Appendix A – Data Sources and Analysis Methods

Data Sources

Billing Dataset

The Billing Dataset contains monthly total billed water consumption at the utility-level, also separated into residential, commercial, and master meter customer types. This dataset represents approximately 7.3% of the current United States population. Master meter water demand includes "water transfers from a water utility to private companies, neighboring towns, and other water utilities" and was not used in the sector-level analysis. The full dataset of water providers and corresponding water use and demographic variables can be downloaded from the HydroShare open access database (Chinnasamy et al. 2021).

Flume Dataset

The Flume Dataset contains CBSA-aggregated data for: 1) number of installed devices by month; 2) summary statistics for indoor, outdoor and total monthly water demand; 3) summary statistics for fixture-level indoor monthly water demand variables; 4) summary statistics for outdoor/irrigation monthly water demand; and 5) household-level data for irrigation system characteristics, occupancy, and home characteristics. A complete listing of variables used in the analysis is provided in Table A1.

Table A1. Variables Provided in Flume Dataset as Monthly Values for Calendar Years 2022 – 2023, by Core-Based Statistical Area.

Category	Variable	Sub-variable	Scale	Statistic(s)
Household	Number of		CBSA	Total
Characteristics	Flume			
	Devices			
	Number of		CBSA	Total
	Households			
	Number of		CBSA	Total
	Events			
	Analyzed			
	Postal Code		Household	
	Irrigation	Sprinkler System,	Household	Sprinkler
	System Type	Garden Hose, Drop,		
		Soaker Hose, None		
	Pool		Household	Binary Indicator
	Indicator			

	Household Size (occupants)		Household	
Household	Lot Size		Household	
Characteristics	(square feet)			
	Estimated		Household	Estimated as
	Landscape			40% of Lot Size
	Area (square			
	feet)			
Water Use	Daily Water	Total	Per	Average,
	Use		Household,	Median,
			Per Capita	Standard
				Deviation
		Indoor	Per	Average,
			Household,	Median,
			Per Capita	Standard
				Deviation
		Outdoor	Per	Average,
			Household,	Median,
			Per Capita	Standard
				Deviation
	Fixture-Level	Volume	Per Event	Average,
	Water Use		(except	Median,
			Total)	Total
		Duration	Per Event	Average,
		(minutes per event)		Median
		Flow Rate	Per Event	Average,
		(gallons per minute)		Median
		Number of Events	Per Day	Per Household,
			(except	Per Capita,
			Total)	Total
		Average Water Use		Per Household,
		(gallons per day)		Per Capita
	Irrigation	Irrigation Rate		
	Water Use	(gallons per minute)		
		Irrigation Volume		
		(gallons per square		
		foot)		
		Irrigation Frequency		
		(minutes per day)		

Water Loss Dataset

The Water Loss Dataset was compiled from individual utility water loss audit reports and state water loss audit databases obtained from individual state agencies, available upon request. For each water provider, we compiled data reported for each of the variables (where available) listed in Table A2. The summary statistics and geographic coverage of the Water Loss Dataset are discussed in further detail in **Error! Reference source not found.**.

Table A2. Listing of Utility Water Loss-Related Variables Used In Analysis.

Variable Name	Description	Units
Public Water System	10-digit identification number associated US EPA's	n/a
Identification	with Safe Drinking Water Information System	
Number	database	
Public Water System	Description of water system type, in terms of	n/a
Туре	service area	
Served Population	Estimated average daily population served	each
Served Area	Total land area of water system service area	square
	boundary	meters
Number of	Total number of customer billing connections	each
Connections		
Distribution and	Total linear length of distribution system	miles
Transmission Mains	transmission and distribution mains, including	
Length	service lines up to the meter	
Operating Pressure	Average annual operating pressure for distribution	pounds per
	system	square
		inch
Total Water System	Annual average volume of treated drinking water	million
Input	input to distribution system	gallons per
		day
Real Losses	Average annual volume of water reported as real	million
	losses (i.e. physical water lost to leaks and main	gallons per
	breaks from tanks, transmission and distribution	day
	mains, and services lines)	

Additional Data Sources

We used several additional data sources to inform this analysis, as described in the Methods section of the report. A listing of these additional datasets, as well as the key variables used in the analysis, is provided in Table A3.

Table A3. Description of Additional Datasets and Relevant Variables Used in Analysis.

Data Source	Reference(s)	Geographic	Variables	Notes
		Scale		

Intercensal Population Totals (2000 – 2010, 2010 – 2020)	(U.S. Census Bureau 2016; 2024c)	Cities and Towns, Census Designated Places, Counties, Core- Based Statistical Areas, States, National	Total Population	
American Community Survey 5-year Estimates (2022)	(U.S. Census Bureau 2023)	Cities and Towns, Census Designated Places, Counties, Core- Based Statistical Areas, States, National	Total Population, Total Housing Units, Occupied Housing Units, Occupancy Type, Household Size	5-year Public Use Microdata Sample
American Housing Survey (2019, 2021, 2023)	(U.S. Census Bureau 2020a; 2020b; 2024b)	Core- Based Statistical Area, National	Number of Buildings, Number of Stories Per Building, Average Household Size Per Unit, Average Lot Size Per Unit	
Economic Census (2002, 2007, 2012, 2017, 2022)	(U.S. Census Bureau 2003; 2008; 2013; 2018; 2024a)	Cities and Towns, Census Designated Places, Counties, Core- Based Statistical Areas,	Employment to Population Ratio, NAICS 3- Digit Code, Number of Employees, Number of Establishments	

		States,		
		National		
NClimDiv	(Vose et al.	National	Cooling Degree	Monthly
Database	2014)	Climate	Days, Heating	Average
		Division	Degree Days,	Values
			Precipitation,	
			Maximum	
			Temperate,	
			Minimum	
			Temperature,	
			Average	
			Temperature	
Commercial	(U.S. EIA 2022)	Census	Total	Summarized
Buildings		Division	Conditioned	by Principal
Energy			Floor Area,	Building
Consumption			Number of	Activity and
Survey (2018)			Employees,	Detailed
			Number of	Principal
			Buildings,	Building
			Number of	Activity
			Establishments	
Plant	(USDA et al.	Zip Code	Plant	
Hardiness	2023)		Hardiness	
Zone			Zone	
Designations			Designation	
Community	(U.S. EPA	Public	Public Water	
Water	2024; 2025)	Water	System	
System		System	Identification	
Boundaries			Number,	
			Served	
			Population,	
			Number of	
			Connections,	
			Served Area (in	
			square miles)	

Seasonality and Per Capita Demand Analysis

Seasonality and per capita demand cluster assignments for the Residential and CII sectors of each utility in the Billing Dataset are illustrated in Figure A1. In general, seasonality patterns (indicated by color Error! Reference source not found.) follow distinct spatial t rends in both sectors. Utilities with Low Seasonality patterns were predominantly identified in the eastern half of the Unites as well as some water providers in the southwest, while Moderate Seasonality patterns were predominantly located in the southwest and Great Plains regions, and High Seasonality pattern mostly occurring in the Mountain West and Pacific Northwest. Some exceptions to these trends exist in both sectors and could reflect water providers that have taken steps to improve water efficiency within their service area during and/or areas that do not face the same drivers of seasonal water use as surrounding water providers (e.g., weather, cultural/aesthetic preferences, etc.). Patterns of per capita demand cluster assignments follow similar, though less distinct, trends, with predominantly Low and Moderate per capita demand patterns found in the eastern half of the US, and High per capita demand patterns occurring mostly in the Southwest and Mountain West.

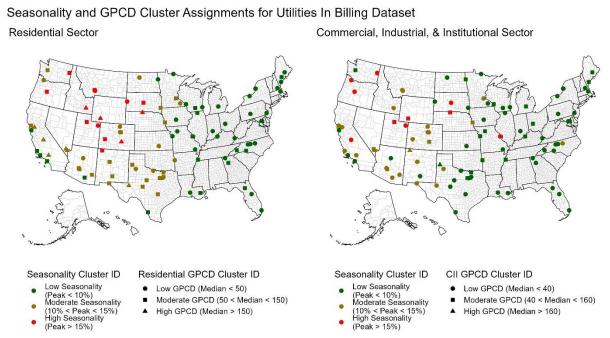


Figure A1. Seasonality and Per Capita Demand Cluster Assignments for Utilities in Billing Dataset, Residential and CII Sectors.

For seasonality, we clustered water providers using the time-series of the mean proportion of monthly water to annual water demand across all years of available data for each utility. For GPCD, we clustered water providers using the average annual GPCD estimated across all years of available data for each utility. We then analyzed the time-series trends in Seasonality and GPCD for each of the three cluster categories over the historical data

period, to evaluate time-dependence of each of the clustering parameters that should be extended to the Baseline year. When accounting for the influence of weather-related variables that also impact monthly water consumption, such as precipitation and temperature, we found no statistically significant time-dependent trends in Seasonality across all three clusters. Therefore, we assume that the Seasonality pattern associated with each cluster extends to the current-day period without change. For GPCD, we similarly accounted for monthly weather-related variables to estimated "weather-normalized" GPCDs for the historical data period and found distinct time-dependent trends in GPCD for each cluster. The "weather-normalized" GPCD represents the hypothetical annual average GPCD for a utility if the weather for that year reflected average values from the historical record. While this approach is suitable for extending water demand trends over a relatively short period, it does not account for changes in water use behavior that could occur due to the impacts of climate change over longer horizons.

The resulting cluster assignments for each parameter were then inspected to ensure that water providers were grouped appropriately and represented distinct Seasonality patterns and GPCD magnitudes. These groupings are illustrated in Figure A2 and Figure A3, showing both the estimated centroid of each cluster and calculated values of the respective clustering parameters for water providers within that cluster. The corresponding monthly average water use, disaggregated by seasonality cluster and GPCD cluster assignments, are also illustrated in Figure A4 and Figure A5 for the Residential and CII sectors respectively. Finally, the results of the Seasonality and GPCD trend analysis are shown in Figure A6 and Figure A7, showing historical cluster-level Seasonality and GPCD as well as projected GPCDs through calendar year 2023, by sector.

Peak vs. Minimum Mean Seasonality Ratio, By Sector

Cluster-Centers Shown As Colored Points, Utility-Level Data Shown In Gray

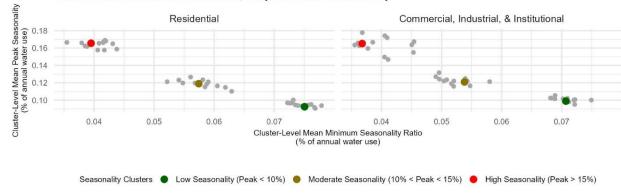


Figure A2. Residential and CII Seasonality Clustering Results Showing Cluster Centers (Colored Points) and Corresponding Utility-Level Data (Gray Points).

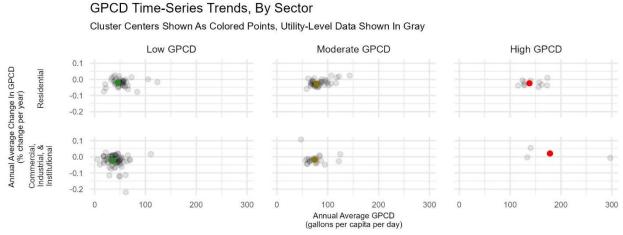


Figure A3. Residential and CII GPCD Clustering Results Showing Cluster Centers (Colored Points) and Corresponding Utility-Level Data (Gray Points).

Projected Median Monthly GPCD, By Seasonality and GPCD Cluster Types Residential Sector, Banded Area Indicates 95% Interval of Utility-Level Data

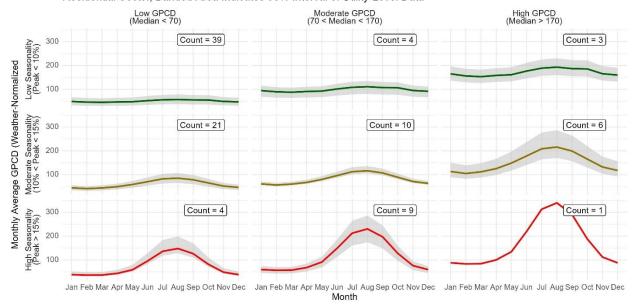


Figure A4. Average Monthly Residential GPCD for Billing Dataset Utilities, By Seasonality Cluster and GPCD Cluster.

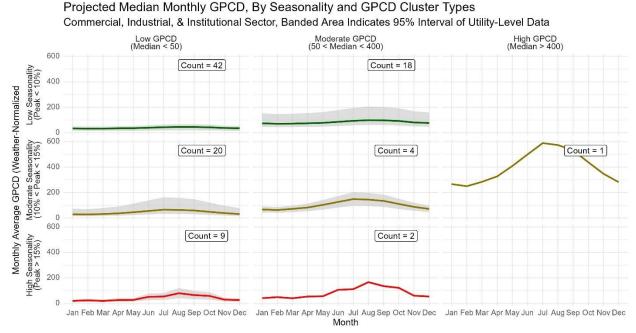


Figure A5. Average Monthly CII GPCD for Billing Dataset Utilities, By Seasonality Cluster and GPCD Cluster.

Projected Median Monthly GPCD, By Seasonality and GPCD Cluster Type
Residential Sector, Banded Area Indicates 95% Interval of Utility-Level Data, Dashed Line Indicates Historical vs. Project

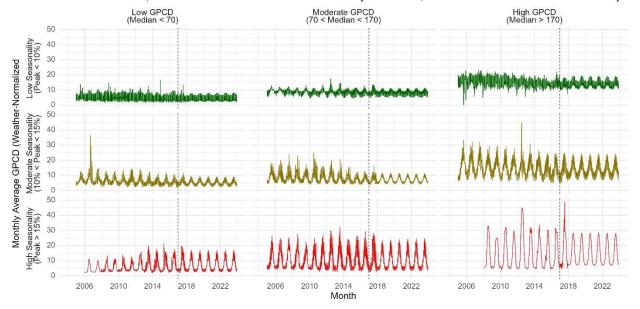


Figure A6. Historical Average (2005 - 2017) and Projected (2018 - 2023) Monthly Residential GPCD for Billing Dataset Utilities, By Seasonality Cluster and GPCD Cluster.

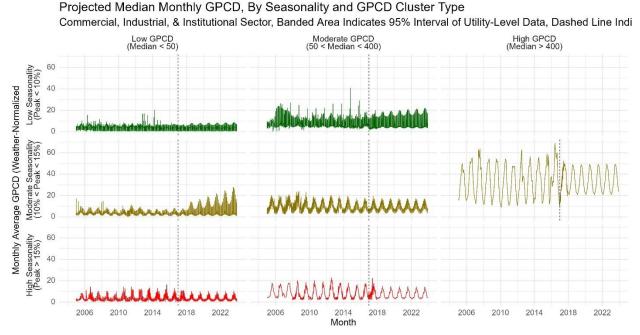


Figure A7. Historical Average (2005 - 2017) and Projected (2018 - 2023) Monthly CII GPCD for Billing Dataset Utilities, By Seasonality Cluster and GPCD Cluster.

For the GPCD analysis, which required monthly data for weather input variables, we assigned each utility to its US Climate Division as defined by the National Oceanic and Atmospheric Administration's National Center for Environmental Information based on location and obtained the corresponding monthly weather input data (Vose et al. 2014).

For GPCD projections, we used the historical average monthly value, over the available period of record, for each weather input variable to represent average weather conditions for projection years and used the average of projected GPCD values for calendar years 2022 and 2023 as the current-day period for this study.

Sector-Specific Analyses

Residential Demand Disaggregation and Seasonal Adjustment

The total water demands in the Residential sector were further disaggregated into indoor and outdoor water demand, as well as to the end use-level for the indoor water demand component. The most common method for disaggregating indoor and outdoor water demand, in the absence of direct data for each component, is to apply the "minimum month" method (MMM). This method assumes that all residential water demand during winter months, typically defined as December through February, is indoor water demand that is relatively consistent throughout the year. Therefore, any surplus water demand beyond this winter month average is considered as outdoor water demand, typically for landscape irrigation. This method is appropriate for areas where winter-time outdoor water demands are almost non-existent but is likely to overestimate the indoor component of water demand in areas landscape irrigation during winter months is more prevalent, such as in southern parts of the United States. The "seasonal adjustment" method (SAM) can be used to account for this geographic trend, by adjusting MMM-derived indoor water use estimates downward using direct data for winter-time outdoor water demands.

For this analysis, we made use of the indoor, outdoor, and total water demand summary statistics from the Flume dataset to compare MMM-derived indoor water demand estimates from the Billing dataset to indoor demands from the Flume datasets for water providers located within one of the CBSAs represented in the Flume dataset. In almost all cases, MMM-derived indoor gpcd estimates were larger than their corresponding Flume dataset indoor gpcd values (Figure A8). To perform the seasonal adjustment for these areas, we calculated the difference in mean monthly indoor water demands between each utility and their corresponding Flume CBSA and re-apportion that difference to outdoor water use across all months. From this process, the largest seasonal adjustments were made to areas classified as "Low" and "Moderate" seasonality, with smaller adjustments observed for "High" seasonality areas and areas where no outdoor water use was reported in the Flume dataset.

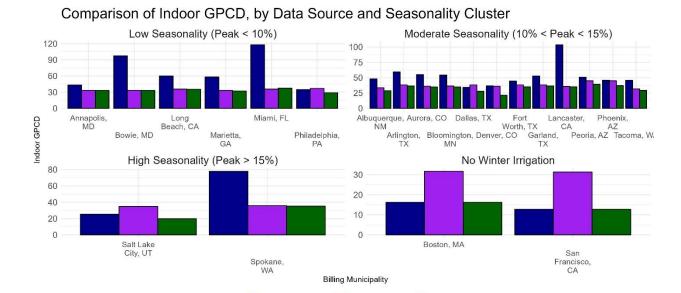


Figure A8. Comparison of Average Monthly Residential Indoor GPCD for Areas Represented by Billing and Flume Dataset, By Estimation Method.

Minimum Month GPCD Flume Median GPCD

Note: Blue - Minimum Month Method Applied to Billing Dataset-Derived Indoor GPCD, Magenta - Median Flume Dataset-Derived Indoor GPCD, Green - Billing Dataset-Derived Total GPCD Multiplied by Median Proportion of Flume-Derived Indoor Water Use.

CII Subsector Disaggregation

The CII sector has not seen the same level of investigation as the Residential sector, in terms of systematic and comprehensive analyses to understand the primary drivers of water use and types of end-uses represented within non-residential buildings. Instead, CII water efficiency literature has historically focused on building-level audits of water use and utility-level, or sometimes state-level, taxonomies of CII building types for aggregate analysis (Brendle Group 2007; Fedak et al. 2019; Hoffman 2016; 2018; 2019; Kiefer et al. 2015; Morales et al. 2010; 2011). For this study, which required a national-scale approach, we leveraged the existing literature with a dataset of summary statistics of water use intensity (WUI) metrics collected from the ENERGY STAR® Portfolio Manager® tool and developed by the US EPA's WaterSense® program (US EPA 2023). This dataset, referred to as the "WUI dataset" in this report, contains state-level 25th percentile, median, and 75th percentile values for building area-normalized annual water use, in gallons per square foot of conditioned floor area per year, and provides a metric for CII water use using the total floor space dedicated to one of twelve non-residential building categories: College/University, K-12 School, Hospital, Hotel, Office, Medical Office, Fire Station, Retail Store, Non-Refrigerated Warehouse, Multi-Family, Senior Living Community, and Supermarket.

The WUI dataset is a self-selected sample, generally representing CII buildings that are either already taking steps to improve their water use efficiency (or at least better track

water use) or are required to submit water use data as part of a regulatory program such as the City of Boston's Building Emissions Reporting and Disclosure Ordinance (City of Boston 2023) and the City of Atlanta's Commercial Buildings Energy Efficiency Ordinance (City of Atlanta 2015). Therefore, we also surveyed the existing literature to develop similar WUI summary statistics of WUI to for comparison. In most cases, the literature-derived median WUI was higher than the median values reported in the WUI dataset, suggesting that the WUI dataset may not be representative of CII buildings at a national-level (Figure A9). To account for this discrepancy, we used the literature-derived WUI values as the starting point for disaggregating the total CII water use estimates developed for this study into subsector-level WUI estimates.

Median Water Use Intesity, By Subsector Lighter Shade/Left Bar Indicates Literature-Derived Value, Darker Shade/Right Bar Indicates USEF (reg 200 Food Service Office Healthcare AccommodalRiaces of Assembly Industrial Subsector Name of Subsector Retail Education Warehousing

Figure A9. Comparison of Literature-Derived and US EPA-Derived Estimates of Median CII Water Use Intensity, By Subsector.

Note: Bars are grouped and color-coded by CII Subsector, with lighter shade indicated literature-derived values and darker shades indicating US EPA-derived values via ENERGYSTAR Portfolio Manager Tool. Error bars indicate inter-quartile range of values (25th percentile to 75th percentile).

From this starting point, we leveraged multiple datasets which included data for total employment for each of the water providers represented in the Billing Dataset and applied area-normalized estimates of employment occupancy (in employee per 1,000 square feet of conditioned floor area), to develop utility-level WUI estimates for the years represented

in the Billing Dataset, following the process illustrated in Figure A10. We obtained estimates of total employment, categorized by industry type via North American Industry Classification System (NAICS) 3-digit code, from the US Economic Census for years 2002, 2007, 2012, and 2017 (U.S. Census Bureau 2003; 2008; 2013; 2018). For each NAICS code, a numeric designation of industry type with increasing specificity based on the number of digits ranging from 2-8, we assigned a single CII subsector that best captures the types of water use within that industry. We estimated average rates of employment occupancy at the Census Division-scale using reported employment and total conditioned area data collected from the 2018 Commercial Building Energy Consumption Survey (CBECS) conducted by the US Energy Information Administration, which is a national sample survey that collects information on the stock of US commercial buildings categorized by Primary Building Activity (PBA). Each PBA category was also assigned a single CII subsector that best captures the types of water use within that PBA. A complete listing of NAICS 3-digits codes and PBAs used in this analysis and mapped to their respective CII subsectors is available in Table A4.

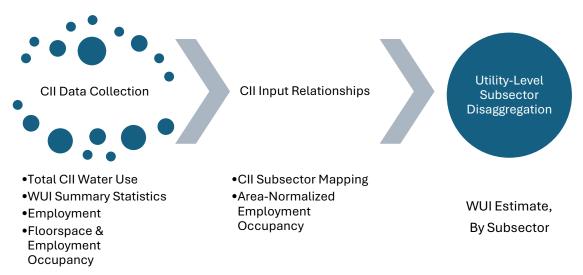


Figure A10. Conceptual Diagram for Disaggregation of Baseline CII Water Use Estimates into Subsectors-Level Estimates.

Using this CII Subsector-NAICS3-CBECS PBA mapping, we also estimated the average ratio of employment occupancy to conditioned floor area and multiplied this ratio by total employment to estimate total conditioned floor area for each CII subsector in each utility's service area. We then apportioned total CII water use for each utility into each CII subsector, assuming subsector-level water use followed the same relative proportion (as a percentage) of subsector-level employment at the utility-level and divided the apportioned annual water use volume by the estimated floor area to develop utility-specific WUI estimates, by CII subsector. As a final adjustment, we then applied a scaling factor to all subsector-level WUIs to ensure that the sum of subsector-level water use estimates matched the total projected current-day water demand for each geography.

Table A4. CII Subsector Assignment Key for NAICS 3-Digit Code, CBECS Principal Building Activity, ENERGYSTAR Portfolio Manager Property Type, and Literature Review-Derived CII Subsectors.

Subsectors.		
CII Data Source	Subsector Identitier	Subsector
		Assignment
NAICS 3-Digit Code	'	Other
NAICS 3-Digit Code		Other
NAICS 3-Digit Code	113 - Forestry and Logging	Other
NAICS 3-Digit Code	<u> </u>	Other
NAICS 3-Digit Code	115 - Support Activities for Agriculture and Forestry	Office
NAICS 3-Digit Code	211 - Oil and Gas Extraction	Other
NAICS 3-Digit Code	212 - Mining (except Oil and Gas)	Other
NAICS 3-Digit Code		Office
NAICS 3-Digit Code		Other
NAICS 3-Digit Code	236 - Construction of Buildings	Office
NAICS 3-Digit Code	237 - Heavy and Civil Engineering Construction	Other
		Office
NAICS 3-Digit Code	311 - Food Manufacturing	Industrial
	312 - Reverage and Tohacco Product	
NAICS 3-Digit Code	Manufacturing	Industrial
NAICS 3-Digit Code	313 - Textile Mills	Industrial
NAICS 3-Digit Code	314 - Textile Product Mills	Industrial
NAICS 3-Digit Code	315 - Apparel Manufacturing	Industrial
NAICS 3-Digit Code	316 - Leather and Allied Product Manufacturing	Industrial
NAICS 3-Digit Code	321 - Wood Product Manufacturing	Industrial
NAICS 3-Digit Code	322 - Paper Manufacturing	Industrial
NAICS 3-Digit Code		Office
NAICS 3-Digit Code	324 - Petroleum and Coal Products	Industrial
NAICS 3-Digit Code		Industrial
NAICS 3-Digit Code	326 - Plastics and Rubber Products	Industrial
NAICS 3-Digit Code	327 - Nonmetallic Mineral Product Manufacturing	Industrial
NAICS 3-Digit Code	331 - Primary Metal Manufacturing	Industrial
NAICS 3-Digit Code	332 - Fabricated Metal Product Manufacturing	Industrial
NAICS 3-Digit Code	333 - Machinery Manufacturing	Industrial
NAICS 3-Digit Code	334 - Computer and Electronic Product	Industrial
NAICS 3-Digit Code	335 - Electrical Equipment, Appliance, and	Industrial
NAICS 3-Digit Code		Industrial
·		

Oll Data Carrier	Out a set and the set if an	Subsector
CII Data Source	Subsector Identifier	Assignment
NAICS 3-Digit Code	337 - Furniture and Related Product Manufacturing	Industrial
NAICS 3-Digit Code	339 - Miscellaneous Manufacturing	Industrial
NAICS 3-Digit Code	423 - Merchant Wholesalers, Durable Goods	Warehousing
NAICS 3-Digit Code	424 - Merchant Wholesalers, Nondurable Goods	Warehousing
NAICS 3-Digit Code	425 - Wholesale Electronic Markets and Agents and Brokers	Warehousing
NAICS 3-Digit Code	441 - Motor Vehicle and Parts Dealers	Retail
NAICS 3-Digit Code	442 - Furniture and Home Furnishings Stores	Retail
NAICS 3-Digit Code	443 - Electronics and Appliance Stores	Retail
NAICS 3-Digit Code	444 - Building Material and Garden Equipment and Supplies Dealers	Retail
NAICS 3-Digit Code	445 - Food and Beverage Stores	Retail
NAICS 3-Digit Code	446 - Health and Personal Care Stores	Retail
NAICS 3-Digit Code	447 - Gasoline Stations	Retail
NAICS 3-Digit Code	448 - Clothing and Clothing Accessories Stores	Retail
NAICS 3-Digit Code	451 - Sporting Goods, Hobby, Book, and Music Stores	Retail
NAICS 3-Digit Code	452 - General Merchandise Stores	Retail
NAICS 3-Digit Code	453 - Miscellaneous Store Retailers	Retail
NAICS 3-Digit Code	454 - Nonstore Retailers	Retail
NAICS 3-Digit Code	481 - Air Transportation	Other
NAICS 3-Digit Code	482 - Rail Transportation	Other
		Other
NAICS 3-Digit Code	484 - Truck Transportation	Other
NAICS 3-Digit Code	485 - Transit and Ground Passenger Transportation	Other
NAICS 3-Digit Code	486 - Pipeline Transportation	Other
NAICS 3-Digit Code	487 - Scenic and Sightseeing Transportation	Other
NAICS 3-Digit Code	488 - Support Activities for Transportation	Other
NAICS 3-Digit Code	491 - Postal Service	Retail
NAICS 3-Digit Code	492 - Couriers and Messengers	Retail
NAICS 3-Digit Code	493 - Warehousing and Storage	Warehousing
NAICS 3-Digit Code	511 - Publishing Industries (except Internet)	Office
NAICS 3-Digit Code	512 - Motion Picture and Sound Recording Industries	Office
NAICS 3-Digit Code	515 - Broadcasting (except Internet)	Office
NAICS 3-Digit Code	516 - Internet Publishing and Broadcasting	Office
NAICS 3-Digit Code	517 - Telecommunications	Office

		Subsector	
CII Data Source	Subsector Identifier	Assignment	
NA 100 0 D: 4: 0 1	518 - Internet Service Providers, Web Search	J	
NAICS 3-Digit Code	Portals, and Data Processing Services	Office	
NAICS 3-Digit Code	519 - Other Information Services	Office	
NAICS 3-Digit Code	521 - Monetary Authorities - Central Bank	Office	
NAICS 3-Digit Code	522 - Credit Intermediation and Related Activities	Office	
	523 - Securities, Commodity Contracts, and		
NAICS 3-Digit Code	Other Financial Investments and Related	Office	
	Activities		
NAICS 3-Digit Code	524 - Insurance Carriers and Related Activities	Office	
NAICS 3-Digit Code	525 - Funds, Trusts, and Other Financial Vehicles	Office	
NAICS 3-Digit Code	531 - Real Estate	Office	
NAICS 3-Digit Code	532 - Rental and Leasing Services	Office	
NAICC 2 Digit Code	533 - Lessors of Nonfinancial Intangible Assets	Office	
NAICS 3-Digit Code	(except Copyrighted Works)	Office	
NAICS 2 Digit Code	541 - Professional, Scientific, and Technical	Office	
NAICS 3-Digit Code	Services	Office	
NAICS 3-Digit Code	551 - Management of Companies and Enterprises	Office	
NAICS 3-Digit Code	561 - Administrative and Support Services	Office	
NAICS 2 Digit Code	562 - Waste Management and Remediation	Office	
NAICS 3-Digit Code	Services	Office	
NAICS 3-Digit Code	611 - Educational Services	Education	
NAICS 3-Digit Code	621 - Ambulatory Health Care Services	Healthcare	
NAICS 3-Digit Code	622 - Hospitals	Healthcare	
NAICS 3-Digit Code	623 - Nursing and Residential Care Facilities	Healthcare	
NAICS 3-Digit Code	624 - Social Assistance	Healthcare	
NAICS 2 Digit Code	711 - Performing Arts, Spectator Sports, and	Diagon of Assambly	
NAICS 3-Digit Code	Related Industries	Places of Assembly	
NAICS 2 Digit Code	712 - Museums, Historical Sites, and Similar	Diagon of Assambly	
NAICS 3-Digit Code	Institutions	Places of Assembly	
NAICS 2 Digit Code	713 - Amusement, Gambling, and Recreation	Diagon of Assambly	
NAICS 3-Digit Code	Industries	Places of Assembly	
NAICS 3-Digit Code	721 - Accommodation	Accommodation	
NAICS 3-Digit Code	722 - Food Services and Drinking Places	Food Service	
NAICS 3-Digit Code	811 - Repair and Maintenance	Retail	
NAICS 3-Digit Code	812 - Personal and Laundry Services	Retail	
NAICS 3-Digit Code	813 - Religious, Grantmaking, Civic, Professional,	Office	
	and Similar Organizations	Office	
NAICS 3-Digit Code	814 - Private Households	Other	
NAICS 3 Digit Codo	921 - Executive, Legislative, and Other General	Office	
NAICS 3-Digit Code	Government Support	Office	
NAICS 3-Digit Code	922 - Justice, Public Order, and Safety Activities	Office	
·		·	

Oll Data Carrier	Cubaaatau Idautifiau	Subsector
CII Data Source	Subsector Identifier	Assignment
NAICS 3-Digit Code	923 - Administration of Human Resource Programs	Office
NAICS 3-Digit Code	924 - Administration of Environmental Quality Programs	Office
NAICS 3-Digit Code	925 - Administration of Housing Programs, Urban Planning, and Community Development	Office
NAICS 3-Digit Code	926 - Administration of Economic Programs	Office
NAICS 3-Digit Code	927 - Space Research and Technology	Office
NAICS 3-Digit Code	928 - National Security and International Affairs	Office
CBECS Principal Building Activity	1 - Vacant	Other
CBECS Principal Building Activity	2 - Office	Office
CBECS Principal Building Activity	4 - Laboratory	Office
CBECS Principal Building Activity	5 - Nonrefrigerated warehouse	Warehousing
CBECS Principal Building Activity	6 - Food sales	Retail
CBECS Principal Building Activity	7 - Public order and safety	Office
CBECS Principal Building Activity	8 - Outpatient health care	Healthcare
CBECS Principal Building Activity	11 - Refrigerated warehouse	Warehousing
CBECS Principal Building Activity	12 - Religious worship	Places of Assembly
CBECS Principal Building Activity	13 - Public assembly	Places of Assembly
CBECS Principal Building Activity	14 - Education	Education
CBECS Principal Building Activity	15 - Food service	Food Service
CBECS Principal Building Activity	16 - Inpatient health care	Healthcare
CBECS Principal Building Activity	17 - Nursing	Healthcare
CBECS Principal Building Activity	18 - Lodging	Accommodation
CBECS Principal Building Activity	23 - Strip shopping center	Retail

CII Data Source	Subsector Identifier	Subsector
Cii Data Source	Subsector Identifier	Assignment
CBECS Principal	24 - Enclosed mall	Retail
Building Activity	24 - Enclosed matt	notait
CBECS Principal	25 - Retail other than mall	Retail
Building Activity	20 Notal other than mate	riotait
CBECS Principal	26 - Service	Office
Building Activity	20 0011100	Office
CBECS Principal	91 - Other	Other
Building Activity		0 11101
CBECS Principal	1 - Vacant	Other
Building Activity	T Vacant	Ottion
CBECS Principal	2 - Administrative/professional office	Office
Building Activity	2 / Administrative/professionatemos	011100
CBECS Principal	3 - Bank/other financial	Office
Building Activity	5 Barno etrior interiorat	011100
CBECS Principal	4 - Government office	Office
Building Activity	T GOVORNMENT OFFICE	Office
CBECS Principal	5 - Medical office (non-diagnostic)	Office
Building Activity	o Trodicat critico (non diagnostio)	011100
CBECS Principal	6 - Mixed-use office	Office
Building Activity	o Timou documen	
CBECS Principal	7 - Other office	Office
Building Activity	, Guior Gines	011100
CBECS Principal	8 - Laboratory	Office
Building Activity	o Laboratory	011100
CBECS Principal	9 - Distribution/shipping center	Warehousing
Building Activity	o Dietilodie in pping center	War erre de erre
CBECS Principal	10 - Non-refrigerated warehouse	Warehousing
Building Activity	To Trem Temperated Warehouse	War erre de erre
CBECS Principal	11 - Public rental storage units	Warehousing
Building Activity	The date remarks to tage and	War erre de erre
CBECS Principal	12 - Convenience store (w/ or w/out gas station)	Retail
Building Activity	12 Convenience store (in or work gas station)	riotan
CBECS Principal	14 - Grocery store/food market	Retail
Building Activity		
CBECS Principal	15 - Other food sales	Retail
Building Activity		. iotait
CBECS Principal	16 - Fire station/police station	Office
Building Activity		3.1100
CBECS Principal	17 - Other public order and safety	Office
Building Activity	Tanon passio state and outory	

CII Data Source	Subsector Identifier	Subsector
Cii Data Source	Subsector identifier	Assignment
CBECS Principal	18 - Medical office (diagnostic)	Healthcare
Building Activity	To - Medicat office (diagnostic)	routtrouro
CBECS Principal	19 - Clinic/other outpatient health	Healthcare
Building Activity	To Guillor outpution thouten	
CBECS Principal	20 - Refrigerated warehouse	Warehousing
Building Activity	20 Homgoratoa waronoaco	vvarenousing
CBECS Principal	21 - Religious worship	Places of Assembly
Building Activity	Z1 Hougidd Woleinp	r tagge of 7 taggringty
CBECS Principal	22 - Entertainment/culture	Places of Assembly
Building Activity	22 Entortainmond duttaro	r tabba ar / tabbi inaty
CBECS Principal	23 - Library	Places of Assembly
Building Activity	20 Library	r tagge of 7 tagginsty
CBECS Principal	24 - Recreation	Places of Assembly
Building Activity	24 110010411011	r tabba ar / tabbi inaty
CBECS Principal	25 - Social/meeting	Places of Assembly
Building Activity	20 Goolas Mosting	r tabba of Alabertiaty
CBECS Principal	26 - Other public assembly	Places of Assembly
Building Activity	20 - Other public assembly	
CBECS Principal	27 - College/university	Education
Building Activity	27 - Odlicgorumversity	Eddedion
CBECS Principal	28 - Elementary school	Education
Building Activity	20 - Eternentary School	Ludcation
CBECS Principal	29 - High school	Education
Building Activity	29 - 1 light 301100t	Ludcation
CBECS Principal	30 - Preschool/daycare	Education
Building Activity	50 - Freschool/daycare	Luucation
CBECS Principal	31 - Other classroom education	Education
Building Activity	S1 - Other classicon education	Luucation
CBECS Principal	32 - Fast food	Food Service
Building Activity	52 - Fast 1000	Food Service
CBECS Principal	33 - Restaurant/cafeteria	Food Service
Building Activity	55 - Nestaurant/Careteria	rood Service
CBECS Principal	34 - Other food service	Food Service
Building Activity	54 - Other lood service	Food Service
CBECS Principal	25 Hospital/inpationt hoolth	Hoolthoore
Building Activity	35 - Hospital/inpatient health	Healthcare
CBECS Principal	26 Nursing home/societed living	Hoolthoore
Building Activity	36 - Nursing home/assisted living	Healthcare
CBECS Principal	27 Dormiton/frotornity/corority	Accommodation
Building Activity	37 - Dormitory/fraternity/sorority	Accommodation

		Τ
CII Data Source	Subsector Identifier	Subsector
		Assignment
CBECS Principal	38 - Hotel/resort	Accommodation
Building Activity		
CBECS Principal	39 - Motel/inn/bed and breakfast	Accommodation
Building Activity	oo maaaaaaaaaaaaaaaaaaaaaaaaaaaaaaaaaaa	
CBECS Principal	40 - Other lodging	Accommodation
Building Activity	To Other toughing	7.00011111104441011
CBECS Principal	42 - Retail store	Retail
Building Activity	42 Notali Store	
CBECS Principal	43 - Other retail	Retail
Building Activity	45 - Other retail	retait
CBECS Principal	44 - Post office/postal center	Retail
Building Activity	44 - Fost office/postat center	Netait
CBECS Principal	46 Vahiala aandaa (ranair ahan	Datail
Building Activity	46 - Vehicle service/repair shop	Retail
CBECS Principal	47 Vahiala ataraga/maintananaa	Marabauaing
Building Activity	47 - Vehicle storage/maintenance	Warehousing
CBECS Principal	48 - Other service	Deteil
Building Activity	48 - Other Service	Retail
CBECS Principal	40. Other:	Other
Building Activity	49 - Other	
CBECS Principal	50. Otain also anais durall	D
Building Activity	50 - Strip shopping mall	Retail
CBECS Principal	54 5 1 1	Datail
Building Activity	51 - Enclosed mall	Retail
CBECS Principal	50.0 / //	Office
Building Activity	52 - Courthouse/probation office	
CBECS Principal		Education
Building Activity	54 - Middle/junior high school	
CBECS Principal	55 M III	- · · · ·
Building Activity	55 - Multi-grade school (any K-12)	Education
ENERGYSTAR	D 1 D 1	0,00
Property Type	Bank Branch	Office
ENERGYSTAR	Fig. and in I Office	04
Property Type	Financial Office	Office
ENERGYSTAR		
Property Type	Adult Education	Education
ENERGYSTAR		
Property Type	College/University	Education
ENERGYSTAR		
Property Type	K-12 School	Education

CII Data Source	Subsector Identifier	Subsector Assignment
ENERGYSTAR		
Property Type	Other - Education	Education
ENERGYSTAR	Pre-school/Daycare	Education
Property Type		
ENERGYSTAR		Education
Property Type	Vocational School	
ENERGYSTAR		
Property Type	Bar/Nightclub	Food Service
ENERGYSTAR		
Property Type	Aquarium	Other
ENERGYSTAR		
Property Type	Fitness Center/Health Club/Gym	Other
ENERGYSTAR		
Property Type	Swimming Pool	Other
ENERGYSTAR		Other
Property Type	Zoo	
ENERGYSTAR		
Property Type	Bowling Alley	Places of Assembly
ENERGYSTAR		Places of Assembly
Property Type	Casino	
ENERGYSTAR		Places of Assembly
Property Type	Convention Center	
ENERGYSTAR		Places of Assembly
Property Type	Ice/Curling Rink	
ENERGYSTAR		Places of Assembly
Property Type	Indoor Arena	
ENERGYSTAR		Places of Assembly
Property Type	Movie Theater	
ENERGYSTAR		Places of Assembly
Property Type	Museum	
ENERGYSTAR		
Property Type	Other - Entertainment/Public Assembly	Places of Assembly
ENERGYSTAR		Places of Assembly
Property Type	Other - Recreation	
ENERGYSTAR	011 01 11	
Property Type	Other - Stadium	Places of Assembly
ENERGYSTAR	Performing Arts	
Property Type		Places of Assembly
ENERGYSTAR	Race Track	DI
Property Type		Places of Assembly

CII Data Source	Subsector Identifier	Subsector Assignment
ENERGYSTAR	Social/Meeting Hall	Places of Assembly
Property Type	Obolati localing rida	r taded of 7 todernoty
ENERGYSTAR	Stadium (Closed)	Places of Assembly
Property Type	Stadium (Glosed)	
ENERGYSTAR	Stadium (On an)	Places of Assembly
Property Type	Stadium (Open)	
ENERGYSTAR	Fast Food Restaurant	Food Service
Property Type	rast rood nestaurant	
ENERGYSTAR	Food Sales	F 1 O
Property Type	rood Sales	Food Service
ENERGYSTAR	Food Comics	Food Comico
Property Type	Food Service	Food Service
ENERGYSTAR	Others Deptarment/Dem	Food Comitee
Property Type	Other - Restaurant/Bar	Food Service
ENERGYSTAR	5	F 10 :
Property Type	Restaurant	Food Service
ENERGYSTAR	0 1 1/0 0	D
Property Type	Supermarket/Grocery Store	Retail
ENERGYSTAR		Healthcare
Property Type	Ambulatory Surgical Center	
ENERGYSTAR		Healthcare
Property Type	Hospital (General Medical & Surgical)	
ENERGYSTAR		Healthcare
Property Type	Medical Office	
ENERGYSTAR		
Property Type	Other - Specialty Hospital	Healthcare
ENERGYSTAR		
Property Type	Outpatient Rehabilitation/Physical Therapy	Healthcare
ENERGYSTAR		Healthcare
Property Type	Residential Care Facility	
ENERGYSTAR		
Property Type	Senior Living Community	Healthcare
ENERGYSTAR		
Property Type	Urgent Care/Clinic/Other Outpatient	Healthcare
ENERGYSTAR		Accommodation
Property Type	Barracks	
ENERGYSTAR		
	Hotel	Accommodation
Property Type		
ENERGYSTAR	Other - Lodging/Residential	Accommodation
Property Type		

CII Data Source	Subsector Identifier	Subsector Assignment
ENERGYSTAR	Residence Hall/Dormitory	Accommodation
Property Type	nesidence riate bornitory	Accommodation
ENERGYSTAR	Manufacturing/Industrial Plant	Industrial
Property Type	Manufacturing/industriat Ftant	
ENERGYSTAR	Office	Office
Property Type	Office	Office
ENERGYSTAR	Veterinary Office	Office
Property Type	veterinary Office	
ENERGYSTAR	Other	Other
Property Type	Other	Other
ENERGYSTAR	Fire Station	Other
Property Type	riie Station	Other
ENERGYSTAR	Prison/Incarceration	Other
Property Type	Prison/incarceration	Other
ENERGYSTAR	Other - Public Service	Office
Property Type	Other - Public Service	
ENERGYSTAR	Police Station	Office
Property Type	Police Station	Отпсе
ENERGYSTAR	Courthouse	Places of Assembly
Property Type	Courthouse	
ENERGYSTAR	Librany	Places of Assembly
Property Type	Library	
ENERGYSTAR	Transportation Terminal/Station	Places of Assembly
Property Type	Transportation Terminal/Station	
ENERGYSTAR	Mailing Center/Post Office	Retail
Property Type	Mailing Center/Post Office	
ENERGYSTAR	Worship Facility	Diagon of Association
Property Type		Places of Assembly
ENERGYSTAR	Vehicle Dealership	Other
Property Type	verilicie Deatership	
ENERGYSTAR	Convenience Store with Gas Station	Retail
Property Type	Convenience Store with Gas Station	
ENERGYSTAR	Convenience Store without Cae Station	Dotoil
Property Type	Convenience Store without Gas Station	Retail
ENERGYSTAR	Enclosed Mall	Deteil
Property Type	ETICIOSEU MAII	Retail
ENERGYSTAR	Lifestyle Center	Dotoil
Property Type		Retail
ENERGYSTAR	Other - Retail/Mall	Retail
Property Type		INGLAIL

CII Data Source	Subsector Identifier	Subsector Assignment
ENERGYSTAR	Retail Store	Retail
Property Type	Hotali Gtoro	notan
ENERGYSTAR	Strip Mall	Retail
Property Type	Strip Matt	
ENERGYSTAR	Wholesale Club/Supercenter	Retail
Property Type	Whotesate Otub/Supercenter	Netait
ENERGYSTAR	Other - Services	Other
Property Type	Other - Services	Other
ENERGYSTAR	Data Center	Other
Property Type	Data Center	Other
ENERGYSTAR	Laboratory	Other
Property Type	Laboratory	Other
ENERGYSTAR	Other Technology/Science	Othor
Property Type	Other - Technology/Science	Other
ENERGYSTAR	Othor Utility	Other
Property Type	Other - Utility	
ENERGYSTAR	Distribution Center	Marchausing
Property Type	Distribution Center	Warehousing
ENERGYSTAR	New Defrigerated Warehouse	Warehousing
Property Type	Non-Refrigerated Warehouse	
ENERGYSTAR	Defri se vete d Merches ve	Marabauaing
Property Type	Refrigerated Warehouse	Warehousing
ENERGYSTAR	Colf Charage Facility	Marchausing
Property Type	Self-Storage Facility	Warehousing
Literature Review	Restaurants	Food Service
Subsector	nestaurants	Food Service
Literature Review	Soniar Cara Facility	I I o althou a va
Subsector	Senior Care Facility	Healthcare
Literature Review	Hotels	Assammadation
Subsector	notets	Accommodation
Literature Review	Llagoitala	l lo althours
Subsector	Hospitals	Healthcare
Literature Review	Cross w/Cross weeks to	Datail
Subsector	Grocery/Supermarkets	Retail
Literature Review	Madical Office	
Subsector	Medical Office	Healthcare
Literature Review	Offices	Office
Subsector	Offices	
Literature Review	Banking/Financial	Office
Subsector		

CII Data Source	Subsector Identifier	Subsector Assignment
Literature Review Subsector	Courthouse	Places of Assembly
Literature Review Subsector	K-12 Schools	Education
Literature Review Subsector	Houses of Worship	Places of Assembly
Literature Review Subsector	Retail/Shopping Centers	Retail
Literature Review Subsector	Unrefrigerated Warehouses	Warehousing
Literature Review Subsector	Manufacturing/Industrial	Industrial
Literature Review Subsector	Colleges/Universities	Education
Literature Review Subsector	Residence Halls/Dormitories	Accommodation

Utility Water Losses

Non-revenue water, also known as "water loss" or "utility-side leaks" represents the volume of water that is treated for potable consumption and delivered to a utility's water distribution system but is not accounted for in metered water use or delivered to an unmetered customer (AWWA 2016). Non-revenue water is typically comprised of three component: 1) Real Losses, or the physical volume of water that enters the distribution system but is lost before reaching a customer due to infrastructure defects and failure; 2) Apparent Losses, or "virtual" volumes of water that represent inaccuracies/errors in meter data acquisition, meter measurements, unbilled consumption, and unauthorized consumption; and 3) Unmetered Authorized Consumption, or water consumption that is sanctioned by a water utility but is not metered or otherwise measured. In general, Real Losses makes up the vast majority of NRW volume and is therefore the focus of this assessment.

Real Losses can occur through leaks and spills in water distribution system infrastructure (utility-side mains, storage tanks & reservoirs, a joints), with causes that can fall within and without directly utility control. Still recent estimates suggest that non-revenue water comprises an average of 14% of the total water produced by water providers across the United States (U.S. EPA 2013), representing a significant category of municipal water use. For this assessment, we collected estimates of real losses reported by water providers to state agencies using the water loss audit evaluation framework developed by the American Water Works Association and published in their M36 – Water Loss Audits and Control Programs manual. These data, referred to as the "Water Loss dataset" in the report, include annual estimates of distribution system input volume, real losses volume, service population and physical characteristics of the water distribution system such as number of service connections, total length of water mains, and average operating pressure. These data were collected by state for years 2019 – 2022 (the most recent vintage of data available at the time of analysis), resulting in a compiled dataset representing over 4,000 water providers across 12 states (Figure A11).

Summary of Utilities Represented in NRW Dataset, County-Level Aggregation (Dataset Represents 21.9 % of US Population)

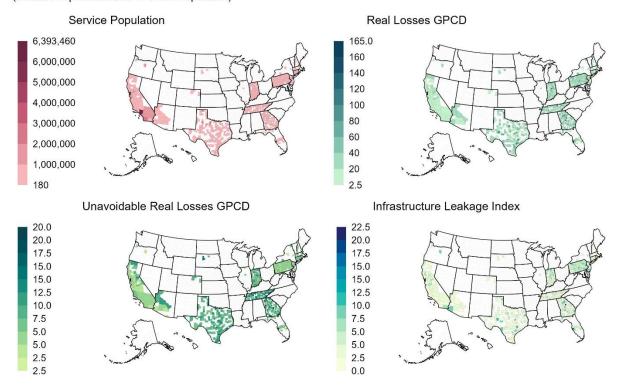


Figure A11. County-Level Summary of Water Loss Dataset Served Population and Real Loss Metrics.

In several cases, individual water audit data were either incomplete or missing one or more variables (water providers with more than two entirely missing variables were not included in this analysis). For these cases, relevant non-revenue water variables were estimated using a simplified geo-imputation process. In this process, we estimated scaling metrics between input variables and calculated average values of these metrics for census-defined geographies ranging from county-level to region-level. Figure A12 shows the relationships between physical system attributes used to develop these scaling metrics (population-connection density and connection-main length density).

Dashed Line Indicates Linear Trend Line Between Variables In Plot Utility Count = 4,210

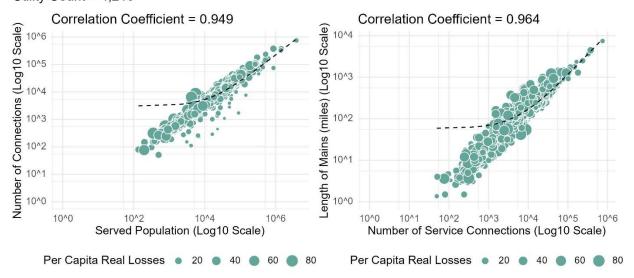


Figure A12. Linear Relationships Between Utility-Level System Characteristics from Water Loss Dataset, Symbolized by Per Capita Real Losses.

For example, for water providers with valid service population data but invalid or missing service connection data, we calculated the average population-connection density for water providers with valid data for both variables and estimate the average population-connection density at the county-level. These county-level estimates were then applied to water providers with incomplete data within the same county, to obtain estimates of the number of service connections where missing. We used a similar approach to estimate total length of mains (using the average service connection-main length density as the scaling metric) and operating pressure (using the direct average operating pressure without scaling). Figure A13 and Figure A14 show the frequency distribution of each NRW variable, separated into observed (via water audit dataset) and estimated (via scaling metric). Of the approximately 4,000 water providers represented by the Water Loss dataset, 27% were complete and were used to geo-impute missing values for the remaining 73%.

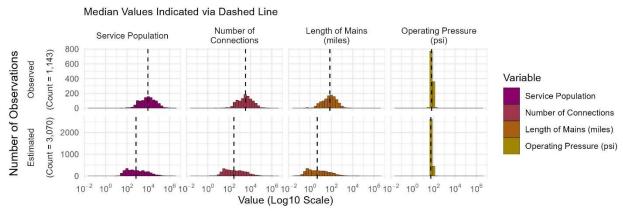


Figure A13. Frequency Distribution of Utility-Level System Characteristics from Water Loss dataset, Disaggregated by Data Source (Observed vs. Estimated).

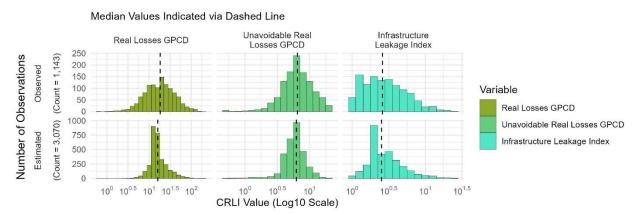


Figure A14. Frequency Distribution of Utility-Level Real Losses Volume Metrics from Water Loss dataset, Disaggregated by Data Source (Observed vs. Estimated).

Using this full (observed and estimated) utility-level dataset, we then calculate the Unavoidable Real Losses (UARL) volume for each utility, which represents the minimum technically achievable volume of Real Losses volume that could be expected of a utility based on its physical characteristics, as shown in Eq. 1 (Lambert et al. 1999). The UARL is an empirically derived equation that acknowledges that it is impossible to eliminate 100% of real losses from a water distribution system and attempts to quantify the minimum expected volume of real losses for a distribution system that can be achieved in the absence of any financial or economic constraints. As shown in Eq. 1, the UARL takes a network component-based approach to marry several performance indicators traditionally used to estimate Real Losses volume for a utility (length of distribution and service mains, number of service connections, and system operating pressure), while providing a single formula that can be applied to a utility of any size and density.

$$\frac{\textit{UARL}_{\textit{Utility}} = }{(5.48 * \textit{L}_{main}) + (0.15 * \textit{N}) + (7.5 * (\textit{N} * \textit{L}_{service}) * \textit{OP}}$$
 Eq. 1

where,

- ullet $UARL_{Utility}$ is the Unavoidable Real Losses for the Utility, in gallons per day
- ullet L_{main} is the total length of transmission and distribution mains in the Utility service area, in miles
- N is the total number of service connections
- $L_{service}$ is the average length of customer-side service line mains, in miles (assumed as zero for this study)
- *OP* is the average operating pressure of the utility's distribution system, in pounds per square inch (psi)

The ratio of Current Annual Real Losses (CARL) volume to UARL volume, also known as the Infrastructure Leakage Index (ILI), can be used to assess current levels of real losses for a utility, benchmark against other water providers with similar characteristics, and track improvement in distribution system performance as a utility implements water loss control strategies (Jernigan et al. 2019).

Baseline Water Demand Estimates

The linear regression model specifications, including weather-normalization variables, are provided in Eq. 2 and Eq. 3. Each equation was first applied to the Billing Dataset to estimate regression coefficients, then applied to the constructed monthly time-series for calendar years 2018 to 2023 to project per capita water demands to current day. These per capita demand estimates were then multiplied by current day estimates of the served population for each water provider to calculate a monthly water demand volume by sector.

$Log_{10}(Seasonality\ Ratio)_{Utility} =$	Eg. 2
$\beta_0 + \beta_1 * (Cluster ID)_{Utility} * (\beta_{1,2} * Year + \beta_{1,3} * Month)$	⊑q. ∠

where,

- Seasonality Ratio is the average proportion of monthly water demand to annual water demand across for the Utility, per Year and Month (numeric variable, values between 0 and 1)
- β_0 is the intercept term representing the Seasonality Ratio for the Reference Utility¹
- Cluster ID is the Seasonality Cluster Assignment of the Utility (categorical variable)
 - \circ β_1 is the regression coefficient term for each Cluster ID
- Year is the time-series indicator of the historical data record (numeric variable, as number of years for first year of data for the utility)
 - $\circ \quad \beta_{1,2}$ is the regression coefficient term for the interaction between each Cluster ID and Year
- Month is the categorical indicator for month of the year, as a proxy for seasonality time-series (categorical variable)
 - \circ $~\beta_{1,2}$ is the regression coefficient term for the interaction between each Cluster ID and Month

$$\frac{Log10(GPCD_{norm})_{Utility} =}{\beta_0 + \beta_1 * (Cluster ID)_{Utility} * (\beta_{1,2} * Log_{10}(Year) + \beta_{1,3} * CDD + \beta_{1,4}PPT)}$$
 Eq. 3

where,

- GPCD_{norm} is the weather-normalized annual average gpcd of the Utility, per year
- β_0 is the intercept term representing the weather-normalized gpcd in the first year of the data record for the Reference Utility²
- Cluster ID is the Seasonality Cluster Assignment of the Utility (categorical variable)
 - \circ β_1 is the regression coefficient term for each Cluster ID
- Year is the time-series indicator of the historical data record (numeric variable, as number of years for first year of data for the utility)

¹ For Eq. 2, the Reference Utility is the Utility with the lowest average Seasonality Ratio across all months (i.e., the Utility with the least seasonal water use pattern)

² For Eq. 3, the Reference Utility is the Utility with the smallest average annual gpcd across all years

- $\circ \quad \beta_{1,2}$ is the regression coefficient term for the interaction between each Cluster ID and Year
- CDD is the number of cooling-degree-days for month of the year, as a proxy for temperature-related variables (numeric variable)
 - $\circ \quad \beta_{1,2}$ is the regression coefficient term for the interaction between each Cluster ID and CDD
- PPT is the amount of precipitation for month of the year, in inches (numeric variable)
 - $\circ \quad \beta_{1,3}$ is the regression coefficient term for the interaction between each Cluster ID and PPT

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