

Perceptions of water use

Shahzeen Z. Attari¹

School of Public and Environmental Affairs, Indiana University, Bloomington, IN 47405

Edited by William C. Clark, Harvard University, Cambridge, MA, and approved January 29, 2014 (received for review August 30, 2013)

In a national online survey, 1,020 participants reported their perceptions of water use for household activities. When asked for the most effective strategy they could implement to conserve water in their lives, or what other Americans could do, most participants mentioned curtailment (e.g., taking shorter showers, turning off the water while brushing teeth) rather than efficiency improvements (e.g., replacing toilets, retrofitting washers). This contrasts with expert recommendations. Additionally, some participants are more likely to list curtailment actions for themselves, but list efficiency actions for other Americans. For a sample of 17 activities, participants underestimated water use by a factor of 2 on average, with large underestimates for high water-use activities. An additional ranking task showed poor discrimination of low vs. high embodied water content in food products. High numeracy scores, older age, and male sex were associated with more accurate perceptions of water use. Overall, perception of water use is more accurate than the perception of energy consumption and savings previously reported. Well-designed efforts to improve public understanding of household water use could pay large dividends for behavioral adaptation to temporary or long-term decreases in availability of fresh water.

water conservation | decision making | judgment | anchoring

Fresh water is used increasingly beyond sustainable levels (1). Do people know how much water is used by a variety of daily activities? If people were asked to conserve water, would they know which behaviors are more effective than others? Gleick (2) estimated that 13.2 gallons of clean water are required per person per day for human needs (drinking, sanitation, hygiene, and food preparation). In 2005, the average American used about 98 gallons of water per day (3), of which ~70% was used indoors (4). Thus, the average American uses more than seven times the water estimated by Gleick as needed. To understand how water use is distributed among daily activities in American households, Mayer et al. (5) surveyed 12 study sites during 1996 through 1998 to disaggregate residential end-use water consumption. Fig. 1 shows the average distribution for six categories. They also found that indoor water use was fairly homogenous across the 12 sites, except for the category “leaks”; whereas outdoor water use varies substantially depending on local climate (5).

Most Americans assume that water supply is both reliable and plentiful. However, research has shown that with climate change, water supply will become more variable due to salinization of ground water and increased variability in precipitation (6, 7). Some have argued that rather than focusing on increasing freshwater supply alone, we need also to reduce water demand (8). Demand-side policy responses to future freshwater variability will benefit from a deeper understanding of public perceptions of water use, which is the focus of this study.

Similar to Attari et al. (9), a study that explored public perceptions of energy use, here actual water use is compared with perceived water use for a variety of indoor and outdoor activities. Perceived energy consumption is a fairly flat function of actual consumption. Such a compression bias (9, 10) could result from participants’ lack of knowledge about energy in its different manifestations. The flatness is also partly due to the judgment heuristic of anchoring and insufficient adjustment (11, 12), which arises when a person generates a numerical estimate by first

adopting a salient reference as a starting point and then adjusts this estimate in the desired direction, but insufficiently. Attari et al. (9) also showed that participants overestimate energy consumption for activities that use small amounts of energy, and underestimate consumption for activities that use large amounts.

Do similar over- and underestimations exist for judgments of water use? Given the consistent tangible physical quality that exists for water but is somewhat obscure for energy as well as the familiarity of the unit of measurement, one could expect more accurate estimates for water. Additionally, Attari et al. (9) found that both numeracy and proenvironmental attitudes are associated with more accurate perceptions of energy use. Similar predictions for individual difference variables are tested here for judgments of water use.

Results

Perception of the “Most Effective Thing.” The study began with two open-ended survey questions that asked participants to indicate the most effective thing they could personally do to conserve water in their lives, and to indicate the most effective thing Americans can do to conserve water in their lives. These two questions were shown in randomized order, where 515 participants completed the order self/Americans and 505 participants completed the opposite order Americans/self. Two judges identified 25 mutually exclusive categories in a set of initial 50 surveys and then independently coded the remaining surveys (Table 1). Interrater agreement was “almost perfect,” $\kappa = 0.86$ (13).

Each of the 25 categories was then classified as a curtailment action (e.g., taking shorter showers) or efficiency action (e.g., switching to water-efficient fixtures). Some responses were difficult to categorize as curtailment or efficiency (e.g., checking for leaks and repairing them). Similar to the findings for energy use (9), where most participants mentioned curtailment over efficiency, here, 75.8% of participants mention curtailment actions for themselves and 67.4% for other Americans, and only 9.7% of participants mention efficiency actions for themselves and 12.5% for other Americans. By contrast, the Environmental Protection Agency (EPA) recommends that retrofitting toilets results in the

Significance

Public perceptions of water use are explored using an online survey ($N = 1,020$). Results show that participants underestimated water use by a factor of 2 on average, with large underestimates for high water-use activities. High numeracy scores, older age, and male sex were associated with more accurate perceptions of water use. Overall, perception of water use is more accurate than the perception of energy consumption and savings previously reported, however perceptions of both resources show significant underestimation.

Author contributions: S.Z.A. designed research, performed research, analyzed data, and wrote the paper.

The author declares no conflict of interest.

This article is a PNAS Direct Submission.

Freely available online through the PNAS open access option.

See Commentary on page 5067.

¹E-mail: sattari@indiana.edu.

This article contains supporting information online at www.pnas.org/lookup/suppl/doi:10.1073/pnas.1316402111/-DCSupplemental.

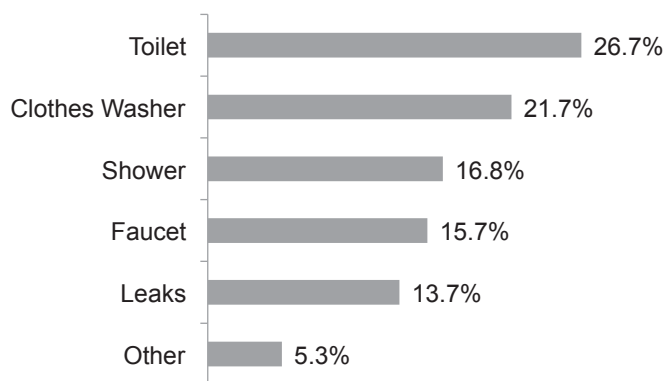


Fig. 1. Disaggregated residential indoor water use based on 12 study sites in the United States published in 1999, adapted from Mayer et al. (5).

greatest savings (71%) in indoor household water use (14), followed by retrofitting clothes washers (19%), showerheads (5%), and faucet aerators (5%). (Even though toilets use less water volumetrically than washers and showers per use, the frequency of use results in higher water use overall.) Note that a more subtle classification of the categories would be to code them as “intent-oriented” or “impact-oriented” behaviors (15). In intent-oriented behaviors, the intention to help the environment shapes the behavior without taking the actual environmental impact or effectiveness into account, such as turning off the water while brushing teeth. Alternatively, impact-oriented behaviors are focused on making a large difference, such as retrofitting toilets. The gap between intent- and impact-oriented actions may be explained by the lack of information (people do not know what is effective) or the lack of motivation (people are not motivated to act out effective behaviors). However, further research is needed to clearly classify the elicited behaviors in this manner.

Table 1 shows a major shift between endorsing fewer/shorter showers for oneself vs. endorsing watering the lawn less for others. Even though both these activities are classified as curtailment (restrictions on consumption), the shift could indicate that participants know that watering the lawn less is an effective action.

Fig. 2 shows the relative joint percentage distribution of responses for self and for other Americans using three categories: curtailment, efficiency, and other. Fig. 2 also displays a significant asymmetry as highlighted by the arrow, indicating that participants are more likely to recommend curtailment actions for themselves and efficiency actions for others than vice versa [$\log(7.6/4.0) = 0.64 \pm 0.26, P \approx 0.001$]. One reason for this asymmetry may be the upfront capital costs involved with efficiency actions (i.e., “I cannot afford the retrofits, but perhaps others can”). Further investigation to tease out why this asymmetry exists will be needed to more fully understand the self/other bias.

To explore order effects, Fig. 2 can be divided into two 3×3 tables (self/American vs. American/self), with the three categories (see Fig. S1 in *SI Text*). Note that the two tables are fairly similar and the hypothesis of identical joint distributions cannot quite be rejected: $\chi^2 = 13.63$ (likelihood-ratio test, 8 df). Given the absence of appreciable order effects, the data from the two orders of presentation are combined here and later.

Perceptions of Water Use. Before conducting the current study, a survey designed to elicit preferred units of measuring water quantity was conducted. Specifically, participants from a university community were asked the following question:

Water quantity can be measured in several possible units: milliliters, customary (US) ounces, cups, quarts, liters, gallons, cubic feet, cubic meters, tons, etc. When thinking about water use, what units of measurement are you most comfortable with?

Of the 225 participants who completed this open-ended question, 73.3% stated gallons, 16.9% stated liters, 5.8% stated

Table 1. Categorized responses to the two open-ended questions about the single most effective thing participants could do to conserve water in their lives, and the single most effective thing Americans could do to conserve water in their lives

Activity	Curtailment (C) or efficiency (E)	Self, %	Americans, %
Shorter or fewer showers	C	42.6	28.0
Turn off water while doing other activities (not including brushing teeth)	C	9.9	10.0
Turn off water while brushing teeth	C	6.9	6.7
Conserve water or use water efficiently	—	4.5	6.6
Do less laundry or full loads of laundry	C	4.3	2.2
Pay more attention to water use	—	4.2	6.4
Water lawn less	C	4.1	12.5
Reduce dishwasher use or hand wash dishes	C	3.6	1.0
Other reason (mentioned once)	—	3.2	3.6
Harvest water by using rain barrels	E	2.4	1.6
Check for leaks and repair them	—	2.1	2.9
Bathe less and shower instead	E	1.8	1.5
Switch to water-efficient fixtures/technologies	E	1.7	2.4
Water-efficient toilet	E	1.5	2.4
Flush less	C	1.2	1.4
Turn off shower while shampooing and soaping	C	1.0	1.3
Switch to low-flow showerheads	E	0.9	1.1
Eat less meat	C	0.8	1.0
Switch to low-flow faucets	E	0.7	1.1
Don't drink bottled water	C	0.6	1.9
Recycle	—	0.5	0.7
Wash car less	C	0.5	1.2
Get rid of lawns or switch to water-efficient plants	E	0.5	2.2
Switch to water-efficient clothes washing machines	E	0.4	0.4
Buy fewer products	C	0.3	0.4

		Americans		
		Curtailment	Efficiency	Other
Self	Curtailment	57.9	7.6	10.3
	Efficiency	4.0	3.4	2.3
	Other	5.4	1.5	7.7
Diagonal asymmetry		$\log_e(7.6/4.0) = 0.64 \pm 0.26$		

Fig. 2. Joint distributions (percentages) of endorsement categories for self and for Americans from the first two open-ended questions ($N = 1,020$). Test of asymmetry in response shifts from self to Americans, indicated by the arrow, is given as estimated log odds with estimated SE.

cups, 3.6% stated ounces, 0.9% stated cubic meters, and 0.4% stated quarts. Therefore, in the current study participants were asked to estimate water use in gallons, as it was shown to be the preferred metric for water use judgments in the presurvey.

In the current study, after completing the open-ended questions, each participant estimated the water use in a variety of household end uses and other activities. The correlation between each participant's perceptions of water use with the actual volume of water used (as determined by the literature and estimation provided in *SI Text*) was assessed, after transforming both distributions logarithmically. The mean correlation between $\log Perception$ and $\log Actual$ was $r = 0.83$, indicating that participants do have significant knowledge about which activities used more water than others. Note that the reported mean correlation between $\log Perception$ and $\log Actual$ values of energy was $r = 0.51$ (9), far lower than the correlation for water. (The

difference in Fisher Z-transformed correlations for water and energy is $+0.63 \pm 0.06$.)

The relationship between participants' perceptions of water use as a function of actual water use was examined in more detail by using a multilevel regression model in Eq. 1.

$$\log_{10} Perception_{ij} = \beta_{0j} + \beta_{1j} \log_{10} Actual_i + \beta_{2j} (\log_{10} Actual_i)^2 + r_{ij} \quad [1]$$

In this equation, i indicates the use or activity and j indicates the participant. The variation among participants was modeled by letting β_{0j} and β_{1j} vary about their average values, thereby allowing each participant to have his or her own regression equation (i.e., participant j 's intercept and slope differed from the average intercept and slope). In contrast, the quadratic effect was treated as fixed, so β_{2j} was the same for all participants. Note that the values of $\log_{10} Perception$ and $\log_{10} Actual$ were centered relative to the original mean of $\log_{10} Actual$, so that the coefficients would be more interpretable. The intercept β_{0j} indicates over- or underestimation, the slope β_{1j} indicates the general relationship between perceptions and actual values, and the coefficient for the quadratic term β_{2j} indicates the curvature in that relationship. This specification allows for a detailed assessment of the accuracy of participants' perceptions. For perfectly accurate perceptions, $y = x$, the values of $\beta_{0j} = 0$ (intercept or elevation), $\beta_{1j} = 1$ (slope), and $\beta_{2j} = 0$ (curvature).

Results for the average parameter estimates are shown in Fig. 3, along with mean perceptions for the 17 uses and activities. The average intercept, which gives the average elevation of perceptions at the mean of $\log_{10} Actual$, was significantly negative, $M(\beta_{0j}) = -0.31 \pm 0.01$. On average, participants underestimated water use by a factor of $10^{0.31} = 2.0$. Reported underestimation for energy use was a factor of $10^{0.44} = 2.8$ (9). (Note that removing both pool activities, Olympic-sized pool and outdoor pool, from the analysis yielded an average underestimation of water use of a factor of 1.6.)

The average slope, evaluated at the mean of $\log_{10} Actual$, was significantly greater than zero, $M(\beta_{1j}) = 0.70 \pm 0.007$, but significantly less than 1. This slope reflects two features of the data. First, it reflects the imperfect correlation between perceived and

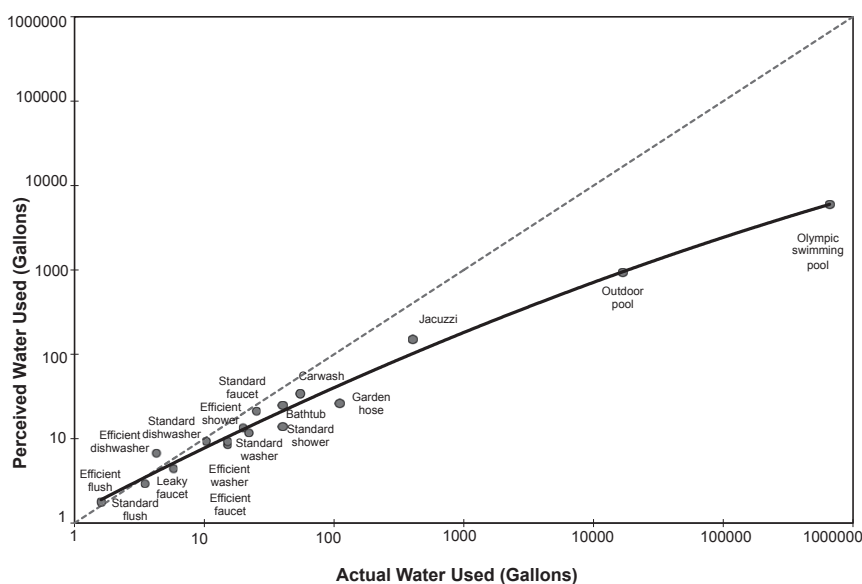


Fig. 3. Mean perceptions of water use as a function of actual water use for 17 different behaviors and activities. Error bars for 95% confidence intervals are omitted because they are typically no taller than the symbols themselves. The diagonal dashed line represents perfect accuracy.

Table 2. Results of multilevel regressions for predicting individuals' perceptions of water use (\pm estimated SE)

Parameters	Elevation, slope, and main effects (effects on elevation)	Interactions (effects on slope)
Intercept (elevation)	$-0.31 \pm 0.01^{***}$	—
Within-participant (level 1) predictors		
Actual water use, $\log_{10}Actual$	$0.70 \pm 0.007^{***}$	—
Quadratic term, $(\log_{10}Actual)^2$	$-0.031 \pm 0.002^{***}$	—
Between-participant (level 2) predictors		
Numeracy (0–3, $\alpha = 0.42$)	0.02 ± 0.01	$0.05 \pm 0.007^{***}$
Male	-0.009 ± 0.02	$0.04 \pm 0.01^{**}$
Age, y	$0.004 \pm 0.001^{***}$	$0.003 \pm 0.0006^{***}$

Elevation and slope are reported at the relevant mean of $\log_{10}Actual$, the x axis variable in Fig. 3. In Fig. 3 elevation varied, and it was tested against the relevant mean of actual water use. The slope was tested against the correct slope of 1. $**P < 0.01$; $***P < 0.001$.

more accurate perceptions of water use. This result highlights yet another difference between water and energy perception, as participants who were more proenvironmental had more accurate perceptions of energy consumption (9) which is not the case for water use. Several variables that one might expect to be related to accuracy of water-use judgments (e.g., experience of drought, having efficient appliances in the home, education level) were not reliable predictors in these regressions.

The mean judged ranks for embodied water use scarcely vary among the four goods, as shown in Fig. 5. No combination of the 10 centered individual difference variables correlate appreciably with this slope [$r^2 = 0.017$, $F(10, 974) = 1.75$].

Discussion

When asked what is the most effective action they can take to decrease their water use, participants stated curtailment actions rather than efficiency actions, possibly because of the upfront monetary costs involved with efficiency actions. Results also show a significant asymmetry indicating that some participants are more likely to recommend curtailment actions for themselves and efficiency actions for others than vice versa.

As shown in Fig. 1, toilets use the most volume of water indoors and their suggested retrofits is the top recommendation made by the EPA (14). However, “buying water-efficient appliances and fixtures” along with “water-efficient toilet” and “flushing less” are among the least-mentioned actions as shown in Table 1. One reason why participants did not mention toilets or flushes may be due to ignoring the frequent but short duration daily exposures related to these behaviors in contrast to single but longer daily exposure related to showers, which topped the list.

Participants in this study did have some knowledge about water used by a variety of activities, as illustrated by the slope of the curve in Figs. 3 and 4, which is somewhat close to the diagonal line. The observed correlation between judged and actual water use is positive and large. However, as water use increases, participants tend to compress the actions together, underestimating the relative differences between different actions that use a lot of water. Older participants were more accurate, indicating that the experience that comes along with age may be leading to more accurate perceptions of water use. Being male and numerate also led to more accurate perceptions. Although proenvironmental attitudes were shown to be important predictors of accuracy for energy consumption (9), they do not seem to be as important for accurate judgments of water use.

Another challenge highlighted by this study is that participants systematically underestimate the water used by standard appliances and fixtures, however they tend to overestimate some efficient appliances (efficient dishwashers and flushes) while underestimating others. Given standard appliances and fixtures are

always underestimated, the relative savings of switching to their water-efficient counterparts may go unrealized.

In general, participants were unable to correctly rank order the four goods based on their embodied water content. Although this may not be too surprising, these results show that there is much work to be done to educate people on how much water goes into growing the different foods that we consume daily (17, 20). Note that anchoring effects play no role in Fig. 5, because a referent was not provided in the ranking task.

In contrast to perceptions of energy consumption (9) which were not very encouraging, participants here had more accurate perceptions of water use and tended to underestimate water use less compared with results from the energy study (Fig. 4). One reason why perceptions of water use are more accurate may be due to the consistent physical characteristics of water as opposed to energy, which is transformed based on the end-use activity (e.g., heating, cooling, lighting, motion). Another reason for greater accuracy for water use is that most Americans make decisions about gallons of liquid nearly every day (e.g., buying gasoline or milk), therefore the unit of measurement may be much more familiar for water use than for energy use. Even though perceptions of water use are more accurate, there is still significant underestimation over the range of activities explored in this study. One reason for this underestimation is due to anchoring and insufficient adjustment (12). However, using gallons as a unit of measure may be a natural anchor that Americans use to think about water volumes in the United States. Of course using larger units of measure would lead to overestimation (21, 22), but based on the presurvey results, gallons was used as a unit of measure in the survey as it may be the preferred natural unit for these judgments. Thus, the observed underestimation should generalize beyond this survey.

This study, like that of Attari et al. (9), has many limitations. Monetary incentives were not offered for accuracy and an Internet sample was used, which was not completely representative of the US population. The actual water-use data have limitations due to availability of data, as they come from a variety of sources and snapshots in time, which is a documented problem in this field (23). It is important to note that the data in Fig. 1 is about 14 y old, even though it is the best available data and is currently being used by the EPA (4). It may be the case that with new regulations and technology, the distribution of water use in the home (as shown in Fig. 1) has shifted over time.

Price signals related to residential water use were a factor omitted from the study that could serve as an important predictor for accuracy. However, pay structures for residential water use vary widely in the United States (e.g., uniform cost per month independent of consumption, uniform rates, progressive or increasing block rates, and regressive or decreasing block rates) (24, 25). Gaudin (25) found that in a sample of 383 water utilities in the United States, only 17% of the utilities indicated

marginal prices next to units of water consumed on the bill, whereas 78% gave no price information other than the total amount of money due. Thus, in many cases, people may not have access to the necessary monetary information on their water bill to make informed decisions about water conservation (25).

In conclusion, this study aims to advance our understanding of residential water use by testing ideas developed around energy to a very different vital resource. The results provide comparative insights into our basic understanding of the psychology of consumption, and also initiate a needed bridge between the energy and water literature. Given the results of this study, as with energy consumption, well-designed efforts to correct misperceptions are needed. Further research that investigates the relationship of these judgments to actual behaviors would also help the field understand how important judgments of resource use really are, or whether they can be side-stepped to facilitate long-lasting conserving behaviors.

Methods

Participants. Between April 21 and 25, 2013, 1,064 participants were recruited via Amazon's Mturk panel (www.mturk.com), of which 1,020 participants completed the full survey. On completion, participants received US \$3 in their Amazon account. The survey was restricted to participants located in the United States. Based on 1,020 participants who completed the survey, the median age was 30 y, compared with 37.2 y in the United States (26), and 51.6% of participants were male (49.2% in the United States). The median family income was US\$50,000–\$80,000 (US\$50,054 in the United States in 2011) and the median level of education was having a college degree (35.4% have an associate's degree or more in the United States) (27). Fifty-four percent self-identified as liberals (score = 1–3), 21% as moderates (score = 4), and 25% as conservatives (score = 5–7). These figures may indicate some selection bias.

Survey Materials. The complete survey and tables of actual water values are presented in [Dataset S1](#) and [SI Text](#), respectively.

At the beginning of the survey, participants answered two open-ended questions about the single most effective thing they could personally do to conserve water in their lives and the most effective thing that Americans could do to conserve water in their lives. The order of these two questions was randomized. Next, participants estimated the number of gallons of water used by 17 different activities (e.g., flushing a standard-flow toilet one time, filling one typical bathtub, washing one load of dishes with a standard home dishwasher, washing one load of dishes with a high-efficiency home

dishwasher, etc.). Note that one task involved estimating the volume of water in an Olympic-sized swimming pool, which has a specified size and was used because it roughly represents the volume of water that could be stored in some water towers (which vary greatly in size and provide potable water for excess demand and for emergencies). The participants were asked to make these estimates in gallons (note that gallon was chosen after a presurvey suggested that this was the most preferred unit of measurement for water use).

Next, participants rank-ordered four goods (1 pound of rice, 1 pound of coffee, 1 pound of sugar, and 1 pound of cheese) in terms of most-embodied water to least-embodied water for production. Embodied water was defined as the amount of water needed to produce a particular good. Participants were then asked about how many gallons of water their household uses in a typical day and how many gallons of water they thought the average American household used in a typical day.

To make sure participants were paying attention to the survey, a test question was included at this point of the survey. Participants then completed the revised NEP scale (18), a 15-item instrument for assessing proenvironmental attitudes. The original responses (1 = "completely disagree," 7 = "completely agree") were coded in the proenvironmental direction and then averaged to yield an overall NEP score for each participant. In addition, participants completed Schwartz et al.'s (19) numeracy assessment, which consists of three open-ended questions. For example, "In the BIG BUCKS LOTTERY, the chance of winning a \$10 prize is 1%. What is your best guess about how many people would win a \$10 prize if 1,000 people each buy a single ticket to BIG BUCKS?"

Next, participants were asked what they paid attention to on their water bill (checking all that apply from: cost of bill, amount of water used, tips to decrease water use, "I do not pay attention to any information," "I do not receive a water bill," or other). Participants were then asked what kinds of appliances they had in their homes with response options of standard appliance; low-flow or high-efficiency appliance; and do not own and do not know for toilet, shower, bathroom faucet, dishwasher, and clothes washing machine. Participants then answered a few questions to elicit their perceptions of drought in their area in the past year, past month, and past week. Demographic questions concluded the survey. This research was approved by Indiana University's Internal Review Board at the Office of Research Administration and informed consent was received from all participants.

ACKNOWLEDGMENTS. The author thanks David Krantz and David Good for helpful comments, as well as Zachary Ruzycki, Jian Guan, Greer Ryan, and Benjamin Inskip for valuable research assistance. This work was supported by the School of Public and Environmental Affairs at Indiana University, Bloomington.

- Postel SL (2000) Entering an era of water scarcity: The challenges ahead. *Ecol Appl* 10(4):941–948.
- Gleick PH (1996) Basic water requirements for human activities: Meeting basic needs. *Water Int* 21(2):83–92.
- Kenny JF, et al. (2009) *Estimated use of water in the United States in 2005* (US Geological Survey, Reston, VA).
- Environmental Protection Agency (2013) Indoor Water Use in the United States. Available at www.epa.gov/watersense/our_water/water_use_today.html. Accessed August 16, 2013.
- Mayer PW, et al. (1999) *Residential End Uses of Water* (American Water Works Association Research Foundation, Denver).
- Bates B, Kundzewicz ZW, Wu S, Palutikof J, eds (2008) *Climate Change and Water, Technical Paper of the Intergovernmental Panel on Climate Change*, (IPCC Secretariat, Geneva), 210 pp.
- Kundzewicz Z, et al. (2008) The implications of projected climate change for freshwater resources and their management. *Hydrol Sci J* 53(1):3–10.
- Christian-Smith J, Gleick PH, Cooley H (2011) U.S. water policy reform. *The World's Water Volume 7: The Biennial Report on Freshwater Resources*, ed Gleick P (Island Press, Washington), Chap 7.
- Attari SZ, DeKay ML, Davidson CI, Bruine de Bruin W (2010) Public perceptions of energy consumption and savings. *Proc Natl Acad Sci USA* 107(37):16054–16059.
- Poulton EC (1994) *Behavioral Decision Theory: A New Approach* (Cambridge Univ Press, New York).
- Chapman GB, Johnson EJ (2002) Incorporating the irrelevant: Anchors in judgments of belief and value. *Heuristics and Biases: The Psychology of Intuitive Judgment*, eds Gilovich T, et al. (Cambridge Univ Press, New York), pp 120–138.
- Tversky A, Kahneman D (1974) Judgment under uncertainty: Heuristics and biases. *Science* 185(4157):1124–1131.
- Landis JR, Koch GG (1977) The measurement of observer agreement for categorical data. *Biometrics* 33(1):159–174.
- Environmental Protection Agency (2005) Water and Energy Savings from High Efficiency Fixtures and Appliances in Single Family Homes. Available at [www.allianceforwaterefficiency.org/uploadedFiles/Resource_Center/Library/residential/showers/Aquacraft\(2005\)EPA-Single-Family-Retrofit-Studies-Combined-Report.pdf](http://www.allianceforwaterefficiency.org/uploadedFiles/Resource_Center/Library/residential/showers/Aquacraft(2005)EPA-Single-Family-Retrofit-Studies-Combined-Report.pdf). Accessed August 16, 2013.
- Stern PC (2000) New environmental theories: Toward a coherent theory of environmentally significant behavior. *J Soc Issues* 56(3):407–424.
- Tversky A, Kahneman D (1973) Availability: A heuristic for judging frequency and probability. *Cognit Psychol* 5(2):207–232.
- Hoekstra AY, Chapagain AK (2007) Water footprints of nations: Water use by people as a function of their consumption pattern. *Water Resour Manage* 21(1):35–48.
- Dunlap R, Van Liere K, Mertig A, Jones R (2000) New trends in measuring environmental attitudes. Measuring endorsement of the new ecological paradigm: A revised NEP scale. *J Soc Issues* 56(3):425–442.
- Schwartz LM, Woloshin S, Black WC, Welch HG (1997) The role of numeracy in understanding the benefit of screening mammography. *Ann Intern Med* 127(11):966–972.
- Hoekstra AY, Chapagain AK (2013) Water Footprint. Available at www.waterfootprint.org/?page=files/productgallery. Accessed August 16, 2013.
- Frederick SW, Meyer AB, Mochoh D (2011) Characterizing perceptions of energy consumption. *Proc Natl Acad Sci USA* 108(8):E23, author reply E24.
- Attari SZ, DeKay ML, Davidson CI, Bruine de Bruin W (2011) Reply to Frederick et al.: Anchoring effects on energy perception. *Proc Natl Acad Sci USA* 108(8):E24.
- Gleick PH (2011) Data table 2: Freshwater withdrawal by country and sector. *The World's Water Volume 7: The Biennial Report on Freshwater Resources*, (Island Press, Washington).
- Environmental Protection Agency (2013) Pricing structures. Available at http://water.epa.gov/infrastructure/sustain/pricing_structures.cfm. Accessed August 16, 2013.
- Gaudin S (2006) Effect of price information on residential water demand. *Appl Econ* 38(4):383–393.
- US Census (2010) Age and Sex Composition: 2010. Available at www.census.gov/prod/cen2010/briefs/c2010br-03.pdf. Accessed August 16, 2013.
- US Census (2009) Educational Attainment in the United States: 2009. Available at <https://www.census.gov/prod/2012pubs/p20-566.pdf>. Accessed August 16, 2013.