**European Journal of Public Health Studies** 



ISSN: 2668 - 1056 ISSN-L:2668 - 1056 Available on-line at: <u>www.oapub.org/hlt</u>

DOI: 10.46827/ejphs.v7i1.166

Volume 7 | Issue 1 | 2024

# HOUSEHOLD WATER INSECURITY EXPERIENCES (HWISE) SCALE: THE PROTOCOL OF CULTURAL ADAPTATION AND STATISTICAL VALIDATION

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#### Abstract:

Annually Sri Lanka experiences substantial rainfall; but, the availability of water within the island nation is unbalanced. Lack of an appropriate system view, suitable nationallevel policy, and bimodal rainfall have resulted in Sri Lankans experiencing medium to high water stress. Considering the impact individual households have to endure due to the unavailability of water, the following study presents a protocol to culturally adapt and statistically validate the Household Water Insecurity Experiences (HWISE) scale to the Sinhala language. The protocol critically discusses the application of classical test theory (CTT) and item response theory (IRT) and documents all relevant steps for the scale validation process. Through this study protocol, the authors attempt to demonstrate the procedural rigor of the adaptation and validation process of the HWISE scale to the Sinhala language in Sri Lanka. The availability of a valid scale to evaluate household water insecurity experiences will assist public health experts, policymakers, and the government in understanding the nature and severity of water stress and the consequences across health, economic, and psychosocial contexts. Similarly, preventative interventions and key policies could be implemented to further support the initiatives of responsible authorities.

**Keywords:** household water insecurity, classical test theory, item response theory, psychometrics, graded response model

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#### 1. Introduction

Water is vital for the survival of all beings and crucial for human health and well-being. It is fundamental for the sustenance of agriculture, industry, economic productivity, and political stability of a country (Kangmennaang & Elliott, 2023; United Nations (UN), 2023). Water may also hold cultural significance and symbolic meanings in some communities (Jepson et al., 2017; Popkin et al., 2010; Rosinger and Young, 2020). Despite its importance, between 2 billion to 3 billion people around the globe annually experience shortages of water for at least one month (UNESCO, 2023). It is estimated that 2 billion people around the world lack access to safe drinking water while 3.6 billion lack access to safe sanitation (UNESCO, 2023). Shortages persist as only 3% of Earth's surface water is available as freshwater; and about 30% of the available freshwater is appropriate for human use (Hannah et al., 2020). Since the water sources are not distributed equally across the globe, at present, the Middle East, North Africa, and South Asia experience the highest water stress (Kuzma et al., 2023). This may be exacerbated as a result of the growing population, burgeoning demand, climate change, floods, droughts, surge in agricultural interventions, and degradation of water infrastructure (Abbott et al., 2019; Kangmennaang & Elliott, 2021; Miller et al., 2020).

In the region of South Asia, in comparison to some other countries, the island country Sri Lanka is not widely known to experience water scarcity. However, Sri Lanka experiences an unbalanced water availability with water deficits and surfeits across its climatic zones (Figure 1).



Figure 1: Annual rainfall of Sri Lanka in millimeters (Department of Meteorology, 2019)

This temporal and spatial variability of water occurs primarily due to the bimodal nature of the country's annual rainfall (Chandrasekara *et al.*, 2021; Gunatilaka, 2008). Additionally, about 50% of the country does not occupy sufficient amounts of groundwater. Sri Lanka's higher population density (353/km<sup>2</sup>) with an approximate population of 22.156 million may further add to the identified insufficiency of consumable water. However, the island nation predominantly houses a rural population where only 19% of its populace resides in urban settings (Sri Lanka Department of Census and Statistics, 2021; World Bank, 2022). In Sri Lanka, the majority of water precipitation is through rainfall. The driest parts (dry zone) in the country receive an annual mean rainfall of under 900mm, while the wettest parts (wet zone) receive over 5000mm (Department of Meteorology, 2019; Gunatilaka, 2008). In 2022, only 89% of the total population had at least basic drinking water services, while only 85.35% of the total population had basic handwashing facilities including soap and water (Word Bank, 2022).

Currently, Sri Lanka has a level three or medium to high (20% - 40%) water stress from the six-level indicator for baseline water stress (Kuzma et al., 2023). Calculating water stress (water demand to renewable supply ratio) is particularly important as it aids in measuring the competition in a country for its local water resources. Gunatilaka (2008) also highlighted that the limited groundwater available in Sri Lanka is at risk of overexploitation. Potential driving factors may include the use of well water for daily requirements by a majority of the rural population and the upward trend of groundwater extraction for agricultural purposes. The risk of overexploitation may be aggravated due to no-fee access to irrigation water, double cropping of rice, and high wastage of water (Gunatilaka, 2008). It is important to note that 85% of the country's water is used by the irrigation sector, of which, 70% is used for paddy cultivation. During the primary cultivation season, which spans from September to March, paddy cultivation is practiced at 100%. During the May to August cultivation season, paddy cultivation is practiced again in combination with other crops (Chandrasekara et al., 2021). Besides, Gunatilaka (2008) predicted that the top four highest-populated districts (Colombo, Gampaha, Kurunegala, Kandy), Jaffna, and Puttalam districts would be at the highest risk of depletion of water resources.

# 1.1 Significance of water insecurity

As Jepson *et al.* (2017) and Young *et al.* (2019b) identify, the condition of water insecurity occurs when the affordability, reliability, adequacy, and safety of water are diminished significantly or become unattainable to potentially threaten the physical-mental wellbeing of individuals with hindrances or impediments to engagement in social, cultural, and productive activities. In 2022, at least 1.7 billion people were using a drinking water source contaminated with feces globally (World Health Organization (WHO), 2023). When the available water is of poor quality or contaminated microbiologically, the risk of transmission of diarrheal diseases, dysentery, cholera, typhoid, and polio could increase (WHO, 2023). Besides, globally, diarrheal diseases are the second largest contributor to the mortality of children under 5 years of age (WHO, 2017). Contaminated water, though not microbiologically, may increase exposure to high levels of inorganic arsenic, potentially leading to chronic arsenic poisoning (WHO, 2022). The potential impacts may encompass cancer and skin lesions. If exposed in utero and early childhood, the cognitive development of the child could be affected negatively and could increase deaths in young adults (WHO, 2022).

Similar to having safe water, accessing safe water is equally important. When the available water is further away, water fetching may take extended periods resulting in a loss of time to engage in income-generation activities for families and to attend school for children. Women and children are the most affected due to water scarcity because they tend to hold the responsibility of water fetching (UNICEF, 2020). UNICEF (2020) further identified that girls tend to be at a greater disadvantage due to water shortages, especially in schools. As water fetching limits income generation activities, the purchasing power of households may also diminish. As a result, families may be forced to choose between purchasing water, food, effective ways to irrigate crops, and raising livestock (Hannah et al., 2020). Due to water scarcity, individuals may not be able to engage in social, cultural, and productive activities and fulfill duties. They may also experience feelings of embarrassment and social shame. These hindrances and negative experiences may potentially lead to elevated levels of frustration, anxiety, and depression in individuals (Kimutai et al., 2023). In extreme situations, water insufficiency may elicit rumination and suicidal ideation (Kangmennaang & Elliott, 2021). As Kangmennaang & Elliott (2021) further highlight, the distress due to water scarcity may be more pronounced in women. This may be underpinned by the culturally constructed gender roles that dictate women in the household to engage more in negotiating access to safe water. As a result, it may expose women to harsh weather conditions, quarrels, and accidents, and may also subject them to an increased risk of assault and rape en route to the water source (Kimutai et al., 2023).

#### 1.2 Assessing water insecurity - The Household Water Insecurity Experiences Scale

The experiences of households concerning water scarcity can be measured through the scale, Household Water Insecurity Experiences (HWISE). It is the first scale to equivalently quantify household water insecurity experiences across both middle-income countries and low-income countries. The HWISE scale can be utilized in different geographic regions, water-provisioning settings, and cultures as it can comparably measure key universal household water insecurity experiences despite any contextual diversity. The scale was originally developed by the HWISE Research Coordination Network (RCN) in the English language. Currently, the HWISE scale is available in more than fifty languages. A four-item shortened version of the HWISE scale is also available (Northwestern University Institute for Policy Research, 2019a; Young *et al.*, 2019a).

The scale examines water insecurity experiences of households within the past four weeks across four components, that is, *accessibility*, *adequacy*, *reliability*, and *safety*. It requires generally around four minutes to administer the scale. The HWISE scale is comprised of simple worded questions under the twelve labels, (1) Worry, (2) Interrupt, (3) Clothes, (4) Plans, (5) Food, (6) Hands, (7) Body, (8) Drink, (9) Angry, (10) Sleep, (11) None, and (12) Shame. The responses to each item include if 0 times - 'never', if 1 to 2 times -'rarely', if 3 to 10 times – 'sometimes', if 11 to 20 times – 'often', and if more than 20 times – 'always'. The responses will be coded as 'never' -0, 'rarely' -1, 'sometimes' -2, and 'often/always' - 3. The coded values for all 12 items will be summed to obtain the scale score for each household, which may range from 0 to 36. A household with a scale score of 12 or above will be considered water-insecure as it is recognized as the provisional cutpoint for a water-insecure household (Young et al., 2019a; Young et al., 2019b). The HWISE scale can be administered to individuals aged 16 or 18 years and above who identify themselves to be knowledgeable about water acquisition and use in their households. The scale will be administered in the language preferred by the respondent, subjected to the availability of a culturally adapted and statistically validated HWISE scale (Young et al., 2019a; Young et al., 2019b). As per the findings of Young et al. (2019a), the HWISE scale is highly reliable with internal consistency reliability ranging from Cronbach's  $\alpha$  .84 to  $\alpha$ .93. Despite the scale's consideration of four unique components in the development, it is intended to be used as a unidimensional scale.

The HWISE scale allows both the identification of determinants of water insecurity and the assessment of consequences of household water insecurity across health, economic, and psychosocial contexts, including food insecurity. It further facilitates the identification of vulnerable subpopulations within communities. The HWISE scale can be adopted for large-scale monitoring and evaluation due to the relative easiness of administering. The data generated with the use of the HWISE scale can be utilized in selecting water-related programs, implementing technologies and policies, and evaluating the impact and cost-effectiveness of interventions. Furthermore, the scale would facilitate identifying and monitoring any trends between climate variation, political changes, economic changes, social changes, and water insecurity (HWISE Research Coordination Network, 2019).

### 1.3 Present study

The HWISE scale, though used in numerous settings, has not been culturally adapted to Sri Lanka. Thus, the present study attempts to culturally adapt the HWISE scale to Sri Lanka by translating it into the Sinhala language and analyzing the psychometric properties of the translation. The scale will be tested for its psychometric properties through both classical test theory (CTT) and item response theory (IRT). Specific statistical tests under CTT include reliability testing and validity testing. Validity for the scale will be established through predictive validity, convergent validity, discriminant validity, and internal structural validity. IRT includes the use of a graded response model (GRM) to assess individual items.

#### 1.4 Significance of the study

Translation of the HWISE scale into the Sinhala language will facilitate the identification of water insecurity experiences of households in Sri Lanka, including its determinants and consequences across health, economic, and psychosocial contexts. It will further assist researchers, public health experts, policymakers, and the government in identifying vulnerable subpopulations within the Sinhala-speaking communities, potential effective interventions to improve household water insecurity, impact and costeffectiveness of interventions, and mitigate negative consequences. Similarly, the mainstream use of IRT analyses for scale validation in Sri Lanka is scarce. Accordingly, this study will also function as a step-by-step guide for researchers intending to learn both CTT and IRT for scale adaptation and validation.

### 2. Methods

### 2.1 Study design

The present study aims to culturally adapt and statistically validate the HWISE scale to the Sinhala-speaking community in Sri Lanka by (1) *Translating the HWISE scale into the Sinhala language* and (2) *Analyzing the psychometric properties of the translation*. The process of cross-cultural adaptation is guided by Gronier (2022) and Scholz *et al.* (2002).

### 2.2 Translation of scale

### 2.2.1 Preparation of Version 1

The permission to translate the original HWISE scale into the Sinhala language was obtained from Dr. Sera L. Young on behalf of the developers of the HWISE scale. Since permission was granted, the original English version of the HWISE scale will be translated into the Sinhala language (forward translation) by the researchers N.C.S and J.S.N independently. Both researchers are native speakers of Sinhala and are fluent in both Sinhala and English languages. The translation will be performed to reach conceptual equivalence between the original English version and the Sinhala translation of the HWISE scale. Once the forward translation is completed, the research team will examine the two Sinhala translations for any discrepancies. Any discrepancies will be resolved by discussion and consensus-based decisions. The initial Sinhala translation of the HWISE scale will be finalized and will be named *Sinhala HWISE Version 1*.

### 2.2.2 Preparation of Version 2

The *Sinhala HWISE Version 1* will be translated back into the English language (backtranslation) by two translators fluent in both Sinhala and English languages independently. The translators will not be familiar with the original HWISE scale or the concepts involved with the scale. Back-translation will aim to assess whether the contents of the items in the Sinhala translation reflect the original English version. Once the backtranslation is completed, the research team will examine the two back-translations against the original English version. Back translation is especially important to meet requirements for content validation. In all scale adaptation processes, finding the ideal equivalent word for an English word in the destination language is not possible (i.e., words such as 'coping,' 'stigma,' etc. are often difficult to translate accurately). In such instances, the next most appropriate word will be chosen. The same steps may apply for certain phrases (i.e., 'how frequently') of the present scale. However, any required amendments to *Sinhala HWISE Version 1* will be made through discussion and consensus-based decisions. The resulting Sinhala translation of the HWISE scale will be named *Sinhala HWISE Version 2*.

### 2.2.3 Preparation of Version 3

A panel of experts in the areas of public health, psychometrics, linguistics, cross-cultural adaptation of scales, and community-based research will be assembled. The experts in the panel will independently review each item of the *Sinhala HWISE Version 2* against the corresponding item of the original English scale. Experts will rate each item of the *Sinhala HWISE Version 2* on a 1 – 10 Likert scale to facilitate the assessment of content and consensual validity of all items. To enable this step in the scale adaptation, a content validation technique named Delphi will be used (de Zoysa *et al.*, 2007). In the Delphi process, each item (Table 1) will be assessed by the chosen group of experts under five criteria to evaluate content and consensual validity. If more than 70% of the aggregate scores of all experts for any of the criteria for a given item fall below 3, the items will be subjected to revisions. Changes to the Sinhala *HWISE Version 2* at this stage will be discussed in a panel discussion and *Sinhala HWISE Version 3* will be finalized through consensus-based decisions.

### 2.3 Pre-test of Sinhala HWISE Version 3

A pre-test will be conducted to assess the appropriateness of *Sinhala HWISE Version 3* in facilitating the investigation of household water insecurity experiences as originally intended by the English HWISE scale. The pre-test will further assist authors in assessing the difficulties research participants may encounter while completing the 12-item scale. Common problems may include incomprehensible words which could result due to limited context items may provide to some individuals. In such instances, the researchers will seek the assistance of the expert panel and a consensus-based decision will be taken to fine-tune the scale further.

Items in HWISE	Content-related validation		Consensual-related validation		
	Appropriateness of language used	Assessment of the concept	Retains the conceptual meaning	Appropriateness with individuals of 18 years and above	Cultural relevance
1. Item 1	(1-10)	(1-10)	(1-10)	(1-10)	(1-10)

Table 1: Delphi process to establish content validity

**Note:** Only 1 item is displayed in the above example. In the original validation process, all 12 items will be listed in a similar table to proceed with content validation.

#### 2.4 Final version of Sinhala HWISE scale and demographic questions

Upon finalizing the scale, a demographic questionnaire will also be constructed to gather other relevant data from all informants. The demographic questionnaire will contain a series of qualifier questions that will help researchers filter participants to fit the identified sampling frame (Section 2.4.1.). After the qualifiers, the participants will answer questions about their gender, age, profession, area of residence, availability of water resources, time to the nearest water resource, difficult experiences associated with securing usable water to the household, and any injuries participants have encountered while fetching water. The questions to include in the demographic questionnaire will further be decided based on the original HWISE scale validation of Young *et al.* (2019a) and other pertinent contemporary research. Some of the questions will contain a fixed number of polytomous responses while a few may remain open-ended. The answers to open-ended questions will aid in descriptive statistical analyses and validity testing.

#### 2.4.1 Sample

The *Sinhala HWISE Version 3* will be administered among individuals of age 18 years and above, who have knowledge about water acquisition and use in their households. The qualifier questions of the demographic questionnaire will be based on the inclusion criteria specified in the preceding sentence. In addition to the above, to improve the efficiency and the accuracy of the sampling process, Azam *et al.* (2021) recommend identifying the target population to recognize the sampling frame which includes elements within the sample that will be selected for the study. Further information related to the sampling strategy is given in Table 2.

As per the report by the Sri Lanka Department of Census and Statistics (2021), approximately 13 million Sri Lankans are between the ages of 18 and 69. Considering the approximate average number of people within a house is 4, the estimated number of houses could be more or less in the vicinity of 3 – 5 million. Since the majority of Sri Lankans live in rural settings, the data will be collected mostly in rural areas. Considering the highest rainfall is reported in the wet zone, the data will mostly be collected from households in the dry zone and the semi-arid zones which also have much less population density compared to the wet zone. Accordingly, the sample size for this study will be considered based on the sample-to-item ratio suggested by Castello & Osborne (2005), Gorsuch (1983), and Memon et al. (2020). The recommended minimum sample required per item as per the above sample-to-item ratio is 5:1. However, in most instances' researchers consider 10:1 and 20:1 ratios as well. As per Costello & Osborne (2005), the chances of obtaining the appropriate factor structures are 70% at 20:1 whereas it is 60% for 10:1 and 40% for 5:1. This sample size calculation ratio is considered for studies with exploratory factor analysis (EFA) and principal component analysis (PCA). In that sense, at 20:1, a minimum of 240 participants will be required for this study. However, to increase the reliability of the study, the researchers of the present study will seek a sample of 300.

Component	Explanation			
Target	Sri Lankans 18 years and above who live with their families and share substantial			
population	responsibilities with them in their respective households will be considered for this			
	study. Individuals who may live in hostels, residence halls, etc. will not be			
	considered. Both mother and father of a nuclear family, and adults of an extended			
	family who share key responsibilities in the household also qualify to take part in			
	this study.			
Sampling unit	Households (not more than 1 qualifying person from a single household).			
Sampling	A list of registered households in Sri Lanka from government records that are			
frame	accessible to researchers.			
Sampling	Systematic sampling will used to identify a few locations representing the three			
technique	major climatic zones of Sri Lanka. Within each zone, households will be randomly			
	selected to meet individuals who may qualify to take part in the present study.			
Sample size	Sample-to-item ratio (20:1) as suggested by Costello & Osborne (2005), Gorsuch			
calculation	(1983), and Memon <i>et al.</i> (2020).			

#### **Table 2:** Sampling strategy for the statistical validation of HWISE scale

### 2.4.2 Data collection

Each potential respondent will be provided with study information and if willing to participate, each respondent will be provided with a consent form. The consent form will include a space to write the first letter of the participant's first name, the first letter of the participant's last name, the birth month, and the birth year. The intention is to generate a unique code for each participant in an attempt to isolate the answer script if the respondent wishes to withdraw their data from the study. Participants will be able to withdraw from the study at any time within a time frame of two weeks from the day of submission of responses to the demographic questionnaire by requesting the research team and providing their unique code to the research team. Further, participants will be informed to refrain from including any personal information such as name, surname, and so forth to maintain anonymity. Only upon receiving informed consent, the participant will be provided with Sinhala HWISE Version 3. The scale will be self-administered. Once the participant completes their responses, the participant will be provided with a large envelope where the answer script could stay along with the answer scripts of other participants. The study will also administer Sinhala HWISE Version 3 online using Google Forms to gather data from areas that the authors of the present study find difficult to travel. In instances of online data collection, all previously described good practices will be implemented.

#### 2.4.3 Data storage

All envelopes containing answer scripts will be placed securely in a locked drawer in a locked room, to which only the research team will have access. All digitized data (including data from Google Forms) will be placed in a password-protected folder in a password-protected computer, to which only the research team will have access. All participants will be provided with the contact details of the researcher N.C.S to contact if they wish to withdraw their data from the study. Data from participants who may wish

to withdraw from the study will be destroyed securely. Answer scripts will not be shared with anyone and will be kept confidential.

### 2.5 Data analysis

The collected data will be first entered into Microsoft Excel. Upon adding data to Microsoft Excel, the researchers will first conduct a thorough data cleaning process to remove entries with missing data. The answers of each participant will be further checked for unusual answer combinations. In instances where the data is collected via Google Forms, the time taken by respondents to complete the scale will also be assessed to potentially exclude any entries that do not at least have utilized a reasonable amount of time (i.e., not at least 45 seconds). Similarly, researchers will assess qualifier questions to eliminate respondents who may not qualify to take part in the study at this stage (i.e., those who live in hostels and resident halls). After this careful data-cleaning process, authors will transfer the data to R Studio where the descriptive analyses and other inferential statistical measures will be performed.

### 2.5.1 Descriptive statistical analyses

After transferring the Excel file into R Studio, the authors will conduct a series of descriptive analyses using demographic questions listed in the questionnaire. Once this process is completed, summary statistics will be obtained to assess the HWISE scale scores for the sample. For this purpose, a new variable with the aggregated score from each HWISE scale item for every individual household will be created. The summary statistics function helps authors evaluate the overall HWISE scale scores of the sample against measures of central tendency, dispersion, and normality. The following analyses will be performed using the 'pacman' package of R Studio, which is a package that offers a variety of descriptive analyses for researchers (Selvaratnam, 2023).

# 2.5.2 Classical test theory (CTT)

# 2.5.2.1 Principal component analysis (PCA)

Scales can be validated using CTT and item response theory (IRT). CTT includes reliability analysis, exploratory factor analysis (EFA), confirmatory factor analysis (CFA), and other forms of validity documenting (i.e., predictive validity, convergent validity, etc.). To proceed with the identified analyses, researchers will consider 'pacman', 'dplyr', 'psych' packages on R Studio. The EFA process will start with the Kaiser-Meyer Olkin (KMO) Index, which evaluates the adequacy of the sample to undergo factor analysis (Field, 2000; Shrestha, 2021). The KMO value ranges from 0 - 1, and adequacy is indicated if the resulting statistic exceeds 0.6.

After completing the assessment on sampling adequacy, the next step in the statistical validation process will be generating a correlation matrix for all 12 items of the scale. The primary objective of creating a correlation matrix is to observe possible signs of multicollinearity, which is when items indicate strong intercorrelations. Generally, correlations above .8 among two items could be considered a sign of multicollinearity

(Bergqvist *et al.*, 2020). Since the original scale is unidimensional, researchers will also look for any possible negative correlations or poor correlations (correlations below .2). Either of negative or poor correlations could imply errors in the translation process. In such instances, the scale's content validation process will be revisited. However, more information on individual items can be further studied through reliability analysis (see section 2.5.2.2). If the correlation matrix fails to indicate any problems, Bartlett's test of sphericity will be performed. Bartlett's test of sphericity checks the suitability of conducting a factor analysis by comparing the current correlation matrix to an identity matrix (Field, 2000). An identity matrix is when items considered for analysis are unrelated. As a result, the sphericity test has to be statistically significant indicating that the current correlation matrix significantly diverges from an identity matrix and is suitable to undergo factor analysis. Both the KMO index and Bartlett's test of sphericity are statistical measures to assess the factorability of the collected data (Shrestha, 2021).

After the KMO index and sphericity test computations, the next step is to observe the internal factor structure of the scale. Although the original scale of Young et al. (2019a) has yielded a unidimensional solution, the Sinhala HWISE scale still requires a factor structure exploration due to possible cross-cultural effects. To evaluate the internal structure, principal component analysis (PCA) will be employed. PCA is a form of dimension reduction that helps to identify the number of dimensions, components, or latent factors in a scale (Santos et al. 2019; Yong & Pearce, 2013). The significance of each component is assessed through the Kaiser-Guttman eigenvalue criterion (Yong & Pearce, 2013, p. 85). According to the Kaiser-Guttman eigenvalue criterion, components that generate an eigenvalue above 1.0 will be considered significant components. The significant components can also be visualized using a scree plot. The PCA will be performed according to the methodology used by Scholz et al. (2002) study on observing psychometric properties of the generalized self-efficacy scale. Any significant component that fails to retain at least 3-factor loadings, and is incapable of explaining a minimum of 5% of the total variance of the observed variables will not be considered a significant component as per the guidelines of Scholz et al. (2002). In the present study, authors expect a unidimensional solution. However, in the instances of a multi-factor solution, an oblique rotation will be performed to further look for unidimensionality (Figure 2).

### 2.5.2.2 Reliability and item-total correlation

Followed by PCA, Cronbach's alpha ( $\alpha$ ) will be computed to find the internal consistency reliability of the HWISE scale. Generally,  $\alpha$  above 0.7 is considered acceptable (Taber, 2018). The raw reliability score of the scale will be further interpreted using Feldt and Duhachek's reliability estimates, Guttman Lambda 6 (G6), signal-to-noise (S/N) ratio, and average standard error (ASE). The purpose of each of the above interpretations is listed in the table below (Table 3).

Table 5: Reliability statistics and interpretations				
Type of				
reliability	Purpose			
statistic				
	Felt and Duhachek estimates provide a lower and upper bound for $\alpha$ with 95%			
Feldt and	confidence. The main reason to check this is due context-dependent variability of $\alpha$ .			
Duhachek	For example, a scale with $\alpha$ = .83 may vary between .81 (lower bound) and .85 (upper			
estimates	bound) based on its standard error. Since the lowest bound is .81, this also means that			
	the measure could get contaminated up to 19% (Iacobucci & Duhachek, 2003).			
Guttman	G6 is an alternative measure of reliability. Higher scores indicate higher reliability			
Lambda (G6)	(Isernia <i>et al.</i> , 2022).			
Signal-to-	S/N ratio assesses the true score variance to the error variance. Resulting scores			
Noise (S/N)	between 3 – 4 are generally considered acceptable as lower scores (closer to zero)			
ratio	suggest more error (Cronbach & Gleser, 1964).			
Average	ASE provides an estimate of the precision of the reliability estimate. Lower values			
Standard	closer to 0 are considered acceptable (Duhachek & Iacobucci, 2004). This also helps in			
Error (ASE)	determining the confidence estimates of alpha (Iacobucci & Duhachek, 2003).			

#### **Table 3:** Reliability statistics and interpretations

Further, the raw correlation between each item and the total score will also be inspected. This could further indicate the strength and the direction of the linear relationship between each item and the scale. This would also support the quality of the items in the scale, and it would assist in comprehending how much influence each item possesses in identifying individuals who associate the most with the latent trait (Wang *et al.*, 2017).



### 2.5.2.3 Confirmatory factor analysis (CFA)

After EFA, the authors will conduct CFA to assess the model fit for the obtained data. Figure 2 displays the model for the CFA of the Sinhala HWISE scale. Compared to EFA, CFA is a restricted factor model and it cannot be rotated. As a result, the model will be tested using the comparative fit index (CFI), root mean square error of approximation (RMSEA), and the normed chi-square ( $\chi^2$ ). The values should be around 2.0 or less for the normed chi-square, less than .08 for RMSEA, and greater than .90 for CFI (Wickrama *et al.* 2023).

#### 2.5.2.4 Construct validity

To display predictive validity, the HWISE scale score will be correlated with the satisfaction with life scale by Ed Diener (Espejo *et al.*, 2021). Convergent validity will be tested by analyzing the association between HWISE scale score and distance to a water source. Similarly, discriminant validity will be evaluated by comparing the HWISE scale score for individuals who have experienced and who have not experienced injuries while fetching water. The simple mean comparison can be achieved through a between-groups t-test. The mean comparison could display individuals with higher water insecurity experiences to encounter more injuries compared to those who do not have exposure to water insecurity. If the authors of the present research could demonstrate a unidimensional solution with predictive, convergent, and discriminant validity satisfactorily, the scale will meet construct validity.

### 2.5.3 Item response theory and latent trait modeling (LTM)

Once the CTT procedures are completed, the researchers will assess the Sinhala HWISE scale's psychometric properties through an IRT model. The original research by Young *et al.* (2019a) used a Rasch model for IRT analysis. Generally, the Rasch model is used for items with dichotomous answer options. Rasch model considers two parameters, probability and ability of an item. Rasch model can be written as follows.

$$\Pr(X_{ij} = 1) = \frac{e^{(\eta_i - \alpha_j)}}{1 + e^{(\eta_i - \alpha_j)}}$$

In the Rasch model,  $Pr(X_{ij} = 1)$  represents the probability an individual *i* will respond correctly to item *j*. Here,  $\eta_i$  is the ability of the person *i* while  $\alpha_j$  is the difficulty parameter specific to item *j* (Selvaratnam *et al.*, 2018). The Rasch model offers insights into the scoring accuracy of items but lacks a discrimination parameter, preventing differentiation between items in terms of their ability to gauge individuals' positions on the latent trait (An & Yung, 2014). The discrimination parameter present in the two-parameter logistic (2PL) model indicates an item's capacity to distinguish individuals who best align with the latent trait being investigated. The 2PL model also aids in understanding the relative effectiveness of items in discriminating between individuals with varying abilities. The 2PL model can be written as follows.

$$\Pr(X_{ij} = 1) = \frac{e^{\lambda_j(\eta_i - \alpha_j)}}{1 + e^{\lambda_j(\eta_i - \alpha_j)}}$$

Within the 2PL model,  $\lambda_j$  represents the discrimination parameter specific to item *j*. Similar to the Rasch model, the 2PL model is suitable for measuring items with binary response options. However, to accommodate items with polytomous data, the graded response model (GRM) offers a solution. GRM incorporates ability, difficulty, and discrimination parameters to evaluate items with multiple response categories,

providing a framework specifically tailored for analyzing polytomous data (Thorpe & Favia, 2012). GRM can be written as follows.

$$\Pr(X_{ij} \le k) = \frac{e^{\{\lambda_j(\eta_i - \beta_{ik})\}}}{1 + e^{\{\lambda_j(\eta_i - \beta_{ik})\}}}$$

In the above formula,  $\Pr(X_{ij} \le k)$  signifies the probability that the response to item *j* by the person *i* is less than or equal to category *k*. Within this formula,  $\eta_i$ represents person *i*'s ability on the latent trait, while  $\beta_{ik}$  stands for the threshold parameter specific to item *j* and category *k*. The discrimination parameter  $\lambda_j$  signifies the item-specific discrimination ability. The variable *k* denotes the category of the response for item *j*, reflecting the cumulative probability of responding up to that category. Accordingly, the authors will evaluate the quality of the Sinhala HWISE scale by running a GRM upon obtaining data.

The GRM offers both constrained and unconstrained versions. In the unconstrained variant, the discrimination parameter varies across items, enabling researchers to assess each item's quality and its alignment with the latent trait. Generally, items with higher discrimination parameters are more effective in measuring the latent trait. Similarly, interpretation of the GRM often involves item information curves (IICs), item category characteristic curves (ICCCs), and the test information function (TIF), aiding researchers in understanding individual item performance and overall test information. After a careful assessment, researchers could test the model fit for constrained vs. unconstrained for further interpretation of the items. Model fit can be interpreted using log-likelihood, Akaike information criterion (AIC), and Bayesian information criterion (BIC) values (Min & Aryadoust, 2021). In the present study, authors will use the R package 'Itm' to conduct the mentioned GRM. The section, 2.5.3.1 summarizes the basic purposes of ICCC to facilitate easier comprehension of the IRT for the readers of this protocol.

### 2.5.3.1 Item category characteristic curves (ICCCs)

In R Studio, through a GRM, researchers can generate ICCCs for all 12 items (Figure 3). Obtaining ICCCs is part of the GRM in IRT. Each figure (ICCC) will display information about the degree to which each response in the item can assess the ability of an individual. Here, ability ( $\theta$ ) is the latent variable. Each curved line represents an answer option and researchers could interpret which response options are more likely to be selected at a particular level of ( $\theta$ ). In the sample ICCCs given below (Figure 3), answer options 1 and 2 are more likely to be selected even at lower ( $\theta$ ) as opposed to items 3 and 4 which are more difficult choices.

For instance, hypothetically assume that the above ICCCs belong to item 1 of the HWISE scale. Accordingly, a person who has encountered more water insecurity experiences ( $\theta$ ) is more likely to select answer option 4 as opposed to the rest of the items. Additionally, the discriminability of item choices can be further assessed by observing

the steepness of each curve. Higher steepness is associated with higher discriminability, and higher discriminability indicates the item's relatedness to the latent trait similar to loadings to a factor in factor analysis (Hays, Morales, & Reise, 2000). In the sample ICCCs (Figure 3) given below, discriminability is kept constant. Similar to ICCC, IIC provides insights about which items are capable of providing more information about the latent variable and TIF provides how well the overall scale provides information about the latent variable (Sethar *et al.* 2022). Thus, in addition to CTT, researchers can learn more about the overall quality of the items in the HWISE scale using IRT.



Figure 3: Sample ICCCs for an item with polytomous responses

# 2.6 Ethics approval

The ethics for the present study was obtained from the Ethics Review Committee of the Faculty of Medicine, University of Peradeniya, Sri Lanka. This study is designed as per the prescribed research guidelines of the American Psychological Association's (APA) and the British Psychological Society's (BPS) code of ethics.

# 2.7 Timeline of the study

The project is expected to be completed within the year 2024. However, if multiple revisions are required to finalize the scale, the project may require more time in the following year as well.

# 3. Discussion and conclusion

The present study is expected to generate a culturally adapted and statistically validated scale to assess household water insecurity experiences in Sri Lanka. Considering the psychometric properties of the previous studies on the HWISE scale construction, the present study also expects to generate a unidimensional factor solution with satisfactory reliability. The protocol paper is carefully designed utilizing the insights of Scholz *et al.* 

(2002) and Young *et al.* (2019a). Similarly, the study will combine both CTT and IRT demonstrating a rigorous evaluation of psychometric properties of the Sinhala HWISE scale. While these processes enhance the overall quality of the scale and the procedural rigor of the study, they also render a noticeable set of benefits to the scientific research community. Firstly, the availability of the scale in the Sinhala language will enable responsible authorities to identify water insecurity experiences among households in multiple parts of Sri Lanka. Such identification will have a direct influence on the health and economic policies of Sri Lanka. For instance, enacting the right policies by understanding water stress and insecurity could help authorities mitigate potential negative impacts on health and the economy. Moreover, the scale will enable other researchers to conduct further research about water conservation and distribution by steering through the community experiences of household water insecurity. Such initiatives and research could have a direct impact on the health and economic policy development of Sri Lanka.

Secondly, understanding more about individual experiences related to water insecurities also carries a psychological component. Individuals with water insecurities may experience psychological disturbance which should be addressed by implementing evidence-based psychotherapeutic interventions. Accordingly, by understanding more about the nature of water insecurity Sri Lankans face, more policies could be implemented to facilitate health promotion. As Chandrasekara *et al.* (2021) and Wickrama *et al.* (2023) reason, the majority of policies Sri Lankan authorities implement for waterrelated problems (i.e., rainfall management) are not effective. In that case, the availability of a scale enables researchers to assess the possibility of adopting more nomothetic approaches to assist vulnerable populations in circumnavigating water stress. Furthermore, future research could focus more on understanding the experiences of people by considering qualitative and mixed methods approaches to explore the depth of household water problems in Sri Lanka.

### Acknowledgments

The authors would like to express their gratitude to the University of Peradeniya for providing the necessary support to publish this research. The authors declare no conflicts of interest, and this publication did not receive any external funding.

### **Conflict of Interest Statement**

The authors declare no conflicts of interest.

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