Multisectoral analysis of drought impacts and management responses to the 2008-2015 record drought in the Colorado Basin, Texas

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Abstract. Drought has long posed an existential threat to society. Engineering and technological advancements have enabled the development of complex, interconnected water supply systems that buffer societies from the impacts of drought, enabling growth and prosperity. However, increasing water demand from population growth and economic development, combined with more extreme and prolonged droughts due to climate change, pose significant challenges for governments in the 21st century. Improved
15   understanding of the cascading multisectoral impacts and adaptive responses resulting from extreme drought can aid in adaptive planning and highlight key processes in modelling drought impacts. The record drought spanning 2008 to 2015 in the Colorado Basin in the state of Texas, United States serves as an outstanding illustration to assess multisectoral impacts and responses to severe, multi-year drought. The basin faces similar water security challenges as across the Western U.S., such as: groundwater depletion and sustainability, resource competition between agriculture and growing urban populations, limited options for
20   additional reservoir expansion, and the heightened risk of more severe and frequent droughts due to climate change. By analysing rich, high-quality data sourced from nine different local, state, and federal sources, we demonstrate that characterizing regional multisector dynamics is crucial to predicting and understanding future vulnerability and possible approaches to reduce impacts to human and natural systems in the face of extreme drought conditions. This review reveals that, despite the severe hydrometeorological conditions of the drought, the region's advanced economy and existing water infrastructure effectively
25   mitigated economic and societal impacts.

1. Introduction

Droughts threaten modern civilizations in a variety of ways (van Dijk et al. 2013; Wilhite et al. 2007;). Prolonged dry spells cause depletion of terrestrial water resources, leading to water use restrictions and shortage (Lund, et al. 2018), reduced crop yields and loss of pasture (Gupta et al., 2020; Kuwayama et al., 2019), impaired electricity generation from hydroelectric and thermoelectric
30   facilities (van Vliet et al., 2016; Voisin et al., 2020), degradation of water quality (Ahmadi and Moradkhani, 2019), forest loss through tree mortality (Brodribb et al., 2020) and forest fire (Littell, et al. 2016), and reduced primary productivity of vegetation (Stocker et al., 2019; Xu et al., 2019). These impacts spawn a myriad of second-order effects. For instance, loss of water-dependent electricity generation can reduce the reliability of the power grid (Turner et al., 2021) or shift generation onto resources that cost more to run or emit more carbon (O'Connell et al., 2019). In some cases, the impacts of a local drought can carry national or global
35   implications, such as by increasing crop prices and altering global food trade networks (Lal et al., 2012; Marston and Konar, 2017).

The need to understand possible impacts from drought is underscored by anticipated intensification of drought in some world regions in the 21st century due to climate change (Cayan et al., 2010; Cook et al., 2018; Trenberth et al., 2014), manifesting large

reductions in surface water availability over large portions of the globe (Schewe et al., 2014). In some regions, climate change has already increased the joint probability of hot and dry conditions that produce more severe drought impacts (Sarhadi et al., 2018).

40   There is no single quantitative definition of drought (Kuwayama et al., 2019). Drought can be defined by many metrics of water deficit, such as reduced precipitation (meteorological drought) often combined with increased potential evapotranspiration, soil moisture deficit affecting vegetation (soil moisture drought or agricultural drought), reduced surface water flows, lake levels, and groundwater levels (hydrological drought) leading to streamflow drought and reduced reservoir storage (i.e., reservoir drought) (Van Loon et al., 2015). The intensity and duration of meteorological drought influences the severity of other types of droughts;

45   for example, a short, intense meteorological drought can result in a severe agricultural drought. The impacts of meteorological drought can also be exacerbated by human actions (Van Loon et al., 2016), such as increased diversions from streams resulting in more severe hydrological drought (reduced streamflow) or withdrawals from reservoirs initiating or exacerbating reservoir drought.

Because extreme drought is rare (by definition), there are a limited number of 21st century case studies available to document and synthesize its impacts. Examining each case is essential to better understanding the complex dynamics of drought propagation, the

50   resulting multisector impacts and responses to drought in modern society, and critical lessons learned to better prepare for future droughts. The aim of this paper is to provide such a case study through a detailed examination of the 2008-2015 drought in the Colorado Basin, TX. This region (Figure 1a) faces significant municipal-agricultural-energy-water nexus challenges and offers a compelling case study for multisectoral drought impact analysis. The paper is organized into the following sections: background on the drought of record, e.g., the basin's hydroclimate, water supply, and sectoral water use (Sections 1.1 and 1.2); data and

55   methods (Section 2); analysis of multisectoral impacts and adaptive management responses from drought of record (Sections 3.1 – 3.3); a discussion of insights into multisector impacts and dynamics, water planning strategies that improve the resiliency and sustainability of regional supply, limitations, and future work (Section 4); and concluding remarks (Section 5).

1.1 Basin Geography and Sectoral Water Use

The Colorado Basin spans 800 km across the central part of Texas and has a drainage area of 102,000 km^2 (Figure 1a). Its

60   headwaters are in the arid north-western part of the state, and surface water flows southeast towards the Gulf of Mexico. The basin is divided into three water management regions (Figure 1a), marked by diverse hydroclimates and distinct differences in water use, reliance on surface water versus groundwater, and sectoral water demand (Table 1). Here, water use refers to total withdrawals, not consumptive use.

65   The basin's hydrology is characterized by highly variable seasonal streamflow prone to multi-year drought periods (Wurbs, 2021). There is a markedly increasing precipitation gradient from the western upper region (38-45 cm/yr) to the eastern lower region (68-112 cm/yr) (TWDB, 2023a), which greatly influences surface water availability and the ratio of surface water to groundwater use across the basin (Table 1). The sparsely populated, arid upper region has few reliable sources of surface water, no major reservoirs, and is almost entirely dependent on groundwater sourced from the Southern High Plains Aquifer to supply its large agricultural

70   sector (Table 1). In contrast, the highly populated lower region receives more than two-thirds of its annual supply from surface water. Lower region reservoirs are the critical supply for the city of Austin's municipal demands, and for providing reliable water supply for thermoelectric power and lower region agriculture. The middle region is heavily reliant on groundwater for agriculture but uses surface water to meet 60-70% of its municipal demand. Overall, the middle region uses less than 20% of the surface water of the lower region.
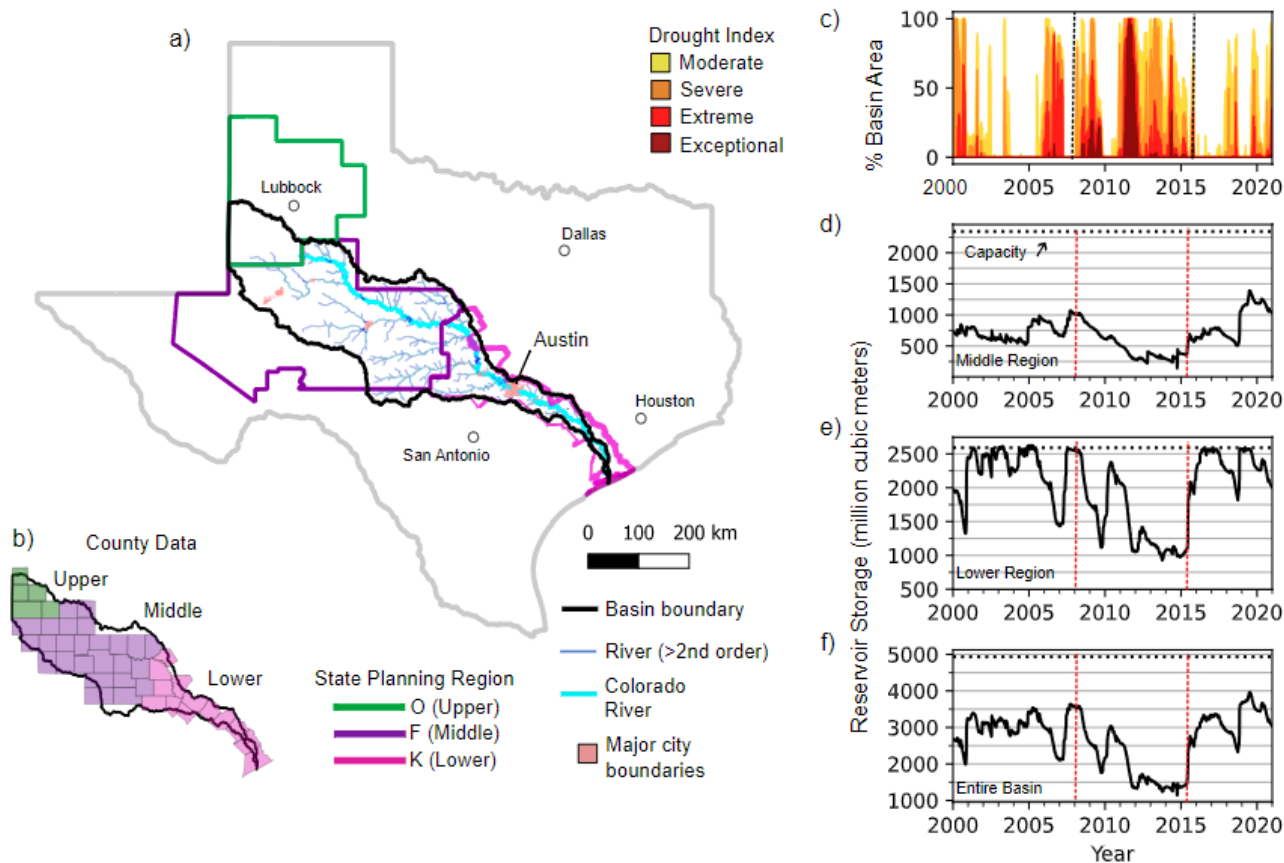
Figure 1: The Colorado Basin (a). The basin spans three state water planning regions: Region O (upper), Region F (middle), and Region K (lower). All regional data presented is based on data from counties within the basin footprint (b). U.S. Drought Monitor Drought Index showing the area of the basin under drought from 2000 to 2020 (c). Reservoir storage for the middle region (d), lower region (e), and total basin (f) in million m^3.

Water use and population are also highly unequally distributed amongst the three management regions (Table 1). The sparsely populated, heavily agricultural upper region and densely populated lower region both use more than twice the water of the middle region. Before to the drought (2000-2007), the agriculture sector was the largest water user in all three regions, accounting for 99% of all water use in the upper region and between 50 and 70%, in the middle and lower regions. Municipal use was the second largest sector, representing 25-30% of annual water use in both the lower and middle regions. Industrial and thermoelectric use was less significant in all three regions, accounting for 3-7% of annual use.

1.2 The 2008 – 2015 Drought of Record

The 2008-2015 drought is recognized as the drought of record for two of the middle and lower planning regions in the basin (Texas Water Development Board (TWDB), 2022a). Texas uses the "drought of record" framework for water planning where future water supply is determined based on shortages that would occur under a repeat of the drought of record event. The 2008-2015 drought period is characterized by a combination of reservoir and meteorological drought, spanning the time between lower basin reservoirs resetting (Figure 1e) and the end of widespread drought conditions (Figure 1c). The drought consisted of two dry periods (2008-2009 and late 2010-2015) separated by a relatively wet year in 2010 (Figure 1c). The drought severity shown in Figure 1c is the US Drought Monitor drought classification index, which is a composite index that incorporates meteorological drought, soil moisture conditions, and surface water impacts (US Drought Monitor, 2023). Before 2008-2015, the region's most severe drought

on record took place in the 1950s (TWDB, 2022a). The greater severity and distinctive impacts of the 2008-2015 drought can be attributed to five key factors, including a combination of climate (natural) and human system factors:

(1) Rapid onset of extreme drought: A statewide record low Palmer Drought Severity Index (PDSI) (Palmer, 1965) of -8.06 occurred just 14 months into the 2011-2015 period whereas the drought of the 1950s took 72 months to reach a PDSI of -7.77 (TWDB, 2017). The PDSI accounts for precipitation, evapotranspiration, and soil moisture conditions and is standardized to enable comparison between regions (Alley, 1984).

(2) Meteorological Conditions: The 2008-2015 drought featured record meteorological drought combined with prolonged heatwaves in 2009 and 2011. Notably, in 2011, the mean temperature during the summer months of June, July, and August reached a record high, about 1.4 °C higher than the previous hottest summer on record (Neilson-Gammon, 2012).

(3) Persistent reservoir drought: Record low reservoir storage persisted in the basin from 2012-2015.

(4) Population growth: The basin's population is three times larger, with 80% of the population increase occurring in the heavily surface-water-reliant lower region, leading to increased population exposure to drought and sectoral competition for surface water.

(5) Economic transformation: In the 1950s, the basin was a largely agrarian economy, in contrast with the predominantly urban, industrialized economy in the 21st century (TWDB, 2022b). While population growth has increased the population exposed to drought conditions, the diversification of the regional economy has reduced the basin's economic vulnerability to drought because many of the sectors are not highly water-dependant – representing a shift from a climate sensitive to climate insensitive economy (Tubi, 2020). This is discussed further in Section 3.

| Region | Population | Average Water Use | | | Average Sectoral Water Use | | | | Reservoirs | |
		Total	SW	GW	Agriculture	Municipal	Industrial	Thermo electric	Average Storage	Capacity
Lower	1,390,569	1,142	850	292	719	283	55	85	2,255	2,632
	(70)	(41)	(85.3)	(16.5)	(33)	(66.7)	(77)	(97)	(75.8)	(53)
Middle	536,774	437	141.5	296	292	127.5	14.5	3	719	2,337
	(27)	(16)	(14.1)	(16.7)	(13)	(30)	(21)	(3)	(24.2)	(47)
Upper	52,204	1,191	5.6	1,185	1,176	13.2	1.8	0	na	na
	(3)	(43)	(0.6)	(66.8)	(54)	(0.3)	(3)			
Total	1,979,547	2,771	997	1,774	2,187	424	71.3	88.4	2,973	4,969

Table 1: Summary of regional average annual water use, population, and reservoir storage from 2000-2007. Volumes are in 10^6 m^3. For each region, the percentage of the basin total water use is shown in parentheses – for example, the Middle Region uses 16.7% of the groundwater (GW) and Upper Region agricultural use is 54% of the basin total. The percentages of each column sum to 100. Total volumetric water use for the basin is summed in the last row. SW = surface water.

2.0 Data and Methods

The extensive review and analysis of grey literature related to drought impacts and management responses are novel aspects of this study. We obtained data from a diverse array of publicly available sources to understand and characterize the breadth of multisectoral impacts and management responses in the basin (Table 2). Table 2 provides a description of each data type, citing the temporal and spatial resolutions and the period of record, and links to all dataset sources are in the references.

Data Category	Description	Source/Agency
Water Use	Annual sectoral SW and GW volumes by county (2000 - 2020)	TWDB, 2023b
Reservoir Storage	Daily reservoir storage (1940 - 2021)	TWDB, 2022c
Streamflow	Daily gauged streamflow (2000 - 2020)	USGS, 2023
Water Quality	Field water quality samples at river and lakes monitoring locations (2000 - 2020)	TCEQ, 2023
Crop	Annual crop production and harvested area by county (2000 - 2020)	USDA, 2023
Cattle	Annual cattle herd size by county (2000 - 2020)	USDA, 2023
Population	Decadal estimates (1940 - 2020) and annual estimates (2001 - 2020) by county	US Census, 2022 TWDB, 2022c
Wildfire	Annual acres burned by county (2008 - 2015), acres burned statewide (2002 - 2021)	NOAA, 2022
Gross Domestic Product (GDP)	Annual sectoral GPD by county (2000 - 2020)	BEA, 2022
Employment	Annual sectoral employment by county (2000 - 2020)	BEA, 2022
Energy Production	Monthly production by power plant (2001 - 2021)	EIA, 2022
Drought Classification	Weekly drought classification (% area under each drought threshold) for the basin (2000 - 2020), weekly drought classification maps (2008 - 2015)	U.S. Drought Monitor, 2023
Well installation by sector	Annual well installations by sector by county (2001 - 2021)	TWDB, 2022d
Planned future supply	Recommended water supply projects to meet future sectoral demand. County-level data aggregated for each planning region. (2011, 2016, 2021)	Regional Water Plans*
Unit cost by supply type	Unit cost for each recommended water supply project. County-level data aggregated for each planning region (2011, 2016, 2021)	Regional Water Plans*

Table 2: Data sources for multisector impacts and water management response characterization. *Regional water plans include 2010, 2015, and 2020 regional plans for each of the planning regions.

Much of the data was available at annual temporal resolution at the county spatial scale. For these cases, we primarily aggregated the county-level data to determine annual statistics related to drought impact for each of the three regions in the basin. The only exceptions are streamflow and reservoir storage which are continuous daily data, and water quality which is only available during reported sampling times. In some cases, the data categories contained an overabundance of records. For example, there were hundreds or thousands of locations with hydrological time series data (streamflow, water quality) and numerous metrics associated with annual, county-level GDP, employment, and crop data. For these cases, literature and planning documents helped guide the selection of metrics and locations for analysis. We used the data sources in Table 2 to assess impacts to sectoral water use, reservoir storage, agriculture production, landcover and the environment, the economy, and energy production. The topical focus areas for drought impacts were informed by peer-reviewed literature and regional water planning documents. Costs for sectoral and regional GDP were converted to 2022 dollars using consumer price index data.

To understand the substantive ways that the drought shaped water planning in the basin, we conducted a comprehensive review and analysis of data in regional water management plans from 2011, 2016, and 2021 for each of the three regions in the basin. Regional water plans in Texas are issued on a 5-year planning cycle and have been mandated by state law since 1997 in response to severe drought conditions in 1995 and 1996 (Wurbs, 2015). An advantage of the relatively short 5-year planning cycle is the ability to respond to recent changes in water availability and sectoral demand. Future shortages are calculated based on the difference between projected future demands (based on estimated sectoral growth) and available supply under drought of record conditions. The 2011 plans were developed before the most severe and prolonged impacts, the 2016 plans were influenced by record drought in 2011 and persistent drought conditions, and the 2021 plans were created with full understanding of the drought of record. Our analysis of planning and management responses was additionally supported by publicly available reports from utilities and municipalities in the basin and was also informed by interviews with subject matter experts who have experience in city, regional, state, and utility-scale water planning and management. We quantify water management and planning responses by aggregating county-level data from the regional plants on planned water supply projects. The planned supply data included information about the supply type (e.g., new groundwater wells, reuse, desalination etc.), the unit cost of each supply project for which there were over 1,186 individual projects ($/m^3), supply volume, and sector supplied by each proposed project. Water supply costs were converted to 2022 values using the annual consumer price index.

The last results section (3.3) presents a synthesis of our analysis of the multisector impacts during the 2008-2015 drought of record in the form of a directed acyclic graph (DAG). A DAG, also known as an influence diagram, is a compact way to present complex causal relationships pictorially; it can also be implemented mathematically to model causal inferences (not performed for this study) (Howard and Matheson, 2005; Schachter, 1987). The influence diagram in Section 3.3 is a novel product of this study and is based on the review of thousands of pages of regional water planning documents, over a hundred academic papers and reports, and the analysis of 15 datasets (Table 1). As a preview to the detailed influence diagram in Section 3.3, Figure 2 presents a high-level DAG showing the relationship between drought dynamics, impacts, and planning/management responses. In an influence diagram, each oval represents a state variable, each rectangle represents a decision, and each arrow shows the direction of influence. Figure 2 shows the following relationships. Meteorological drought can lead to soil moisture drought (not shown here, but also influenced by evapotranspiration). Together, these two types of droughts lead to streamflow drought (less surface runoff due to decreased precipitation and decreased soil moisture) that in turn can lead to reservoir drought. Reservoir drought can also be exacerbated by soil moisture drought if increased irrigation demand (municipal or agricultural) is accommodated by reservoir storage. Thus, reservoir drought can be produced by both decreased surface water inflows and increased water demand during drought conditions. The combined effects of soil moisture, streamflow, and reservoir droughts cause a wide variety of human and natural system impacts (Section 3.1) and planning and management responses (Section 3.2).
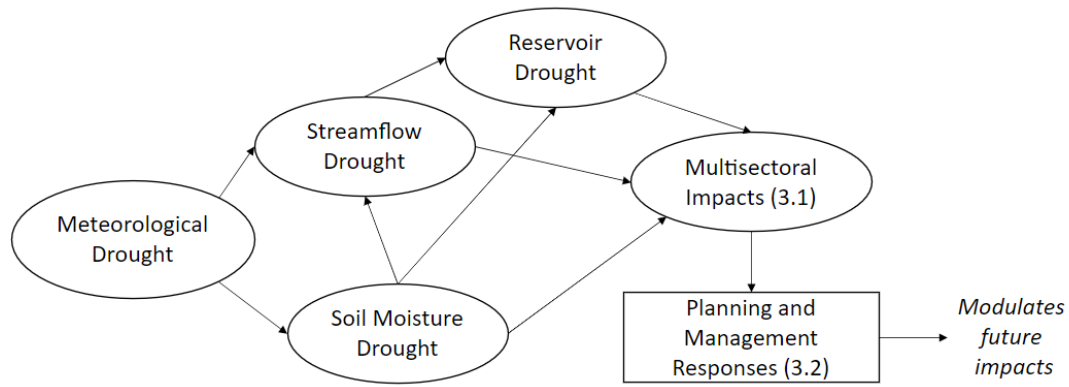
Figure 2: High-level influence diagram showing the relationships between types of droughts, multisectoral impacts, and adaptation responses.

3.0 Results

We first present analysis of multisectoral impacts during the 2008-2015 drought of record (Section 3.1), followed by changes to water planning, policy, and management during and following the drought of record (Section 3.2), and conclude with an influence diagram summarizing multisectoral impacts and interactions based on our analysis (Section 3.3).

3.1 Multisectoral Impacts

This section covers multisectoral impacts during the 2008-2015 drought. Available data is presented before and after the drought to provide context on how sectoral impacts compared to the pre-drought and post-drought period. The following sub-sections are covered: multisectoral water use of surface water and groundwater (3.1.1), reservoir drought in the middle and lower regions (3.1.2), impacts to agricultural production (3.1.3), environmental impacts (3.1.4) (wildfire, drought-driven tree mortality, streamflow, surface water quality, and environmental flows), economic impacts (3.1.5), and impacts to energy production (3.1.6).

3.1.1 Multisectoral Water Use

The onset of the drought in 2008 marked the highest amount of water use in the middle and upper regions (from increased groundwater use), while 2011 was the largest annual water use in the lower region (from both increased surface water and groundwater use) (Figure 3). Notable regional differences in year-to-year variability of water use during the drought were driven primarily by agriculture (Figure 3), while municipal use (second largest sector) showed comparatively little absolute (volumetric) fluctuation when compared to total water use within each region (Figure 3). Surface water use declined in the middle and lower regions as the drought progressed, reflecting reservoir conservation measures and temporary drought management measures enacted by municipal water providers (SI Figure 1). During the last three years of the drought (2013-2015), surface water use in the lower region was 40% less than that from 2008-2010, while surface water use decreased by 19% in the middle region. In contrast, average groundwater use in the middle and lower regions showed little change during the drought. The declining trend in groundwater use in the upper region that started during the drought does not have an obvious explanation because it does not reflect comparatively large reduction in irrigated acres for major crops. One plausible explanation would be adoption of more efficient irrigation technology, but we do not have data to support that hypothesis.

205   Comparing annual agricultural water use during and following the drought revealed significant shifts in surface water and groundwater use for the two largest sectors in the basin (Figure 4). Compared to the pre-drought period (2000-2007), agricultural surface water use during the drought declined by an average of 36% in the lower region and 38% in the middle region, and these reductions persisted over the 2016-2020 post-drought period (Figure 4a). Following reservoir conservation measures in 2012, lower basin agricultural surface water use was 65-77% less than during the pre-drought period. A consequence of reduced
210   agricultural surface water availability in the lower region was an increase in groundwater use (Figure 4a) and well installations (SI Figure 2) during the drought and post-drought periods (Figure 2). Average agricultural groundwater use in the lower region was 33% higher compared to the pre-drought period, with a peak increase of 84% in 2011, while in the middle region average use was 21% higher during the drought and 42% higher in 2008. Only upper region groundwater use declined in the post-drought period compared to the pre-drought period. In all three regions, post-drought agricultural groundwater use declined compared to the
215   drought period (Figure 4a). The post-drought decline in agricultural groundwater use across the basin could be due to a combination of reduced irrigation demand due to the cessation of meteorological drought, more efficient irrigation technology/practices, and in the middle and lower regions also be influenced by a preference for lower cost surface water when available.
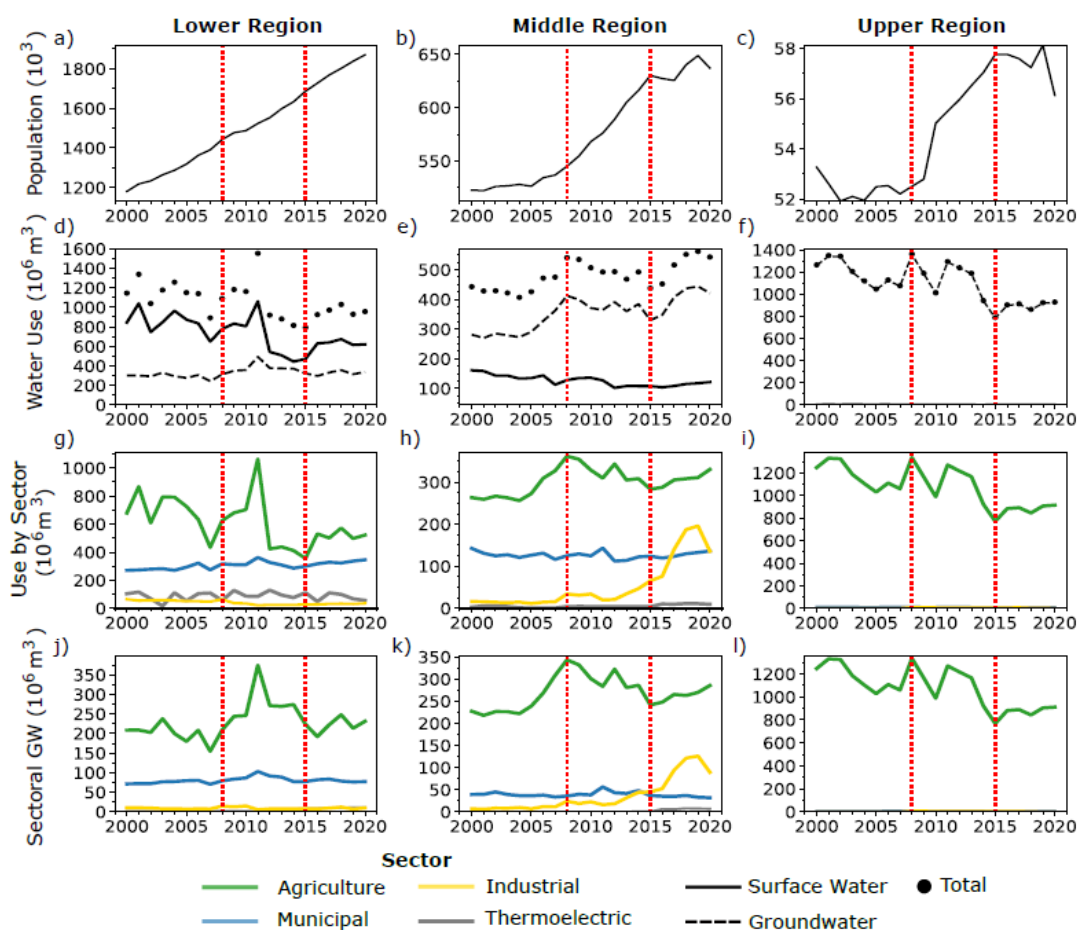
Figure 3: Population growth (a-c), annual surface water **(SW)** and groundwater (GW) use (d-f), total sectoral use (SW + GW) (g-i), and sectoral GW use (j-l) from 2000 – 2019 in the three planning regions. This data only includes counties shown in Figure 1b.

Increased municipal surface water use in the lower region during and following the drought (Figure 4b) is reflective of the large population growth in the region, which grew by over 450,000 residents between 2008 and 2020 (Figure 3a). In contrast, municipal

surface water use in the middle region was on average 11% lower during the drought and 15% lower following the drought (Figure 4b). Municipal surface water use in the upper region, while small in magnitude (Figure 3g), showed even larger declines than the middle region (Figure 4b). A consistent pattern in municipal groundwater use shared by all three regions was increased use during the drought followed by reduced use after the drought. This suggests a temporary shift towards groundwater to compensate for reduced surface water supply during the drought. The reduction in groundwater use following the drought may reflect the successful long-term demand management efforts implemented in response to the drought (Section 3.2) and also a preference to use lower cost surface water when available. Only in the lower region municipal groundwater use in the post-drought period remained higher than during the pre-drought period, likely related in some degree to accommodating the large population increase from 2008-2020.
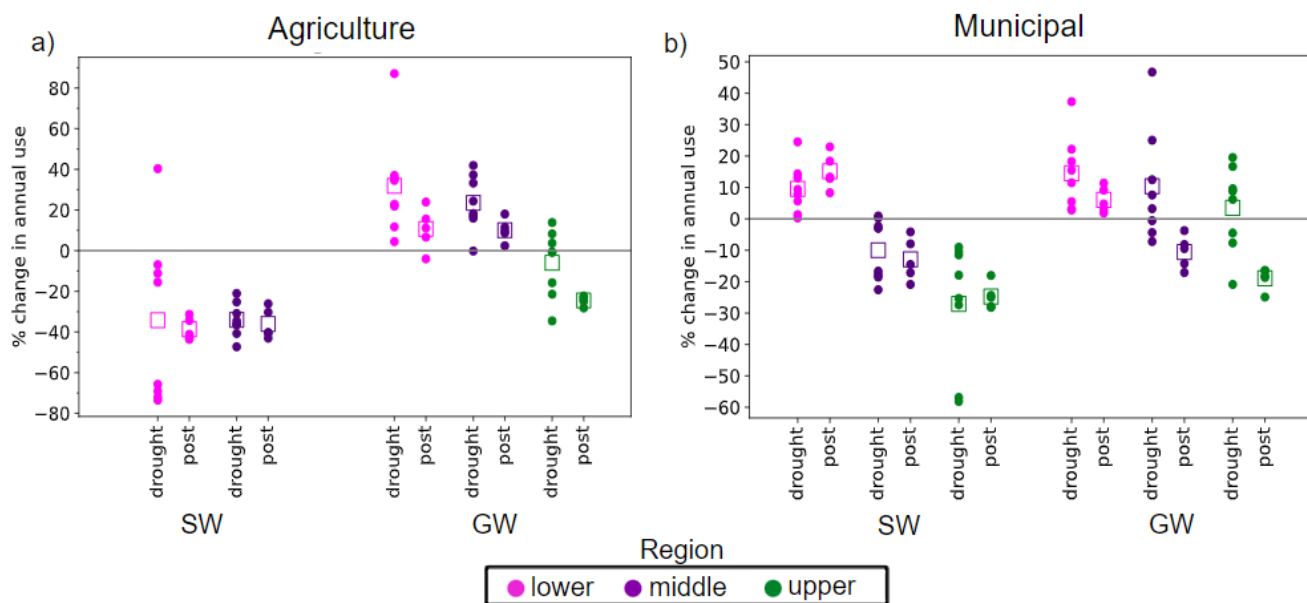
Figure 4: Change in agricultural (a) and municipal (b) surface water (SW) and groundwater (GW) use during the drought (2008-2015) and post drought (2016-2020) periods compared to the pre-drought 2000-2007 period. Annual values are circles and period means are open squares. No SW is reported for agriculture in the upper region and it is therefore omitted from (a).

Thermoelectric water use in the basin increased by an average of 12.4% during the drought compared to the pre-drought period and two of the highest use years occurred during the drought (2009 and 2012). Although not visually apparent in Figure 3j due to its relatively small magnitude compared to other sectoral water uses, there was a 540% increase in groundwater use for thermoelectric water supply in the lower region following the drought (1.58 million m^3/yr from 2008-2013 growing to 10.17 million m^3/yr from 2015-2020). This suggests a transition towards a more drought-resilient supply as groundwater is less sensitive to reduced surface flows. A notable multisectoral use trend unique to the middle region was a remarkable 150% increase in industrial water use from 2008 to 2020 (Figure 3h). This growth was almost entirely associated with unconventional (fracking) oil and gas development (Region F, 2020), which often uses non-potable sources and was not influenced by drought –it is thus not considered a drought impact.

3.1.2 Reservoir Drought

In 2008, at the onset of the meteorological drought, middle region reservoirs were less than 50% full, and were already in the midst of a long-term reservoir drought (Figure 1d). In contrast, lower region reservoirs were completely filled at the onset of the drought

(Figure 1e). However, because of much lower agricultural surface water use (less than one-tenth of the lower region), the middle region is not susceptible to large interannual declines in storage from supplying large quantities to irrigators (Figure 1d). Additionally, surface water use from other sectors in the middle region was much smaller than the lower region (Figure 3 e, h, k). In fact, the total surface water use in the middle region during 2000-2007 was 47% less than municipal use *alone* in the lower region. In contrast to the gradual storage declines in the middle region during the drought (Figure 1d), in both 2008-2009 and 2011, there were sharp declines in lower region reservoir storage with over 40% drops in total storage during each one- or two-year period (Figure 1e). Reservoir releases for surface water irrigation were the largest driver of large annual storage declines in the lower region, but significant municipal demand also contributed to storage declines during the most severe meteorological drought years.

Middle and lower region reservoirs experienced sustained record low storage during the second half of the drought (2012-2015). During this period, storage levels in the lower region fluctuated between 40-50% capacity and in the middle region between 10-20%. A specific feature of the 2011 to 2015 period that caused severe reservoir drought to persist in the lower region was the absence of any large storm events to replenish storage. In 2011, inflows to lower region reservoirs were the lowest on record, and only 10.6% of average annual inflows from 1942 to 2017 (Austin Water, 2018). To contextualize how unprecedented 2011 inflows were, the lowest inflows during the 1950's drought (619 million m^3) were approximately four times greater than in 2011 (157 million m^3) (Austin Water, 2018). Inflows to the lower region reservoirs continued at record-low levels from 2012 to 2014, all lower than the worst year of the 1950's drought. Evaporative losses further exacerbated low surface inflow and contributed to reservoir drought. In 2011, lower region evaporative losses exceeded reservoir inflows, with an estimated 239 million m^3 lost to evaporation — equivalent to ~10% of lower region storage capacity and approximately the total annual municipal demand of the highly populated lower region (LCRA, 2022). A series of large precipitation events in 2015 ended the drought and replenished lower region reservoirs, which by 2016 were completely full, while the middle basin storage only recovered to 25% capacity (Figure 1d).

3.1.3 Agricultural Production

Reduced agricultural production was one of the most notable impacts of the drought. The simultaneous stressors of increased plant water demand and physiological stress from high temperatures were the main drivers leading to diminished yields and high abandonment rates during the hot, dry drought conditions in 2008-2009 and 2011 (Figure 5) (Anderson et al., 2012; TWDB, 2022b; Nielson-Gammon, 2012). For all three major crops (corn, cotton, winter wheat) but rice, these years were generally associated with the lowest harvested acreage, production, and yield (Figure 5 b-m) (Anderson et al., 2012; TWDB, 2022b).

The severity of impacts varied by region due to the spatial heterogeneity of drought (SI Figure 3) and differences in the proportion of irrigated versus dryland crops. Because dryland farming relies on precipitation to meet plant water needs, it is more vulnerable to meteorological drought than irrigated farmland that can supplement precipitation deficits. The middle basin, with 29% production in irrigated cotton, had generally lower cotton yields than the upper region with 55% of production irrigated (Figure 5j). A higher proportion of dryland farming was also related to larger reductions in total production and harvested acres during the most severe drought years (Figure 4 b, f). Compared to 2010, in 2011 cotton acreage in the upper region declined by 64% while acreage in the middle region decreased by 87.5%. Texas is one of the major global producers of cotton and comprises a large enough fraction of supply that the severely reduced production in 2011 contributed to the unprecedented price spike in cotton,

which increased 153% between March 2010 and March 2011 (U.S. Bureau of Labor Statistics, 2011). Cotton acreage and production gradually recovered to pre-drought levels over 2012-2015. Winter wheat is another example of severe yield, acreage, and production declines for dryland crops (Figure 5 d, h, l). Before the drought, less than 10% of annual production was for irrigated wheat—even during the drought only 16% of production was irrigated. In 2009 and 2011, wheat production declined by 64% and 86%, respectively, compared to the preceding year. Corn is also primarily dryland and had reduced production and yield in 2009 and 2011 but by 2013 production recovered to levels greater than before the drought (Figure 5 g, k). Corn continued to increase following the drought with post-drought area and production almost doubling relative to pre-drought levels (Figure 5 c, g). Rice differs from the three other crops because it is primarily irrigated by surface water flood irrigation. The abrupt decrease in rice production from 2012-2015 was a result of curtailment of lower region reservoir releases. 2012 was the first time in the basin's history that agricultural water deliveries in the lower basin were curtailed, and curtailments continued until 2015. Most surface water deliveries for rice are classified as interruptible, which can be reduced or entirely cut off if reservoir storage falls below defined drought trigger levels.
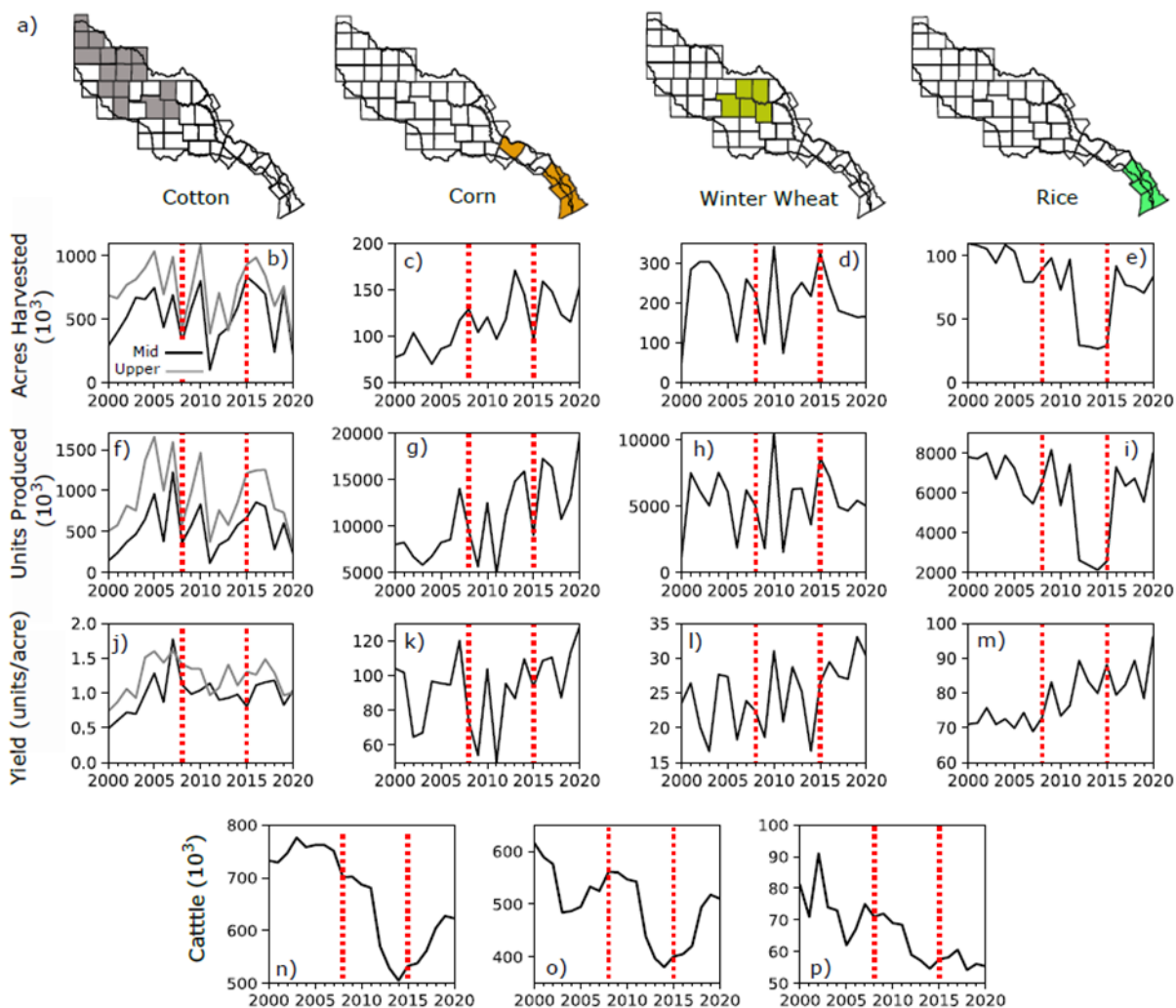
Figure 5: Locations of major crop production (a). Harvested acres (b-e), units produced (f-i), and yield (j-m) for the four crops. Crop-specific units of production: 480-pound bales for cotton, bushels for corn and wheat, and 100-pound units for rice. Cattle herd data for each region (n-p). This data includes all counties shown in Figure 1b.

An adaptive response during drought is to temporarily switch to lower water demand, more drought-tolerant crops (Fisher et al., 2015; Glotter and Elliott, 2016). Temporary increase in sorghum production in the upper region is a potential example of crop

switching (SI Figure 4). Increased sorghum, combined with decreased wheat and cotton also occurred during the 1950's Texas drought (TWDB, 2022b). Sorghum has lower water requirements and is more drought-tolerant than cotton or wheat (TWDB, 2022b). The largest single-year increase in sorghum production occurred in the upper region in 2008 with a 350% rise, while cotton production dropped by 55% compared to 2007. Sorghum production in the lower and middle regions did not show evidence of crop switching, and both regions displayed a long-term decline in sorghum production from 2000 to 2020 (SI Figure 4).

The drought also caused large reductions in cattle in the middle and lower regions, with a 17% (224,000) decrease from 2011 to 2012. Exceptionally low spring precipitation in 2011 prevented development of dryland crops for cattle feed and adequate forage growth for pasture (Nielson-Gammon, 2012), which reduced available feed and increased feed prices (Countryman et al., 2016). Cattle numbers did not increase until 2015 and through 2020 herd sizes had not yet recovered to pre-drought numbers (Figure 5).

3.1.4 Environmental Impacts

3.1.4.1 Wildfire and Landcover

The dry and abnormally hot conditions in 2008 and 2011 (Neilson-Gammon and McRoberts, 2009; Neilson-Gammon 2012) produced the two most severe wildfire years in the state (SI Figure 5), and the record dry and hot conditions in 2011 led to the worst wildfire year in the state's history (Texas A&M Forest Service, 2011). 2011 accounted for 52% of the total area burned in the Colorado Basin over the drought period. However, the fraction of burned area in 2011 varied widely over the different regions, with over 88% in the upper region, 50% in the middle, and 40% in the lower (SI Figure 5). The upper and middle regions are mostly arid grassland and shrubland, which were more affected by hot/dry drought-driven wildfires (Nielson-Gammon, 2012) compared to the forest-dominated lower region. Firefighting costs for Texas were estimated at $48 million (Neilson-Gammon, 2012). Of the estimated $500 million in fire-related losses in 2011, $325 million (65%) was associated with the Bastrop Complex fire located in the lower region city of Bastrop that remains the costliest fire in state history (Texas Standard, 2021).

In addition to vegetation loss from fires, the extreme dry and hot conditions during 2011 caused widespread tree mortality in the middle and lower regions, due to depleted deep soil moisture that typically buffers trees from short-term drought (Nielson-Gammon, 2012). Estimates indicate that there was an 8-10% canopy loss in the middle and lower regions (Schwantes et al. 2017). A statewide study by Moore et al. 2016 found single-year mortality percentages of 6-6.6% in the middle region and 7.4-9.7% in the lower region, similar to the estimates from Schwantes et al., 2017. Crouchet et al. (2019) studied tree mortality in the middle region and found a 9× increase in mortality compared to a typical year. The upper region was not affected by tree mortality because it is scrubland largely devoid of tree cover. Tree mortality also affected cities, with mortality rates in parts of Austin reaching 20% in 2011 (NASA, 2019). While the record hot, dry conditions in 2011 have been the focus of most studies, Klockow et al. (2018) found pest-driven mortality increased during 2012-2015 in Eastern Texas and hypothesized that this was related to physiological stress induced by 2011 combined with the continuation of drought conditions.

3.1.4.2 Streamflow, Surface Water Quality, and Environmental Flows

To contextualize the severity of the hydrological drought, streamflow at six locations in the basin are summarized using flow-duration plots (Figure 6 a-f). Locations a-c are located along the mainstem of the Colorado River, while locations d-f are tributaries (Figure 6j). Figure 6 a-c additionally show the flow duration curves for the 2000-2007, 2008-2015, and 2016-2020 periods. The curves for the pre-drought (2000-2007) and drought (2008-2015) periods were used to calculate percent reduction in flow over the

entire range of exceedance probabilities (Figure 6 a-f). Median to low flows are critical for stream habitat and water quality (Caldwell at al., 2018; Konrad et al., 2008; Wineland et al., 2021), while high flows are important for replenishing reservoir storage (Figure 2).

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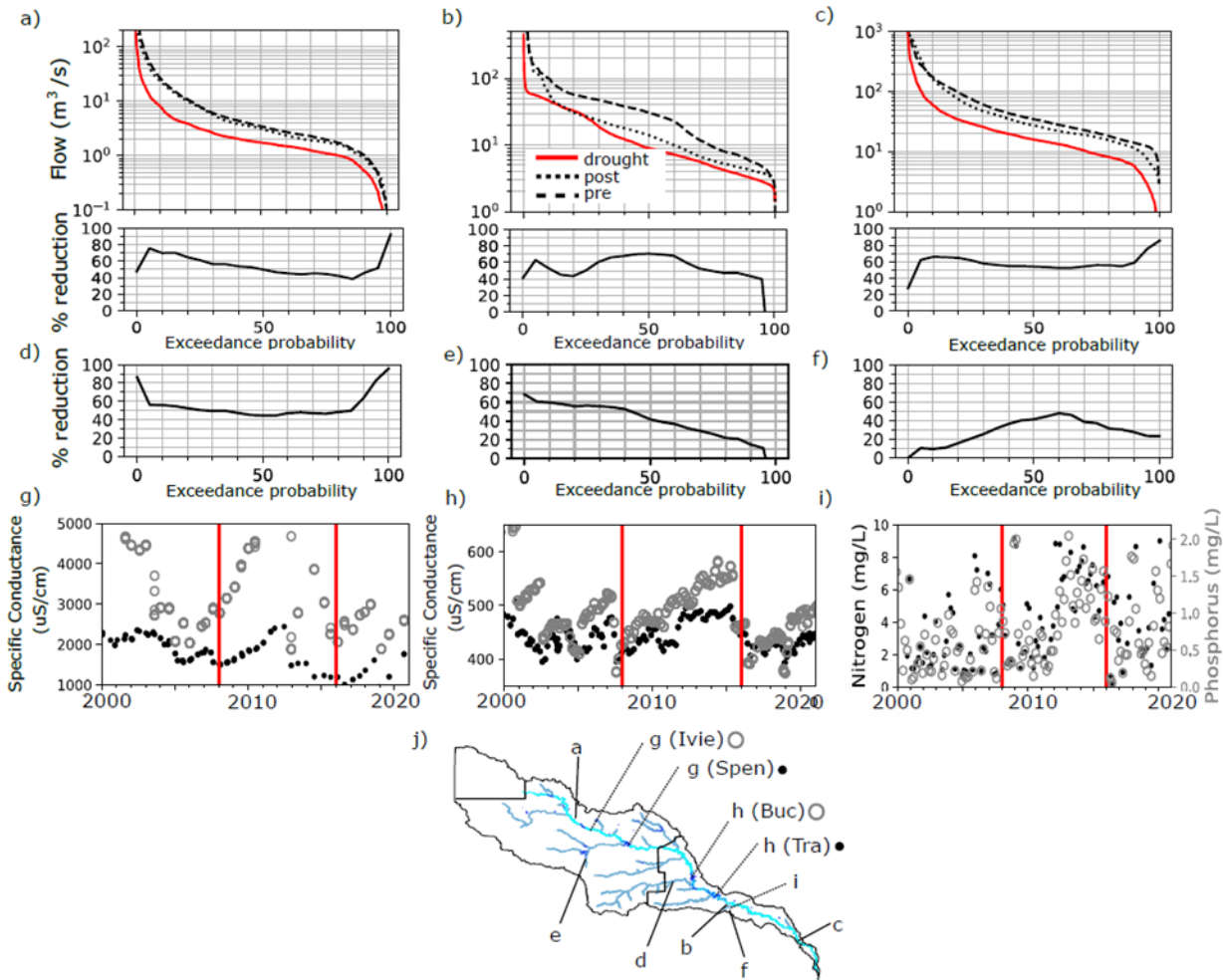
Figure 6: Flow duration curves for the pre-drought (2000-2007), drought (2008-2015), and post drought (2016-2020) periods for three locations along the Colorado River, TX (a-c). Percent reduction in exceedance probability flow for the drought period compared to the pre-drought period (a-f) for six locations (three for the Colorado River and three for tributaries). Specific conductance data at two middle region reservoirs O.H. Ivie (Ivie) and Spence (Spen) (g) and two lower region reservoirs Buchanan
360   (Buc) and Travis (Tra) (h). Nitrate and phosphorus data for the Colorado River downstream of Austin (i). Locations of discharge and water quality data (j) and denoted symbols for subplots g and h that show data for two reservoirs.

During the drought, flows along the mainstem were generally 40-60% lower across the spectrum of flow percentiles (i.e., the high, median, and low flows were all heavily reduced), while the tributary locations had more heterogeneity in their flow reductions. The San Saba location (Figure 6d) showed greater than 45% reduction across all flow percentiles, while the spring-fed South
365   Concho (Figure 6e) and Barton (Figure 6f) locations had had less severely affected low flows (often considered to be defined by the 90th or 95th flow exceedance percentiles). Prolonged hydrological drought can affect groundwater levels, which can in turn affect streamflow by reducing groundwater baseflow and spring discharge (Smith, 2013; Smith et al 2015), demonstrated by reduced flows at spring-fed locations e and f (Figure 6j). Due to the reservoirs being at critical levels between 2012 and 2015, environmental flow releases were reduced by about 86%, decreasing from 38 to 40.7 million m³ in 2011-2013 to only 5.7 million
370   m³ in 2014, and there were no releases in 2015 (LCRA, 2022), affecting low flows downstream of major reservoirs.

Water quality impacts included increased salinity, algae, metals, and nutrients (nitrogen and phosphorus), which are surface water quality impacts commonly associated with drought (Mosley, 2015). Reduced surface flows affect water quality by increasing the concentration of pollutants in surface water from both point source pollution (e.g., treated wastewater outflows) and non-point source pollution (e.g., runoff from agricultural or urban land) (Mosley, 2015). The example we provide is for a segment of the Colorado River downstream of one of Austin's two water treatment plants (Figure 6i), which shows consistently elevated nitrogen and phosphorous concentrations during 2012-2015. Low streamflow also affected water quality in the Matagorda Bay estuary where the Colorado River discharges into the Gulf of Mexico. Discharge from the Lower Colorado River to Matagorda Bay in 2011 was 274 million m^3, representing a decrease of over 78% compared to the average annual discharge of over 1.2 billion m^3 between 1980 and 2010, marking the lowest on record since 1977 (TWDB, 2015). This historically low freshwater input resulted in increased salinity levels in the estuary that reduced habitat suitability for oyster, crab, shrimp, and fish, affecting commercial fishing operations and estuary health (TWDB, 2015).

In the lower region, the drought led to elevated nitrogen levels in reservoirs that caused increases in microalgae population and a shift towards more harmful algae strains (Gamez, et al. 2019), specifically cyanobacteria, which can produce harmful algal blooms (Beversdorf et al., 2013). Water quality in middle region streams and reservoirs was affected by naturally high levels of chlorides, sulfates, trace contaminants (ex. arsenic), and total dissolved solutes from groundwater baseflows (Region F, 2015). During hydrological drought, groundwater baseflow comprises a larger fraction of streamflow (Jones and van Vliet, 2018), which resulted in degraded surface water quality in the middle region. Reservoir water quality was further degraded by evaporation that concentrated solutes. Specific conductance data (proxy for solute concentration) for two key middle region supply reservoirs (O.H. Ivie and Spence) show solute concentrations steadily increasing from 2008 to 2013 (Figure 6g). Fresh inflows in 2013 substantially reduced solute concentrations in these reservoirs, though total storage in the middle basin changed little (Figure 1b). The two main lower region reservoirs (Buchanan and Travis) also showed increasing solute concentrations during the drought (Figure 6h), but their magnitude was much smaller and was not a concern for potable water quality.

3.1.5 Economic Impacts

It is difficult to precisely quantify and directly attribute economic impacts to drought (Naumann et al., 2021; Stahl et al., 2016). However, sectoral data on employment, GDP, and population growth at regional and basin scales enables a first-order assessment of whether any explainable changes coincide with the drought period.

Population growth in the basin, including the rapidly growing Austin metro area, remained constant throughout the 2008-2015 period and did not show a reduced growth rate at any point during the drought (Figure 3 a-c), even during (2011-2015) when strict water conservation measures were in place. Additionally, key economic metrics of total GDP (Figure 7) and employment (SI Figure 6) both showed steady and sizeable growth throughout the drought. As shown in Figure 7, GDP decline in the middle and upper basins can be attributed to the oil and gas sector, which is unrelated to the drought. Compared to average agricultural GDP during 2000-2007, average GDP in the basin over 2008-2015 was $574 million lower (35%) and in 2011 $913 million lower (56%) (inflation adjusted to 2022). The upper region was more severely affected and disproportionally due to its large agricultural sector. During 2008-2015 upper region agricultural GDP was reduced by 51%, while the middle and lower regions were only reduced by 26% and 24%. While the drought had significant negative impacts on the agricultural sector GDP, agriculture represents a small

fraction of total GDP and regional employment. Even in the upper basin, where 99% of water use is for irrigation, agriculture accounts for less than 15% of GDP, whereas it's less than 0.5% in the other two regions. However, agricultural impacts would have been more severe if losses were not partially offset by federal assistance and crop insurance (TWDB, 2022b). For example, at the state level there were $2.6 billion in insurance payments (Collins and Bulut, 2012), while state-level losses were estimated at $13 billion (Anderson et al., 2012). However, the losses reported by Anderson et al. (2012) are gross revenue so the $2.6 billion likely made up for a large fraction of lost profit.
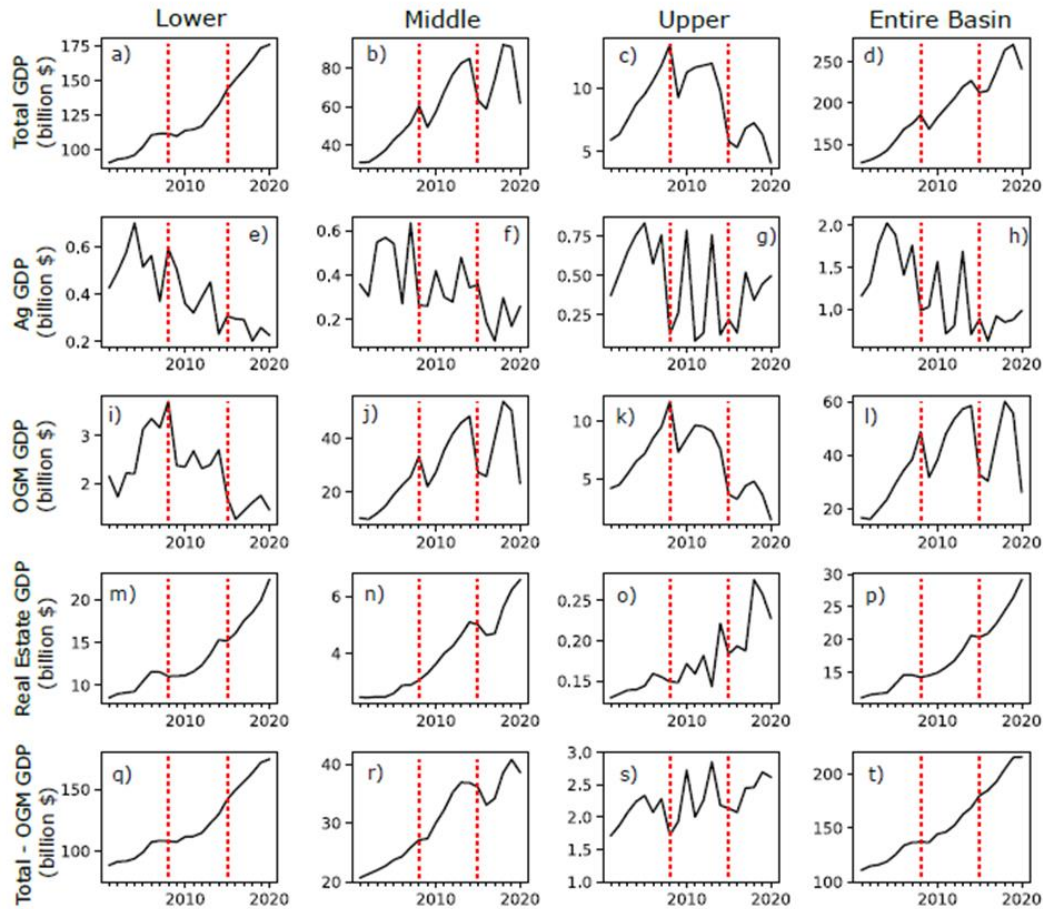
Figure 7: Regional annual GDP for all sectors (a-c), agriculture (e-g), oil, gas, and mining (OGM) (h-j)., real estate (k-m), and all sectors minus OGM (n-p).

Aside from agriculture, a specific sector harmed by the drought was the real estate market for lakeside homes, whose values are strongly tied to the recreational and aesthetic value of lakes. An analysis by Morris (2019) of home values around the lower region reservoir Lake Travis showed that the drought had large adverse effects on property values. Accounting for both loss of value and lost appreciation, lakeside homes incurred over $2 billion in estimated losses between 2011 and 2015 (Morris, 2019), whereas the real estate market in Austin and the lower region exhibited strong growth throughout the drought (Morris, 2019) (Figure 7).

Our finding that the drought had little apparent overall effect on the basin-wide economy is in line with assessments of the 2001-2009 Millennium Drought in Australia (Van Djik et al., 2013) and the 2012-2016 drought in California, United States (Lund et al., 2018). Highly connected domestic and global trade networks in the 21st century have greatly reduced the economic and societal

430   impacts of drought (Lund, 2016, Lund et al., 2018). Water supply infrastructure also buffers social impacts and economic disruption (Lund 2016). The combined factors of highly engineered regional water supply and domestic-global trade networks help explain why the drought did not hinder population and economic growth.

3.1.6 Energy Production

435

The power sector notably did not suffer any major adverse impacts during the drought (TWDB, 2022b), and there were no reports of significant outages even during record drought conditions in 2011 (Scanlon et al 2013a). The absence of substantial reliance on hydropower in the basin (on average less than 3% of annual production) resulted in no *significant* impact to power generation from curtailed reservoir releases due to reservoir drought. Additionally, many thermoelectric plants in the basin had already transitioned

440   to low water demand cooling technologies before the drought and thus were "pre-adapted" for severe and prolonged drought conditions (Scanlon et al. 2013a). Natural gas facilities with high water efficiency technologies such as combustion turbine and combined cycle (with cooling tower) are prevalent in the middle and upper regions (Scanlon et al 2013b). There is only one high water demand coal plant in the lower basin, which is supported by a guaranteed firm water contract from lower basin reservoirs (LCRA, 2022). Many of the thermoelectric plants also have their own reservoirs, including the South Texas Nuclear Plant in the

445   lower region, that provide more reliable supply than solely relying on run-of-river diversions. These factors highlight the significance of institutional arrangements and engineered water infrastructure for reducing power sector vulnerability to drought.

During the drought wind power production in the basin almost doubled (98% increase), mostly in the water-scarce middle and upper regions. By 2015 annual wind production was similar in magnitude to coal power production in the basin (~10 million

450   megawatt hours (MWh) (SI Figure 7). Solar power did not experience large growth until after 2015, but between 2015 and 2020 annual production increased from 44,000 MWh to 4.1 million MWh. By 2020 the combined annual wind and solar production (2.5 million MWh) was more than double coal power and on par with gas power production in the basin. An advantage of wind and solar power in a water-stressed region is electricity generation with zero water requirements.

455   ### 3.2 Impacts on Water Planning and Management

The drought resulted in large increases in proposed investments to meet long-term water needs, with the largest increase in planned projects in the lower region (a $3.63 billion increase from 2011 to 2016 and an additional $623 million from 2016 to 2021) and moderate increases in the middle region ($281 million from 2011 to 2016 and an additional $410 million from 2016 to 2021).

460   Notably, the drought did not cause any major changes in the upper region planning due to its low sectoral demand outside of agriculture and no economically viable alternative irrigation source other than continued use of groundwater. The following sections describe changes in planned sectoral water supply (3.2.1), the type, volume, and unit costs of proposed water supply sources (3.2.2), and specific planning and management innovations (3.2.3).

465   ### 3.2.1 Impact of Drought of Record on Future Sectoral Water Supply Planning

The first part of our assessment tabulated recommended additional water supply for sectors in each region along with the estimated sectoral shortage in a repeated drought of record (Figure 8). We found that most of the anticipated future supply needs and recommended additional supplies were associated with the municipal and agricultural sectors (Figure 8), the two largest sectors in

the basin. The most prominent planning response was a nearly 300% increase in planned municipal supply for the lower region between 2011 and 2016 (Figure 8b). A consistent pattern across all regions was that recommended new municipal supply far exceeded projected future needs, which suggests a sizable buffer or "safety factor" should a future drought be more severe than the historical reference used by the drought of record methodology. In contrast, recommended agricultural supplies typically do not exceed projected needs and are indicative of a lower priority towards preventing agricultural water shortages in the event of drought. This gap is most notable in the upper region where planned supplies for agriculture were less than 20% of
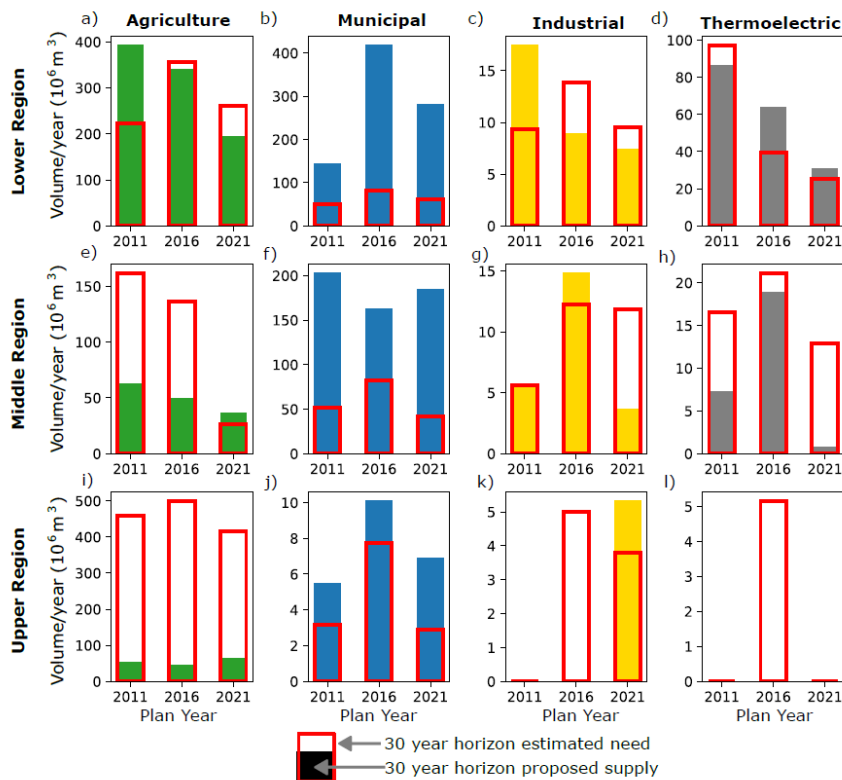
Figure 8: Filled bars show 30-year additional recommended supply ($10^6\,\text{m}^3$ per year) for each sector within each region, while unfilled red bars are estimated annual sectoral needs under a repeat of the drought of record in the same 30-year horizon.

anticipated need, reflecting the anticipated reduction of long-term supply due to groundwater depletion with no feasible alternative supply (Region O, 2020). Proposed additional supply for thermoelectric power met anticipated needs in the lower region, but not the middle and upper regions. However, the middle basin plans note that some middle region power plants included in the regional water plans are being phased out in the near-future and that the projected 30-year demands are not accurate; the upper basin need in 2016 appears anomalous.

3.2.2 Water Supply and Management Strategies to Meet Future Supply Needs

The next part of our analysis compiled a database of the specific sources of additional supply proposed to meet the recommended supply targets for each planning region in each of the five-year regional water plans from 2011 to 2021 (Table 3). We identified 13 water supply strategies proposed to meet future water needs in the basin (Table 3). The strategies can be classified into one of the following three groups: (1) demand reduction, (2) creation of new supplies, and (3) alternative use of existing supplies. The three regions have notable differences in what combination of the 13 strategies are used to meet projected needs under a repeated drought of record.

Year	Region	Demand Reduction		Existing Supplies		New Supplies								
		Conservation	Drought Management	Voluntary Transfer	Subordination	ASR	Brush control	Desal	GW	New Reservoir	Return Flows	Reuse	Rain Harvesting	Advanced Treatment
2011	Lower	219.7	0.0	0.0	0.0	0.0	0.0	8.1	108.4	0.0	35.3	72.5	0.0	0.0
2016	Lower	256.4	182.1	0.0	0.0	64.3	4.2	0.0	32.5	151.5	54.5	72.2	10.2	0.0
2021	Lower	194.0	93.1	0.0	0.0	20.5	2.6	0.6	35.6	34.6	52.5	64.2	3.9	0.0
2011	Middle	67.8	0.0	25.7	93.5	0.0	10.6	19.8	41.9	0.0	0.0	15.4	0.0	0.0
2016	Middle	66.4	0.0	21.1	63.7	6.2	27.7	8.8	20.7	0.0	0.0	15.9	0.0	15.4
2021	Middle	41.2	0.0	1.6	55.0	0.0	0.7	0.0	71.1	0.0	0.0	11.0	0.0	44.0
2011	Upper	56.4	0.0	0.0	0.0	0.0	0.0	0.0	2.9	0.0	0.0	0.0	0.0	0.0
2016	Upper	49.0	0.0	0.0	0.0	0.0	0.0	0.6	5.1	0.0	0.0	0.0	0.0	0.0
2021	Upper	64.2	0.0	0.0	0.0	0.4	0.0	0.0	10.4	0.0	0.0	0.0	0.0	0.0

495

Table 3: Planned sources of additional supply (10^6 m^3/year) for planning regions in the Colorado Basin. ASR – aquifer storage and recovery; GW – groundwater.

3.2.2.1 Planned New Water Supply Sources Following the Drought of Record

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The 2016 regional water plans had six supply strategies that were not present in 2011 plans: aquifer storage and recovery (ASR), rain harvesting, advanced water treatment, construction of new reservoirs, and brush control. Another notable change compared to 2011 was a large increase in the use of municipal return flows. While this strategy was not entirely new in the 2016 plans, the over 50% increase in return flow volumes was notable so this strategy is included in this section.

505

The new strategies had a wide range of unit cost, with return flows being the least expensive while advanced treatment, rain harvesting, and ASR generally being the most expensive (Figure 9). ASR is primarily a strategy in the lower region, and likely due to its high estimated unit cost was scaled back in the subsequent 2021 plan (Table 3). Advanced treatment is unique to the middle region and refers to upgrading existing water treatment facilities and building new facilities that can treat surface and groundwater

510 to meet drinking water standards. Expanded advanced treatment would enable the middle region to use groundwater sources that currently exceed standards and treat reservoir water that can exceed standards during periods of drought (Region F, 2015). The use of return flows in the lower region is primarily for Colorado River diversions downstream of Austin, but one project proposes to import municipal return flows from outside of the basin.

515   The drought accelerated the construction of an off-channel reservoir that was proposed for 2030 in the 2011 plan. The 111 million m³ reservoir is designed to be filled using diversions from the Colorado River during high flow events to capture water that would otherwise flow to the Gulf of Mexico. Brush control refers to the selective removal of high-water-demand plants (juniper, salt cedar, and mesquite) to increase groundwater recharge and reduce riparian and shallow groundwater evapotranspiration (ET). Brush control was scaled back as a strategy in the 2021 plans and is not currently proposed as major

520   source of supply.

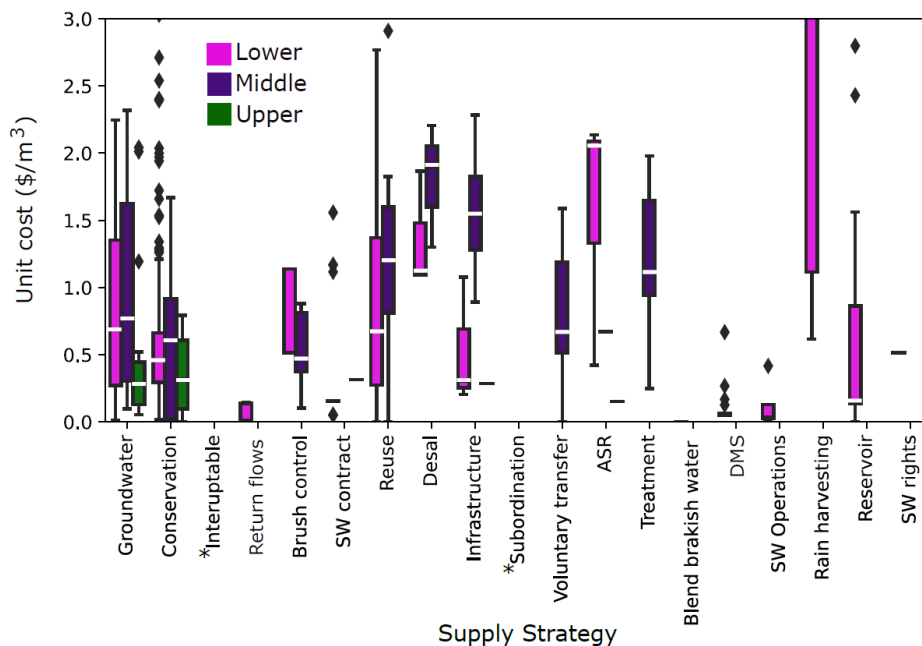



Figure 9: Unit cost per cubic meter for water supply strategies compiled from the 2011, 2016, and 2021 regional water plans. Costs converted to 2022 dollars. ASR = aquifer storage and recovery, DMS = temporary drought management strategies. No unit
525   cost reported for interruptible supply or subordination. Boxes show the interquartile range, and the median is shown by white lines.

3.2.2.2 Supply Strategies that Remained the Same or Decreased Following the Drought of Record

530   Planned supply from groundwater pumping and reuse remained the same or decreased after the drought. New groundwater supply was increased in the middle and upper regions following the drought, but there was a large decrease for the lower region, which was offset by a commensurate increase in groundwater supply from ASR, suggesting effort towards more sustainable groundwater use (Table 3).

535   We found that reuse and groundwater have a wide range of estimated costs (Figure 9). Reuse costs vary depending on whether the reuse is indirect or direct and the intended end use, with potable reuse being more costly than non-potable reuse, in agreement with Cooley et al. 2019. Non-potable reuse currently supplies municipal irrigation (parks, golf courses), oil and gas operations in the middle basin, and water for thermoelectric plants (middle and lower regions). The first direct reuse facility in Texas became operational in the middle region city of Big Spring in 2013. The Big Spring direct reuse facility blends reclaimed water with raw
540   reservoir water that is then treated in water treatment plant, providing 2.32 million m³/year of supply (Region F, 2015).

Estimates of new groundwater supply costs vary from 0.3 to 0.7 $/m³ for the lower quartile to over 1 $/m³ for the upper quartile (Figure 9). Major cost factors are proximity to the groundwater source and end use. The top quartile costs are associated with municipal supply projects developed far from the groundwater source that require extensive conveyance infrastructure, whereas

545   the lower costs are associated with local supplies associated with existing wellfields or non-municipal use. An example of a high-cost, municipal supply groundwater project is the T-Bar Groundwater Well Field for City of Midland (middle region) that became operational during the drought. The project added 13.8 million m³/year of supply at cost of $209 million. The project required the installation of 43 wells and a 95 km, 1.2 m diameter pipeline to convey groundwater from the T-Bar Ranch, located outside the basin, to the city of Midland. Estimated unit costs for the project were 1.15 $/m³ (2008 dollars) per acre-foot during amortization

550   (first 20 years) and 0.28 $/m³ after (2008 dollars) (Region F, 2015).

The use of existing supplies through voluntary transfers and subordination are unique to the middle region. Voluntary transfers are the temporary sale of surface or groundwater supply between users within the middle region. Following the drought, available supply from voluntary transfers was reduced by over 90%. Subordination refers to junior water right holders in the middle region

555   purchasing water from more senior downstream rights in the lower region. Under a strict priority system, junior middle basin water rights would not be allowed to make diversions during a drought of record due to legal priority of senior downstream users. However, the middle and lower regions have historically cooperated to ensure adequate essential supply for junior (low priority) middle basin users in critical sectors (e.g., municipal and power) and anticipate continuing to do so in the future (Region F, 2020). However, estimated supply provided by subordination was reduced by 40% following the drought due to reduced estimates of the

560   firm (reliable) supply for the lower region.

3.2.2.3 Conservation Strategies

Conservation is a key strategy in all the regional plans and was already a major strategy before the drought (Table 3). Conservation

565   was proposed across all sectors, with the largest amounts for municipal and agricultural sectors. Our cost analysis found that conservation is often more costly than many existing supplies but is typically less expensive than developing new resources (Figure 9).

Municipal conservation approaches include replacing water fixture efficiency, incentivizing low water landscaping, implementing

570   permanent watering schedules, improved metering, pipeline leak detection and repair, public outreach and education, customer engagement software (custom water use reports and water saving suggestions), and landscape standards for new development (Austin Water, 2018; Region K, 2020). The city of Austin has already implemented aggressive conservation measures, which have produced large, sustained reductions in per capita use (Figure 10). In 2010, Austin's water utility published a plan to reduce per capita use to 529 L/day by 2020 (Austin Water, 2010). The drought served as an accelerator of this objective (Figure 10). Per capita

575   use fell to below 529 L/day in 2013, seven years ahead of schedule, and the 76-113 L/day per capita reduction achieved during the drought has been sustained in the five years following the drought (2016-2020). Steep and lasting reductions in per capita use were achieved through an array of measures such as education, rebates for installation of drought tolerant landscapes, new ordinances for irrigation systems in new developments, rate increases, and rebates for water efficient fixtures (Austin Water, 2018).

580   Agricultural irrigation conservation measures include lining canals, converting canals to pipelines, laser-levelling flood irrigation fields (primarily rice in the lower region), increased efficiency (conversion of flood to sprinkler and sprinkler to drip), and real-

time metering and monitoring (supports more accurate billing and data to support conservation improvements) (Region F, 2020; Region K, 2020; Region O, 2020).

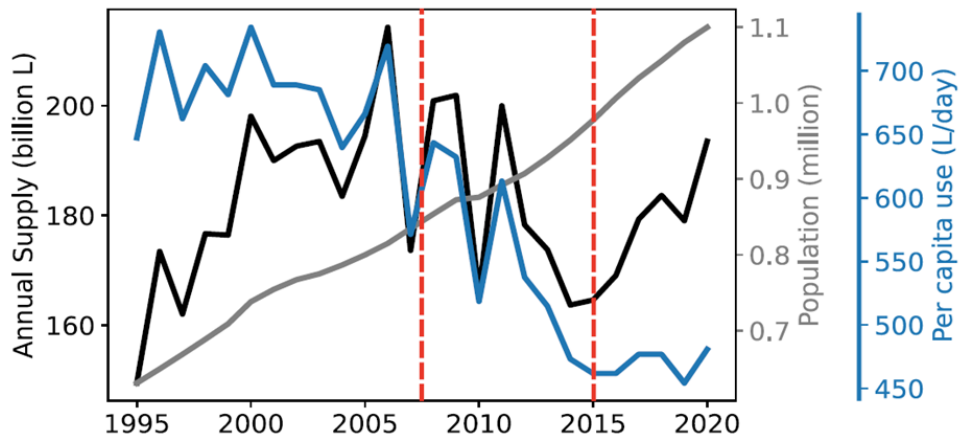



Figure 10: Austin Water annual water use (black), population (grey), and per capita water use (blue) from 1995 to 2020. Drought period shown by dashed red lines. Data Austin Water, 2022.

Temporary demand management measures were not unique to the lower region but it is the only region where temporary demand management is treated as a source of supply to offset shortage during a repeated drought of record. Most temporary demand management efforts are aimed at reducing municipal outdoor use, which can be highly responsive to temporary reduction measures (Hogue and Pincetl, 2015). For example, outdoor water restrictions in the United States during drought have been shown to reduce residential water demand by ~20-50% (Gober and Quay, 2015; Mayer et al., 2015). Temporary demand management measures in the basin (limitations on frequency, timing, and method of outdoor water use) are implemented under pre-defined drought trigger thresholds such as reservoir storage thresholds (e.g., lower region storage below 60%) and peak daily municipal demand thresholds (e.g., 120% of average daily demand) (Austin Water, 2016).

3.2.3 Other Water Management Responses and Planning Innovations

Following the drought, the lower region, which is highly reliant on reservoir storage, implemented more stringent supply reduction triggers to conserve storage more aggressively during drought. Before the drought, available interruptible (non-guaranteed) supply was gradually reduced between reservoir storage thresholds of 70% to 15% capacity, and there were no restrictions to firm customers (Region K, 2010). Following the drought, operating rules were revised so that interruptible supplies can now be fully curtailed below 45% capacity (Region K, 2020). Another major change is that lower region municipal firm customers now have drought trigger thresholds at 70% and 45% storage capacity that require corresponding use reductions of 5% and 10-20% (Region K, 2020). Under a scenario worse than the drought of record, firm customers will be subject to a minimum 20% reduction and are encouraged to use alternate supplies (e.g., groundwater) (Region K, 2020).

There were notable modelling capability improvements during and following the drought. The Lower Colorado River Authority (LCRA) who manages lower region surface water supplies added new capabilities of their medium range forecast model used to inform reservoir operations. New features include revised reservoir operating rules, modification of environmental flow requirements, and incorporation of El-Niño Southern Oscillation forecasts (Anderson and Walker, 2017). A Distributed Hydrology

Soil-Vegetation Model (DHSVM, Wigmosta et al., 1994) model is under development for the basin that can produce high-resolution naturalized flow inputs to either the official state Water Rights Analysis Package model (Wurbs, 2020) or the LCRA
615 Riverware (Zagona et al., 2001) operational model for water management modelling studies. The DHSVM model will enable historically based drought of record analysis and future climate scenarios driven by downscaled global climate model inputs.

The record drought also prompted Austin to more rigorously evaluate the long-term security of its water supply. In 2014, the Austin Water Resource Planning task force recommended that the city perform its own independent assessment of water supply for the
620 next 100 years (Austin Water, 2018). The task force recommended assessments occur on 5-year planning cycles, similar to the regional and state water planning cycles. The first long-term study for Austin was published in 2018 (Austin Water, 2018). A notable feature of the study is the incorporation of future climate uncertainty into the assessment of Austin's long-term water supply, instead of the drought of record approach used in the state regional water planning.

625 Several state laws were passed, both during and following the drought, to improve water planning and drought response. In response to numerous threats to municipal supplies during 2011, the 2012 state legislature passed TAC 357.42(d) requiring each regional planning group to collect information on existing emergency water connections. The law mandates each region to create and maintain a database of emergency supply connections and the available supply volume of each connection. Before 2016, recommended water management strategies from previous regional plans were not tracked to determine their implementation
630 status. Since 2016, the TWDB requires each region to conduct a region-wide survey to track the implementation status of all water management strategies recommended in the previous plan. More recently, HB 807 (passed in 2019) is designed to increase regional cooperation in water planning and promote ASR by requiring all regional water plans to assess ASR as a strategy (Kramer et al., 2019). While there are currently only six active ASR sites in the state, two are in the lower region of the Colorado Basin and multiple new ASR projects were proposed in the 2016 and 2021 plans for the lower and middle regions (Table 3). HB 807 also
635 requires the TWDB to create an Interregional Planning Council to improve coordination and share best practices between planning regions (Kramer et al., 2019).

3.3 Influence Diagram of Multisector Dynamics During the Drought of Record

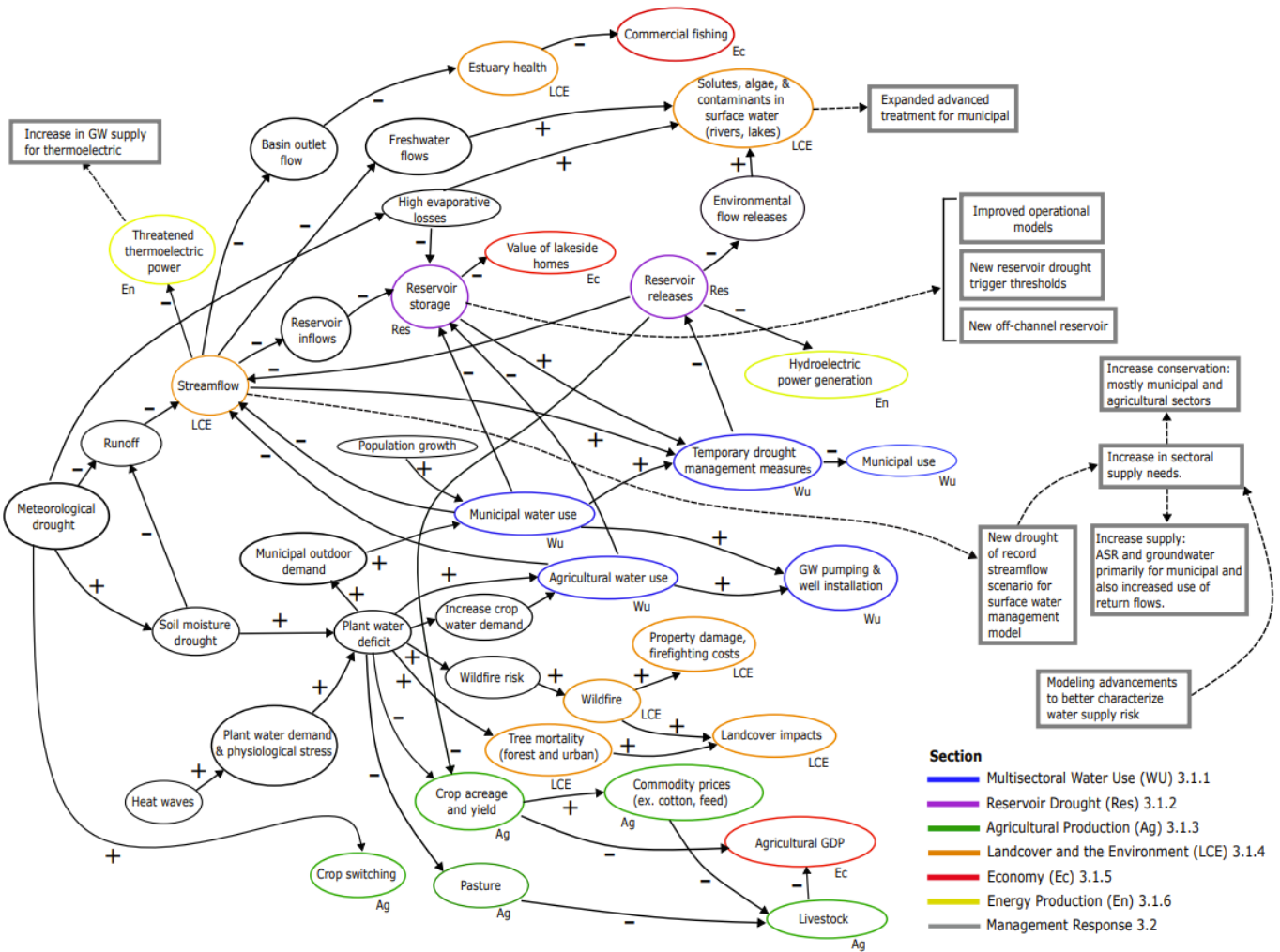
640 We developed an influence diagram to summarize the insights from our analysis presented in Sections 3.1 and 3.2 (Figure 11). The diagram shows the causal nature of cascading impacts that stem from the initial trigger of severe meteorological drought and highlights the highly multisectoral, interconnected nature of the drought impacts. The diagram is not intended to be exhaustive of all potential causal drought impacts and instead aims to capture the notable, basin-specific impacts and responses covered in this study. As a static illustration, the influence diagram does not provide information on the temporal nature (timing, frequency,
645 duration) or severity of impacts. For example, some impacts occurred months into the drought (agriculture in early 2008) while others took years to develop (estuary impacts did not occur until 2011). Some were brief but intense (wildfire), and others were prolonged (reservoir drought from 2011 to 2015). The temporal dynamics and impact severity are described in the preceding Sections 3.1 and 3.2.

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Figure 11: Influence diagram describing multisector impacts and interactions during the drought. Arrows depict influence of upstream state variables on a downstream state variable and can be interpreted as connecting causes and effects. Plus (+) and minus (-) symbols denote the effect on the downstream state variable. Colors indicate multisector impacts identified in each of the corresponding sections. Squares represent management responses following the drought. Abbreviations for sections provided (e.g.,

655 Ec = Economy) next to corresponding states. Drivers are not colored or labelled with an abbreviation, and Impacts are.

The utility of the influence diagram is that it explicitly captures the interactions and multisectoral connections that may not be easily inferred from the text. For example, from the text alone it may not be apparent that reservoir drought was a nexus of sectoral interactions and what the specific upstream causes and downstream impacts were. The nodes are coloured based on the sector that

660 was affected — sectors can be the part of the human system or the natural environment. Not all nodes represent sectoral impacts and therefore are not coloured. For example, wildfire impacts to landcover and the environment were the result of propagating (1) meteorological drought to (2) a soil moisture deficit that (3) produced a plant water deficit that (4) led to increased wildfire risk. The upstream nodes are important to the causal outcome of wildfire impacts but are not themselves sectoral impacts. Also summarized are the notable management responses that resulted from the drought. Some of the major drought impacts that

665 motivated management changes were the severe reservoir drought and the impacts to streamflow, and these responses have clear downstream adaptive responses. An important response without a clear upstream driver was modelling advancements that helped better characterize future drought impacts; these were motivated by the collective and widespread impacts to water availability for human and environmental needs.

 4. Discussion

4.1 Insight into Multisector Dynamics During the Severe Drought

Drought impacts in coupled human-natural systems are often the result of cascading natural and human factors (Aghakouchak et al., 2021; Figure 11). Some dynamics during severe drought can be expected to occur in any region such as impacts to landcover
675 due to the propagation of meteorological drought to soil moisture drought, reductions in groundwater recharge, or reductions in streamflow. However, as revealed in this study, the specific multisectoral impacts that result from drought are shaped by region-specific attributes of the human and natural system. Examples of impacts specific to the study basin are the water quality issues in the middle region resulting from groundwater solutes, curtailments of surface water irrigation supply in the lower region, or impacts to estuary health at the basin outlet. Whether drought hazards create significant harm to the human system depends on sectoral
680 exposure and the available mechanisms (engineered or institutional) to mitigate the exposure to the given drought hazard. For example, in a region with agriculture, soil moisture drought has the potential to affect agricultural production, but access to surface water or groundwater can partially or entirely offset impacts. Our analysis showed that extensive irrigation helped partially offset the agricultural impacts in the Colorado Basin, TX. However, as shown in Figure 11, management decisions for one sector can reduce or increase impacts to other sectors or even the same sector in another location. An example of cross-sector impacts in the
685 Colorado Basin was agricultural demand in the lower region hastening reservoir drought, which produced cascading impacts to municipal supply availability (triggering conservation measures) and reduced water availability for environmental flows.

A characteristic of drought impact propagation not captured in the influence diagram (Figure 11), but highly relevant to the manifestation of sectoral impacts, is that some impacts do not occur until certain state thresholds are crossed. This means that there
690 can be non-linear or stepwise responses to upstream states. Examples of this are that reservoir release curtailments did not occur until specific trigger thresholds were crossed and adverse impacts to specific stream segments or the estuary did not occur until some minimum flow condition was crossed. Other impacts occur across a gradient of upstream state conditions, such as increasing severe and prolonged meteorological drought resulting in progressively more severe soil moisture deficits or progressively more irrigation required to meet plant water demand for agriculture or municipal irrigation.

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Examples of commonly studied sectoral interactions during drought are energy-health, water-energy, energy-water, and water-food (Bluahut, 2020; de Brito, 2021; Hagenlocher et al. 2023, Yates et al., 2024). Our analysis revealed significant water-food impacts because of the harm to agricultural production (Figure 5 and 11). Due to the direct dependence of vegetation health on soil moisture, agriculture is typically one of the earliest and most affected sectors from meteorological drought (Van Loon et al., 2015).
700 While water-food interactions affected agricultural production, domestic and global trade mitigated food-health impacts within the basin. Sectoral exposure and adaptive measures limited the impact of water-energy, energy-water, and energy-health impacts. For example, the pre-adaptation of thermoelectric power plants to lower water requirement technology reduced energy-water impacts as the power sector had a low water footprint (Figure 3). The absence of significant negative water-energy interactions can be explained by the already mentioned low-water-use technology for thermoelectric power combined with hydropower being a minor
705 source of energy in the basin. The rapid growth of renewable wind and soler energy during the drought also reduced negative water-energy and energy-water interactions. This is an example of how decarbonization and energy transitions can reduce water reliance and water-supply vulnerability of the power sector (Byers et al., 2014; Zohrabian and Sanders, 2018). However, increased reliance on renewables can produce new vulnerabilities, such as periods of reduced wind speeds if a large fraction of regional

supply is sourced from wind power (Wessel et al. 2021). Also of note, there were no major human health impacts reported during
drought and heat waves – undoubtedly, a contributing factor was the absence of any significant water-energy impacts, which
enabled the use of AC during dangerous heat conditions. Finally, our analysis did not identify widespread economic impact from
the drought. Recent examples from California (Lund et al., 2018) and Australia (Van Djik et al., 2013), along with this study,
demonstrate how modern economies are largely decoupled from the agricultural sector. Tubi (2020) terms this a shift from "climate
sensitive" to "climate insensitive" economies.

4.2 Building a More Resilient and Sustainable Water Supply

Recent studies have examined the 'reservoir effect' where regions with access to large reservoir storage can be prone to increased
vulnerability to severe drought due to lack of supply diversification and lower incentivization for adaptive measures (Di Baldassarre
et al 2018, Garcia at al., 2019). The recent drought highlighted vulnerability of the lower region due to its heavy reliance on surface
water and reservoirs. The planned diversification of water supply sources following the drought shown by our analysis (Table 3)
indicates efforts to reduce reliance on reservoirs. The middle region, because of its chronically depleted reservoirs, had already
expanded its use of groundwater, including out of basin groundwater imports, and unconventional supplies (direct and indirect
reuse) before the drought.

To mitigate the reliance on reservoir storage, and more generally surface water, strategies include increasing groundwater capacity
and developing non-conventional water supply sources such as wastewater reuse, desalination, and ASR. Expanding groundwater
capacity can offer a reliable supply for users confronted with more unpredictable surface water resources (Taylor et al., 2013).
However, the location, scale, and frequency of groundwater use should be evaluated to ensure that it is sustainable and does not
adversely impact surface water baseflows (de Graaf et al., 2019). Reuse has the benefit of creating additional supply close to the
source of demand, low transmission costs, and low environmental impacts (Grant et al., 2012). Potable reuse may have less
environmental impacts and is often cheaper in the unit cost compared to desalination (Hadjikakou et al., 2019). ASR enables
storage of surface water during periods of plentiful supply for later use and has the added benefit that stored water is not lost to
evaporation. However, ASR is still a developing technology and can have high abandonment rates due to a variety of issues such
as well clogging, water quality, and insufficient recovery (Bloetscher et al., 2014). Managed aquifer recharge (MAR), which has
been employed since the 1960s and has had significant growth over the last 30 years (Dillon et al., 2019), is a lower-risk alternative
to ASR to improve groundwater sustainability.

Equally important to expanding supply is reducing demand. Demand management encompasses a wide range of actions intended
to reduce water use such as increasing efficiency, adopting or changing laws governing water use, and pricing strategies (rate-
based), and is considered an essential component of water security (Cosgrove and Loucks, 2015). Conservation is often much
cheaper than development of new alternative supplies (Cooley et al., 2019), and was found to be a major component of agricultural
and municipal supplies in the basin (Table 3).

Finally, our water supply cost analysis (Figure 9) showed that additional new supplies tends to be more costly than existing
conventional sources, particularly low-cost surface water. The increased cost of new supplies can be accommodated and justified
for municipal and industrial uses, but costs of unconventional sources may be prohibitive for agricultural use, where profit margins
are slim (Hoppe, 2014). A common adaptive response to potential shortages in high-value sectors (municipal, industrial, energy)

is to obtain supply from low-value uses, typically from agriculture (Flörke et al., 2018). This practice raises questions about its impacts on food security and regional agricultural production (Brown et al., 2019). Improved management and conservation efforts in the upper region will only slow the timeline to depletion (Scanlon et al., 2012) and large declines in irrigated acreage are anticipated by 2100 (Deines et al., 2020).

4.3 Limitations and Future Work

Limitations for our study are related to historical data availability and the depth of analysis of each sectoral impact. Much of the historical data was not available before the year 2000, preventing comparisons to impacts during previous droughts and the 1950s drought of record. Diminishing quality and availability of historical data is likely an issue in many regions, which limits the number of severe drought events that can be evaluated as multisectoral case studies. Another data limitation is the temporal and spatial resolution of publicly available data. Most of the data was only available at annual temporal and county-level spatial resolution (Table 2). This prevented analysis of sub-annual drought impact dynamics and the coarse spatial resolution prevented understanding the spatial heterogeneity of impacts, for example at the community or user level. Such limitations are discussed by Sevelli et al. (2022), who point out that many impact indicators represent average values and thus limit the understanding of impact heterogeneity.

A challenge for this type of broad analysis that spans both impacts and management responses is distilling the most salient findings into a manuscript-length text. This necessitated a high-level presentation of impacts and responses. Indeed, many of the individual sectors or impacts are often the subject of their own in-depth studies. The utility of this type of analysis is capturing the key multisector dynamics and their interactions within the study region, which can motivate focused follow-on studies looking more closely at specific sectoral interactions. Future work can involve applying a similar approach for other drought events in other regions. Building out a corpus of multisectoral drought impact analyses would improve understanding of how regional characteristics (sectors, hydrology, management, infrastructure) produce certain drought impact typologies and sectoral interactions, which would aid the development of proactive adaptation measures targeted at reducing drought vulnerability across all sectors.

5. Conclusions

We found that the drought produced a wide array of environmental impacts, significantly harmed agriculture, threatened water supplies triggering drought conservation measures, and had lasting effects on water planning and management. Water supply infrastructure (reservoirs, pipelines, canals, and wells) and temporary demand management responses were key for averting severe shortages to non-agricultural sectors. We demonstrate the use of an influence diagram as an effective tool for summarizing cascading regional multisectoral impacts and interactions. Insight into the connectivity between impacts can support adaptive planning and help reduce the vulnerability of negative cascades in other regions (Lawrence et al., 2020). Our evaluation of regional water management plans revealed that the drought substantively affected water management planning with large increases in the variety of water supply strategies (supply diversification) and planned municipal supply volume. There is no "silver bullet" water management solution for the basin like building a large new reservoir. Instead, a mosaic of supply and demand management strategies are needed to achieve long-term water security. Evidence of proactive changes to water management and planning following the drought of record includes the development of more sophisticated water supply planning models, the enactment of

more conservative drought management policies, and the passing of several new laws that regulate water planning. However, the difficult task of implementing the expensive water supply projects (over $6 billion in 2022 dollars) is largely yet to be accomplished.

Water planning faces deep uncertainty about future demand (sectors, location, quantity) and availability of supply, and it is therefore imperative that both technical and institutional management approaches evolve as better data and modelling techniques become available. We feel this study offers a "blueprint" that can be followed by future regional drought analyses. Our hope is that this work will inspire other comprehensive, multisectoral drought impact studies that improve understanding of how regional nuances in climate, hydrology, ecosystems, institutional management, water supply infrastructure, and sectoral demand lead to specific drought impacts and how these factors influence adaptive planning.

Code availability

The Python scripts for processing and plotting the data presented in the figures are available on an associated GitHub repository: https://github.com/IMMM-SFA/ferencz_et_al_2024_NHESS.

Data availability

All data presented was obtained from publicly available sources. All data presented in the text and supplemental figures are available on an associated GitHub repository: https://github.com/IMMM-SFA/ferencz_et_al_2024_NHESS.

Author contribution

SF, ST, NS, JR conceived the idea for the study. SF performed the data curation and formal analysis. SF wrote the manuscript draft. SF, NS, ST, BS, and JR reviewed and edited the manuscript.

Competing interests

The authors declare that they have no conflict of interest.

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References

AghaKouchak, A., A. Mirchi, K. Madani, G. Di Baldassarre, A. Nazemi, A. Alborzi, H. Anjileli, M. Azarderakhsh, F. Chiang, E. Hassanzadeh, L. S. Huning, I. Mallkpour, A. Martinez, O. Mazdiyasni, H. Moftakhari, H. Norouzi, M. Sadegh, D. Sadeqi, A. F. Van Loon and N. Wanders: Anthropogenic Drought: Definition, Challenges, and Opportunities, Reviews of Geophysics 59(2), 10.1029/2019RG000683, 2021.

Ahmadi, B. and Moradkhani, H.: Revisiting hydrological drought propagation and recovery considering water quantity and quality, Hydrol Process, 33, 1492-1505, 10.1002/hyp.13417, 2019.

Alley, W. M.: The Palmer Drought Severity Index - Limitations and Assumptions." Journal of Climate and Applied Meteorology **23**(7): 1100-1109, 1984.

Anderson, R., Walker, D.: Ten years of stochastic water supply modeling by Lower Colorado River Authority of Texas. J. Water Manage. Model. 26: C432. doi:10.14796/JWMM.C432, 2017.

Anderson, D.P.; Welch, J.M.; Robinson, J. Agricultural Impacts of Texas's Driest Year on Record, Choices AAEA, 27, 1–4. 2012.

Austin Water: 140 GPCD Conservation Plan, 68 pp., https://www.austintexas.gov/edims/document.cfm?id=148212, accessed 14 August 23, 2010.

Austin Water: City of Austin Drought Contingency Plan, https://www.austintexas.gov/sites/default/files/files/Water/Conservation/Planning_and_Policy/2016DroughtContingencyPlan.pdf, accessed 14 August 23, 2016.

Austin Water: Water Forward Integrated Water Resource Plan. 494 pp., https://www.austintexas.gov/department/water-forward, accessed 14 August 22, 2018.

Austin Water: Total Gallons of Water Pumped per Capita per Day, https://data.austintexas.gov/Utilities-and-City-Services/Total-Gallons-of-Water-Pumped-per-Capita-per-Day-G/cr3t-b72z, accessed 8 April 2022, 2022.

Beversdorf, L. J., Miller, T. R., and McMahon, K. D.: The Role of Nitrogen Fixation in Cyanobacterial Bloom Toxicity in a Temperate, Eutrophic Lake, Plos One, 8, ARTN e5610, 10.1371/journal.pone.0056103, 2013.

Blauhut, V.: The triple complexity of drought risk analysis and its visualisation via mapping: a review across scales and sectors, Earth-Sci. Rev., 210, 103345, 10.1016/j.earscirev.2020.103345, 2020.

Bloetscher, F.; Sham, C. H.; Danko, J. J., III; Ratick, S.: Lessons Learned from Aquifer Storage and Recovery (ASR) Systems in the United States. J. Water Resour. Prot. 2014, 06 (17), 1603, 10.4236/jwarp.2014.617146

Breyer, B., Zipper, S. C., and Qiu, J. X.: Sociohydrological Impacts of Water Conservation Under Anthropogenic Drought in Austin, TX (USA), Water Resour Res, 54, 3062-3080, 10.1002/2017wr021155, 2018.

Brodribb, T. J., Powers, J., Cochard, H., and Choat, B.: Hanging by a thread? Forests and drought, Science, 368, 261-+, 10.1126/science.aat7631, 2020.

Brown, T. C., Mahat, V., and Ramirez, J. A.: Adaptation to Future Water Shortages in the United States Caused by Population Growth and Climate Change, Earths Future, 7, 219-234, 10.1029/2018ef001091, 2019.

Bureau of Economic Analysis (BEA): Regional Data GPD and Personal Income, https://apps.bea.gov/itable/?ReqID=70&step=1&acrdn=5 , accessed 25 August 2022, 2022.

Byers, E. A., Hall, J. W., and Amezaga, J. M.: Electricity generation and cooling water use: UK pathways to 2050, Global Environ Chang, 25, 16-30, 10.1016/j.gloenvcha.2014.01.005, 2014.

Caldwell, T. J., Rossi, G. J., Henery, R. E., and Chandra, S.: Decreased streamflow impacts fish movement and energetics through reductions to invertebrate drift body size and abundance, River Res Appl, 34, 965-976, 10.1002/rra.3340, 2018.

Cayan, D. R., Das, T., Pierce, D. W., Barnett, T. P., Tyree, M., and Gershunov, A.: Future dryness in the southwest US and the hydrology of the early 21st century drought, P Natl Acad Sci USA, 107, 21271-21276, 10.1073/pnas.0912391107, 2010.

Cook, B. I., Mankin, J. S., and Anchukaitis, K. J.: Climate Change and Drought: From Past to Future, Curr Clim Change Rep, 4, 164-179, 10.1007/s40641-018-0093-2, 2018.

Cooley, H., Phurisamban, R., and Gleick, P.: The cost of alternative urban water supply and efficiency options in California, Environ Res Commun, 1, 10.1088/2515-7620/ab22ca, 2019.

Collins K., Bulut H.: 2011 Year in Review. Crop Insurance America. https://cropinsuranceinamerica.org/wp-content/uploads/2011-Year-in-Review-FINAL.pdf, 2012.

Cosgrove, W. J. and Loucks, D. P.: Water management: Current and future challenges and research directions, Water Resour Res, 51, 4823-4839, 10.1002/2014wr016869, 2015.

Countryman, A. M., Paarlberg, P. L., and Lee, J. G.: Dynamic Effects of Drought on the U.S. Beef Supply Chain, Agricultural and Resource Economics Review, 45, 459-484, 10.1017/age.2016.4, 2016.

Crouchet, S. E., Jensen, J., Schwartz, B. F., and Schwinning, S.: Tree Mortality After a Hot Drought: Distinguishing Density-Dependent and -Independent Drivers and Why It Matters, Front for Glob Chang, 2, 10.3389/ffgc.2019.00021, 2019.

875 de Brito, M. M.: Compound and cascading drought impacts do not happen by chance: A proposal to quantify their relationships, Sci. Total Environ., 778, 146236, 10.1016/j.scitotenv.2021.146236, 2021.

de Graaf, I. E. M., Gleeson, T., van Beek, L. P. H., Sutanudjaja, E. H., and Bierkens, M. F. P.: Environmental flow limits to global groundwater pumping, Nature, 574, 90-+, 10.1038/s41586-019-1594-4, 2019.

880

Deines, J. M., Schipanski, M. E., Golden, B., Zipper, S. C., Nozari, S., Rottler, C., Guerrero, B., and Sharda, V.: Transitions from irrigated to dryland agriculture in the Ogallala Aquifer: Land use suitability and regional economic impacts, Agr Water Manage, 233, ARTN 106061 10.1016/j.agwat.2020.106061, 2020.

Di Baldassarre, G., Wanders, N., AghaKouchak, A., Kuil, L., Rangecroft, S., Veldkamp, T. I. E., Garcia, M., van Oel, P. R., Breinl, K., and Van
885 Loon, A. F.: Water shortages worsened by reservoir effects, Nat Sustain, 1, 617-622, 10.1038/s41893-018-0159-0, 2018.

Dillon, P., Stuyfzand, P., Grischek, T., Lluria, M., Pyne, R. D. G., Jain, R. C., Bear, J., Schwarz, J., Wang, W., Fernandez, E., Stefan, C., Pettenati, M., van der Gun, J., Sprenger, C., Massmann, G., Scanlon, B. R., Xanke, J., Jokela, P., Zheng, Y., Rossetto, R., Shamrukh, M., Pavelic, P., Murray, E., Ross, A., Valverde, J. P. B., Nava, A. P., Ansems, N., Posavec, K., Ha, K., Martin, R., and Sapiano, M.: Sixty years of
890 global progress in managed aquifer recharge, Hydrogeol J, 27, 1-30, 10.1007/s10040-018-1841-z, 2019.

Energy Information Administration EIA: Electricity Data Browser, https://www.eia.gov/electricity/data/browser/, accessed 22 November 2022, 2022.

Fisher, M., Abate, T., Lunduka, R. W., Asnake, W., Alemayehu, Y., and Madulu, R. B.: Drought tolerant maize for farmer adaptation to drought in sub-Saharan Africa: Determinants of adoption in eastern and southern Africa, Climatic Change, 133, 283-299, 10.1007/s10584-015-
895 1459-2, 2015.

Flörke, M.C. Schneider, R.I. McDonald: Water competition between cities and agriculture driven by climate change and urban growth, Nat. Sustain., 1 (1), pp. 51-58, 10.1038/s41893-017-0006-8, 2018.

Gamez, T. E., Benton, L., and Manning, S. R.: Observations of two reservoirs during a drought in central Texas, USA: Strategies for detecting harmful algal blooms, Ecol Indic, 104, 588-593, 10.1016/j.ecolind.2019.05.022, 2019.

900 Garcia, M., Koebele, E., Deslatte, A., Ernst, K., Manago, K. F., and Treuer, G.: Towards urban water sustainability: Analyzing management transitions in Miami, Las Vegas, and Los Angeles, Global Environ Chang, 58, ARTN 101967 10.1016/j.gloenvcha.2019.101967, 2019.

Gober, P., & Quay, R.: Harnessing urban water demand: Lessons from North America. In K. C. Seto, W. D. Solecki, & C. A. Griffith (Eds.), The Routledge handbook of urbanization and global environmental change (pp. 93–105). Abingdon, UK: Routledge, 2015.

Glotter, M. and Elliott, J.: Simulating US agriculture in a modern Dust Bowl drought, Nat Plants, 3, ARTN 16193, 10.1038/nplants.2016.193,
905 2017.

Grant, S.B., Saphores, J.-D., Feldman, D.L., Hamilton, A.J., Fletcher, T.D., Cook, P.L., Stewardson, M., Sanders, B.F., Levin, L.A., Ambrose, R.F.: Taking the "waste" out of "wastewater" for human water security and ecosystem sustainability. Science 337 (6095), 681–686, 10.1126/science.1216852, 2012.

Gupta, A., Rico-Medina, A., and Cano-Delgado, A. I.: The physiology of plant responses to drought, Science, 368, 266-269,
910 10.1126/science.aaz7614, 2020.

Hadjikakou, B.D. Stanford, T. Wiedmann, H.V. Rowley, Y. Kobayashi, S. Ishii, J.P.A. Gaitan, G. Johns, S. Lundie, S.J. Khan: A flexible framework for assessing the sustainability of alternative water supply options Sci. Total Environ., 671, pp. 1257-1268, 10.1016/j.scitotenv.2019.03.288, 2019.

Hagenlocher, M., G. Naumann, I. Meza, V. Blauhut, D. Cotti, P. Döll, K. Ehlert, F. Gaupp, A. F. Van Loon, J. A. Marengo, L. Rossi, A. S. S.
915 Siemons, S. Siebert, A. T. Tsehayu, A. Toreti, D. Tsegai, C. Vera, J. Vogt and M. Wens: Tackling Growing Drought Risks-The Need for a Systemic Perspective, Earths Future 11(9), 10.1029/2023EF003857 , 2023.

Hoppe, R.A.: Structure and finances of U.S. farms: Family farm report, 2014 edition, Econ. Inform. Bull. (no. 132), Economic Research Service, U.S. Department of Agriculture, 2014.

920 Hogue, T. S. and Pincetl, S.: Are you watering your lawn?, Science, 348, 1319-1320, 10.1126/science.aaa6909, 2015.

Howard R.A., Matheson J.E. Influence diagrams, Decis Anal, 2 (3), pp. 127-143, 2005.

Jones, E. and van Vliet, M. T. H.: Drought impacts on river salinity in the southern US: Implications for water scarcity, Sci Total Environ, 644, 844-853, 10.1016/j.scitotenv.2018.06.373, 2018.

Klockow, P. A., Vogel, J. G., Edgar, C. B., and Moore, G. W.: Lagged mortality among tree species four years after an exceptional drought in
925 east Texas, Ecosphere, 9, ARTN e02455 10.1002/ecs2.2455, 2018.

Konrad, C. P., Brasher, A. M. D., and May, J. T.: Assessing streamflow characteristics as limiting factors on benthic invertebrate assemblages in streams across the western United States, Freshwater Biol, 53, 1983-1998, 10.1111/j.1365-2427.2008.02024.x, 2008.

Kramer K, Mullins C, Robbins D, Steinbach SA, Martinsson L, Hightower T, Fowler PL.: Commentary: 86th Texas State Legislature: Summaries of Water-related Legislative Action. Texas Water J, 10(1):75-100, 10.21423/twj.v10i1.7100, 2019.

930   Kuwayama, Y., Thompson, A., Bernknopf, R., Zaitchik, B., and Vail, P.: Estimating the Impact of Drought on Agriculture Using the Us Drought Monitor, Am J Agr Econ, 101, 193-210, 10.1093/ajae/aay037, 2019.

Lal, R., Delgado, J. A., Gulliford, J., Nielsen, D., Rice, C. W., and Van Pelt, R. S.: Adapting agriculture to drought and extreme events, J Soil Water Conserv, 67, 162a-166a, 10.2489/jswc.67.6.162A, 2012.

Lawrence, J., P. Blackett and N. A. Cradock-Henry: Cascading climate change impacts and implications, Climate Risk Management 29,
935   10.1016/j.crm.2020.100234, 2020.

Littell, J. S., Peterson, D. L., Riley, K. L., Liu, Y. Q., and Luce, C. H.: A review of the relationships between drought and forest fire in the United States, Global Change Biol, 22, 2353-2369, 10.1111/gcb.13275, 2016.

LCRA. Historical Water Use Summary. https://www.lcra.org/water/water-supply-planning/water-use-summary/, last access 20 December
940   2022.

Lund, J. R.: Droughts and the global economy: Lessons from California: Harvard College Review of Environment and Society: Running dry, weathering the great California drought, https://issuu.com/harvarduniversityreviewofenvironmen/docs/hcres_2016, 2016.

Lund, J., Medellin-Azuara, J., Durand, J., and Stone, K.: Lessons from California's 2012-2016 Drought, J Water Res Plan Man, 144, Artn 04018067 10.1061/(Asce)Wr.1943-5452.0000984, 2018.

945   Marston, L. and Konar, M.: Drought impacts to water footprints and virtual water transfers of the Central Valley of California, Water Resour Res, 53, 5756-5773, 10.1002/2016wr020251, 2017.

Mayer, P., Lander, P., & Glenn, D. T.: Outdoor water efficiency offers large potential savings, but research on effectiveness remains scarce. Journal of the American Water Works Association, 107(2), 61–66, 2015.

Moore, G. W., Edgar, C. B., Vogel, J. G., Washington-Allen, R. A., March, O. G., and Zehnder, R.: Tree mortality from an exceptional drought
950   spanning mesic to semiarid ecoregions, Ecol Appl, 26, 602-611, 10.1890/15-0330, 2016.

Morris B.: Lake-area homes and lake water levels. https://billmorrisrealtor.blog/2019/07/02/lake-area-homes-and-lake-water-levels/, accessed 8 August 23, 2019.

Mosley, L. M.: Drought impacts on the water quality of freshwater systems; review and integration, Earth-Sci Rev, 140, 203-214, 10.1016/j.earscirev.2014.11.010, 2015.

955   NASA: NASA DEVELOP Analyzes Drought Impacts on Urban Tree Recovery in Texas, https://www.drought.gov/news/nasa-develop-analyzes-drought-impacts-urban-tree-recovery-texas. last access 14 August 2023, 2019.

Naumann, G., Cammalleri, C., Mentaschi, L., and Feyen, L.: Increased economic drought impacts in Europe with anthropogenic warming, Nat Clim Change, 11, 485-+, 10.1038/s41558-021-01044-3, 2021.

Nielson-Gammon, J. W.: The 2011 Texas Drought, The Texas Water Journal, 3, 59-95, https://doi.org/10.21423/twj.v3i1.6463., 2012.

960   National Oceanic and Atmospheric Administration (NOAA): Storm Events Database, https://www.ncdc.noaa.gov/stormevents, 15 May 2022, 2022.

O'Connell, Voisin, N., Macknick, and Fu: Sensitivity of Western US power system dynamics to droughts compounded with fuel price variability, Appl Energ, 247, 745-754, 10.1016/j.apenergy.2019.01.156, 2019.

Palmer, W.: Meteorological Drought. Technical Report, Weather Bureau Research Paper 45 (US Department of Commerce), 1965.
965

Region F, 2010. 2011 Region F Water Plan, 501 pp., 2010. https://www.twdb.texas.gov/waterplanning/rwp/regions/f/index.asp

Region F, 2015. 2016 Region F Water Plan, 607 pp., 2015. https://www.twdb.texas.gov/waterplanning/rwp/regions/f/index.asp

Region F, 2020. 2021 Region F Water Plan, 450 pp., 2020. https://www.twdb.texas.gov/waterplanning/rwp/regions/f/index.asp

Region K, 2010. 2011 Region K Water Plan, 1341 pp., 2010. https://www.twdb.texas.gov/waterplanning/rwp/regions/k/index.asp

970   Region K, 2015. 2016 Region K Water Plan, 2018 pp., 2015. https://www.twdb.texas.gov/waterplanning/rwp/regions/k/index.asp

Region K, 2020. 2021 Region F Water Plan, 1425 pp., 2020. https://www.twdb.texas.gov/waterplanning/rwp/regions/k/index.asp

Region O, 2010. Llano Estacado Regional Water Planning Area Regional Water Plan, 916 pp., 2010. https://www.twdb.texas.gov/waterplanning/rwp/regions/o/index.asp

Region O, 2015. Llano Estacado (Region O) 2016 Regional Water Water Plan, 10535 pp., 2015.
975 https://www.twdb.texas.gov/waterplanning/rwp/regions/o/index.asp

Region O, 2020. 2021 Llano Estacado Regional Water Plan, 1051 pp., 2020. https://www.twdb.texas.gov/waterplanning/rwp/regions/o/index.asp

Sarhadi, A., Ausin, M. C., Wiper, M. P., Touma, D., and Diffenbaugh, N. S.: Multidimensional risk in a nonstationary climate: Joint probability of increasingly severe warm and dry conditions, Sci Adv, 4, ARTN eaau3487 10.1126/sciadv.aau3487, 2018.

980 Savelli, E., M. Rusca, H. Cloke and G. Di Baldassarre: Drought and society: Scientific progress, blind spots, and future prospects, Wiley Interdisciplinary Reviews-Climate Change 13(3), 10.1002/wcc.761, 2022.

Scanlon, B. R., Faunt, C. C., Longuevergne, L., Reedy, R. C., Alley, W. M., McGuire, V. L., and McMahon, P. B.: Groundwater depletion and sustainability of irrigation in the US High Plains and Central Valley, P Natl Acad Sci USA, 109, 9320-9325, 10.1073/pnas.1200311109, 2012.

985 Scanlon, B. R., Duncan, I., and Reedy, R. C.: Drought and the water-energy nexus in Texas, Environ Res Lett, 8, Artn 045033 10.1088/1748-9326/8/4/045033, 2013a.

Scanlon, B. R., Reedy, R. C., Duncan, I., Mullican, W. F., and Young, M.: Controls on Water Use for Thermoelectric Generation: Case Study Texas, US, Environ Sci Technol, 47, 11326-11334, 10.1021/es4029183, 2013b.

Schewe, J., Heinke, J., Gerten, D., Haddeland, I., Arnell, N. W., Clark, D. B., Dankers, R., Eisner, S., Fekete, B. M., Colon-Gonzalez, F. J.,
990 Gosling, S. N., Kim, H., Liu, X. C., Masaki, Y., Portmann, F. T., Satoh, Y., Stacke, T., Tang, Q. H., Wada, Y., Wisser, D., Albrecht, T., Frieler, K., Piontek, F., Warszawski, L., and Kabat, P.: Multimodel assessment of water scarcity under climate change, P Natl Acad Sci USA, 111, 3245-3250, 10.1073/pnas.1222460110, 2014.

Schwantes, A. M., Swenson, J. J., Gonzalez-Roglich, M., Johnson, D. M., Domec, J. C., and Jackson, R. B.: Measuring canopy loss and climatic thresholds from an extreme drought along a fivefold precipitation gradient across Texas, Global Change Biol, 23, 5120-5135,
995 10.1111/gcb.13775, 2017.

Shachter, R. D.: Evaluating Influence Diagrams, Oper Res, 34, 871-882, 10.1287/opre.34.6.871, 1986.

Smith, B.A.: Drought Trigger Methodology for the Barton Springs Aquifer, Travis and Hays Counties, Texas, Barton Springs/Edwards Aquifer Conservation District, https://bseacd.org/2014/07/drought-trigger-methodology-for-the-barton-springs-aquifer-travis-and-hays/, 2013

Smith, B. A., Hunt, B. B., Andrews, A. G., Watson, J. A., Gary, M. O., Wierman, D. A., and Broun, A. S.: Surface water-groundwater
1000 interactions along the Blanco River of central Texas, USA, Environ Earth Sci, 74, 7633-7642, 10.1007/s12665-015-4630-1, 2015.

Stahl, K., Kohn, I., Blauhut, V., Urquijo, J., De Stefano, L., Acacio, V., Dias, S., Stagge, J. H., Tallaksen, L. M., Kampragou, E., Van Loon, A. F., Barker, L. J., Melsen, L. A., Bifulco, C., Musolino, D., de Carli, A., Massarutto, A., Assimacopoulos, D., and Van Lanen, H. A. J.: Impacts of European drought events: insights from an international database of text-based reports, Nat Hazard Earth Sys, 16, 801-819, 10.5194/nhess-16-801-2016, 2016.

1005 Stocker, B. D., Zscheischler, J., Keenan, T. F., Prentice, I. C., Seneviratne, S. I., and Penuelas, J.: Drought impacts on terrestrial primary production underestimated by satellite monitoring, Nat Geosci, 12, 264-+, 10.1038/s41561-019-0318-6, 2019.

Taylor, R. G., Scanlon, B., Doll, P., Rodell, M., van Beek, R., Wada, Y., Longuevergne, L., Leblanc, M., Famiglietti, J. S., Edmunds, M., Konikow, L., Green, T. R., Chen, J. Y., Taniguchi, M., Bierkens, M. F. P., MacDonald, A., Fan, Y., Maxwell, R. M., Yechieli, Y., Gurdak, J. J., Allen, D. M., Shamsudduha, M., Hiscock, K., Yeh, P. J. F., Holman, I., and Treidel, H.: Ground water and climate change, Nat Clim
1010 Change, 3, 322-329, 10.1038/Nclimate1744, 2013.

Texas A&M Forest Service, 2011 Texas Wildfires Common Denominators of Home Destruction, 52 pp., https://wildfiretoday.com/documents/Texas%20Wildfires%20report%202011.pdf, 2011.

Texas Commission on Environmental Quality (TCEQ): Surface Water Quality Web Reporting Tool, https://www80.tceq.texas.gov/SwqmisPublic/index.htm, accessed 31 May 2023, 2023.

1015 Texas Standard. Looking Back On 10 Years Since Bastrop Fire, And What Central Texas Is Doing to Mitigate Future Disasters. https://www.texasstandard.org/stories/looking-back-on-10-years-since-bastrop-fire-and-what-central-texas-is-doing-to-mitigate-future-disasters/, 2021. last access: 14 August 2023.

Texas Water Development Board: Studies to Evaluate Achievement of Freshwater Inflow Standards and Ecological Response Final Report, 2015.

1020   Texas Water Development Board: 2017 State Water Plan. 150 pp., 2017. https://www.twdb.texas.gov/waterplanning/swp/2017/index.asp

Texas Water Development Board: 2022 State Water Plan. 202 pp., 2022a. https://www.twdb.texas.gov/waterplanning/swp/2022/index.asp

Texas Water Development Board TWDB. Drought in Texas: A Comparison of the 1950–1957 and 2010–2015 Droughts. 101 pp., https://www.twdb.texas.gov/publications/reports/other_reports/, 2022b.

1025   Texas Water Development Board: Texas Reservoirs: Monitored Water Supply Reservoirs, https://waterdatafortexas.org/reservoirs/statewide, accessed 21 November, 2022c.

Texas Water Development Board: County Well Reports, https://www3.twdb.texas.gov/apps/reports/SDR/WellRpts_County_Use, accessed 2 August 2022, 2022d.

Texas Water Development Board: GIS Data, https://www.twdb.texas.gov/mapping/gisdata.asp, accessed 27 April 2023, 2023a.

1030   Texas Water Development Board: Historical Water Use Estimates, https://www.twdb.texas.gov/waterplanning/waterusesurvey/estimates/index.asp, accessed 27 April 2023, 2023b.

Trenberth, K. E., Dai, A. G., van der Schrier, G., Jones, P. D., Barichivich, J., Briffa, K. R., and Sheffield, J.: Global warming and changes in drought, Nat Clim Change, 4, 17-22, 10.1038/Nclimate2067, 2014.

Tubi, A.: Recurring droughts or social shifts? Exploring drivers of large-scale transformations in a transformed country, Global Environ Chang, 65, ARTN 102157 10.1016/j.gloenvcha.2020.102157, 2020.

1035   Turner, S. W. D., Nelson, K., Voisin, N., Tidwell, V., Miara, A., Dyreson, A., Cohen, S., Mantena, D., Jin, J. L., Warnken, P., and Kao, S. C.: A multi-reservoir model for projecting drought impacts on thermoelectric disruption risk across the Texas power grid, Energy, 231, ARTN 120892 10.1016/j.energy.2021.120892, 2021.

U.S. Bureau of Labor Statistics. The Impact of Soaring Cotton Prices on Consumer Apparel Prices, vol 2, num 5, 1-8 pp., 2011.

United States Census Bureau: Explore Census Data, https://www.census.gov/data.html, accessed 27 October 2022, 2022.

1040   United States Department of Agriculture: National Agricultural Statistics Service Quick Stats, https://quickstats.nass.usda.gov/, accessed October 2022.

United States (US) Drought Monitor: Drought Severity and Coverage Index, https://droughtmonitor.unl.edu/DmData/DataDownload/DSCI.aspx, accessed 25 May 2023, 2023

United States Geological Survey: USGS Current Water Data for the Nation, https://waterdata.usgs.gov/nwis/rt, accessed 1 February 2023, 1045   2023.

van Dijk, A. I. J. M., Beck, H. E., Crosbie, R. S., de Jeu, R. A. M., Liu, Y. Y., Podger, G. M., Timbal, B., and Viney, N. R.: The Millennium Drought in southeast Australia (2001-2009): Natural and human causes and implications for water resources, ecosystems, economy, and society, Water Resour Res, 49, 1040-1057, 10.1002/wrcr.20123, 2013.

Van Loon, A. F.: Hydrological drought explained, Wires Water, 2, 359-392, 10.1002/wat2.1085, 2015.

1050   Van Loon, A. F., Gleeson, T., Clark, J., Van Dijk, A. I. J. M., Stahl, K., Hannaford, J., Di Baldassarre, G., Teuling, A. J., Tallaksen, L. M., Uijlenhoet, R., Hannah, D. M., Sheffield, J., Svoboda, M., Verbeiren, B., Wagener, T., Rangecroft, S., Wanders, N., and Van Lanen, H. A. J.: Drought in the Anthropocene, Nat Geosci, 9, 89-91, 10.1038/ngeo2646, 2016.

van Vliet, M. T. H., Sheffield, J., Wiberg, D., and Wood, E. F.: Impacts of recent drought and warm years on water resources and electricity supply worldwide, Environ Res Lett, 11, Artn 124021 10.1088/1748-9326/11/12/124021, 2016.

1055   Voisin, N., Dyreson, A., Fu, T., O'Connell, M., Turner, S. W. D., Zhou, T., and Macknick, J.: Impact of climate change on water availability and its propagation through the Western US power grid, Appl Energ, 276, ARTN 11546710.1016/j.apenergy.2020.115467, 2020.

Wessel, J., Kern, J. D., Voisin, N., Oikonomou, K., and Haas, J.: Technology Pathways Could Help Drive the US West Coast Grid's Exposure to Hydrometeorological Uncertainty, Earths Future, 10, ARTN e2021EF002187 10.1029/2021EF002187, 2022.

Wigmosta MS, Vail LW, Lettenmaier DP: A distributed hydrology-vegetation model for complex terrain. Water Resources Research 30: 1665– 1060   1697, 10.1029/94WR00436, 1994.

Wilhite, D. A., Svoboda, M. D., and Hayes, M. J.: Understanding the complex impacts of drought: A key to enhancing drought mitigation and preparedness, Water Resour Manag, 21, 763-774, 10.1007/s11269-006-9076-5, 2007.

Wineland, S. M., Basagaoglu, H., Fleming, J., Friedman, J., Garza-Diaz, L., Kellogg, W., Koch, J., Lane, B. A., Mirchi, A., Nava, L. F., Neeson, T. M., Ortiz-Partida, J. P., Paladino, S., Plassin, S., Gomez-Quiroga, G., Saiz-Rodriguez, R., Sandoval-Solis, S., Wagner, K., Weber, N., Winterle, J., and Wootten, A. M.: The environmental flows implementation challenge: Insights and recommendations across water-limited systems, Wires Water, 9, ARTN e1565 10.1002/wat2.1565, 2022.

Wurbs, R. A.: Sustainable Statewide Water Resources Management in Texas, J Water Res Plan Man, 141, 10.1061/(ASCE)WR.1943-5452.0000499, 2015.

Wurbs, R. A.: Institutional Framework for Modeling Water Availability and Allocation, Water-Sui, 12, ARTN 2767 10.3390/w12102767, 2020.

Wurbs, R.A.: Storage and Regulation of River Flows by Dams and Reservoirs, The Texas Water Journal, 12, 10-39, 10.21423/twj.v12i1.7106, 2021.

Xu, C. G., McDowell, N. G., Fisher, R. A., Wei, L., Sevanto, S., Christoffersen, B. O., Weng, E. S., and Middleton, R. S.: Increasing impacts of extreme droughts on vegetation productivity under climate change, Nat Clim Change, 9, 948-+, 10.1038/s41558-019-0630-6, 2019.

Yates, D., J. K. Szinai and A. D. Jones: Modeling the Water Systems of the Western US to Support Climate-Resilient Electricity System Planning, Earths Future 12(1), 10.1029/2022EF003220, 2024.

Zagona EA, Fulp TJ, Shane R, Magee T, Goranflo HM: Riverware: a generalized tool for complex reservoir system modelling, J Am Water Resour Assoc 37:913–929, 2001.

Zohrabian, A. and Sanders, K. T.: Assessing the impact of drought on the emissions- and water-intensity of California's transitioning power sector, Energ Policy, 123, 461-470, 10.1016/j.enpol.2018.09.014, 2018.