Exploring the Affordability of Water Services within and across Utilities

3

4 Abstract

5 The cost of water services in the United States is increasing along with water affordability challenges. 6 We developed an open approach that calculates five affordability metrics at multiple volumes of water 7 usage (from 0 to 16,000 gallons per month) using rates data from 2020 at the scale of census block 8 groups and service areas. We applied this approach to 1,791 utilities in four states. We found 77% of 9 utilities had more than 20% of their population below 200% of the federal poverty level, suggesting 10 widespread poverty is a major contributor to affordability challenges. Depending on how much water a 11 household uses, our results suggest a tenth to a third of households are working more than a day each 12 month to afford their water bills. We developed an interactive visualization tool to bring greater transparency to water affordability (https://nicholasinstitute.duke.edu/water-affordability/water-13 affordability-dashboard) that can be expanded to further increasing our understanding of water 14 15 affordability.

16 Research Impact Statement

Developing an open approach to quantify and visualize water affordability provides insight on the scope
and drivers of affordability.

19 INTRODUCTION

20 In 2017, nearly 29% of the world's population did not have safe, reliable drinking water and 46% did not have access to safely managed sanitation (UNICEF & WH, 2019). The United Nation's 6th Sustainable 21 22 Development Goal is for all people to have access to safe and affordable drinking water by 2030 (United 23 Nations 2018). One component of being able to access water services is the ability for households to 24 afford the costs of those services. In the United States (U.S.), the focus of this study, 1.4 million persons 25 did not have access to water services in 2014, of which many were located in low-income regions (Dig 26 Deep & US Water Alliance 2019). Indeed, the lack of access to water services in the U.S. is more likely 27 due to affordability challenges than physical infrastructure as more than 1.5 million households in 12 28 large utilities owed \$1.1 billion in past-due water bills (Walton 2020). In many states and localities, 29 shutoffs are used to remove these households from access to water services until those bills are paid, 30 thus directly linking affordability to access (Dig Deep & US Water Alliance 2019; Walton 2020). 31 Water affordability and access challenges are increasing in the U.S. as the cost for providing water 32 services is becoming more expensive for both water service providers (hereafter "utilities") and their 33 customers (Teodoro & Saywitz 2019; Beecher 2020; Colton 2020; Goddard et al. 2021; Payne Forthcoming). Initially, the federal government subsidized a portion of the modern water service 34 35 infrastructure through grants and low interest funding. As the federal government has decreased 36 funding, utilities have become primarily responsible for financing water service infrastructure as well as 37 operations (US Water Alliance 2017; Tomer et al. 2019; Greer 2020). Most utilities generate revenue by 38 charging customers for water services and/or establishing taxes (if the utility has taxing authority). Thus, 39 the financial capability of a utility is a function of the number of customers and those customers' 40 financial health. That is, the ability to finance local water utilities has become more dependent on the 41 financial characteristics of the local community (Spearing et al. 2020).

42 In recent decades, water utilities have increased the cost of services faster than inflation to cover rising 43 operational costs in addition to infrastructure repair and replacement costs (Beecher 2020; Greer 2020). 44 Households with moderate or high incomes can typically afford to pay for water services as rates 45 increase; however, low-income households may struggle to pay bills as costs rise. At the utility scale, 46 utilities serving a higher portion of low-income households will have greater difficulty generating 47 sufficient revenues through their customer base without creating undue hardship. Teodoro & Saywitz (2019), for instance, have shown that households with incomes in the lowest 20th percentile are already 48 49 spending an average of 16.5% of their disposable income (income remaining after paying for other 50 essential services like housing, energy, and food) on water services, and that minimum wage earners 51 must work 10 hours per month to pay for water services. Additional increases in water rates may 52 require households to make tradeoffs with other basic living expenses (e.g., rent, electricity, food). 53 Increasing water rates, coupled with the growing geographic economic disparity in household income 54 and wealth in the U.S. (Horowitz et al 2020), lead to commensurate disparities in the fiscal health of 55 local utilities (Smull et al. Forthcoming). Utilities serving declining or struggling communities may also 56 need to make tradeoffs based on what they can afford: servicing debt, ensuring updated infrastructure and service quality, or maintaining affordable rates (Doyle et al. 2020). 57

58 The financial capability of a community refers to the ability for a community (commercial, industry, 59 institutions, and households) to pay for their water utility(ies) costs in terms of infrastructure, 60 operations, maintenance, and financing (e.g., debt service). In the U.S., large federal subsidies were provided in the 1970s and early 1980s to cover the financing and infrastructure costs needed for utilities 61 to adopt the treatment technology required to comply with new regulatory requirements (e.g., Clean 62 63 Water Act (1972) and the Safe Drinking Water Act (1974)) (CBO 2018). The subsidies were designed to 64 be temporary, with local utilities growing their financial capability to cover not only operations and 65 maintenance, but also infrastructure and debt. However, the cost remained prohibitive to many local

66	utilities so the federal government transitioned funding from grants to loans, with the federal
67	contribution steadily diminishing, but not ceasing (Copeland 2019). By 2017, state and local
68	governments were responsible for 96% of water utility financing (CBO 2018; Copeland 2019; Greer
69	2020), and as local communities have moved towards paying full costs, the costs have been ultimately
70	transferred onto their customers, exacerbating household affordability challenges.
71	Household affordability refers to the ability for a household to pay for the basic water services needed
72	for drinking, cooking, cleaning, and sanitation without undue hardship. Household affordability has
73	become more tenuous as the costs of providing water services have increased at about 5% annually in
74	recent decades (4.7% for 1996 – 2016 (Bunch <i>et al.</i> 2017); 5.1% from 2014 – 2018 (AWWA 2019a)). In
75	contrast, the median household income, adjusted for inflation increased at a much slower annual rate
76	(0.44% from 1996-2016 and 2.72% from 2014-2018,
77	https://fred.stlouisfed.org/series/MEHOINUSA672N). The slower increase in income compared to water
78	bills raises deep concerns for the ability of low-income, fixed income, or other economically
79	disadvantaged groups to afford basic water services. While there may be a willingness to pay more to
80	maintain and ensure access to water, the ability of many households to do so may be limited (Baird
81	2010; Mack & Wrase 2017). Detroit, MI provides a stark example, where nearly 40% of the population
82	lives below federal poverty threshold, yet water rates increased by over 400% since 2000 (Lakhani
83	2020).

84 Affordability metrics

A plethora of metrics has been developed to assess the financial capability of the community and
household affordability (e.g. Davis & Teodoro 2014; Teodoro 2018; Raucher *et al.* 2019). The earliest
metric – which has been co-opted as an affordability metric (although never it's intended design) – was
developed by the U.S. Environmental Protection Agency (EPA) in the mid-1980's. This metric sought to

89	determine whether a utility under consent decree had the financial capability to pay for the proposed
90	solution, part of which included the financial impact to households if the utility raised rates to pay for
91	the solution (EPA 1984). In other words, are the rates affordable for a representative income in the
92	community (e.g. median or low-income households)? EPA considered the solution affordable if the
93	proposed rate increase resulted in average household water bills (combined drinking water and
94	wastewater) being less than 4.5% of the median household income (MHI). Importantly, this metric was
95	designed to be used as one of several indicators to determine the utility financial capability, recognizing
96	the added financial burden on households. However, this metric has often been conflated with (and
97	improperly used in isolation as an indicator of) household affordability.
98	Recently, the use of MHI has received considerable scrutiny, in part because it does not capture impacts
99	on low-income residents, who are most sensitive to water affordability challenges (Mack & Wrase 2017;
100	Teodoro 2018; Teodoro & Saywitz 2019; Raucher et al. 2019). To better quantify affordability for low-
101	income households, a growing number of metrics are based on the 20 th percentile income (i.e., low-
102	income) instead of the median income (Teodoro 2018; Raucher et al. 2019). For instance, the recently
103	proposed Household Burden indicator (Raucher et al. 2019) uses the portion of income needed to pay a
104	water bill based on the 20 th percentile income. However, these metrics are not strictly looking at
105	household affordability as much as whether the rates are affordable for a representative low-income
106	household in a community.
107	There are metrics focused solely on the financial capability of the community. For example, the Poverty
108	Prevalence indicator, which quantifies the percent of the community below 200% of the federal poverty

109 level (FPL). By setting aside the costs of water services, the Poverty Prevalence indicator emphasizes

110 only the potential financial capability of the community. Alternatively, there are metrics focused solely

111 on household affordability, such as Minimum Wage Hours (Teodoro 2018), which assesses the number

of hours needed at minimum wage to pay for water services, setting aside the composition of householdincomes in the community.

While there are studies that develop and compare affordability metrics (Teodoro 2018; Van Abs & Evans
2018; Teodoro & Saywitz 2019; Raucher *et al.* 2019), these studies aggregate results across many
utilities and do not allow for exploration of nuances among or within individual utilities. Further, no
metric is perfect; they each provide different insights into overall water affordability, and in

118 combination, provide a potentially more holistic perspective.

119 Objectives

We developed a systematic approach that enables the exploration of multiple affordability metrics 120 121 within and across utilities. This work has three main contributions beyond the results provided in this 122 paper. First, our approach allows for a granular exploration of affordability across a large number of 123 utilities in an open and transparent way that is repeatable and expands the work done in previous 124 studies. Second, we developed an additional metric to understand the distribution of affordability 125 challenges within a utility – the Income Dedicated to Water Service. This is the first metric we are aware 126 of that assesses how many households share a similar affordability burden; thereby showing both the 127 prevalence of affordability challenges (how many households) at a particular level of hardship (percent 128 of income going to water services). Third, the rates data and code to replicate this analysis are open and 129 accessible to expand water affordability research.

We applied this approach to 1,791 utilities located in four states – California (CA), North Carolina (NC),
Pennsylvania (PA), and Texas (TX). Our analysis combined census, utility service area boundary, and
rates (drinking water, wastewater, and stormwater) data to calculate multiple affordability metrics at
different volumes of water usage. We chose these four states because they had water service area

boundaries (a key data requirement) and represented a wide variety of climates, populations, andutilities.

136 We also created an interactive data visualization tool to enable greater transparency as it allows users to 137 examine how affordability changes within and across utility service areas at different volumes of water 138 use (https://nicholasinstitute.duke.edu/water-affordability/water-affordability/dashboard). Finally, we 139 summarize results. Some results are presented using previously recommended thresholds to provide 140 context to frame the conversation. We fully recognize that thresholds are fraught with challenges, as 141 they can be interpreted as fixed boundaries rather than general guidelines for interpretations. However, 142 they also provide useful classifications for communication and guidance as to when metrics may indicate 143 affordability challenges. When possible, we simply used the number of days of labor required to pay for 144 services with more days of labor indicating greater affordability challenges. 145 Our approach relies on publicly available data and open-source software; thus, allowing the analysis to 146 be continually updated and applied to more utilities as data become available. However, while the rates 147 data were public, they required substantial efforts to collect and curate. All scripts use open source 148 software (Rcran and Javascript) to enable transfer of this method to other locations that have service 149 area boundaries and rates data.

150 MATERIALS AND METHODS

151 Data

152 The affordability analysis requires three types of data: (1) service area boundaries, (2) water service

153 rates (drinking, wastewater, and stormwater), and (3) census data.

- 154 Service area boundaries.
- 155 In this study, we selected and obtained water service area boundaries for four states: California
- 156 (https://data.ca.gov/dataset/drinking-water-water-system-service-area-boundaries), North Carolina
- 157 (https://aboutus.internetofwater.dev/layers/aboutus_data:geonode:PWS_NC_20190), Pennsylvania
- 158 (http://www.pasda.psu.edu/uci/DataSummary.aspx?dataset=1090), and Texas
- 159 (https://www3.twdb.texas.gov/apps/WaterServiceBoundaries). California uses digital service area
- 160 boundaries to build multi-utility scoping projects around mutual aid agreements and regionalization
- 161 (CASWRCB 2020). In Pennsylvania, the State Water Plan requires service area boundaries to determine
- 162 non-public water supply areas and assess the population served (PADEP 2009). Similarly, the Texas
- 163 Water Development Board created a statewide public water system service area mapping application to
- 164 update utility boundaries to inform regional and state water planning, particularly projecting population
- and water demand, as well as to estimate populations not served by public water systems (TWDB 2020).
- 166 North Carolina's water supply boundaries were updated in 2019 by a team of students at Duke
- 167 University to aid the state in local water supply planning and emergency response to drought. States
- 168 have different processes for creating and maintaining boundaries and different levels of accuracy. We
- relied on the available spatial boundaries from these four sources and did not adjust or correct
- 170 perceived spatial boundary inaccuracies. We could not locate any statewide wastewater or stormwater
- 171 service area boundaries when those services were separated from drinking water utilities (see below).
- 172Rates data.173There is not a publicly available dataset for water service rates, although there are groups regularly174collecting rates data from utilities through surveys (e.g. https://efc.sog.unc.edu/utility-financial-175sustainability-and-rates-dashboards and https://github.com/California-Data-Collaborative/Open-Water-176Rate-Specification). However, the underlying raw data is not available (only calculated bill estimates).
- 177 Adding to this challenge, there is large diversity in rate structures as each utility is trying to balance

178 several goals including cost recovery, revenue stability, conservation, regulatory compliance, equity 179 across customer classes, and administrative simplicity (Beecher 2020). Differences in priorities and state 180 regulations have led to a plethora of rate structures. For example, some utilities have a single, uniform 181 rate structure for all customers, while others provide different rates based on meter size or customer 182 class (e.g., residential, commercial, industrial). In addition, some utilities have varying water rates based 183 on location within the service area (e.g., inside or outside of a municipal boundary, distribution type, 184 and elevation zones). California had particularly complex rates, with some utilities creating customized 185 water budgets based on previous winter use and property characteristics. All of these variations make it 186 challenging to develop a standardized rates database.

187 We collected rates data through online searches, prioritizing locating rates on the official website of a 188 utility. We created a standardized spreadsheet for data entry. Rate structures often consisted of several 189 components: service charges (a fixed or constant amount charged each month, hereafter referred to as 190 "fixed charge"), commodity charges (amount varies based on usage or household size, hereafter 191 referred to as "usage charge"), and surcharges (extra charges added to the bill, often to cover particular 192 costs associated with debt, capital expenses, or consent decrees). When we were unable to locate rates 193 online, we included the utility in our metadata and placed "not found" in the column listing the website 194 source. However, without rates data for both drinking water and wastewater services, these utilities are 195 not included in the dashboard or analysis.

Importantly, the rates database does not capture customer assistance programs (CAPs) designed to make water more affordable for low-income customers. An estimated 31% to 37% of utilities offer any type of CAPs (EPA 2016; AWWA 2019b; Vedachalam & Dobkin 2021). Furthermore, few utilities report CAPs rates and most require individuals to opt-in (i.e. low-income households or senior citizens are not automatically enrolled), resulting in less than 10 to 15% of eligible households benefiting from these programs (Vedachalam & Dobkin 2021). Thus, it is not possible to discern the scale of CAPs within a

202	utility, precluding our ability to incorporate these programs into a generalizable analysis and approach.
203	While households benefiting from CAPs will receive some financial relief, no affordability metrics
204	currently account for CAPs. The data would need to be collected and future research undertaken to
205	understand how CAPs influence affordability.
206	Census data.
207	The spatial location of census tracts and block groups came from the U.S. Census Bureau. The historic
208	population (1990, 2000, 2010) and income (2000) data came from University of Minnesota's IPUMS
209	National Historical GIS data (Manson et al. 2020), where the data are standardized across block groups
210	over time. The population, household, income, and poverty prevalence of census tracts and block
211	groups were obtained from the Census Bureau's 5-year ACS survey (2014-2019). Block groups were the
212	finest spatial resolution available to estimate household income affordability, including total population
213	(B01001_001), total households (B19001_001), median household income (B19013_001), and the
214	number of households at each income bracket (B19001 group).
215	Census tract data for calculating poverty prevalence included the number of households surveyed
216	(S0101_C01_001) that were below the 200% federal poverty level (S1701_C01_042). The only
217	affordability metric reliant on census tract data was poverty prevalence. Since block groups fit within
218	tracts, we applied the same poverty prevalence to all block groups within a tract. Census data were used
219	to quantify population trends, age, race, income, unemployment, and building age within each service
220	area (included in the online visualization, but not analyzed further here).

221 Utilities included in this study.

For this study, we obtained rates data for 1,957 utilities, of which 1,825 had both drinking water and
wastewater rates. There were 34 utilities had missing service area boundaries, resulting in 1,791 utilities

where we could identify both water and wastewater rates within the service area (Table 1). We

225 identified stormwater rates for 195 utilities (10.8%). The population of utilities in this study ranged from

226 25 (Harris County Municipal Utility District, TX) to over 4 million (Los Angeles Department of Power and

227 Water, CA). The utilities in our dataset served between 65% (Texas) and 92% (California) of each state's

- total population. Overall, 44% of the utilities in our study are large or very large (serving over 10,000 228
- 229 persons), 25% are medium (serving 3,301 to 10,000 persons), and 32% are small or very small (serving
- 230 3,000 or less persons).
- 231 Table 1. Description of utilities included in the study and the percent of state population covered. The
- 232 total number of utilities is based on EPA Safe Drinking Water Information System data

(https://www.epa.gov/enviro/sdwis-model). California and Texas do not include many very small, small, 233

234 or medium utilities at this time.

State	Number of Utilities in Study	Number of Utilities in State	Percent of Utilities in Study	Median Population of Utilities	Population Served by Utilities (millions)	Portion of State(s) Population Represented by Utilities (%)
California	634	2,871	22.1	15,898	36.2	91.6
North Carolina	415	1,962	21.2	3,656	7.1	67.7
Pennsylvania	330	1,883	17.5	8,263	9.8	76.6
Texas	412	4,616	8.9	5,468	18.8	64.8
All Data	1,791	11,332	8.4	9,300	71.9	78.3

Analytical approach 235

236 Affordability metrics strive to answer two questions (1) what is enough water and (2) what constitutes 237 undue financial hardship (Teodoro 2018; Raucher et al. 2019; Goddard et al. 2021)? The typical amount 238 of water considered "enough" for indoor domestic water use in the U.S. is often set at 50 gallons per 239 person per day (Bowne et al. 1994; Teodoro & Saywitz 2019; Raucher et al. 2019). However, the amount 240 of water used (and billed) varies based on household size, age of household, whether appliances are low-flow, irrigation needs, and so on. Previous studies of water affordability used different volumes of 241 242 monthly water consumption such as 5,000 gallons per month (gpm) (Van Abs & Evans 2018), 6,200 gpm

243 (Teodoro & Saywitz 2019), and 12,000 gpm (Mack & Wrase 2017). A recent joint report of several water

244	utility organizations (Raucher et al. 2019) recommended assuming 2.65 persons per household at 50
245	gallons per person per day, resulting in an average use of 4,030 gpm. However, the average per capita
246	water use in the U.S. is 82 gallons (<u>https://www.epa.gov/watersense/statistics-and-facts</u>), which is
247	considerably more than other countries. Even the 50 gallon recommendation is at the upper end of the
248	optimal amount considered necessary to ensure public health (26.4 to 52.8 gallons per person per day)
249	(WHO 2017 Table 5.1). Rather than selecting a single volume, we calculated bills and affordability
250	metrics for no water use to 16,000 gpm at increments of 1,000 gpm. This allows users to select the
251	volume of water most representative of their residential community (including household size) and to
252	assess the sensitivity of affordability metrics to water usage.
253	The definition of undue financial hardship is often described in terms of the acceptable share of a
254	household's income dedicated to water services. Most affordability metrics provide some guidance as to
255	what constitutes undue hardship. Here, we do not subscribe to a recommended threshold but provide
256	context by referring to how many days of labor were required to pay for water services (a day of labor is
257	equivalent to 4.6% of monthly income). This concept is intuitive with the basic understanding that more
258	time spent paying for water services suggests greater affordability challenges.

259 Estimating monthly household bills.

Household bills were quantified as the sum of fixed charges, usage charges, and surcharges. Bills also
could vary by location, as there were many instances when utilities charged different rates to different
regions within their service area, often based on distribution type (pump or gravity), location (closer or
farther away), elevation, or the consolidation of new systems with specific debt service or capital
expenditure needs. In NC, 76% of water and wastewater utilities in this study charged residential
customers different rates depending on if a customer was located inside or outside of a utility's political

266 jurisdiction or municipal boundaries (EFC & NCLM 2018). These geographically variable rates are often 267 referred to as "inside" or "outside" rates, with inside rates being typically lower than outside rates. 268 Inside and outside rates were common for utilities in our study, and when present, often resulted in 269 very different bills. For example, in North Carolina the median outside bill was 72% higher than the 270 inside bill, ranging from as little as 0.4% higher to as much as 272% higher. Both Texas (161 utilities) and 271 California (54 utilities) also had utilities with inside and outside rates, but the difference in bills was 272 smaller than in North Carolina. In Texas, the median outside bill was 29% higher, while in California the 273 median outside bill was 9% higher.

274 Since inside and outside rates resulted in very different bills and were relevant for 29% of our utilities, 275 we estimated which households were billed these rates by intersecting current municipal boundaries 276 with service area boundaries. Households located within the municipal boundary were assigned inside 277 rates, while households outside of the municipal boundary (but inside the service area) were assigned 278 outside rates. For example, Greensboro, NC provides water to those living inside the Greensboro 279 municipal limits as well as outlying areas (Fig 1). Those living inside city limits were assigned inside 280 monthly rates, which has an estimated monthly bill of \$46 for 4,000 gpm of use, while those living 281 outside of the city were assigned outside rates (with an estimated monthly bill of \$110 for 4,000 gpm). 282 Assuming that current municipal boundaries reflect inside and outside charges is an assumption made in 283 lieu of spatially defined rate zones from utilities. For utilities with inside and outside rates, and where 284 there were known stormwater services, stormwater rates were only applied inside the municipal 285 boundary because stormwater services are often provided by municipalities and not water utilities.



Fig 1. Inside-Outside Rates. Inside (municipality) and outside (service area outside of the municipality)
 for Greensboro, NC with the associated inside and outside rates resulting in different monthly bills (inset
 graph on right).

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291 Wastewater services may be provided by the same entity as drinking water; however, Pennsylvania and

292 California often had separate authorities providing drinking water and wastewater. When multiple

293 wastewater providers served customers in the service area of a drinking water utility, we calculated the

294 mean of wastewater bills, and applied that bill to all customers within the drinking water service area.

295 For example, the North Penn Water Authority (Fig 2) provided drinking water services to all or portions

of 10 municipalities; yet each municipality had its own wastewater utility with rates ranging from as low

297 as \$20 per month in Lansdale to as much as \$58 per month in Soulderton at 4,000 gpm. No wastewater 298 rates were identified for two townships. In these instances, given missing data and lack of spatial 299 wastewater service areas, we calculated the mean wastewater bills within the drinking water utility 300 service. Additionally, some utilities charge different rates for different portions of the service area, 301 requiring us to calculate a mean drinking water bill. For example, the North Penn Water Authority 302 charges different drinking water rates in its service area, with Sellersville having lower rates. We took the sum of the mean drinking water bill and mean wastewater bill to estimate a total bill of \$65 that was 303 304 applied throughout North Penn Water Authority (Fig 2).



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Fig 2. Averaging bills within a service area. The North Penn Water Authority (blue) intersects 10 306 307 municipalities, many of which provide their own wastewater services. We calculated the bill for each

308 township and took the mean to get a single estimated bill that we applied across the service area of the

309 drinking water utility; however, there is a wide range in estimated bills depending on location.

311	Different spatial boundaries and inside/outside rates were present for hundreds of utilities in our study,
312	but were generally sufficiently consistent for us to use systematic approaches to standardize rates for
313	analysis. However, a few complex rate structures required additional assumptions (see S1 File).
214	Calculating affordability matrice for block groups
514	
315	We calculated a set of affordability metrics across the hundreds of utilities studied here and could be
316	generated for utilities nationwide (Table 2) using broadly available public data (i.e., service area
317	boundaries, census data, rates). Specifically, we calculated:
318	• Traditional : measures the financial capability of the community by assessing the portion of
319	income spent on water services for the community's median household income (MHI, 50 th
320	percentile of household incomes in the utility) (EPA 1995; EPA 1997).
321	• Household Burden (HB): measures the financial capability of the community by assessing the
322	portion of income spent on water services for the community's lowest quintile income (LQI; 20 th
323	percentile of household incomes in the utility). This metric reflects the financial burden of
324	relatively low-income households in the utility (Raucher et al. 2019). The LQI was estimated by
325	randomly generating incomes for the number of households present within each income
326	bracket (i.e., if there were 50 households in the \$20,000 to \$25,000 income bracket then we
327	generated 50 random incomes within that range) and then calculate the LQI of the randomly
328	generated incomes of all brackets. Previous work has shown this approach to be robust and
329	comparable to assuming all households earn the median income of each bracket (Cardoso &
330	Wichman 2020).

331	• Poverty Prevalence (PP) : portion of households within a service area at or below 200% of the
332	federal poverty level (note that this metric is purely derived from census data and does not
333	consider the costs of providing water services) (Raucher et al. 2019).
334	• Minimum Wage Hours: number of hours worked at minimum wage needed to pay for water
335	services (Teodoro 2018). North Carolina, Pennsylvania, and Texas adopted the federal minimum
336	wage (\$7.25, which was set in 2009), while California had a higher minimum wage of \$12.00 set
337	in 2019. Local governments may provide for a higher minimum wage that is not captured here
338	and may significantly change the results of this metric.
339	While there are other metrics that could be calculated (e.g., the Weighted Average Residential Index
340	and the Affordability Ratio), they require greater granularity of data, such as actual household bills or
341	disposable income, that are difficult to obtain across a large number of utilities, particularly smaller

342 utilities (Davis & Teodoro 2014; Raucher *et al.* 2019).

344 Table 1: Metrics considered in this study (HH is households). The IDWS, a new metric, is described in345 detail below.

			What it
Metric	Description	Formula	measures
Poverty Prevalence	Percent of households	HH Surveyed below 200% FPL	Community
(PP)	below 200% of FPL	HH Surveyed	Financial
		-	Capability
	Percent of median	Annual HH Bill (\$)	Community
Traditional	household income paying	Median HH Income (\$)	Financial
	for water services		Capability
Household Burden	Percent of 20 th percentile	Annual HH Bill (\$)	Community
	household income paying	Lowest Quintils HH Insome (\$)	Financial
(ПВ)	for water services	Lowest Quintile HH Income (\$)	Capability
Minimum Wago	Number of hours worked	HH Bill (\$)	Household
Ninimuni wage	at minimum wage paying	× * * * *	Affordability
Hours	for water services	Minimum Wage $(\frac{1}{hr})$	Anordability
Income Dedicated	Percent of households in a	S(UU with Income HH Bill (\$)	
to Water Services	utility spending x% of	$\Sigma(HH with Income < \frac{1}{Percent Income})$	Household
(IDWS)	income on water services	to Water	Affordability
	meenie on water services	Total HH	

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347 Affordability is concerned with defining what constitutes an "undue hardship". Each of these metrics provides some threshold to provide that context. For example, the Traditional metric suggests that if 348 less than 4.5% of the MHI is going to water services then the rates are affordable for the community 349 350 (EPA 1995; EPA 1997). The HB metric suggests 7% and 10% as indicators that the rates are becoming less 351 affordable for the community (Raucher et al. 2019). PP thresholds suggest less than 20% indicates 352 relatively low amounts of poverty, between 20 to 35% indicates moderate amounts of poverty, and 353 greater than 35% indicates high amounts of poverty (Raucher et al. 2019). The general assessment for 354 minimum wage hours is that a four-person household's basic monthly water and wastewater services 355 bill should not require more than 8 hours at minimum wage to be considered affordable (Teodoro 356 2018).

357 While these thresholds exist, determining what constitutes "enough" water and "undue" hardship are 358 value-based judgments. Instead, we present the results using the number of days of labor required each

359	month as a consistent and intuitive way to provide context to the increasing affordability challenges for
360	the Minimum Wage Hours, Traditional, and Household Burden indicators. A day of labor is roughly
361	equivalent to 4.6% of a household's monthly income. Additionally, a proposed water affordability
362	framework (Raucher et al. 2019) combined HB and PP to understand the financial capability of the
363	community to pay for water services by defining burden levels in terms of a low financial burden to a
364	very high financial burden (Table 2). We adopted similar categories of describing burden levels (i.e. Low
365	to Very High) using the recommended thresholds for Poverty Prevalence and the percent of income
366	representing each subsequent day of labor for the Household Burden.

Table 2. Affordability framework combining Household Burden (HB) and Poverty Prevalence (PP) to
 reflect that water services become increasingly burdensome and unaffordable as HB and PP increase.
 Adopted from (Raucher *et al.* 2019).

Household Burden		Poverty Prevalence	e
by Days of Labor	< 20%	20 to 35%	> 35%
> 2 days (> 9.2%)	Moderate-High	High	Very-High
1 – 2 days (4.7 to 9.2%)	Low-Moderate	Moderate-High	High
< 1 day (4.6%)	Low	Low-Moderate	Moderate-High

370

There is some correlation between HB and PP as the distribution of income in the community influences the income for the lowest quintile; the greater the prevalence of poverty in a community, the lower the 20% of household income (LQI) and the greater the burden of paying for water services. While thresholds provide useful constructs for assessing affordability, such thresholds should be held loosely as the difference between a utility with 19% PP (low) and 21% PP (moderate) is minute. S2 File contains a comparison of affordability results using the recommended thresholds for the Traditional and Household Burden metrics.

378 Linking census data to service areas for income and poverty variables used by affordability 379 metrics. To develop affordability metrics at the block group and utility scale, we intersected census block groups 380 381 and tracts with utility service area boundaries. Since census and service area boundaries do not perfectly align, we calculated the percent of area that intersected to weight affordability metrics when 382 383 aggregating metric scores for the utility. This allows block groups fully in the service area to have greater 384 weight than block groups only partially within the service area. For example, Hillsborough, NC is a rural 385 community that intersects 6 census tracts and 13 block groups (Fig 3). Only one block group was located 386 completely inside the service area boundary of the Hillsborough utility (the remaining overlapped by 0.4 387 to 76%), while the most overlap with a census tract was 55%.



388

389 Fig 3. Overlapping service area and census boundaries. Hillsborough, NC service area intersected

portions of 6 census tracts and 13 block groups. We show the percent of the census tract (red) and block

391 group (black) overlapping the service area.

393	Calculating affordability metrics for the utility.
394	Block group affordability metrics were aggregated to the service area using a recommended weighting
395	method (Raucher et al. 2019). Here, we adjusted the number of households based on the percent of the
396	block group within the service area (Fig 4). For example, if a block group had 100 households, but only
397	45% of the block group was within the service area, then we adjusted the number of households from
398	100 to 45. Next, we summed the total number of adjusted households in the service area. We then
399	weighted the affordability metric scores in each block group based on the total number of households in
400	the service area. For example, in Fig 4, the block group with 45 households represents 9% of all
401	households in the weighted service area (468 households). The Traditional, HB, and PP scores in each
402	gives a score of 0.26). The sum of the affordability metrics in each block group becomes the affordability
403	score for the utility
405	Adjusted Household = Percent of Block Group in Service Area \times Number of Households
406	Block Group $Weight_i = \frac{Adjusted Households_i}{\sum Adjusted Households'}$, where i is an individual block group.
407	Service Area HB Score = $\sum_i HB X Block Group Weight$, where i is an individual block group.



409

If block groups were not weighted, the HB service area score would be 5.14

410 Fig 4. Aggregating block group metrics to a single metric for the utility. Individual block group HB

411 scores were weighted by percent overlap with the utility service area to develop a utility HB score.

- 412
- 413 Utilities with inside-outside rates often had block groups bisected by the municipal boundary. Here, the
- 414 percent of the block group located inside were assigned inside bills and the percent of the block group
- 415 located outside were assigned outside bills. The same weighting method was applied to estimate a
- 416 single affordability metric for each block group and utility. We also used this weighting approach to
- 417 estimate the change in population, MHI, and LQI by block group within utility service area boundaries
- 418 between 2000 and 2019.

419 Income Dedicated to Water Services (IDWS).

- 420 Most metrics consider affordability at a specific income level – the LQI or median – and assess
- affordability based on pre-identified thresholds of income needed for water services (e.g., 4.5%, 7%, 421
- 422 10%). However, these approaches do not quantify how many customers have a low or high financial

burden to pay for water services. We sought to pivot the question to allow utilities to explore the distribution of affordability in their service area by asking, "What proportion of income dedicated to water services is acceptable for what proportion of customers in a utility" (Fig 5)? The advantage of this approach is that it does not require selecting a threshold and it provides information on both the financial capability of households, as well as the relative burden imposed by water rates across the entire population served by the utility.



429

Fig 5. Income Dedicated to Water Service metric. (A) IDWS curve for a single utility. (B) Overlaying an
 individual utility IDWS curve with other utilities.

432

433 We quantified the continuum of income dedicated to paying for water services by dividing the annual 434 household bill by a percentage to identify the income required for the household to spend 1%, 5%, 10%, etc. of their income on water services. For example, if the estimated annual water bill is \$787 (Fig 6), 435 436 and we wanted to know what income would be needed for that bill to account for 7% of household 437 income, we would divide 787/0.07 to find that a household earning \$11,243 annually would spend 7% of their income on water bills. We then quantify the number of households estimated to earn less than 438 439 that amount in a service area using the census data. For example, the North Penn Water Authority has 440 2,175 (3.9% of total) households earning less than \$11,243, thus generating the data point of 3.9% of

- 441 households spend more than 7% of their income on water services. Combining the burden (x% of
- income spent on water services) with the prevalence (percent of households spending that much or
- 443 more) constructs the IDWS for a particular utility (Fig 6).



Fig 6. Schematic showing how IDWS is calculated. The North Penn Water Authority serves ~55,486
households with an estimated annual bill of \$787 at 4,000 gpm. We calculated the annual income
(second column of table) needed for water services to account for some percent of income (first column
of table). We then calculated the percent of houses earning less than that income (third and fourth
column of table) based distribution of households by census income brackets (upper right chart).

450

451 We repeated this method to estimate the annual income needed for water services to account for 1 to

452 20% of income (Fig 6). Next, we summed the total number of adjusted households (Fig 4) within each

453 census income bracket and randomly generated an income for each household within that bracket. We

454 then combined these incomes to create a distribution of household incomes in the service area. Finally,

455 we counted all households that earned less than the household income needed for water service bills to

456 account for some percentage of their annual income (Fig 6). The first and last columns of the table in Fig

457	6 are plotted to visualize how many households spend more than some percentage of their annual
458	income on water related services. This approach allows us to generate a single, continuous curve that
459	represents how many households within a utility share a similar financial burden to pay for services.
460	Moreover, by generating such curves for many utilities, we can also generate summary descriptions for
461	collections of utilities (e.g., the median utility; Fig 5B). This approach is not suitable for utilities that
462	serve a small fraction of a single block group and we did not include those utilities whose service area
463	covered less than 15% of all intersecting block groups (removing 246 utilities).

464 Limitations

There are several limitations and assumptions made around the data. First, the rates data were
manually collected and subject to transcription error, particularly for utilities that are billed by multiple
entities (e.g., municipality owns the infrastructure but another authority treats and distributes water).
We also are not sure how many municipalities have stormwater bills that were missed in our search or
are embedded in property taxes.

470 Second, spatial boundary data only existed for drinking water utilities. The majority of utilities in this 471 study in California, North Carolina, and Texas provided both drinking water and wastewater services and 472 we assumed the service areas were commensurate. However, in Pennsylvania, the geographic footprint 473 and administration of drinking water and wastewater services differed. Here, we took the mean of 474 wastewater bills within the service area of the drinking water utility. Better spatial wastewater data 475 would improve the accuracy of bill estimates for block groups. Similarly, spatial boundary data did not 476 include distinctions of locations where different rates applied. Again, we used the average of the 477 estimated bills, with the exception of inside-outside rates, although we could not confirm that current 478 municipal boundaries were used by all utilities to distinguish inside and outside rates.

479	Third, some communities with drinking water services did not have wastewater services, with
480	households relying on on-site treatment (i.e., septic systems). In these instances, we estimated
481	homeowner costs to maintain a septic system (relevant for 28 utilities in PA). It may be preferable to
482	exclude these utilities in the future or provide affordability metrics for water and wastewater separately.
483	Fourth, this approach is less robust for utilities with a very small service area. Some utilities represent
484	less than 1% of a single block group. The metrics approach estimates affordability for the income
485	composition of the block group; however, it is unknown how accurately the composition of such small
486	utilities represents the composition of the overall block group.
487	Finally, because utilities may change their water rates, we provide the last date a selected utility's rates
488	were updated on our website (between 2020 and 2021). We are in the process of creating tools that

489 would allow the underlying data and affordability tool to be updated.

490 **RESULTS**

- 491 There were 1,791 utilities with rates and service area data included at the time of this study. All results
- 492 can be examined through the use of an interactive dashboard, which visualizes metrics of affordability,

493 water rates, and demographic characteristics for different volumes of usage

494 (https://nicholasinstitute.duke.edu/water-affordability/water-affordability-dashboard). The dashboard

- 495 is continually being updated as new data become available. All results presented here are based on
- analysis of data available as of June 2021.
- 497 For 76% of utilities in this study, the number of customers grew over the past two decades, particularly
- those located in TX and for larger utilities overall (Fig 7). However, the median income decreased for
- 499 35% of utilities in California (CA), 44% in Pennsylvania (PA), 49% in Texas (TX), and 70% of utilities in
- 500 North Carolina (NC). Further, low-income customers had a decrease in adjusted income in 54% of

- 501 utilities (with the median change ranging from 0% in TX to -7.2% in NC). When exploring trajectories by
- 502 utility size, there were slight but not significant differences in population and income trajectories.



504 **Fig 7 Change in income and population for utilities over time.** Change in income and population by 505 (Left) state and (Right) utility size from 2000 to 2019. Income is adjusted to 2019 dollars.

503

507 Cost of water services.

- 508 There was considerable variability in utility rate structures, which created variability in how sensitive
- 509 water bills were to the volume of water used. Overall, the median monthly drinking water bill ranged
- from \$22 with zero usage to \$105 at 16,000 gallons per month (gpm; Fig 8). The median wastewater bill
- ranged from \$27 at zero usage to \$76 at 16,000 gpm. The median total household bill was \$51 without
- any water usage, increasing to \$188 at 16,000 gpm. Twenty-seven utilities exceeded \$200 per month at
- 513 4,000 gpm, 11% of utilities by 8,000 gpm, 31% of utilities by 12,000 gpm, and 54% of utilities by 16,000
- 514 gpm.



Fig 8. Monthly bills by water usage. Total (A), drinking water (B), and wastewater (C) estimated monthly
bills by monthly water usage.

515

519 Most water services included a fixed charge and a usage charge; however, the portion of the monthly

520 bill derived from these components (and surcharge) varied tremendously for similar water usage (Fig 9).

- 521 It was more common for wastewater services to have a single fixed charge (46% for wastewater
- 522 compared to 6% for drinking water). For drinking water, the median percent of the fixed bill decreased

- from 89% at 1,000 gpm to 21% of the bill at 16,000 gpm. The median percent of the fixed bill for
- wastewater decreased from 100% of the bill at 1,000 gpm to 32% of the bill at 16,000 gpm.



Fig 9. Components of monthly bills. (A) Drinking Water and (B) Wastewater monthly bills, their
 components, and the percent of the bill that is fixed at 4,000 gpm for utilities in this study. Note that the
 percent of the fixed bill exceeded 100% for one utility wastewater bill due to averaging bill components
 across multiple service areas within the utility with very different rate structures.

531 Affordability metric comparisons at 4,000 gpm.

- 532 Since the volume of water used directly affected the costs of services, and by extension affordability, we
- 533 first compare affordability metrics assuming 4,000 gpm, which is near the 4,030 gpm recommended by
- Raucher et al. (2019). We then explore the sensitivity of these metrics to changes in volume of water
- used. Using 4,000 gpm, the combination of affordability metrics provided several distinct insights. First,
- 536 Poverty Prevalence (PP), which is the only metric not dependent on water usage, indicated that many
- 537 utilities have widespread poverty in their service area with a median PP of 30%. For utilities in our study,
- 538 77% have a PP greater than 20%, 37.5% have a PP greater than 35% (Table 3, Fig 10), and 143 utilities
- 539 (8%) are serving communities where more than half of the households are below 200% of FPL.



- 553 study. Utilities in Texas required a median of 9.4 hours per month because their average monthly bill
- was often lower (median of \$67) relative to the other states. Utilities in North Carolina and Pennsylvania

required a median of 11.6 and 11.8 hours of labor per month, respectively.

556 **Table 3.** Percent of utilities classified by days of labor needed to pay for water services for their

respective metric at 4,000 gpm. Note that a day of labor is equivalent to 4.6% of monthly income. The

558 exception is Poverty Prevalence, whereby we used recommended thresholds (Raucher *et al.* 2019).

	Days of Labor or	Percent of	Measures	
Metric	Percent of Community	utilities		
Minimum Wago	< 1 day	32.4%	Household	
	1-2 days	60.7%	Affordability	
nours	> 2 days	6.8%	Anoruability	
	< 1 day	98.8%	Financial	
Traditional	1-2 days	1.2%	Capability	
	> 2 days	0.0%	Capability	
Housebold	< 1 day	65.8%	Financial	
Burden (HB)	1-2 days	31.5%	Capability	
Burden (IIB)	> 2 days	2.7%		
Poverty	< 20%	23.0%	Financial	
Provalance (PD)	20-35%	39.5%	Capability	
	> 35%	37.5%		

559

560 Third, the Traditional and HB metrics measuring the financial capacity of median income and low-561 income households in the community to pay for water services was highly correlated ($r^2 = 0.95$, 562 pearson). SI File 2 contains additional information comparing the Traditional and HB metric with their 563 recommended thresholds. While there is strong correlation between the two metrics, we found the HB 564 metric to be more sensitive to low-income households with 34.2% of utilities requiring more than a day of labor for households to pay for services (Table 3). This is in contrast to the Traditional metric where 565 only 1.2% of utilities required more than a day of labor from median households at 4,000 gpm. 566 567 Fourth, block group metrics showed considerable variation within utilities. The 1,791 utilities intersected 568 47,479 census block groups, with each utility comprised of between 1 and 2,779 block groups (median

569	number of block groups in a utility = 9, mean = 32). The Traditional and HB metrics were calculated at
570	the census block group scale, thus providing greater granularity on how rates and household incomes
571	combine within a utility. We found that utilities classified with a Low HB at the scale of the entire service
572	area often contained a few individual block groups with a Moderate or High HB (Table 4). Utilities with a
573	HB classified as Moderate to High at the service area scale had greater diversity in block group HB
574	classifications.

575 **Table 4**. Comparison of Household Burden (HB) metric for utility service areas and their corresponding 576 block groups at 4,000 gallons. For example, for the 65.8% of utilities had a HB requiring less than a day 577 of labor at the utility-wide scale, 83% of block groups within those utilities had a HB requiring less than a 578 day of labor, 14.5% 1-2 days of labor, and 2% more than 2 days of labor. Shaded cells represent the

579 percent of block groups matching the number of days of labor of the utility.

Days of labor each month to afford water bill based on HB	Percent of utilities	Percent of block groups needing < 1 day	Percent of block groups needing 1-2 days	Percent of block groups needing > 2 days	Percent of block groups unknown
Less than 1 day	65.8	82.7	14.5	2.0	0.9
1 to 2 days	31.5	44.6	42.0	12.3	1.0
More than 2 days	2.7	16.2	39.8	42.4	1.3

581	The distribution of affordability by block group primarily reflected the distribution of household income,
582	and where applicable, the presence of inside and outside rates relative to current municipal boundaries
583	(Fig 1). For example, for Greensboro, NC, the entire utility had a poverty prevalence of 34% with
584	minimum wage earners spending nearly 11 hours to pay monthly bills (Figure 11C). The affordability
585	burden matrix (Table 2) indicated the utility as a whole had a low-moderate burden, driven by poverty
586	prevalence (Fig 11C). Within the utility, however, there was clear spatial variability in affordability
587	burden: 94 of the block groups, particularly those located northwest of the city center, had lower
588	burden than block groups located near the city center (Fig 11B). That is, households near the city center

- had lower incomes and would be expected to struggle more to pay for water services than those in the
- 590 northwest region of the service area.



Fig 11. Maps and charts of affordability metrics. (A) Map shows the affordability burden for utilities in
 North Carolina. (B) The affordability burden for block groups within the Greensboro utility. (C)
 Greensboro (blue dot) is plotted alongside other utilities (here, utilities in North Carolina) when looking

595 at affordability metrics.

596

591

597 Income Dedicated to Water Services (IDWS).

598 The previous metrics provide a snapshot of affordability at a particular income level while the Income

599 Dedicated to Water Services (IDWS) metric shows the breadth of impact along a continuum (i.e., how

600 many households spend what percent of income on water services). There was wide variability in the

601 IDWS of utilities in this study, as well as some variability between states. When taken collectively, the 602 IDWS indicated that, for the median utility in our dataset, 16.4% of households spent more than 4% of 603 their income (0.9 days of labor) on water services, while 7.7% of households spent more than 7% of 604 their income (1.5 days of labor) on water services (Fig 12). At the most extreme, 45% of households in one utility spent more than 7% of their income on water services at 4,000 gpm (a utility in NC where 605 606 49% of the population earned less than 200% of the federal poverty level). At the other extreme, 15 utilities had less than 1% of households spending more than 7% of their income on water services (these 607 608 utilities often had both low poverty and low costs). There was also variability in utilities between states 609 (Fig 12); however, the sources of this variability are beyond the scope of this paper.





Fig 12. IDWS results at 4,000 gallons for utilities in the study. Each utility shows the proportion of
 households in the community spending more than some percent of their income on water services.

613 Sensitivity of affordability metrics to water usage.

621

As noted above, many utilities had a moderate affordability burden regardless of water usage because
of poverty prevalence (Fig 10). We found 88% of utilities required less than a day of labor for lowincome households when no water is used (Fig 13A; Table 2). As water usage increased, the burden
increased (utilities move vertically with HB; while PP remained constant since not based on water usage)
(Fig 13A-C); the number of utilities requiring low-income households to spend more than a day of labor
nearly tripled between 0 (12% of utilities) and 4,000 gpm (34% of utilities). Similarly, the number of
utilities requiring low-income households spending more than 2 days of labor doubled for each

thousand gallons of water from 2,000 (0.8% of utilities) to 6,000 gpm (8.6% of utilities) (Fig 13D).



Fig 13. **Changes in affordability by water usage.** Affordability Burden at (A) 0 gpm, (B) 4,000 gpm, and

The amount of water needed for basic use is a function of household size. A single-person household using 50 gallons per day would use 1,500 gpm; at this volume, fewer than 19% utilities in our dataset required more than a day of labor (15 utilities required more than 2 days). However, a four-person household would use 6,000 gpm; at this volume, 551 utilities (58%) required more than a day of labor while 76 of utilities (8%) required more than 2 days of labor (Fig 13D).

631 Nineteen utilities required more than 30 days of labor each year at minimum wage to pay for water 632 services at 4,000 gpm. As water use increased, however, the amount of labor hours needed to pay for 633 water services rapidly grew. For example, at 6,000 gpm (~50 gallons per day for a 4-person household), 634 8% of utilities required more than 30 days to pay for water services each year (Fig 14), and at 10,000 635 gpm, 32% of utilities required more than 30 days per year at minimum wage to pay for water services. 636 By 16,000 gpm, 55% of utilities required more than a month of labor per year at minimum wage to pay 637 for water services, and 14% required 2 months of labor per year. The immense variability in minimum 638 wage hours by utilities at all volumes reflects the importance of rate structures on affordability. This is 639 one part of the equation as even those utilities with identical costs may have dramatically different 640 affordability burdens depending the characteristics of the community served. For example, the same 641 monthly bill of \$80 could be a low financial burden for households in an affluent community, while a 642 high financial burden in a low-resourced community (S3 File).





Fig 14. Changes in minimum wage hours by water usage. The number of days a minimum wage worker
 must labor to pay for water services each year based on monthly water consumption.

- 646
- 647 The effect of increasing water use on affordability was also evident using the IDWS. Doubling the volume
- of water used from 4,000 to 8,000 gpm, the percent of homes spending more than 5% of their income
- on water services increased from a median of 12% to 19% of households in the community (Fig 15).
- 650 Similarly, the breadth of households grew from 5% to 8% when looking at the percent of households
- 651 spending more than 10% of their income on water services.



Fig 15. Change in IDWS by water usage. Percent of households spending more than 1 to 15% income on
water services at 4,000 gpm (Left) and 8,000 gpm (Right). For example, at 4,000 gpm 12% of households
spent more than 5% of their income on water services.

656 **DISCUSSION**

652

657 Affordability metrics provide different insights and collectively give better

658 understanding.

In the last decade, several metrics were developed to understand different aspects of water affordability

660 in the U.S. in terms of the financial capability of utilities and household affordability (Raucher *et al.*

661 2019; Goddard *et al.* 2021). These metrics are intended to identify what constitutes enough water

662 (volume of water used) and undue hardship to pay for basic water services. Rather than advocating for

- one metric, we calculate several metrics across a range of water volumes and provide context for
- hardship in terms of the number of days of labor needed to pay water bills each month. We found each
- 665 metric provided different insights, and in combination, can provide a more comprehensive

understanding of water affordability challenges for utilities and households.

- 667 For example, the Poverty Prevalence metric is based solely on census-based data (no water rates or
- usage data), but demonstrated that many utilities are experiencing widespread poverty (Figs 10 and 13).
- 669 Regardless of water rates or usage, deep poverty can make affording water services a challenge for

households, and simultaneously create financial capability challenges for a utility: if a large portion of
the population served by a utility is low income, then the revenue potential for the utility will be
constrained (Spearing *et al.* 2020; Goddard *et al.* 2021).

673 Similarly, Minimum Wage Hours was an informative metric, yet because it focused solely on household 674 affordability, it was greatly influenced by both water rates set by the utility and the volume of water 675 used by households. Our results demonstrate that regardless of the community composition, in a typical 676 utility, those relying on minimum wage must work 1 to 2 days per month to pay for water services, even 677 when households use relatively low amounts of water use (Figs 10 and 14). This metric was sensitive to 678 the volume of water used, particularly as water use reached levels more typical of large households. At 679 low volumes, Minimum Wage Hours increased by less than an hour per month from 0 to 2,000 gpm, but 680 from 3,000 gpm onward, the median Minimum Wage Hours consistently increased by an hour per 1,000 681 gpm. The slower increase in Minimum Wage Hours for the first 2,000 gpm is likely because many utilities 682 included the first several thousand gallons in the fixed charge. For example, 43% of drinking water rates, 683 and 82% of wastewater rates did not have a usage charge at 2,000 gpm. By 4,000 gpm, 92% of drinking 684 water rates, and 43% of wastewater rates had a usage charge, thus increasing sensitivity to the volume 685 of water used.

686 This metric demonstrated that low-income households are guite vulnerable to the size of water bills and 687 the amount of water used, and are particularly affected by rate structures. Low-income households pay 688 comparatively more for water services because fee structures are often regressive (i.e. water bills 689 account for a larger share of a low-income household budget compared to a high-income household 690 budget) and cumulative across each water service (drinking water, wastewater, and stormwater) 691 (Beecher 2020). This vulnerability highlights the significance of rate design to affordability, particularly 692 when considering the difference in monthly water consumption between households of different sizes. 693 The current paradigm of treating water as an economic good with rates striving to reach economic

equity (everyone pays the same amount) could be reassessed in the context of affordability, so that lowincome households do not spend a higher proportion of their budget on water services (e.g. Beecher
2020).

697 As such, results for Minimum Wage Hours showed the median utility in our study required minimum 698 wage earners to spend 11.7 hours at 6,000 gpm to pay for water services, which is more than the 10.1 699 hours found in Teodoro & Saywitz (2019) for 6,200 gpm. The difference in results highlights both the 700 growing costs of water services and the importance that minimum wages have on alleviating household 701 affordability. Teodoro & Saywitz (2019) used the minimum wage for utilities in their jurisdiction, which 702 may be above the minimum wage set by the state, which is what we used in this study. The importance 703 of higher minimum wages is highlighted by comparing the median utility labor hours in CA (8.2 hours at 704 6,000 gpm with an hourly minimum wage of \$12) compared with NC (15.2 hours at the federal minimum 705 wage of \$7.25).

706 The Traditional and Household Burden (HB) metrics measure the financial capability for the community 707 to afford proposed costs of financing capital and operations. We found that while PP placed many 708 utilities into moderate burden levels for affordability (Table 2 and 3), the HB resulted in utilities with 709 more prevalent poverty to shift from moderate to high affordability burdens as water usage increased (Fig 13D). No utilities with a PP below 20% shifted into a Moderate-High affordability burden until more 710 711 than 4,000 gallons of water were used (Figs 13B and 13C) and no utilities with a low PP had a High or 712 Very High burden up to and including 16,000 gpm. The transition from a moderate to high affordability 713 burden began to increase rapidly after the first 3,000 gallons of water use (Fig 13D). Our approach also 714 takes advantage of the ability to calculate metrics at the block group scale to provide insight into how 715 affordability challenges may be distributed within a utility (Table 4; Fig 11).

Importance of understanding how many households may have difficulty affording water services.

718 The Traditional and HB metrics each provide a single cross-section of the affordability burden (percent 719 of income going towards water services) for a particular representative household income (i.e. MHI or 720 LQI) in the community. While useful, these metrics provide limited insight on how many households 721 experience different levels of affordability burden (Colton 2020; Goddard et al. 2021). The IDWS 722 provides a method to quantify both the affordability burden (i.e. what percent of income is used to pay 723 for water) and the breadth of impact (number of households at that burden level). For example, the 724 median utility in our study would have 8% of their households spending more than 7% of their income 725 on water services (Fig 12). Cardoso & Wichman (2020) adopted 4.5% as the acceptable percent of 726 household income spent on water services, and found that 13.6% of households in their study spent 727 more than 4.5% of their income on water services. Our approach does not allow a direct comparison 728 (because they modeled the volume of water used by households), but our general results are consistent 729 with theirs despite the different approaches. We found that at 2,000 gpm, the median utility had 12% of 730 households spending more than 4% of their income on water services, while at 3,000 gpm 14% of 731 households spent more than 4% of their income on water services. Importantly, however, by 6,000 gpm 732 (a more realistic estimate for larger households), more than 21% of households in the median utility 733 spent more than 4% of their income on water services. If we applied this metric to the 12,000 gpm used 734 by Colton (2020) then 35% of households are spending more than 4% of their income on water services. 735 That is, depending on how much water a household uses, between a tenth to a third of households are 736 working a day or more each month to pay for water services.

737 CONCLUSIONS

738 Previous studies highlighted water affordability challenges by describing the aggregated, utility-scale 739 results for a few volumes of water use at a specific threshold and reported findings across geographic 740 regions or utility size (Mack & Wrase 2017; Teodoro & Saywitz 2019; Colton 202; Goddard et al. 2021). 741 Additionally, many of these studies, due to data limitations, have prioritized certain geographies (e.g. 742 states with data available such as Goddard et al. (2021) for California and for New Jersey (Van Abs & 743 Evans 2018) or limited to certain utility sizes because of data availability (medium or larger utilities such 744 as in Teodoro & Saywitz (2019)). Our work built upon these efforts by collecting rates data and 745 developing a visualization tool that allows utilities (or any user) to explore affordability metrics within 746 and across their utility. This approach allows utilities and regulators (e.g., state agencies or EPA) to avoid 747 reliance on singular metrics or thresholds, as such reliance can overly simplify challenges and obscure 748 which groups are affected by affordability or which causes are most relevant (e.g., rate structures, water 749 usage, minimum wage standards, and/or poverty prevalence). More nuanced understandings of 750 affordability challenges enable us to design policy responses that best fit the needs of particular 751 communities.

752 Making water affordability measures transparent is important for utilities and households. Creating 753 more transparency can improve our understandings of the scale of affordability challenges across 754 utilities and the concentrations within utilities (e.g. Fig 11). Furthermore, the amount of water used by 755 utilities and households varies for numerous reasons including infrastructure age, climate, household 756 size, and so on. Calculating affordability metrics at multiple volumes is important for understanding the 757 challenges facing any particular utility, as well as understanding the implications for rate structures 758 adopted by utilities and the differential impact across income levels. Transparency in water affordability 759 is also critical for informing potential interventions by state or federal governments, whether subsidies 760 at the utility level (e.g., State Revolving Funds) or at the household level (e.g., Customer Assistance

Programs). A suite of affordability metrics is helpful for gaining better understanding of the challenges a
utility is facing to assess what types of policy interventions may be most beneficial.

763 Affordable water services was a burgeoning crisis (Mack & Wrase 2017) prior to the COVID-19 pandemic 764 with periodic, acute crises bringing these challenges to the public's attention (e.g. Flint, Michigan or the 765 bankruptcy of Detroit and subsequent shutoffs). The COVID-19 pandemic has spurred on another acute 766 water affordability crisis, this time nationwide, as the pandemic resulted in businesses closing and rising 767 unemployment. Many households lost jobs, leading to additional financial hardship with the accrual of 768 penalties from unpaid bills (household affordability challenges). At the same time, many states and 769 utilities enacted shutoff moratoria, meaning that utilities lost revenue while having to create new 770 practices and invest in new technologies to ensure workforce safety (utility financial capability). The 771 water affordability tool and the open data and open-source code approach we developed here may help 772 to bring some greater transparency and understanding to how water affordability has been impacted by 773 the pandemic, and how communities, utilities, and households recover.

The combination of metrics and understanding what factors are driving affordability challenges can help
with policy-making and choosing activities that will most directly address the underlying challenge. The
primary activities utilities may take to address affordability challenges include (Goddard *et al.* 2021;
Pierce *et al.* 2021): (1) consolidation and regionalization, (2) rate design changes, (3) customer

assistance programs (including the newly launched Federal Low Income Household Water Assistance

Program; <u>https://www.acf.hhs.gov/ocs/programs/lihwap</u>), (4) water efficiency programs to reduce

usage, and (5) crisis relief to protect households from shutoffs.

781 Finally, our database, and online visualization tool (https://nicholasinstitute.duke.edu/water-

782 <u>affordability/water-affordability-dashboard</u>), represents a limited number of utilities, and reflects rates

and demographic data during a particular period of time (2018 to 2021). Future versions of the

dashboard will include the ability for utilities to directly update their service area boundaries and

provide updated water service rates data, thus increasing the number of utilities included as well as

786 most accurately representing rates. We also envision incorporating non-residential water users (i.e.,

- 787 commercial, industrial) to better understand and visualize sensitivity of these water users to
- affordability challenges as well, and their impact on overall water utility affordability.

789 ACKNOWLEDGEMENTS

Spring Point Partners funded this work through their Delta Water Innovators program. Kyle Onda provided guidance on developing the rates databases and Erika Smull provided review of the scripts written to calculate rates and affordability. The work led by Megan Mullin and Katy Hansen to develop updated shapefile boundaries for the state of North Carolina sparked our initial curiosity and interest in developing a statewide approach to explore affordability. This manuscript benefited from detailed reviews by Manny Teodoro, John Mastraccio, Peter Grevatt, and Sri Vedachalam. The performance of the dashboard benefited from work done by Don't Panic Labs.

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