

Environmental Research Letters



LETTER

Domestic well vulnerability to drought duration and unsustainable groundwater management in California's Central Valley

OPEN ACCESS

RECEIVED

26 September 2019

REVISED

21 January 2020

ACCEPTED FOR PUBLICATION

23 January 2020

PUBLISHED

18 March 2020

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Millions of Californians access drinking water via domestic wells, which are vulnerable to drought and unsustainable groundwater management. Groundwater overdraft and the possibility of longer drought duration under climate change threatens domestic well reliability, yet we lack tools to assess the impact of such events. Here, we leverage 943 469 well completion reports and 20 years of groundwater elevation data to develop a spatially-explicit domestic well failure model covering California's Central Valley. Our model successfully reproduces the spatial distribution of observed domestic well failures during the severe 2012–2016 drought ($n = 2027$). Next, the impact of longer drought duration (5–8 years) on domestic well failure is evaluated, indicating that if the 2012–2016 drought would have continued into a 6 to 8 year long drought, a total of 4037–5460 to 6538–8056 wells would fail. The same drought duration scenarios with an intervening wet winter in 2017 lead to an average of 498 and 738 fewer well failures. Additionally, we map vulnerable wells at high failure risk and find that they align with clusters of predicted well failures. Lastly, we evaluate how the timing and implementation of different projected groundwater management regimes impact groundwater levels and thus domestic well failure. When historic overdraft persists until 2040, domestic well failures range from 5966 to 10 466 (depending on the historic period considered). When sustainability is achieved progressively between 2020 and 2040, well failures range from 3677 to 6943, and from 1516 to 2513 when groundwater is not allowed to decline after 2020.

1. Introduction

Presently, more than 13 million households rely on private domestic wells for drinking water in the United States [1]. In the State of California alone, around 1.5 million residents rely on domestic wells for drinking water, around one third of which live in the Central Valley (CV) [2]. Domestic wells in the CV are greater in number than agricultural or public supply wells, yet tend to be more shallow and have much smaller pumping capacities (e.g. $0.25\text{--}1.0\text{ m}^3\text{ h}^{-1}$ compared to $100.0\text{--}900.0\text{ m}^3\text{ h}^{-1}$ [3]). Well completion report (WCR) data [4] suggest that between 1900 and 2018 in the CV, 96 299 domestic wells with an interquartile

(IQR) depth range of 36.6–75.6 m were drilled, compared to 43 861 agricultural wells (IQR: 57.9–152.0 m) and 3649 public supply wells (IQR: 76.2–159.0 m). Hence, a large number of shallow domestic wells in the CV are vulnerable to both lowering of the groundwater table [5–9] and contamination by pollutants such as total dissolved solids [10, 11], nitrates [12–14], arsenic [15, 16], uranium [17, 18], and hexavalent chromium [19, 20], among others.

Past droughts in California have encouraged both additional well drilling and groundwater pumping to supplement dwindling surface water supplies [21, 22]. During the 2012–2016 drought, 2027 private domestic drinking water wells were reported dry in California's

CV [23]; because reporting was voluntary, actual well failure counts are possibly greater. To date, limited long-term data and solutions exist to address the vulnerability of rural community drinking water supply wells to severe droughts [24, 25].

The paucity of well failure research, particularly in California, is partially due to privately-held records on well location and construction. In 2017, the public release of over one hundred years of digitized domestic WCR enabled the first spatial distribution and count estimates of domestic wells in California [26, 27]. The California Online State Well Completion Report Database [4] and similar well construction databases across the US have allowed near-continental scale estimation of failing wells [28] and well depths [9]. A recent study in the Tulare County, California (around 5000 km²) estimated domestic well supply interruptions from groundwater level decline during the 2012–2016 drought, and the associated costs of maintaining domestic water well supplies [29]. However, to our knowledge, no studies have developed models at the regional aquifer scale (around 50 000 km² or greater) that simulate the impact of drought and sustainable groundwater management regimes on domestic well failure. Such a model can help evaluate the consequences of future droughts and statewide groundwater management options.

Groundwater overdraft in California is part of a larger global trend in aquifer depletion [30–33]. Like many other semi-arid, agriculturally intensive regions worldwide, in the decades to come, California will grapple with the impacts of climate change and policy on its overdrafted aquifers. By the end of the 21st century, California's snowpack is projected to decline by as much as 79.3% [34], and drought frequency in the southern CV may increase by upwards of 100% [35]. It is in this increasingly drier and warmer climate [36, 37] characterized by more frequent, more spatially extensive heat waves and extended droughts [38, 39], that California will implement a statewide policy of sustainable groundwater management [40]. These policies aim to prevent chronic groundwater overdraft and other undesirable results, including domestic well failure. However, we lack both methodological approaches to forecasting well failure, and a basic understanding of how climate change (i.e. drought) and policy (i.e. groundwater management regimes) will impact well failure.

In this paper, we present a regional aquifer scale model covering California's CV that predicts domestic well failure in response to groundwater level decline from extended drought and different groundwater management regimes. The model was developed using reported domestic well failures from the severe 2012–2016 California drought. The goal of this study is to evaluate the risk of domestic well failure in response to (1) extended (5–8 year) drought duration scenarios and (2) three different groundwater management regimes (sustainability, glide path, business as usual) in California's CV.

2. Study area

The domestic well failure model was developed for the California CV alluvial groundwater basin (figure 1). We chose this area for its geologic continuity, data availability, social and economic significance, and high rates of domestic well failure reported during the recent 2012–2016 drought. The study area was further pared down to only include areas with domestic wells completed on or after 1976 (SI appendix, section S1 is available online at stacks.iop.org/ERL/15/044010/mmedia).

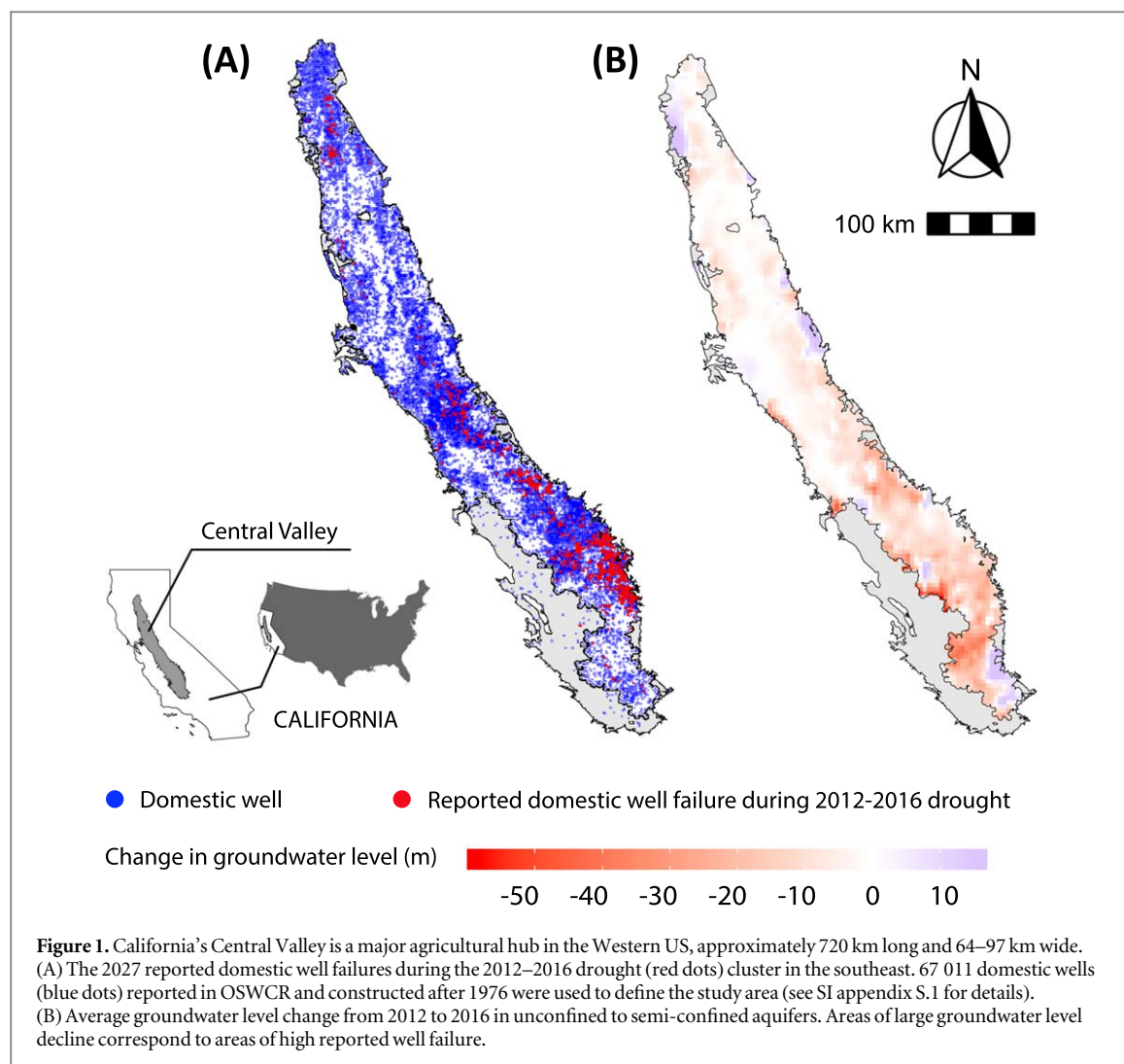
The CV is heavily dependent on winter snowpack and groundwater for agriculture [41, 42, 21]. In an average year, groundwater provides about 30% of the water demand, but in drought years, groundwater can account for upwards of 60% of water consumed in some parts of the CV [43]. Nearly all of this water is consumed by agriculture [42, 43]. It is well established that scarce surface water supply during drought encourages groundwater pumping [44, 25, 45]. The United States Geologic Survey estimated that during periods of drought, groundwater pumping in the CV increased upwards of 180% compared to the long-term mean (1962–2003) [42]. Estimated annual baseline groundwater depletion in the San Joaquin Valley (southern CV) is 2.3 km³ yr⁻¹, but during drought, the groundwater depletion rate may be up to 5 times greater [46]. Modeled CV groundwater depletion during the 1976–1977, 1987–1992, 2012–2016 droughts is estimated at 24.6 km³, 49.3 km³, and 40.0 ± 0.8 km³ respectively [41, 47]. Thus, four- and five-year long historical droughts in California's CV have led to groundwater storage losses roughly equivalent to the combined storage capacity of California's surface water reservoirs (51.8 km³) [21].

Groundwater storage change leads to groundwater level change. Data from 506 monitoring wells in the Tulare Lake hydrologic region indicate that between fall 2011 and fall 2017, around 90% of wells experienced a decline in groundwater level, and 58.9% of wells experienced more than 7.5 m of groundwater level decline [48].

3. Materials and Methods

3.1. Data

The study used WCR from 943 469 wells from the California Department of Water Resources (<https://data.ca.gov/dataset/well-completion-reports>) [4]. Further, the study used seasonal groundwater level measurements [49] spanning the period 1998–2017 and well failures reported during the 2012–2016 drought. The well failure dataset was obtained via an agreement with the California Department of Water Resources and the California Governor's Office of Planning and Research [23]. A limitation of the reported well failure data is that data was neither collected nor verified consistently by counties, and reporting was voluntary (and usually happens only



when a well owner could not self-solve their issues). Hence, the reported data under-counts the domestic wells impacted during the drought. All data are accessible online [50], with the exception of observed well failure data, which are confidential and may be obtained by contacting the California Department of Water Resources. Further information on data sources is provided in SI appendix, section S2.1.

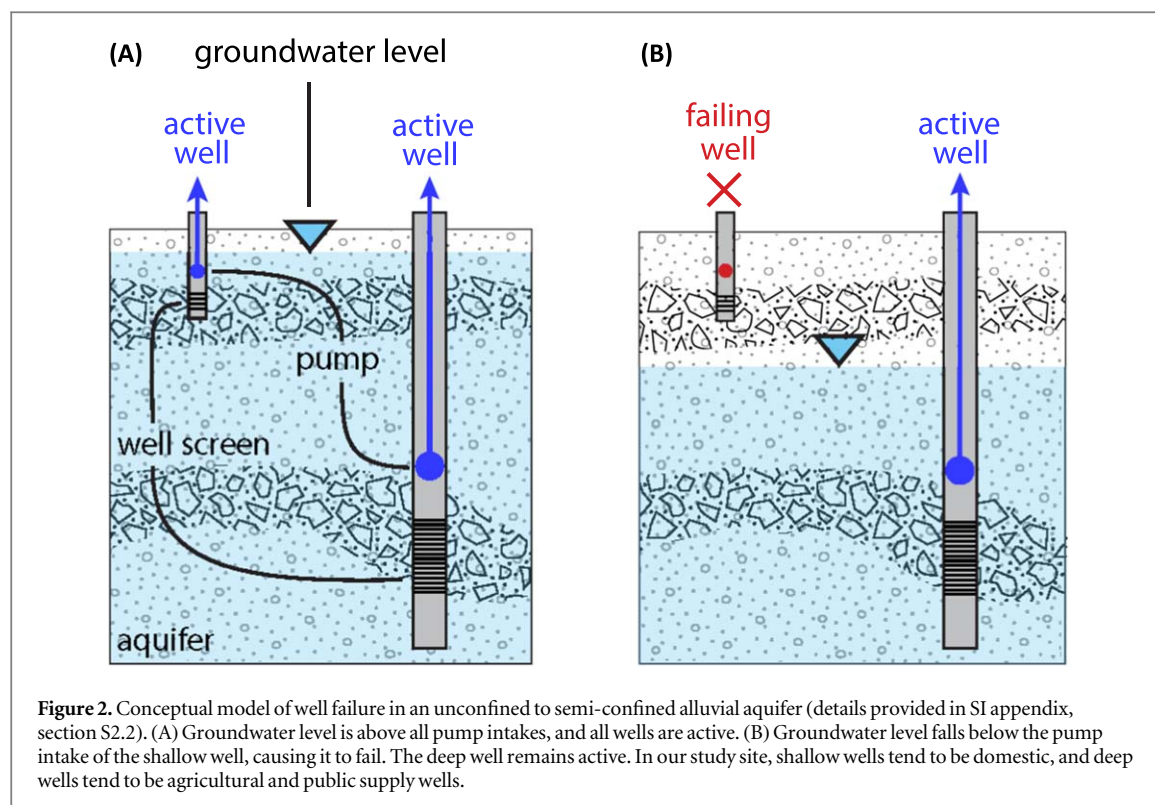
3.2. Classification of failing and vulnerable wells

We distinguish between three classes of well status: *active*, *failing*, and *vulnerable*. A well is classified as *active* when the groundwater level at the location of the well is above the level of the pump intake. If the groundwater level falls at or below the pump intake, the well is classified as *failing* (figure 2). The well failure data collected during the 2012–2016 drought did not distinguish between failing wells and wells experiencing a decrease in pump efficiency, thus for the model calibration, wells are considered as either failing or active. Further detail is provided in SI appendix S2.2.

Wells are classified as *vulnerable* to well failure when the groundwater level in a well falls within 3 m of the pump intake. As the distance between a well's pump intake and the groundwater level decreases, the fluid pressure (i.e. the net positive suction head) declines, causing cavitation, which may physically damage the pump and decrease its efficiency [51, 52]. In this study, we estimate the minimum separation distance required to avoid decreases in well function as 3 m (see SI appendix S2.3).

3.3. Groundwater level interpolation

Seasonal (spring and fall) groundwater level data for each year between 1998 and 2017 [49] were used to determine groundwater level changes in the unconfined to semi-confined shallow aquifer, which domestic wells draw from. For each set of seasonal groundwater levels, we applied ordinary kriging to the log-transformed groundwater levels to normalize the data distribution, suppress outliers, and improve data stationarity [53, 54]. Because the expected value of back-transformed log-normal kriging estimates is



biased (i.e. not equal to the sample mean), we applied the correction of Laurent [55, 56] to recover unbiased groundwater level estimates (SI appendix, section S2.4). We further calculated the 5% and 95% confidence intervals of the kriging estimates to propagate kriging uncertainty through the model and into the well failure estimates.

3.4. Pump intake depth estimation

Pump intake depth is not explicitly recorded on WCRs, thus for each well, it was estimated as the mean of the static water level at the time of well completion, and the top of the screened interval (SI appendix, section S2.6). When pump depth could not be directly calculated (i.e. —a WCRs is missing static water level or the top of the screened interval information), we imputed pump depths with simple linear models to regress known pump depths onto the bottom of the screened interval, which is known for nearly all wells (SI appendix, figure S4). Pump depth exhibits spatial variance due to geologic heterogeneity and historical groundwater level, hence imputation was conducted at the Bulletin 118 subbasin level (SI appendix, figure S3) to ensure hydrogeologic similarity. As with the kriging estimates, we calculated the 5% and 95% confidence intervals of the estimated pump locations to propagate this uncertainty into the well failure estimates.

3.5. Model calibration based on 2012–2016 drought data

The well failure model was calibrated with observed 2012–2016 well failures by relating groundwater level changes to estimated pump intake locations of wells in

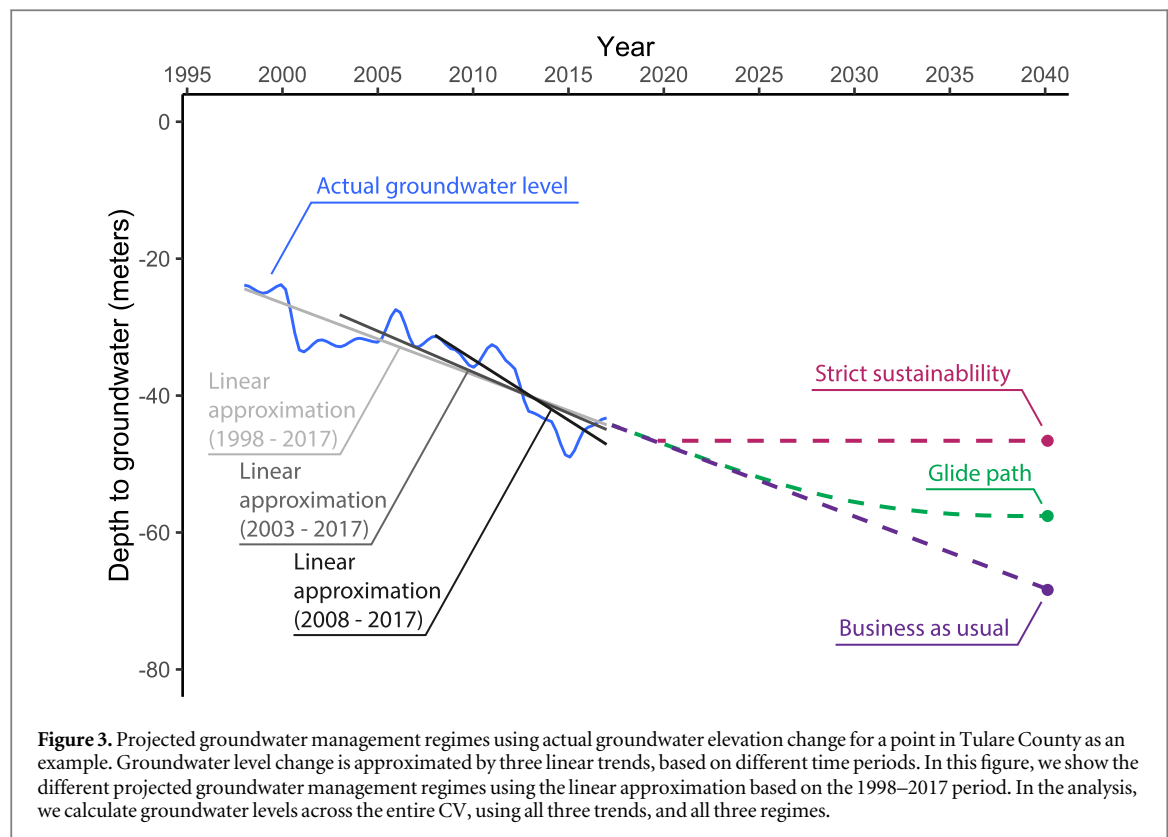
OSWCR, and minimizing error between the observed and predicted well failures during the 2012–2016 drought (SI appendix, section S2.7). Well failures tend to form clusters, thus we calculated Gaussian kernel density estimates for the observed and predicted point patterns and calculated residual error as their difference. We use a kernel bandwidth of 433 m, calculated as $0.15/\sqrt{5 \cdot \lambda}$ where λ is the point intensity—the number of observations divided by the study site area [57]. Calibration results are depicted at the Public Land Survey System [58] township resolution (roughly 10 km) to improve mapping.

3.6. Simulation of drought duration scenarios

Climate change may cause severe and extended droughts exceeding 4 years in duration, yet the impact of such drought durations on domestic well failure remains unknown. Thus, we simulate drought durations of 5–8 years in length by extending the observed 2012–2016 drought with an additional 1–4 years using two scenarios:

- (i) *Continuous drought*: 1–4 years of drought immediately following the 2012–2016 drought.
- (ii) *Intervening wet winter*: identical to the continuous drought scenario, but groundwater levels are allowed to recover after 4 years, due to one intervening wet winter.

Groundwater level change in each drought duration scenario was determined by assuming that the impact of future droughts is proportional to the historical 2012–2016 drought. In other words, the



groundwater level change associated with 1–4 additional years of drought is computed by scaling the change in the groundwater level field observed during the 2012–2016 drought by 0.25, 0.50, 0.75, and 1 respectively.

In the ‘continuous drought’ scenario, groundwater levels are already low from the 2012–2016 drought, and increased well failure is expected. Hence, the ‘intervening wet winter’ scenario examines how much a wet winter event, such as the one observed in 2017, may buffer against well failure over a longer drought duration.

3.7. Projected groundwater management regimes

In California, the Sustainable Groundwater Management Act (SGMA) enacted in 2014, requires the development and implementation of local groundwater management plans by 2020. These plans aim to prevent undesirable results, including the chronic lowering of groundwater levels, to achieve groundwater sustainability by 2040 for critically overdrafted basins. Overlying landowners of overdrafted basins may deploy different groundwater management regimes, which will impact groundwater level change in the coming decades to various degrees.

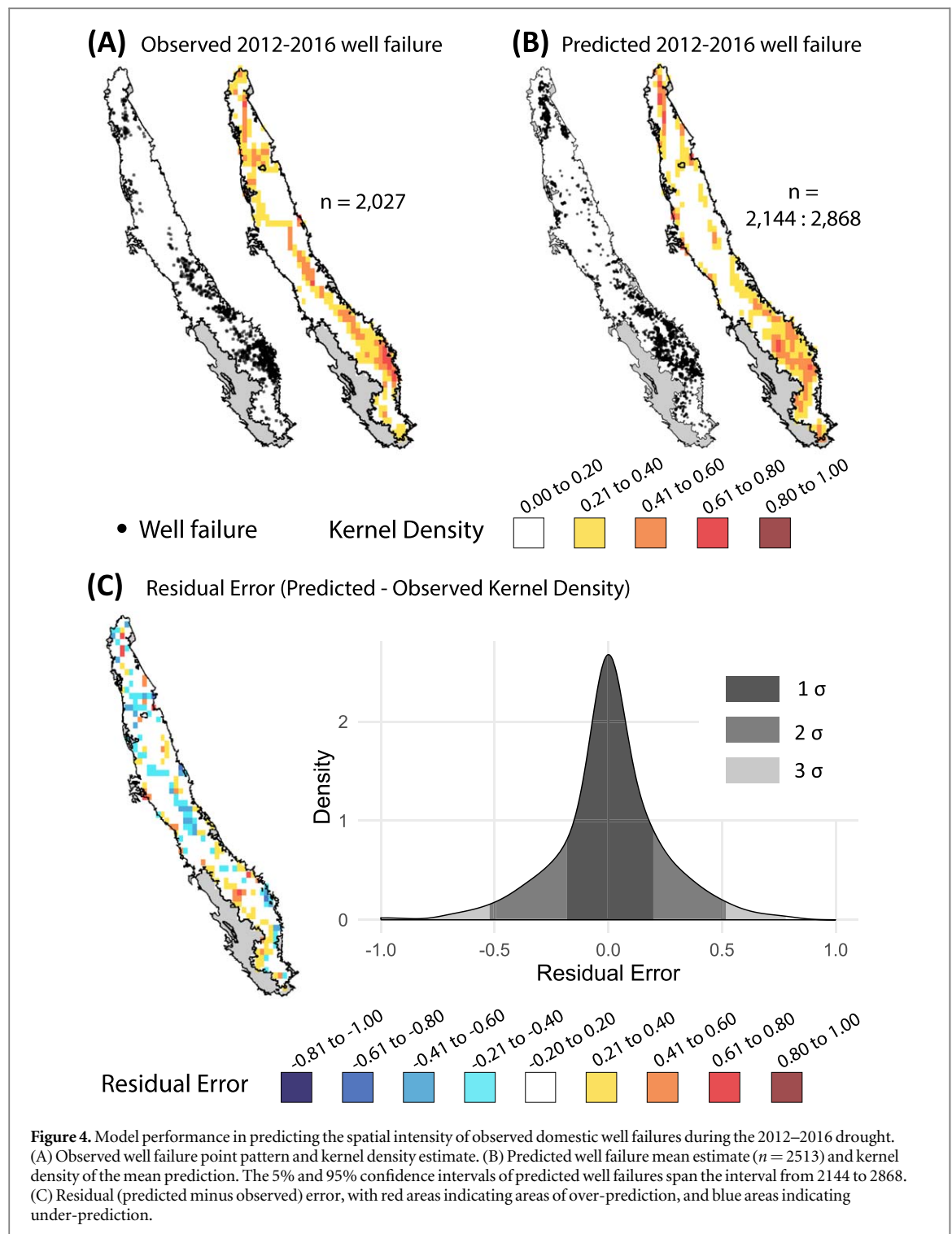
To analyze how different groundwater management regimes might impact groundwater level change and hence domestic well failure, we simulate three simplified regimes for the period 2017–2040 (figure 3):

- (i) *Strict sustainability*: water levels do not decline after 2020. This represents a theoretical (and

idealized) best case management regime for domestic wells.

- (ii) *Glide path*: groundwater level decline is gradually reduced over the implementation period until 2040.
- (iii) *Business as usual*: groundwater level decline continues at the historic rate. This regime is used for comparison.

To project the number of failing wells for each groundwater management regime, we extend past groundwater level trends through 2040. For this, we first determined past groundwater level trends using data for the period from 1998 to 2017 and estimated annual groundwater levels at each point of the CV via ordinary kriging as discussed above and in SI appendix, section S2.4. To estimate declining groundwater level trends consistently over time, we only use fall measurements following the growing season. We then obtain linear approximations of groundwater level for each cell using a $5 \times 5 \text{ km}^2$ raster. We use three different approximations of groundwater level based on changes observed from 1998–2017, 2003–2017, and 2008–2017 to account for differences in initial groundwater level and thus, uncertainty introduced by the period over which the linear models are built. Finally, to project the ‘Strict sustainability’ regime we extend these three approximations into 2020, then eliminate further overdraft. In contrast, the ‘Business as usual’ regime projects the linear trends into 2040 before ending overdraft, and the ‘Glide path’



regime gradually reduces the slope of the linear trend between 2020 and 2040, representing a middle path between the ‘Strict sustainability’ and the ‘Business as usual’ regimes.

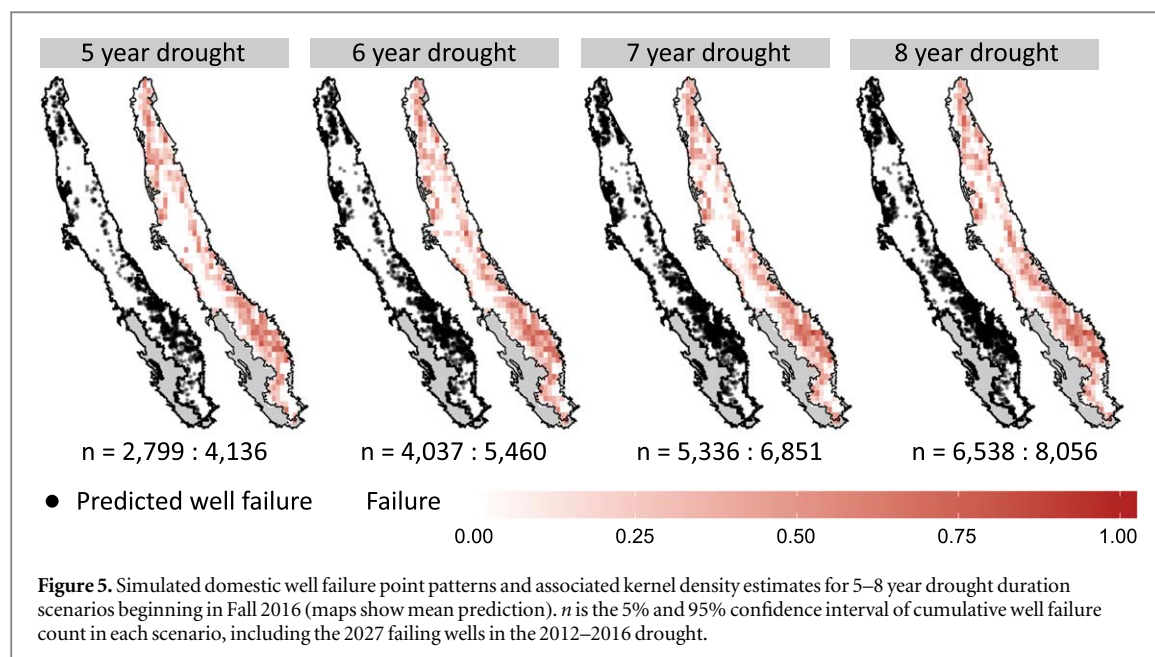
4. Results

4.1. Well failure prediction during the 2012–2016 drought

The calibrated model reproduced both the magnitude and spatial distribution of the 2027 well failures

observed in the study area during the 2012–2016 drought (figure 4(A)). The model predicts a slightly higher mean number of well failures ($n = 2513$) (figure 4(B)), which is expected, as observed well failures are most probably under-reported due to the voluntary nature of data collection, and a well-owner’s perceived consequence of reporting a failed well to their county or state.

The normally distributed residual error (figure 4(C)) indicates the unbiasedness and strength of the model: well failure predictions for the observed



2012–2016 drought were within 20% of the actual value for around 68.2% of the study area, between 20% and 55% of the actual value for around 27.2% of the study area, and greater than 55% of the actual value for less than 5% of the study area.

Unsurprisingly, both observed and predicted failures tend to cluster in the southeastern CV, where agricultural groundwater use is comparatively higher than elsewhere in the state [43, 42]; households reliant on domestic wells in this region are particularly susceptible to failure.

4.2. Failing and vulnerable wells in drought duration scenarios

Longer drought duration results in widespread well failure episodes concentrated primarily in the southeastern CV (figure 5). Consistent with domestic well failure patterns observed during the 2012–2016 drought, well failure density is highest in Madera, Kings, Kaweah, Tule, Tulare Lake, and Kern subbasins.

In the ‘continuous drought’ simulation, two- and four-year long droughts immediately following the 2012–2016 drought (6 and 8 years total without an intervening wet winter) result in 4037–5460 and 6538–8056 cumulative well failures, respectively. Thus, a two-year drought duration following the 2012–2016 drought results in more well failures than the 2012–2016 drought alone, and a combined 8 year drought duration results in nearly twice the failures observed from 2012 to 2016 (figure 6). Intensified well failure during extended drought reinforces the interdependence of well failure on groundwater level: when groundwater levels cannot recover to pre-drought levels and pump depths are fixed, wells are more vulnerable to failure.

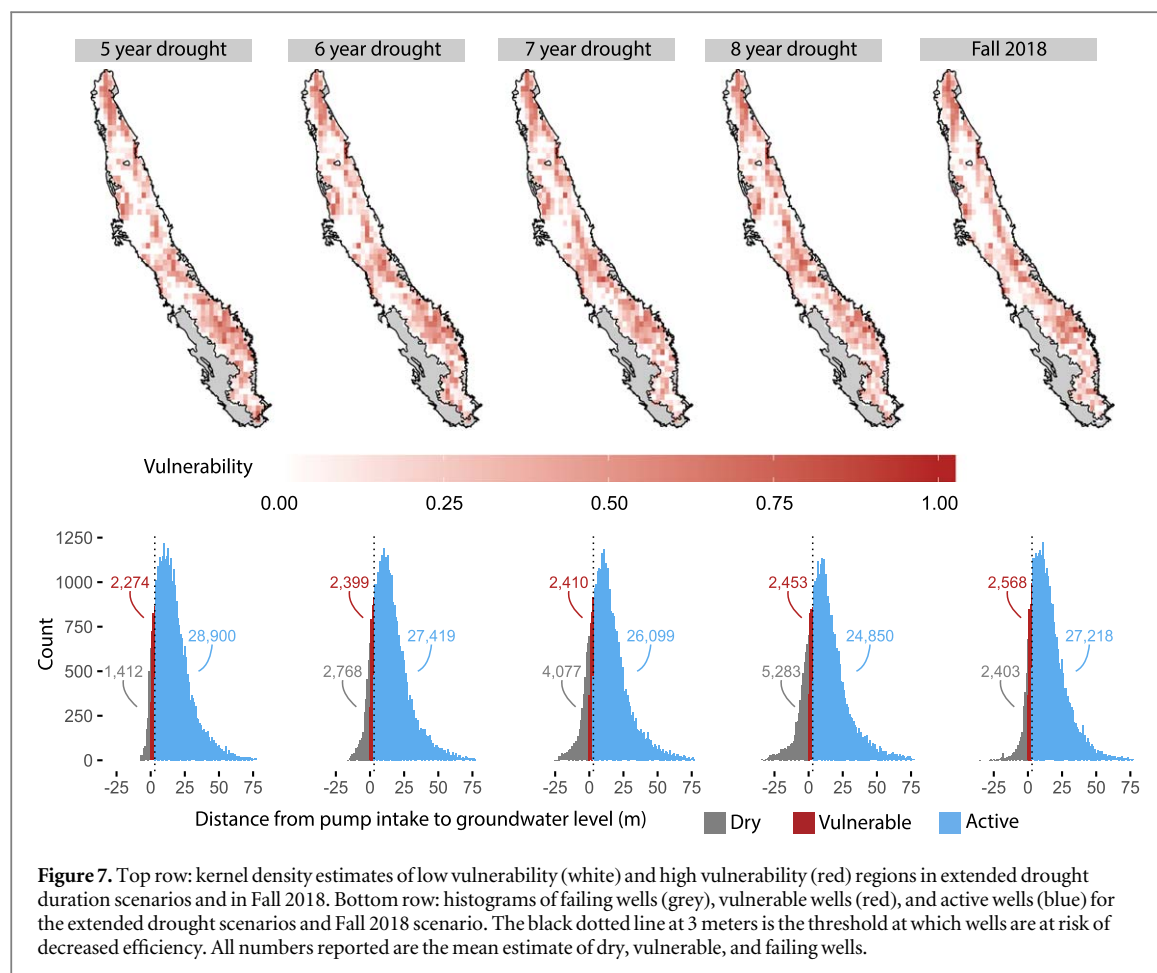
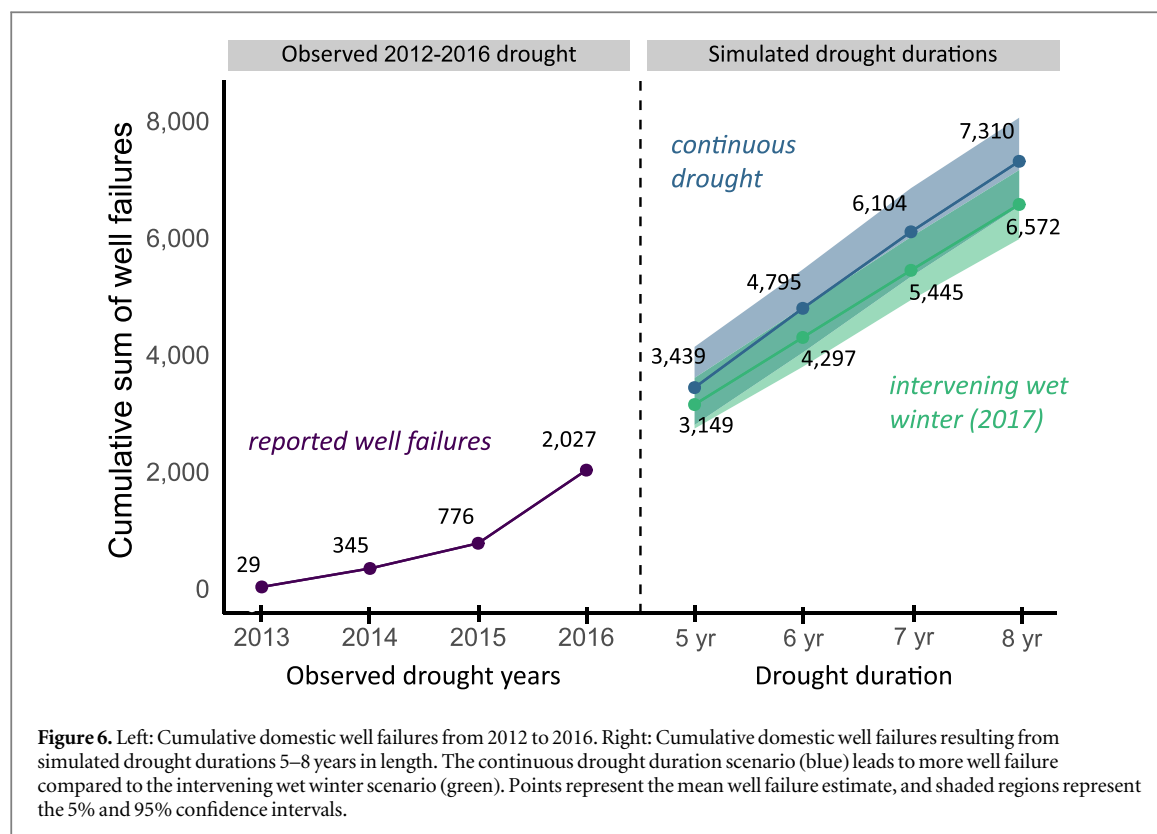
In the ‘intervening wet winter’ scenario, groundwater levels are allowed to recover during 2017, and well failure slightly abates: 498 and 738 fewer wells fail in the 6 and 8 year drought scenarios, indicating that an increase in median groundwater level of only a few meters across the Central Valley can prevent hundreds of domestic well failures during extended drought.

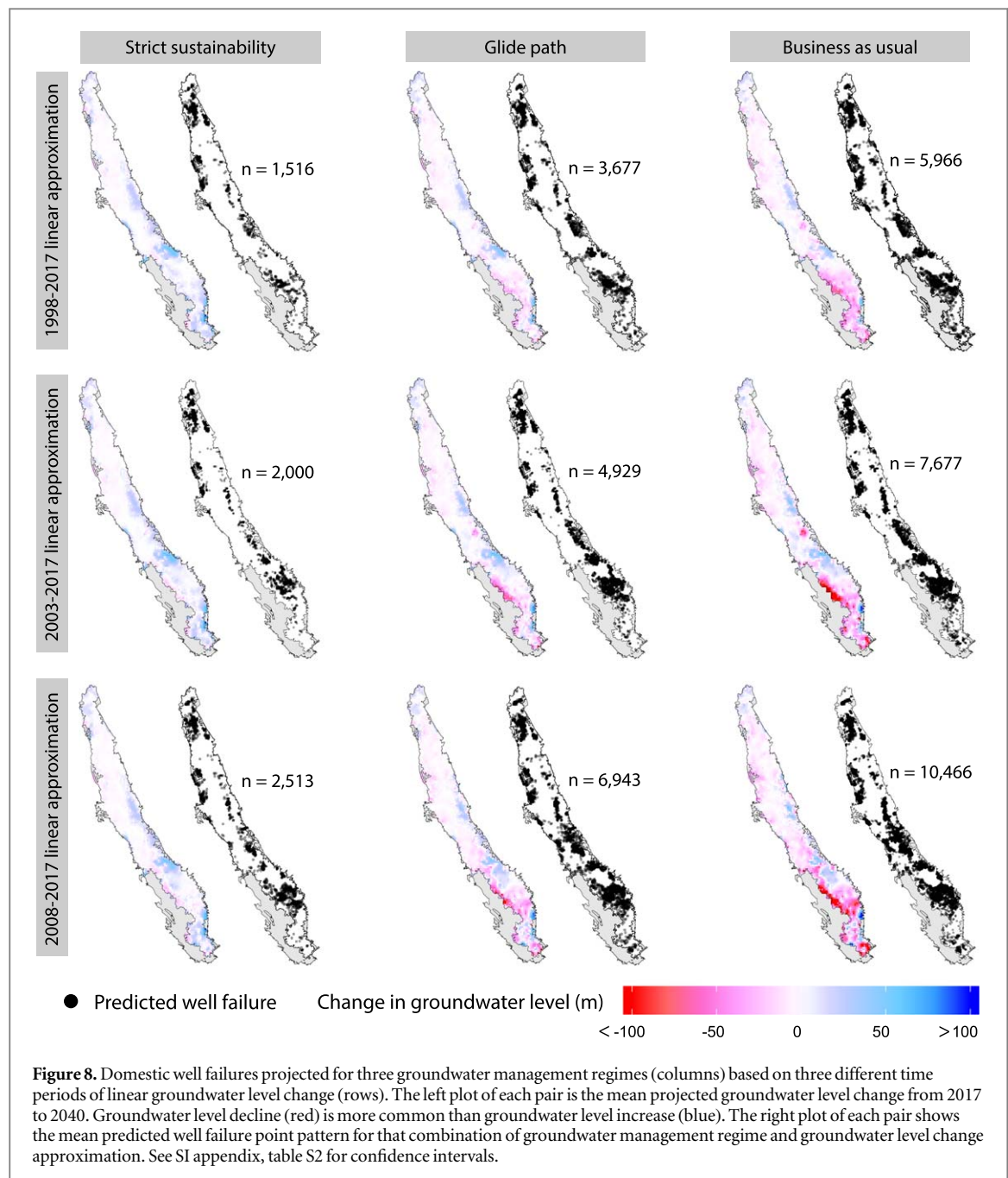
The cumulative sum of annual well failures observed in the evaluated drought duration scenarios follows a linear trend (figure 6). If the drought were to continue past the simulated 8 years scenario, well failures likely would follow a sigmoidal trend: inflecting then leveling off, as failure progresses to increasingly infrequent and deeper wells until none are left.

Vulnerable wells (figure 7) are those with estimated pump intakes within 3 m of the groundwater level, and are at heightened risk of experiencing a reduction in pump efficiency, or a failure episode. Since this 3 m window is fixed in our analysis, the spatial distribution and count of vulnerable wells is relatively constant across the drought duration scenarios (2274–2453 wells), and the present day scenario of Fall 2018 (mean estimate = 2568). Moreover, the spatial distribution of vulnerable wells mirrors those of well failures.

4.3. Failing wells in projected groundwater management regimes

Projecting groundwater depths into 2040 under three different management regimes results in significant differences in domestic well failures (figure 8). The ‘Business as usual’ regime, with no change in the historical trend of groundwater level decline, would lower the groundwater level by up to 100 m in parts of the southern CV, but significant groundwater level declines are widespread. Scenarios aimed at achieving sustainability





would reduce these declines, hence the differences between the ambitious ‘Strict sustainability’, ‘Glide path’ and ‘Business as usual’ pathways might be quite important for water resources managers and policy makers.

The groundwater depth changes and associated well failures are sensitive to the period used for the linear approximation of groundwater level declines. The period from 2008 to 2017 leads to significantly worse groundwater depletion than both periods 2003–2017 and 1998–2017, particularly because of the effects of the 2012–2016 drought. Average well failures for the ‘Business as usual’ regime range from 5966 to 10 466 (depending on the period used for the linear interpolation), while under the ‘Glide Path’ regime they range from 3677 to 6943, and from 1516 to 2513 under the

‘Strict sustainability’ regime (confidence intervals are reported in SI appendix, table S2).

Most of the estimated domestic well failures are still concentrated in the southeastern CV, but the central and northern CV are also affected, presumably due to the ubiquity of relatively shallow wells in these regions. The ‘Business as usual’ regime leads to especially severe well failure in all three projected groundwater level trends.

5. Discussion

5.1. Impact of drought duration on well failure and vulnerability

It is well understood that drought duration leads to increased groundwater extraction [21, 22], and hence

domestic well failure [28, 25]. Thus, we tested the impact of previously unseen drought durations ranging 5–8 years in length, by simulating an additional 2–4 years of severe drought immediately following the 2012–2016 drought, calculating the change in groundwater level, and determining failing and vulnerable wells.

A previous study estimated that 4 years of drought in the Tulare County, California immediately following the 2017 wet winter would result in about 200–850 domestic well failures [29]. Our model's equivalent scenario (intervening wet winter with an 8 year drought duration) results in a similar range of 585–715 domestic well failures in Tulare County. Additional comparisons are not possible given the lack of research on this topic.

At the level of California's CV, our results suggest that drought durations of 6–8 years result in 4037 to 5460 and 6538 to 8056 cumulative well failures, respectively. However, an intervening wet winter during the 6 and 8 year long drought duration simulations buffers against well failure: when groundwater is allowed to recover after 4 years of drought (as happened during the 2017 wet winter), an average of 498 and 738 less domestic wells fail. These findings support research indicating that limiting groundwater pumping during drought may reduce well failure [46, 29], and a general understanding that groundwater pumping can lower proximal groundwater levels [5].

During the 2012–2016 drought, the median groundwater level in the CV fell to progressively new historic lows each fall after the summer growing season (SI appendix, section S2.5) [48]. Our results indicate that between fall of 2014 and 2015, the median groundwater level across the entire CV fell by nearly 5 m, and in some areas (i.e.—Tulare, Kings, and Kern counties), by tens of meters. In fall of 2016, the median groundwater level in the CV was 27.0 m below land surface. Moreover, our results indicate that the IQR range of domestic well pump locations in the CV is 24.5–52.3 m below land surface. The proximity of pump intake depths to groundwater levels explains why domestic wells are sensitive to even slight declines in groundwater level: 5–10 m of groundwater level decline may easily impact thousands of domestic well pump intakes and cause failure.

In the four drought duration scenarios evaluated, an average of 2274 to 2453 domestic well pumps reside within 3 m of the groundwater level. We classified these wells as vulnerable, because they are likely to fail first under persistent groundwater level decline. The spatial distribution of well vulnerability mirrors that of well failures. Mapping clusters of predicted failing and vulnerable wells is essential for sustainable water management and disaster response.

5.2. Implications for groundwater management and policy

The strong dependence of domestic well failure on groundwater pumping to support irrigated agriculture raises serious questions concerning the role of sustainable groundwater policy in mitigating well failure [46]. We evaluated three different projected groundwater management regimes to curb groundwater level declines in the coming years: a 'Strict sustainability' theoretical best-case regime wherein declining trends in groundwater level stop in 2020, a 'Business as usual' regime that continues groundwater decline until 2040, and a final 'Glide path' moderate regime that slows the rate of groundwater level decline to the midway point between the former two regimes.

Our results suggest that choices embedded within each of the groundwater management regimes vastly impact the amount of expected well failures. For instance, the 'Glide path' regime predicts 3677 to 6943 domestic well failures by 2040, and the 'Business as usual' regime predicts 5966 to 10 466 domestic well failures by 2040. Both groundwater management regimes would result in twice to almost three times as many well failures than the 'Strict Sustainability' regime (1516–2513 failures). All three scenarios are sensitive to the period of record used to approximate the linear groundwater level decline, however they underpin the vulnerability of domestic wells to historic rates of groundwater level decline, and demonstrate the impact of management on well failure.

Refilling overdrafted aquifers via managed aquifer recharge might meet the dual objectives of increasing groundwater storage, and bolstering domestic well dependent households' drought resilience. In California, high-magnitude flood flows are likely the most accessible and largest sources of water to replenish groundwater aquifers through managed aquifer recharge [59], which might considerably slow or reverse trends in groundwater depletion. The emerging research in the strategic siting of managed aquifer recharge considers impacts on crop health [60], human health [61], the mobilization of contaminants into groundwater [62], and hydrogeologic suitability (i.e.—highly conductive flowpaths and geologic formations capable of accommodating large volumes of water, such as incised valley fills) [63]. In the San Joaquin Valley where domestic well failures peak, managed aquifer recharge alone may not be enough to offset groundwater overdraft, but coupled with a reduction in agricultural water use [46], groundwater levels may stabilize enough to prevent widespread future failure events.

This study assumes that no interim well construction takes place to prepare for falling groundwater levels, such as the practice of pump lowering or well deepening. Pump lowering typically takes place in 6 m intervals (the length of standard discharge piping), and costs around \$2000 USD per lowering event [29]. If we consider the cost of pump lowering in all failing

wells in the 6 and 8 year drought duration scenarios (in reality some wells will not have room to be lowered) and assuming every failing well's pump is lowered once (some will require more than one lowering), at \$2000 USD per 6 m unit of discharge piping, 4037–5460 and 6538–8056 failures correspond to \$8.7–\$10.4 and \$13.8–\$15.5 million USD.

During the recent drought, it is likely that some households also deepened their wells. In California and nationwide, drilling deeper wells is a common practice to adapt to declining groundwater levels [9], but is a costly and unsustainable solution that may furthermore result in cross-contamination due to inter-connection of confined aquifers by well construction [64]. Moreover, the financial burden of pump lowering or well deepening might disproportionately impact disadvantaged populations [30] unable to afford chasing after declining groundwater levels. Since many of these disadvantaged groups may not own their land and thus wells, well construction decisions may be made by landowners rather than the affected groups.

Sustainable long-term solutions for drinking water access might include connecting vulnerable households to nearby centralized water provisions. Recent research indicates that many rural communities, assumed to be on domestic wells, are actually quite close (less than 2 km) to a potable water supply system [65]. However, as annexation and consolidation is financially and physically impractical for all domestic-well dependent households, many will remain too remote and isolated to connect to a nearby water system.

Short- and long-term solutions to domestic well failure remain largely unexplored. What role can managed aquifer recharge play in mitigating well failure? Given the strong dependence of groundwater level decline on extraction for irrigated agriculture, could agri-business proximal to centers of high well failure collectively fund safety nets that internalize the cost of well failure during periods of increased groundwater pumping? Should vulnerable domestic well reliant populations connect to nearby municipal water systems with more reliable water supply? What is the appropriate solution for those that are too remote or isolated to connect to a community system?

5.3. Applicability to other areas

The well failure model presented in this study is extensible to other areas outside of California where sufficient data or groundwater flow models are available. It relies on two inputs: (1) a time series of spatially-explicit groundwater level surfaces reflecting typical groundwater level changes (specifically, the maximum drawdown), and (2) well construction information (i.e.—geographic location and pump intake depth).

Approaches for interpolating groundwater levels and estimating pump intake depths are demonstrated in this study, though others exist [29, 28, 66, 56]. Groundwater levels provided by a groundwater flow model such as MODFLOW [67] would easily couple to a well failure model, enabling the simulation of water management regimes and the impact of the resulting groundwater level on domestic well failure at arbitrary temporal scales. In California, existing regional-scale groundwater flow models such as C2VSim [43] and CVHM [42] can be used to plan for the impact of future failure episodes under different water management regimes involving changes in both pumping and recharge in space and time.

This study aimed for regional prediction of failing, vulnerable, and active wells, but more nuanced impact analyses can be made. For instance, variable losses in well efficiency may be quantified as groundwater levels fall [22]. This in turn enables the cost estimation of repairing failing and vulnerable wells (e.g.—pump lowering, well deepening), compared to water management actions (e.g.—fallowing fields, reduced groundwater pumping).

Where resources exist to survey households, detailed domestic well information such as geographic location, pump intake depth, and retirement age may be obtained, and would further constrain the uncertainty inherent in the estimation of these parameters. Additionally, well failure observations are essential for model calibration. Though this study benefited from failure data, efforts to anticipate domestic well failures as proactive hazard mitigation should not wait for the existence of observational data. It does, however, suggest the benefit of having such a system in place as part of local and state-level drought preparedness.

5.4. Implications for adaptation to climate change

Our results demonstrate that the mechanisms leading to domestic well failure are heavily dependent on groundwater level declines due to pumping for irrigated agriculture and increased pumping during drought. A historical lack of groundwater management in California [21] has led to widespread groundwater level decline. Climate change compounds the impact of water management decision-making. Warming will increase the frequency and duration of drought in California and other parts of the world [36, 37, 35, 34, 68], and if left unchecked, groundwater withdrawal will likely intensify as surface water becomes more scarce, as it has in the past [21]. As we demonstrate in this study, groundwater replacement of lost surface water during extended drought intensifies well failure due to already low groundwater levels. Thus, managing for low to no domestic well failure requires a consideration of the complex interaction between land use change, water resources management, human decision-making, and climate change. Unless adaptation strategies become integral to

sustainable groundwater management policy, the extended droughts anticipated under climate change and resulting changes in groundwater levels will put thousands of domestic wells in California's CV at risk of failure, and hence, thousands of Californians at risk of losing access to water.

5.5. Additional perspective on the data and model

There is generally good agreement between the observed and predicted well failure at the 10 km resolution of the residual error maps (figures 4(A)–(B)), and better agreement (figure 4(C)) is achieved at larger spatial scales (i.e.—Bulletin 118 groundwater subbasins, entire CV). Thus, the results presented in this study should not be taken as *de facto* predictions of the exact locations of well failure, but rather, as *regional-scale* well failure estimates. Local-scale errors introduced by uncertainty in well failure reporting, well completion reporting, groundwater level, and model formulation are overcome at regional scales.

We acknowledge that spatial and temporal variability in monitoring well data introduces uncertainty in the interpolated groundwater level. Ambient monitoring wells measured each season (i.e.—spring and fall) are not the same across seasons, and each season's measurements are sampled over a roughly three month time frame (January–March in the spring, and October–December in the fall). However, because most of the groundwater level change observed in a year takes place as the result of the summer growing season, and the fall measurements take place after the summer, spring and fall measurements still reflect ambient conditions. Moreover, both scaling the 2012–2016 groundwater level change to create future drought scenarios, and calculating 2040 groundwater levels with linear trends are simple approaches to estimate future groundwater level decline, but the accuracy of any method to forecast unseen future events are also questionable. Additionally, we do not account for any emergency response measures in response to drought such as groundwater pumping curtailments. In California, some households were able to drill deeper wells, lower their pumps, or connect to a nearby surface water supply system during the drought. Because these corrective actions are cost-prohibitive and highly unlikely to be widespread, our modeling assumptions (no corrective action) and hence results, still agree with observed well failure rates from 2012 to 2016.

6. Conclusions

In this study, we developed a data-driven well failure model and applied it to California's CV to make regional-scale estimates of domestic well failure, and assess future well failure under different groundwater level scenarios.

Our model reproduces reported domestic well failures during the 2012–2016 drought in California's CV ($n = 2027$), and furthermore, simulates the impact of different drought duration scenarios up to 8 years in length. We show that small declines in groundwater level are sufficient to cause thousands of wells failures when groundwater levels are already low, and that wet winters, and hence groundwater recharge or reduced pumping, may buffer against well failure. A simulated drought duration of 6 years (2012–2018) results in 4037–5460 total well failures. Similarly, an 8 year long drought (2012–2020), corresponds to a median groundwater level change of less than 10 m across the CV, but results in 6538–8056 total well failures. The same 6 and 8 year long drought duration scenarios with an intervening wet winter in 2017 lead to an average of 498 and 738 fewer well failures. Lastly, wells that do not fail may still be vulnerable to failure. Our model estimates that in Fall 2018, an average of 2568 well pump intakes were within 3 m of the groundwater level, and 10 544 well pump intakes were within 10 m of the groundwater level.

Our model further shows that early adoption of sustainable groundwater management regimes aimed at halting declining trends in groundwater level will lessen the magnitude of domestic well failure. A 'Business as usual' linear groundwater level decline would result in an average of 5966–10 466 domestic well failures by 2040. In contrast, a more gradual 'Glide path' decline would result in 3677–6943 domestic well failures by the same date. A 'Strict sustainability' regime that allows groundwater levels to decline until 2020 before halting would result in 1516–2513 well failures.

Together, these results demonstrate that access to domestic water supply for large rural populations may be imperilled by a relatively small number of agricultural users, posing challenges for equitable and sustainable groundwater management which may not adequately represent domestic well users.

Models like the one developed in this study may be updated over time to accommodate additional wells, refine existing well construction information, and evaluate the impact of potential water management strategies on groundwater level changes, and hence well failure. This study's approach to well failure modeling may be applied in other arid regions worldwide to facilitate drought preparedness planning. We anticipate that the model developed herein may be used by local and state agencies developing groundwater management plans in accordance with California's Sustainable Groundwater Management Act.

Acknowledgments

We thank the Governor's Office of Planning and Research and the California Department of Water Resources for their assistance in acquiring domestic well failure, and well completion report data. Thomas

Harter, Darcy Bostic, and Nisha Marwaha provided modeling advice and assistance. The West Big Data Hub has helped disseminate this research. Financial support was provided by the National Science Foundation (NSF) Climate Change, Water, and Society (CCWAS) Integrated Graduate Education and Research Traineeship (IGERT) program at the University of California, Davis (<http://ccwas.ucdavis.edu>, DGE-10693333), and the University of California Water (UC Water) Security and Sustainability Research Initiative.

Data availability

The data that support the findings of this study are openly available. These data [50] do not include observed well failure data [23], which are confidential and must be obtained by contacting the California Department of Water Resources.

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References

- [1] US Census American Housing Survey 2017 (<https://census.gov/programs-surveys/ahs/data.html>) (Accessed: 8 May 2018)
- [2] Dieter C, Linsey K, Caldwell R, Harris M, Ivahnenko T, Lovelace J, Maupin M and Barber N 2018 Estimated use of water in the United States county-level data for 2015 version 2.0 U.S. Geological Survey data release (<https://doi.org/10.5066/F7TB15V5>) (Accessed: 1 July 2019)
- [3] Harter T 2003 Publication 8086: water well design and construction *Technical Report* University of California Division of Agriculture and Natural Resources Oakland, CA
- [4] CA-DWR 2018 California Online State Well Completion Report Database (<https://data.cnra.ca.gov/dataset/well-completion-reports>) (Accessed: 1 January 2018)
- [5] Theis C V 1935 *Eos, Trans. Am. Geophys. Union* **16** 519–24
- [6] Theis C V 1940 *Civ. Eng.* **10** 277–80
- [7] Sophocleous M 2000 *J. Hydrol.* **235** 27–43
- [8] Greene C 2018 *Environ. Sci. Policy* **89** 283–91
- [9] Perrone D and Jasechko S 2019 *Nat. Sustain.* **2** 773–82
- [10] Cismowski G, Cooley W, Grober L S, Martin J, McCarthy M, Schnagl R S and Toto A 2006 Salinity in the central valley: an overview. Report of the regional water quality control board, Central Valley Region, California Environmental Protection Agency *Technical Report* Central Valley Regional Water Quality Control Board Rancho Cordova, California
- [11] Bertoldi G L, Johnston R H and Evenson K D 1991 Ground water in the Central Valley, California; a summary report *Technical Report* USGS
- [12] Harter T and Lund J R 2012 Addressing nitrate in California's Drinking Water: with a focus on Tulare Lake Basin and Salinas Valley Groundwater *Report for the State Water Resources Control Board Report to the Legislature* Center for Watershed Sciences, University of California, Davis
- [13] Balazs C, Morello-Frosch R, Hubbard A and Ray I 2011 *Environ. Health Perspect.* **119** 1272–8
- [14] Ransom K M *et al* 2017 *Sci. Total Environ.* **601–602** 1160–72
- [15] Welch A, Westjohn D, Helsel R and Wanty R 2000 *Ground Water* **38** 589–604
- [16] Ahuja S 2008 *Arsenic Contamination of Groundwater: Mechanism, Analysis and Remediation* (New York: Wiley) (<https://doi.org/10.1002/9780470371046>)
- [17] Jurgens B C, Burow K R, Dalgish B A and Shelton J L 2008 Hydrogeology, water chemistry, and factors affecting the transport of contaminants in the zone of contribution of a public-supply well in Modesto, eastern San Joaquin Valley, California *Scientific Investigations Report* 2008–5156 USGS (<https://doi.org/10.3133/sir20085156>)
- [18] Fujii R and Swain W C 1995 Areal distribution of selected trace elements, salinity, and major ions in shallow ground water, Tulare Basin, southern San Joaquin Valley, California. Water-Resour. Investig. Rep. *Water-Resources Investigations Report* 95–4048 USGS (<https://doi.org/10.3133/wri954048>)
- [19] Robertson F N 1991 Geochemistry of ground water in alluvial basins of Arizona and adjacent parts of Nevada, New Mexico, and California, USGS Professional Paper *Technical Report* 1406-C USGS (<https://doi.org/10.3133/pp1406C>)
- [20] Ellis A S, Johnson T M and Bullen T D 2002 *Science* **295** 2060–2
- [21] Hanak E, Lund J, Dinar A, Gray B and Howitt R 2011 *Managing California's Water: From Conflict to Reconciliation* (San Francisco, CA: Public Policy Institute of California) pp 1–22
- [22] Medellín-Azuara J, MacEwan D, Howitt R E, Sumner D A, Lund J R, Scheer J, Gailey R, Hart Q, Alexander N D and Arnold B 2016 Economic analysis of the 2016 California drought on agriculture: a report for the California Department of Food and Agriculture *Technical Report* Center for Watershed Sciences, University of California Davis Davis, CA
- [23] CA-OPR 2018 Observed domestic well failures during 2012–2016 drought dataset obtained via an agreement with the California Governor's Office of Planning and Research. Private communication (Accessed: 6 May, 2018)
- [24] Mitchell D, Hanak E, Baerenklau K, Escrivá-Bou A, McCann H, Pérez-Urdiales M and Schwabe K 2017 Building drought resilience in California's cities and suburbs *Technical Report* Public Policy Institute of California
- [25] Feinstein L, Phurisamban R, Ford A, Tyler C and Crawford A 2017 Drought and equity in California drought and equity in California *Technical Report* Pacific Institute
- [26] Johnson T D and Belitz K 2015 *J. Hydrol.: Reg. Stud.* **3** 31–86
- [27] Johnson T D and Belitz K 2017 *Sci. Total Environ.* **607** 658–68
- [28] Perrone D and Jasechko S 2017 *Environ. Res. Lett.* **12** 104002
- [29] Gailey R M, Lund J R and Medellín-Azuara J 2019 *Hydrol. J.* **27** 1159–82
- [30] Famiglietti J S 2014 *Nat. Clim. Change* **4** 945–8
- [31] Wada Y, Van Beek L P, Van Kempen C M, Reckman J W, Vasak S and Bierkens M F 2010 *Geophys. Res. Lett.* **37** L20402
- [32] Döll P, Hoffmann-Dobrev H, Portmann F T, Siebert S, Eicker A, Rodell M, Strassberg G and Scanlon B R 2012 *J. Geodyn.* **59** 143–56
- [33] Siebert S, Burke J, Faures J M, Frenken K, Hoogeveen J, Döll P and Portmann F T 2010 *Hydrol. Earth Syst. Sci.* **14** 1863–80
- [34] Rhoades A M, Jones A D and Ullrich P A 2018 *Geophys. Res. Lett.* **45** 13–008
- [35] Swain D L, Langenbrunner B, Neelin J D and Hall A 2018 *Nat. Clim. Change* **8** 427
- [36] Diffenbaugh N S, Swain D L and Touma D 2015 *Proc. Natl Acad. Sci.* **112** 3931–6
- [37] Cook B I, Ault T R and Smerdon J E 2015 *Sci. Adv.* **1** e1400082
- [38] Tebaldi C, Hayhoe K, Arblaster J M and Meehl G A 2006 *Clim. Change* **79** 185–211
- [39] Lobell D B, Torney A and Field C B 2011 *Clim. Change* **109** 355–63
- [40] California Law 2014 *Sustainable Groundwater Management Part 2.74* (California: Legislative Information) ch 1932 10720–37.8

- [41] Scanlon B R, Faunt C C, Longuevergne L, Reedy R C, Alley W M, McGuire V L and McMahon P B 2012 *Proc. Natl Acad. Sci.* **109** 9320–5
- [42] Faunt C, Hanson R T, Belitz K, Schmid W, Predmore S P, Rewis D L and McPherson K 2009 Groundwater availability of the Central Valley Aquifer, California, US Geological Survey Professional Paper *Technical Report* 1766 USGS (<https://doi.org/10.3133/pp1766>)
- [43] Brush C F, Dogrul E C and Kadir T N 2013 *Development and Calibration of the California Central Valley Groundwater-Surface Water Simulation Model (C2VSim), Version 3.02-CG* (Sacramento, CA: California Department of Water Resources)
- [44] Lund J, Medellín-Azuara J, Durand J and Stone K 2018 *J. Water Resour. Plan. Manage.* **144** 04018067
- [45] Mount J *et al* 2018 Managing drought in a changing climate: four essential reforms *Technical Report* Public Policy Institute of California
- [46] Hanak E, Escrivá-Bou A, Gray B, Green S, Harter T, Jezdimirovic J, Lund J, Medellín-Azuara J, Moyle P and Seavy N 2019 PPIC: water and the future of the San Joaquin Valley *Technical Report* Public Policy Institute of California
- [47] Xiao M, Koppa A, Mekonnen Z, Pagán B R, Zhan S, Cao Q, Aierken A, Lee H and Lettenmaier D P 2017 *Geophys. Res. Lett.* **44** 4872–9
- [48] CA-DWR 2017 Fall 2017 groundwater level data summary *Technical Report* Department of Water Resources (https://water.ca.gov/-/media/DWR-Website/Web-Pages/Programs/Groundwater-Management/Data-and-Tools/Files/Statewide-Reports/Fall-2017-Groundwater-Level-Data-Summary_ay_19.pdf)
- [49] CA-DWR 2019 Groundwater Information Center (<https://gis.water.ca.gov/app/gicima/>) (Accessed: 8 May 2018)
- [50] Pauloo R, Dahlke H, Escrivá-Bou A, Fencl A, Fogg G E and Guillon H 2019 Domestic well vulnerability to drought duration and unsustainable groundwater management in California's Central Valley *UC Davis Dataset* (<https://doi.org/10.25338/B8Q31D>)
- [51] Tullis J P 1989 *Hydraulics of Pipelines: Pumps, Valves, Cavitation, Transients* (New York: Wiley) (<https://doi.org/10.1002/9780470172803.ch9>)
- [52] Helweg O, Scott V and Scalmanini J 1983 *Improving Pump and Well Efficiency* (Denver, CO: American Water Works Association)
- [53] Deutsch C V and Journel A G 1998 *GSLIB: Geostatistical Software Library and User as Guide* 2nd edn (New York: Oxford University Press)
- [54] Varouchakis E, Hristopulos D and Karatzas G 2012 *Hydrol. Sci. J.* **57** 1404–19
- [55] Laurent A G 1963 *J. Am. Stat. Assoc.* **58** 231–5
- [56] Journel A G and Huijbregts C J 1978 *Mining Geostatistics* vol 43 (London: Academic) pp 563–4
- [57] Stoyan D and Stoyan H 1994 *Fractals, Random Shapes, and Point Fields: Methods of Geometrical Statistics* vol 302 (New York: Wiley) (<https://doi.org/10.1002/zamm.19950750815>)
- [58] USDOI 2009 Manual of surveying instructions: for the survey of the public lands of the United States *Technical Report* US Department of the Interior Denver
- [59] Kocis T N and Dahlke H E 2017 *Environ. Res. Lett.* **12** 084009
- [60] Dahlke H *et al* 2018 *Calif. Agric.* **72** 65–75
- [61] Ayuso-Gabella N, Page D, Masciopinto C, Aharoni A, Salgot M and Wintgens T 2011 *Agric. Water Manage.* **99** 93–102
- [62] Xanke J, Liesch T, Goeppert N, Klinger J, Gassen N and Goldscheider N 2017 *Hydrol. J.* **25** 1795–809
- [63] Maples S, Fogg G and Maxwell R 2019 *Hydrol. J.* **27** 2869–88
- [64] Gailey R M 2017 *Hydrol. J.* **25** 2163–83
- [65] London J *et al* 2018 The struggle for water justice in California's San Joaquin Valley: a focus on disadvantaged unincorporated communities *Technical Report* UC Davis Center for Regional Change
- [66] O'sullivan D and Unwin D 2010 *Geographic Information Analysis* 2nd edn (New York: Wiley)
- [67] Harbaugh A W, Banta E R, Hill M C and McDonald M G 2000 MODFLOW-2000, the US Geological Survey modular ground-water model-user guide to modularization concepts and the ground-water flow process *Open-file Report* 2000-92 USGS (<https://doi.org/10.3133/ofr200092>)
- [68] Van Loon A F *et al* 2016 *Nat. Geosci.* **9** 89–91