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# A review of 80 assessment tools measuring water security

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## Abstract

Scholars and practitioners have been working on methodologies to measure water security at a variety of scale and focus. In this paper, we critically examine the landscape of water security metrics, discussing the progress and gaps of this rich scholarship. We reviewed a total of 107 publications consisting of 17 conceptual papers and 90 methodological papers that propose 80 metrics to measure water security and observed that there are two dominant research clusters in this field: experiential scale-based metrics and resource-based metrics. The former mainly focus on measuring the water experiences of households and its impact on human well-being, while the majority of the latter assess freshwater availability or water resources security. We compare their approaches and the arguments used to develop them. We posit that the more local the scale and the more specific the water domain, the more meaningful results that the metrics can provide. Acknowledging the interrelationship between different water domains (e.g., water resources and water hazards) is important, but their aggregation for measurement may be problematic. We offer our views on future work in this field relating to topics beyond water, the need to conduct validation tests, and collaboration among academics and with other stakeholders.

This article is categorized under:

Human Water > Human Water

## KEYWORDS

assessment tools, indicator, metrics, review, scale, water security

## 1 | INTRODUCTION

Water security scholarship emerged in the early 2000s and has become a growing body of work, with diverse conceptualizations (for compilations of definitions of water security, see Cook & Bakker, 2012; Zeitoun et al., 2016; Jepson, Wutich, et al., 2017). To evaluate water security status in a city, country, or other unit of analysis, scholars and practitioners have been operationalizing the concept and developing measurement tools. Despite these efforts, many metrics tend to be limited in both their application and their influence on the policymaking process (Howlett & Cuenca, 2017). Before the widespread use of water security terminology, tools proposed to measure water conditions, primarily the hydrology of freshwater resources, were numerous (Plummer, de Loë, & Armitage, 2012), varying in spatial and temporal resolution and ranging from single to multiple dimensions. For example, Dunn and Bakker (2009) observed that in

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Canada alone, there were at least 365 indicators addressing water-related issues in 2009. The majority of them (295 indicators) were developed at the federal, provincial, and regional levels, whereas the rest were developed at community level. The proliferation and prominence of indicators in water management are primarily because they provide a simplified, quantified, and communicated expression (Brown & Matlock, 2011). In general, water metrics are useful for identifying vulnerable areas that need to be strengthened, suggesting potential leverage points for intervention, and monitoring the effectiveness and efficiency of certain interventions (Mason & Calow, 2012). For comparative purposes, they enable benchmarking performance, cross-learning, and the creation of best-practice standards.

This paper focuses on the quantification of “water security” whose pivot occurs when water becomes “securitised” (Staddon & James, 2014). Threats from a shortage of water (and a surplus of water; see Octavianti, 2020) create the need for robust policies, which often translate into large-scale infrastructure. This implies that the majority of water security studies narrowly refer to water supply security, although water researchers have interpreted the term more broadly, depending on their disciplinary approaches, theoretical leanings, and institutional agendas, among other factors (Gerlak et al., 2018). Efforts to secure water through large infrastructure do not necessarily mean better water experiences for people, particularly marginalized communities (Zeitoun et al., 2016).

We critically review and reflect on current analytical approaches to measure water security and highlight areas where challenges remain in creating meaningful metrics. We build our analysis from previous review papers (Brown & Matlock, 2011; Plummer et al., 2012; Wilder, 2016), but given the rapid growth of this scholarship, we only review publications proposing tools to measure “water security.” In addition to updating findings from the previous review papers, we seek to promote further development of tools and methods to address the complexity of operationalizing the water security concept, identify best practices in the literature, and improve the accessibility of metrics in policy settings.

## 2 | METHODS

### 2.1 | Data collection

We used Web of Science with the search string.<sup>1</sup> “water \*security” AND “tool\*,” and other similar terms, such as indicators and metrics, in the title, keyword, and abstract of articles. The search string was constructed over numerous iterations to include as many possible publications on water security metrics. For example, “water \*security” AND “metric\*” yielded only 42 publications, while “water \*security” AND “index” yielded 194 publications. We also checked references of some key papers to ensure we have included all relevant publications. The iterative search yielded 264 articles. This paper focuses on peer-reviewed publications, but it builds on reports from the gray literature to capture tools developed by practitioners (e.g., ADB, 2013; GWP, 2014).

While trying to be as comprehensive as possible but keeping the number of articles manageable, we set the following criteria in selecting articles: (a) their full texts are available in English; (b) they explicitly employ water security as a concept (it is not just mentioned in passing); and (c) they propose or test specific analytical tools for evaluating water security. Following Albrecht, Crootof, and Scott (2018) who conducted a systematic review of tools measuring the nexus of food, energy, and water (FEW) security, we categorize papers that are not explicitly proposing or testing analytical tools as “conceptual” (a list of conceptual papers is presented in Table A1). This paper includes those reviewing the progress of research on a certain scale (e.g., Jepson, Wutich, et al., 2017, reviewing household water security metrics) or in a particular location (e.g., Sun, Staddon, & Chen, 2016, reviewing water security metrics in China). Of the 264 articles identified, 90 articles are methodological and 17 articles are conceptual. We excluded the remaining 157 articles. From 90 methodological papers, 80 distinct assessment tools were identified (Tables 1 and 2).

While we focus on methodological papers, all 17 conceptual papers were reviewed and informed our analysis. They highlighted research gaps and needs and therefore were useful when we assessed the extent to which methodological papers meet these needs. In relation to this, we derived normative attributes or desirable qualities of an analytical approach in water security measurement from these conceptual papers.

### 2.2 | Bibliometric analysis

Our main approach for reviewing progress in water security metrics is by using qualitative analysis, whose findings will be further discussed in Section 3. However, as a first step, we also conducted a bibliometric analysis to help us identify

**TABLE 1** Experiential scale-based metrics

No	Authors, year	Scale	Urbanicity	Location	Specific name of the metric	Domains						
						Water resources	Water supply <sup>a</sup>	sanitation	Hygiene <sup>a</sup>	Water hazards	Climate change	Adaptive capacity
1	Alhara et al. (2015), Aihara, Shrestha, and Sharma (2016)	Household	Urban	Kathmandu Valley, Nepal	HWIS	x	x					x
2	Boateng, Collins, et al. (2018)	Household		Nyaza, Kenya	HHWI Scale	x	x		x			
3	Danielaini, Maheshwari, and Hagare (2019)	Household	Rural to urban	Cirebon, Indonesia			x	x		x		x
4	Hadley and Freeman (2016)	Household	Rural	Ethiopia	HWIS	x	x		x			
5	Jepson (2014), Jepson and Vandewalle (2016)	Household	Rural and periurban	Texas-Mexico border		x	x		x			
6	Shrestha et al. (2018)	Household	Urban	Kathmandu Valley, Nepal	Objective Water Security Index	x	x					
7	Stevenson et al. (2012)	Household	Rural	Amhara, Ethiopia			x					
8	Stevenson et al. (2016)	Household	Rural	Ethiopia		x	x		x			
9	Tomaz et al. (2020)	Household	Urban	Forquilha, Ceará, Brazil	HWISI		x		x			
10	Tsai et al. (2016)	Household	Rural	Uganda	HWIAS	x	x		x			
11	Workman and Ureksoy (2017)	Household	Rural	Lesotho			x		x			
12	Wutich and Ragsdale (2008), Hadley and Wutich (2009), Wutich (2009)	Household	Urban and periurban	Cochabamba, Bolivia			x		x			
13	Young, Boateng, et al. (2019), Young, Collins, et al. (2019)	Household	Rural to urban	28 sites in 23 LMICs	HWISE Scale	x	x		x			

Abbreviations: HHWI, Household Water Insecurity; HWIAS, Household Water Insecurity Access Scale; HWIS, Household Water Insecurity Scale; HWISE, Household Water Insecurity Experience; HWISI, Household Water Insecurity Index; LMICs, low- and middle-income countries.

<sup>a</sup>Water supply and hygiene questions are in the form of experiential scale; Danielaini et al. (2019) also asked experiences about sanitation condition.

TABLE 2 Resource-based metrics

No	Authors, year	Scale <sup>a</sup>	Location	Stage of development		Specific name of the metric	Framework <sup>b</sup>	Specific method <sup>c</sup>	Dimensions							
				Proposal only	Implementation	Validation			Water resources	Water supply	Sanitation	Hygiene	Water hazards	Climate change	Adaptive capacity	Governance
1	Abodinga, Ribbe, Frechen, and Sughrir (2019), Aboelnga et al. (2020)	Urban	Madaba, Jordan	x	x		IUWSI	AHP	x	x	x		x	x		x
2	Arreguin-Cortes et al. (2019)	Municipality, country	Mexico	x	x		WSI	Risk framework		x						
3	Assefa et al. (2019)	Subareas, city/urban	Addis Ababa	x	x		Domestic Water Security Index		x	x	x	x				
4	Babel and Shinde (2018), Babel et al. (2020)	Basin, urban	Bangkok	x	x		WSI	DPSIR	x	x	x	x	x	x	x	x
5	Basu et al. (2016)	Subareas, district	Purulia District, India	x	x		RWII		x	x	x			x		
6	Bitterman et al., 2016	State	Tamil Nadu, India	x	x			Enhanced DPSIR	x							
7	Cai, He, Xie, and Liu, 2020	County, province	Hunan Province, China	x	x		WSI	Fuzzy comprehensive evaluation and the entropy value methods	x							x
8	Chen and Shi, 2016	Urban	Chengdu City, China	x	x			AHP	x				x			x
9	Dubey et al. (2020)	District, basin	Basin, Rajasthan, India	x	x			Three CORDEX-SA driving GCM (Global Circulation Model) experiment and SWAT	x							
10	Dumont et al. (2012)	Continent	Europe	x	x			GWAVA (Global Water Availability Assessment)	x					x		
11	Flörke, Schneider, and McDonald (2018)	Urban, global	482 of the world's largest cities	x	x			WaterGAP3 modeling framework	x				x			
12	Gain et al., 2016	Global	Global	x	x		GWSI	Spatial MCA framework	x	x	x					x
13	Gesualdo, Oliveira, Rodrigues, and Gupta, 2019	Basin	Jaguari Basin, Sao Paulo, Brazil	x	x				x				x			
14	Ghosh et al. (2019)	Urban	Delhi Metropolitan Area, India	x	x			Urban metabolism	x							
15	Giri et al. (2018)	Subbasin, basin	Neshanic Basin, USA	x	x			SWAT, agent-based modeling framework and spatial data analysis	x							x

TABLE 2 (Continued)

No	Authors, year	Scale <sup>a</sup>	Location	Stage of development		Specific name of the metric	Framework <sup>b</sup>	Specific method <sup>c</sup>	Dimensions						
				Proposal only	Implementation	Validation			Water resources	Water supply	Sanitation	Hygiene	Water hazards	Climate change	Adaptive capacity
16	Gong et al. (2017)	Basin, region	China		x		WSD (Water Security Degree) standard	Developed from WPI	x	x					x
17	Hailu et al. (2020)	Household	Awash Basin, Ethiopia		x		HWSI		x	x	x		x		x
18	Holding and Allen (2016)	Island	Andros Island, Bahamas	x				Risk framework	x		x			x	
19	Holmatov et al. (2017)	Country, region	Southern Africa Development Communities	x				Based on the ADB (2016) Asian Water Development Outlook (AWDO)	x				x		
20	Huang, Xu, Yin, YanpengCui, and ZhifengYang (2015)	Urban	Dalian City, China	x			UWS Assessment		x	x	x		x		x
21	Jaramillo and Nazemi (2018)	Urban	Montreal City, Canada	x					x					x	
22	Jensen and Wu (2018)	Urban	Singapore and Hong Kong	x			UWSI		x	x	x		x		x
23	Jia et al. (2015)	Basin	Yellow River Basin, China	x					x						x
24	Jiang, He, and Jing (2018)	Basin	Yellow River Basin, China	x			WSI (not specific)	Entropy	x	x	x		x		x
25	Kaur et al. (2019)	Basin	Grand River Basin, Ontario, Canada	x				SWAT	x						
26	Khan et al. (2020)	Urban	Islamabad City, Pakistan	x			Water Security Assessment Framework		x	x	x		x		x
27	Kim et al. (2018)	Country	South Korea	x				Based on Falkenmark's Water Stress Index	x						x
28	Krueger et al. (2019)	Urban	Amman, Chennai, Mexico City, Ulaanbaatar, Singapore, Melbourne, Berlin	x					x				x		x
29	Li, Peng, and Li (2016)	Country	China	x					x		x				
30	Li et al. (2019)	Basin, province	17 basins in the three regions (Yangtze River, Yellow River, and inland rivers) of Gansu Province	x			MIWSA	MIWSA	x						x

(Continues)

TABLE 2 (Continued)

No	Authors, year	Scale <sup>a</sup>	Location	Stage of development			Specific name of the metric	Framework <sup>b</sup>	Specific method <sup>c</sup>	Dimensions						
				Proposal only	Implementation	Validation				Water resources	Water supply	Sanitation	Hygiene	Water hazards	Climate change	Adaptive capacity
31	Li et al. (2017)	Region	Beijing-Tianjin-Hebei region, China	x			Freshwater Security Index			x						x
32	Ma et al. (2010)	Subbasin, basin	Haihe River Basin, China	x					PCA with Kendall $\tau$	x	x	x		x		x
33	Martunen et al. (2019)	Country	Finland	x						x	x	x	x	x		x
34	Mohammadpour et al. (2019)	Administrative area, country	Ecuador, Peru, and Bolivia	x			FEW Security Index	The RAND Pardee approach		x	x					
35	Mukherjee, Sundberg, and Schütt (2020)	Urban	Kolkata City, India	x						x	x	x				
36	Naderi (2020)	Basin	Dorudzan Dam Basin, Iran	x					SWAT	x	x				x	
37	Nie et al. (2018)	Region	China	x			Water Security Sustainability (WSSI) Indicator	MCDM		x	x	x		x		
38	Nilsson, Berner, et al. (2013), Nilsson, Destouni, et al. (2013)	Country, region	Arctic	x						x					x	
39	Norman et al. (2013)	Community	Township of Langley, British Columbia, Canada	x			Water Security Status Indicators (WSSI)			x				x		x
40	Padowski et al. (2016)	Urban	108 large cities in the USA and Africa	x						x	x					x
41	Paladini (2012)	Country, region	Asia Pacific	x			CWVI		PCA	x	x					
42	Rodrigues et al. (2014), Rodrigues, Gupta, Mendiondo, and Oliveira (2015)	Basin	Cachoeira River Basin, Sao Paulo, Brazil	x					SWAT and the lumped conceptual model HYMOD	x						
43	Sardigno et al. (2017)	Country, region	Middle East and North Africa	x				Developed from WPI and Global Food Security Index		x	x	x				x
44	Shao, Yang, Xiao, and Tan (2012)	Urban	Wuhan City, China	x			Water Resources Sustainability Evaluation Model			x	x	x		x		
45	Su et al. (2019)	Administrative area, country	Japan	x			Water Security System (WSS) Index		SPA (Set Pair Analysis) and SD (System Dynamics model)	x	x	x		x		x
46	Yin, Dongjie, Wei, and Weijun (2017)	Province	Guizhou Province, China	x			Urban Water Security Index (UWSSI)		System dynamics and x GIS	x	x	x		x		x
47	Thapa et al. (2018)	Household	Kathmandu Valley, Nepal	x			HWISI			x						

TABLE 2 (Continued)

No	Authors, year	Scale <sup>a</sup>	Location	Stage of development			Specific name of the metric	Framework <sup>b</sup>	Specific method <sup>c</sup>	Dimensions						
				Proposal only	Implementation	Validation				Water resources	Water supply	Sanitation	Hygiene	Water hazards	Climate change	Adaptive capacity
48	van Ginkel et al. (2018)	Urban	10 cities (Amsterdam, Toronto, Singapore, Dubai, Beijing, Hong Kong, Sao Paulo, Nairobi, Lima, and Jakarta)		x			PSIR		x	x	x		x	x	x
49	Veettil and Mishra (2016, 2018)	Basin	Savannah River Basin, USA		x				SWAT	x	x					
50	Venghaus and Dieken (2019)	Country, global	Selected 40 countries		x		STE FEW Security Index			x	x					
51	Vörösmarty et al. (2010)	Country, global	Global		x					x						x
52	Wang, Cui, and Li (2012)	Administrative area, region	Zhangjiakou Region, China		x			OWAM (an optimal water allocation model)		x	x					
53	Wang et al. (2020)	Country, region	Central Asia (Kazakhstan, Kyrgyzstan, Tajikistan, Turkmenistan, and Uzbekistan)		x				PSO-PPE (the projection pursuit model based on particle swarm optimization)	x	x					x
54	Xiao et al. (2008)	Basin	Three basins in Hest Corridor, China		x				AHP and expert judgment (weighting and fuzzy assessment model)	x	x	x		x		x
55	Xiao-Jun et al. (2014)	Urban	Yulin City, China		x				Catastrophe method based on multicriteria model	x				x		
56	Yang, Shao, Xiao, and Tan (2012)	Urban	Wuhan City, China		x				Catastrophe method (with some improvements)	x	x	x		x		
57	Yin et al. (2017)	City, province	Guizhou Province, China		x				System Dynamics	x		x		x		
58	Yomo, Mourad, and Guazou (2019)	Subbasin	Out Nord sub-basin, Togo		x				IFCEM (Improved Fuzzy Comprehensive Evaluation Model)	x	x	x		x		
59	Zende et al. (2018)	Village, basin	Yerala River Basin, India		x					x						
60	Zhang, Xu, et al. (2019)	Urban	Sichuan Province, China		x			PSR	TODIM (an acronym in Portuguese for Interactive and Multicriteria Decision-Making)	x	?			x	x	x

(Continues)

TABLE 2 (Continued)

No	Authors, year	Scale <sup>a</sup>	Location	Stage of development			Specific name of the metric	Framework <sup>b</sup>	Specific method <sup>c</sup>	Dimensions						
				Proposal only	Implementation	Validation				Water resources	Water supply	Sanitation	Hygiene	Water hazards	Climate change	Adaptive capacity
61	Zhang et al. (2019)	Province, region	China	x				DFSCIR	Entropy and Gray Prediction Model	x	x	x				x
62	Zhao, Chen, and Weng (2009)	Urban	Nanjing City, China	x					Entropy and unascertained model	x	x	x		x		
63	Zhou, Wu, and He (2007)	Urban	China	x					VFS (Variable Fuzzy Sets) and entropy	x		x				
64	Zhou et al. (2019)	Province	Guizhou Province, China	x				PSER	TOPSIS (Technique of Order Preference Similarity to the Ideal Solution)	x	x	x				
65	Zhu et al. (2019)	Province, country	China	x				Developed from Water Stress Index		x						
66	Zhu and Li (2014)	Municipality, province	Shanxi Province, China	x					Nash equilibrium and TOPSIS (Technique of Order Preference Similarity to the Ideal Solution)	x	x	x				
67	Zi-Ying and An-Yan (2018)	Municipality	Taizhou Bay, Zhejiang Province, China	x				PSR	AHP	x	x			x		x

<sup>a</sup>The format of "scale" suggests that water security was measured at the first level (scale 1) and then aggregated at the second level (scale 2).

<sup>b</sup>Some studies developed their framework from the DFSCIR framework (D = driver, P = pressure, S = State, I = Impact, R = Response).

<sup>c</sup>Acronym: AHP (analytical hierarchy process), SWAT (Soil and Water Assessment Tool), and PCA (principal component analysis).

Abbreviations: CWVI, Composite Water Vulnerability Index; FEW, food, energy, and water; GWSI, Global Water Security Index; HWSI, Household Water Security Index; IUWSI, Integrated Urban Water Security Index; MCA, multicriteria analysis; MCDM, multicriteria decision-making; MIWSA, Multistage Integrated Water Security Assessments; RWII, Rural Water Insecurity Index; UWS, Urban Water Security; UWSI, Urban Water Security Indicators; WPI, Water Poverty Index; WSI, Water Security Index.

research clusters. We used VOSviewer, a free software tool specifically designed for visualizing and exploring the landscape of a scientific field using bibliometric data (van Eck & Waltman, 2020). It enables us to “construct networks of scientific publications, researchers, research organizations, countries, keywords, or terms. Items in these networks can be connected by co-authorship, co-occurrence, citation, bibliographic coupling, or co-citation links” (van Eck & Waltman, 2020, p. 3). For this analysis, we include both conceptual and methodological papers because the former informs the latter in developing specific tools to measure water security.

We first imported the bibliometric information of articles, such as authors, year, and journal title, from Web of Science into VOSviewer, and then explored the landscape of the scholarship, to identify influential publications and the relationships within the body of literature (Zhao & Strotmann, 2015). After exploring some visualizations, we concluded that bibliographic coupling and co-occurrences of keywords maps provided the most useful information for the purpose of our research. Figure 1 shows six research clusters in the data set from a bibliographic coupling analysis that uses citation analysis to establish a similarity relationship between documents. The clusters are denoted by different colors and are a mix of small and large clusters.

The first cluster (red) represents publications that focus on assessing water resources, with a majority of case studies focused on China. The second cluster (blue) groups papers that measure experiences of households in accessing water. The third cluster (green) classifies research measuring water security at the urban level. The papers in the fourth cluster (yellow) are not so distinct in terms of topic but are grouped because they focus on non-China case studies including Africa, Middle East, Indonesia, and South America. The fifth cluster (purple) groups publications that measure “blue” and “green” water to assess water security using a water footprint approach. Blue water is the water in freshwater lakes, rivers, and aquifers, whereas green water refers to the portion of precipitation that infiltrates to become soil moisture (Rodrigues, Gupta, & Mendiondo, 2014). The last and smallest cluster (light blue) represents the papers by Nilsson, Berner, et al. (2013), Nilsson, Destouni, et al. (2013) that propose metrics to measure food and water security in the Arctic.

Those six clusters are not completely distinct from each other and provide limited insights; therefore, for a more substantial analysis, we used a co-occurrences of keywords map to explore if a more informative research cluster can be identified. From Figure 2, we can discern two large clusters of publications using similar keywords. The first cluster (red), with water security at the center of it, consists of those publications who use similar terms, such as resources, governance, and model. The second cluster (blue) classifies papers that have keywords such as emotional distress, water insecurity, and community. We combine the green cluster with the red cluster because most papers assessing water resources use vulnerability as a framework and often associate water security with water scarcity.

The co-occurrences of keywords map corresponds nicely with the previous bibliographic coupling map, with experiential scale-based metrics (blue cluster in Figure 2) being distinct in the scholarship (Cluster 2 in Figure 1), while the resource-based metrics (red and green clusters in Figure 2) represent a combination of the rest of the publications (Clusters 1, 3, 4, 5, and 6 in Figure 1).

This finding also triangulates with our qualitative review, which identified two dominant research clusters in water security metrics scholarship: the experiential scale-based metrics and the resource-based metrics. This classification will be used for further analysis in this paper.

The next sections present our observations upon reviewing methodological papers based on spatial scale, water domains, and development techniques. In Section 4, we summarize the different characteristics of dominant research clusters and discuss the substantial arguments behind their formulation followed by our views on future work. The final section concludes our arguments.

### 3 | THE LANDSCAPE OF WATER SECURITY METRICS

Focusing on 90 methodological papers, this section assesses the progress of water security metrics based on three variables: (a) the scale of analysis, (b) the water domains in which the tools were developed, and (c) the methods used to measure water security, including their high-level development techniques. This qualitative review corroborates our bibliometric analysis that two research clusters dominate the literature. The first relates to tools that measure experiences of households (Table 1), and the second relates to tools measuring water resources security at other levels, such as city and country (Table 2).

### 3.1 | Spatial scales

Three types of scale units are used as the basis of water security assessment: political boundaries (from municipality to country), hydrological boundaries (basin), and the social construction of scale (urban–rural, community, household). In this review, we classify the spatial scale of the papers based on authors' self-identification in those scale types.

Earlier works on water security measurement were developed at the global level, such as the analysis by Vörösmarty et al. (2010) who consider human water security and biodiversity perspectives simultaneously. The significance of their work is confirmed by the bibliographic coupling in Figure 1 because it triggered further research in this field. The scholarship then grew to cover other macro levels (e.g., ADB, 2013; Dumont, Williams, Keller, Voß, & Tattari, 2012). For global and regional assessment, data were usually collected from countries and then aggregated to create a global or regional picture of water security. While this information is useful to see which regions or countries are facing water insecurity, the uptake of the information for local stakeholders is often limited. They may also mask striking variations happening at a much lower scale (Molle & Mollinga, 2003).

At the other end of the spectrum is individual or household water (in)security assessment. We observe that studies in this cluster developed differently compared with other nonhousehold water metrics, with one defining feature being the use of an experiential scale (not indicators) to measure how water security is felt by individuals or household representatives. Hence, household surveys are essential for this measurement. Jepson, Wutich, et al. (2017) have critically reviewed studies in this cluster, which were initially developed by anthropologists, such as Wutich and Ragsdale (2008). One exception from the majority of works at the household level that used an experiential scale is the Hailu, Tolossa, and Alemu (2020). Deriving from Sullivan's (2002) Water Poverty Index (WPI), they developed a Household Water Security Index based on water resources availability, access, utilization, capacity, environment, and water institution indicators.

In between the global and individual scales are metrics capturing the dynamics of water security at the scale of region (within or beyond countries), basin, urban (and rural), and municipality, with urban ( $n = 17$ , 20%) and basin ( $n = 17$ , 20%) scales being the most popular ones. We discuss our main observations for each scale below.

A total of eight (9%) articles that we studied propose metrics to measure water security at the regional level. They refer to either a small region within a country, such as China's One Belt and One Road Region (Zhang et al., 2019) and Gansu Province (Li, Su, & Wei, 2019), or a number of countries, such as the Arctic (Nilsson, Berner, et al., 2013), Central Asia (Wang et al., 2020), and Middle East and North Africa (MENA) regions (Scardigno et al., 2017). Data were typically collected as per unit analysis: at the country level for multicountry analysis or at the province or state level if the region is within a country.

Studies using basin scale as a unit of analysis, ranging from subbasin (e.g., Ma, Liu, & Chen, 2010; Zende, Patil, & Patil, 2018) to multiple catchments (e.g., Nie et al., 2018), have been growing rapidly. This is partly because such a unit enables modeling exercises to assess freshwater availability. Basin-level research was seen by authors in this group as the most appropriate scale for giving useful information to local stakeholders.

In terms of a socially constructed scale, water security assessment at the urban level has attracted much interest since 2015. In their conceptual paper, Romero-Lankao and Gnatz (2016) call for more research on urban water security, given more than 50% of the world's population reside in urban areas. Extreme events, such as a prolonged drought in Sao Paulo in 2013–2015 (Empinotti, Budds, & Aversa, 2019), can compromise the economic outlook of the country and present a great challenge to achieving water security in urban areas. While urban areas range from small towns to megacities, most papers in this cluster use large cities as case studies, such as Addis Ababa in Ethiopia (Assefa et al., 2019), Kolkata in India (Mukherjee et al., 2020), Islamabad in Pakistan (Khan et al., 2020), and Singapore and Hong Kong (Jensen & Wu, 2018). Still on the urbanicity spectrum, rural areas have been increasingly investigated by researchers as these settings pose different water challenges (Basu, Hoshino, & Hashimoto, 2016; Dickson, Schuster-Wallace, & Newton, 2016). The reason we classify the urban–rural spectrum into a “social” scale is because of the debatable definition of what constitutes urban areas. For example, Brenner and Schmid (2014) argue that there is no specific rule for drawing the boundaries of an urban, or urbanizing, area. Hence, many countries differ in their classification.

Another social scale is community. A research consortium in Canada (Norman et al., 2013) developed the Water Security Status Indicator as a method to measure water security at a community scale, integrating variables pertaining to water quality and quantity and their relationship to human health and aquatic ecosystems. They also developed other water metrics, such as water security risk assessment (Dunn et al., 2012). They argue that measuring water security at such a scale provides useful information for end users of the metrics, including the community itself.

Nonetheless, there has been little development in this cluster, which may have been translated into other local scales, such as municipality.

With regard to location, China is the most popular case study ( $n = 25$ , 29%). This is partly because water security has become a rising priority in Chinese national policy (China Power, 2020). Sun et al. (2016), reviewing water security metrics in China, found 160 publications, of which 91% were written in Chinese. This suggests that the country has vibrant water security-related research. Some of our findings share what Sun et al. (2016) found in their paper, such as the use of the Driver–Pressure–State–Impact–Response) framework in formulating metrics.

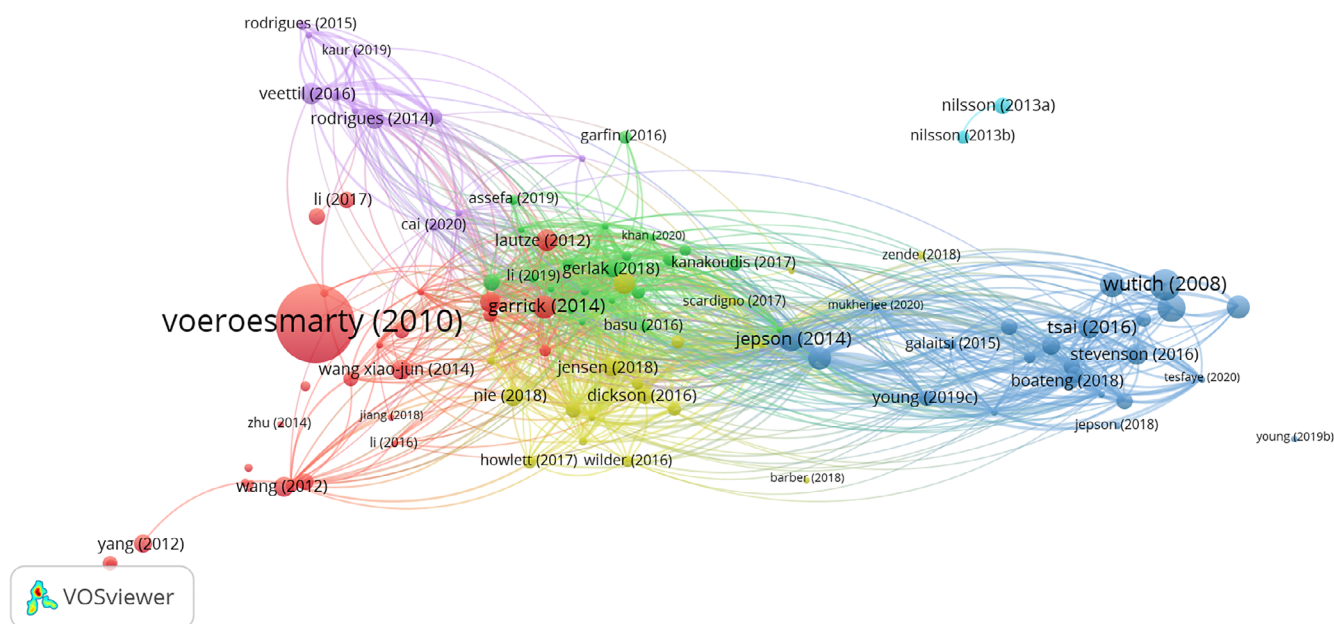
Looking at the temporal dimension, resource-based water security tools evaluate the past and present (if the data is available) status of water security using secondary data, thus measuring progress over time. Some of these studies extend the timeline to include predictions of water security at a given time in the future by conducting some modeling exercises (e.g., Giri, Arbab, & Lathrop, 2018). This means they are able to provide recommendations on how to improve water security, such as by increasing supply and increasing adaptive capacity.

On the other hand, experiential scale-based tools measure the present status of water security, with a recall period ranging from 1 week to 1 month (Jepson, Wutich, et al., 2017) or up to 4 months (Tomaz, Jepson, & de Oliveira Santos, 2020). Given this snapshot picture, researchers suggest conducting multiple surveys in different seasons or conducting a follow-up survey if the effectiveness of particular interventions is part of the investigation.

### 3.2 | Water domains

The diverse conceptualizations of water security have led to various operationalizations of the term, that is, what water domains count under the terminology. There are three main water domains being measured by the tools in the literature: (a) domestic water and human well-being, (b) freshwater availability, and (c) water-related hazards (notably flooding).

First, researchers developing experiential scale-based metrics focus on the relationship between domestic water and human well-being. They measure water supply and hygiene behavior of households via the following questions: “In the last 4 weeks, how frequently did you or anyone in your household worry you would not have enough water for all of your household needs?”; and “In the last 4 weeks, how frequently have you or anyone in your household had to go without washing hands after dirty activities?” (Young, Boateng, et al., 2019, p.8; Young, Collins, et al., 2019). This directly links to sustainable development goal 6.1 on the proportion of population using safely managed drinking water services. The experiential scale is yet to be adopted by the



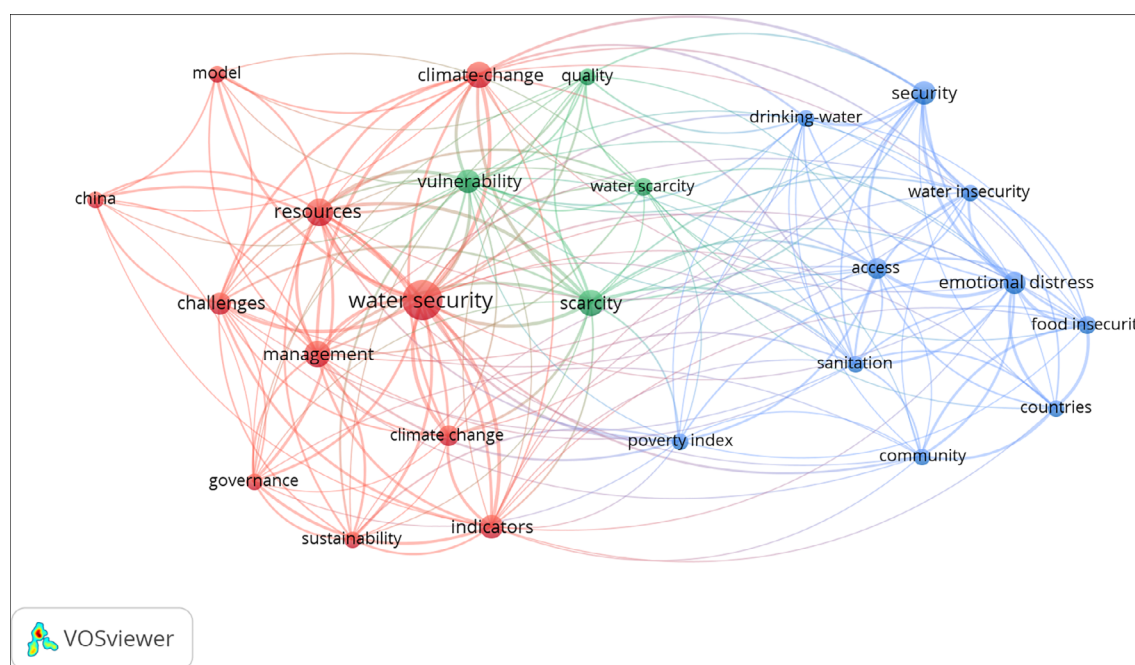
**FIGURE 1** A network map of bibliographic coupling of documents, which shows six research clusters in the field of water security assessment tools. The size of the label and the circle is determined by the weight of the item or citation links. The distance between two items approximately indicates the relatedness of the items

monitoring surveys (JMP, 2018) that gather data on physical access to water supplies. Some household water insecurity studies (Aihara, Shrestha, Kazama, & Nishida, 2015; Stevenson, Ambelu, Caruso, Tesfaye, & Freeman, 2016) investigate the connection between water insecurity and wider well-being (e.g., psychological stress) felt by the households.

Second, resource-based metrics give a more complicated picture of what *waters* are considered under the proposed metrics. However, we observe that the selection of indicators is underpinned by the need to understand freshwater availability or *water resources security* (e.g., Xiao, Li, Xiao, & Liu, 2008; Zhou, Su, & Zhang, 2019). Some use Falkenmark, Lundqvist, and Widstrand's (1989) water stress indicators (water availability measured in m<sup>3</sup> per capita per year) as a reference. These water resources data are typically combined with water use data from domestic, agricultural, industrial, and other sectors. Sanitation coverage or treated wastewater data are often included to represent threats from untreated wastewater in the water bodies. Some include this information to assess *water environment security* (Su, Gao, & Guan, 2019). Very few studies put ecology or the environment, such as river health (Nichols & Dyer, 2013) and biodiversity (Dumont et al., 2012), at the center of their inquiry. Another approach used to measure freshwater availability is by evaluating "blue-green water" availability (e.g., Kaur et al., 2019), taking into account, for example, groundwater availability (blue water) and the evapotranspiration process (green water). Water hazards, primarily drought, are often incorporated into the metrics as their occurrence compromises freshwater availability. Another approach for measuring freshwater availability is by using the FEW nexus lens. Mohammadpour et al. (2019) calculate the security of each sector before aggregating them, while Zhu, Jia, Devineni, Lv, and Lall (2019) take a deeper look at food and water connections and focus only on indicators trying to quantify their relationship.

Third, some studies ( $n = 28$ , 33%) include water hazards (droughts and floods) as one of the domains in the water security measurement. While the occurrence of drought is relevant in analyzing the availability of freshwater as noted above, flood events disrupt livelihoods in different ways (Octavianti, 2020). This *water hazard security* (focusing on flooding) is an important domain in water security, but it may risk providing a distorted picture when aggregated to other domains of water security assessment.

Institutional related indicators, such as water governance (Norman et al., 2013; Padowski, Carrera, & Jawitz, 2016), have been incorporated in some studies in the three domains. Recently, water security has been linked to adaptive capacity, social capital, and resilience (Garfin et al., 2016; Krueger, Rao, & Borchardt, 2019).



**FIGURE 2** A network map of co-occurrences of keywords in the data set, showing three research clusters that were further collapsed into two large research clusters: experiential scale-based metrics (blue) and resource-based metrics (red and green)

### 3.3 | Measurement techniques

We now analyze how metrics have been developed by focusing on their data requirement and weighting process.

#### 3.3.1 | Data requirement

For experiential scale-based metrics, data come from household surveys that have been developed in several stages, from formative research, survey development, and implementation. Some studies have validated their scale, such as Stevenson et al. (2016) and Young, Boateng, et al. (2019), Young, Collins, et al. (2019). Survey design (e.g., sampling number and methods and the timing of the survey) and questions (e.g., recall period) are key to the success of these metrics.

However, resource-based metrics usually use the following frameworks or methods in their assessment: pressure–state–response, system dynamics, “blue and green water” footprint, risk-based water management, integrated assessment, carrying capacity, and vulnerability (Li et al., 2019). They generally rely on secondary data published by governmental agencies or others, such as the total annual freshwater withdrawals of a country from the World Bank (2015) and the total renewable freshwater resources of a country from FAO (2015). Authors admit that their selection of indicators is based, to some extent, on the availability of data, and therefore, it is an iterative process. When data are not available, or not of sufficient quality, researchers have to balance this against the costs of conducting data collection. Extrapolating or modeling data have been undertaken by some researchers when only partial data can be obtained (e.g., Ghosh, Kansal, & Venkatesh, 2019).

When using secondary data for measuring water security, Venghaus and Dieken (2019), who analyzed the differences and inconsistencies of FEW indices, found that the RAND FEW Security Index and STE FEW Security Index provided different results, particularly for Kazakhstan (out of the 40 countries assessed). The differences occurred primarily because the former index mostly uses data from the Food and Agricultural Organization (FAO) for water security (Willis et al., 2016), while the latter builds on the water risk framework in which the FAO is only one source of many (Gassert et al., 2015). Holmatov et al. (2017) assessing water security in the Southern African Development Community (SADC) also found their findings differed from those of Fischer et al. (2015) who suggest that all SADC countries are water secure, except Zimbabwe. In contrast, Holmatov et al. (2017) found that Malawi is the most water insecure in the SADC. The different focus of the two studies, with Holmatov focusing on economic water security and Fischer on water security in general, and the variables selected may explain this discrepancy. The above examples show that the effects of data choices can be significant for water security measurement.

In developing an experiential scale and selecting indicators, some researchers opened up the research process by engaging stakeholders and/or end users. Dunn et al. (2012) was among the first to incorporate insights from not only local policymakers but also the community who would be using the indicators and insights from the study. More recent papers (e.g., Jensen & Wu, 2018; Krueger et al., 2019) used a participatory approach, acknowledging the increasing importance of co-producing knowledge with other sectors.

Despite the recognition of the importance of qualitative data in measuring water security, or what Garfin et al. (2016) called “Metric Plus,” most metrics in our database use only quantitative data (e.g., water resources availability and connection to wastewater services). Challenges associated with integrating quantitative and qualitative data include determining the appropriate unit of analysis where meaningful qualitative information can add value to quantitative data. Technically, such integration may lead to questions about how to actually incorporate them into the metrics: whether the qualitative data are used only for making sense of numbers in data analysis or are incorporated early, which may mean that the qualitative information is “quantified” to a certain extent (Zhu & Li, 2014).

With two distinct metrics developed (experiential scale- and resource-based metrics), Shrestha et al. (2018) sought to integrate both the “experiential (subjective) and physical (objective)” dimensions of water security (Shrestha et al., 2018, p. 277). They developed what they call an objective index of water security to measure the physical dimension of water security in communities and to integrate the data with a cross-sectional household survey ( $n = 1,500$ ). However, since many scholars view water security as a relational concept, which “demands a fuller consideration of the political structures and processes through which water is secured” (Jepson, Budds, et al., 2017, p. 47), they would argue that there cannot be an “objective” water security measure. In addition to proposing a metric, the majority of papers also pilot it in one site, while a minority conduct measurements in multiple sites. For example, Young, Boateng, et al. (2019), Young, Collins, et al. (2019) implemented the Household Water Insecurity Experience (HWISE) Scale

survey in 28 sites in 23 low- and middle-income countries to validate the scale so that it can be used widely. Jensen and Wu (2018) developed urban water security indicators and implemented the metric in Singapore and Hong Kong, two locations that share similar urban challenges. Krueger et al. (2019) developed an integrated framework for the quantification of urban water supply security and produced seven urban case studies, selected from a wide range of hydro-climatic and socioeconomic conditions.

### 3.3.2 | Weighting and aggregation

The main challenges of composite indices have been identified as the selection of variables or subindices, an appropriate aggregation function, and the weighting formula (Santeramo, 2016). The usefulness of aggregated indices has been constantly questioned as they need to balance two demands: making large data sets accessible for informing policymakers and providing the details and interrelations of variables in order not to prompt incorrect conclusions (Burgass et al., 2017). With these challenges in mind, we examine how authors weight variables and aggregate them in developing composite indices of water security.

Composite indicators consist of variables that have various units of measurement. There is a need to normalize the data (0–1) so that the diverse variables can be aggregated. One of the problematic steps in the process is how weights are assigned to variables to reflect their importance as authors weight variables differently.

For example, the WPI (Sullivan, 2002) consists of five variables (resource, access, use, capacity, and environment) whose weights are determined by local experts. Some authors (e.g., Gong et al., 2017) use WPI as the basis for formulating their metrics and one can see how authors assign weights to different variables depending on local context and their judgment of importance. It is not uncommon to find that authors propose a metric and leave the weighting formula up to the users. In such cases, comparing the results is a clear issue. Assigning weights to variables is an important part of water security measurement because different weights can lead to a completely different water security status (Sun et al., 2016). Because weighting reflects the hierarchy of importance, it is possible that this process may favor certain outcomes. Therefore, it is recommended to conduct sensitivity and uncertainty analysis during the process, to test how sensitive the result is to different weights assigned to the variables (Burgass et al., 2017).

In an attempt to deal with this subjectivity problem, researchers from statistical, engineering, and computer science backgrounds develop weighting methodologies to determine the index weight according to the degree of index connection. Techniques that can be applied include the entropy method, the fuzzy clustering analysis method, the multilevel fuzzy method, system dynamics method, principal component analysis method, and the gray relational degree analysis evaluation (Ali et al., 2014; Zarghami, Gunawan, & Schultmann, 2018).

Some prefer to assign equal weight to variables in the metrics, such as Krueger et al. (2019), because they consider all five components (natural capital/water resources, physical capital/infrastructure, political capital/management efficacy, financial capital, and social capital/community adaptation) equally important as urban water supply indicators.

Another problem that may arise during this process is when different water domains are aggregated into one single score to determine water status. A different approach was outlined by Su et al. (2019), who did not attempt to aggregate information from three different water security domains into a single score.

Features of water security metrics, such as spatial scale and water domains, of the reviewed papers are summarized in Table 1 (experiential scale-based metrics) and Table 2 (resource-based metrics).

## 4 | DISCUSSION

The first half of this section discusses the different characteristics of experiential scale-based and resource-based metrics and the conceptions underpinning their development. We then offer our views regarding topics on which future work could focus to contribute to knowledge production in this field.

### 4.1 | Experiential scale-based and resource-based metrics

The two research clusters have quite distinct characteristics (outlined in Table 3). Most of these (i.e., spatial scale, water domains, and development technique) have been discussed in Section 3. The way authors conceptualize water security plays a significant role in how they measure it.

**TABLE 3** A summary of different characteristics of experiential scale-based and resource-based metrics

	Experiential scale-based metrics	Resource-based metrics
Disciplines	Social science	Engineering and natural science
Spatial scale	Household, individual	Municipality, city, province, basin, country, region, global
Temporal scale	Snapshot data (present data) Recall period in the survey: 1 week, 1 month, 4 months	Past annual data to measure water status (some publications use the data to predict water status in the future)
Purpose	Capturing water insecurity experiences Identifying vulnerable, water insecure groups Evaluating water interventions	Improving water security Identifying mitigation targets Allocation of funding Raise awareness (benchmarking)
Water domain/focus	Water supply and hygiene; and human well-being Water insecurity (what we are trying to fight)	Mainly freshwater resources, but some with broad focus Water insecurity (what we are trying to achieve)
Data collection	Household surveys, preceded by formative survey and validation of questions (some studies)	Mainly secondary data from governmental agencies
Vision for universal application	Yes (some metrics)	Yes (some metrics), but generally only used locally
Weighting	Not applicable (basic arithmetic)	Vary (fixed weights, equal weights, up to local judgments)

Analyzing the substantial arguments underpinning the development of water security metrics, we found that experiential scale-based metrics were developed to understand how water insecurity was associated with psychological ill health (Stevenson et al., 2012, 2016). Later developments in this field were informed by the capabilities approach of Amartya Sen (Sen, 2009) and Martha Nussbaum (Nussbaum, 2011). This approach “assess[es] how well-being and social arrangements contribute to or detract from human flourishing and freedom” (Jepson, Budds, et al., 2017, p. 47), and hence, water access is important to “allow people to enjoy a host of capabilities” (Mehta, 2014, p. 66). For resource-based metrics, their approaches tend to be mixed: developed from existing theories, models, or frameworks (deductive), such as a blue–green water-based accounting framework (Rodrigues et al., 2014), but also based on available data (inductive) and on value judgments (normative), especially those of experts, in the aggregation of indicating variables. Deductive arguments usually applied first in their methodology to select variables.

Analyzing the purpose of metrics using Hinkel's (2011) conceptual framework to review climate change vulnerability indicators, we observe that the two research clusters are meant to address different problems of water security. The purpose of experiential scale-based metrics is to identify water insecure people and communities and evaluate the performance of water interventions. By contrast, resource-based metrics primarily aim to identify mitigation targets, where awareness raising and allocation of funding could then take place (partly because of the benchmarking function of the metrics). This reflects a subtle yet fundamental discrepancy between the two clusters: the use of the terminology of water *security* and *insecurity* in the metrics. Experiential scale-based metrics measure household water insecurity as a minimum basis from which humans can thrive, as derived from the capabilities approach. These studies aim to speak “directly to the question of equity and experiences underpinning... demand-side analysis at the household scale” (Tomaz et al., 2020, p. 2). Resource-based metrics measure water security status through quantifying freshwater availability of a particular unit of analysis, usually at the level of nation-state. Although politically useful, choosing a high-level scale may conceal issues of inequality. Socioeconomic structures may limit the availability of national resources for households and individuals, which can differ significantly from the national-level estimates (Schlör, Venghaus, & Hake, 2018). However, experiential scale-based metrics also have some weaknesses, such as not including information on water quality, which is an important component of household water security, and not providing much insight into the underlying causes of household water insecurity—whether the barriers are primarily physical ability, economic, or social (Slaymaker & Johnston, 2020).

An early observation in the water security scholarship (Cook & Bakker, 2012) about broad versus narrow framing is relevant in assessing water metrics. Some authors who perceive water security as a broad issue tend to include many water domains in its quantification, including water supply, sanitation, flooding, and others, whereas those who use a narrow framing only measure one or limited topics. Nonetheless, there are some authors who use a broad definition in defining the topic but focus on certain issues when it comes to measurement. In line with Cook and Bakker (2012) and Jepson, Wutich, et al. (2017), we posit that a narrow framing is more appropriate for operationalizing the concept of water security in meaningful ways, as it can provide precise analytics including those related to the weighting and aggregation issues discussed above.

## 4.2 | Universal metrics

Some authors have attempted to create universal metrics to measure water security, but this may raise a question about how local contexts can be incorporated and valued in the assessment. Like a spectrum with locality at one end and universality at the other end, one may want to strike a balance between the two to enable results to be compared with other sites without sacrificing important contexts.

For resource-based metrics, there are studies, such as Vörösmarty et al.'s (2010) global human security link to biodiversity and Gain, Giupponi, and Wada's (2016) global water supply security, that focus on assessing certain aspects of water security at a high level with metrics intended to be universal. The majority usually collect available secondary data and collate them to produce a regional or global figure. However, it is unclear whether the metrics have been validated to be applicable across different biophysical and sociocultural contexts. For composite indicators that use secondary data, it may be challenging to validate the metrics particularly because of layers of uncertainties (following Wilby and Dessai's (2010) cascade of uncertainty) and some other methodological drawbacks (Molle & Mollinga, 2003).

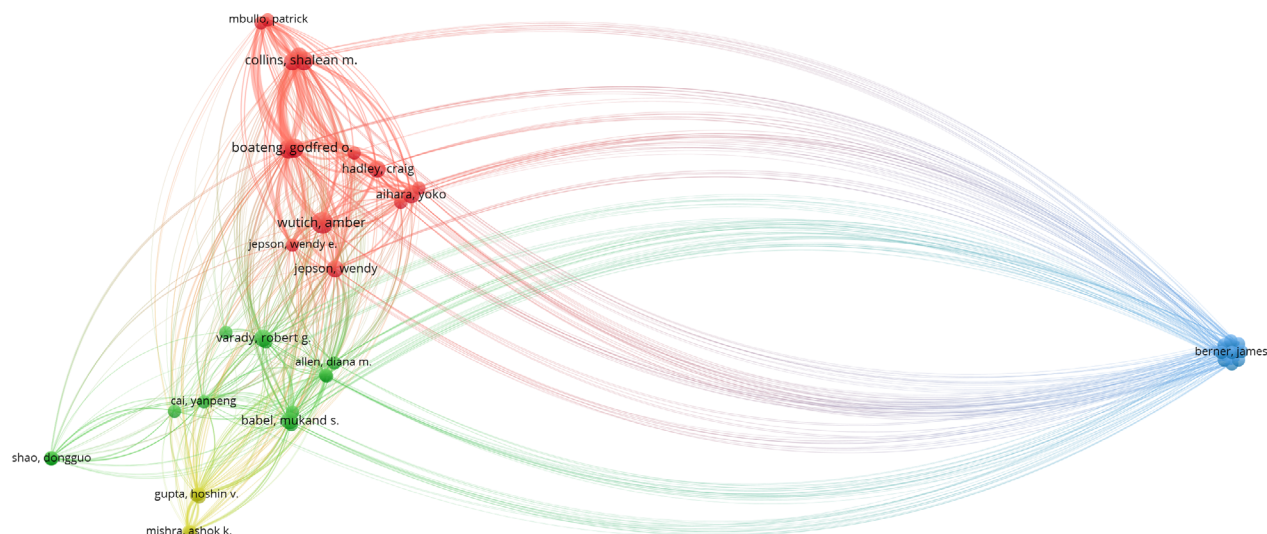
Multidimensional thinking will clearly be important to the construction of reliable and valid metrics. In some locations, water insecurity may derive from challenges related to quantity of available water; in other locations, it may be characterized more by water quality challenges; and in still other locations, the type of water insecurity may change temporally or vary by sociodemographic group.

In the literature of household water insecurity, some authors have validated their metrics. Tsai et al. (2016) validated a Household Water Insecurity Access Scale for rural Uganda, and their work has been a benchmark for subsequent studies. Data collected using the HWISE Scale in 28 sites globally, with a target of at least 250 participants from each site, were used for validation of the scale that can now be implemented in widely varying biophysical and sociocultural settings (Young, Boateng, et al., 2019). Methodologically, it was a difficult process to select the most relevant questions to ask about household experience, with robust statistical methods to test the questions or methods in general.

Seeking to advance the work on household water insecurity metrics, Tomaz et al. (2020) developed the Household Water Insecurity Index to assess differences across the urban waterscape using a small urban center as a case study. Their vision is to develop a validated regional tool for Brazil's semiarid regions. They tried to develop a metric that is applicable in multiple sites, but which retains the contextuality (a semiarid region in this case), so that policymakers can develop targeted policy interventions from the measurement.

## 4.3 | Future work

After discussing some issues underpinning the current literature of water security metrics, we now outline some avenues for future work, focusing on topic, methodology, and collaboration. First, we posit that studies on water security measurement could be more impactful if they also quantify the impact of water insecurity to other sectors. Some authors have progressed research from a water-centric approach (Briscoe, 2009) to quantifying connections between water security and other sectors. Research on measuring FEW security is one of them, although, in our view, attempts to cover broad issues of the three sectors often give only high-level observations that are not specific enough to trigger policy actions (see Albrecht et al., 2018). Research on the significance of water security to livability and the feasibility of investment in a city, for example, could be a way to raise awareness about the importance of having a water secure city with the public and local stakeholders. Topics beyond water are increasingly important, and experimentation on the marriage of water metrics and other metrics is worth investigating. In addition, we observe that recent publications have researched a different geographical scale, such as an island (Holding & Allen, 2016). This niche area of research,



**FIGURE 3** A network map of bibliographic coupling of authors showing that the red cluster (authors working on experiential scale-based metrics) has close citation links

measuring water security at a specific geographical location, might become more frequent in the future, considering those areas have different water challenges.

Second, we see the need to conduct validation tests on metrics, especially for those claimed to have universal application. Metrics are often developed from limited case studies and to be applicable outside its original context; robust validation testing should be conducted. Many authors do not deal with this issue, perhaps, because they think that the long-term acceptance of their tools by users is sufficient to assure credibility. Bockstaller and Girardin (2003) present three kinds of validation for indicators: a) design validation, to evaluate if the indicators are scientifically founded; b) output validation, to assess the soundness of the indicators' outputs; and c) end-use validation, to ensure the indicator is useful for a decision aid tool. For scale development and validation, Boateng, Neilands, et al. (2018) review the process of to create new, valid, and reliable scales in nine steps. Testing the validity of the scale is the last step to ensure that an instrument measures the dimension it was developed to evaluate. However, validation is an ongoing process that should be considered when defining the scope of the study. The most common tests of scale validity are content validity, which can be done prior to fieldwork, and criterion and construct validity, which occurs after survey administration. As far as one can tell, validation tests can be resource-intensive and filled with unfamiliar techniques, but this is an important step to ensure the credibility of metrics and the results they produce.

Finally, with rich scholarship and active publication, it would be more fruitful and impactful if scholars could build collaboration with each other and with practitioners and policymakers. Currently, there are limited connections between studies in the literature, especially in the resource-based metrics. On the contrary, authors in the experiential scale-based metrics show close collaboration with each other (Figure 3). This might be because the field is relatively new and relevant literature is much smaller compared with the resources-based metrics. Authors or groups of researchers in the resources-based cluster seem to be competing to create the best metrics while only minimally considering, or building from, previous work. Looking at some of the appendices or explanatory materials in some publications (e.g., van Ginkel, Hoekstra, Buurman, & Hogeboom, 2018), one can tell the amount of effort being put into creating such metrics. With a joint effort, scholars can not only create and validate a metric together but also mainstream the metrics for wider application. Engagement with other stakeholders outside academia, including the community, is equally important as it will improve the applicability of the metrics.

## 5 | CONCLUSION

The prevalent use of water security as a concept in academic and policy papers prompts publications that offer tools, frameworks, or methods for quantifying water security. In this paper, we assessed those publications based on their spatial scale, water domains, and development techniques. Two research clusters were observed in the literature: experiential scale-based metrics at the household level and resources-based metrics at other levels beyond household. The former measures household water experiences through surveys and focuses its analysis on water supply and human well-being, whereas the latter mainly assesses freshwater availability by considering the interrelationships between different water domains and usually relies on secondary data. We found that metrics measuring freshwater availability have dominated the landscape of water security methods, and while these approaches provide useful insights, the emerging scholarship on household water insecurity offers new perspectives that expand our understanding of water security, while also addressing the social and political questions, notably distributional inequity. Selecting which approach to use will be based on the purpose of the investigation and scholarly interests, which depends on the disciplinary backgrounds of the researchers. By discussing both research clusters including their strengths and weaknesses, we hope that this paper would be able to help researchers make some informed choices when developing or using a water security metric. We further identify that the discrepancies between the two clusters have been driven by different theoretical underpinnings. The experiential scale-based metrics are developed from a capabilities approach that recognizes the need for human beings to thrive, including through water provision, while resource-based metrics are motivated by the need to secure physical water, often at a high (such as country) level. In the quantification process, there are always risks associated with the reduction of a complex system. These include models that tend to be black boxes because of difficulties in unraveling assumptions embedded in their calculation and the risk of obscuring important variations at the local scale. Despite these caveats, measuring water security is an essential step toward reducing water-related risks, and for future planning. This effort can be understood as a way to operationalize the broadly stated water security concept into a more tangible and measurable concept.

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## CONFLICT OF INTEREST

The authors declare no conflicts of interest.

## AUTHOR CONTRIBUTIONS

**Thanti Octavianti:** Conceptualization; data curation; formal analysis; investigation; methodology; visualization; writing-original draft; writing-review and editing. **Chad Staddon:** Funding acquisition; investigation; methodology; supervision; validation; writing-review and editing.

## DATA AVAILABILITY STATEMENT

The authors confirm that the data supporting the findings of this study are available within the article and has been compiled in Table 1 and 2.

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## ENDNOTE

<sup>1</sup> We used quotation marks to search for an exact phrase and “wildcards,” also known as truncation(s), such as \* to include zero or more characters. The use of wildcard turned out to be important especially for “\*security” because most experience scale-based water security research studies use the term water insecurity instead of water security (Section 4).

## RELATED WIREs ARTICLES

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[Community water governance for urban water security in the Global South: Status, lessons, and prospects](#)

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## REFERENCES

- Aboelnga, H. T., Ribbe, L., Frechen, F. B., & Saghir, J. (2019). Urban water security: Definition and assessment framework. *Resources*, 8(4), 1–19. <https://doi.org/10.3390/resources8040178>
- Aboelnga, H. T., El-Naser, H., Ribbe, L., & Frechen, F. B. (2020). Assessing water security in water-scarce cities: Applying the Integrated Urban Water Security Index (IUWSI) in Madaba, Jordan. *Water (Switzerland)*, 12(5), 1–22. <https://doi.org/10.3390/W12051299>
- ADB. (2013). *Asian water development outlook 2013: Measuring water security in Asia and the Pacific*. Philippines: Mandaluyong City. Retrieved from <http://www.adb.org/sites/default/files/pub/2013/asian-water-development-outlook-2013.pdf>
- Aihara, Y., Shrestha, S., Kazama, F., & Nishida, K. (2015). Validation of household water insecurity scale in urban Nepal. *Water Policy*, 17(6), 1019–1032. <https://doi.org/10.2166/wp.2015.116>
- Aihara, Y., Shrestha, S., & Sharma, J. (2016). Household water insecurity, depression and quality of life among postnatal women living in urban Nepal. *Journal of Water and Health*, 14(2), 317–324. <https://doi.org/10.2166/wh.2015.166>
- Albrecht, T. R., Crotoft, A., & Scott, C. A. (2018). The Water-Energy-Food Nexus: A systematic review of methods for nexus assessment. *Environmental Research Letters*, 13(4), 1–26. <https://doi.org/10.1088/1748-9326/aaa9c6>
- Ali, Z. M., Ibrahim, N. A., Mengersen, K., Shitan, M., & Juahir, H. (2014). Robust principal component analysis in water quality index development. *AIP Conference Proceedings*, 1602, 1091–1097. <https://doi.org/10.1063/1.4882620>
- Arreguin-Cortes, F. I., Saavedra-Horita, J. R., Rodriguez-Varela, J. M., Tzatchkov, V. G., Cortez-Mejia, P. E., Llaguno-Guilberto, O. J., Navarro-Barraza, S. (2019). Municipal level water security indices in Mexico. *SN Applied Sciences*, 1(10), 1–16. <https://doi.org/10.1007/s42452-019-1180-2>
- Assefa, Y. T., Babel, M. S., Sukšnik, J., & Shinde, V. R. (2019). Development of a generic domestic water security index, and its application in Addis Ababa, Ethiopia. *Water*, 11(37), 1–23. <https://doi.org/10.3390/w11010037>
- Babel, M. S., Shinde, V. R., Sharma, D., & Dang, N. M. (2020). Measuring water security: A vital step for climate change adaptation. *Environmental Research*, 185(November 2019), 109400. <https://doi.org/10.1016/j.envres.2020.109400>
- Babel, M., & Shinde, V. R. (2018). A framework for water security assessment at basin scale. *APN Science Bulletin*, 8(1), 27–32. <https://doi.org/10.30852/sb.2018.342>
- Basu, M., Hoshino, S., & Hashimoto, S. (2016). A pragmatic analysis of water supply and demand, and adaptive capacity in rural areas: Development of Rural Water Insecurity Index. *Natural Hazards*, 81(1), 447–466. <https://doi.org/10.1007/s11069-015-2091-1>
- Bitterman, P., Tate, E., Van Meter, K. J., & Basu, N. B. (2016). Water security and rainwater harvesting: A conceptual framework and candidate indicators. *Applied Geography*, 76, 75–84. <https://doi.org/10.1016/j.apgeog.2016.09.013>
- Boateng, G. O., Collins, S. M., Mbullo, P., Wekesa, P., Onono, M., Neilands, T. B., & Young, S. L. (2018). A novel household water insecurity scale: Procedures and psychometric analysis among postpartum women in western Kenya. *PLoS One*, 13(6), 1–28. <https://doi.org/10.1371/journal.pone.0198591>
- Boateng, G. O., Neilands, T. B., Frongillo, E. A., Melgar-Quinonez, H. R., & Young, S. L. (2018). Best practices for developing and validating scales for health, social, and behavioral research: A primer. *Frontiers in Public Health*, 6, 1–18. <https://doi.org/10.3389/fpubh.2018.00149>
- Bockstaller, C., & Girardin, P. (2003). How to validate environmental indicators. *Agricultural Systems*, 76(2), 639–653. [https://doi.org/10.1016/S0308-521X\(02\)00053-7](https://doi.org/10.1016/S0308-521X(02)00053-7)
- Brenner, N., & Schmid, C. (2014). The “urban age” in question. *International Journal of Urban and Regional Research*, 38(3), 731–755. <https://doi.org/10.1111/1468-2427.12115>
- Briscoe, J. (2009). Water security. *Innovations: Technology, Governance, and Globalization*, 4(3), 3–28.
- Brown, A. and Matlock, M. D. (2011) *A review of water scarcity indices and methodologies, food, beverage & agriculture*. 106. White Paper #106.
- Burgass, M. J., Halpern, B. S., Nicholson, E., & Milner-Gulland, E. J. (2017). Navigating uncertainty in environmental composite indicators. *Ecological Indicators*, 75, 268–278. <https://doi.org/10.1016/j.ecolind.2016.12.034>
- Cai, J., He, Y., Xie, R., & Liu, Y. (2020). A footprint-based water security assessment: An analysis of Hunan province in China. *Journal of Cleaner Production*, 245, 118485. <https://doi.org/10.1016/j.jclepro.2019.118485>
- Chen, L., & Shi, J. (2016). Analysis and predication of urban water security: a case study of Chengdu City, China. *IOP Conference Series: Earth and Environmental Science*, 39(1), 012027. <https://doi.org/10.1088/1755-1315/39/1/012027>
- China Power (2020) *How does water security affect China's development?* Retrieved from <https://chinapower.csis.org/china-water-security/>.
- Cook, C., & Bakker, K. (2012). Water security: Debating an emerging paradigm. *Global Environmental Change*, 22(1), 94–102. <https://doi.org/10.1016/j.gloenvcha.2011.10.011>
- Danielaini, T. T., Maheshwari, B., & Hagare, D. (2019). An assessment of household water insecurity in a rapidly developing coastal metropolitan region of Indonesia. *Sustainable Cities and Society*, 46(December 2018), 101382. <https://doi.org/10.1016/j.scs.2018.12.010>

- Dickson, S. E., Schuster-Wallace, C. J., & Newton, J. J. (2016). Water security assessment indicators: The rural context. *Water Resources Management*, 30(5), 1567–1604. <https://doi.org/10.1007/s11269-016-1254-5>
- Dubey, S. K., Sharma, D., Babel, M. S., & Mundetia, N. (2020). Application of hydrological model for assessment of water security using multi-model ensemble of CORDEX-South Asia experiments in a semi-arid river basin of India. *Ecological Engineering*, 143(2019), 105641. <https://doi.org/10.1016/j.ecoleng.2019.105641>
- Dumont, E., Williams, R., Keller, V., Voß, A., & Tattari, S. (2012). Modelling indicators of water security, water pollution and aquatic biodiversity in Europe. *Hydrological Sciences Journal*, 57(7), 1378–1403. <https://doi.org/10.1080/02626667.2012.715747>
- Dunn, G., Cook, C., Bakker, K., & Allen, D. (2012). *Water security guidance document*. Vancouver, Canada. Retrieved from: <https://watergovernance.ca/projects/water-security/water-security-manual-2/>.
- Dunn, G., & Bakker, K. (2009). *Canadian approaches to assessing water security: An inventory*. Vancouver, Canada. Available at: University of British Columbia. <http://www.watergovernance.ca/PDF/IndicatorsReportFINAL2009.pdf>
- van Eck, N. J. and Waltman, L. (2020). *VOSviewer manual version 1.6.15*. Leiden. Available from [http://www.vosviewer.com/documentation/Manual\\_VOSviewer\\_1.6.1.pdf](http://www.vosviewer.com/documentation/Manual_VOSviewer_1.6.1.pdf).
- Empinotti, V. L., Budds, J., & Aversa, M. (2019). Governance and water security: The role of the water institutional framework in the 2013–15 water crisis in São Paulo, Brazil. *Geoforum*, 98, 46–54. <https://doi.org/10.1016/j.geoforum.2018.09.022>
- Falkenmark, M., Lundqvist, J., & Widstrand, C. (1989). Macro-scale water scarcity requires micro-scale approaches: Aspects of vulnerability in semi-arid development. *Natural Resources Forum*, 13(4), 258–267. <https://doi.org/10.1111/j.1477-8947.1989.tb00348.x>
- FAO (2015) *AQUASTAT*. Available from <http://www.fao.org/nr/water/aquastat/data/query/index.html>.
- Fischer, G., Hirzsnayik, E., Tramberend, S., & Wiberg, D. (2015). Towards indicators for water security - A global hydro-economic classification of water challenges. *IIASA Interim Report*, 83(2017), 1–6. <https://doi.org/10.1016/J.ENVSCL.2018.02.003>
- Flörke, M., Schneider, C., & McDonald, R. I. (2018). Water competition between cities and agriculture driven by climate change and urban growth. *Nature Sustainability*, 1(1), 51–58. <https://doi.org/10.1038/s41893-017-0006-8>
- Gain, A., Giupponi, C., & Wada, Y. (2016). Measuring global water security towards sustainable development goals. *Environmental Research Letters*, 11, 1–14.
- Garfin, G. M., Scott, C. A., Wilder, M., Varady, R. G., & Merideth, R. (2016). Metrics for assessing adaptive capacity and water security: common challenges, diverging contexts, emerging consensus. *Current Opinion in Environmental Sustainability*, 21, 86–89. <https://doi.org/10.1016/j.cosust.2016.11.007>
- Garrick, D., & Hall, J. W. (2014). Water security and society: Risks, metrics, and Pathways. *Annual Review of Environment and Resources*, 39, 611–639. <https://doi.org/10.1146/annurev-environ-013012-093817>
- Gassert, F., Landis, M., Luck, M., Reig, P., & Shiao, T. (2015) *Aqueduct Metadata Document: Aqueduct Global Maps 2.1*. Available from [http://www.wri.org/sites/default/files/Aqueduct\\_Global\\_Maps\\_2.1.pdf](http://www.wri.org/sites/default/files/Aqueduct_Global_Maps_2.1.pdf).
- Gerlak, A. K., House-Peters, L., Varady, R. G., Albrecht, T., Zúñiga-Terán, A., de Grenade, R. R., ... Scott, C. A. (2018). Water security: A review of place-based research. *Environmental Science and Policy*, 82, 79–89. <https://doi.org/10.1016/j.envsci.2018.01.009>
- Gesualdo, G. C., Oliveira, P. T., Rodrigues, D. B. B., & Gupta, H. V. (2019). Assessing water security in the São Paulo metropolitan region under projected climate change. *Hydrology and Earth System Sciences*, 23(12), 4955–4968. <https://doi.org/10.5194/hess-23-4955-2019>
- Ghosh, R., Kansal, A., & Venkatesh, G. (2019). Urban water security assessment using an integrated metabolism approach-Case study of the National Capital Territory of Delhi in India. *Resources*, 8, 1–15. <https://doi.org/10.3390/resources8020062>
- van Ginkel, K. C. H., Hoekstra, A. Y., Buurman, J., & Hogeboom, R. J. (2018). Urban water security dashboard: Systems approach to characterizing the water security of cities. *Journal of Water Resources Planning and Management*, 144(12), 1–11. [https://doi.org/10.1061/\(ASCE\)WR.1943-5452.0000997](https://doi.org/10.1061/(ASCE)WR.1943-5452.0000997)
- Giri, S., Arbab, N. N., & Lathrop, R. G. (2018). Water security assessment of current and future scenarios through an integrated modeling framework in the Neshanic River Watershed. *Journal of Hydrology*, 563(November), 1025–1041. <https://doi.org/10.1016/j.jhydrol.2018.05.046>
- Gong, L., Jin, C. L., Li, Y. X., & Zhou, Z. L. (2017). A novel water poverty index model for evaluation of Chinese regional water security. *IOP Conference Series: Earth and Environmental Science*, 82(1), 1–9. <https://doi.org/10.1088/1755-1315/82/1/012029>
- GWP (2014). Assessing water security with appropriate indicators. In *Global Water Partnership*. Stockholm, Sweden: Global Water Partnership (GWP) Available from [http://www.gwp.org/Global/ToolBox/Publications/P763\\_GWP\\_Proceedings\\_Paper.pdf](http://www.gwp.org/Global/ToolBox/Publications/P763_GWP_Proceedings_Paper.pdf)
- Hadley, C., & Freeman, M. C. (2016). Assessing reliability, change after intervention, and performance of a water insecurity scale in rural Ethiopia. *Food Security*, 8(4), 855–864. <https://doi.org/10.1007/s12571-016-0599-1>
- Hadley, C., & Wutich, A. (2009). Experience-based measures of food and water security: Biocultural approaches to grounded measures of insecurity. *Human Organization*, 68(4), 451–460. <https://doi.org/10.17730/humo.68.4.932w421317680w5x>
- Hailu, R., Tolossa, D., & Alemu, G. (2020). Household Water Security Index: Development and application in the Awash Basin of Ethiopia. *International Journal of River Basin Management*, 1–17. <https://doi.org/10.1080/15715124.2020.1755300>
- Hinkel, J. (2011). “Indicators of vulnerability and adaptive capacity”: Towards a clarification of the science-policy interface. *Global Environmental Change*, 21(1), 198–208. <https://doi.org/10.1016/j.gloenvcha.2010.08.002>
- Holding, S., & Allen, D. M. (2016). Risk to water security for small islands: an assessment framework and application. *Regional Environmental Change*, 16(3), 827–839. <https://doi.org/10.1007/s10113-015-0794-1>

- Holmatov, B., Lautze, J., Manthrithilake, H., & Makin, I. (2017). Water security for productive economies: Applying an assessment framework in southern Africa. *Physics and Chemistry of the Earth*, 100, 258–269. <https://doi.org/10.1016/j.pce.2017.04.007>
- Howlett, M. P., & Cuenca, J. S. (2017). The use of indicators in environmental policy appraisal: lessons from the design and evolution of water security policy measures. *Journal of Environmental Policy and Planning*, 19(2), 229–243. <https://doi.org/10.1080/1523908X.2016.1207507>
- Huang, Y., Xu, L., Yin, H., YanpengCai, & ZhifengYang. (2015). Dual-level material and psychological assessment of urban water security in a water-stressed coastal city. *Sustainability*, 7, 3900–3918. <https://doi.org/10.3390/su7043900>
- Jaramillo, P., & Nazemi, A. (2018). Assessing urban water security under changing climate: Challenges and ways forward. *Sustainable Cities and Society*, 41(April), 907–918. <https://doi.org/10.1016/j.scs.2017.04.005>
- Jensen, O., & Wu, H. (2018). Urban water security indicators: development and pilot. *Environmental Science and Policy*, 83(February), 33–45. <https://doi.org/10.1016/j.envsci.2018.02.003>
- Jepson, W. (2014). Measuring “no-win” waterscapes: Experience-based scales and classification approaches to assess household water security in colonias on the US-Mexico border. *Geoforum*, 51, 107–120. <https://doi.org/10.1016/j.geoforum.2013.10.002>
- Jepson, W., Budds, J., Eichelberger, L., Harris, L., Norman, E., Reilly, K. O., ... Young, S. (2017). Advancing human capabilities for water security: A relational approach. *Water Security*, 1, 46–52. <https://doi.org/10.1016/j.wasec.2017.07.001>
- Jepson, W. E., Wutich, A., Collins, S. M., Boateng, G. O., & Young, S. L. (2017). Progress in household water insecurity metrics: A cross-disciplinary approach. *WIREs Water*, 4(June), 1–21. <https://doi.org/10.1002/wat2.1214>
- Jepson, W., & Vandewalle, E. (2016). Household water insecurity in the Global North: A study of rural and periurban settlements on the Texas–Mexico border. *The Professional Geographer*, 68(1), 66–81. <https://doi.org/10.1080/00330124.2015.1028324>
- Jia, X., Li, C., Cai, Y., Wang, X., & Sun, L. (2015). An improved method for integrated water security assessment in the Yellow River basin, China. *Stochastic Environmental Research and Risk Assessment*, 29, 2213–2227. <https://doi.org/10.1007/s00477-014-1012-2>
- Jiang, G., He, L., & Jing, J. (2018). Water security evaluation in Yellow River basin. *Advances in Energy Science and Environment Engineering II*, 020059(March), 1–6.
- JMP (2018) *JMP methodology: 2017 update and SDG baselines*. Available from <https://washdata.org/sites/default/files/documents/reports/2018-04/JMP-2017-update-methodology.pdf>.
- Kanakoudis, V., & Tsitsifli, S. (2017). Potable water security assessment – a review on monitoring, modelling and optimization techniques, applied to water distribution networks. *Desalination and Water Treatment*, 99, 18–26. <https://doi.org/10.5004/dwt.2017.21784>
- Kaur, B., Shrestha, N., Daggupati, P., Rudra, R., Goel, P., Shukla, R., & Allataifeh, N. (2019). Water security assessment of the Grand River Watershed in Southwestern Ontario, Canada. *Sustainability*, 11(1183), 1–22. <https://doi.org/10.3390/su11071883>
- Khan, S., Guan, Y., Khan, F., & Khan, Z. (2020). A comprehensive index for measuring water security in an UrbanizingWorld: The case of Pakistan's capital. *Water*, 12, 1–18. <https://doi.org/10.3390/w12010166>
- Kim, Y., Kong, I., Park, H., Jin, H., Jae, I., Um, M., ... Vörösmarty, C. J. (2018). Assessment of regional threats to human water security adopting the global framework: A case study in South Korea. *Science of the Total Environment*, 637–638, 1413–1422. <https://doi.org/10.1016/j.scitotenv.2018.04.420>
- Krueger, E., Rao, P. S. C., & Borchardt, D. (2019). Quantifying urban water supply security under global change. *Global Environmental Change*, 56(February), 66–74. <https://doi.org/10.1016/j.gloenvcha.2019.03.009>
- Lautze, J., & Manthrithilake, H. (2012). Water security: Old concepts, new package, what value? *Natural Resources Forum*, 36(2), 76–87. <https://doi.org/10.1111/j.1477-8947.2012.01448.x>
- Lemos, M. C., Manuel-Navarrete, D., Willems, B. L., Caravantes, R. D., & Varady, R. G. (2016). Advancing metrics: models for understanding adaptive capacity and water security. *Current Opinion in Environmental Sustainability*, 21, 52–57. <https://doi.org/10.1016/j.cosust.2016.11.004>
- Li, D., Wu, S., Liu, L., Liang, Z., & Li, S. (2017). Evaluating regional water security through a freshwater ecosystem service flow model: A case study in Beijing-Tianjian-Hebei region, China. *Ecological Indicators*, 81(June), 159–170. <https://doi.org/10.1016/j.ecolind.2017.05.034>
- Li, X. S., Peng, Z. Y., & Li, T. T. (2016). An evaluation index system of water security in China based on macroeconomic data from 2000 to 2012. *IOP Conference Series: Earth and Environmental Science*, 39, 012045. <https://doi.org/10.1088/1755-1315/39/1/012045>
- Li, X., Su, X., & Wei, Y. (2019). Multistage integrated water security assessment in a typical region of Northwestern China. *Journal of Cleaner Production*, 220, 732–744. <https://doi.org/10.1016/j.jclepro.2019.02.033>
- Ma, H., Liu, L., & Chen, T. (2010). Water security assessment in Haihe River Basin using principal component analysis based on Kendall  $\tau$ . *Environmental Monitoring and Assessment*, 163(1–4), 539–544. <https://doi.org/10.1007/s10661-009-0856-2>
- Marttunen, M., Mustajoki, J., Sojamo, S., Ahopelto, L., & Keskinen, M. (2019). A framework for assessing water security and the water–energy–food nexus — The case of Finland. *Sustainability*, 11(2900), 1–24.
- Mason, N. and Calow, R. (2012) *Water security: From abstract concept to meaningful metrics*. 357. London, UK.
- Mehta, L. (2014). Water and human development. *World Development*, 59, 59–69. <https://doi.org/10.1016/j.worlddev.2013.12.018>
- Mohammadpour, P., Mahjabin, T., Fernandez, J., & Grady, C. (2019). From national indices to regional action—An Analysis of food, energy, water security in Ecuador, Bolivia, and Peru. *Environmental Science and Policy*, 101(September), 291–301. <https://doi.org/10.1016/j.envsci.2019.08.014>
- Molle, F., & Mollinga, P. (2003). Water poverty indicators: Conceptual problems and policy issues. *Water Policy*, 5(5–6), 529–544.
- Mukherjee, S., Sundberg, T., & Schütt, B. (2020). Assessment of water security in socially excluded areas in Kolkata, India: An approach focusing on water, sanitation and hygiene. *Water*, 12, 1–36. <https://doi.org/10.3390/w12030746>
- Naderi, M. (2020). Assessment of water security under climate change for the large watershed of Dorudzan Dam in southern Iran. *Hydrogeology Journal*, 28(5), 1553–1574. <https://doi.org/10.1007/s10040-020-02159-1>

- Nichols, S. J., & Dyer, F. J. (2013). Contribution of national bioassessment approaches for assessing ecological water security: an AUSRIVAS case study. *Frontiers of Environmental Science & Engineering*, 7(5), 669–687. <https://doi.org/10.1007/s11783-013-0556-6>
- Nie, R., Tian, Z., Wang, J., Zhang, H., & Wang, T. (2018). Water security sustainability evaluation: Applying a multistage decision support framework in industrial region. *Journal of Cleaner Production*, 196, 1681–1704. <https://doi.org/10.1016/j.jclepro.2018.06.144>
- Nilsson, L. M., Destouni, G., Berner, J., Dudarev, A. A., Mulvad, G., Odland, J. Ø., ... Evengård, B. (2013). A call for urgent monitoring of food and water security based on relevant indicators for the Arctic. *Ambio*, 42(January), 816–822. <https://doi.org/10.1007/s13280-013-0427-1>
- Nilsson, L. M., Berner, J., Dudarev, A. A., Mulvad, G., Odland, J. Ø., Parkinson, A., ... Evengard, B. (2013). Indicators of food and water security in an Arctic Health context - results from an international workshop discussion. *International Journal of Circumpolar Health*, 72, 1–9. <https://doi.org/10.3402/ijch.v72i0.21530>
- van Noordwijk, M., Kim, Y. S., Leimona, B., Hairiah, K., & Fisher, L. A. (2016). Metrics of water security, adaptive capacity, and agroforestry in Indonesia. *Current Opinion in Environmental Sustainability*, 21, 1–8. <https://doi.org/10.1016/j.cosust.2016.10.004>
- Norman, E. S., Dunn, Gemma., Allen, D. M., & de Albuquerque, R. C. (2013). Water security assessment: Integrating governance and freshwater indicators. *Water Resources Management*, 27(2), 535–551. <https://doi.org/10.1007/s11269-012-0200-4>
- Nounkeu, C. D., & Dharod, J. M. (2019). Status on the scale development to measure water insecurity experiences at the household level: A narrative review. *Advances in Nutrition*, 10(5), 864–875. <https://doi.org/10.1093/advances/nmz008>
- Nussbaum, M. (2011). *Creating capabilities: The human development approach*. Cambridge, MA: Harvard University Press.
- Octavianti, T. (2020). Rethinking water security: How does flooding fit into the concept ? *Environmental Science and Policy*, 106, 145–156. <https://doi.org/10.1016/j.envsci.2020.01.010>
- Padowski, J. C., Carrera, L., & Jawitz, J. W. (2016). Overcoming urban water insecurity with infrastructure and institutions. *Water Resources Management*, 30, 4913–4926. <https://doi.org/10.1007/s11269-016-1461-0>
- Paladini, S. (2012). Evaluating water security in the Asia-Pacific region: a new approach based on vulnerability indices. *Eurasian Geography and Economics*, 53(1), 95–114. <https://doi.org/10.2747/1539-7216.53.1.95>
- Plummer, R., de Loë, R., & Armitage, D. (2012). A systematic review of water vulnerability assessment tools. *Water Resources Management*, 26(15), 4327–4346. <https://doi.org/10.1007/s11269-012-0147-5>
- Rodrigues, D. B. B., Gupta, H. V., Mendiolo, E. M., & Oliveira, P. T. S. (2015). Assessing uncertainties in surface water security: An empirical multimodel approach. *Water Resources Research*, 51, 9013–9028. <https://doi.org/10.1002/2015WR017200.A>
- Rodrigues, D. B. B., Gupta, H. V., & Mendiolo, E. M. (2014). A blue/green water-based accounting framework for assessment of water security. *Water Resources Research*, 50, 7187–7205. <https://doi.org/10.1002/2013WR014274>.Received
- Romero-lankao, P., & Gnat, D. M. (2016). Conceptualizing urban water security in an urbanizing world. *Current Opinion in Environmental Sustainability*, 21, 45–51. <https://doi.org/10.1016/j.cosust.2016.11.002>
- Santeramo, F. G. (2016). Methodological challenges in building composite indexes: Linking theory to practice. V. Jeremic Z. Radojicic & M. Dobrota *Emerging Trends in the Development and Application of Composite Indicators*, 127–139. Hershey, PA: IGI Global. <https://doi.org/10.4018/978-1-5225-0714-7.ch006>
- Scardigno, A., Capone, R., El Bilali, H., & Cardone, G. (2017). Water-food security nexus in Middle East and North Africa Region: An exploratory assessment. *New Medit*, 16(4), 31–38 Available from [http://newmedit.iamb.it/share/img\\_new\\_medit\\_articoli/1119\\_31scardigno.pdf](http://newmedit.iamb.it/share/img_new_medit_articoli/1119_31scardigno.pdf)
- Schlör, H., Venghaus, S., & Hake, J. F. (2018). The FEW-Nexus city index – Measuring urban resilience. *Applied Energy*, 210, 382–392. <https://doi.org/10.1016/j.apenergy.2017.02.026>
- Sen, A. (2009). *The idea of justice*. Cambridge, MA: The Belknap Press of Harvard University Press.
- Shao, D., Yang, F., Xiao, C., & Tan, X. (2012). Evaluation of water security: An integrated approach applied in Wuhan urban agglomeration, China. *Water Science and Technology*, 66(1), 79–87. <https://doi.org/10.2166/wst.2012.147>
- Shrestha, S., Aihara, Y., Bhattarai, A. P., Bista, N., Kondo, N., Futaba, K., ... Shindo, J. (2018). Development of an objective water security index and assessment of its association with quality of life in urban areas of developing countries. *SSM - Population Health*, 6(July), 276–285. <https://doi.org/10.1016/j.ssmph.2018.10.007>
- Slymaker, T., & Johnston, R. (2020). *Detailed review of a recent publication: An innovative measure of the experience of water insecurity can help identify vulnerable households and evaluate interventions Literature Review: Definitions and methods for measuring household water insecurity*. Chapel Hill: The Water Institute at University of North Carolina Available from [https://waterinstitute.unc.edu/wp-content/uploads/sites/3640/2020/07/Issue\\_15\\_final.pdf](https://waterinstitute.unc.edu/wp-content/uploads/sites/3640/2020/07/Issue_15_final.pdf)
- Staddon, C., & James, N. (2014). Water security: Genealogy of a new paradigm for water management? In G. Schneier-Madan (Ed.), *Globalized water: A question of governance* (pp. 261–276). Dordrecht: Springer. <https://doi.org/10.1007/978-94-007-7323-3>
- Stevenson, E. G. J., Greene, L. E., Maes, K. C., Ambelu, A., Tesfaye, Y. A., Rheingans, R., & Hadley, C. (2012). Water insecurity in 3 dimensions: An anthropological perspective on water and women's psychosocial distress in Ethiopia. *Social Science and Medicine*, 75(2), 392–400. <https://doi.org/10.1016/j.socscimed.2012.03.022>
- Stevenson, E. G. J., Ambelu, A., Caruso, B. A., Tesfaye, Y., & Freeman, M. C. (2016). Community water improvement, household water insecurity, and women's psychological distress: An intervention and control study in Ethiopia. *PLoS One*, 11(4), 1–13. <https://doi.org/10.1371/journal.pone.0153432>
- Su, Y., Gao, W., & Guan, D. (2019). Integrated assessment and scenarios simulation of water security system in Japan. *Science of the Total Environment*, 671, 1269–1281. <https://doi.org/10.1016/j.scitotenv.2019.03.373>
- Sullivan, C. (2002). Calculating a Water Poverty Index. *World Development*, 30(7), 1195–1210. [https://doi.org/10.1016/S0305-750X\(02\)00035-9](https://doi.org/10.1016/S0305-750X(02)00035-9)
- Sun, F., Staddon, C., & Chen, M. (2016). Developing and applying water security metrics in China: Experience and challenges. *Current Opinion in Environmental Sustainability*, 21, 29–36. <https://doi.org/10.1016/j.cosust.2016.10.006>

- Thapa, B. R., Ishidaira, H., Pandey, V. P., Bhandari, T. M., & Shakya, N. M. (2018). Evaluation of water security in Kathmandu Valley before and after water transfer from another basin. *Water*, 10(2), 1–12. <https://doi.org/10.3390/w10020224>
- Tomaz, P., Jepson, W., & de Oliveira Santos, J. (2020). Urban household water insecurity from the margins: Perspectives from Northeast Brazil. *Professional Geographer*, 72(4), 481–498. <https://doi.org/10.1080/00330124.2020.1750439>
- Tsai, A. C., Kakuhikire, B., Mushavi, R., Vořechovská, D., Perkins, J. M., McDonough, A. Q., & Bangsberg, D. R. (2016). Population-based study of intra-household gender differences in water insecurity: Reliability and validity of a survey instrument for use in Rural Uganda. *Journal of Water and Health*, 14(2), 280–292. <https://doi.org/10.2166/wh.2015.165>
- Veettil, A. V., & Mishra, A. K. (2016, 542). Water security assessment using blue and green water footprint concepts. *Journal of Hydrology*, 542, 589–602. <https://doi.org/10.1016/j.jhydrol.2016.09.032>
- Veettil, A. V., & Mishra, A. K. (2018). Potential influence of climate and anthropogenic variables on water security using blue and green water scarcity, Falkenmark index, and freshwater provision indicator. *Journal of Environmental Management*, 228(May), 346–362. <https://doi.org/10.1016/j.jenvman.2018.09.012>
- Venghaus, S., & Dieken, S. (2019). From a few security indices to the FEW Security Index: Consistency in global food, energy and water security assessment. *Sustainable Production and Consumption*, 20, 342–355. <https://doi.org/10.1016/j.spc.2019.08.002>
- Vörösmarty, C. J., McIntyre, P. B., Gessner, M. O., Dudgeon, D., Prusevich, A., Green, P., ... Davies, P. M. (2010). Global threats to human water security and river biodiversity. *Nature*, 467(7315), 555–561. <https://doi.org/10.1038/nature09549>
- Wang, X., Chen, Y., Li, Z., Fang, G., & Wang, Y. (2020). Development and utilization of water resources and assessment of water security in Central Asia. *Agricultural Water Management*, 240(June), 106297. <https://doi.org/10.1016/j.agwat.2020.106297>
- Wang, X., Cui, Q., & Li, S. (2012). An optimal water allocation model based on water resources security assessment and its application in Zhangjiakou Region, northern China. *Resources, Conservation and Recycling*, 69, 57–65. <https://doi.org/10.1016/j.resconrec.2012.09.005>
- WaterAid (2012) *Water security framework*. London, UK. Available from [www.wateraid.org/~media/Publications/water-security-framework.pdf](http://www.wateraid.org/~media/Publications/water-security-framework.pdf).
- Wilby, R., & Dessai, S. (2010). Robust adaptation to climate change. *Weather*, 65(7), 180–185. <https://doi.org/10.1002/wea.504>
- Wilder, M. (2016). Metrics: moving beyond the adaptation information gap — Introduction to the special issue. *Current Opinion in Environmental Sustainability*, 21, 90–95. <https://doi.org/10.1016/j.cosust.2016.11.008>
- Willis, H. H., Groves, D. G., Ringel, J. S., Mao, Z., Efron, S., & Abbott, M. (2016) *Developing the Pardee RAND Food-Energy-Water Security Index*. Santa Monica, CA.
- Workman, C. L., & Ureksoy, H. (2017). Water insecurity in a syndemic context: Understanding the psycho-emotional stress of water insecurity in Lesotho, Africa. *Social Science and Medicine*, 179, 52–60. <https://doi.org/10.1016/j.socscimed.2017.02.026>
- World Bank (2015) *Indicators*. Available from <https://data.worldbank.org/indicator>.
- Wutich, A. (2009). Intrahousehold disparities in women and men's experiences of water insecurity and emotional distress in urban Bolivia. *Medical Anthropology Quarterly*, 23(4), 436–454. <https://doi.org/10.1111/j.1548-1387.2009.01072.x>
- Wutich, A., & Ragsdale, K. (2008). Water insecurity and emotional distress: Coping with supply, access, and seasonal variability of water in a Bolivian squatter settlement. *Social Science and Medicine*, 67(12), 2116–2125. <https://doi.org/10.1016/j.socscimed.2008.09.042>
- Xiao-jun, W., Jian-yun, Z., Shahid, S., Xing-hui, X., Rui-min, H., & Man-ting, S. (2014). Catastrophe theory to assess water security and adaptation strategy in the context of environmental change. *Mitigation and Adaptation Strategies for Global Change*, 19(4), 463–477. <https://doi.org/10.1007/s11027-012-9443-x>
- Xiao, S. C., Li, J. X., Xiao, H. L., & Liu, F. M. (2008). Comprehensive assessment of water security for inland watersheds in the Hexi Corridor, Northwest China. *Environmental Geology*, 55(2), 369–376. <https://doi.org/10.1007/s00254-007-0982-5>
- Yang, F., Shao, D., Xiao, C., & Tan, X. (2012). Assessment of urban water security based on catastrophe theory. *Water Science and Technology*, 66(3), 487–493. <https://doi.org/10.2166/wst.2012.182>
- Yin, S., Dongjie, G., Weici, S., & Weijun, G. (2017). Integrated assessment and scenarios simulation of urban water security system in the southwest of China with system dynamics analysis. *Water Science and Technology*, 76(9), 2255–2267. <https://doi.org/10.2166/wst.2017.333>
- Yomo, M., Mourad, K. A., & Gnazou, M. D. T. (2019). Examining water security in the challenging environment in Togo, West Africa. *Water*, 11(2), 1–19. <https://doi.org/10.3390/w11020231>
- Young, S. L., Collins, S. M., Boateng, G. O., Neilands, T. B., Jamaluddine, Z., Miller, J. D., ... HWISE Research Coordination Network. (2019). Development and validation protocol for an instrument to measure household water insecurity across cultures and ecologies: The Household Water InSecurity Experiences (HWIS) Scale. *BMJ Open*, 9(1), e023558. <https://doi.org/10.1136/bmjopen-2018-023558>
- Young, S. L., Boateng, G. O., Jamaluddine, Z., Miller, J. D., Frongillo, E. A., Neilands, T. B., ... HWISE Research Coordination Network. (2019). The Household Water InSecurity Experiences (HWIS) Scale: Development and validation of a household water insecurity measure for low-income and middle-income countries. *BMJ Global Health*, 4(5), e001750. <https://doi.org/10.1136/bmjgh-2019-001750>
- Zarghami, S. A., Gunawan, I., & Schultmann, F. (2018). System dynamics modelling process in water sector: A review of research literature. *Systems Research and Behavioral Science*, 35(6), 776–790. <https://doi.org/10.1002/sres.2518>
- Zeitoun, M., Lankford, B., Krueger, T., Forsyth, T., Carter, R., Hoekstra, A. Y., ... Matthews, N. (2016). Reductionist and integrative research approaches to complex water security policy challenges. *Global Environmental Change*, 39, 143–154. <https://doi.org/10.1016/j.gloenvcha.2016.04.010>
- Zende, A. M., Patil, R. A., & Patil, V. M. (2018). Water security assessment in semi-arid region using geospatial techniques. *Materials Today: Proceedings*, 5(1), 620–627. <https://doi.org/10.1016/j.matpr.2017.11.125>

- Zhang, Y., Xu, Z., & Liao, H. (2019). Water security evaluation based on the TODIM method with probabilistic linguistic term sets. *Soft Computing*, 23(15), 6215–6230. <https://doi.org/10.1007/s00500-018-3276-9>
- Zhang, Z., He, W., An, M., Degefu, D. M., Yuan, L., Shen, J., ... Wu, X. (2019). Water security assessment of China's One Belt and One Road Region. *Water*, 11(3), 1–23. <https://doi.org/10.3390/w11030607>
- Zhao, D., & Strotmann, A. (2015). Analysis and visualization of citation networks. *Synthesis Lectures on Information Concepts, Retrieval, and Services*, 7(1), 1–207. <https://doi.org/10.2200/S00624ED1V01Y201501ICR039>
- Zhao, S., Chen, J., & Weng, Y. (2009). *Research on Urban Water Security Evaluation Based on Unascertained Measure Model*. ICCIT 2009 - 4th International Conference on Computer Sciences and Convergence Information Technology. IEEE, pp. 620–623. doi: <https://doi.org/10.1109/ICCIT.2009.135>
- Zhou, F., Su, W., & Zhang, F. (2019). Influencing indicators and quantitative assessment of water resources security in karst region based on PSER model-the case of Guizhou. *Sustainability*, 11(20), 1–17. <https://doi.org/10.3390/su11205671>
- Zhou, H., Wu, L., & He, B. (2007). Use of Variable Fuzzy Sets Method for Regional Water Security Evaluation. *Proceedings - Fourth International Conference on Fuzzy Systems and Knowledge Discovery, FSKD*. 2007, Vol. 1, pp. 305–309. doi: <https://doi.org/10.1109/FSKD.2007.600>
- Zhu, W., Jia, S., Devineni, N., Lv, A., & Lall, U. (2019). Evaluating China's water security for food production: The role of rainfall and irrigation. *Geophysical Research Letters*, 46(20), 11155–11166. <https://doi.org/10.1029/2019GL083226>
- Zhu, Y. N., & Li, L. (2014). A regional competitive water resources security evaluation model based on nash equilibrium restrictions. *Water Policy*, 16(4), 690–703. <https://doi.org/10.2166/wp.2014.081>
- Zi-Ying, Z., & An-Yan, H. (2018). Construction method and application of water environment security assessment system in Taizhou bay of Zhejiang province. *Journal of Environmental Protection and Ecology*, 19(2), 515–526.

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## APPENDIX

Table A1

**TABLE A1** Conceptual papers

No	Authors, year	Journal
1	Dickson et al. (2016)	Water Resources Management
2	Garfin et al. (2016)	Current Opinion in Environmental Sustainability
3	Garrick and Hall (2014)	Annual Review of Environment and Resources
4	Gerlak et al. (2018)	Environmental Science and Policy
5	GWP (2014)	GWP (Global Water Partnership): Report
6	Howlett and Cuenca (2017)	Journal of Environmental Policy and Planning
7	Jepson, Wutich, et al., (2017)	WIREs water
8	Kanakoudis and Tsitsifli (2017)	Desalination and Water Treatment
9	Lautze and Manthrilake (2012)	Natural Resources Forum
10	Lemos et al. (2016)	Current Opinion in Environmental Sustainability
11	Mason and Calow (2012)	ODI (Overseas Development Institute): Report
12	Nounkeu and Dharod (2019)	Advances in Nutrition
13	Romero-lankao and Gnatz (2016)	Current Opinion in Environmental Sustainability
14	Sun et al (2016)	Current Opinion in Environmental Sustainability
15	van Noordwijk et al. (2016)	Current Opinion in Environmental Sustainability
16	WaterAid (2012)	Wateraid
17	Wilder (2016)	Current Opinion in Environmental Sustainability