity of complementarity*. For  $\eta < 1$  the two goods are considered substitutes; for  $\eta > 1$  they are complements.<sup>4</sup>

We assume that households have the same income levels, Y > 0, and solely differ in their substitutability preferences. This means that all differences in the evaluation of the environmental public good, E, are due to differences in preferences and not by an unequal endowment with income or the environmental public good.<sup>5</sup> As we consider a single private consumption good, all income is spent on it. Hence, C = Y/P, which further simplifies to C = Y with private consumption good as numeraire, that is P = 1.

The marginal willingness to pay (WTP),  $\omega_i(Y, E; \eta_i)$  for one unit of E is the marginal rate of substitution between the public and private good (cf. Ebert 2003):<sup>6</sup>

$$\omega_i(Y, E; \eta_i) := \frac{\partial U_i(Y, E; \eta_i) / \partial E}{\partial U_i(Y, E; \eta_i) / \partial Y} \stackrel{(1)}{=} \frac{1 - \alpha}{\alpha} \left(\frac{Y}{E}\right)^{\eta_i}.$$
(2)

Thus, the individual marginal WTP for the environmental public good is a simple function of the ratio of income and the environmental public good to the power of the individual-specific elasticity of complementarity, weighted by the relative utility share parameters for the private and public good consumption.<sup>7</sup> Observe from Eq. (2) that the elasticity of complementarity equals the income elasticity of WTP for the environmental public good, which is defined as  $\eta_i := \frac{\partial \omega_i}{\partial Y} \frac{Y}{\omega_i}$  (cf. Ebert 2003, Kovenock and Sadka 1981).

<sup>&</sup>lt;sup>4</sup>We formally study the model with the elasticity of complementarity,  $\eta$ , instead of the elasticity of substitution throughout for reasons of analytical tractability (cf., Gollier 2019).

<sup>&</sup>lt;sup>5</sup>See Baumgärtner et al. (2017a) for an examination of unequal income and Meya (2020) for a treatment of unequal endowment with an environmental (local) public good.

<sup>&</sup>lt;sup>6</sup>Marginal WTP (sometimes referred to as 'virtual' or 'Lindahl price'),  $\omega$ , can be interpreted as the price the individual would have been willing to pay if the level of the public good, E, had been freely chosen on a hypothetical market (e.g. Flores and Carson 1997, Ebert 2003).

<sup>&</sup>lt;sup>7</sup>Note that this represents a first-order approximation of WTP, as discussed in detail in Smith (2023).

## 2.2 Theoretical results

#### 2.2.1 Heterogeneous substitutability preferences

We now turn to the societal value of the environmental good. This is motivated by a key result of public economics (Lindahl-Samuelson-condition): Pareto-efficiency requires that public goods are supplied to the extent that the sum of individuals' marginal WTPs equals the marginal (opportunity) cost of supplying the public good (Lindahl 1928, Samuelson 1954). Thus, aggregate marginal WTP is meaningful without interpersonal comparison in utility or the specification of a welfare function.

For the remainder,  $\eta$  is a distributed variable that describes the continuous distribution of the inverse of the elasticity of substitution in the population. Society's mean marginal WTP is the expected value for a given distribution of  $\eta$ :

$$\overline{\omega}(Y,E;\eta) := \mathbb{E}\left[\omega(Y,E;\eta)|\eta\right] \stackrel{(2)}{=} \mathbb{E}\left[\frac{1-\alpha}{\alpha} \left(\frac{Y}{E}\right)^{\eta}|\eta\right] = \frac{1-\alpha}{\alpha} \mathbb{E}\left[\left(\frac{Y}{E}\right)^{\eta}|\eta\right].$$
(3)

This mean marginal WTP is a measure for societal WTP, as aggregate WTP is the sum of individual WTPs, which is the mean multiplied by the number of individuals.

#### **Proposition 1**

Let  $\eta$  denote the inverse of the elasticity of substitution (i.e., the elasticity of complementarity) between a public and private good. Any mean preserving spread in  $\eta$  increases the economic value of the public good. The only exception is the case where the level of the private and public goods are identical.

Proof. For  $Y \neq E$  it holds that  $k(\eta) := (Y/E)^{\eta}$  is a convex function in  $\eta$ , for positive levels of income and the environmental good, Y > 0 and E > 0. Therefore, by Jensen's inequality,  $\mathbb{E}[(Y/E)^{\eta}]$  increases by any mean-preserving spread of  $\eta$ . As  $\alpha \in (0, 1)$ , Eq. (3) is a positive function of  $\mathbb{E}[(Y/E)^{\eta}]$ . Hence,  $\overline{\omega_i}(Y, E; \eta)$  also increases by any mean-preserving spread of  $\eta$ . For Y = E, however,  $k(\eta) = 1$  is constant, as is  $\mathbb{E}[(Y/E)^{\eta}]$ , and thus remains unaffected by a mean-preserving spread of  $\eta$ .

Figure 1 illustrates Proposition 1 for two individuals that exhibit a low elasticity of complementarity,  $\eta_{\text{low}}$ , and a high elasticity,  $\eta_{\text{high}}$ . Figure 1 shows that mean marginal WTP when the two individuals have heterogeneous substitutability preferences,  $\overline{\omega}(Y, E; \eta)$ , is higher than the marginal WTP at the mean elasticity of complementarity,  $\omega_i(Y, E; \mu_\eta)$ . Mean marginal WTP,  $\overline{\omega}(Y, E; \eta) = \mathbb{E}[\omega(Y, E; \eta)|\eta]$ , increases with a mean-preserving spread in the elasticity of complementarity.<sup>8</sup>



Figure 1: Heterogeneous complementarity preferences and (mean) marginal WTP.

Notes: Illustration with two individuals with a low elasticity of complementarity,  $\eta_{\text{low}}$ , and a high elasticity of complementarity,  $\eta_{\text{high}}$ . If marginal WTP (blue) is a convex function of the elasticity of complementarity and preferences are heterogeneous, then Jensen's inequality implies that mean marginal WTP based on heterogeneous preferences,  $\mathbb{E}[\omega(\eta)]$ , is higher than marginal WTP at the mean elasticity value,  $\omega(\mathbb{E}[\eta])$ . Mean marginal WTP based on heterogeneous preferences increases with a mean-preserving spread in the elasticity of complementarity from  $\mathbb{E}[\omega(\eta)]$  to  $\mathbb{E}[\omega(\eta^*)]$ .

<sup>&</sup>lt;sup>8</sup>Technically, the effect of preference heterogeneity in the elasticity of complementarity,  $\eta$ , on the mean marginal WTP is analogue to the effect of uncertainty about substitutability on the ecological discount rate, as analyzed by Gollier (2019) in an intertemporal context.

#### 2.2.2 Normally distributed complementarity preferences

We now study a special case of  $\eta \sim \mathcal{N}(\mu_{\eta}, \sigma_{\eta}^2)$ , where  $\mu_{\eta}$  is the mean of the elasticity of complementarity between a public and private good in society and  $\sigma_{\eta}$  the corresponding standard deviation. The assumption of a normally distributed  $\eta$  has been previously taken to study uncertainty about the degree of substitutability (Gollier 2019) as well as to show that the effect of income inequality on WTP for environmental public goods can extend to heterogeneous preference (Baumgärtner et al. 2017a, Appendix 11).

Mean marginal WTP is the expected value of individual WTP's (see Appendix A.1)

$$\overline{\omega}(\mu_{\eta},\sigma_{\eta}) = \frac{1-\alpha}{\alpha} \left(Y/E\right)^{\mu_{\eta} + \frac{\sigma_{\eta}^{2}}{2}\ln(Y/E)}$$

$$= \frac{1-\alpha}{\alpha} \exp\left[\mu_{\eta}\ln(Y/E)\right] \exp\left[\frac{\sigma_{\eta}^{2}}{2}\ln(Y/E)^{2}\right],$$
(4)

which is strictly positive for Y > 0 and E > 0. Eq. (4) shows that  $\overline{\omega}$  exponentially depends on both the spread and the mean of the elasticity of complementarity. Conducting comparative statics with respect to  $\mu_{\eta}$  or  $\sigma_{\eta}$  establishes Proposition 2.

#### **Proposition 2**

Consider the elasticity of complementarity,  $\eta$ , to be normally distributed with mean,  $\mu_{\eta}$ , and standard deviation,  $\sigma_{\eta}$ . It holds:

1. Mean marginal WTP,  $\overline{\omega}$ , increases (decreases) in  $\mu_{\eta}$  if and only if the endowment with income is higher (lower) than with the public good

$$\frac{\partial \overline{\omega}}{\partial \mu_{\eta}} \gtrless 0 \iff Y \gtrless E; \tag{5}$$

2. Mean marginal WTP,  $\overline{\omega}$ , increases in  $\sigma_{\eta}$ , except if endowment with income equals endowment with the public good

$$\frac{\partial \overline{\omega}}{\partial \sigma_{\eta}} \begin{cases} = 0, & \text{if } Y = E \\ > 0, & \text{otherwise} \end{cases};$$
(6)

*Proof.* See Appendix  $A.2.^9$ 

Proposition 2.1 shows that the effect of mean substitutability on mean marginal WTP for the environmental public good depends on its relative scarcity vis-a-vis private consumption goods or income. If the environmental public good E is scarcer than income Y, mean WTP for the environmental public good increases as the degree of mean complementarity increases (or, equivalently, as mean substitutability decreases), that is the larger  $\mu_{\eta}$  (Proposition 2.1).

Proposition 2.2 is a special case of Proposition 1 for a specific probability density function—Normally distributed complementarity preferences—featuring a meanpreserving spread. Assuming Normally distributed preferences further allows us to compare the cases of heterogeneous and homogeneous preferences using closed-form solutions. To this end, we consider the ratio between  $\overline{\omega}$  with  $\sigma_{\eta}$ -heterogeneous preferences and  $\overline{\omega}$  without heterogeneous preferences, that is with  $\sigma_{\eta} = 0$ , while holding everything else constant. This heterogeneity factor

$$h(\sigma_{\eta}) := \frac{\overline{\omega}(\mu_{\eta}, \sigma_{\eta})}{\overline{\omega}(\mu_{\eta}, 0)} \stackrel{(4)}{=} (Y/E)^{\frac{\sigma_{\eta}^2}{2}\ln(Y/E)} = \exp\left[\frac{\sigma_{\eta}^2}{2}\ln(Y/E)^2\right],\tag{7}$$

is independent of  $\mu_{\eta}$  and strictly positive, given our assumptions of Y > 0 and E > 0(cf. Propositions 1 and 2.2). The heterogeneity factor equals unity in the special cases

<sup>&</sup>lt;sup>9</sup>It is further possible to show that, first, the positive effect of  $\sigma_{\eta}$  on mean marginal WTP,  $\overline{\omega}$ , increases (decreases) in  $\mu_{\eta}$  if and only if the level of income is higher (lower) than that of the public good, and, second, that the positive effect of  $\sigma_{\eta}$  on mean marginal WTP,  $\overline{\omega}$ , increases with income, Y, if income is more abundant than the public good. See Appendix A.2 for details.

of E = Y or  $\sigma_{\eta} = 0$ . Thus, when substitutability preferences are heterogeneous (and private and public goods are supplied in different amounts), mean WTP increases relative to the standard homogeneous preference case—by a factor that is an exponential function of the heterogeneity of substitutability preferences,  $\sigma_{\eta}$ .

Alternatively, one can ask how high the mean elasticity of complementarity with homogeneous preferences needs to be to give the same mean marginal WTP as in a situation with preference heterogeneity. This *heterogeneity equivalent*,  $\mu_{\eta}^{*}$ , is implicitly defined as  $\overline{\omega}(\mu_{\eta}^{*}, 0) = \overline{\omega}(\mu_{\eta}, \sigma_{\eta})$ . Inserting Eq. (4) and rearranging we have

$$\mu_{\eta}^{*} = \frac{\sigma_{\eta}^{2}}{2} \ln(Y/E) + \mu_{\eta}, \qquad (8)$$

where the heterogeneity equivalent mean degree of limited substitutability,  $\mu_{\eta}^{*}$ , is larger (lower) than the mean degree of limited substitutability with homogeneous substitutability preferences,  $\mu_{\eta}$ , if and only if there are more (less) private goods Y than public goods E. Note, in the case of E = Y the heterogeneity equivalent is equal to mean  $\eta$ . Eq. (8) shows how representative agent models can account for heterogeneity in the underlying preferences data in their parametrization of CES-preferences.

# **3** Estimation of substitutability preferences

In the previous Section 2, we have established how the heterogeneity of substitutability preferences can theoretically matter for the valuation of environmental public goods. Here, we now empirically estimate the heterogeneity of individual substitutability preferences. To measure substitutability preferences in the first place, we need observations on how people solve trade-offs between private market goods (or income) and environmental public goods. We collect such observations through an online experiment with more than 2,000 participants from Germany. This allows us to measure substitutability preferences at the individual level in a general population sample. In Subsection 3.1, we introduce our experimental design, in Subsection 3.2, we explain how we estimate the preference parameters with the experimental data and, in Subsection 3.3, we summarize our results from the experiment.

## 3.1 Experimental design

To examine how individuals substitute private market goods with an environmental public good, we conduct an online experiment in which we confront participants repeatedly with a modified dictator game. The setup we employ has previously been used to study, among others, equity-efficiency trade-offs in the allocation of income between a giver and a receiver and to estimate an isoelastic measure of fairness preferences (e.g., Andreoni and Miller 2002, Fisman et al. 2007, 2015). Here we transfer this approach to provide first direct estimates of the elasticity of substitution between private goods, or income, and an environmental public good.

In our experiment, we present participants with 30 choice tasks in which they have to trade off donations to plant forest trees against income, with one randomly selected decision being realized (in the two incentivized of our four treatments). In line with our theoretical model, we simplify the choice set to a single private good, so that all income is spent on it, hence C = Y. We use forest ecosystem services derived from planting forest trees as the environmental public good E. Donations to plant trees are a relatively familiar setting for participants, as evidenced by recent studies (e.g., Bartels et al. 2024, Vlasceanu et al. 2024) and the considerable fraction of participants who report to have previously donated to plant trees (see Panel D of Figure 5). To generate variation in the trade-off between income and forest trees, we match the donations from participants to plant forest trees.<sup>10</sup> The 30 choice tasks generate rich decision data at the individual

<sup>&</sup>lt;sup>10</sup>Specifically, planting a forest tree via an official state forestry in Germany costs 5 EUR per tree. We match donations upwards to ensure that it would not be worthwhile for participants to take the full income at relative prices that are unfavorable for tree donations in the experiment to then donate

level on how the trade-off between income and forest trees is solved along a set of relative prices. We use this data to estimate the elasticity of complementarity  $(\eta_i)$  as well as the utility share parameter regarding income  $(\alpha_i)$ , and thus regarding forest ecosystem services  $(1 - \alpha_i)$ , of an ordinary CES utility function for each participant *i*.

Figure 2 shows two exemplary decision tasks, in which participants have to choose allocations of additional forest trees, E, and/or additional private goods, or income, Y. We illustrate all possible allocations that exhaust the normalized budget m = 1 by a blue linear budget line, which is given by the constraint  $p_Y \pi_Y + p_E \pi_E = m$ .<sup>11</sup> Participants can choose their preferred allocation by either clicking on their desired allocation on the budget line or by using one of the interactive sliders. Across these 30 decisions, we vary the price ratio in such a way that  $p_E/p_Y \in [0.3; 3]$ .<sup>12</sup> We can then reconstruct participants' preferences by examining how they react to these changes in relative prices.

We employ a  $2 \times 2$  treatment design to vary incentives and the income recipient: Participants are randomly allocated either to an incentivized or hypothetical treatment arm. In the incentivized treatment arm, one random decision out of all 30 decisions is realized and the chosen number of forest trees from that decision will be planted and the chosen income will be payed out. We add up the quantity of trees that participants have chosen for and plant them on behalf of participants through a donation to a German

them outside of the experiment—for the same tree quality and context as ensured by the German state forestry. While the use of matching donations for the provision of environmental public goods has been previously explored in the literature, most studies so far only rely on a limited set of salient variations and examine effects on participation or giving in situations with a 1:1 matching or close variants, such as a 1/3:1 or 3:1 matching (e.g., Kesternich et al. 2016). To the best of our knowledge, no study used such variations to estimate substitution elasticities.

<sup>&</sup>lt;sup>11</sup>Please note that participants can actually spend a part of their budget—in two of our four treatments, see below—on a donation to the environmental public good, while in our theoretical set-up this choice is only virtual as common in theoretical and empirical non-market valuation literature, and as is in line with our other two treatments.

<sup>&</sup>lt;sup>12</sup>The budget lines are randomly generated prior to the experiment and fixed across participants. Participants see them, however, in a random order. We randomly draw budget lines in a way that one axis intercept is between 0.5 and 1 and the other between 0.1 and 1 (hence,  $p_E/p_Y \in [0.1; 10]$  could have been theoretically possible). This process generates normally distributed logarithmic price ratios, which we visualize in Figure A1 in the Appendix.



Figure 2: Illustrations of the experimental tasks.

*Notes:* This figure shows two exemplary decision tasks where participants choose between private income and forest trees as a public environmental good. The budget line (in blue) represents all available allocations. Participants can either click on the budget line directly or use one of the sliders to make their decision. The bar chart on the right visualizes the chosen allocation. In total, participants must complete 30 decision tasks.

state forestry.<sup>13</sup> In the hypothetical treatment arm, no decision is realized. With this treatment, we want to examine by how much results change when participants have no direct 'skin in the game'. To mitigate hypothetical or elicitation bias (e.g., Vossler and Evans 2009, Bishop et al. 2017), we highlight in the instructions that responses may be consequential insofar as the results will be communicated to the Federal Environment Agency, who are in charge of setting the German environmental cost-benefit guidelines and informing environmental policy design.<sup>14</sup> In addition, participants are randomly allocated to either a private or a public treatment arm. In the private income treatment arm, participants must choose between forest trees and private income for themselves. In the public income treatment arm, participants must choose between forest trees and private income trees and

<sup>&</sup>lt;sup>13</sup>Participants were not informed ex-ante about the specific state and location where trees will be planted within Germany to avoid that local preferences affect their choices. We ex-post donated according to individual choices in the two incentivized treatments (1,690 EUR in total to plant 338 trees) to HessenForst on the participants' behalf, as the state of Hessen is located centrally within Germany.

<sup>&</sup>lt;sup>14</sup>Appendix A.6 includes a translation of the full experimental instructions.

public income for all, which is donated to the German finance ministry ('Bundeskasse'). In comparison to the private income treatment, the public income treatment serves to mitigate public good provision free-riding considerations in influencing substitutability preferences. While we interpret the private income setting to be relevant for decisions concerning a voluntary provision of public goods, the latter might better serve as a yardstick when informing public policy. Participants are assigned to a treatment group at the beginning of the experiment and remain in them for the rest of the experiment.<sup>15</sup>

Before the main decision task, participants receive instructions about the task and get familiar with the interface in three training rounds. To ensure that participants pay attention and carefully read and understand the task, we also include an attention check and a comprehension check that participants must pass. After the main decision task, the experiment closes with a short survey. We developed the experiment in oTree (Chen et al. 2016), ran the online experiment in January and February 2024, and recruited participants through the market research firm Kantar.

Before proceeding with outlining the estimation strategy, and to facilitate a more intuitive understanding, we illustrate the choices for three selected participants who exhibit archetypal preference structures in Figure 3. The three preference structures represent near perfect substitutability ( $\eta_i \approx 0$ ), near perfect complementarity ( $\eta_i \rightarrow \infty$ ), and intermediate substitutability preferences close to the Cobb-Douglas case ( $\eta_i \approx 1$ ).

Participant 1081 presented in the top row of panels in Figure 3, for example, prefers a strongly complementary consumption of market goods (or income) and environmental public goods, as she always chose an almost equal allocation between the two. Irrespective of the relative price  $(p_E/p_Y)$ , the consumption share was always around 50 percent for each good. Participant 897, in contrast, has consumption preferences that reflect perfect substitutability between income and the environmental good, as she always chose

<sup>&</sup>lt;sup>15</sup>In Table A2 in the Appendix, we compare the summary statistics of participants between all four treatments and find, except for slight differences in the average age, balance between treatment groups. The age differences depend on the baseline treatment group with whom other treatment groups are compared to and disappear when using the private hypothetical treatment group, for example.



Figure 3: Exemplary choice patterns by three selected participants.

Notes: This figure shows the choices of selected participants with three archetypal substitutability preferences, all with an approximately equal preference for market goods (or income) versus the environmental public good ( $\alpha_i \approx 0.5$ ). The left panels are equivalent to the screens that participants faced in each decision task. For the middle panels, we have standardized the budget lines to cross the consumption bundle (0.25, 0.25) to facilitate comparisons between choices. In the right panels, we then show the corresponding consumption shares depending on the relative price  $p_E/p_Y$ . Participant 1081 prefers a complementary consumption of market and environmental goods, with a high estimated elasticity of complementarity,  $\eta_i$ , of more than 60, and always chooses an almost equal share between income and the environmental good. Participant 897 has consumption preferences that reflect perfect substitutability between income and the environmental good ( $\eta_i = 0$ ). She always chooses the good that maximizes the consumption level. Participant 591 has preferences close to Cobb-Douglas preferences ( $\eta_i \approx 1$ ): She reacts to price changes and consumes more of the relatively cheaper good.

the option that maximized the sum of consumption levels. Therefore, she selected corner solutions for relative prices differing from unity meaning that she preferred to consume only income when income was relatively cheap  $(p_E/p_Y < 1)$ , only the environmental good when the environmental good was relatively cheap  $(p_E/p_Y > 1)$ , and she preferred equal consumption levels when the respective prices of the goods where the same  $(p_E/p_Y = 1)$ . Finally, participant 591 has intermediate substitutability preferences, close to the Cobb-Douglas case. She reacts to changes in relative prices and prefers a higher share of income when income is relatively cheap, and a higher share of the environmental good when that is relatively cheap, whereby she avoids corner solutions.<sup>16</sup>

## 3.2 Estimation Strategy

The experiment generates rich individual-level data about the choices of a general population sample regarding the trade-off between incomes and tree-planting. We first check whether subjects make consistent and rational choices and subsequently estimate individual-level preference parameters of the CES utility function described in Eq. (1): the elasticity of complementarity ( $\eta_i$ ) and the utility weight for income ( $\alpha_i$ ).

We start by examining whether participants make consistent and rational choices, i.e. whether their preferences can be recovered by a well-behaved utility function, such as the CES utility function that we seek to calibrate. Following Fisman et al. (2007), we therefore test for compliance of the participants' choices with the generalized axiom of revealed preferences (GARP). To this end, we calculate the critical cost efficiency index (CCEI) suggested by Afriat (1972). The CCEI ranges between 0 and 1 and

<sup>&</sup>lt;sup>16</sup>Apart from these three archetypal preference types, and those with other intermediate substitution preferences, our data also features participants who do not react to price changes and always allocate the whole budget to income or to the environmental good. We exclude these participants from our main analysis, as we cannot separately identify their subsitutability preferences. Specifically, we exclude participants with *uniform preferences* if they allocated, on average, at least 98% of their budget to a single good:  $\mathbb{E}[Y/(Y+E)] \ge 0.98$  or  $\mathbb{E}[E/(Y+E)] \ge 0.98$ . We vary this threshold and explore sensitivity in Figure A9 in the Appendix. We find that changing the cut-off threshold has no discernable effect on the median estimated elasticity of complementarity, but tends to lead to slightly higher mean estimates.

informs by how much the budget lines would need to be adjusted to remove all GARP violations. For fully rational participants, no adjustments are necessary and CCEI = 1. For participants with GARP violations, however, one would need to adjust the budget lines to make their choices consistent and rational (hence, CCEI < 1).<sup>17</sup> Overall, a large majority of participants makes very consistent and rational choices as we show in Figure A2 in the Appendix. While there is no formal threshold that distinguishes rational from irrational choice, we follow Fisman et al. (2007) and choose a threshold of 0.8 which leads to the exclusion of 394 participants for our main sample.

Among the remaining participants, 110 have uniform preferences and allocate, on average, more than 98% of their budget to only a single good. While we can derive an income utility weight for those (either  $\alpha_i = 0$  or  $\alpha_i = 1$ ), we are unable to jointly estimate their elasticity of complementarity ( $\eta_i$ ), as this would require at least one choice away from the choice set boundary.<sup>18</sup> For the remaining 1,428 participants, we observe consistent and rational choices and are able to estimate both preference parameters, and crucially, the elasticity of complementarity.<sup>19</sup>

To retrieve individual-level preference parameters, we follow the estimation approach outlined in previous work (e.g., Andreoni and Miller 2002, Fisman et al. 2007). We assume that individuals maximize utility according to a CES utility function from consuming a private good, or income (C = Y), and an environmental public good (E) and are restricted by a normalized budget  $p_Y Y + p_E E = 1$ . Hence, the optimal share of

 $<sup>^{17}\</sup>mathrm{In}$  Figure A3 in the Appendix we visualize the choices of some subjects that are excluded due to low CCEI scores.

<sup>&</sup>lt;sup>18</sup>It may well be that a considerable fraction of these subjects will become price sensitive at more extreme relative prices than are featured here in our experiment, which would then allow for capturing their substitutability preferences. We leave an investigation of this to future work.

<sup>&</sup>lt;sup>19</sup>Table A1 in the Appendix shows descriptive statistics on individuals characteristics in our initial sample (N=2,181) and our main sample (N=1,428) for the estimation of substitutability preferences.

income for the private consumption good  $(p_Y Y_i^*)$  for participant *i* is:

$$p_Y Y_i^* = \left( \left(\frac{p_E}{p_Y}\right)^{\frac{\eta_i - 1}{\eta_i}} \left(\frac{1 - \alpha_i}{\alpha_i}\right)^{\frac{1}{\eta_i}} + 1 \right)^{-1} \tag{9}$$

Thus, the optimal income share for the consumption of the private good depends on the elasticity of complementarity  $\eta_i$ , the utility weight for income  $\alpha_i$ , and the price ratio  $p_E/p_Y$ . We allow for some imprecisions and measurement error in the observed choices from our experiment and thus assume that the observed income shares  $(p_Y Y_i)$ are the sum of the optimal income share for the consumption good and an error term,  $\epsilon_i$ , that is normally distributed with an expected value of zero. Hence, our econometric specification is:

$$p_Y Y_i = \left( \left(\frac{p_E}{p_Y}\right)^{\frac{\eta_i - 1}{\eta_i}} \left(\frac{1 - \alpha_i}{\alpha_i}\right)^{\frac{1}{\eta_i}} + 1 \right)^{-1} + \epsilon_i$$
(10)

With our experiment, we observe various income shares for the consumption  $(p_Y Y_i)$ over different price ratios  $(p_E/p_Y)$ , which allow us to estimate the parameters  $\eta_i$  and  $\alpha_i$  for each participant *i*. As the observed income share is bounded between 0 and 1, we employ a two-limit maximum likelihood model, in line with the prior literature (e.g., Maddala 1983, Andreoni and Miller 2002, Fisman et al. 2007), to estimate both preference parameters from Eq. (10), the utility weight,  $\alpha_i$ , and the elasticity of complementarity,  $\eta_i$ , for each individual respondent.<sup>20</sup>

<sup>&</sup>lt;sup>20</sup>Similar results are obtained through a non-linear least squares model or, alternatively, using a simple maximum likelihood estimation of the following logit equation form:  $ln\left(\frac{p_Y Y_i}{1-p_Y Y_i}\right) = \frac{1-\eta_i}{\eta_i} ln\left(\frac{p_E}{p_Y}\right) + \frac{1}{\eta_i} ln\left(\frac{\alpha_i}{1-\alpha_i}\right) + \epsilon_i$ . The numerical optimization of the logit equation is plausibly more stable as the parameters are not included in the exponent. However, adjustments are necessary at the boundaries because solutions are not defined for the clusters at zero and one. As this might introduce bias, we therefore report the main results using the described tobit model instead.

## **3.3** Results of the experiment

Table 1 shows a summary of the estimated preference parameters for our main sample of 1,428 participants.<sup>21</sup> We report both the full raw distribution and a version in which estimates of the elasticity of complementarity are winsorized at the upper 90th percentile. We use this (one-sided) winsorization for our main analysis, as  $\eta_i$  diverges to infinity for near-perfect complements, thereby making the mean elasticity of complementarity hyper-sensitive to these near-perfect complementarity preferences.

Table 1: Estimated preference parameters.			
	Elasticity of complementarity,		Income utility weight,
	$\eta_i$		$\alpha_i$
	Wins. p90	Raw	Raw
Median	2.48	2.48	0.47
Mean	12.70	$303,\!034.15$	0.47
SD	20.27	1.10e + 07	0.35
Min	0	0	0
Max	63.63	4.14e + 08	1.00
Observations	1,428	1,428	1,428

Notes: This table shows summary statistics of the estimates of the elasticity of complementarity,  $\eta_i$ , and for the utility share given to income,  $\alpha_i$ , for the raw sample and our main estimation sample that is winsorized at the upper 90th percentile of the elasticity of complementarity.

We show the distribution of the individual-level estimated parameters for the elasticity of complementarity ( $\eta_i$ ) and the utility share parameter for income ( $\alpha_i$ ) in Figure 4. Panel (A) depicts the empirical cumulative distribution of substitutability preferences, which we categorize in seven preference domains in Panel (B). Panels (C) and (D) illustrate similar analyses for the utility share parameter. We document four main results:

<sup>&</sup>lt;sup>21</sup>We exclude participants from our main analysis that either fail quality checks or display uniform preferences. Specifically, we exclude 17 participants that failed a comprehension at least 10 times, 232 participants that completed the experiment in less than 5 or more than 60 minutes, 394 participants with irrational choices as measured by their degree of GARP violations, and 110 participants that allocated, on average, at least 98% of their budget to only a single good. In Figure A4 in the Appendix, we visualize these exclusions and the final composition of our main sample.

# Result 1: Substitutability preferences are similar across treatments, but environmental quality receives a larger utility weight in public settings.

Panel A of Figure 4 shows the cumulative distribution of individual elasticities of complementarity across the four treatments, which highlights only small differences in the distribution of individual elasticities of complementarity. We test for differences in the mean and median elasticity of complementarity between our four treatment arms in Table A3 in Appendix A.3 with an OLS regression and a Fisher's exact test for the equality of the medians, but detect only minor differences, almost all of which are insignificant.<sup>22</sup> These findings suggest that our estimation of substitutability preferences largely tends to carry through across settings that are incentivized or hypothetical as well as between settings where income is a private or public good. In Figure 4*C*, by contrast, we observe a level-shift on the utility share given to income ( $\alpha_i$ ) between private and public setting. When participants can allocate part of the budget to private instead of public income, they put a significantly larger weight on income (see Tables A3 and A4 as well as Figures A6 and A7 in the Appendix for the corresponding statistical tests).

#### Result 2: The majority of preferences lie in the complementarity domain.

The majority of participants treat income and the environmental public good as complements (see Figure 4*B*). We find a median value for the elasticity of complementarity,  $\eta_i$ , of 2.48, which is close to but slightly higher than the value used in a prominent application of limited substitutability in the integrated assessment of climate change policies by Sterner and Persson (2008). The choices of almost 40 percent of participants imply mild complementarity (here denoted as such when  $\eta_i \in [1.25, 5]$ ), while choices of 20 percent of the participants even imply near-perfect complementarity ( $\eta_i > 20$ ).

<sup>&</sup>lt;sup>22</sup>The two exception are a marginally significant difference for  $\eta_i$  at the 10 percent level between the Private-Incentivized and Public-Hypothetical treatments, as displayed in Figure A6 in the Appendix, and a significant difference between Incentivized versus Hypothetical with a ranksum test (see Figure A7), which is insignificant when comparing means with a standard t-test (see Table A4).



Figure 4: Distribution of estimated preference parameters.

Notes: This figure shows empirical cumulative distributions in Panels (A) and (C) and categorized histograms in Panels (B) and (D) of the individual-level estimates of  $\alpha_i$  and  $\eta_i$ , where the elasticity of complementarity,  $\eta_i$  is the inverse of the common Hicksian constant elasticity of substitution (CES). In Panels (A) and (C), we also differentiate the empirical cumulative distributions by treatment group. As an alternative for the empirical cumulative distributions, we also provide histograms for  $\alpha_i$ and  $\eta_i$  by treatment group in Figure A5 in the Appendix.

Overall, we find that less than a quarter of estimated elasticities of complementarity fall below unity, indicating a substitutive relationship between goods that has been indirectly estimated in the non-market valuation literature based on the income elasticity of WTP (e.g., Drupp and Hänsel 2021, Drupp et al. 2024b, Conte et al. 2025).



Figure 5: Elasticity of complementarity along income and environmental preferences.

Notes: This figure shows the mean and median elasticity of complementarity  $(\eta_i)$  for all participants (N=1,428) along income and environmental preferences. In particular, it shows the elasticity of complementarity for different household income groups (Panel A) and for different measures of environmental preferences, such as the perceived importance of forests (Panel B), the frequency participants visit forests (Panel C), and donations made for trees in the past year (Panel D). Error bars around the mean values represent one standard error.

#### Result 3: Preference heterogeneity for substitutability is substantial.

We observe that individuals' preferences range across the whole spectrum, from (near) perfect substitutability to Cobb-Douglas substitutability and (near) perfect complementarity. Panels A and B in Figure 4 visualize this variation in preferences. The extent of preference heterogeneity also becomes apparent by observing that the interquartile range of  $\eta_i$  estimates stretches from 1.19 to 12.10. Note, in this regard, that the mean estimate of 12.70 for the elasticity of complementarity lies above its 75<sup>th</sup> percentile value.

# Result 4: Substitutability preferences do not differ systematically across income levels or measures of environmental preferences.

Finally, we explore how substitutability preferences differ along income or the concern about the environmental public good that we assessed via three proxies in our experiment: survey measures on the perceived importance of forests and on the frequency of forest visits as well as self-reported donations made to plant trees in the past year.

In Panel A of Figure 5, we show the elasticity of complementarity,  $\eta$ , across different income levels. We find no systematic relationship between the elasticity of complementarity and income levels, which is confirmed by regression analyses reported in Table A5 in the Appendix. In contrast, Barbier et al. (2017) find that the income elasticity of WTP—which is observationally equivalent to the elasticity of complementarity,  $\eta$ , in our setting —increases with income levels in a multi-country contingent valuation study of eutrophication reduction in the Baltic Sea. Similarly, across our three measures (Panels B to D), we do not observe a systematic relationship between the elasticity of complementarity and our three proxies of environmental preferences. We confirm this observation by regression analyses in Table A5 in the Appendix.

# 4 Illustration of theoretical results

Finally, we bring our theoretical results and empirical estimates together to illustrate how accounting for heterogeneity in substitutability preferences may affect the economic value of environmental public goods. To this end, we solve Eq. (2) and (4) with our estimated parameters from the previous section. In particular, we utilize the individuallevel estimates of the elasticity of complementarity,  $\eta_i$ . For the constant utility weight,  $\alpha$ , in our model, we use the mean of the individual-level estimates  $\alpha_i$ . We also use the population mean,  $\mu_{\eta}$ , and standard deviation,  $\sigma_{\eta}$ , of the elasticity of complementarity,  $\eta_i$ , where applicable. In addition, we also need to set the ratio between the environ-



Figure 6: Illustration of the effect of preference heterogeneity on mean marginal WTP assuming normally distributed substitutability preferences.

Notes: This figure shows mean marginal WTP,  $\overline{\omega}(\mu_{\eta}, \sigma_{\eta})$ , (Eq. (4)) as a function of the standard deviation of the elasticity of complementarity,  $\sigma_{\eta}$ , for different ratios between income and the environmental public good under the assumption of normally distributed substitutability preferences. The dashed vertical black line depicts the standard deviation of the elasticity of complementarity for the upper 90th percentile winsorization. If the relation between income and the environmental public good were 1.1, this would lead to a mean marginal WTP that is 6.5 times higher with normally distributed substitutability preferences.

mental public good and income, Y/E, for which we—given the lack of solid guidance on magnitudes—consider small variations where Y > E for illustrative purposes.<sup>23</sup>

<sup>&</sup>lt;sup>23</sup>Determining and quantifying the ratio between the environmental public good, E, and income, Y, is difficult. At the macro-scale, Elhacham et al. (2020) compare the weight of anthropogenic mass with the weight of the global living, natural biomass. They find that both were equal in 2020, suggesting Y/E = 1 (given C = Y). Moreover, they find that the anthropogenic mass has increased massively and doubles approximately every 20 years. Even if natural biomass stays constant, this suggests that the relative abundance of private goods was much lower in the recent past and will be much higher in the near future such that Y/E > 1 is likely. While this indicates how environmental goods tend to become more scarce relative to manufactured goods over time, the estimated anthropogenic mass does not translate into market traded goods (or income) very well, and an individual only holds a small fraction of global anthropogenic mass or income. Hence, given our ignorance about this ratio, we will illustrate how the heterogeneity in substitutability preferences affects WTP for various ratios between income and environmental public goods. This implies that the magnitudes we present here concerning WTP adjustments are solely illustrative and should not be mistaken as being quantitatively informative.

In Figure 6 we illustrate how mean marginal WTP,  $\overline{\omega}(\mu_{\eta}, \sigma_{\eta})$ , depends on the heterogeneity of substitutability preferences as measured by the standard deviation of the elasticity of complementarity (or income elasticity of WTP),  $\eta_i$ , assuming that the elasticity of complementarity follows a normal distribution. The Figure shows how the mean marginal WTP increases in the standard deviation of the elasticity of complementarity,  $\sigma_{\eta}$  for the mean elasticity of  $\mu_{\eta} = 12.70$  that we observe in our experiment. The higher the ratio between income and environmental public goods is, the stronger is this relationship. In our empirical data, for example, we observe a standard deviation for the elasticity of substitution of  $\sigma_{\eta} = 20.27$ , which can imply substantial differences in the mean marginal WTP depending on the ratio between environmental public goods and income. For example, we would obtain a mean marginal WTP that is 6.5 times higher when considering preference heterogeneity than under the assumption of homogeneous preferences. This heterogeneity factor (see Eq. (7)) depends on the ratio between environmental public goods and market goods (or income) but will lead to much higher valuations of environmental public goods.

Similarly, we can quantify a heterogeneity equivalent estimate of the elasticity of complementarity, which allows representative agent models to account for heterogeneity in the underlying preferences data. This heterogeneity equivalent adds a factor that depends on preference heterogeneity, using  $(\frac{\sigma_n^2}{2}\ln(Y/E))$ , to the mean estimate of the elasticity of complementarity (see Eq. (8)). For our illustration with Y/E = 1.1, the heterogeneity equivalent elasticity,  $\mu_{\eta}^*$ , would amount to 32.28 instead of the sample mean of 12.70, and thus be considerably more shifted towards complementarity. To reiterate, these examples rely on the assumption of normally distributed preferences and a ratio of market goods to the environmental public good of 1.1, solely for illustrative purposes.

Finally, we explore how mean marginal WTP unfolds with our actual empirical distribution. Unfortunately, we can only derive closed form heterogeneity factors assuming that the elasticity of complementarity is normally distributed. We can, however, reject that this is the case empirically (Shapiro-Wilk test; z = 14.641; p < 0.001). Therefore, we contrast the result illustrated above, which entails the assumption of normally distributed preferences, with the fully flexible empirical distribution. For this, we calculate the individual marginal WTP flexibly for each participant, using Eq. (2), again with a ratio of income to environmental public goods of 1.1. We then aggregate these marginal WTP estimates without assuming any specific distribution for the elasticity of complementarity to contrast this with our previous illustrations above, which assume either homogeneous or normally distributed substitutability preferences. Figure 7 shows the resulting distribution of the individual marginal WTPs as a kernel density plot.



Figure 7: Distribution of individual marginal WTPs.

Notes: This figure shows a kernel density plot of individual marginal WTPs, capped at a value of 70 for visual purposes, for Y/E = 1.1. The black line depicts the mean marginal WTP under homogeneous preferences, and the green line when assuming a normally distributed elasticity of complementarity ( $\eta$ ). Finally, the blue line depicts the mean marginal WTP under our observed heterogeneous preferences and when we winsorize  $\eta_i$  at the upper 90th percentile.

The distribution of marginal WTPs is highly skewed towards high WTP values, due to a high share of participants that prefer a complementary consumption of income and environmental public goods. The mean WTP for the distribution of individual WTPs is 15.0 times higher than in the homogeneous preference case and thus leads to a much higher upward adjustment as when assuming that preference heterogeneity regarding limited substitutability follows a normal distribution. Figure 7 illustrates how adjustments using normally distributed substitutability preferences already leads to a sizeable adjustment of mean WTP, which still falls considerably short of the mean WTP derived using our (winsorized) empirical distribution for the elasticity of complementarity.

While solely illustrative, our results underscore the importance of accounting for the heterogeneity in preferences concerning limited substitutability for environmental valuation and the application of preference parameters in environmental cost-benefit analysis and environmental-economic accounting.

## 5 Discussion

Both our theoretical and experimental approaches are subject to a number of underlying assumptions and limitations, which we discuss in this section.

First, to focus our analysis on the effect of heterogeneous substitutability preferences, we considered a very simple and stylized model that is static, deterministic and solely features a homogeneous private market-traded consumption good, without income inequality, and an environmental public good, which all individuals are considered to consume to the same extent. Several extensions of this or related valuation frameworks already exist—but none have so far focused on the heterogeneity of substitutability preferences. Baumgärtner et al. (2017a) study effects of income inequality in a static deterministic setting, extended by Smith (2023) to a more general approximation of WTP. Meya (2020) considers an unequal distribution of environmental quality and how this affects societal WTP. Meya et al. (2020) consider a deterministic, dynamic context concerning the valuation of ecosystem services derived from natural capital, while Gollier (2019) studies the effects of uncertain substitutability preferences on natural capital valuation in a dynamic context. Relateldy, the literature on discounting has considered the aggregation of heterogeneous time preferences or recommendations on discount rates (e.g., Freeman and Groom 2015, Gollier and Zeckhauser 2005, Heal and Millner 2023, Millner 2020). As further extensions, it would be interesting to study heterogeneous preferences in a dynamic setting to examine effects on good-specific discount rates or relative price changes (e.g. Drupp et al. 2024a, Gollier 2010, 2019, Hoel and Sterner 2007, Traeger 2011, Weikard and Zhu 2005).

Second, our theoretical and empirical analyses consider a standard constant elasticity of substitution (CES) utility function and focus on the constant elasticity of complementarity (i.e. the inverse of the CES), which is equivalent in our setting to the income elasticity of WTP (Baumgärtner et al. 2017a, Ebert 2003). Preferences, however, need not be well-described by a CES utility function, and elasticities need not be constant (e.g., Barbier et al. 2017). While there is some theoretical research on non-constant elasticities of substitution (e.g., Baumgärtner et al. 2017b, Drupp 2018), examining how elasticities vary in the presence of basic needs thresholds, little is known empirically about how well the CES assumption approximates actual substitutability preferences. Future work should consider more general preference formulations and empirically examine how well CES—as compared to other utility specifications—can rationalize choices.

Third, while we found that the scarcity of E relative to Y (or C) is a decisive factor for the effect of how heterogeneous substitutability preferences affect the economic value of nature, we did not measure this ratio in our experimental setting. The comparison of the quantity of C to the quantity of E in the agents utility function relates to fundamental questions in applied microeconomic theory. We leave the development of appropriate empirical approaches to determine this relation to future research. Fourth, our main empirical analysis only includes individuals that make relatively consistent and rational choices, as measured by their (non-)violations of GARP. While we can vary the allowable threshold for GARP violations, the choices of a number of subjects are simply not well rationalizable. Our analysis, following the experimental literature on fairness preferences (e.g., Andreoni and Miller 2002, Fisman et al. 2007, 2015), thus excludes boundedly rational participants whose preferences violate utility maximization too strongly. Such participants may change their preferences during the experiment or may not experience any additional utility when going beyond a certain threshold of a given good. While such choices could still be relevant and informative for decision-makers, it becomes more questionable whether such preference can be accommodated in a CES utility function framework or related preference structures.<sup>24</sup> Again, we leave an examination of more complex decision-rules and preference structures to future work.

Fifth, and relatedly, a lack of understanding of the decision tasks might drive our results. Koppel et al. (2025) have recently shown that missing comprehension in economic games leads to more—seemingly—prosocial behavior. In our context, missing comprehension might similarly distort the elicited substitutability preferences. For example, due to a lack of comprehension, participants might heuristically select a balanced allocation, which would then falsely signal a preference for complementarity. To examine this hypothesis, we report summary statistics of individual-level estimates grouped by comprehension checks in Appendix A6. We find no indication that estimated preferences of participants who immediately pass our comprehension task systematically differ from participants who required multiple attempts (with median estimates of 2.56 and 2.52).

Sixth, we restrict our experiment to a single environmental good: forest ecosystem services. We chose donations to plant forest trees, as this represents a relatively common 'good' for participants. Yet, the elasticity of complementarity may be very different for

<sup>&</sup>lt;sup>24</sup>In fact, we observe in Figure A8 in the Appendix that participants with a low CCEI score tend to have a higher elasticity of complementarity ( $\eta_i$ ), which could either suggest that boundedly rational participants may tend to perceive both goods more often as complements, or—plausibly—that increased noise in choices drives up the estimated elasticities.

other environmental public goods. Akin to explorations for how the income elasticity of WTP derived in meta-analyses differs across ecosystem service types (e.g., Drupp et al. 2024b), we seek to examine how elasticities may differ across (proxies for) various environmental public goods in future work. The same holds for potential variation across countries, incentive levels and donation mechanisms.<sup>25</sup>

Finally, a number of considerations concern the details of our empirical estimation. For example, our estimations do not reflect that participants enjoy some level of consumption of both goods outside of the experiment—a standard assumption in the experimental literature. It is, howeverm conceivable that respondents take these baseline consumption levels into account, deciding for total consumption bundles in the experiment instead of considering the experimental units in isolation. In Appendix A.4 we scrutinize this possibility in two ways. On the one hand, we repeat our estimations for different baseline consumption levels. Here, we find that baseline consumption levels should lead to an insensitivity of choices with respect to relative price changes. We test for this hypothesis and reject it for a majority of our sample. On the other hand, we explore the baseline levels necessary to rationalize the decisions of our participants by assuming homogeneous, median preferences for each participant. We find that for almost all participants, the predicted baseline levels of consumption are close to zero. Although these analyses cannot with certainty rule out the presence of baseline consumption considerations, they do provide some suggestive evidence that participants use narrow brackets and only consider the units given within the experimental environment (Rabin and Weizsäcker 2009). Furthermore, as single outlier decisions across our 30 rounds may distort the estimation of individual-level preference parameters, the

<sup>&</sup>lt;sup>25</sup>One of our key findings is that substitutability preferences are more tilted towards complementarity (Result 2) than previously suggested by indirect empirical evidence derived from income elasticites of WTP below unity (e.g., Jacobsen and Hanley 2009, Drupp et al. 2024b). An exception so far in this literature is a recent study by Heckenhahn and Drupp (2024), who find income elasticities of WTP of around 3 in a meta-analysis of German WTP studies, which is close to our median estimate of the elasticity of complementarity of 2.5. Conducting our experiment to elicit substitutability preferences in other countries is therefore an important next step, not least to exclude the possibility that sizable preferences for complementarity are not just a peculiarity of the German population.

underlying preferences of some individuals might not be accurately reflected in our estimations. In Appendix A.5 we test for this possibility and find that outlier decisions in our main sample might lead to an overestimation of the degree of substitutability and to an underestimation of preference heterogeneity. Specifically, when excluding potential outlier decisions, the median (mean) estimate of the elasticity of complementarity increases from 2.48 to 2.97 (12.70 to 20.78), while the standard deviation increases from 20.27 to 35.38. As it is, so far, uncommon in the literature using generalized dictator designs to correct for potential outlier decisions (e.g., Fisman et al. 2007, 2015), we retain the unadjusted estimates in our main results.

# 6 Conclusion

In this paper we study the heterogeneity of substitutability preferences between environmental public goods and private consumption goods both theoretically and empirically.

Drawing on a stylized model, we first show that more heterogeneity in substitutability preferences increases mean marginal WTP for environmental public goods. Moreover, whether a higher mean level of the elasticity of complementarity increases (decreases) the mean marginal WTP depends on whether environmental goods are relatively more (less) scarce than human-made consumption goods.

We then present an experimental approach to directly elicit individual preferences for the elasticity of complementarity (or substitution). We apply it to elicit general population preferences of around 1,500 Germans in an online experiment concerning the trade-off between private market goods and public forest ecosystem services. We document substantial preference heterogeneity and find that a majority of individual preferences implies a complementary relationship, with a median estimate of the elasticity of complementarity of 2.5. This is considerably higher than most prior estimates derived indirectly from the income elasticity of WTP from non-market valuation studies, which tended to lie in the domain of substitutability, with values between zero and unity (e.g., Drupp 2018, Drupp et al. 2024b, Conte et al. 2025), and close to a prominent assumption in the integrated assessment literature studying the implication of limited substitutability on optimal climate policy (cf. Sterner and Persson 2008).

Finally, we bring together our theory and empirical estimates and illustrate how accounting for heterogeneity in substitutability preferences increases mean marginal WTP for environmental public goods in society as compared to the standard case of equal preferences. As the effect of preference heterogeneity on mean WTP is moderated by the relative abundance of private market consumption goods relative to environmental public goods, which is difficult to measure, the potentially substantial magnitude we highlight remains illustrative.

Notwithstanding the caveats that we have outlined above, our results highlight that accounting for the heterogeneity of substitutability preferences may considerably affect the societal value attached to environmental public goods. Furthermore, our experiment yields the first direct estimates of the elasticity of substitution—or its inverse, the elasticity of complementarity—and suggests that preferences may be more tilted towards complementarity than previously portrayed. As such, our results have both conceptual and quantitative implications for non-market valuation, cost-benefit analysis, and the comprehensive accounting of natural capital.

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# A Appendix

# A.1 Derivation of mean marginal WTP

The density function for normally distributed  $\eta$ , with mean  $\mu_{\eta}$  and standard deviation  $\sigma_{\eta}$ , is

$$f_{\text{norm}}(\eta; \mu_{\eta}, \sigma_{\eta}) = \frac{1}{\sqrt{2\pi\sigma_{\eta}^2}} \exp\left(-\frac{(\eta - \mu_{\eta})^2}{2\sigma_{\eta}^2}\right).$$
(A.11)

Mean marginal WTP is then given as the expected value

$$\begin{split} \overline{\omega}(\mu_{\eta},\sigma_{\eta}) &= \mathbb{E}\left[\omega(Y,E;\eta)\right] \\ &= \int_{-\infty}^{+\infty} f_{\text{norm}}(\eta;\mu_{\eta},\sigma_{\eta})\,\omega(Y,E;\eta)\,d\eta \\ (2).(A.11) &\int_{-\infty}^{+\infty} \frac{1}{\sqrt{2\pi\sigma_{\eta}^{2}}} \exp\left(-\frac{(\eta-\mu_{\eta})^{2}}{2\sigma_{\eta}^{2}}\right)\frac{1-\alpha}{\alpha}\left(Y/E\right)^{\eta}\,d\eta \\ &= \frac{1-\alpha}{\alpha} \int_{-\infty}^{+\infty} \frac{1}{\sqrt{2\pi\sigma_{\eta}^{2}}} \exp\left(-\frac{(\eta-\mu_{\eta})^{2}}{2\sigma_{\eta}^{2}}\right) \exp\left(\ln\left((Y/E)^{\eta}\right)\right)\,d\eta \\ &= \frac{1-\alpha}{\alpha} \int_{-\infty}^{+\infty} \frac{1}{\sqrt{2\pi\sigma_{\eta}^{2}}} \exp\left(-\frac{(\eta-\mu_{\eta})^{2}}{2\sigma_{\eta}^{2}}+\eta\ln(Y/E)\right)\,d\eta \\ &= \frac{1-\alpha}{\alpha} \int_{-\infty}^{+\infty} \frac{1}{\sqrt{2\pi\sigma_{\eta}^{2}}} \exp\left(\frac{-(\eta-\mu_{\eta})^{2}+2\sigma_{\eta}^{2}\eta\ln(Y/E)}{2\sigma^{2}}\right)\,d\eta \\ &= \frac{1-\alpha}{\alpha} \int_{-\infty}^{+\infty} \frac{1}{\sqrt{2\pi\sigma_{\eta}^{2}}} \exp\left(\frac{-[\eta-(\mu_{\eta}+\sigma_{\eta}^{2}\ln(Y/E))]^{2}}{2\sigma^{2}}\right)\,\exp\left(\ln(Y/E)\left[\mu_{\eta}+\frac{\sigma_{\eta}^{2}}{2}\ln(Y/E)\right]\right)\,d\eta \\ &= \frac{1-\alpha}{\alpha} \int_{-\infty}^{+\infty} \frac{1}{\sqrt{2\pi\sigma_{\eta}^{2}}} \exp\left(\frac{-[\eta-(\mu_{\eta}+\sigma_{\eta}^{2}\ln(Y/E))]^{2}}{2\sigma^{2}}\right)\,\exp\left(\ln(Y/E)\left[\mu_{\eta}+\frac{\sigma_{\eta}^{2}}{2}\ln(Y/E)\right]\right)\,d\eta \\ &= \frac{1-\alpha}{\alpha} \exp\left(\ln(Y/E)\left[\mu_{\eta}+\frac{\sigma_{\eta}^{2}}{2}\ln(Y/E)\right]\right)\int_{-\infty}^{+\infty} \frac{1}{\sqrt{2\pi\sigma_{\eta}^{2}}} \exp\left(\frac{-[\eta-(\mu_{\eta}+\sigma_{\eta}^{2}\ln(Y/E)])^{2}}{2\sigma^{2}}\right)\,d\eta \\ &= \frac{1-\alpha}{\alpha} \exp\left(\ln(Y/E)\left[\mu_{\eta}+\frac{\sigma_{\eta}^{2}}{2}\ln(Y/E)\right]\right)\int_{-\infty}^{+\infty} \frac{1}{\sqrt{2\pi\sigma_{\eta}^{2}}} \exp\left(\frac{-[\eta-\mu_{\eta}^{\prime}]^{2}}{2\sigma^{2}}\right)\,d\eta \\ &= \frac{1-\alpha}{\alpha} \exp\left(\ln\left((Y/E)^{\mu_{\eta}+\frac{\sigma_{\eta}^{2}}{2}\ln(Y/E)}\right)\right)\int_{-\infty}^{+\infty} \frac{1}{\sqrt{2\pi\sigma_{\eta}^{2}}} \exp\left(\frac{-[\eta-\mu_{\eta}^{\prime}]^{2}}{2\sigma^{2}}\right)\,d\eta \\ &= \frac{1-\alpha}{\alpha} \exp\left(\ln\left((Y/E)^{\mu_{\eta}+\frac{\sigma_{\eta}^{2}}{2}\ln(Y/E)}\right)\right) = \frac{1-\alpha}{\alpha}\left(Y/E)^{\mu_{\eta}+\frac{\sigma_{\eta}^{2}}{2}\ln(Y/E)}\right)$$

# A.2 Proof of Proposition 2

1. Differentiating mean marginal WTP (Eq. (4)) with respect to  $\mu_{\eta}$  yields

$$\frac{\partial\overline{\omega}}{\partial\mu_{\eta}} = \ln(Y/E) \frac{1-\alpha}{\alpha} (Y/E)^{\mu_{\eta} + \frac{\sigma_{\eta}^2}{2}\ln(Y/E)} \stackrel{(4)}{=} \ln(Y) \,\overline{\omega},\tag{A.13}$$

for which the sign is fully determined by  $\ln(Y/E)$ , since  $\alpha \in (0, 1)$  and Y, E > 0. It thus holds:

$$\frac{\partial \overline{\omega}}{\partial \mu_{\eta}} \stackrel{\geq}{=} 0 \iff \ln(Y/E) \stackrel{\geq}{=} 0 \iff Y/E \stackrel{\geq}{=} 1 \iff Y \stackrel{\geq}{=} E. \tag{A.14}$$

2. Rearranging Eq. (4) to  $\overline{\omega} = \frac{1-\alpha}{\alpha} (Y/E)^{\mu_{\eta}} \exp\left[\frac{\sigma_{\eta}}{2} \ln(Y/E)^2\right]$  and taking the derivative with respect to  $\sigma_{\eta}$  gives

$$\frac{\partial\overline{\omega}}{\partial\sigma_{\eta}} = \frac{1-\alpha}{\alpha} (Y/E)^{\mu_{\eta}} \exp\left[\frac{\sigma_{\eta}}{2} \ln(Y/E)^2\right] \frac{\ln(Y/E)^2}{2} \stackrel{(4)}{=} \frac{\ln(Y/E)^2}{2} \overline{\omega}, \quad (A.15)$$

which is non-negative as  $Y, E, \overline{\omega} > 0$ .  $\frac{\partial \overline{\omega}}{\partial \sigma_{\eta}}$  is zero for the special case of Y = E, and strictly positive otherwise.

We additionally examine how the effect of preference heterogeneity on mean marginal WTP depends on the mean level of complementarity preferences as well as on income in the two additional sub-results following from Proposition 2 below:

3. Differentiating Eq. (A.15) with respect to  $\mu_{\eta}$  gives

$$\frac{\partial^2 \overline{\omega}}{\partial \sigma_\eta \partial \mu_\eta} = \frac{\ln(Y/E)^2}{2} \frac{\partial \overline{\omega}}{\partial \mu_\eta} \stackrel{(A.15)}{=} \frac{\ln(Y/E)^3}{2} \overline{\omega}, \tag{A.16}$$

for which the sign is determined by  $\ln(Y/E)$  since  $\overline{\omega} > 0$ . It holds:

$$\frac{\partial^2 \overline{\omega}}{\partial \sigma_\eta \partial \mu_\eta} \stackrel{\geq}{\geq} 0 \iff Y \stackrel{\geq}{\geq} E$$

#### 4. Differentiating Eq. (A.15) with respect to Y gives

$$\frac{\partial^2 \overline{\omega}}{\partial \sigma_\eta \partial Y} = \ln(Y/E) \, \frac{E}{Y} \, \overline{\omega} + \frac{\ln(Y/E)^2}{2} \frac{\partial \overline{\omega}}{\partial Y},\tag{A.17}$$

where  $\frac{\partial \overline{\omega}}{\partial Y} = \overline{\omega} \frac{E}{Y} \left( \mu_{\eta} + \ln(Y/E) \sigma_{\eta}^2 \right)$  and hence

$$\frac{\partial^2 \overline{\omega}}{\partial \sigma_\eta \partial Y} = \overline{\omega} \frac{E}{Y} \ln(Y/E) \left[ 1 + \frac{\ln(Y/E)\mu_\eta + \ln(Y/E)^2 \sigma_\eta^2}{2} \right] \\
= \ln(Y/E) \left[ \overline{\omega} \frac{E}{Y} + \frac{\ln(Y/E)}{2} \left( \overline{\omega} \frac{E}{Y} \left( \mu_\eta + \ln(Y/E) \sigma_\eta^2 \right) \right) \right] \\
= \ln(Y/E) \left[ \overline{\omega} \frac{E}{Y} + \frac{\partial \overline{\omega}}{\partial Y} \frac{\ln(Y/E)}{2} \right].$$
(A.18)

Thus,

$$\frac{\partial^2 \overline{\omega}}{\partial \sigma_\eta \partial Y} \gtrless 0 \iff \ln(Y/E) \left[ \overline{\omega} \, \frac{E}{Y} + \frac{\partial \overline{\omega}}{\partial Y} \, \frac{\ln(Y/E)}{2} \right] \gtrless 0. \tag{A.19}$$

To analyse what determines the sign of  $\frac{\partial^2 \overline{\omega}}{\partial \sigma_\eta \partial Y}$  we have to distinguish two cases.

<u>Case 1: For Y > E</u> Eq. (A.19) simplifies to

$$\overline{\omega} \, \frac{E}{Y} + \frac{\partial \overline{\omega}}{\partial Y} \, \frac{\ln(Y/E)}{2} \stackrel{\geq}{=} 0 \iff \frac{\partial \overline{\omega}}{\partial Y} \frac{Y}{\overline{\omega}} \stackrel{\geq}{=} \underbrace{-\frac{2 E}{\ln(Y/E)}}_{<0, \text{ for } Y > E}, \tag{A.20}$$

where  $\eta_{\overline{\omega},Y} := \frac{\partial \overline{\omega}}{\partial Y} \frac{Y}{\overline{\omega}}$  is the income elasticity of mean marginal WTP or the elasticity of complementarity. Since Y is a normal good by assumption and thus  $\eta_{\overline{\omega},Y} > 0$ , it holds that  $\frac{\partial^2 \overline{\omega}}{\partial \sigma_\eta \partial Y} > 0$  if Y > E.

<u>Case 2: For Y < E</u> Eq. (A.19) simplifies to

$$\overline{\omega} \, \frac{E}{Y} + \frac{\partial \overline{\omega}}{\partial Y} \, \frac{\ln(Y/E)}{2} \stackrel{\leq}{\leq} 0 \iff \frac{\partial \overline{\omega}}{\partial Y} \frac{Y}{\overline{\omega}} \stackrel{\leq}{\leq} \underbrace{-\frac{2 E}{\ln(Y/E)}}_{>0, \text{ for } Y < E}, \tag{A.21}$$

and consequently  $\frac{\partial^2 \overline{\omega}}{\partial \sigma_\eta \partial Y} > 0$  if  $\eta_{\overline{\omega},Y} < 0$  and Y < E.

Considering both cases together establishes the Proposition. Note that the elasticity of complementarity (or income elasticity of mean marginal WTP),  $\eta_{\overline{\omega},Y}$ , is generally not equal to the mean of the individual elasticities,  $\mu_{\eta}$ , since (written for N individuals):

$$\mu_{\eta} := \frac{1}{N} \sum_{i=1}^{N} \eta_{i} = \frac{1}{N} \sum_{i=1}^{N} \frac{\partial \omega_{i}}{\partial Y} \frac{Y}{\omega_{i}} \neq \frac{\partial \left[\frac{1}{N} \sum_{i=1}^{N} \omega_{i}\right]}{\partial Y} \frac{Y}{\frac{1}{N} \sum_{i=1}^{N} \omega_{i}} = \frac{\partial \overline{\omega}}{\partial Y} \frac{Y}{\overline{\omega}} =: \eta_{\overline{\omega}, Y}. \quad (A.22)$$

A.3	Additional	Tables	and	Figures
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	Full sample				Final sample			
	Mean	SD	Min	Max	Mean	SD	Min	Max
Age	50.91	15.44	18	88	51.03	15.25	18	86
Gender								
Male	0.50	0.50	0	1	0.53	0.50	0	1
Female	0.49	0.50	0	1	0.46	0.50	0	1
Non-binary	0.00	0.00	0	0	0.00	0.00	0	0
Marital status								
Married / cohabiting	0.60	0.49	0	1	0.60	0.49	0	1
Single	0.26	0.44	0	1	0.27	0.44	0	1
Separated / divorced / widowed	0.14	0.35	0	1	0.13	0.34	0	1
University degree	0.30	0.46	0	1	0.32	0.47	0	1
Monthly household income								
$\leq 500$ Euro	0.02	0.13	0	1	0.01	0.12	0	1
$500 - 999 { m Euro}$	0.05	0.22	0	1	0.05	0.23	0	1
$1000-1499 \ \mathrm{Euro}$	0.10	0.30	0	1	0.09	0.29	0	1
$1500 - 1999 { m  Euro}$	0.11	0.31	0	1	0.11	0.31	0	1
$2000 - 2499 { m Euro}$	0.13	0.33	0	1	0.13	0.34	0	1
$2500 - 2999 { m Euro}$	0.12	0.33	0	1	0.12	0.33	0	1
$3000 - 3499 { m Euro}$	0.10	0.30	0	1	0.11	0.31	0	1
$3500 - 3999 { m Euro}$	0.10	0.30	0	1	0.10	0.30	0	1
$4000 - 4499 { m  Euro}$	0.09	0.29	0	1	0.08	0.28	0	1
$4500 - 4999 { m Euro}$	0.07	0.26	0	1	0.08	0.27	0	1
$5000 - 6000 { m Euro}$	0.06	0.24	0	1	0.07	0.25	0	1
$\geq 6000$ Euro	0.04	0.20	0	1	0.04	0.20	0	1
Observations	2,181				1,428			

Table A1: Descriptive statistics.

*Notes*: This table shows descriptive statistics for the full and final sample. The full sample includes all participants that took part in our experiment. The final sample consists of participants that passed several quality checks and made choices that allow us to recover their preference parameters.

	Private Incentivized	Private Hypothetical	Public Incentivized	Public Hypothetical	
Age	52.79	50.31 **	49.45 ***	51.12	
Gender					
Male	0.51	0.52	0.46	0.49	
Female	0.48	0.46	0.52	0.49	
Non-binary	0.00	0.00	0.00	0.00	
Marital status					
Married / cohabiting	0.59	0.58	0.61	0.63	
Single	0.24	0.27	0.27	0.25	
Separated / divorced / widowed	0.18	0.15	0.12 *	0.13 *	
University degree	0.31	0.31	0.30	0.30	
Monthly household income					
$\leq 500$ Euro	0.01	0.02	0.02	0.02	
$500 - 999 { m Euro}$	0.06	0.05	0.06	0.05	
1000 - 1499 Euro	0.12	0.09	0.07 *	0.10	
$1500 - 1999 { m Euro}$	0.11	0.11	0.12	0.11	
2000 - 2499 Euro	0.12	0.15	0.13	0.12	
2500 - 2999 Euro	0.13	0.12	0.14	0.11	
3000 - 3499 Euro	0.10	0.11	0.09	0.11	
3500 - 3999 Euro	0.11	0.09	0.13	0.09	
4000 - 4499 Euro	0.07	0.11	0.09	0.09	
4500 - 4999 Euro	0.09	0.06	0.06	0.08	
$5000 - 6000 { m Euro}$	0.05	0.06	0.06	0.06	
$\geq 6000$ Euro	0.04	0.04	0.04	0.05	
Observations	518	596	509	558	

Table A2: Balance test of the treatment groups.

Notes: This table compares participant's characteristics of the final sample between treatment groups. The final sample includes participants that passed several quality checks and for which we can recover their preference parameters. The table shows mean values for each treatment group. Stars in Columns (2) to (4) indicate significance differences in the mean values between the respective treatment group and the private incentivized treatment group in Column (1). We use t-tests to compare mean values. \* p < 0.1, \*\* p < 0.05, \*\*\* p < 0.01

	$\eta_i$	$lpha_i$
Private Hypothetical	0.000	0.000
Private Incentivized	(.) 0.419 (1.507)	(.) -0.039 (0.025)
Public Hypothetical	$1.986 \\ (1.481)$	$-0.165^{***}$ (0.025)
Public Incentivized	$\begin{array}{c} 0.110\\ (1.525) \end{array}$	$-0.184^{***}$ (0.026)
N	1,428	1,428
$\mathbb{R}^2$	0.00	0.05
Fisher's p-value	0.222	0.000

Table A3: Treatment effects on  $\eta_i$  and  $\alpha_i$ .

Notes: This table shows OLS regression results for the treatment effects on  $\eta_i$  and  $\alpha_i$ . The private hypothetical treatment serves as the baseline. While the OLS regressions test for differences in the mean values, we also run Fisher's exact test of the equality of the medians across treatments and report their corresponding p-values. \* p < 0.1, \*\* p < 0.05, \*\*\* p < 0.01.

	$\eta_i$	$lpha_i$	$\eta_i$	$lpha_i$
Public setting	0.000	0.000		
	(.)	(.)		
Private setting	-0.899	$0.156^{***}$		
	(1.073)	(0.018)		
Hypothetical setting			0.000	0.000
			(.)	(.)
Incentiviced setting			-0.716	-0.028
			(1.074)	(0.018)
N	1,428	1,428	1,428	1,428
$\mathbb{R}^2$	0.00	0.05	0.00	0.00
Fisher's p-value	0.751	0.000	0.751	0.000

Table A4: Treatment effects of private and incentivized settings for  $\eta_i$  and  $\alpha_i$ .

Notes: This table shows OLS regression results comparing the private treatments with the public treatments and the incentivized with the hypothetical treatments on  $\eta_i$  and  $\alpha_i$ . The public and hypothetical treatments serve as the baseline. While the OLS regressions test for differences in the mean values, we also run Fisher's exact test of the equality of the medians across treatments and report their corresponding p-values. Standard errors in parentheses. \* p < 0.1, \*\* p < 0.05, \*\*\* p < 0.01.

	$Dependent \ variable: \ \eta_i$							
	(1)	(2)	(3)	(4)	(5)			
Constant	$14.760^{***} \\ (3.246)$	$ \begin{array}{c} 12.006^{***} \\ (1.193) \end{array} $	$ \begin{array}{c} 16.517^{***} \\ (3.016) \end{array} $	$ \begin{array}{c} 13.282^{***} \\ (0.646) \end{array} $	$\begin{array}{c} 12.537^{***} \\ (0.539) \end{array}$			
Household Income (in 1000 EUR)	$0.183 \\ (0.347)$	$0.202 \\ (0.344)$						
Forest Importance	-0.362 (0.510)		-0.641 (0.490)					
Forest Visits Frequency (in visits/year)	-0.016 (0.010)			$-0.017^{*}$ (0.010)				
Tree Donations 2023 (in 1000 EUR)	1.187 (0.759)				$1.295^{*}$ (0.751)			
Observations R <sup>2</sup>	$1,422 \\ 0.005$	$1,422 \\ 0.0002$	$1,422 \\ 0.001$	$1,422 \\ 0.002$	$1,422 \\ 0.002$			

Table A5: Regression results of  $\eta_i$  for income and environmental preferences.

Notes: This Table shows results from OLS regressions. The independent variable Household Income is defined as midpoints of the income categories (e.g. 750 EUR for the category 500-999 EUR) and 7000 EUR for the highest category (>6000 EUR/month). Forest Importance is measured on a 7-point Likert scale and treated as quasi-continuous. Forest Visit Frequency Importance is re-scaled to visits per year and assuming 4 visits per week for the highest category (>3 visits per week). For Tree Donations 2023 we assume that an omitted answer corresponds to 0 EUR. Standard errors are shown in parentheses. While coefficients for two environmental preference proxies are marginally significant in univariate regressions, they show opposite signs and disappear in a multivariate regression. Significance levels: \* p < 0.1, \*\* p < 0.05, \*\*\* p < 0.01.

rable rio. Summary statistics grouped by comprehension.								
	Mean	SD	Median	Ν				
0 Mistakes								
$\eta_i$	14.86	23.96	2.56	1,752				
$lpha_i$	0.48	0.36	0.47	1,752				
> 0 Mistakes								
$\eta_i$	15.32	24.37	2.52	429				
$lpha_i$	0.48	0.39	0.45	429				

Table A6: Summary statistics grouped by comprehension.

*Notes*: Summary statistics of the preference parameters for the full sample (without exclusions) grouped by participants that passed the comprehension check on the first try and participants that required more than one try to select the correct answer. Individual-level estimates for  $\eta_i$  are winsorized at the upper 90th percentile.



Figure A1: Distribution of the price ratio in our experiment.

Notes: This figure shows the distributions of the relative prices between the consumption good and public environmental good that participants saw in our experiment. Prior to the experiment, we randomly generated 30 budget lines in a way that one axis intercept is between 0.1 and 1 and the other between 0.5 and 1. As a result, we obtain normally distributed price ratios when using a logarithmic scale.



Figure A2: Distribution of the CCEI scores.

*Notes:* This figure shows the distributions of the critical cost efficiency index (CCEI) suggested by Afriat (1972). The score informs about the severity of GARP violations as a measure for the rationality of choices. Following Fisman et al. (2007), we exclude participants which a CCEI of less than 0.8 due to concerns about their rationality.



Figure A3: Examples of choices with severe GARP violations (irrational participants).

*Notes:* This figure shows the choices of selected participants with inconsistent and irrational choices that we identified through their severe GARP violations. Participant 133, for example, made choices that seem to be random with no particular pattern. Participant 614 made several choices where only income was preferred, but also made intermediary choices in tasks with similar price ratios. That participant may have switched strategies during the experiment which causes these inconsistencies and render the whole set of choices irrational. In a similar vein, participant 468 chose the full amount of income in most tasks, but also chose the full amount of forest trees in some tasks with almost the same price ratios. Again, this can be due to different strategies applied during the same experiment which leaves some choices inconsistent to other choices.

![](_page_54_Figure_0.jpeg)

Figure A4: Main sample composition.

Notes: Failed Comprehension indicates that a participant failed a comprehension check at least 10 times. Fast/Slow clicker includes participants that finsihed the experiment in less than 5 minutes or more than 60 minutes. Uniform Preferences denotes participants that are insensitive to relative price changes, meaning that on average they allocated more than 98% of their budget to either income or trees. GARP Violation includes all participants below the CCEI threshold of 0.8.

![](_page_55_Figure_0.jpeg)

Figure A5: Distribution of the estimated  $\alpha_i$  and  $\eta_i$  parameters by treatment group.

*Notes:* This figure shows two distributions of the individual-level estimates of  $\alpha_i$  and  $\eta_i$  by treatment group. The left panel shows the distribution for  $\alpha_i$  and indicates the respective mean and median values in red and orange. The right panel shows the distribution for  $\eta_i$ . To improve the readability of the plot, we have capped the elasticity of complementarity,  $\eta_i$ , at a value of 10 in this Figure and only show the respective median values for  $\eta_i$  in orange.

![](_page_56_Figure_0.jpeg)

Figure A6: Boxplots & treatment differences: All treatment combinations.

Notes: Standard boxplots for  $\eta_i$  (top) and  $\alpha_i$  (bottom) by treatment, using the main sample data (N=1,428; upper 90% winsorization for  $\eta_i$ ). The numeric value inside each boxplot denotes the respective median. Brackets in the top figure indicate pairwise Wilcoxon rank-sum tests for median equality of the two treatment combinations below the two tips. Brackets in the bottom figure indicate pairwise t-tests for mean equality of the two treatment combinations below the two tips. The p-value above a bracket denotes the p-value for the corresponding pairwise test, adjusted by the Holm-Bonferroni method.

![](_page_57_Figure_0.jpeg)

Figure A7: Boxplots & treatment differences: Overall treatment categories.

Notes: Standard boxplots for  $\eta_i$  (top) and  $\alpha_i$  (bottom) by treatment categories, using the main sample data (N=1,428; upper 90% winsorization for  $\eta_i$ ). The numeric value inside each boxplot denotes the respective median. Brackets in the top figures indicate Wilcoxon rank-sum tests for median equality of the two treatment categories below the two tips. Brackets in the bottom figures indicate t-tests for mean equality of the two treatment categories below the two tips. The p-value above a bracket denotes the p-value for the corresponding test.

![](_page_58_Figure_0.jpeg)

Notes: This figure shows the mean and median elasticity of complementarity  $(\eta)$  for participants along their CCEI score. Deviations of the CCEI score from unity indicate by how much participants violate GARP. It thus informs how well choices can be rationalized with a well-defined utility maximization function. This figure also includes participants with a CCEI score of less than 0.80, which we exclude in our main analysis due to sizable violations of rational choices. We observe that participants with a lower CCEI score tend to a exhibit, on average, a higher estimated elasticity of complementarity  $(\eta)$ .

![](_page_59_Figure_0.jpeg)

Notes: This figure shows the sensitivity of our  $\eta$  estimates with respect to the chosen cut-off for the uniform preferences exclusion criterion. With this criterion we exclude participants who allocated, on average, more than 98% of their budget to a single good. For these participants we cannot separately identify their substitutability preferences. Here, we vary this cut-off value. All other exclusion criteria are applied and the values for  $\eta_i$  are winsorized at the upper 90th percentile. Error bars around the mean, black dot, indicate the corresponding standard error; the median is represented by the black triangle, while the green bars denote the number of participants.

## A.4 Experimental Results Considering Baseline Consumption

Participants might not consider their decisions within the experiment in isolation, but instead bundle them together with their preexisting consumption levels outside of the experimental environment. We assess this possibility in two ways: First, we perform a sensitivity analysis for the estimation of the preference parameters, assuming different baseline consumption levels for the (private) consumption good and the environmental public good. Second, we assume median preferences for each participant and estimate the baseline consumption levels necessary to rationalize their decisions.

Overall, the results provide suggestive evidence that the participants do not consider their baseline levels of consumption outside of the experiment, lending us confidence that we measure the intended heterogeneity in preferences with our design.

We show the derivation of optimal demand with baseline consumption levels  $\overline{Y}$  and  $\overline{C}$  in Appendix A.6. We then employ the following econometric specification for our two-limit maximum likelihood model which is analogous to the model of our main estimations:

$$p_Y Y_i = \frac{1 - p_Y \bar{Y} z + p_E \bar{E}}{1 + z} + \epsilon_i.$$
 (A.23)

To allow, but constrain, the numerical optimization we use penalty functions instead of strict corner solutions in the calculation of likelihood values.

#### Sensitivity analysis including baseline consumption

We estimate and report the preference parameters assuming one of four baseline consumption scenarios. For  $\bar{Y}$  in the private treatment, we always use midpoints of the household income categories stated by the participants at the end of the survey. For  $\overline{Y}$  in the public treatment and  $\overline{E}$  in both the private and public treatment, we use the following levels:

A:  $\bar{Y} = 375$  billion, reflecting the total annual federal taxes collected (in euros) in Germany in 2024 (Bundesfinanzministerium 2025).  $\bar{E} = 100.4$  billion, reflecting the total number of forest trees in Germany in 2022 (Bundesministerium für Ernährung und Landwirtschaft 2024).

**B**:  $\bar{Y} = 375$  billion as before and  $\bar{E} = 100.4/16$  billion, reflecting the average number of forest trees per state in Germany in 2022.

C:  $\bar{Y} = 375$  billion as before and  $\bar{E} = 1200$  reflecting the average number of forest trees per citizen in Germany in 2022.

**D**:  $\bar{Y} = 4485$  reflecting the average annual federal taxes collected (in euros) per citizen in Germany in 2024 and  $\bar{E} = 1200$  as before (Statistisches Bundesamt 2025).

Cumulative distributions for the estimated preference parameters for each of the four scenarios are shown in Figure A10. In each case, the decisions by our participants can only be explained by attributing largely the same preferences to each participant within the same treatment arm and – in the case of private treatments – within the same income category (Hence, the step-wise shape of the cumulative distribution of  $\eta$ ).

This is the case as the preference parameters are by design calibrated to best explain the decisions in the experiment given the baseline consumption levels: Most participants choose interior solutions most of the time, indicating that within a margin of one euro and one tree their baseline levels are already utility-maximizing. For each of these participants, the same consumption bundle is therefore optimal, leading to largely homogeneous preferences. In the following, we discuss the plausibility of these results by comparing expected and observed reactions to relative price changes.

![](_page_62_Figure_0.jpeg)

*Notes:* These figures show empirical cumulative distributions of individual-level preference parameters for the four different scenarios, named A to D, described in Appendix A.4. The legend in the left panel of A applies to all figures.

Let us first focus on the scenarios and treatments where  $\bar{Y}$  and  $\bar{E}$  do not diverge by multiple orders of magnitude. That is, all scenarios and treatments except private treatments in (A) and (B) and public treatments in (C).

In each of the selected scenarios and treatments we retrieve largely homogeneous preferences that express a strong complementarity between Y and E. For the majority of these participants we would expect no systematic reaction to relative price changes within the experiment as they would for every decision either (1) choose the same ratio between Y and E as dictated by  $\overline{Y}$  and  $\overline{E}$ , in line with their complementarity preferences or (2) choose without a clear strategic pattern as a (up to) one unit deviation from strict complementary consumption would be negligible in comparison to their baseline levels.<sup>26</sup>

The remaining scenarios and treatments are characterized by ratios of baseline levels that converge towards the uniform preference case where only a single good is consumed in every decision. In a utility-maximizing state we would, again, expect no systematic reactions to relative price changes in this case as participants would either (1) only ever consume a single good, irrespective of their substitutability preferences (2) choose without any strategic pattern due to the marginality of their decisions.

Let us, in addition, consider the possibility that the baseline levels of consumption are not utility-maximizing (up to a one unit deviation) for some of the participants. For the common case of unbalanced baseline levels that are high in comparison to the experimental units this would - with the exception of (near-to) perfect substitutability preferences - rationalize the uniform consumption of only a single good for every decision in order to move closer to the utility-maximizing total consumption bundle. Again, this would imply no reaction to relative price changes.<sup>27</sup>

For all cases above we should therefore not be able to observe systematic reactions to relative price changes. If we do, this would be strong suggestive evidence that participants do not take their baseline levels outside of the experiment into account when making decisions in our environment.

To evaluate reactions to relative price changes we regress the observed demand shares for consumption (income) Y/(Y + E) for each participant on the relative price ratios

 $<sup>^{26}</sup>$ For perfect substitutability preferences this would generally not be the case. Here participants would react to relative prices in the same way as without baseline levels of consumption.

 $<sup>^{27}</sup>$ Note that this coincides with our exclusion criterion for uniform preferences which applied to only 7% of participants, signaling that this is not a common occurrence.

![](_page_64_Figure_0.jpeg)

Figure A11: Reactions to relative price changes.

Notes: This figure shows the estimated change in observed demand for consumption (income) associated with an increase in the relative price  $p_E/p_Y$ . Results are reported for our main sample and in bins matching the categories in Figure 4. Bars at the bottom report the number of participants in each bin. Green shading shows the share of participants for which individual-level regression coefficients differ statistically significant from 0, at the 5% significance level. Within each bin the black dot denotes the mean value of the corresponding individual-level regression coefficients. 95% confidence intervals are reported, assuming normally distributed sample means for bins with small sample sizes.

 $p_E/p_Y$  they encountered and test if the slope coefficient differs significantly from zero.<sup>28</sup> The results are reported in Figure A11. We reject the null hypothesis of a slope coefficient differing from zero for most individual participants and groups binned by preference types. This lends us confidence that the majority of participants in our experiment dis-

 $<sup>^{28}{\</sup>rm This}$  corresponds to the slope of a linear function fitted through the data points in the third column of Figure 3.

regard their consumption levels outside of the experimental environment such that we measure the intended preferences with our design.

#### Predicting baseline consumption underlying decisions

In addition we use our median preference estimates of  $\eta = 2.48$  and  $\alpha = 0.47$  to predict the baseline consumption levels  $\bar{Y}$  and  $\bar{E}$  necessary to rationalize the decisions of our participants.

To this end we assume homogeneous preferences i.e. that all participants decide based on the same median sample preferences but different baseline consumption levels. The econometric specification follows A.23 and the results are reported in Table A7. For a large majority of the sample, the baseline levels rationalizing the decisions are close to zero for both  $\bar{Y}$  and  $\bar{E}$ . This serves as additional suggestive evidence that participants decide in narrow brackets without regard to consumption outside of the experiment.

			V					
	Mean	Min	Max	P5	P25	Median	P75	P95
$\bar{Y}$	8,062.11	-1.01	1.15e+07	-0.28	-0.15	0.09	0.40	1.12
$\bar{E}$	7,663.38	-0.92	1.09e+07	-0.29	-0.16	0.05	0.29	1.08
Observations	1,428							

Table A7: Summary statistics for baseline estimations.

*Notes*: This table shows estimations for the baseline consumption levels necessary to rationalize the decisions made by participants in the experiment. Here, we assume median sample preferences of  $\eta_i = 2.48$  and  $\alpha_i = 0.47$  for each participant. PX denotes the X% percentile.

### A.5 Sensitivity of Results to the Exclusion of Outliers

The estimation of preference parameters might be sensitive to outlier decisions that do not represent the intrinsic preferences of a participant. To illustrate the effect this might have on the results we exclude the most adverse decision for every participant and report estimation results for the remaining 29 decisions in Table A8. In addition, Figure A12 shows an example of such an outlier decision from our experiment and how its exclusion changes the estimated elasticity of complementarity for the affected participant.

To determine the most adverse outlier we first iterate over all 30 decisions for each participant, excluding one decision at a time and estimating the individual-level preference parameters with the remaining 29 decisions. The iteration for which the estimated  $\eta_i$  parameter deviates most from the median estimation of all iterations is then determined to be the iteration that excluded the most adverse outlier.

The deviation of  $\eta_i$  from the median estimate is measured by the following logarithmic transformation of the absolute difference:  $|ln(\eta_i + c) - ln(median(\eta_i + c))|$ , with c = 0.05. This transformation ensures that the economic significance of changes for low values (e.g. from perfect substitutability to Cobb-Douglas substitutability) is preserved. Vice versa, the constant c ensures that small changes close to zero do not dominate the analysis.

	Median	Mean	SD	Min	Max
$\eta_{Main}$	2.48	12.70	20.27	0.00	63.63
$\eta_{Ex-Outlier}$	2.97	20.78	35.38	0.00	111.44
$lpha_{Main}$	0.47	0.47	0.35	0.00	1.00
$\alpha_{Ex-Outlier}$	0.46	0.47	0.37	0.00	1.00
Observations	1,428				

Table A8: Summary Statistics of Outlier Sensitivity Analysis.

*Notes*: This table shows summary statistics of the estimated preference parameters for the main sample using (1) our main specification (2) excluding potential outlier decisions. In both cases the estimates for  $\eta$  are winsorized at the upper 90th percentile.

![](_page_67_Figure_3.jpeg)

Figure A12: Example of Excluded Outlier

*Notes:* This figure shows the choices of a participant with the red dot indicating a choice determined to be an outlier. Non-winsorized estimations for the elasticity of complementarity are provided before and after exclusion of this outlier.

# A.6 Derivation of Optimal Demand with Baseline Consumption

We discuss a model in which the agent also considers background levels of  $\overline{C}$  and  $\overline{E}$  (outside of the experiment). The utility function can then be written as:

$$U_i(C, E, \bar{C}, \bar{E}; \eta_i) = \left(\alpha_i(C + \bar{C})^{1 - \eta_i} + (1 - \alpha_i)(E + \bar{E})^{1 - \eta_i}\right)^{\frac{1}{1 - \eta_i}},$$
(A.24)

s.t.

$$p_C C + p_E E + \pi_{\bar{C}}(p_{\bar{C}}) + \pi_{\bar{E}}(p_{\bar{E}}) = m + m_{out}$$
(A.25)

$$C \ge 0 \tag{A.26}$$

$$E \ge 0 \quad . \tag{A.27}$$

For completeness, the budget constraint (A.25) includes the budget that the participants spend outside of the experiment,  $m_{out}$ , but simplifies to the usual constraint by subtracting  $m_{out} = \pi_{\bar{C}}(p_{\bar{C}}) + \pi_{\bar{E}}(p_{\bar{E}})$  from both sides of the equation, where  $\pi_i(p_i)$ denotes the budget share spent on good *i* as a function of its price  $p_i$ . Non-negativity constraints are added as the budget constraint alone is not sufficient to ensure positive values for *C* and *E*.

The Lagrangian for the corresponding maximization problem reads:

$$\mathcal{L}(C, E, \lambda, \mu_c, \mu_e) = \left(\alpha_i (C + \bar{C})^{1 - \eta_i} + (1 - \alpha_i) (E + \bar{E})^{1 - \eta_i}\right)^{\frac{1}{1 - \eta_i}} + \lambda (m - p_C C - p_E E) + \mu_C C + \mu_E E$$
(A.28)

and the first order conditions are given by:

$$\frac{\partial \mathcal{L}}{\partial C} = \left(\alpha_i (C + \bar{C})^{1-\eta_i} + (1 - \alpha_i) (E + \bar{E})^{1-\eta_i}\right)^{\frac{1}{1-\eta_i}-1} \alpha_i (C + \bar{C})^{-\eta_i} - \lambda p_C - \mu_C = 0$$
(A.29)

$$\frac{\partial \mathcal{L}}{\partial E} = \left(\alpha_i (C + \bar{C})^{1 - \eta_i} + (1 - \alpha_i) (E + \bar{E})^{1 - \eta_i}\right)^{\frac{1}{1 - \eta_i} - 1} (1 - \alpha_i) (E + \bar{E})^{-\eta_i} - \lambda p_E - \mu_E = 0$$
(A.30)

$$m - p_C C - p_E E = 0 \tag{A.31}$$

$$\mu_C C = 0 \tag{A.32}$$

$$\mu_E E = 0 \tag{A.33}$$

We first examine interior solutions for which the complementary slackness conditions require  $\mu_C = \mu_E = 0$ . Dividing (A.29) by (A.30) and rearranging then gives:

$$\frac{p_C}{p_E} = \frac{\alpha_i}{1 - \alpha_i} \left(\frac{C + \bar{C}}{E + \bar{E}}\right)^{-\eta_i} \tag{A.34}$$

$$E = (C + \bar{C}) \left(\frac{p_E}{p_C} \frac{\alpha_i}{1 - \alpha_i}\right)^{-\frac{1}{\eta_i}} - \bar{E}$$
(A.35)

Inserting (A.35) into the budget constraint gives:

$$m = p_C C + p_E \left( (C + \bar{C}) \left( \frac{p_E}{p_C} \frac{\alpha_i}{1 - \alpha_i} \right)^{-\frac{1}{\eta_i}} - \bar{E} \right)$$
(A.36)

$$m = C\left(p_C + p_E\left(\frac{p_E}{p_C}\frac{\alpha_i}{1 - \alpha_i}\right)^{-\frac{1}{\eta_i}}\right) + p_E\bar{C}\left(\frac{p_E}{p_C}\frac{\alpha_i}{1 - \alpha_i}\right)^{-\frac{1}{\eta_i}} - p_E\bar{E}$$
(A.37)

$$C = \frac{m - p_E \bar{C} \left(\frac{p_E}{p_C} \frac{\alpha_i}{1 - \alpha_i}\right)^{-\frac{1}{\eta_i}} + p_E \bar{E}}{p_C + p_E \left(\frac{p_E}{p_C} \frac{\alpha_i}{1 - \alpha_i}\right)^{-\frac{1}{\eta_i}}}$$
(A.38)

$$C = \frac{m - p_C \bar{C} \left(\frac{p_E}{p_C}\right)^{-\frac{1-\eta_i}{\eta_i}} \left(\frac{\alpha_i}{1-\alpha_i}\right)^{-\frac{1}{\eta_i}} + p_E \bar{E}}{p_C \left(1 + \left(\frac{p_E}{p_C}\right)^{-\frac{1-\eta_i}{\eta_i}} \left(\frac{\alpha_i}{1-\alpha_i}\right)^{-\frac{1}{\eta_i}}\right)}$$
(A.39)

$$\frac{p_C C}{m} = \frac{1 - \frac{p_C \bar{C}}{m} \left(\frac{p_E}{p_C}\right)^{-\frac{1-\eta_i}{\eta_i}} \left(\frac{\alpha_i}{1-\alpha_i}\right)^{-\frac{1}{\eta_i}} + \frac{p_E \bar{E}}{m}}{1 + \left(\frac{p_E}{p_C}\right)^{-\frac{1-\eta_i}{\eta_i}} \left(\frac{\alpha_i}{1-\alpha_i}\right)^{-\frac{1}{\eta_i}}} , \qquad (A.40)$$

which is the optimal demand share for C for interior solutions. For a more compact representation we use our normalized budget m = 1 and define  $z = \left(\frac{p_E}{p_C}\right)^{-\frac{1-\eta_i}{\eta_i}} \left(\frac{\alpha_i}{1-\alpha_i}\right)^{-\frac{1}{\eta_i}}$  to obtain:

$$p_C C = \frac{1 - p_C \bar{C} z + p_E \bar{E}}{1 + z}$$
(A.41)

By definition  $p_E, p_C > 0$  and  $0 \le \alpha_i \le 1$ . Therefore, the denominator of (A.41) is strictly positive and the solutions and conditions for corner solutions follow immediately. With C = Y the complete characterization of the optimal demand share  $p_Y Y$  in our experiment is then given by:

$$p_Y Y = \begin{cases} 1 & \text{for} \quad 1 - p_Y \bar{Y} z + p_E \bar{E} > 1 + z \\ \frac{1 - p_Y \bar{Y} z + p_E \bar{E}}{1 + z} & \text{for} \quad 0 \le 1 - p_Y \bar{Y} z + p_E \bar{E} \le 1 + z \\ 0 & \text{for} \quad 1 - p_Y \bar{Y} z + p_E \bar{E} < 0, \end{cases}$$
(A.42)

# A.7 Full Experimental Instructions (Translation) Welcome

Welcome to this study on decisions that are important for economic and environmental policy. The study is conducted by researchers at the University of Hamburg. Your answers will be stored and processed **anonymously**.

# Background

This study will be used for a research project funded by the **Federal Ministry of Education and Research** (Bundesministerium für Bildung und Forschung). The results are intended to help with economic and environmental policy decisions. To this end, we also share the results of this study with our project partners, the **Federal Environment Agency** (Umweltbundesamt) and the **Federal Agency for Nature Conservation** (Bundesamt für Naturschutz).

## Remuneration

# [Private Incentivized Version]

If you participate in the study and answer all the questions, you will receive a **lump-sum payment**. Depending on your answers, you might also receive a **variable remuneration** of up to EUR 1 (converted to LifePoints).

[Private Non-Incentivized Version, Public Incentivized Version and Public Non-Incentivized Version]

If you participate in the study and answer all the questions, you will receive a **lumpsum payment**.

## Requirements

- You will need about 20 minutes.
- You must **concentrate** and read thoroughly.
- You may not use a smartphone.

## Preview

We will ask you to make **30 distribution decisions** using interactive illustrations. Here is an example of how we illustrate the distribution decisions:


## [Public incentivized version and public non-incentivized version]



This is followed by a questionnaire with 13 questions.

## [Horizontal line]

## Your consent

Have you read the above text and do you give your consent?

- Yes
- No

Would you like to participate in this study?

- Yes
- No

## [Page break] Your age and gender

Please state your age and gender.

How old are you? [16 - 99]

What gender do you identify with?

- Male
- Female
- Non-binary
- Prefer not to respond
- Other

# [Page break] General information

In studies like ours it sometimes occurs that participants do not thoroughly read all questions. This is a problem as it may distort the research results. Therefore, it is very important that you read and answer each question carefully.

To show that you read our questions attentively, please select "Newspapers".

- Radio
- Newspapers
- Other
- Twitter
- Facebook

- TikTok
- Television
- Reddit
- YouTube

# [Page break] General information

## [Private Incentivized Version]

As mentioned before, you might receive an additional variable renumeration, depending on the decisions you make. In addition to that, based on your decisions, we will donate money to a state forestry operation for the planting of trees.

On the following pages, we will explain how your decisions are linked to an additional variable renumeration or a donation for planting trees.

First, you must **give your consent** that we may **donate for planting trees on your behalf**. Without this consent, you cannot participate in this study.

## Instructions:

If you decide to assign a part of the variable remuneration to a donation for planting trees, you agree that the execution of the donations will be carried out collectively for all participants by the head of this experiment (Prof. Dr. Moritz Drupp). To document the assigned donations, the donation receipt will be published on the website of the professorship at the University of Hamburg after completion of this study: https://uhh.de/wiso-baumpflanzen

Have you read the instructions and do you agree to them?

- Yes
- No

## [Public Incentivized Version]

As mentioned before, you will receive a lump-sum payment. Furthermore, based on your decisions we will donate to the Federal Treasury (Bundeskasse), financially benefitting all residents of Germany, and to a state forestry operation for the planting of trees, benefitting all residents of Germany by improving air quality.

On the following pages, we will explain how your decisions are linked to an additional donation to the Federal Treasury and to a donation for planting trees.

First, you must **give your consent** that we may **donate to the Federal Treasury** and **donate for planting trees** on your behalf. Without this consent, you cannot participate in this study.

### Instructions:

If you decide to assign a part of the money to a donation to the Federal Treasury or to a donation for planting trees, you agree that the execution of the donations will be carried out collectively for all participants by the head of this experiment (Prof. Dr. Moritz Drupp). To document the assigned donations, the donation receipts will be published on the website of the professorship at the University of Hamburg after completion of this study: https://uhh.de/wiso-baumpflanzen

Have you read the instructions and do you agree to them?

- Yes
- No

[Skip page for Private Non-incentivized Version and Public Non-incentivized Version]

# [Page break] General information

## [Private Version]

We will ask you to make 30 distribution decisions.

When making these distribution decisions, you need to weigh the following aspects against each other:

- income and
- trees.

## Please select distributions between income and trees that best reflect your wishes.

### Consequences

[Private Incentivized Version]

**Your decisions are** <u>not</u> **hypothetical**. Both the income and the number of trees that you choose will be paid out to you or planted through a donation.

To do this, we will **randomly select one of the 30 distribution decisions** at the end of the study and **implement your respective decision**.

## [Private Non-Incentivized Version]

Your decisions are hypothetical, but not without consequences. Neither the income nor the number of trees that you choose will be paid out to you or planted through a donation.

However, the results of how you would decide will be passed on to the Federal Environment Agency to contribute to the further development of environmental policies. Therefore, your decisions may have actual consequences.

## Background

In this study, we want to understand how you deal with the **trade-off** between **income** for you and **public environmental quality** (here in the form of more trees). To this end, we show you various situations (i.e. distribution decisions) that differ in terms of the distribution *options*.

## [Public Version]

We will ask you to make **30 distribution decisions**.

When making these distribution decisions, you need to weigh the following aspects against each other:

- money for the Federal Treasury and
- trees.

Please select distributions between money for the treasury and trees that best reflect your wishes.

## Consequences

[Public Incentivized Version]

**Your decisions are <u>not</u> hypothetical**. Both the money for the Federal treasury and the number of trees that you choose will be donated or planted through a donation.

To do this, we will **randomly select one of the 30 distribution decisions** at the end of the study and **implement your respective decision**.

[Public Non-Incentivized Version]

**Your decisions are hypothetical, but not without consequences**. Neither the money for the Federal Treasury nor the number of trees that you choose will be donated or planted through a donation.

However, the results of how you would decide will be passed on to the Federal Environment Agency to contribute to the further development of environmental policies. Therefore, your decisions may have actual consequences.

## Background

In this study, we want to understand how you deal with the **trade-off** between **money for the Federal Treasury** and **public environmental quality** (here in the form of more trees). To this end, we show you various situations (i.e. distribution decisions) that differ in terms of the distribution *options*.

# [Pagebreak] General information

We will visualize the different distribution decisions using an interactive illustration. Here is an example:



[Private Incentivized Version and Private Non-incentivized Version]

[Public Incentivized Version and Public Non-incentivized Version]



Please pay particular attention to the **blue line**. It indicates the following:

[Private Incentivized Version and Private Non-incentivized Version]

- 1. It shows **all distributions** between income and trees that **are possible** in the respective situation.
- 2. Its **axis intercepts** describe the maximum possible income for you (here EUR 1) and the maximum possible number of trees (0.2) that you can plant with a donation.
- 3. Its **slope** describes the exchange rate between income for you and planted trees.

[Public Incentivized Version and Public Non-incentivized Version]

- 1. It shows **all distributions** between money for the Federal Treasury and trees that **are possible** in this situation.
- 2. Its **axis intercepts** describe the maximum possible amount of money for the Federal Treasury (here EUR 1) and the maximum possible number of trees (0.2) that you can plant with a donation.
- 3. Its **slope** describes the exchange rate between income for all German citizens (paid to the Federal Treasury) and planted trees.

**To choose a distribution** that most closely reflects your preferences, **please click** on the desired distribution on the blue line **or** use the **slider**. After you have made your decision, please click "Next".

You will see another, unrelated distribution decision. This process will be repeated until you have completed all distribution decisions.

## [Pagebreak] Costs of a tree donation

### [Private Incentivized Version]

It currently costs EUR 5 to plant a tree at a state forestry operation in Germany. A donation of EUR 1 therefore corresponds to a fifth of a tree. If you forgo the same amount in our study, you can always have *at least* one tree planted, often even more. So, you won't see any situations where you can have more trees planted by a state forestry operation in Germany for the same amount of income that you can receive instead.

This is explained by us topping up your donation. For example, if you decide to have one tree planted and forgo EUR 1, we will pay the remaining EUR 4 to have the tree planted by a state forestry operation. The purpose of the donation increase is merely to generate different situations for distribution decisions. Therefore, please do not donate more money than you would otherwise.

#### **Payment of donations**

Upon completion of the study, we **add up** the **number of trees chosen by all participants** in one of the 30 random distribution decisions, round it up to a full number of trees and **have these trees planted** through a donation to a state forestry operation.

### [Private Non-Incentivized Version]

It currently costs EUR 5 to plant a tree at a state forestry operation in Germany. If you forgo the same amount in our study, you can always have *at least* one tree planted, often even more. So, you won't see any situations where you can have more trees planted by a state forestry operation in Germany for the same amount of income that you can receive instead.

This is explained by us hypothetically topping up your donation. For example, if you decide to have two trees planted and forgo EUR 5, we will pay the remaining EUR 5 to have the corresponding number of trees planted by a state forestry operation. The purpose of the hypothetical donation increase is merely to

generate different situations for distribution decisions. Therefore, please do not donate more money than you would otherwise.

#### **Payment of donations**

Since your decision is **merely hypothetical**, no trees will be planted through a donation to a state forestry operation. However, your hypothetical distribution decisions still provide important data to inform environmental policies.

#### [Public Incentivized Version]

It currently costs EUR 5 to plant a tree at a state forestry operation in Germany. If you decide against donating the same amount to the Federal Treasury in our study, you can always have *at least* one tree planted, often even more. So, you won't see any situations where you can have more trees planted by a state forestry operation in Germany for the same amount of money that you can donate to the Federal Treasury instead.

This is explained by us topping up your donation. For example, if you decide to have two trees planted and forgo giving EUR 5 to the Federal Treasury, we will pay the remaining EUR 5 to have the corresponding number of trees planted by a state forestry operation. The purpose of the donation increase is merely to generate different situations for distribution decisions. Therefore, please do not donate more money than you would otherwise.

#### **Payment of donations**

Upon completion of the study, we **add up** the **number of trees chosen by all participants** in one of the 30 random distribution decisions, round it up to a full number of trees and **have these trees planted** through a donation to a state forestry operation.

In addition to that, we **sum up the amount of money to the Federal Treasury** given by all participants in one of the 30 random distribution decisions, round it up to a full euro amount and **donate it to the Federal Treasury**.

#### [Public Non-incentivized Version]

It currently costs EUR 5 to plant a tree at a state forestry operation in Germany. If you decide against donating the same amount to the Federal Treasury in our study, you can always have *at least* one tree planted, often even more. So, you won't see any situations where you can have more trees planted by a state forestry operation in Germany for the same amount of money that you can donate to the Federal Treasury instead.

This is explained by us topping up your donation. For example, if you decide to have two trees planted and forgo giving EUR 5 to the Federal Treasury, we will pay the remaining EUR 5 to have the corresponding number of trees planted by a state forestry operation. The purpose of the donation increase is merely to generate different situations for distribution decisions. Therefore, please do not donate more money than you would otherwise.

### Payment of donations

Since your decision is **merely hypothetical**, no money will be donated to the Federal Treasury. However, your hypothetical distribution decisions still provide important data to inform environmental policies.

## [Pagebreak]

# [Private Incentivized Version and Private Non-Incentivized Version] Exchange rate between income for you and trees

The **gradient of the blue line** in the interactive illustrations informs you about the exchange rate between income and trees. It tells you how many trees you can have planted for every euro of income you forgo. The **steeper** the blue line, **the more trees** you can have planted for every euro of income you choose to forgo. The **flatter** the blue line, the **more income** you can receive for every tree you choose not to plant. Please take a look at the following two examples:

### Example 1:

In this situation, if you forgo an income of EUR 0.5, you can plant 0.2 trees for that amount of income.



### Example 2:

In this situation, if you forgo an income of EUR 0.5, you can plant 0.4 trees for that amount of income.



[Public Incentivized Version and Public Non-Incentivized Version]

# Exchange rate between income for all and trees

The **gradient of the blue line** in the interactive illustrations informs you about the exchange rate between income for all (money given to the Federal Treasury) and trees. It tells you how many trees you can have planted for every euro of money you decide not to donate to the Federal Treasury. The **steeper** the blue line, **the more trees** you can have planted for every euro of income you decide not to give to the Federal Treasury. The **steeper** the blue line, **the more trees** you can have planted for every euro of income you decide not to give to the Federal Treasury. The **flatter** the blue line, the **more money you can donate to the Federal Treasury** for every tree you choose not to plant. Please take a look at the following two examples:

### Example 1:

In this situation, if you decide not to give EUR 0.5 to the Federal Treasury, you could plant 0.2 trees for that amount of money.



## Example 2:

In this situation, if you decide not to give EUR 0.5 to the Federal Treasury, you could plant 0.4 trees for that amount of money.



## [Page break]

# [Private Incentivized Version and Private Non-Incentivized Version] Exchange rate between income for you and trees

On the previous page you have read information about the exchange rate between income and trees. Now please choose the answer option that best summarizes the exchange rate in the following situation:

- You can have 0.8 trees planted if you forgo EUR 0.2 of income.
- You can have 0.2 trees planted if you forgo EUR 0.8 of income.
- You can have 1 tree planted if you forgo EUR 1 of income.



[Public Incentivized Version and Public Non-Incentivized Version]

# Exchange rate between income for all and trees

On the previous page you have read information about the exchange rate between money given to the Federal Treasury and trees. Now please choose the answer option that best summarizes the exchange rate in the following situation:

- You can have 0.8 trees planted if you decide not to donate EUR 0.2 to the Federal Treasury.
- You can have 0.2 trees planted if you decide not to donate EUR 0.8 to the Federal Treasury.
- You can have 1 tree planted if you decide not to donate EUR 1 to the Federal Treasury.



[Pagebreak]

## Exercise decisions

On the following page we ask you to familiarize yourself with the interactive illustration. Please click "Next" to start with the **3 exercise decisions**.

[Private-Incentivized Version and Private Non-incentivized Version]

- Please choose a similar distribution between income for you and trees (i.e. approx. EUR 0.25 and 0.25 trees).
- Please choose a distribution where you allocate more than EUR 0.3 of income to yourself.
- Please choose a distribution where you have more than 0.3 trees planted.

[Public-Incentivized Version and Public-Non-incentivized Version]

- Please choose a similar distribution between income for all in form of money given to the Federal Treasury and trees (i.e. approx. EUR 0.25 and 0.25 trees).
- Please choose a distribution where you allocate more than EUR 0.3 to the Federal Treasury.
- Please choose a distribution where you have more than 0.3 trees planted.

## [Pagebreak] Exercise decisions completed

Thank you! You have successfully completed all 3 exercise decisions.

Please click "Next" to start with the **30 distribution decisions**.

# [Pagebreak] Distribution decision

[Private-Incentivized Version and Private Non-incentivized Version]

Please choose a distribution between income for you and trees.

[interactive illustration]

[Public-Incentivized Version and Public-Non-incentivized Version]

Please choose a distribution between income for all in form of money donated to the Federal Treasury and trees.

[interactive illustration]

# [Pagebreak] Distribution decision

Thank you very much for making your decisions. Next, we will ask you to answer a few more questions.

# [Pagebreak] Questionnaire

1. What is the zip code of your home address? \_\_\_\_\_

- 2. What is your highest school-leaving qualification?
  - No school-leaving qualification
  - Hauptschulabschluss (lower secondary school certificate)
  - Completed vocational training
  - Mittlere Reife/Realschulabschluss (higher secondary school certificate)
  - Hochschulabschluss (Universität, FH) (university degree)
  - Abitur (certificate of general qualification for university entrance)
  - Other
- 3. What is your marital status?
  - Married/registered partnership
  - Single
  - Living together
  - Separated/widowed/divorced
- 4. How many persons reside in your household (yourself included)?
- 5. How many of these persons are under the age of 18?
- 6. Which party do you lean towards?
  - SPD
  - CDU
  - CSU
  - FDP
  - Bündnis 90 / Die Grünen
  - Die Linke
  - AfD
  - Freie Wähler
  - Bündnis Sahra Wagenknecht
  - Other
- 7. What is your monthly net household income (the income of all household members together, including transfer payments such as child benefit, after deduction of taxes and social insurance)? For our evaluation, it is sufficient if you classify the net household income in one of the following categories:
  - Less than EUR 500 per month
  - EUR 500-999 per month
  - EUR 1000-1499 per month
  - EUR 1500-1999 per month
  - EUR 2000-2499 per month
  - EUR 2500-2999 per month
  - EUR 3000-3499 per month
  - EUR 3500-3999 per month
  - EUR 4000-4499 per month
  - EUR 4499-4999 per month
  - EUR 5000-6000 per month

- More than EUR 6000 per month
- 8. Approximately how often do you go into a forest?
  - Never
  - Once a year
  - Twice a year
  - Three times a year
  - Four times a year
  - Once a month
  - Twice a month
  - Three times a month
  - Four times a month
  - Once a week
  - Twice a week
  - Three times a week
  - More than three times a week
- 9. How important is the availability of sufficiently wooded areas in your proximity to you?
  - Not important at all
  - Not important
  - Rather not important
  - Neither important nor unimportant
  - Rather important
  - Important
  - Very important
  - No assessment
- 10. Aside from this study, have you ever donated money for the planting of trees before? [Yes] [No] [Don't remember]
- 11. In case you donated to nature and environment protection in 2023, how much did you donate?
- 12. To what extent do you agree to the following statement:

"I am worried about the state of ecosystems worldwide." [5-point Likert scale]

	Do not agree at all	Rather do not agree	Neither agree nor disagree	Rather agree	Completely agree
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13. In your opinion, how trustworthy are the following institutions?

- University of Hamburg
- State forestry operations

- Federal Government of Germany

Not trustworthy – Very trustworthy [0-10]

## [Pagebreak] Questionnaire

Thank you very much for your answers. Please contact us with any comments you may have. We look forward to your feedback.

Did any part of this survey seem confusing to you, and if yes, which one?

Are there any comments you would like to share with us?

Incentivized Version:

[Pagebreak]

End

Thank you very much for your participation!

## [Private Incentivized Version]

Your variable remuneration will be paid out with a time delay following the study.

To document the donations made, the donation receipt will be published on the website of the professorship at the University of Hamburg after completion of the study: https://uhh.de/wiso-baumpflanzen

## [Public Incentivized Version]

To document the donations made, the donation receipts will be published on the website of the professorship at the University of Hamburg after completion of the study: https://uhh.de/wiso-baumpflanzen

## A.8 Institutional Review Board (IRB) statement

At the time of conducting the experiment to elicit substitutability preferences, no official IRB was available at any of the co-authors institutions at the time (Hamburg, Leipzig). We apply for an exemption and certify that the experiment complies with all the 10 EJ ethics requirements.