





## Article

# Evidence of Similarities in Ecosystem Service Flow across the Rural-Urban Spectrum

Indunee Welivita <sup>1</sup>, Simon Willcock <sup>1,2,\*</sup> , Amy Lewis <sup>1</sup> , Dilshaad Bundhoo <sup>3</sup>, Tim Brewer <sup>4</sup> , Sarah Cooper <sup>4,5</sup>, Kenneth Lynch <sup>3</sup>, Sneha Mekala <sup>6</sup>, Prajna Paramita Mishra <sup>7</sup> , Kongala Venkatesh <sup>7</sup>, Dolores Rey Vicario <sup>4</sup> and Paul Hutchings <sup>4,8</sup>

- <sup>1</sup> School of Natural Sciences, Bangor University, Bangor LL57 2DG, UK; i.welivita@bangor.ac.uk (I.W.); amy.lewis@bangor.ac.uk (A.L.)
- <sup>2</sup> Rothamsted Research, Harpenden AL5 2JQ, UK
- <sup>3</sup> Countryside and Community Research Institute, University of Gloucestershire, Cheltenham GL50 4AZ, UK; dbundhoo@glos.ac.uk (D.B.); klynch@glos.ac.uk (K.L.)
- <sup>4</sup> Cranfield Water Science Institute, Cranfield University, Cranfield MK43 0AL, UK; t.brewer@cranfield.ac.uk (T.B.); S.J.Cooper@leeds.ac.uk (S.C.); d.reyvicario@cranfield.ac.uk (D.R.V.); p.hutchings@leeds.ac.uk (P.H.)
- <sup>5</sup> School of Politics and International Studies, University of Leeds, Leeds LS2 9JT, UK
- <sup>6</sup> Independent Researcher, Hyderabad 500046, India; regionalcoordinator@fansasia.net
- <sup>7</sup> School of Economics, University of Hyderabad, Hyderabad 500046, India; prajnamishra@uohyd.ac.in (P.P.M.); venkyeco@gmail.com (K.V.)
- <sup>8</sup> School of Civil Engineering, University of Leeds, Leeds LS2 9JT, UK
- \* Correspondence: s.willcock@bangor.ac.uk



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**Abstract:** In 2006, the world's population passed the threshold of being equally split between rural and urban areas. Since this point, urbanisation has continued, and the majority of the global population are now urban inhabitants. With this ongoing change, it is likely that the way people receive benefits from nature (ecosystem services; ES) has also evolved. Environmental theory suggests that rural residents depend directly on their local environment (conceptualised as green-loop systems), whereas urban residents have relatively indirect relationships with distant ecosystems (conceptualised as red-loop systems). Here, we evaluate this theory using survey data from >3000 households in and around Hyderabad, India. Controlling for other confounding socioeconomic variables, we investigate how flows of 10 ES vary across rural, peri-urban and urban areas. For most of the ES we investigated, we found no statistical differences in the levels of direct or indirect use of an ecosystem, the distance to the ecosystem, nor the quantities of ES used between rural and urban residents ( $p > 0.05$ ). However, our results do show that urban people themselves often travel shorter distances than rural people to access most ES, likely because improved infrastructure in urban areas allows for the transport of ES from wider ecosystems to the locality of the beneficiaries' place of residence. Thus, while we find some evidence to support red-loop–green-loop theory, we conclude that ES flows across the rural-urban spectrum may show more similarities than might be expected. As such, the impact of future urbanisation on ES flows may be limited, because many flows in both rural and urban areas have already undergone globalisation.

**Keywords:** cultural; provisioning; regulating; green-loop; red-loop; peri-urban; India; nature's contributions to people; urbanisation

## 1. Introduction

Urbanisation is evident across the Global North and South, and, in some areas, dramatic. For example, nearly 60% of the global population now live in urban areas and there are now 34 megacities (cities with over 10 million residents) across the world [1]. Whilst urban areas are predominantly artificial, nature still penetrates these concrete fortresses

and multiple studies have highlighted the importance of ecosystem services (ES) (nature's contributions to people) to both rural and urban wellbeing [2].

ES are intimately linked to human wellbeing [3]. ES provide us with our fundamental basic needs (e.g., fuel, food, and water; provisioning services [4]) and help maintain the environment we need to thrive (e.g., maintaining the quality of air and soil, providing flood control; regulating services [5]). ES also provide us with the ability to develop our mental, physical and spiritual wellbeing; providing space for recreation, spiritual and aesthetic appreciation of nature (cultural services [6]).

ES are increasingly threatened by human activities, such as urbanisation, despite being of global importance to human well-being [7]. Recognising their importance, 137 United Nations member states have signed up to the Intergovernmental Science-Policy Platform for Biodiversity and Ecosystem Services (IPBES; [www.ipbes.net](http://www.ipbes.net) (accessed on 16 April 2021)) and many governments now see the importance of moving towards ES-based management of natural resources [8]. To support this policy shift, more accurate ES data are required [9] for understanding their spatial distribution and heterogeneity [10] and the ability to project and compare the outcomes of different future scenarios [11]. Understanding how nature impacts the wellbeing of both urban and rural people is a knowledge-gap that needs to be filled if ecosystems (and the ES derived from them) are to be managed sustainably [12].

Cumming et al. [13] highlighted theoretical differences between how rural and urban people receive benefits from nature. In rural areas, people are thought to have relatively direct relationships with local ecosystems (e.g., growing food on your subsistence farm)—termed “green-loop” systems. By contrast, within urban areas, people often have more indirect access to distant ecosystems (e.g., obtaining food from hundreds of miles away via a supermarket value chain)—termed “red-loop” systems. However, this rather simplistic viewpoint, whilst useful, may fail to describe all ES (e.g., an urban resident recreating in a nearby park is directly accessing local ES) and leaves many questions unanswered—e.g., as urbanisation occurs, are inhabitants of peri-urban areas which either neither rural nor urban [14] within a green- or red-loop system?

Across the rural–urban spectrum, the flow of ES are complex and dependent on a variety of interacting variables. For example, Hamann et al. [15] show that the use of rice by the people in a particular area is not only dependent on the land quality but an interaction of socioeconomic variables (such as the skills of the people, government subsidies for food cultivation) as well as ecological features of the area (such as soil fertility, and water availability). Therefore, the use of ES depends on the characteristics of the particular social–ecological system. The relative importance of these variables is likely to differ across rural, peri-urban and urban areas. For example, within peri-urban areas, agricultural lands are ultimately developed for housing and other infrastructure [16], leading to higher land fragmentation and a decline in local food production [17].

Here, we investigate ES use and flow across the rural–urban spectrum. We conduct a survey across >3000 households focussing on 10 ES, including provisioning, regulating and cultural services. Using these data, we aim to evaluate whether the ES flow patterns predicted by red-loop–green-loop theory are identifiable in the real-world and whether the “messy” peri-urban areas are best characterised by the red-loop, green-loop, or a unique blend of the red- and green-loop systems (e.g., whereby households are indirectly dependent on their local environment). We hypothesise that ES flow less directly and from more distant ecosystems to people in urban areas than those within rural areas. However, we also hypothesise that beneficiaries in urban areas travel shorter distances themselves to access ES (i.e., due to improved infrastructure), and that they use higher quantities of ES (i.e., due to increased demand and reduced awareness of sustainable use) than rural inhabitants.

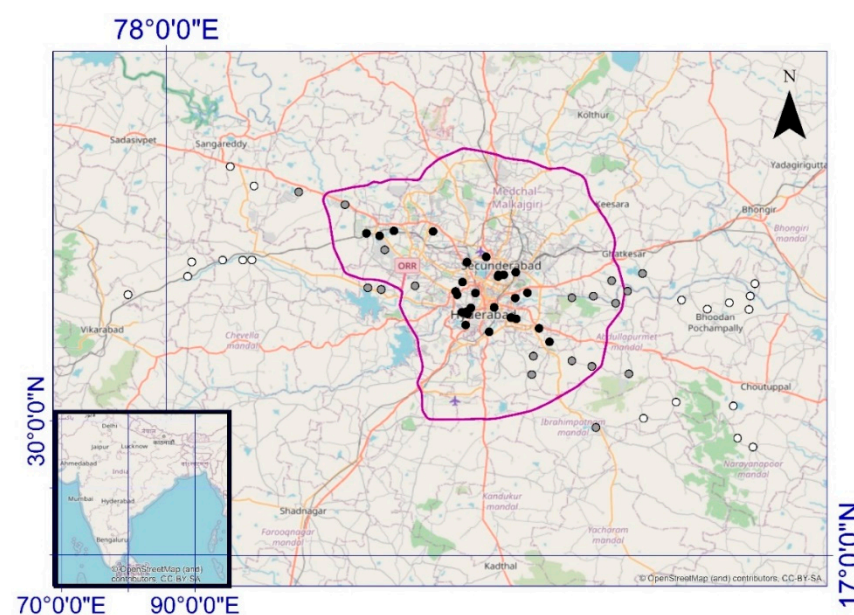
## 2. Materials and Methods

### 2.1. Study Area

Our study focusses on the recently formed state of Telangana, India (112,077 km<sup>2</sup>). Within Telangana, approximately 39% of the 35 million population inhabited urban areas at the last census in 2011, with the remainder (~61%) in rural areas [18]. However, urbanisation is occurring rapidly, with 41% of the population estimated to inhabit urban areas in 2019–2020 [19]. The state is located in a semi-arid zone, it is dry with high temperatures ~42 °C in summer months and ~22 °C in winter months and a mean annual rainfall of 905.3 mm [20]. Hyderabad is the main urban centre and state capital of Telangana and is surrounded by peri-urban areas with informal settlements and rural areas. Peri-urban areas cannot be easily defined but are generally regarded as a transition zone which is neither entirely urban nor purely rural [14]. According to the last 2011 census, Hyderabad was populated with approximately seven million inhabitants [18] with an estimated population of 10 million by 2020. As such, Hyderabad can serve as a case study to represent other rapidly expanding cities across the Global South.

### 2.2. Sampling

In 2019, two transects were studied across Hyderabad city to capture a wide range of the available rural-urban spectrum (Figure 1). Along each transect, we categorised sites as urban (all sites > 5 km from and inside the Nehru ring road), peri-urban (any sites situated within 5 km of the ring road), and rural (sites > 5 km outside the ring road and within the Hyderabad Metropolitan Development Authority). In total, we used 64 sampling locations, including 19 rural, 18 peri-urban and 27 urban (Figure 1), covering urban to “close to city” rural, but including a substantial range in population density (Appendix A). In order to conduct the household survey, we selected 3010 households across these sites using the random sampling method, stratified across rural, peri-urban and urban areas and equally divided between male and female respondents. Beyond this, no other selection criteria were applied, with participants recruited by approaching these randomly selected households and accepting all participants that were willing to contribute to this investigation. We had both male and female interviewers available so participants could speak with whichever gender they felt most comfortable.



**Figure 1.** Rural (white), peri-urban (grey) and urban (black) study locations in Telangana State, India. The Nehru ring road is shown in purple. Inset is a wider map showing Hyderabad within India.

### 2.3. Questionnaire Design

We focussed on 10 ES: drinking water, food production (rice), fuel (fuelwood and charcoal), fish, sediment regulation, hazard mitigation (flooding), sanitation [21], recreation in natural spaces, nature's aesthetic and enjoying nature for spiritual reasons. We designed the questionnaire in English and our survey team translated it into Telegu, Urdu and Hindi (the main languages spoken in study area) in real-time as they conducted the survey. We piloted the questionnaire and translation using a sample of 30 participants comprising 50% males and 50% females from rural, peri-urban and urban areas outside of the selected sampling locations. Based on the findings of the pilot, we edited the questionnaire and translations used as required. The survey was delivered using Android-based smartphones and tablets using Open Data Kit (ODK; <https://opendatakit.org/> (accessed on 20 February 2021)) to collect the survey data. We trained the enumerators with the questionnaire and the use of ODK. This training also included a trial of the survey in at least three different sites (rural, urban and peri-urban) and a feedback session with the enumerators after the trial was used to further refine the questionnaire via a small number of relatively minor edits. The University of Gloucestershire Research Ethics Committee provide ethics approval for the questionnaire survey on the 12 February 2019 (Approval code: REC.19.16.1).

Prior to the questionnaire survey, consent was obtained verbally from the respondent in each household. No sensitive data were collected, and respondents were informed that they could stop the survey at any time. All respondents were aged 18 years and above. The survey was conducted during the months of February–May 2019.

For each respondent, we collected socioeconomic data, including the respondent's monthly income, social class, residency status, and household size. For provisioning ES (rice, fish, fuelwood/charcoal), we collected data on usage quantity, purchased quantity, received (given free of charge) quantity, price, how they obtained it, seasonal variations (excess and scarcity), where they get it (recording location on a digital map) and the ecosystem it likely originated in (again recording location). For sediment regulation and hazard, we included the cost of impact and cost of protective measures (if any), marking the location on the digital map. For sanitation, we recorded the types and location of the sanitation facility, frequency of use and marking the location of the facility on the digital map. Finally, for the cultural services (i.e., recreation, aesthetic and spirituality), we recorded the number of hours spent and money spent per week accessing these services, recording their locations on the digital map. Our full ODK survey is available here: [https://github.com/InduneeWelivita/Household-survey-questionnaire-RUST-project/blob/main/household\\_survey\\_ODK.xlsx](https://github.com/InduneeWelivita/Household-survey-questionnaire-RUST-project/blob/main/household_survey_ODK.xlsx) (accessed on 16 April 2021). The data are available via <https://reshare.ukdataservice.ac.uk/854680/> (accessed on 16 April 2021).

As with all studies, there might be some uncertainties associated with the survey data. For example, we asked the respondents to mark the ES location on a map (i.e., where they perceived the ES to have originated, where they obtained the natural goods themselves). Thus, there is potential for such an approach to result in systematic bias. For instance, if urban inhabitants are more disconnected from nature than rural residents (e.g., as might be predicted from red loop–green loop theory) then urban people may be less likely to accurately locate the source of each ES. However, this bias is unlikely to impact the results as no question in the survey was compulsory. Therefore, if any respondent was uncertain about a question, they could (and were encouraged to) simply skip that question, rather than give an erroneous answer. As such, whilst the data collected undoubtedly contain some uncertainty (e.g., in locations or the quantities of ES used), it is unlikely to contain any systematic biases that would negate the results of our analyses.

### 2.4. Analysis

The data were cleaned prior to analysis to correct the typographical errors and remove any no-data values (e.g., 9999), outliers and/or other values that were not possible (see Appendix B for our full details of the data cleaning rules applied). Each ES was analysed via general linear models (GLMs) using SPSS (IBM SPSS Statistics 23). The variables

used for each ES were the quantity of ES used (Equation (1)), location of where the ES was obtained (from which we calculated the distance from the ES to their household; referred to as “beneficiary travel distance”; Equation (2)), and location of where the ES originated in nature (again calculating distance to the household; termed “total ES distance”; Equation (3)). Each GLM compared one of the ES variables to the locality of the household (urban, peri-urban and rural) and how the ES was obtained (i.e., from the source themselves, from a seller, from a relative, from a friend; Equations (1)–(3)). We statistically controlled the cost per unit (if applicable), the respondent’s monthly income (as a proxy for household income), social class, residency status (owner/tenant/other), and household size as explanatory variables (Equations (1)–(3); see Appendix C for a full description of each variable). We also developed GLMs for the percentage of households at each site (Figure 1) having direct access to provisioning ES (i.e., they reported obtaining drinking water, rice, fuelwood, fish and/or sanitation themselves, as opposed to via a seller, friend or relative; Equation (4)). The statistical models only investigated the main effects as no interactions were included.

$$\begin{aligned} \text{Quantity of ES used} = & \text{Locality of the household} + \text{How the ES was obtained} \\ & + \text{Cost per unit (if applicable)} + \text{Monthly income} + \text{Social class} + \text{Residency} \\ & \text{status} + \text{Household size} \end{aligned} \quad (1)$$

$$\begin{aligned} \text{Beneficiary travel distance} = & \text{Locality of the household} + \text{How the ES was} \\ & \text{obtained} + \text{Cost per unit (if applicable)} + \text{Monthly income} + \text{Social class} + \\ & \text{Residency status} + \text{Household size} \end{aligned} \quad (2)$$

$$\begin{aligned} \text{Total ES distance} = & \text{Locality of the household} + \text{How the ES was obtained} + \\ & \text{Cost per unit (if applicable)} + \text{Monthly income} + \text{Social class} + \text{Residency} \\ & \text{status} + \text{Household size} \end{aligned} \quad (3)$$

$$\text{Percentage of households having direct access ES} = \text{Locality of the household} \quad (4)$$

### 3. Results

We surveyed 3010 households, yet the response rate for different ES and their variables were different as respondents were encouraged to skip questions they did not want to answer and/or they were not sure of the answer individuals could skip any question they wished, and not everyone used all ES (Table 1; Appendix D). We found that the drinking water, sanitation, recreation, aesthetic and spirituality questions were answered by a higher number of households with a lower number of responses for rice and fish, and the lowest sample size for fuelwood/charcoal, sediment regulation and hazards. The number of responses might provide an indication of the ES most familiar to the respondents (Table 1). Here, we display overall summary statistics (Table 1), before reporting the GLM results for each ES from Equations (1)–(4), respectively (see Appendix E for extended results with full coefficient tables).

**Table 1.** Descriptive statistics of the ecosystem service variables.

Ecosystem Service	Variable	Sample Size (n)	Rural Mean (Standard Deviation)	Peri-Urban Mean (Standard Deviation)	Urban Mean (Standard Deviation)
Drinking water	Daily Water consumption (L)	2888	67.48 ( $\pm 99.07$ )	80.70 ( $\pm 148.33$ )	228.37 ( $\pm 169.85$ )
	Cost of water per month (Indian Rupees (INR))	2677	117.22 ( $\pm 99.18$ )	181.11 ( $\pm 168.78$ )	173.06 ( $\pm 142.87$ )
	Willingness to pay for water service (INR)	1928	5.79 ( $\pm 17.05$ )	36.24 ( $\pm 476.34$ )	70.86 ( $\pm 779.30$ )
	Household level water purification expenses (INR)	520	23.33 ( $\pm 67.89$ )	58.94 ( $\pm 120.51$ )	161.67 ( $\pm 1188.60$ )
	Frequency of eutrophication in water bodies	1931	5.63 ( $\pm 0.74$ )	5.39 ( $\pm 0.95$ )	5.43 ( $\pm 0.99$ )
	Beneficiary travel distance for water (km)	2864	0.26 ( $\pm 1.90$ )	0.35 ( $\pm 3.77$ )	0.08 ( $\pm 0.75$ )
Rice	Quantity purchased per week (kg)	1714	12.05 ( $\pm 21.05$ )	13.54 ( $\pm 26.37$ )	13.74 ( $\pm 12.92$ )
	Quantity received free of charge per week (kg)	1712	33.97 ( $\pm 110.48$ )	10.99 ( $\pm 42.52$ )	11.11 ( $\pm 18.02$ )
	Purchased cost per kg (INR)	1594	29.50 ( $\pm 17.06$ )	32.11 ( $\pm 17.48$ )	35.96 ( $\pm 15.38$ )
	Beneficiary travel distance of rice (km)	1696	0.73 ( $\pm 2.73$ )	0.46 ( $\pm 2.87$ )	0.23 ( $\pm 1.16$ )
	Distance from household for origin of rice (km)	1682	0.87 ( $\pm 2.99$ )	1.07 ( $\pm 10.92$ )	0.28 ( $\pm 1.21$ )
Fuel	Fuelwood-Quantity consumed per week (kg)	48	11.42 ( $\pm 8.89$ )	8.57 ( $\pm 7.11$ )	12.00 ( $\pm 11.13$ )
	Fuelwood-Quantity purchased per week (kg)	48	8.30 ( $\pm 27.63$ )	4.25 ( $\pm 11.36$ )	3.06 ( $\pm 10.33$ )
	Fuelwood-Purchased cost per kg (INR)	48	0.76 ( $\pm 2.77$ )	1.50 ( $\pm 4.61$ )	0.46 ( $\pm 1.80$ )
	Fuelwood-Quantity received free of charge per week (kg)	48	11.15 ( $\pm 10.05$ )	7.20 ( $\pm 5.40$ )	5.20 ( $\pm 10.55$ )
	Beneficiary travel distance for fuelwood (km)	49	0.82 ( $\pm 1.62$ )	0.35 ( $\pm 0.48$ )	0.09 ( $\pm 0.11$ )
	Distance from household for origin of fuelwood (km)	48	0.88 ( $\pm 1.73$ )	0.27 ( $\pm 0.48$ )	0.11 ( $\pm 0.11$ )
	Charcoal-Quantity consumed per week (kg)	2	n/a	6.50 ( $\pm 4.94$ )	n/a
	Charcoal-Quantity purchased per week (kg)	2	n/a	1.00 ( $\pm 1.41$ )	n/a
	Charcoal-Purchased cost per kg (INR)	2	n/a	0	n/a
	Charcoal-Quantity received free of charge per week (kg)	2	n/a	6.50 ( $\pm 4.94$ )	n/a
	Beneficiary travel distance for charcoal (km)	2	n/a	1.47 ( $\pm 2.08$ )	n/a
Distance from household for origin of charcoal (km)	2	n/a	1.09 ( $\pm 1.54$ )	n/a	

Table 1. Cont.

Ecosystem Service	Variable	Sample Size (n)	Rural Mean (Standard Deviation)	Peri-Urban Mean (Standard Deviation)	Urban Mean (Standard Deviation)
Fish	Fish-Quantity consumed per week (kg)	335	0.97 ( $\pm 0.58$ )	1.29 ( $\pm 0.75$ )	1.11 ( $\pm 0.67$ )
	Fish-Quantity purchased per week (kg)	557	0.77 ( $\pm 0.66$ )	0.79 ( $\pm 0.75$ )	0.89 ( $\pm 0.68$ )
	Fish-Purchased cost per kg (INR)	456	108.81 ( $\pm 73.96$ )	108.96 ( $\pm 95.32$ )	143.07 ( $\pm 96.10$ )
	Fish-Quantity received free of charge per week (kg)	566	0.75 ( $\pm 0.70$ )	0.77 ( $\pm 0.83$ )	0.78 ( $\pm 0.70$ )
	Beneficiary travel distance for fish (km)	329	1.03 ( $\pm 3.83$ )	0.76 ( $\pm 1.14$ )	0.53 ( $\pm 1.12$ )
	Distance from household for origin of fish (km)	528	1.41 ( $\pm 4.68$ )	0.55 ( $\pm 1.04$ )	14.07 ( $\pm 80.03$ )
Sanitation	Frequency of toilet use per day	3005	3.61 ( $\pm 1.89$ )	3.82 ( $\pm 2.08$ )	3.48 ( $\pm 2.12$ )
	Beneficiary travel distance for toilet (km)	2988	0.18 ( $\pm 1.840$ )	0.17 ( $\pm 1.078$ )	0.07 ( $\pm 0.730$ )
Hazard mitigation	Cost of flood loss last year (INR)	9	0	0	714.28 ( $\pm 1889.82$ )
	Cost of land protection spent last year for flood (INR)	2897	0.02 ( $\pm 0.38$ )	0.02 ( $\pm 0.40$ )	0.01 ( $\pm 0.34$ )
	Distance from household to impact of flood (km)	11	0	0	0.03 ( $\pm 0.08$ )
Sediment regulation	Distance from household for impact of sedimentation (km)	131	0.25 ( $\pm 0.35$ )	0.70 ( $\pm 1.04$ )	0.19 ( $\pm 0.18$ )
	Distance from household for impact of erosion (km)	34	0.07 ( $\pm 0.002$ )	0.50 ( $\pm 0.81$ )	0.22 ( $\pm 0.24$ )
Aesthetic	Hours for aesthetic per week	2910	0.61 ( $\pm 2.42$ )	0.80 ( $\pm 3.04$ )	0.57 ( $\pm 1.77$ )
	Money spent for aesthetics per week	2892	19.97 ( $\pm 106.62$ )	19.24 ( $\pm 59.09$ )	18.00 ( $\pm 59.77$ )
	Beneficiary travel distance for aesthetic place (km)	1593	0.54 ( $\pm 2.65$ )	0.48 ( $\pm 1.13$ )	0.23 ( $\pm 0.54$ )
Recreation	Hours for recreation per week	2909	0.23 ( $\pm 0.87$ )	0.39 ( $\pm 1.03$ )	0.32 ( $\pm 0.60$ )
	Money spent for recreation per week	2910	8.07 ( $\pm 36.49$ )	14.73 ( $\pm 47.34$ )	10.95 ( $\pm 53.46$ )
	Beneficiary travel distance for recreation (km)	1543	0.45 ( $\pm 2.67$ )	0.88 ( $\pm 7.77$ )	0.18 ( $\pm 0.61$ )
Spirituality	Hours for spirituality per week	2991	0.98 ( $\pm 4.34$ )	0.77 ( $\pm 2.04$ )	0.81 ( $\pm 1.98$ )
	Money spent for spirituality per week	2991	14.75 ( $\pm 53.62$ )	19.95 ( $\pm 76.50$ )	21.85 ( $\pm 62.65$ )
	Beneficiary travel distance for spiritual place (km)	2054	0.55 ( $\pm 2.30$ )	0.63 ( $\pm 2.39$ )	0.47 ( $\pm 4.77$ )

### 3.1. Quantity of Ecosystem Service Used

We were not able to develop models (Equation (1)) for flood (hazard), sedimentation and erosion (sediment regulation), and charcoal as their usage was reported by too small a number of households. We were also unable to develop a statistically significant model for the time spent on spiritual activities (Adj R-sq =  $-0.001$ ). All of the considered variables were statistically insignificant in this model. However, for the remaining ES we investigated, we were able to run GLMs, the findings of which are summarised below:

### 3.1.1. Drinking Water

Daily drinking water consumption (adjusted R-squared [Adj R-sq] = 0.557;  $n = 761$ ) varied by the locality of the household ( $p < 0.001$ ). Specifically, water consumption was highest in urban areas, with rural areas being 39.03 L lower ( $p < 0.001$ ) and peri urban areas being 83.41 L lower ( $p < 0.001$ ). Water consumption also varied by the residency status of the household ( $p < 0.05$ ; being highest among tenants and “other” residency status, with owners being 58.47 L lower) and when respondents obtain it from relatives, friends or sellers (being with 41.29 L being lower when obtained by the respondent themselves;  $p < 0.05$ ). Water consumption increased by 11.31 L for every person in the household ( $p < 0.001$ ) and decreased by 142.81 L for every additional water source ( $p < 0.001$ ) they have access to. Water quantity also decreased by 6.30 L for every INR 10 of the monthly cost of water ( $p < 0.05$ ). Daily drinking water consumption varied by the type of water source ( $p < 0.001$ ), being 47–81 L higher for households that water piped into the dwelling, via a tube well or via a piped neighbour than households having tanker-truck, bottled water, protected well, unprotected well, and water kiosk sources, with households accessing public taps or with water piped into their compound using 43–45 L less water again. The sample size of this model can be increased by dropping the “How the ES was obtained” variable from the model; however, the results are consistent (adjusted R-squared [Adj R-sq] = 0.620;  $n = 2669$ ; Appendix E).

### 3.1.2. Sanitation

The frequency of daily toilet use (Adj R-sq = 0.173;  $n = 3000$ ) increased by 20 uses for every additional three people in the household ( $p < 0.001$ ). For every INR 88,731 increase in monthly income, the frequency of toilet use per day increased up by 1 ( $p < 0.05$ ). The frequency of daily use also varied by the type of toilet used ( $p < 0.001$ ). Frequency of use was 1.36 lower for households on site sanitation options than for households with toilet flush to a piped sewer system ( $p < 0.05$ ) and 2.15 lower than households with toilet flush to open drains ( $p < 0.05$ ). The frequency of daily toilet use also showed significant interaction between the locality of the household (urban, peri urban and rural) and toilet type ( $p < 0.001$ ; see Appendix E for details). Frequency of daily toilet use also varied by the social class ( $p < 0.001$ ), being lowest in our other category (Muslim), but 1.32 higher in the general class ( $p < 0.001$ ), 0.92 higher among other backward classes ( $p < 0.001$ ), 0.77 higher among scheduled tribes ( $p < 0.001$ ), and 0.74 higher among scheduled castes ( $p < 0.001$ ). The frequency of daily toilet use varied by the place of use ( $p < 0.05$ ), being lower in those using a neighbour’s toilet, temporary pit toilet and church toilets but 2.86 higher among public toilet users ( $p < 0.05$ ), 1.72 higher among household toilet users ( $p < 0.05$ ), 1.54 higher among community toilet users ( $p < 0.05$ ), and 1.29 higher among people who use open defecation ( $p < 0.05$ ).

### 3.1.3. Rice

The rice quantity purchased per week (Adj R-sq = 0.089;  $n = 1592$ ) increased by 2.06 kg for every extra person in the household ( $p < 0.001$ ) and by 1.18 kg for every INR 10 of the cost of rice per kg ( $p < 0.001$ ). The weekly rice quantity purchased was higher when respondents bought from relatives, friends or sellers than those obtaining rice themselves, with the latter group buying 4.07 kg ( $p < 0.001$ ). We also modelled the rice quantity given free of charge per week (Adj R-sq = 0.042;  $n = 1591$ ). The amount of rice given (free of charge) to the respondent per week increased by 1.82 kg for every INR 10 of the cost of rice per kg ( $p < 0.05$ ). We found that the given rice quantity varies by the locality of the household ( $p < 0.001$ ). Specifically, the rice quantity given is lowest in urban and peri urban areas, with rural areas being 17.73 kg higher per household per week ( $p < 0.001$ ).

### 3.1.4. Fuelwood

The fuelwood quantity used per week (Adj R-sq = 0.222;  $n = 46$ ) decreased by 5.28 kg for every INR 1 of the cost of fuelwood (per kg) ( $p < 0.05$ ). The fuelwood quantity use



per week varied by how it was obtained ( $p < 0.05$ ). This quantity was highest when respondents buy from sellers, being 66.10 kg lower when obtained by the respondents themselves ( $p < 0.05$ ) and 80.16 kg lower when obtained from relatives ( $p < 0.05$ ). The fuelwood quantity purchased per week (Adj R-sq = 0.677;  $n = 47$ ) decreased by 6.70 kg for every INR 1 increase in cost of fuelwood per kg ( $p < 0.001$ ). Fuelwood quantity purchased per week was highest when respondents buy from sellers, being 121.08 kg lower from relatives ( $p < 0.001$ ) and 121.91 kg lower when obtained by the respondent themselves ( $p < 0.001$ ). The fuelwood quantity received (free of charge) per week (Adj R-sq = 0.232;  $n = 47$ ) decreased by 4.59 kg for every INR 1 increase in the cost of fuelwood ( $p < 0.05$ ). According to the model, fuelwood quantity received was lowest in urban areas, being 9.30 kg higher in peri urban areas ( $p < 0.05$ ) and 11.94 kg higher in rural areas ( $p < 0.05$ ). The fuelwood quantity received per week was highest when respondents obtained the fuelwood from sellers, being 57.42 kg lower when obtained by respondents themselves ( $p < 0.05$ ) and 68.25 kg lower from relatives ( $p < 0.05$ ).

### 3.1.5. Fish

The fish quantity consumed per week (Adj R-sq = 0.275;  $n = 210$ ) increased by 0.08 kg for every INR 10,000 increase in monthly income ( $p < 0.05$ ), by 0.01 kg for every INR 10 increase in the cost of fish and by 0.18 kg for every extra person in the household ( $p < 0.001$ ). The quantity of fish they purchased per week (Adj R-sq = 0.572;  $n = 443$ ) increased by 83 g for every extra person in the household ( $p < 0.001$ ) and by 0.5 kg for every INR 100 increase in the price of fish per kg ( $p < 0.001$ ). Weekly purchased fish quantity was highest when respondents purchased from sellers, being 0.33 kg lower when purchased from relatives ( $p < 0.05$ ). The quantity of the fish they received (free of charge) per week (Adj R-sq = 0.358;  $n = 451$ ) increased by 0.119 kg for every extra person in the household ( $p < 0.001$ ) and by 0.4 kg for every INR 100 of the cost of fish (per kg) ( $p < 0.001$ ). We also found that the fish quantity received per week was highest among 'other' residency status, being 0.47 kg lower among owners ( $p < 0.05$ ) and 0.48 kg lower among tenants ( $p < 0.05$ ) of the house.

### 3.1.6. Recreation in Nature

The time spent on recreational activities per week (Adj R-sq = 0.008;  $n = 2907$ ) increased by 16.8 min for every INR 100,000 increase ( $p < 0.05$ ) in monthly income. Weekly time spent on recreation varied by the locality of the household ( $p < 0.001$ ), being highest in urban areas and peri urban areas, and 6.48 min lower in rural areas ( $p < 0.001$ ). We found that the time spent on recreation in nature varied by residency status so that it is lowest among 'other' residency types, 14.8 min higher among tenants and 14.04 min higher among owners ( $p < 0.05$ ). The money spent on recreation per week (Adj R-sq = 0.006;  $n = 2908$ ) increased by INR 3.16 for every INR 10,000 increase in monthly income ( $p < 0.05$ ) and decreased by INR 1.691 for every extra person in the household ( $p < 0.05$ ). According to the model, weekly spending for recreation was lowest among rural and urban areas, being INR 3.641 higher among peri-urban residents ( $p < 0.1$ ).

### 3.1.7. Enjoying Nature's Aesthetics

The time spent enjoying nature's aesthetics per week (Adj R-sq = 0.006;  $n = 2908$ ) decreased by 43 min for every INR 100,000 increase in monthly income ( $p < 0.05$ ) and by 42 min for every extra person in the household ( $p < 0.05$ ) and varied by social class ( $p < 0.05$ ). The money spent on aesthetics per week (Adj R-sq = 0.001;  $n = 2891$ ) decreased by 3 INR for every INR 10,000 increase in monthly income ( $p < 0.05$ ).

### 3.1.8. Visiting Nature for Spiritual Reasons

The amount of money spent on visiting nature for spiritual reasons per week (Adj R-sq = 0.004;  $n = 2988$ ) increased by INR 2.86 for every INR 10,000 increase ( $p < 0.05$ ) in monthly income. The money spent on spirituality per week decreased by 2.45 INR for

every extra person in the household ( $p < 0.05$ ). Money spent on spirituality is highest in urban areas and peri-urban areas, being INR 7.91 lower in rural areas ( $p < 0.05$ ).

### 3.2. Total Ecosystem Service Distance

No variables were significant for models (Equation (2)) of distance between the household to the ecosystem where the fish, charcoal, and fuelwood originated (total ES distance), where they get fuelwood from, defecation location, location of flood impact, where they visit to appreciate aesthetic beauty, where they visit to enjoy recreation and place of spirituality ( $p > 0.05$ ). We were unable to model the total ES distance of rice or recreational place because negative R-squared values indicated poor model performance (i.e., the response is very low or negligible [22]).

### 3.3. Beneficiary Travel Distance

No variables were significant for models (Equation (3)) of distance between a household to the place where they obtained charcoal and fuelwood ( $p > 0.05$ ). We were unable to model the distance between a household to the place where they obtained water because negative R-squared [22]. However, for the remaining ES we investigated, the findings of which are summarised below.

#### 3.3.1. Rice

The distance between a respondent's household and where they obtained rice (Adj R-sq = 0.044;  $n = 1571$ ) increased by 1 m for every INR 100 of the monthly income ( $p < 0.05$ ). The distance was lower in peri urban and urban areas, with rural areas being 0.39 km further ( $p < 0.001$ ). We also found that the distance to where they obtained rice was lower when they obtained it from the source themselves, via a friend or via a seller, while it was 2 km further when they obtained it via a relative ( $p < 0.001$ ).

#### 3.3.2. Fish

The model developed for the distance between a respondent's household location and where they obtained fish (Adj R-sq = 0.041;  $n = 210$ ) was weak yet showed significant patterns. The distance varied by social class ( $p < 0.05$ ). Specifically, the distance was lowest among Scheduled Tribes, "Other Backward Class", Scheduled castes and "other social classes", being 3.16 km further for general class people ( $p < 0.05$ ).

#### 3.3.3. Aesthetics

The model developed for the distance between a respondent's household and place of aesthetic beauty (Adj R-sq = 0.004;  $n = 1592$ ) was weak yet showed significant patterns. The distance varied by the locality of the household ( $p < 0.05$ ). Specifically, the distance was lower among urban households, being 0.25 km further among peri-urban households ( $p < 0.05$ ) and 0.31 km further among rural households ( $p < 0.05$ ).

### 3.4. Direct Access to Ecosystem Services

We developed GLMs (Equation (4)) for the percentage of households having direct access to provisioning ES (i.e., they reported obtaining drinking water, rice, fuelwood, fish and/or sanitation themselves, as opposed to via a seller, friend or relative; Table 2). The percentage of households with direct access to drinking water varied by the locality of the household (Adj R-sq = 0.179;  $n = 53$ ), with the percentage higher in urban and rural areas, with peri urban areas being 17.87% lower ( $p < 0.001$ ). The model developed for the percentage of households having direct access to sanitation ES (Adj R-sq = 0.769;  $n = 64$ ) showed that the percentage was lower in urban areas, with peri urban areas being 55.39% higher ( $p < 0.001$ ) and rural areas being 75.85% higher ( $p < 0.001$ ). We were unable to develop models with statistically significant variables for rice, fuelwood and fish. Additionally, no model was developed for charcoal as their usage was reported by too small a number of households.

**Table 2.** Percentage of respondents obtaining provisioning ecosystem services directly (i.e., themselves) or indirectly (e.g., via a friend, relative or seller) as per the locality of the household.

Ecosystem Service	Sample Size (n)	Rural	Peri Urban	Urban
Drinking water	1386	Direct = 91.2 Indirect = 8.8	Direct = 81.6 Indirect = 18.4	Direct = 97.1 Indirect = 2.9
Rice	1716	Direct = 22.3 Indirect = 77.7	Direct = 21.9 Indirect = 78.1	Direct = 11.8 Indirect = 88.2
Fuelwood	49	Direct = 92.9 Indirect = 7.1	Direct = 85.0 Indirect = 15.0	Direct = 93.3 Indirect = 6.7
Charcoal	2	Direct = 100.0 Indirect = 0	Direct = 100.0 Indirect = 0	n/a
Fish	1293	Direct = 60.1 Indirect = 39.9	Direct = 52.2 Indirect = 47.8	Direct = 54.8 Indirect = 45.2
Sanitation		Direct = 95.8 Indirect = 4.2	Direct = 78.8 Indirect = 21.2	Direct = 20.7 Indirect = 79.3

#### 4. Discussion

Red-loop, green-loop theory predicts that rural people directly use local ES, whereas urban people tend to indirectly use services from more distant ecosystems (e.g., via a value chain) [13]. This is because many ES are locally produced in rural areas but not in urban areas and thus these services must be imported from other ecosystems by urban people [23]. Here, we achieved our aim of evaluating red-loop–green-loop theory against evidence, generally finding more similarities than differences in ES flow across the rural-urban spectrum, and so rejecting our hypotheses in most instances.

For 20% of the ES investigated, we find the direct–indirect use pattern you would expect under red-loop–green-loop theory—i.e., that rural inhabitants use ecosystem services more directly than urban residents (Table 3). However, for many ES (rice, fuelwood and fish), we find no difference in levels of direct access across rural, peri-urban and urban areas. This lack of difference between rural and urban areas might arise due to similar levels of market access in rural and urban areas (i.e., allowing indirect use of ecosystem services across the rural-urban spectrum via value chains) [15], or perhaps because our “close to city” rural is not remote enough for differences to be detected. The latter is unlikely as we were able to detect some differences for some ES. However, when we detected differences in levels of direct/indirect access, they did not necessarily reflect the patterns predicted by red-loop–green-loop theory. For example, we found that direct access to drinking water is higher in rural and urban areas, whilst indirect access highest in peri-urban areas. For rural areas, this result was expected. However, the majority of urban respondents are not getting water directly from nature and instead receive it via a socio-technical configuration of institutions and engineering infrastructure—although, interestingly, this “seller” is not perceived by our respondents. Hamann et al. [15] also found that peri-urban areas are a mixture of high and low ES direct use areas, and often not an area of intermediate level of direct use between rural and urban areas as might be predicted. The intermittent ES access in peri-urban areas is perhaps a result of poor service delivery from both city authorities and nature [24]. By contrast, we do find evidence of the expected red loop-green loop pattern for sanitation ES. Many rural areas have decentralized waste treatment (mainly having pit latrines in their households), while urban areas often rely on centralized waste treatment plants often located outside the urban areas themselves [25].

**Table 3.** Summary of differences in ecosystem services (ES) flows across the rural-urban spectrum around Hyderabad. Localities where respondents reported the highest (↑), in between (↔), and lowest (↓) values are shown. Blank cells indicate no significant difference across rural, peri-urban and urban areas. ES models that could not be run (e.g., due to low sample size) are not shown.

ES Flow Characteristic	Ecosystem Service	Urban	Peri-Urban	Rural	
Quantity of ecosystem service used	Daily drinking water consumption	↑	↓	↔	
	Frequency of daily toilet use				
	Rice quantity purchased per week				
	Rice received free of charge per week	↔	↓	↑	
	Fuelwood quantity per week				
	Fuelwood received free of charge per week	↓	↔	↑	
	Fish quantity consumed per week				
	Time spent on recreational activities in nature per week	↑	↑	↓	
	Money spent on recreational activities in nature per week				
	Time spent enjoying nature's aesthetics per week				
	Money spent enjoying nature's aesthetics per week				
	The amount of money spent on visiting nature for spiritual reasons per week	↑	↔	↓	
	Total ES distance (distance between the household to ... )	Where the fish originated			
		Where the charcoal originated			
Where the fuelwood originated					
Where they obtained the fuelwood					
Defecation location					
Location of flood impact					
Where they visit to appreciate nature's aesthetic beauty					
Where they visit to enjoy recreation in nature					
Place of natural spirituality					
Beneficiary travel distance (the distance the respondent travels to obtain ... )	Drinking water				
	Rice	↓	↔	↑	
	Fish				
	Aesthetics	↓	↔	↑	
	Charcoal				
	Fuelwood				
Direct access to ecosystem services (respondents reported obtaining these themselves, as opposed to via a seller, friend or relative)	Drinking water	↑	↓	↔	
	Sanitation	↓	↔	↑	
	Rice				
	Fuelwood				
	Fish				

While red-loop–green-loop theory predicts that rural residents use more local ecosystems than urban residents [13], we find no evidence of this. Our data show no significant difference in distance between the ecosystem where the ES was perceived to have been generated and where the ES was used across rural, peri-urban or urban areas (although this may differ for other ES, or if transects were extended deeper into rural areas). This is likely because, in an ever more developed and globalised world, both rural and urban

residents get many of the ES they need from distant ES via value [15,26]. In five West African cities, rice is typically delivered from relatively remote areas through value chains with varying distance from 762–1602 km [27]. By contrast, the distance between the origin and consumption of rice is often smaller in rural areas where subsistence farming may be practiced; e.g., with such distances ~2 km in Sierra Leone [28] and <30 km in the Mekong Delta [28]. However, due to the public distribution system operated in India (including in our study area), people in all areas are able to access rice produced across the country [29]. Likewise, low-income households in both rural and urban areas in India rely on fuelwood from local ecosystems—i.e., from using homesteads, nearby woodlands or street trimmings from urban green spaces, respectively [30,31]. By contrast, 58.2% of rural people and 80.7% of urban people in India have water facilities in their households [32]. As such, urban residents have a higher capacity to access distant water sources (via a piped water system) when compared to more rural people, who may need to retrieve water from relatively nearby on foot [33].

Whilst there is no difference in the distance between where the ES was perceived to have been generated and where the ES was used, our results show that urban people themselves travel shorter distance than rural people to access many ES (rice, and aesthetics; Tables 2 and 3). This is likely because the urban areas have good infrastructure enabling the transport of ES to beneficiaries' doorsteps (or relatively nearby), as well as more nearby services and shops. Previous studies show similar findings, for example, urban residents are also closer to food stores than those in rural areas [34,35]. This pattern persists even when the ES is generated more locally (i.e., within the city itself) [36]. For example, city authorities provide green spaces and parks for recreation and aesthetic beauty and religious places for spiritual services to urban people in order to increase their quality of life [37], and urban people tend to travel less to use these services than rural people [38,39]. Our results echo this, showing that urban peoples travel lower mean distances (Aesthetic ES: 187 m; Recreation ES: 141 m; and Spirituality ES: 205 m) to access these cultural services compared to rural and peri urban areas (Rural: 535 m, 465 m and 509 m, and Peri-Urban: 46 m, 974 m and 617 m, respectively).

Furthermore, we generally observe no differences in the quantity of ES used across the rural–urban spectrum (Table 3), consistent with some previous findings. For example, no differences between the amount of provisioning or regulating services used were observed between rural and urban areas in/surrounding the European cities of Berlin, Helsinki, Salzburg and Stockholm [36]. However, other studies show that provisioning services are used less in urban areas than in rural areas [40–43]. Reduced use of provisioning services in urban areas might be because higher population densities in urban areas result in high resource consumption, so often degraded ecosystems have to support higher numbers of people per unit area (and thus with less ES per person) [44,45]. Similarly, lower levels of land tenure in urban areas might result in reduced access to some ES [46,47]. For example, public green spaces in urban areas are often highly regulated and activities such as grazing, or firewood collection may be prohibited. Similarly, urbanisation often results in changed lifestyles towards those that rely more on non-ecosystem goods due to convenience and technological development (i.e., petroleum fuel/electricity for fuelwood, plastics/metal for timber etc) [37,43]. This high demand for non-natural products may lead to a lower usage of ES in urban areas. By contrast, we show that investment in cultural services in rural areas is lower than in urban areas. It is likely this pattern occurs as rural inhabitants prioritise obtaining the provisioning services required to fulfil their basic needs, with regulating and cultural services prioritised in more built-up areas where baseline living standards can be higher and many basic needs are already met [40,43,48–50]. Thus, use of provisioning services may be higher in rural areas, but the use of cultural services is higher in urban areas, and, where these differences in quantities of ES use exist, peri-urban areas sometimes show an intermediate step between rural and urban systems.

Within Hyderabad and the surrounding area, our results are robust, and we believe that Hyderabad can serve as a case study to represent other rapidly expanding cities

across the Global South (see Section 2.1). However, it is important that these findings are validated in numerous cities across the globe before making conclusions about the global applicability of red-loop–green-loop theory. For example, it is currently not known if our findings would be replicated if this study was repeated in the Global North, and this could be an avenue for future research. Further limitations relate to the survey method used. Surveys reveal perceptions of ES flows, but beneficiaries may not be aware of the full value chain [51] nor, indeed, be aware of all the ES they are receiving [52,53]. As a result, the reported ES flows from surveys may not necessarily reflect those determined by other methods [54,55]. Furthermore, whilst we investigated differences in ES flows across the rural–urban spectrum, it should be acknowledged that ecosystems provide disservices as well as services [56], and the disservices may vary between rural and urban areas [57]. Therefore, future studies should explore any systematic biases across a variety of ES methods (e.g., surveys, focus groups, observations, modelling, etc.), as well as expanding the ES investigated to include disservices as well as additional ES.

## 5. Conclusions

For the majority of the ES investigated, we found no statistical differences in the quantities of ES used, the distance to the ecosystem, or the levels of direct/indirect use of ecosystems between urban, peri-urban and rural areas. This evidence represents one of the most comprehensive assessments of red-loop–green-loop theory to date but does not support the predictions of this theory and thus suggests it to be a poor conceptualisation of ES flows across the rural–urban spectrum. This result is likely because ES flows across all areas have already undergone substantial modernisation and globalisation, involving complex (and often international) value chains. As such, the impact of future urbanisation on ES flows may be limited. However, our results may indicate some broad generalisations. For example, use of provisioning services may be higher in rural areas, but use of cultural services is higher in urban areas. Similarly, urban people themselves travel shorter distances than rural people to access most ES. Furthermore, where these differences in ES flow exist, peri-urban areas sometimes show an intermediate step between rural and urban systems. Our results highlight differences in flow between ES and should be an area of development for future ES theory and research, particularly in the light of the world’s rapidly expanding urban and peri-urban populations.

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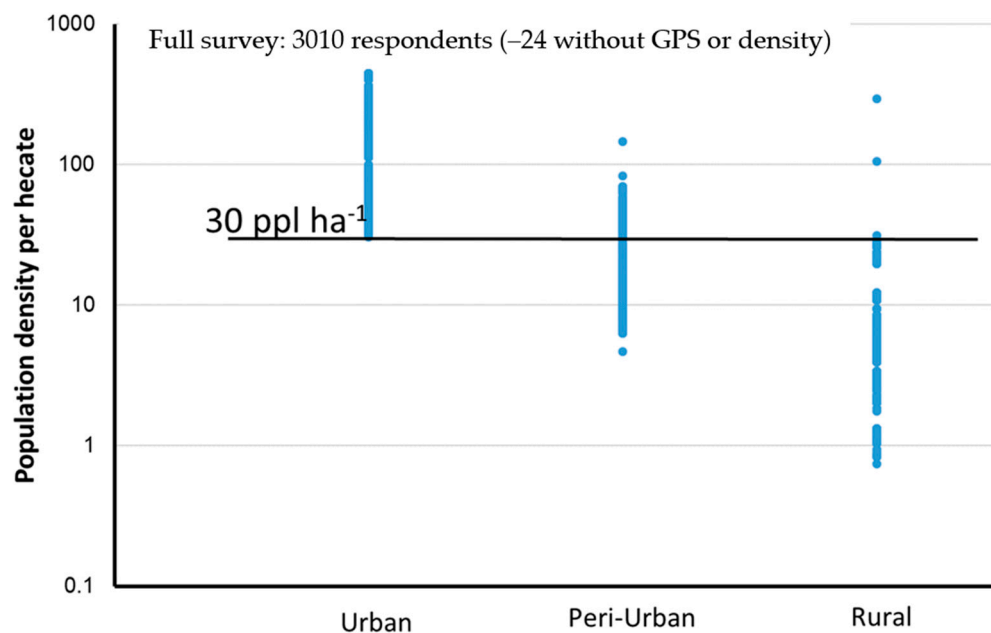
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### Appendix A. Transect Population Density Range



**Figure A1.** The local population density (from worldpop.com) of our survey respondents categorised by using our rural, peri-urban and urban divisions.

### Appendix B. Data Cleaning Rules

**Table A1.** Cleaning rules for numerical data.

Data Range	Cleaning Rule
Water quantity—daily	
0–3000 and 9999 L	For the data on daily water usage data (for drinking, cooking and bathing), values were identified as erroneous if they exceeded 698.9 L, which is the maximum water quantity for drinking, cooking and bathing, according to the study done in Rajasthan, India (Choudhary et al., 2012). If they did exceed 698.9 L, they were removed. This correction was required for 26 out of 4458 entries (0.58%). Further, 9999 values were deleted as this was used to mark “do not know” answers in previous columns. This correction was required for 4 out of 4458 households (0.08%).
Willingness to pay for water (per month)	
INR 0–800 and 9999	According to the local collaborating partners, it is possible to have INR 990 per month as a maximum. Therefore, all data were kept except 9999 values. This correction was required for 8 data points out of 3011 entries (0.26%).
Monthly water bill	
INR 0–6223 and 9999	According to the local collaborating partners, monthly water bills cannot be less than INR 10 or more than INR 990. We removed the values less than 10 but we kept zero as in some areas the water bill was zero. Again, we removed the values more than INR 990. This correction was required for 76 values out of 4458 entries. Additionally, we removed 999,999,999,999 mistakenly added for “don’t know” responses. This correction was required for 384 out of 4458 entries (8.61%).
Waste quantity—daily	
0–50 kg	For the data on daily household waste quantity, values were identified as erroneous if they exceeded a maximum value of 4.14 kg according to the study done in Dehradun city, India (Suthar and Singh, 2015). These were removed and this correction was required for 28 out of 2896 households (1.00%).

Table A1. Cont.

Data Range	Cleaning Rule
Rice quantity purchased—last week	
0–600 kg	According to the local collaborating partners, it is possible to store large quantities of rice purchased for a long period of time. All of the data for quantity of rice purchased (last week) by a household were kept.
Rice cost—per kg	
INR 0–800	For the data on cost of rice (per kilo gram), values were identified and removed as erroneous if they exceeded INR 100 according to the Indiamart.com website. This correction was required for 9 out of 1715 households (0.52%). Additionally, we removed rice price values given by the respondents who said that no rice had been purchased that week. This correction was required for 50 out of 1715 households (2.9%).
Rice received—last week	
0–2000 kg	According to the local collaborating partners, it is possible to store large quantities of rice received from relatives or friends for a long time period. For the data on quantity of rice received (last week) by a household, all the data were kept.
Recreation expense—last week	
INR 0–5000 and 9999	For the data on recreation expense (last week), values were identified as erroneous if they exceeded 11.65% of the monthly income according to Upadhyay and Pathania (2013). We assumed that their non-food expenses all go to recreation, and weekly given expenses are the only non-food expenses per month. From this we calculated the share of non-food expenses. If they did exceed that value, they were removed. This correction was required for 4 out of 2853 households (0.14%).
Recreation hours—last week	
0–888 h & 9999	For the data on recreation hours, we identified values as erroneous if they exceeded 84 h because it is unrealistic that people spend more than 12 h a day 7 days a week on recreational activities. If they did exceed 84, we deleted the value. This correction was required for 3 data points (0.10%).
Aesthetic expense—last week	
INR 0–10,000 and 9999	For the data on aesthetic expense (last week), values were identified as erroneous if they exceeded 11.65% of the monthly income according to Upadhyay and Pathania (2013). We assumed that their non-food expenses all go to aesthetic, and weekly given expense is the only non-food expenses per month. Then, we calculated the share of non-food expenses. If they did exceed that value, they were removed. This correction was required for 6 out of 2850 households (0.21%).
Aesthetic hours—last week	
0–2400 h & 9999	For the data on aesthetic hours, we identified values as erroneous if they exceeded 84 h because it is unrealistic that people spend more than 12 h a day 7 days a week on aesthetic activities. If they did exceed 84, we deleted the value. This correction was required for 4 data points (0.13%).
Spiritual expense—last week	
INR 0–5000	For the data on spiritual expense (last week), values were identified as erroneous if they exceeded 11.65% of the monthly income according to [58]. We assumed that their non-food expenses all go to spiritual expenses, and weekly given expense is the only non-food expenses per month. Then, we calculated the share of non-food expenses. If they did exceed that value, they were removed. This correction was required for 6 out of 2935 households (0.043%).
Spiritual hours—last week	
0–10,000 h	For the data on spiritual hours, we identified values as erroneous if they exceeded 84 h because it is unrealistic that people spend more than 12 h a day 7 days a week in a temple. If they did exceed 84, we deleted the value. This correction was required for 2 data points (0.06%).
Fish quantity consumed—last week	
0–200 kg	For the data on weekly fish consumption, values were identified as erroneous if they exceeded 5 kg according to the local knowledge from our collaborating partners. If they did exceed 5 kg, they were removed. This correction was required for 5 out of 340 households (1.47%).



Table A1. Cont.

Data Range	Cleaning Rule
Fish quantity purchased—last week	
0–1500 kg	For the data on weekly fish quantity purchased, values were identified as erroneous if they exceeded 5 kg according to the local knowledge from our collaborating partners. If they did exceed 5 kg, they were removed. This correction was required for 15 out of 572 households (2.6%).
Fish cost—per kg	
INR 0–800 and 9999	For the data on cost of fish (per kg), values were identified as erroneous if they were 9999 because they were given “Don’t know” responses in other data columns. This correction was required for 8 out of 572 households (1.39%). Additionally, the fish cost values were removed when they had zero in the adjacent column to where the quantity of fish they purchased was asked. This correction was required for 8 out of 572 households (1.39%). The highest price for tiger prawns, which was most expensive type, does not exceed INR 1000 (Indiamart.com). There were no values more than 1000 in our data set.
Fish quantity received—last week	
0–500 kg	For the data on weekly fish quantity received, values were identified as erroneous if they exceeded 5 kg according to the local knowledge from our collaborating partners. If they did exceed 5 kg, they were removed. This correction was required for 5 out of 572 households (0.87%).

### Appendix C. Description of the Variables

Table A2. Description of the variables.

Variable Name	Variable Type	Variable Description
Water quantity	Dependent	Water quantity used by a household per day (L)
Sanitation—toilet usage	Dependent	Number of times using the toilet by the household per day
Rice—purchased quantity	Dependent	Quantity of rice purchased by the household per week (kg)
Rice—received quantity	Dependent	Quantity of rice given to the household free of charge per week (kg)
Fuelwood quantity consumed	Dependent	Quantity of fuelwood used by the household per week (kg)
Fuelwood quantity purchased	Dependent	Quantity of fuelwood purchased by the household per week (kg)
Fuelwood quantity received	Dependent	Quantity of fuelwood given to the household free of charge per week (kg)
Fish—quantity consumed	Dependent	Quantity of fish consumed by the household per week (kg)
Fish—purchased quantity	Dependent	Quantity of fish purchased by the household per week (kg)
Fish—received quantity	Dependent	Quantity of fish given to the household free of charge per week (kg)
Recreational hours	Dependent	Number of hours spent in recreational places per week
Recreational expenses	Dependent	Amount of money spent on recreation per week (INR)
Aesthetic hours	Dependent	Number of hours spent for aesthetic per week
Aesthetic expenses	Dependent	Amount of money spent on aesthetic per week (INR)
Spirituality hours	Dependent	Number of hours spent on spirituality per week
Spirituality expenses	Dependent	Amount of money spent on spirituality per week (INR)
Rice—ES distance	Dependent	Distance between household and origin of rice
Fuelwood—ES distance	Dependent	Distance between household and origin of fuelwood
Fish—ES distance	Dependent	Distance between household and origin of fish
Water—travel distance	Dependent	Distance between household and where they get water
Sanitation—toilet travel distance	Dependent	Distance between household and location of toilet
Rice—travel distance	Dependent	Distance between household and where they get rice
Fuelwood—travel distance	Dependent	Distance between household and where they get fuelwood
Fish—travel distance	Dependent	Distance between household and where they get fish

Table A2. Cont.

Variable Name	Variable Type	Variable Description
Recreation—travel distance	Dependent	Distance between household and where they enjoy recreation
Aesthetic—travel distance	Dependent	Distance between household and where they enjoy aesthetic beauty
Spirituality—travel distance	Dependent	Distance between household and where they go for spirituality
Area—peri urban	Independent	Household is located in a peri-urban area
Area—rural	Independent	Household is located in a rural area
Area—urban	Independent	Household is located in an urban area
Social class—General	Independent	Social class of the respondent household
Social class—Other Backward Class (OBT)	Independent	Social class of the respondent household
Social class—Scheduled caste	Independent	Social class of the respondent household
Social class—Scheduled tribes	Independent	Social class of the respondent household
Residency status—owner	Independent	Residency status of the household
Residency status—tenant	Independent	Residency status of the household
Residency status—other	Independent	Residency status of the household
Household size	Independent	Number of members in the household
Monthly income (INR)	Independent	Monthly income of the household (INR)
Water use—drinking	Independent	Using the particular water source for drinking (Yes/No)
Water use—cooking	Independent	Using the particular water source for cooking (Yes/No)
Water use—bathing	Independent	Using the particular water source for bathing (Yes/No)
Water source—11	Independent	Water piped into dwelling
Water source—12	Independent	Water piped into compound, yard or plot
Water source—13	Independent	Water piped to neighbour
Water source—14	Independent	Public tap (standpipe)
Water source—21	Independent	Tube Well/Borehole
Water source—61	Independent	Tanker-truck
Water source—72	Independent	Water kiosk
Water source—91	Independent	Bottled water
Water source—99	Independent	Other (specify)
Water collected by—1	Independent	Water collected for the household by themselves
Water collected by—2	Independent	Water collected for the household by friends
Water collected by—3	Independent	Water collected for the household by relatives
Water collected by—4	Independent	Water collected for the household by sellers
Number of different water sources	Independent	Number of different water sources they are using?
Household level water purification—done	Independent	Purifying the water at household
Household water purification expense per month (INR)	Independent	Cost of purifying the water at household per month (INR)
Cost of water (month) (INR)	Independent	Cost of water per month (INR)
Place of the toilet—1	Independent	Household toilet
Place of the toilet—2	Independent	Community toilet
Place of the toilet—3	Independent	Public toilet

**Table A2.** *Cont.*

Variable Name	Variable Type	Variable Description
Place of the toilet—4	Independent	Open defecation
Place of the toilet-other	Independent	Other please specify (workplace toilet, etc.)
Type of the toilet—11	Independent	Toilet flush to piped sewer system
Type of the toilet—12	Independent	Toilet flush to septic tank
Type of the toilet—13	Independent	Toilet flush to pit latrine
Type of the toilet—14	Independent	Toilet flush to open drain
Type of the toilet—22	Independent	Pit latrine with slab
Type of the toilet—23	Independent	Pit latrine without slab/Open pit
Type of the toilet—31	Independent	Composting toilet
Type of the toilet—32	Independent	Twin pit toilet with slab
Type of the toilet—41	Independent	Bucket toilet
Type of the toilet—other	Independent	Open defecation
Rice source—themselves	Independent	Rice collected for the household by themselves
Rice source—via friend	Independent	Rice collected for the household by friends
Rice source—via relative	Independent	Rice collected for the household by relatives
Rice source—via seller	Independent	Rice collected for the household by sellers
Rice purchased cost (INR)	Independent	Cost of rice per week (INR)
Fuelwood source—themselves	Independent	Fuelwood collected for the household by themselves
Fuelwood source—via relative	Independent	Fuelwood collected for the household by relatives
Fuelwood source—via seller	Independent	Fuelwood collected for the household by sellers
Fuelwood purchased cost (INR)	Independent	Cost of fuelwood per week (INR)
Fish source—via relative	Independent	Fish collected for the household by relatives
Fish source—via seller	Independent	Fish collected for the household by sellers
Fish purchased cost (INR)	Independent	Cost of fish per week (INR)

**Table A3.** Description of the category codes.

Water Source	Name of the Water Source
Water source—11	Piped into dwelling
Water source—12	Piped into compound, yard or plot
Water source—13	Piped to neighbour
Water source—14	Public tap/standpipe
Water source—21	Tube Well, Borehole
Water source—31	Protected well
Water source—32	Unprotected well
Water source—42	Unprotected spring
Water source—61	Tanker-truck
Water source—72	Water kiosk
Water source—91	Bottled water
Water source—92	Sachet water
Water source—99	Other (specify)

Table A3. Cont.

<b>Water Source</b>	<b>Name of the Water Source</b>
<b>Place of Toilet</b>	<b>Name of the Toilet Place</b>
Place of the toilet—1	Household toilet
Place of the toilet—2	Community toilet
Place of the toilet—3	Public toilet
Place of the toilet—4	Open defecation
Place of the toilet—99	Other (specify)
<b>Type of the Toilet</b>	<b>Name of the Toilet Type</b>
Type of the toilet—11	Flush to piped sewer system
Type of the toilet—12	Flush to septic tank
Type of the toilet—13	Flush to pit latrine
Type of the toilet—14	Flush to open drain
Type of the toilet—22	Pit latrine with slab
Type of the toilet—23	Pit latrine without slab/Open pit
Type of the toilet—31	Composting toilet
Type of the toilet—32	Twin pit with slab
Type of the toilet—41	Bucket
Type of the toilet—other	Other (specify)

## Appendix D. Descriptive Statistics of the Respondents

Table A4. Descriptive statistics of the respondents.

<b>Variable</b>	<b>Groups</b>	<b>Count</b>	<b>Percentage</b>
Household size	≤2	1271	42.20
	3–4	1490	49.50
	5–6	209	6.90
	7–8	27	0.90
	9+	11	0.40
Monthly income of the household (INR)	≤20,000.00	2376	78.94
	20,001.00–40,000.00	542	18.01
	40,001.00–60,000.00	76	2.53
	60,001.00–80,000.00	11	0.37
	80,001.00–100,000.00	1	0.03
	100,001.00–120,000.00	2	0.06
	120,001.00+	2	0.06
Social class	General	305	10.10
	OBC	1679	55.80
	ST	788	26.20
	ST	193	6.40
	Other	42	1.40
Residency status	Owner	2193	72.90
	Tenant	739	24.60
	99	76	2.50

## Appendix E. Extended Results

**Table A5.** Ecosystem service quantification (for variable descriptions see Appendix C).

Ecosystem Service Variable	Parameter	Coefficient	<i>p</i> -Value
Daily drinking water consumption	Water source—11	81.44	$5.56 \times 10^{-11}$
	Water source—12	−43.52	$3.94 \times 10^{-3}$
	Water source—13	47.85	$4.10 \times 10^{-2}$
	Water source—14	−45.01	$3.09 \times 10^{-3}$
	Water source—21	69.65	$3.04 \times 10^{-3}$
	Water source—31	34.18	$5.11 \times 10^{-1}$
	Water source—32	35.86	$6.81 \times 10^{-1}$
	Water source—42	118.94	$1.73 \times 10^{-1}$
	Water source—61	−32.40	$2.46 \times 10^{-1}$
	Water source—72	0.25	$9.84 \times 10^{-1}$
	Water source—91	−0.83	$9.40 \times 10^{-1}$
	Water source—92	171.50	$5.41 \times 10^{-1}$
	Water source—99	0	
	Area—peri urban	−39.03	$9.10 \times 10^{-5}$
	Area—rural	−83.41	$2.23 \times 10^{-13}$
	Area—urban	0	
	Social class—General	33.87	$3.47 \times 10^{-1}$
	Social class—Other Backward Class (OBT)	54.81	$1.09 \times 10^{-1}$
	Social class—Scheduled caste	44.71	$1.94 \times 10^{-1}$
	Social class—Scheduled tribes	60.48	$0.93 \times 10^{-1}$
	Social class—other	0	
	Residency status—owner	−58.47	$7.64 \times 10^{-3}$
	Residency status—tenant	$-7.79 \times 10^{-1}$	$9.37 \times 10^{-1}$
	Residency status—other	0	
	Water collected by—themselves	−41.297	$4.40 \times 10^{-31}$
	Water collected by—friend	−24.067	$5.98 \times 10^{-1}$
	Water collected by—relative	−16.063	$4.95 \times 10^{-1}$
	Water collected by—seller	0	
	Number of different water sources	−142.81	$7.188 \times 10^{-47}$
	Cost of water (month) (INR)	−0.06	$2.85 \times 10^{-2}$
	Household size	11.31	$1.00 \times 10^{-6}$
	Monthly income (INR)	$-5.90 \times 10^{-5}$	$8.71 \times 10^{-1}$
	Water source—11	98.018	$1.19 \times 10^{-33}$
Water source—12	59.201	$7.08 \times 10^{-10}$	
Water source—13	79.896	$1.05 \times 10^{-8}$	
Water source—14	19.278	$4.76 \times 10^{-2}$	
Water source—21	70.141	$2.59 \times 10^{-7}$	
Water source—31	59.575	$1.69 \times 10^{-1}$	

Table A5. Cont.

Ecosystem Service Variable	Parameter	Coefficient	p-Value
Daily drinking water consumption excluding the "How the ES was obtained" variable	Water source—32	44.013	$5.99 \times 10^{-1}$
	Water source—42	136.852	$1.03 \times 10^{-1}$
	Water source—61	64.225	$3.00 \times 10^{-6}$
	Water source—72	−5.035	$6.10 \times 10^{-1}$
	Water source—91	8.027	$2.23 \times 10^{-1}$
	Water source—92	104.013	$0.82 \times 10^{-1}$
	Water source—99	0	
	Area—peri urban	−35.577	$1.25 \times 10^{-12}$
	Area—rural	−57.189	$2.15 \times 10^{-26}$
	Area—urban	0	
	Social class—General	39.342	$1.21 \times 10^{-2}$
	Social class—Other Backward Class (OBT)	15.359	$3.04 \times 10^{-1}$
	Social class—Scheduled caste	8.877	$5.58 \times 10^{-1}$
	Social class—Scheduled tribes	19.192	$2.38 \times 10^{-1}$
	Social class—other	0	
	Residency status—owner	−53.548	$1.80 \times 10^{-5}$
	Residency status—tenant	4.162	$3.16 \times 10^{-1}$
	Residency status—other	0	
	Number of different water sources	−97.915	0
	Cost of water (month) (INR)	−042	$3.44 \times 10^{-3}$
	Household size	18.970	$1.97 \times 10^{-52}$
	Monthly income (INR)	$3.75 \times 10^{-4}$	$1.52 \times 10^{-2}$
	Area—peri urban	0.62	0.08
	Area—rural	0.33	0.39
	Area—urban	0	
	Social class—General	1.32	$1.90 \times 10^{-5}$
	Social class—Other Backward Class (OBT)	0.92	$1.72 \times 10^{-5}$
	Social class—Scheduled caste	0.74	0.01
	Social class—Scheduled tribes	0.77	0.01
	Social class—other responses	0	0
	Residency status—owner	0.04	0.87
	Residency status—tenant	−0.16	0.56
Residency status—other	0		
Household size	0.15	$9.49 \times 10^{-10}$	
Monthly income (INR)	$1.12 \times 10^{-5}$	$6.65 \times 10^{-4}$	
Place of the toilet—1	1.72	$7.05 \times 10^{-4}$	
Place of the toilet—2	1.54	0.01	
Place of the toilet—3	2.86	$1.25 \times 10^{-3}$	
Place of the toilet—4	1.29	0.05	

Table A5. Cont.

Ecosystem Service Variable	Parameter	Coefficient	<i>p</i> -Value
Sanitation-toilet usage per day	Place of the toilet—99	0	
	Type of the toilet—11	1.36	0.01
	Type of the toilet—12	0.01	0.98
	Type of the toilet—13	1.40	0.25
	Type of the toilet—14	2.15	$7.51 \times 10^{-4}$
	Type of the toilet—22	−0.10	0.85
	Type of the toilet—23	−0.43	0.82
	Type of the toilet—31	0.36	0.85
	Type of the toilet—32	0.09	0.91
	Type of the toilet—41	0.53	0.60
	Type of the toilet—99	0	
	Type of the toilet × Area—PU × 11	−1.03	0.01
	Type of the toilet × Area—PU × 12	0.59	0.21
	Type of the toilet × Area—PU × 13	−0.18	0.87
	Type of the toilet × Area—PU × 14	−1.66	$4.58 \times 10^{-3}$
	Type of the toilet × Area—PU × 22	2.38	$1.04 \times 10^{-8}$
	Type of the toilet × Area—PU × 23	0.75	0.71
	Type of the toilet × Area—PU × 31	−1.56	0.56
	Type of the toilet × Area—PU × 32	−0.13	0.92
	Type of the toilet × Area—PU × 41	−0.32	0.78
	Type of the toilet × Area—PU × 95	0	
	Type of the toilet × Area—R × 11	−0.81	0.22
	Type of the toilet × Area—R × 12	0.53	0.28
	Type of the toilet × Area—R × 13	−1.96	0.11
	Type of the toilet × Area—R × 14	−2.11	0.01
	Type of the toilet × Area—R × 22	2.28	$4.58 \times 10^{-3}$
	Type of the toilet × Area—R × 23	−1.29	0.62
	Type of the toilet × Area—R × 32	0	
	Type of the toilet × Area—R × 41	0.24	0.83
	Type of the toilet × Area—R × 95	0	
	Type of the toilet × Area—U × 11	0	
	Type of the toilet × Area—U × 12	0	
	Type of the toilet × Area—U × 13	0	
	Type of the toilet × Area—U × 14	0	
	Type of the toilet × Area—U × 22	0	
	Type of the toilet × Area—U × 23	0	
	Type of the toilet × Area—U × 31	0	
	Type of the toilet × Area—U × 41	0	
	Type of the toilet × Area—U × 95	0	

Table A5. Cont.

Ecosystem Service Variable	Parameter	Coefficient	p-Value	
Rice-purchased quantity	Area—peri urban	−0.64	0.42	
	Area—rural	−1.46	0.07	
	Area—urban	0		
	Social class—General	1.98	0.51	
	Social class—Other Backward Class (OBT)	−0.81	0.77	
	Social class—Scheduled caste	−0.39	0.88	
	Social class—Scheduled tribes	−0.93	0.75	
	Social class—other	0		
	Residency status—owner	−1.07	0.64	
	Residency status—tenant	−1.55	0.514	
	Residency status—other	0		
	Household size	2.06	$2.09 \times 10^{-18}$	
	Monthly income (INR)	$-2.65 \times 10^{-5}$	0.39	
	Rice source—themselves	−4.07	$8.0 \times 10^{-6}$	
	Rice source—via friend	0.25	0.94	
	Rice source—via relative	1.43	0.54	
	Rice source—via seller	0		
	Rice purchased cost (INR)	0.11	$3.31 \times 10^{-9}$	
	Rice-received quantity	Area—peri urban	−3.02	0.27
		Area—rural	17.73	$1.39 \times 10^{-9}$
Area—urban		0		
Social class—General		−7.59	0.46	
Social class—Other Backward Class (OBT)		−2.92	0.76	
Social class—Scheduled caste		−1.64	0.86	
Social class—Scheduled tribes		−10.91	0.29	
Social class—other		0		
Residency status—owner		0.07	0.99	
Residency status—tenant		−0.34	0.96	
Residency status—other		0		
Household size		−0.19	0.81	
Monthly income (INR)		$-1.30 \times 10^{-5}$	0.90	
Rice source—themselves		1.79	0.57	
Rice source—via friend		18.96	0.16	
Rice source—via relative		4.53	0.59	
Rice source—via seller		0		
Rice purchased cost (INR)		0.18	$8.76 \times 10^{-3}$	



Table A5. Cont.

Ecosystem Service Variable	Parameter	Coefficient	p-Value
Fuelwood quantity consumed	Area—peri urban	1.476	0.68
	Area—rural	−1.66	0.73
	Area—urban	0	
	Social class—General	−17.13	0.26
	Social class—Other Backward Class (OBT)	−3.81	0.77
	Social class—Scheduled caste	−1.16	0.92
	Social class—Scheduled tribes	−1.80	0.89
	Social class—other	0	
	Residency status—owner	3.86	0.51
	Residency status—tenant	−1.14	0.82
	Residency status—other	0	
	Household size	−0.90	0.43
	Monthly income (INR)	$1.51 \times 10^{-4}$	0.37
	Fuelwood source—themselves	−66.10	$1.05 \times 10^{-3}$
	Fuelwood source—via relative	−80.16	$5.69 \times 10^{-4}$
	Fuelwood source—via seller	0	
	Fuelwood purchased cost (INR)	−5.28	$2.38 \times 10^{-3}$
	Fuelwood quantity purchased	Area—peri urban	−0.82
Area—rural		1.92	0.74
Area—urban		0	
Social class—General		−35.73	0.05
Social class—Other Backward Class (OBT)		−32.29	0.04
Social class—Scheduled caste		−37.31	0.01
Social class—Scheduled tribes		−33.64	0.03
Social class—other		0	
Residency status—owner		8.07	0.25
Residency status—tenant		8.01	0.20
Residency status—other		0	
Household size		0.33	0.81
Monthly income (INR)		$-1.73 \times 10^{-4}$	0.39
Fuelwood source—themselves		−121.91	$4.00 \times 10^{-6}$
Fuelwood source—via relative		−121.08	$3.01 \times 10^{-5}$
Fuelwood source—via seller		0	
Fuelwood purchased cost (INR)		−6.70	$1.35 \times 10^{-3}$

Table A5. Cont.

Ecosystem Service Variable	Parameter	Coefficient	<i>p</i> -Value
Fuelwood quantity received	Area—peri urban	9.30	0.01
	Area—rural	11.94	0.01
	Area—urban	0	
	Social class—General	−7.24	0.62
	Social class—Other Backward Class (OBT)	−8.16	0.51
	Social class—Scheduled caste	−2.52	0.83
	Social class—Scheduled tribes	−2.42	0.84
	Social class—other	0	
	Residency status—owner	−7.76	0.17
	Residency status—tenant	−6.18	0.21
	Residency status—other	0	
	Household size	−0.97	0.38
	Monthly income (INR)	0	
	Fuelwood source—themselves	−57.42	$2.51 \times 10^{-3}$
	Fuelwood source—via relative	−68.25	$1.76 \times 10^{-3}$
	Fuelwood source—via seller	0	
	Fuelwood purchased cost (INR)	−4.598	$5.07 \times 10^{-3}$
	Fish—quantity consumed	Area—peri urban	0.16
Area—rural		−0.02	0.83
Area—urban		0	
Social class—General		−0.09	0.68
Social class—Other Backward Class (OBT)		−0.02	0.90
Social class—Scheduled caste		0.01	0.92
Social class—Scheduled tribes		−0.15	0.50
Social class—other		0	
Residency status—owner		0.01	0.94
Residency status—tenant		0.05	0.84
Residency status—other		0	
Household size		0.18	$8.41 \times 10^{-11}$
Monthly income (INR)		$8.17 \times 10^{-6}$	0.01
Fish source—via relative		0.01	0.94
Fish source—via seller		0	
Fish purchased cost (INR)	$9.94 \times 10^{-4}$	0.03	

Table A5. Cont.

Ecosystem Service Variable	Parameter	Coefficient	<i>p</i> -Value
Fish—purchased quantity	Area—peri urban	0.05	0.27
	Area—rural	0.10	0.06
	Area—urban	0	
	Social class—General	0.09	0.49
	Social class—Other Backward Class (OBT)	0.14	0.28
	Social class—Scheduled caste	0.05	0.70
	Social class—Scheduled tribes	−0.04	0.78
	Social class—other	0	
	Residency status—owner	−0.25	0.05
	Residency status—tenant	−0.30	0.02
	Residency status—other	0	
	Household size	0.08	$1.63 \times 10^{-7}$
	Monthly income (INR)	$-4.38 \times 10^{-7}$	0.82
	Fish source—via relative	−0.33	0.01
	Fish source—via seller	0	
	Fish purchased cost (INR)	$5.73 \times 10^{-3}$	$1.23 \times 10^{-75}$
	Fish—received quantity	Area—peri urban	0.09
Area—rural		0.15	0.05
Area—urban		0	
Social class—General		0.01	0.95
Social class—Other Backward Class (OBT)		−0.01	0.94
Social class—Scheduled caste		−0.06	0.74
Social class—Scheduled tribes		−0.21	0.32
Social class—other		0	
Residency status—owner		−0.47	$5.73 \times 10^{-3}$
Residency status—tenant		−0.48	$5.33 \times 10^{-3}$
Residency status—other		0	
Household size		0.11	$3.79 \times 10^{-8}$
Monthly income (INR)		$1.91 \times 10^{-6}$	0.46
Fish source—via relative		0.04	0.79
Fish source—via seller		0	
Fish purchased cost (INR)		$4.27 \times 10^{-3}$	$4.67 \times 10^{-35}$

Table A5. Cont.

Ecosystem Service Variable	Parameter	Coefficient	<i>p</i> -Value
Recreational hours	Area—peri urban	0.05	0.13
	Area—rural	−0.10	$5.90 \times 10^{-3}$
	Area—urban	0	
	Social class—General	$9.23 \times 10^{-3}$	0.94
	Social class—Other Backward Class (OBT)	0.08	0.49
	Social class—Scheduled caste	0.02	0.83
	Social class—Scheduled tribes	0.08	0.57
	Social class—other	0	
	Residency status—owner	0.23	0.01
	Residency status—tenant	0.24	0.01
	Residency status—other	0	
	Household size	$-3.48 \times 10^{-3}$	0.76
	Monthly income (INR)	$-2.87 \times 10^{-6}$	0.05
	Recreational expenses	Area—peri urban	3.64
Area—rural		−3.03	0.17
Area—urban		0	
Social class—General		1.80	0.81
Social class—Other Backward Class (OBT)		3.17	0.66
Social class—Scheduled caste		2.72	0.71
Social class—Scheduled tribes		2.40	0.76
Social class—other		0	
Residency status—owner		9.23	0.10
Residency status—tenant		7.52	0.19
Residency status—other		0	
Household size		−1.69	$9.45 \times 10^{-3}$
Monthly income (INR)		$3.16 \times 10^{-4}$	$1.58 \times 10^{-4}$
Aesthetic hours		Area—peri urban	0.1
	Area—rural	−0.01	0.92
	Area—urban	0	
	Social class—General	$1.32 \times 10^{-4}$	1.00
	Social class—Other Backward Class (OBT)	0.19	0.59
	Social class—Scheduled caste	−0.07	0.84
	Social class—Scheduled tribes	−0.26	0.51
	Social class—other	0	
	Residency status—owner	0.45	0.11
	Residency status—tenant	0.52	0.07
	Residency status—other	0	
	Household size	0.07	0.03
	Monthly income (INR)	$-8.51 \times 10^{-6}$	0.04

Table A5. Cont.

Ecosystem Service Variable	Parameter	Coefficient	p-Value
Aesthetic expenses	Area—peri urban	0.70	0.84
	Area—rural	1.63	0.65
	Area—urban	0	
	Social class—General	17.23	0.17
	Social class—Other Backward Class (OBT)	13.79	0.25
	Social class—Scheduled caste	11.61	0.34
	Social class—Scheduled tribes	6.87	0.60
	Social class—other	0	
	Residency status—owner	15.76	0.08
	Residency status—tenant	14.98	0.11
	Residency status—other	0	
	Household size	−0.54	0.61
	Monthly income (INR)	$2.96 \times 10^{-4}$	0.03
	Spirituality hours	Area—peri urban	−0.06
Area—rural		0.12	0.36
Area—urban		0	
Social class—General		0.01	0.98
Social class—Other Backward Class (OBT)		0.22	0.62
Social class—Scheduled caste		0.20	0.66
Social class—Scheduled tribes		0.37	0.45
Social class—other		0	
Residency status—owner		0.18	0.60
Residency status—tenant		0.10	0.76
Residency status—other		0	
Household size		0.05	0.16
Monthly income (INR)		$-6.90 \times 10^{-6}$	0.17
Spirituality expenses		Area—peri urban	−2.74
	Area—rural	−7.91	$8.32 \times 10^{-3}$
	Area—urban	0	
	Social class—General	−13.92	0.19
	Social class—Other Backward Class (OBT)	−8.25	0.41
	Social class—Scheduled caste	−9.25	0.37
	Social class—Scheduled tribes	−11.89	0.28
	Social class—other	0	
	Residency status—owner	12.92	0.09
	Residency status—tenant	10.71	0.17
	Residency status—other	0	
	Household size	−2.452	$5.25 \times 10^{-3}$
	Monthly income (INR)	$2.86 \times 10^{-4}$	0.01

**Table A6.** Total ES distance (for variable descriptions see Appendix C).

Ecosystem Service Variable	Parameter	Coefficient	<i>p</i> -Value
Rice	Area—peri urban	500.35	0.19
	Area—rural	305.48	0.44
	Area—urban	0	
	Social class—General	−251.07	0.85
	Social class—Other Backward Class (OBT)	118.71	0.92
	Social class—Scheduled caste	−197.67	0.88
	Social class—Scheduled tribes	−65.57	0.96
	Social class—other responses	0	
	Residency status—owner	178.11	0.87
	Residency status—tenant	−267.30	0.82
	Residency status—other	0	
	Household size	−74.32	0.50
	Monthly income (INR)	0.01	0.49
	Rice source—themselves	−648.17	0.14
	Rice source—via friend	−384.50	0.83
	Rice source—via relative	1381.74	0.23
	Rice source—via seller	0	
	Rice purchased cost (INR)	−19.87	0.03
	Fuelwood	Area—peri urban	−49.18
Area—rural		448.63	0.46
Area—urban		0	
Social class—General		570.56	0.76
Social class—Other Backward Class (OBT)		716.43	0.65
Social class—Scheduled caste		673.74	0.65
Social class—Scheduled tribes		398.94	0.80
Social class—other		0	
Residency status—owner		284.80	0.69
Residency status—tenant		−30.96	0.96
Residency status—other		0	
Household size		105.37	0.45
Monthly income (INR)		$-1.52 \times 10^{-4}$	0.99
Fuelwood source—themselves		−1597.27	0.48
Fuelwood source—via relative		299.04	0.90
Fuelwood source—via seller		0	
Fuelwood purchased cost (INR)		−41.97	.83

Table A6. Cont.

Ecosystem Service Variable	Parameter	Coefficient	p-Value
Fish	Area—peri urban	−7071.52	.09
	Area—rural	−5227.25	.28
	Area—urban	0	
	Social class—General	969.10	0.94
	Social class—Other Backward Class (OBT)	1142.01	0.92
	Social class—Scheduled caste	4531.35	0.70
	Social class—Scheduled tribes	−1991.58	0.88
	Social class—other responses	0	
	Residency status—owner	2489.95	0.80
	Residency status—tenant	4344.78	0.67
	Residency status—other	0	
	Household size	2187.36	0.10
	Monthly income (INR)	0.22	0.16
	Fish source—via relative	−118.7	0.99
	Fish source—via seller	0	
	Fish purchased cost (INR)	−36.292	0.082

Table A7. Beneficiary travel distance (for variable descriptions see Appendix C).

Ecosystem Service Variable	Parameter	Coefficient	p-Value
Daily drinking water consumption	Water source—11	−13.28	$9.39 \times 10^{-1}$
	Water source—12	−108.90	$6.02 \times 10^{-1}$
	Water source—13	−69.14	$8.31 \times 10^{-1}$
	Water source—14	299.15	$1.56 \times 10^{-1}$
	Water source—21	499.25	$1.26 \times 10^{-1}$
	Water source—31	−22.39	$9.75 \times 10^{-1}$
	Water source—32	337.04	$7.80 \times 10^{-1}$
	Water source—42	−88.12	$9.42 \times 10^{-1}$
	Water source—61	−85.47	$8.25 \times 10^{-1}$
	Water source—72	190.17	$2.95 \times 10^{-1}$
	Water source—91	154.08	$3.10 \times 10^{-1}$
	Water source—92	−70.07	$9.55 \times 10^{-1}$
	Water source—99	0	
	Area—peri urban	−45.911	$7.42 \times 10^{-1}$
	Area—rural	−13.337	$9.34 \times 10^{-1}$
	Area—urban	0	
	Social class—General	325.66	$5.13 \times 10^{-1}$
	Social class—Other Backward Class (OBT)	450.33	$3.41 \times 10^{-1}$
	Social class—Scheduled caste	379.89	$4.25 \times 10^{-1}$
	Social class—Scheduled tribes	329.12	$5.08 \times 10^{-1}$
	Social class—Other	0	
Residency status—owner	−209.99	$4.89 \times 10^{-1}$	
Residency status—tenant	−173.96	$2.01 \times 10^{-1}$	

Table A7. Cont.

Ecosystem Service Variable	Parameter	Coefficient	p-Value
	Residency status—other	0	
	Water collected by—themselves	188.47	$3.48 \times 10^{-1}$
	Water collected by—friend	179.82	$7.75 \times 10^{-1}$
	Water collected by—relative	462.50	$1.55 \times 10^{-1}$
	Water collected by—seller	0	
	Number of different water sources	−2.97	$9.84 \times 10^{-1}$
	Daily water quantity	−0.35	$5.00 \times 10^{-1}$
	Cost of water (month) (INR)	0.36	$3.59 \times 10^{-1}$
	Household size	−5.53	$8.65 \times 10^{-1}$
	Monthly income (INR)	−0.002	$6.21 \times 10^{-1}$
	Water source—11	378.66	$1.10 \times 10^{-1}$
	Water source—12	175.36	$5.29 \times 10^{-1}$
	Water source—13	255.77	$5.27 \times 10^{-1}$
	Water source—14	155.25	$5.80 \times 10^{-1}$
	Water source—21	244.94	$5.37 \times 10^{-1}$
	Water source—31	70.35	$9.54 \times 10^{-1}$
	Water source—32	393.21	$8.71 \times 10^{-1}$
	Water source—42	−178.45	$9.41 \times 10^{-1}$
	Water source—61	296.42	$4.57 \times 10^{-1}$
	Water source—72	411.64	$1.49 \times 10^{-1}$
	Water source—91	72.21	$7.04 \times 10^{-1}$
	Water source—92	299.05	$8.62 \times 10^{-1}$
	Water source—99	0	
Daily drinking water consumption excluding the “How the ES was obtained” variable	Area—peri urban	280.59	$5.50 \times 10^{-2}$
	Area—rural	170.27	$2.79 \times 10^{-1}$
	Area—urban	0	
	Social class—General	172.12	$7.07 \times 10^{-1}$
	Social class—Other Backward Class (OBT)	214.90	$6.24 \times 10^{-1}$
	Social class—Scheduled caste	43.52	$9.22 \times 10^{-1}$
	Social class—Scheduled tribes	79.28	$8.68 \times 10^{-1}$
	Social class—other	0	
	Residency status—owner	−22.14	$9.52 \times 10^{-1}$
	Residency status—tenant	40.11	$7.39 \times 10^{-1}$
	Residency status—other	0	
	Number of different water sources	16.75	$9.13 \times 10^{-1}$
	Daily water quantity	−0.81	$1.50 \times 10^{-1}$
	Cost of water (month) (INR)	0.04	$9.13 \times 10^{-1}$
	Household size	−20.79	$5.72 \times 10^{-1}$
Monthly income (INR)	$-1.03 \times 10^{-5}$	$9.98 \times 10^{-1}$	
	Area—peri urban	137.14	0.58
	Area—rural	−61.07	0.81
	Area—urban	0	



Table A7. Cont.

Ecosystem Service Variable	Parameter	Coefficient	p-Value
Sanitation	Social class—General	56.89	0.78
	Social class—Other Backward Class (OBT)	136.81	0.49
	Social class—Scheduled caste	49.07	0.80
	Social class—Scheduled tribes	24.83	0.90
	Social class—other	0	
	Residency status—owner	−30.21	0.88
	Residency status—tenant	−7.54	0.97
	Residency status—other	0	
	Household size	−4.50	0.79
	Monthly income (INR)	xx	0.52
	Place of the toilet—1	114.46	0.73
	Place of the toilet—2	42.08	0.92
	Place of the toilet—3	−90.00	0.88
	Place of the toilet—4	31.08	0.94
	Place of the toilet—99	0	
	Type of the toilet—11	−207.09	0.59
	Type of the toilet—12	−223.53	0.60
	Type of the toilet—13	−191.53	0.81
	Type of the toilet—14	−153.13	0.72
	Type of the toilet—22	−15.67	0.96
	Type of the toilet—23	−119.91	0.92
	Type of the toilet—31	−156.16	0.90
	Type of the toilet—32	479.72	0.43
	Type of the toilet—41	−108.15	0.87
	Type of the toilet—99	0	
	Type of the toilet × Area—PU × 11	−128.47	0.64
	Type of the toilet × Area—PU × 12	11.58	0.97
	Type of the toilet × Area—PU × 13	−162.7	0.84
	Type of the toilet × Area—PU × 14	−38.190	0.92
	Type of the toilet × Area—PU × 22	−263.48	0.35
	Type of the toilet × Area—PU × 23	−96.66	0.94
	Type of the toilet × Area—PU × 31	−263.99	0.88
	Type of the toilet × Area—PU × 32	−817.60	0.37
	Type of the toilet × Area—PU × 41	−112.39	0.88
	Type of the toilet × Area—PU × 95	0	
	Type of the toilet × Area—R × 11	48.32	0.91
	Type of the toilet × Area—R × 12	182.51	0.58
	Type of the toilet × Area—R × 13	46.93	0.95
	Type of the toilet × Area—R × 14	72.79	0.89
	Type of the toilet × Area—R × 22	90.56	0.75
	Type of the toilet × Area—R × 23	35.70	0.98
Type of the toilet × Area—R × 32	0		
Type of the toilet × Area—R × 41	227.27	0.77	
Type of the toilet × Area—R × 95	0		
Type of the toilet × Area—U × 11	0		

Table A7. Cont.

Ecosystem Service Variable	Parameter	Coefficient	p-Value	
Rice	Type of the toilet × Area—U × 12	0		
	Type of the toilet × Area—U × 13	0		
	Type of the toilet × Area—U × 14	0		
	Type of the toilet × Area—U × 22	0		
	Type of the toilet × Area—U × 23	0		
	Type of the toilet × Area—U × 31	0		
	Type of the toilet × Area—U × 41	0		
	Type of the toilet × Area—U × 95	0		
	Area—peri urban	95.13	0.31	
	Area—rural	397.31	$6.00 \times 10^{-5}$	
	Area—urban	0		
	Social class—General	110.10	0.75	
	Social class—Other Backward Class (OBT)	283.46	0.38	
	Social class—Scheduled caste	287.42	0.38	
	Social class—Scheduled tribes	263.68	0.45	
	Social class—other	0		
	Residency status—owner	−64.91	0.81	
	Residency status—tenant	−92.38	0.74	
	Residency status—other	0		
	Household size	6.62	0.81	
	Monthly income (INR)	0.01	$7.03 \times 10^{-3}$	
	Rice source—themselves	−168.82	0.12	
	Rice source—via friend	−71.38	0.88	
	Rice source—via relative	2006.97	$5.61 \times 10^{-12}$	
	Rice source—via seller	0		
	Rice purchased cost (INR)	−4.51	0.05	
	Fuelwood	Area—peri urban	−25.96	0.95
		Area—rural	312.06	0.58
Area—urban		0		
Social class—General		1153.95	0.52	
Social class—Other Backward Class (OBT)		1237.03	0.41	
Social class—Scheduled caste		1108.40	0.44	
Social class—Scheduled tribes		720.68	0.64	
Social class—other		0		
Residency status—owner		365.51	0.59	
Residency status—tenant		−94.71	0.87	
Residency status—other		0		
Household size		110.50	0.41	
Monthly income (INR)		$2.38 \times 10^{-4}$	0.99	
Fuelwood source—themselves		−1148.15	0.59	
Fuelwood source—via relative		580.72	0.81	
Fuelwood source—via seller		0		
Fuelwood purchased cost (INR)		−10.27	0.95	

Table A7. Cont.

Ecosystem Service Variable	Parameter	Coefficient	p-Value
Fish	Area—peri urban	30.33	0.95
	Area—rural	703.71	0.22
	Area—urban	0	
	Social class—General	3167.83	0.01
	Social class—Other Backward Class (OBT)	188.85	0.85
	Social class—Scheduled caste	146.81	0.89
	Social class—Scheduled tribes	405.21	0.75
	Social class—other	0	
	Residency status—owner	199.51	0.87
	Residency status—tenant	13.23	0.99
	Residency status—other	0	
	Household size	98.98	0.50
	Monthly income (INR)	0.02	0.18
	Fish source—via relative	−513.12	0.56
	Fish source—via seller	0	
	Fish purchased cost (INR)	0.22	0.93
	Recreation	Area—peri urban	730.30
Area—rural		283.64	0.37
Area—urban		0	
Social class—General		473.64	0.79
Social class—Other Backward Class (OBT)		455.20	0.80
Social class—Scheduled caste		480.61	0.79
Social class—Scheduled tribes		642.43	0.73
Social class—other		0	
Residency status—owner		121.75	0.88
Residency status—tenant		215.47	0.79
Residency status—other		0	
Household size		−75.31	0.40
Monthly income (INR)		$-5.10 \times 10^{-3}$	0.67
Aesthetic	Area—peri urban	255.04	0.01
	Area—rural	311.61	$3.30 \times 10^{-3}$
	Area—urban	0	
	Social class—General	262.45	0.66
	Social class—Other Backward Class (OBT)	290.43	0.62
	Social class—Scheduled caste	145.07	0.80
	Social class—Scheduled tribes	534.47	0.39
	Social class—other	0	
	Residency status—owner	148.93	0.60
	Residency status—tenant	192.29	0.51
	Residency status—other	0	
	Household size	6.17	0.84
	Monthly income (INR)	$-3.81 \times 10^{-3}$	0.34

Table A7. Cont.

Ecosystem Service Variable	Parameter	Coefficient	p-Value
Spirituality	Area—peri urban	154.42	0.42
	Area—rural	58.68	0.76
	Area—urban	0	
	Social class—General	133.27	0.88
	Social class—Other Backward Class (OBT)	232.15	0.80
	Social class—Scheduled caste	8.09	0.99
	Social class—Scheduled tribes	221.83	0.82
	Social class—other	0	
	Residency status—owner	39.84	0.93
	Residency status—tenant	27.63	0.95
	Residency status—other	0	
	Household size	−16.96	0.77
	Monthly income (INR)	$-7.36 \times 10^{-3}$	0.34

Table A8. Direct and indirect access to ES.

Ecosystem Service Variable	Parameter	Coefficient	p-Value
The percentage of people getting water indirectly	Area: Peri urban	17.87	$1.10 \times 10^{-3}$
	Area: Rural	4.00	0.42
	Area: Peri urban	0	
The percentage of people with direct access to a toilet	Area: Peri urban	55.39	$2.67 \times 10^{-14}$
	Area: Rural	75.85	$2.25 \times 10^{-20}$
	Area: Peri urban	0	

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