# Rising coastal groundwater as a result of sea-level rise will influence contaminated coastal sites and underground infrastructure

kristina hill<sup>1</sup>, Daniella Hirschfeld<sup>2</sup>, Caroline Stanhope Lindquist<sup>1</sup>, Forest Cook<sup>2</sup>, and Scott Warner<sup>3</sup>

<sup>1</sup>University of California, Berkeley <sup>2</sup>Utah State University <sup>3</sup>University of Newcastle

May 25, 2023

#### Abstract

Sea-level rise (SLR) will cause coastal groundwater to rise in many coastal urban environments. Inundation of contaminated soils by groundwater rise (GWR) will alter the physical, biological, and geochemical conditions that influence the fate and transport of existing contaminants. These transformed products can be more toxic and/or more mobile under future conditions driven by SLR and GWR. We reviewed the vulnerability of contaminated sites to GWR in a US national database and in a case comparison with the San Francisco Bay region to estimate the risk of rising groundwater to human and ecosystem health. The results show that 326 sites in the US Superfund program may be vulnerable to changes in groundwater depth or flow direction as a result of SLR, representing 18.1 million hectares of contaminated land. In the San Francisco Bay Area, we found that GWR is predicted to impact twice as much land area as inundation from SLR, and 5,282 additional state-managed sites of contamination may be vulnerable to inundation from GWR in a 1.0 m SLR scenario. Increases of only a few centimeters of elevation can mobilize soil contaminants, alter flow directions in a heterogeneous urban environment with underground pipes and utility trenches, and result in new exposure pathways. Pumping for flood protection will elevate the saltwater interface, changing groundwater salinity and mobilizing metals in soil. Socially vulnerable communities are disproportionately exposed to this risk at both the national scale and in a regional comparison with the San Francisco Bay Area.

#### Hosted file

963872\_0\_art\_file\_11003579\_rgvgxp.docx available at https://authorea.com/users/621729/ articles/645176-rising-coastal-groundwater-as-a-result-of-sea-level-rise-will-influencecontaminated-coastal-sites-and-underground-infrastructure

#### Hosted file

963872\_0\_supp\_11003510\_r5v52q.docx available at https://authorea.com/users/621729/ articles/645176-rising-coastal-groundwater-as-a-result-of-sea-level-rise-will-influencecontaminated-coastal-sites-and-underground-infrastructure

# Rising coastal groundwater as a result of sea-level rise will influence contaminated coastal sites and underground infrastructure

# 5 K. Hill<sup>1</sup>, D. Hirschfeld<sup>2</sup>, C. Lindquist<sup>1</sup>, F. Cook<sup>2</sup>, and S. Warner<sup>3, 4</sup>

<sup>6</sup> <sup>1</sup>Landscape Architecture and Environmental Planning, University of California, Berkeley,

7 California, USA; <sup>2</sup>Landscape Architecture and Environmental Planning, Utah State University,

8 Logan, Utah, USA; <sup>3</sup>Global Centre for Environmental Remediation, University of Newcastle,

9 Callaghan, New South Wales, Australia and <sup>4</sup>BBJ Group, Larkspur, California, USA.

10 Corresponding author: Kristina Hill (kzhill@berkeley.edu)

#### 11 Key Points:

- Rising sea levels will cause rising groundwater to inundate some coastal contaminated
   sites, mobilizing pollutants and causing corrosion.
- We found 326 Superfund sites that may be at risk nationally, and 5,282 state managed sites in a San Francisco Bay area comparison.
- Socially vulnerable communities are disproportionately exposed to this hazard, via
   impacts on indoor air, foundations and infrastructure.
- 18

1

# 19 Abstract

20 Sea-level rise (SLR) will cause coastal groundwater to rise in many coastal urban environments. 21 Inundation of contaminated soils by groundwater rise (GWR) will alter the physical, biological, 22 and geochemical conditions that influence the fate and transport of existing contaminants. These 23 transformed products can be more toxic and/or more mobile under future conditions driven by 24 SLR and GWR. We reviewed the vulnerability of contaminated sites to GWR in a US national 25 database and in a case comparison with the San Francisco Bay region to estimate the risk of 26 rising groundwater to human and ecosystem health. The results show that 326 sites in the US 27 Superfund program may be vulnerable to changes in groundwater depth or flow direction as a 28 result of SLR, representing 18.1 million hectares of contaminated land. In the San Francisco Bay 29 Area, we found that GWR is predicted to impact twice as much land area as inundation from 30 SLR, and 5.282 additional state-managed sites of contamination may be vulnerable to inundation 31 from GWR in a 1.0 m SLR scenario. Increases of only a few centimeters of elevation can 32 mobilize soil contaminants, alter flow directions in a heterogeneous urban environment with 33 underground pipes and utility trenches, and result in new exposure pathways. Pumping for flood 34 protection will elevate the saltwater interface, changing groundwater salinity and mobilizing 35 metals in soil. Socially vulnerable communities are disproportionately exposed to this risk at 36 both the national scale and in a regional comparison with the San Francisco Bay Area.

- 37
- 38

#### 39 Plain Language Summary

- 40 We estimated the number of sites with known contamination in the US Superfund program at the
- 41 national scale and found 326 Superfund sites that may be exposed to inundation from below as
- 42 rising sea levels push groundwater higher along the coast. California, North Carolina, Virginia
- 43 and New York have the largest area of federally-managed contaminated land that may be
- 44 exposed. Thousands of additional sites are managed by state agencies. We conducted a
- 45 comparison in the San Francisco Bay Area that included state-managed sites.
- 46 We found that 5,297 sites in the San Francisco region may be exposed to rising groundwater
- 47 with SLR of 1.0 m, including 1,480 open sites, and an additional 3,817 closed sites that may
- 48 contain residual contaminants. If the ratio of Superfund to state-managed sites in this region
- 49 (1:352) holds, the number of at-risk contaminated sites nationally would be 115,000.
- 50 Low-income residents and people of color are disproportionately represented near these sites and
- 51 therefore may face higher risks. Additional sub-regional research is urgently needed to
- 52 understand these exposures. Interactions will occur between the salinity of rising coastal
- 53 groundwater and shallow pumping, affecting infrastructure and building foundations. Adaptation
- 54 plans must consider rising groundwater to avoid widespread failures.

# 55 1 Introduction

56 Higher sea levels and human adaptation actions can influence the elevation, discharge 57 rates, and flow direction of unconfined coastal groundwater all around the world (Michael,

- Russoniello, and Byron 2013). Future sea levels are predicted to rise significantly in urban areas
- 59 along the US coast (Sweet et al. 2022). Coastal cities have been designed for today's
- 60 groundwater elevations, using the assumption that water supply pipes, sanitary sewers, storm
- 61 sewers, electrical conduits, and even building foundations will either be dry or seasonally
- 62 submerged in fresh groundwater. Future performance of critical infrastructure at the building and
- 63 district scales is threatened by pressure and salinity changes associated with rising coastal
- 64 groundwater (Tansel and Zhang 2022; Parkinson 2021; Habel et al. 2020; Hummel, Berry, and 65 Steam 2018; Noi and Nitivetter and 2015)
- 65 Stacey 2018; Noi and Nitivattananon 2015).
- 66 Coastal sediment, soil, and groundwater are frequently contaminated with chemicals that 67 can threaten human and ecosystem health (Burman et al. 2022; Carter and Kalman 2020). Previous studies have identified substantial zones of mixing between fresh groundwater and 68 69 ocean-derived or influenced groundwater that may strongly affect aqueous geochemical cycles 70 and coastal water quality (Sawyer et al. 2015). A recent study estimated the number of hazardous 71 sites that are exposed to SLR and GWR in California, and the social vulnerability of people 72 nearby (Cushing et al 2023). However, the number of sites defined as exposed may be too low 73 by an order of magnitude if groundwater processes are not considered using an appropriate 74 conceptual model. No previous studies have estimated the number or area of contaminated sites 75 that may be exposed to rising groundwater nationally in the US, or the number and 76 characteristics of people who may be vulnerable to exposure along the US coast. In addition, no 77 previous work has compared the national US number of sites to a detailed regional case to 78 estimate the total number of sites managed by non-federal agencies.
- Military bases, commercial sites such as fueling stations and cleaning facilities, industrial
   sites including oil refineries and chemical manufacturing, and transportation hubs such as air and

81 shipping port facilities have left a legacy of contaminated land in coastal areas. The types of 82 contaminants present on these sites are diverse: heavy metals, volatile organic compounds 83 (VOC's), pesticides and herbicides, persistent organic pollutants, radioisotopes, and unexploded 84 military ordnance. Contaminated earth materials including soil, sediment, and bedrock have typically been left in place and capped with low-permeability materials to exclude rainwater 85 86 infiltration and isolate or immobilize contaminants (Palermo 1998). Site-scale biological, 87 chemical, and other physical remedies have been developed and applied over the past 30 years 88 (Warner et al. 2023). Although many in situ caps have not performed as intended due to the 89 heterogeneity of site conditions and unanticipated interactions with contaminant chemistry (Pu et 90 al. 2021), cost and environmental impact comparisons with removal actions have led to the 91 widespread use of these in situ soil caps and treatment strategies instead of soil removal for 92 treatment off-site or sequestration (Hou 2020). These site-by-site comparisons of costs and 93 environmental impacts have not yet included the risk of rising coastal groundwater as a 94 consequence of sea level rise.

95 In US law, the Comprehensive Environmental Response, Compensation, and Liability 96 Act (CERCLA), also known as Superfund, authorizes government to respond to releases or 97 threatened releases of hazardous substances into the environment (CERCLA 1980). 98 Contaminated sites listed on the Superfund program's National Priorities List (NPL), maintained 99 by the US Environmental Protection Agency (EPA), received special funding for remediation 100 and community engagement (Summers, Lamper and Buck 2021). However, Superfund sites are 101 not necessarily contaminated with more dangerous chemicals than other sites managed by US 102 state agencies. Most US contaminated sites are managed by state or local agencies that receive 103 their authority to require investigation, clean-up and monitoring of both public and private sites 104 from CERCLA. Under this authority, the spatial and temporal patterns of groundwater and 105 chemical concentrations in soil and groundwater at contaminated sites are typically studied only 106 within the boundaries of the legal parcel where the contamination has been identified. The often 107 slow and iterative cycles of investigation, monitoring, negotiations and court proceedings with 108 private owners, and remediation can take several decades, leaving many sites effectively un-109 remediated (Summers, Lamper and Buck 2021).

110 A rising sea surface can alter the elevation, discharge rates or flow directions of 111 groundwater in the saturated zone (Bjerklie 2012; Rotzoll and Fletcher 2012; Michael, 112 Russoniello, and Byron 2013; Abarca et al. 2013; Gonneea, Mulligan, and Charette 2013; Plane 113 and Hill 2017, Plane, Hill and May 2019; Befus et al. 2020). As groundwater rises and 114 inundation of soil occurs, contaminants may be transformed and mobilized (Yuan et al 2023). As 115 contaminants are mobilized, these new flows can create unexpected exposure pathways for 116 humans and aquatic ecosystems. For example, underground utility trenches and pipes can 117 become conduits for the volatile component of organic chemicals, potentially introducing these contaminants into indoor air via cracked plumbing seals or openings in building foundations 118 119 (Roghani et al. 2021). Additionally, the changed hydrologic and biogeochemical conditions from 120 rising groundwater may impair the intended performance of remedies and risk-management 121 approaches for contaminated soil and groundwater (Warner et al. 2023).

Increased pumping to protect low-elevation land or buildings can raise the saltwater
interface by tens of meters (Werner, Jakovovic and Simmons 2009; de Louw et al 2013;
Jakovovic et al 2016; Kim, Yoon and Lee 2019). Increasing chloride and sulfate concentrations
can mobilize metals in contaminated soils (Acosta et al 2011; Wen et al 2019; Yuan et al 2023).

126 Aquatic organisms are sensitive to metals such as arsenic, lead and chromium that are common

- 127 at contaminated sites (Peakall and Burger 2003). In addition, tidally influenced groundwater
- 128 cycles may remove fines in backfill under water supply pipes, destabilizing pipes at the joints.
- Higher groundwater also has significant impacts on sewer pipes, infiltrating and reducing their conveyance capacity and producing increased surface flooding (Habel et al. 2020). Finally, the
- inland and upwards movement of saline groundwater increases corrosion rates for underground
- 132 utilities and structural foundations, presenting serious risks to human health and safety from
- structural failures (Parkinson 2021; Abdelhafez, Ellingwood and Mahmood 2022; Tansel and
- 134 Zhang 2022).

135 Maps of shallow unconfined groundwater at the regional or urban district scale do not yet 136 exist for most coastal urban areas. In response to the need for planned adaptation to sea level 137 rise, new maps of current depth-to-water for unconfined, shallow coastal groundwater have been 138 produced in some metropolitan areas, such as the San Francisco Bay region (Plane and Hill 139 2017; Plane, Hill, and May 2019) and for the entire California coast (Befus et al. 2020). Similar 140 maps have been produced in Miami-Dade County, Florida, and Hampton Roads, Virginia, to 141 support adaptation planning. In addition, process-based projections of rising groundwater in 142 relation to sea level have been produced using numerical groundwater software such as 143 MODFLOW (Befus et al 2020; Habel et al 2017; Bjerklie et al 2012) using various assumptions 144 about hydraulic conductivity to represent the heterogeneity of hydrogeologic conditions. Unlike 145 empirical maps of past and current groundwater depth, these process-based modeling studies 146 offer opportunities to predict and identify critical thresholds for groundwater elevation in relation 147 to rising sea level. Process-based models also support investigations of saline groundwater 148 movement, allow evaluation of whether and how groundwater flow directions may change, and 149 can estimate the magnitude of increase in discharge rates for surface streams.

150 To date, no study has estimated how many contaminated sites in the lower 23 US coastal 151 states may be vulnerable to a rise in unconfined coastal groundwater. This represents a new and 152 critical adaptation planning concern for all sites with legacy contamination. A previous study has 153 evaluated risks of direct surface inundation by rising sea level at contaminated sites managed by 154 federal agencies on the eastern and Gulf coasts of the US (Carter and Kalman 2020). Another 155 recent study looked at the threats that federal NPL sites face from a wide range of natural 156 hazards across the US (Summers, Lamper and Buck 2021), but did not include rising 157 groundwater. While studies have begun to map and quantify the risk of surface flooding at 158 contaminated sites and to map the potential for emergent groundwater as a component of 159 compound flooding (Rahimi et al. 2020; Burman et al. 2022), the scale of the risk of inundation 160 from below has not yet been systematically assessed outside of California. A recent California 161 study by Cushing et al (2023) used topographic overlay methods that did not consider the depth 162 of the actual contaminants or infrastructure conveyance pathways in the soil, in relation to the 163 depth of the groundwater.

These gaps in the current literature prevent public agencies from effectively protecting people, ecosystems and public infrastructure assets from sea level rise hazards. One recent investigation found that coastal urban planning does not yet consider the risk of rising groundwater as a consequence of rising sea level (Hirschfeld, Hill, and Plane 2021), although this has been changing in the San Francisco Bay Area as a result of community-level advocacy, sustained media coverage and active public agency leadership. Globally, urban planners and engineers typically intend to use levees to protect vulnerable districts from surface flooding. 171 Planners and engineers are often unaware that groundwater can rise on the inland side of the

- 172 levee, causing health and infrastructure problems before emerging at the surface as flooding
- 173 (Hirschfeld et al 2023). In the US, the threat of contaminant mobilization by rising groundwater 174 is of particular concern since people with greater social vulnerability than is typical of the US
- population are more likely to live near contaminated sites (Carter and Kalman 2020).

This study assessed the number of contaminated sites in the US Superfund program that may be exposed to rising coastal groundwater in the contiguous US and used a case comparison with the San Francisco Bay Area to estimate the total number. We used topographic data to estimate groundwater levels in coastal regions and identified the boundaries of highly contaminated soil areas using US EPA's Superfund site map database. In the San Francisco Bay Area comparison, two separate state databases provided the locations of contaminated sites using street addresses. These sites typically have been treated and/or capped from above but have little or no protection from changes in subsurface flows

183 or no protection from changes in subsurface flows.

184 We compared these site locations to maps by Befus et al (2020) that used a process-based 185 model to estimate groundwater rise along the California coast in two sea level rise scenarios, 0.5 186 m and 1.0 m. The 2020 Befus et al. study concluded that the San Francisco Bay region has 187 extensive areas where shallow unconfined groundwater will rise with sea level. Although levees 188 and seawalls are currently in use and more are planned, emergent groundwater will continue to 189 present significant risks on the inland side of such coastal structures. Pumping frequently occurs 190 as a response to high groundwater, elevating the salt water interface and creating new inundation 191 and salinity conditions in some contaminated soils, along with risks of substantial land 192 subsidence (Jakovovich et al 2016; Kim, Yoon and Lee 2019).

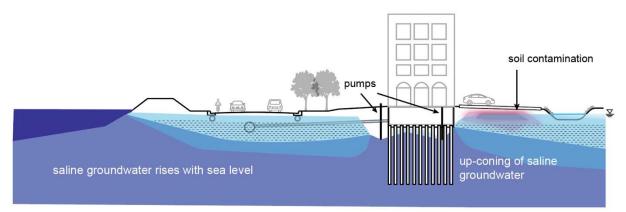
# 193 2 Methods

194 2.1 Conceptual Models for Contaminated Sites

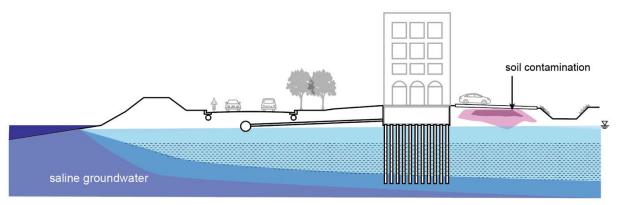
195 Models of coastal groundwater and contaminant movement are rarely constructed as a 196 synthesis that includes tidal effects on a range of geochemical conditions, interactions with urban 197 infrastructure or heterogeneous fill materials, and contaminant movement (Warner et al 2023). 198 Yet these conditions can be highly altered by rising sea levels and infiltrating sea water, 199 depending on the hydrogeologic environment (Pratt et al 2022). The dominant conceptual model 200 of advection-dispersion for contaminant transport in groundwater has failed to predict the field 201 behavior of tracers at highly monitored sites, leading to arguments for advection-diffusion as the 202 dominant processes (Hadley and Newell 2014). In advection-diffusion, sediment grains are 203 conceptualized as tiny baffles that induce vertical diffusion as well as lateral dispersion. The 204 relative dominance of vertical or horizontal contaminant movement may also be influenced by 205 the hydraulic pressure response during tidal dynamics, potentially arguing for greater 206 consideration of diffusion as a significant process in coastal contaminant flows.

A synthetic conceptual model is needed of groundwater dynamics at coastal urban sites with increasing rates of sea level rise. It must represent heterogeneous conditions with significant anthropomorphic influences, including urban development activities such as parcel-scale pumping to protect individual structures, water and sewer pipes placed in tidally-influenced groundwater, deferred maintenance of pipe systems and building foundations, and the use of treatment or containment strategies at coastal landfills and other contaminated sites that include permeable and impermeable barriers, pumping, and injection of materials. In addition to current

- 214 activities, urban fill was historically placed in large quantities in urban coastal areas. Adding fill
- 215 produced large areas with highly variable hydraulic conductivities as a result of the diverse and
- disorganized material constituents, and heavy traffic corridors with compacted soils can elevate
- 217 groundwater levels on their upgradient side (Plane, Hill, May 2019).
- To account for an increased sea level, this conceptual model must also represent hydrological changes that will impact urban conditions, including geochemical interaction with
- hydrological changes that will impact urban conditions, including geochemical interaction with contaminated soils that could lead to mobilization of contaminants (Pratt et al 2023), increased
- salinization that accelerates corrosion of conduits and building materials, increased liquefaction
- risks, changes in hydrostatic pressure, and increased groundwater discharge to streams and
- 223 underground pipes (Biswas et al 2018). Successful design and management decisions for
- infrastructure systems and individual building sites must consider these physical and chemical
- drivers. Ignoring these drivers could lead to loss of life in extreme precipitation or seismic events
- and increase both human and ecosystem health risks from exposure to contaminants.
- 227 Maintenance and replacement costs for infrastructure systems are also likely to increase.



Future conditions with rising sea level and rising groundwater.



228

Current conditions in coastal cities with protective levees.

- Figure 1. A synthetic conceptual model of rising coastal groundwater interacting with soil
- 230 constituents, soil chemistry, urban infrastructure, and pumping. Current conditions are shown in
- the lower diagram and future conditions in the upper diagram. Dark blue represents ocean water,
- 232 medium blue is saline groundwater with a diffusion zone, light blue represents fresh

233 groundwater. Small horizontal dashes in the light blue zone represent anoxic groundwater

conditions, and pink represents contaminated soil. Under future conditions, building foundations

- are exposed to more corrosive saline groundwater, particularly if pumping occurs and causes up-
- coning in the saltwater interface. Soil contaminants may be inundated by oxic, anoxic and saline
- groundwater. The sanitary sewer under the road and connected to the building, as well as thestorm drains, may be infiltrated and have reduced capacity. Creek water levels will increase as
- 239 groundwater discharge increases.

240 We propose the use of a synthetic conceptual model (Figure 1) that includes critical 241 chemical and structural relationships affected by rising and increasingly saline groundwater. It 242 represents the depth of fresh groundwater, which can increase liquefaction risk in seismic events; 243 inundation of pipes and catch basins that impact infrastructure performance; the saltwater 244 interface, which will rise in relation to sea level and will exhibit up-coning as a response to 245 pumping, accelerating corrosion rates of foundations and pipes; and inundation of previously dry 246 contaminated soils by groundwater. These interactions may occur even if shoreline levees are 247 constructed. This synthetic conceptual model allows regulatory agencies, property owners, urban 248 planners and infrastructure managers to anticipate future conditions at contaminated sites and 249 make choices that consider the interactions of changes in these physical systems with adaptation 250 strategies such as pumping.

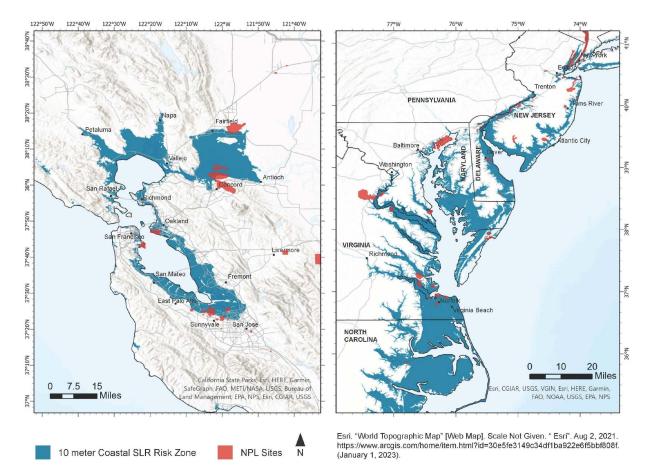
251

#### 2.2 National Assessment of Exposed and Contaminated Sites

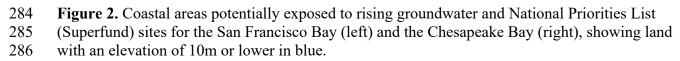
252 To identify all Superfund sites that may be exposed to potential coastal groundwater 253 inundation or influence from changed groundwater flow directions, we delineated coastal areas 254 where groundwater conditions may be affected by a rising sea surface. Such coastal areas include 255 the 23 mainland US states that are influenced by tidal flows (see Table 2). Rather than estimate 256 exposure using distance from the tidal shoreline, we used elevation derived from digital elevation 257 model (DEM) data provided by NOAA (Office of Coastal Management, 2023). This data was 258 subsequently used to create two continuous coastal datasets (one for the US East and Gulf coasts, 259 and one for the West coast). We then identified all areas of land below 10 meters of elevation as 260 potentially exposed to rising groundwater. Elevation was selected as a key parameter rather than 261 distance from the shoreline to recognize the important role topography plays in the relationship 262 between rising sea levels and groundwater (Befus et al 2020). This approach is intended as a 263 rapid assessment method designed to capture all sites with potential exposure since it can be 264 applied to extensive and complex coastal areas where process-based groundwater maps are not 265 yet available. The area within 10 meters of mean sea level is shown in Figure 2 for the San 266 Francisco Bay Area (A) and Chesapeake Bay (B) to draw attention to the extensive areas at risk 267 from rising groundwater in low-lying estuary environments.

268 Next, we overlaid a national dataset of US EPA Superfund contamination boundaries 269 onto our map of coastal land located within approximately10 meters of mean sea level. For this 270 analysis we relied on a map dataset created by Shared Enterprise Geodata and Services (SEGS) 271 for the EPA. This dataset contains polygons that define the Operable Unit and represent the 272 current understanding of the full extent of contamination (US EPA, 2021), and includes 1,852 273 Superfund sites throughout the United States. For the purposes of our analysis, we included sites that are considered either open (ie, actively being investigated or remediated) or closed (where 274 275 investigation and remediation activities are considered complete). Sites that are administratively 276 closed often contain residual contamination (dela Cruz et al 2014). We identified all Superfund

- sites that are fully or partially located within the topographic coastal risk area, and identified the
- 278 specific contaminants located at each site based on the Contaminant of Concern Data for
- 279 Decision Documents by Media, FYs 1982-2020 (US EPA, 2022). We categorized the sites as
- having (a) only volatile organic compounds (VOC's), (b) only metals, or (c) a mixture of
- pollutants that included both these types of materials as well as unusual components such as
- 282 unexploded ordinances. (See Supplementary materials.)



283



287 In addition, we estimated the number of socially vulnerable households in proximity to 288 these sites that may be at risk of exposure from potential changes in groundwater level. 289 Following the method of a previous study of contaminated sites vulnerable to surface inundation 290 (Carter and Kalman 2020), we defined households within three different radii (one, three, and 291 five kilometers) of Superfund sites as potentially at risk. We described these households using 292 the American Community Survey from the US Census Bureau (US Census Bureau, 2022), which 293 defined households living in extreme poverty as those that earn less than \$30,000 per year. To 294 identify communities of color in the risk area, we subtracted the number of "white alone" 295 individuals from the total number of people living in each census block group. For both groups 296 (people of color or people living in poverty) we identified the total number of people and the

297 percentage relative to the population living in the buffer zone by replicating methods used by 208 Carter and Kalman (2020)

- 298 Carter and Kalman (2020).
  - 2.3 San Francisco Bay Comparison with Superfund and State-Managed Sites

We used a similar study of the San Francisco Bay Area to estimate the number of statemanaged contaminated sites that may be exposed to rising coastal groundwater, in addition to Superfund sites. State-managed sites are not necessarily less hazardous than federal Superfund sites and are far more numerous. A database of Superfund sites alone does not include thousands of contaminated sites in the San Francisco Bay Area, and a similar situation exists in other regions. It may be possible to establish a more realistic initial estimate of the number of exposed contaminated sites in US coastal areas using a ratio of Superfund sites to state-managed sites.

307

299

DTSC (Envirostor)		WRCB (GeoTracker)	
Included	Excluded	Included	Excluded
Border Zone/Haz Waste Evaluation	Calmortgage	NPDES	Sampling Point
Corrective Action		Cleanup Program Site	Non-Case
Evaluation		Land Disposal Site	UIC
Federal Superfund		LUST Cleanup Site	Project
Historical		Military Cleanup Site	Well Stimulation Project
Military Evaluation		Military Privatized Site	
School Clean Up		Military UST Site	
School Investigation		Other Oil and Gas	
State Response			
Tiered Permit			
Voluntary Cleanup			

308

309	<b>Table 1.</b> The types of contaminated sites included in this study are listed here. We included all
310	sites that currently have or have had contamination, or are being investigated for contamination,
311	using categories from the two California databases maintained by DTSC (Department of Toxic

312 Substance Control) and WRCB (Water Resources Control Board).

313

A comprehensive set of contaminated sites was prepared by combining the sites from the two separate publicly available statewide databases of contaminated sites: Envirostor, which is

316 managed by California Environmental Protection Agency (CalEPA), Department of Toxic

317 Substance Control (DTSC), and GeoTracker, which is developed and maintained by the CalEPA

318 State Water Resources Control Board (SWRCB) (CA WRCB 2023). Most sites listed in these

- 319 two databases are unique, but for historical reasons related to the timing of when a given site was
- 320 regulated by a prior agency, a small number are contained in both databases. We removed
- 321 duplicate site listings or location errors from the data sets, then combined the data sets to create
- 322 the first comprehensive map of contaminated sites in the region. Because some sites may be 323 closed administratively but still contain residual contamination, we included both active and
- 324 closed sites in this combined dataset. Former military, landfill, industrial and commercial sites
- 325 are included on this list that contain radioisotopes, volatile organic compounds (VOC's), heavy
- 326 metals, and municipal household wastes, among other contaminants. The sites range in size from
- 327 multiple hectares to a single parcel with a leaky underground fuel tank.

328 We used current and projected groundwater head from Befus et al (2020) to represent 329 both current and future groundwater levels in the San Francisco Bay Area, with SLR scenarios of 330 0.5 m and 1.0 m. Befus et al (2020) produced groundwater elevation maps for a range of 331 hydraulic conductivities (0.1 Kh, 1.0 Kh and 10.0 Kh). We selected the value of 1.0 Kh to 332 represent what may be an average condition in a heterogeneous geomorphic region that includes 333 artificial fill and compacted road and railroad beds, as well as Holocene alluvial fans, sand dunes 334 and paleochannels. The modeled groundwater surfaces in Befus et al (2020) indicate that 335 approximately twice as much land area in the Bay Area will be affected by rising groundwater in comparison to direct inundation with 1.0 m of SLR. In eight of the nine counties of the region, 336 337 more land area will be affected by rising groundwater than by direct inundation in both SLR 338 scenarios. Santa Clara County is the only part of the San Francisco Bay Area where more land 339 will be affected by direct inundation than by rising groundwater in both SLR scenarios (see 340 Supplemental materials).

341 Next, we identified the contaminated sites in this combined dataset that are currently 342 located over shallow groundwater. We defined shallow groundwater as groundwater within 343 approximately 3 m of the surface for two reasons: first, additional sediment has been placed on 344 many of the larger contaminated sites, without raising the remaining soil contamination which 345 remains close to the saturated zone; and second, because sanitary sewer pipes and other utilities 346 are typically located within 3 m of the ground surface. Pipes and trenches create exposure 347 pathways that can make building occupants vulnerable to VOC mobilization and health impacts 348 (Roghani et al 2021).

349 We limited our analysis to areas where at least 0.10 m of groundwater rise is predicted in 350 either the 0.5m or 1.0m SLR scenarios (Befus et al 2020). Given the relatively low resolution of 351 the groundwater surface produced by their statewide study, we questioned the significance of 352 very small changes in elevation and omitted those areas from our defined zones of rising 353 groundwater.

354 Our final question for comparison with the national results was whether socially 355 vulnerable communities are more exposed to risks from this emerging hazard than the general 356 population of the San Francisco Bay Area. In a recent study, the San Francisco Bay Conservation 357 and Development Commission (BCDC) assigned ordinal social vulnerability scores to census 358 blocks across the entire region using variables such as income, education, and race (BCDC 359 2020). We used Kendall's tau to test the strength of the association between the number of 360 exposed contaminated sites per hectare and BCDC's four ranked categories of social

361 vulnerability using IBM SPSS Statistics (version 27).

#### 362 **3 Results**

363 3.1 National Assessment of Exposed Contaminated Sites

364 Table 2 summarizes the data for all 23 coastal states in the contiguous United States. The 365 table shows the total coastal area for each state we identified as at risk, the number of NPL sites that intersect with the at-risk coastal area, the area of those NPL sites, and the ratio of the area of 366 367 Superfund sites to the area of coastal lowlands we defined as at risk (i.e., less than 10 meters above mean sea level in elevation). Across the 23 coastal states in the contiguous United States, 368 369 we found that approximately 18 million hectares of land are at elevations low enough to 370 potentially be impacted by groundwater rise along coastal corridors.

371 Louisiana, Florida, and Texas have the greatest amount of land area at risk with 4.5, 3.8, 372 and 2.3 million hectares, respectively. A total of 326 Superfund sites are completely or partially 373 contained within this at-risk area, covering nearly 300,000 hectares in all 23 coastal states 374 studied. When the land area of at-risk contaminated soils on Superfund sites is compared to the total area of at-risk coastal land, California, New York, and New Hampshire have the highest 375 376 proportional risks (24%, 21%, and 13% respectively). Southern and Gulf coast states have the 377 lowest risk, since South Carolina, Mississippi, Texas, Georgia and Louisiana all have less than 378 0.5% of their at-risk coastal land included in Superfund contamination area. With the exception 379 of Mississippi, this is partly due to these states' large areas of low-elevation coastal land.

380

State	EPA Region	Coastal SLR Risk Area (Hectares)	Number of Superfund Sites at risk of SLR	Superfund Site Area (Hectares)	Percentage Superfund Area / Coastal SLR Risk Area
Maine	1	123,584	3	1,421	1.15%
New Hampshire	1	13,488	1	1,699	12.60%
Massachusetts	1	160,854	8	10,299	6.40%
Rhode Island	1	30,563	3	1,156	3.78%
Connecticut	1	61,785	2	374	0.61%
New York	2	178,156	19	37,121	20.84%
New Jersey	2	382,655	54	12,961	3.39%
Delaware	3	198,157	16	1,773	0.89%
Pennsylvania	3	25,184	9	177	0.70%
Maryland	3	716,998	11	20,971	2.92%
District of Columbia	3	4,415	1	31	0.71%
Virginia	3	823,338	17	41,659	5.06%
North Carolina	4	1,806,062	13	46,485	2.57%
South Carolina	4	1,188,518	8	3,230	0.27%
Georgia	4	703,006	4	387	0.06%
Florida	4	3,813,313	51	18,854	0.49%
Alabama	4	265,172	5	1,907	0.72%

#### manuscript submitted to Earth's Future

Mississippi	4	213,801	2	450	0.21%
Louisiana	6	4,465,579	19	819	0.02%
Texas	6	2,257,767	23	3,500	0.16%
California	9	293,723	27	70,520	24.01%
Oregon	10	162,387	6	3,587	2.21%
Washington	10	208,551	24	16,186	7.76%
TOTAL:		18,097,055	326	295,568	

381

Table 2. This table lists the number of exposed Superfund sites by US EPA region, along with the hectares of each coastal risk area, number of superfund sites in each coastal risk area, the area of contaminated land at each Superfund site, and the proportion of Superfund land area to coastal risk area for each of the 23 coastal states in the United States (excluding Alaska and Hawai'i). Total summary numbers are provided at the bottom of the table. The states are listed starting in the northeast and moving south, then west, then north, around the coastline of the contiguous United States. States are clustered by US EPA region.

389 Superfund site exposure for socially vulnerable populations is shown in Table 3. For each 390 US state and three buffer distances from Superfund boundaries (1km, 3km, and 5km), Table 3 391 contains the percent of the total exposed population that is non-white (left) and living in extreme 392 poverty (right). Colors highlight low percentages (blue) and high percentages (red) relative to the 393 range within the study area. A smaller percentage of people who may be exposed are non-white 394 in the US Northeast (Maine, New Hampshire, Massachusetts, Rhode Island & Connecticut). Our 395 results show that in the District of Columbia, Virginia, Georgia, Mississippi, Louisiana, and 396 California, higher percentages of residents who may be exposed to these risks are non-white, at 397 more than 50%.

398 People in extreme poverty represent a lower percentage of those who may be exposed to 399 risks from rising groundwater near Superfund sites, relative to the percentages of non-white 400 residents. The highest percentage of people in extreme poverty who may be exposed is 22% 401 (Georgia), while for non-white residents it is 73% (District of Columbia). Except for Texas, 402 southern US states have higher percentages of people in extreme poverty who may be exposed to 403 risks of rising groundwater at Superfund sites. West coast states have a relatively low percentage 404 of people in extreme poverty who may be exposed to the risk of rising groundwater at Superfund 405 sites.

	% of people of color			% of people in poverty		
State	1km	3km	5km	1km	3km	5km
Maine	12%	9%	7%	12%	11%	10%
New Hampshire	9%	9%	9%	11%	8%	8%
Massachusetts	29%	25%	24%	14%	11%	9%
Rhode Island	26%	15%	13%	10%	8%	7%
Connecticut	19%	27%	31%	5%	7%	8%
New York	37%	42%	44%	9%	10%	10%
New Jersey	40%	46%	46%	10%	9%	9%
Delaware	36%	40%	42%	11%	9%	9%

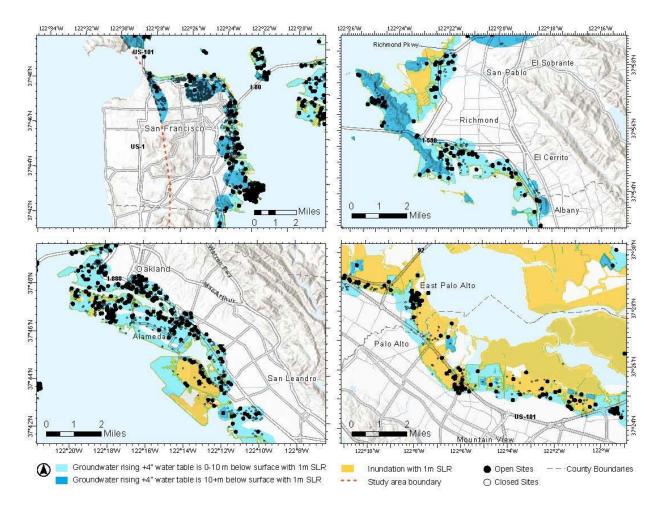
Pennsylvania	64%	47%	47%	15%	11%	11%
Maryland	40%	45%	50%	8%	9%	10%
District of Columbia	54%	64%	73%	9%	10%	11%
Virginia	67%	62%	59%	13%	12%	11%
North Carolina	32%	34%	34%	7%	10%	10%
South Carolina	41%	44%	44%	11%	13%	12%
Georgia	51%	64%	62%	22%	17%	17%
Florida	49%	48%	46%	16%	14%	13%
Alabama	29%	35%	40%	13%	14%	14%
Mississippi	59%	64%	57%	17%	17%	16%
Louisiana	60%	55%	55%	21%	18%	17%
Texas	34%	35%	35%	9%	9%	9%
California	55%	55%	55%	4%	4%	5%
Oregon	23%	23%	22%	6%	7%	7%
Washington	34%	39%	37%	7%	8%	8%

406 Table 3. Exposure of socially vulnerable residents summarized by state and by distance from 407 Superfund sites. The percent of the exposed population that is non-white (left) or living in 408 extreme poverty (right) is represented within 1km, 3km, and 5km buffer distances from at-risk 409 Superfund sites. States are listed starting in the northeast and moving south, then west, then north 410 around the contiguous United States. States are clustered by EPA region. Colors indicate upper 411 and lower ends of the percentage ranges, with blue signifying relatively low percentages and red 412

representing relatively high percentages.

#### 413 3.2 San Francisco Bay Area Comparison: Superfund and State-Managed Sites

414 We found 15 contaminated Superfund sites within the San Francisco Bay Area that may 415 be exposed to GWR in the 1.0m SLR scenario. We identified an additional 5,282 state-managed sites in that same scenario where soil and/or groundwater currently or formerly contained 416 417 VOC's, heavy metals, radioisotopes, and other contaminant substances, establishing a ratio of 418 1:352 (Superfund sites to state-managed sites) in the San Francisco Bay region. Figure 3 419 provides examples of the density and location of contaminated sites in this urbanized area.



420

Figure 3. Maps of selected cities in the San Francisco Bay Area with Richmond at upper right,
Palo Alto at lower right, Oakland at lower left, and San Francisco at upper left. Known
contaminated sites (empty circles are open sites, filled black circles are closed sites) are shown
where groundwater is predicted to rise (blue) or inundation is predicted to occur (yellow) in the
1.0 m SLR scenario.

426 427

**SF Bay Area County** 0.5 m SLR 1.0 m SLR Alameda 339 (745) 425 (954) Contra Costa 191 (233) 245 (344) 79 (183) 88 (225) Marin Napa 24 (133) 27 (168) 225 (535) 237 (839) San Francisco

San Mateo	156 (343)	211 (552)
Santa Clara	100 (121)	127 (172)
Solano	81 (364)	91 (448)
Sonoma	20 (92)	29 (115)
Total by status	1,215 (2,749)	1,480 (3,817)
Total	3,964	5,297

428 **Table 4.** Summary by county of the number and status of contaminated sites, including

429 Superfund sites, that are located over rising groundwater or inundated under the 0.5m and 1.0m

430 SLR scenarios. The number of closed sites is shown in parentheses, following the number of

431 open sites. The final total includes both open and closed sites.

432 Next, we estimated the number and density of potentially exposed sites in census blocks
433 by overlaying the map of contaminated sites exposed to rising groundwater onto a map of census
434 blocks, characterized by relative social vulnerability (BCDC 2020) (Table 5).

435

		-		Blocks	
549	368	280	142	165	
1,627	805	724	406	181	
177,790	55,860	8,363	5,010	7,586	
2,176	1,173	1,004	548	346	
0.012	0.021	0.120	0.110	N/A	
	1,627 177,790 2,176	1,627       805         177,790       55,860         2,176       1,173	1,627805724177,79055,8608,3632,1761,1731,004	1,627805724406177,79055,8608,3635,0102,1761,1731,004548	5493682801421651,627805724406181177,79055,8608,3635,0107,5862,1761,1731,004548346

#### Low SOVI Moderate SOVI High SOVI Highest SOVI Unrated Census Blocks

436 **Table 5.** Number and density of contaminated sites that may be exposed to rising groundwater

437 with 1.0 m SLR within census blocks characterized by low, medium, high and highest social

438 vulnerability (BCDC 2020). Site density includes both open and closed sites. A total of 165 open

439 sites are in census blocks with no documented residents (115) or in open water (50) with this

440 SLR scenario.

441 To test the relationship between the density of contaminated sites and social

442 vulnerability, we first combined the two top social vulnerability categories ("high" and

443 "highest") to obtain a land area for the upper rank with the same order of magnitude as the area

444 for "moderate" SOVI. Using Kendall's tau (IBM SPSS Statistics, v. 27), we found that the

445 correlation between the density of contaminated sites and increasing social vulnerability was

positive and significant at the 0.01 level. Using only the density of open sites compared to these

same three categories of social vulnerability, we found that the correlation was still positive and

significant at the 0.01 level, suggesting that the process of remediating contaminated sites has not

449 proceeded more quickly in areas with higher social vulnerability.

#### 450 **5 Conclusions**

451 5.1 Implications of our results

452 A synthetic conceptual model is needed for contaminated sites that represents the full 453 range of hazards in a changing climate including rising groundwater, changes in groundwater 454 salinity and other chemical characteristics, and potential changes in groundwater flow direction. 455 In the heterogeneous conditions of actual urban areas, groundwater flow directions, elevation and 456 salinity will be altered by artificial soils, utility trenches, and pumping that occurs to protect 457 subsurface structures from rising groundwater. Since contaminated soils will be impacted by 458 physical and chemical changes at scales beyond the original parcel where contamination 459 occurred, district-scale modeling will be needed to identify potential interactions and protect 460 human and ecosystem health.

In our national assessment we found that potential exposure of Superfund sites to increases in groundwater elevations is widespread on the coast of the contiguous US. California, New York, and New Hampshire appear to have the highest proportional risks when we considered the area of exposed contaminated land vs. the total area of exposed low-elevation land in those states. California's elevated statewide risk of sea level rise impacts was also identified in a previous national study of coastal flooding that did not consider rising groundwater (Summers, Lamper and Buck 2021).

468 Our results for the contiguous US suggest that more low-income and non-white
469 Americans may be exposed to the hazards associated with rising groundwater at Superfund sites.
470 This is likely to be a result of historical and contemporary policies and market dynamics that
471 influence housing choices and job opportunities in those communities, along with policy
472 decisions that led to the geographic concentration of polluting land uses (Bullard 1994).

We found a ratio of at-risk Superfund sites (15) to potentially exposed state-managed sites in the San Francisco Bay Area (5,282) of 1:352. If this ratio is representative of other coastal regions, the total number of contaminated sites potentially exposed to rising groundwater in the contiguous US may be 114,752 or more. Given California's elevated exposure relative to other states, this estimate may be high. However, it is critical that all sites with potential exposure are identified so that trust can be built with local communities, as sites would be removed from the list as local investigations proceed instead of added.

As our San Francisco Bay case also demonstrated, analytical overlay methods that
combine a topographic surface and a groundwater surface to identify exposed sites are
inadequate where fill materials have been mounded on top of the original contaminated soils
unless shallow groundwater is defined as 3m below the ground surface. This omission of
potentially exposed sites would overlook most landfill sites, for example, as well as heavily
contaminated military or industrial sites where the ground has been raised to create a higher
elevation surface for new urban development. This type of raised surface is currently planned as

487 a base for dense new housing at highly contaminated shoreline sites in Richmond and San 488 Francisco, California.

489 In the San Francisco Bay area, SLR and GWR modeling by Befus et al (2020) predicts that twice as much land will be affected by rising groundwater as the area that will be inundated 490 491 directly by SLR. Other low-lying regions around the US and the world may experience similar 492 proportional impacts, although this is mediated by geology and vertical land motion. In addition 493 to soil contamination, underground infrastructure and building foundations in these regions are 494 likely to be impacted by both fresh and saline groundwater. In contexts where inspections are 495 rare and maintenance is often deferred, this could lead to harmful health impacts and risks of 496 system failures.

497 The number of contaminated sites that may be exposed to rising groundwater in the San 498 Francisco Bay case was higher than we expected. The potential for contaminants to be mobilized 499 at these sites represents an important new public health hazard, in addition to the potential for 500 negative impacts on nearshore water quality and ecosystems with federally threatened and 501 endangered species, and on important fish and shellfish resources.

502 Our work indicates that policy changes will be needed at the state and federal levels in 503 the US. In 2022, the San Francisco Regional Water Quality Control Board (RWQCB), a district 504 of the State WRCB, changed its policy to require landfill operators to consider rising coastal 505 groundwater. California's DTSC changed its statewide policy to require managers of contaminated sites to consider rising coastal groundwater as an impact on site conditions in early 506 507 2023, without specifying how. The US Environmental Protection Agency (EPA) has committed 508 to considering the most recent climate science as it reviews site remedies every five years but has 509 not specifically described how these reviews will identify risks or prepare for rising coastal 510 groundwater (US EPA 2021). These changes must become more specific by requiring the 511 necessary scientific investigations at the sub-regional and district scales and accelerating the 512

- review of existing site remedies.
- 513 5.2 Additional Research Needs

514 The results of our analyses provide an initial estimate of the number and area of 515 Superfund sites threatened by changes in groundwater elevation in US coastal regions and 516 indicate that the percentage of socially vulnerable residents near these sites is often high. Our 517 rapid assessment method for the national scale and our use of statewide groundwater modeling 518 projections in the San Francisco Bay area both point to the need for many localized studies to 519 assess exposure risks more accurately using higher-resolution process-based models of 520 groundwater elevation and dynamics. Our method does not account for specific ways in which 521 groundwater elevations may change in heterogeneous settings, including different soil contexts 522 and recharge conditions (Werner and Simmons 2009, Michael et al 2013). Much future work is 523 needed to couple high-resolution groundwater and surface water models to simulate and identify 524 thresholds of impact in sea-level rise scenarios using the regional projections of Sweet et al. 525 (2022) or even more accurate local projections and offer higher-resolution representations of the 526 dynamic threat of rising groundwater.

527 Studies that take advantage of continuous projections of SLR over time instead of single-528 year scenarios will provide further insight into the timing and progression of exposure to GWR 529 at contaminated sites, highlighting temporal thresholds in exposure risks. These results could

be help decision makers at the federal, regional, state and local levels identify sites that should be

- 531 prioritized for protective investment or full clean-up actions. Hydraulic contaminant control
- 532 measures, including a range of physical and chemical, active and passive approaches, will be
- necessary to control both groundwater and contaminant occurrence and migration. These control strategies will need to be coordinated at a sub-regional scale to avoid unexpected interactions and
- 534 strategies will need to be coordinated at a sub-regional scale to avoid unexpected interactions and 535 will require a change from current practice, in which both modeling and protective actions are
- 535 will require a change from current practice, in which both modeling and protective 536 considered on a parcel-by-parcel basis.
- 537 Future actions may also require cap and barrier materials that are durable and resilient 538 under conditions of sea water inundation for periods that may be temporary or permanent. In 539 cases where in situ management costs or technical challenges cannot be met, removal of 540 contaminated soil and treatment or off-site sequestration may be required. These actions can 541 create new environmental justice impacts that result from transport or landfilling. In any of these 542 situations, new costs will impact owners and new funding mechanisms for remediation and 543 management are likely to be required, particularly in locations with a high density of sites or 544 extensive areas of contamination.
- 545 The most important methodological insight we gained is that regional or national-scale 546 overlay analyses must use a greater groundwater depth as the threshold for inundation of 547 contamination in soil because additional fill has often been mounded on contaminated sites, 548 altering the topographic surface. The depth of the contaminants in the soil and the relationship of 549 that depth to the saturated zone are the essential variables for process-based studies that consider 550 the potential for rising groundwater to mobilize soil contaminants. Obtaining depth-to-551 contaminant information is much more difficult and may require investigators to automate 552 acquisition of data from the extensive reports that exist for thousands of sites in each US region. 553 Future studies will also benefit from automated methods for extrapolating contaminant 554 movement, and spatial data for the locations of sewer pipes and other utility trenches that could 555 allow VOC's to enter indoor air. These data acquisition challenges must be overcome to 556 undertake more accurate process-based modeling at sub-regional scales, which is essential for 557 identifying serious local health risks from contaminant inundation, mobilization, and flow 558 direction in complex urbanized coastal systems.

# 559 Acknowledgments

560 We wish to acknowledge Ian Utz at the California Department of Toxic Substance 561 Control for sharing some of his geo-referenced data with us, and for helpful discussions early in the development of this paper, along with the members of the Richmond South Shoreline 562 563 Citizens Advisory Group, who shared information with us and helped us understand the history 564 of their sites in California. We would also like to thank staff at the California Water Resources 565 Control Board for helping us access and understand their dataset, GeoTracker, and for 566 discussions early in the development of this paper. Jacob Carter and Casey Kalman from Union of Concerned Scientists provided helpful discussions in the development of the national scale 567 568 analysis. Caroline Lindquist was supported during part of this project by the UC Berkeley Bay 569 Area Water Quality Fellowship, and the Excellence in Landscape Design Award from the UC 570 Berkeley Department of Landscape Architecture and Environmental Planning. Funding for Forest Cook was provided by Utah State University's Department of Landscape Architecture and 571 Environmental Planning. We have no financial conflicts of interest with the results of this paper. 572

#### 573

#### 574 **Open Research**

575 US Census data used in this paper are available online (US Census Bureau, 2021). Digital 576 Elevation Models used to identify exposed sites at the US national scale were obtained from 577 NOAA (Office of Coastal Management, 2016). Superfund program site boundaries were 578 produced by (U.S. Environmental Protection Agency, 2023). The data layers are stored in the 579 DataDryad repository (doi:10.6078/D15X4N, no registration is required) along with all 580 Geographic Information System (ArcGIS) files used in the analyses. Model output from Befus et 581 al (2020) predicting current and future groundwater elevations in the San Francisco Bay Area is 582 available through the US Geological Survey link in the references below (USGS 2020). Data 583 processing for Superfund data occurred in the RStudio programming environment using 584 (RStudio 2020). Maps and figures were made with ArcGIS, produced by ESRI, Inc. (ESRI 585 2022), or Adobe Illustrator (Adobe 2019). 586 587 References 588 Abarca, E., Karam, H., Hemond, H. F., & Harvey, C. F. (2013). Transient groundwater dynamics 589 in a coastal aquifer: The effects of tides, the lunar cycle, and the beach profile: 590 TRANSIENT GROUNDWATER DYNAMICS IN A COASTAL AQUIFER. Water 591 Resources Research, 49(5), 2473–2488. https://doi.org/10.1002/wrcr.20075

592

Abdelhafez, M. A., Ellingwood, B., & Mahmoud, H. (2022). Hidden costs to building
foundations due to sea level rise in a changing climate. *Scientific reports*, *12*(1), 14020.

595

Acosta, J. A., Jansen, B., Kalbitz, K., Faz, A., & Martínez-Martínez, S. (2011). Salinity increases
 mobility of heavy metals in soils. Chemosphere, 85(8), 1318–1324.
 <a href="https://doi.org/10.1016/j.chemosphere.2011.07.046">https://doi.org/10.1016/j.chemosphere.2011.07.046</a>

599

600 Adobe Inc. (2019). *Adobe Illustrator*. Retrieved from https://adobe.com/products/illustrator

601

Befus, K. M., Barnard, P. L., Hoover, D. J., Finzi Hart, J. A., & Voss, C. I. (2020). Increasing
threat of coastal groundwater hazards from sea-level rise in California. Nature Climate
Change, 10(10), 946–952. <u>https://doi.org/10.1038/s41558-020-0874-1</u>

605

Biswas, B., Qi, F., Biswas, J., Wijayawardena, A., Khan, M., & Naidu, R. (2018). The fate of
chemical pollutants with soil properties and processes in the climate change paradigm—
A review. Soil Systems, 2, 51. https://doi.org/10.3390/soilsystems2030051

609

610 611 612	Bjerklie, D., Mullaney, J., Stone, J., Skinner, B., & Ramlow, M. (2012). Preliminary Investigation of the Effects of Sea-Level Rise on Groundwater Levels in New Haven, Connecticut (Open-File Report No. 2012–1085). US Geological Survey.
613	
614 615	Bullard, R. D. (1994). Overcoming racism in environmental decision making. Environment, 36(4), 10. doi:10.1080/00139157.1994.9929997.
616	
617 618 619	Burman, E., Mulvaney, K., Merrill, N. H., Bradley, M., & Wigand, C. (2022). Hazardous and Contaminated Sites within Salt Marsh Migration Corridors in Rhode Island, USA. SSRN Electronic Journal. <u>https://doi.org/10.2139/ssrn.4253660</u>
620	
621 622	California Department of Toxic Substance Control (DTSC), (2022). Envirostor. https://www.envirostor.dtsc.ca.gov/public/data_download (accessed April 30, 2023)
623	
624 625 626	California Department of Toxic Substance Control (DTSC), (2023). Sea level rise guidance to DTSC project managers for cleanup activities (DRAFT: For immediate use and public comment). <u>https://dtsc.ca.gov/climate-change/</u>
627	
628 629	California Water Resources Control Board (WRCB), (2022). GeoTracker. https://geotracker.waterboards.ca.gov/datadownload (accessed April 30, 2023)
630	
631 632	Carter, J., & Kalman, C. (2020). A Toxic Relationship: Extreme Coastal Flooding and Superfund Sites. Union of Concerned Scientists. <u>www.ucsusa.org/resources/toxic-relationship</u>
633	
634 635 636	Chung, J., Chung, J. H., & Townsend, T. G. (2019). Approximation of transient redox boundary conditions: Its application to numerical analysis of iron plume migration near landfills. Environmental Earth Sciences, 78(24), 711. <u>https://doi.org/10.1007/s12665-019-8683-4</u>
637	
638 639 640	Comprehensive Environmental Response, Compensation, and Liability Act, 42 U.S.C. chapter 103 (1980). <u>https://www.govinfo.gov/app/details/USCODE-2021-title42/USCODE-2</u>
641	
642 643 644	de Louw, P. G. B., Vandenbohede, A., Werner, A. D., & Oude Essink, G. H. P. (2013). Natural saltwater upconing by preferential groundwater discharge through boils. Journal of Hydrology, 490, 74–87. <u>https://doi.org/10.1016/j.jhydrol.2013.03.025</u>
645	
646 647	dela Cruz AL, Cook RL, Dellinger B, Lomnicki SM, Donnelly KC, Kelley MA, Cosgriff D. (2014) Assessment of environmentally persistent free radicals in soils and sediments

648 649	from three Superfund sites. Environ Sci Process Impacts. 16(1):44-52. doi: 10.1039/c3em00428g. PMID: 24244947; PMCID: PMC3907510.
650	
651 652	Esri Inc. (2022). ArcGIS Pro (Version 3.0). Esri Inc. https://www.esri.com/en- us/arcgis/products/arcgis-pro/overview
653	
654 655 656	Gonneea, M. E., Mulligan, A. E., & Charette, M. A. (2013). Climate-driven sea level anomalies modulate coastal groundwater dynamics and discharge. Geophysical Research Letters, 40(11), 2701–2706. <u>https://doi.org/10.1002/grl.50192</u>
657	
658 659 660	Habel, S., Fletcher, C. H., Anderson, T. R., & Thompson, P. R. (2020). Sea-Level Rise Induced Multi-Mechanism Flooding and Contribution to Urban Infrastructure Failure. Scientific Reports, 10(1), 3796. <u>https://doi.org/10.1038/s41598-020-60762-4</u>
661	
662 663 664	Habel, S., Fletcher, C. H., Rotzoll, K., & El-Kadi, A. I. (2017). Development of a model to simulate groundwater inundation induced by sea-level rise and high tides in Honolulu, Hawaii. Water Research, 114, 122–134. <u>https://doi.org/10.1016/j.watres.2017.02.035</u>
665	
666 667 668	Hadley, P. W., & Newell, C. (2014). The New Potential for Understanding Groundwater Contaminant Transport: P.W. Hadley and C. Newell. Groundwater, 52(2), 174–186. <u>https://doi.org/10.1111/gwat.12135</u>
669	
670 671 672	<ul> <li>Hadley, P. W., Arulanantham, R., &amp; Gandhi, D. (2015a). California's Low-Threat LUFT Site Closure Policy: Looking Forward: California's Low-Threat LUFT Site Closure Policy: Looking Forward. Remediation Journal, 25(2), 9–33. https://doi.org/10.1002/rem.21421</li> </ul>
673	
674 675 676 677	<ul> <li>Hadley, P. W., Arulanantham, R., &amp; Gandhi, D. (2015b). Yardsticks to Integrate Risk</li> <li>Assessment, Risk Management, and Groundwater Remediation: Yardsticks to Integrate</li> <li>Risk Assessment, Risk Management, and Groundwater Remediation. Remediation</li> <li>Journal, 25(3), 9–30. <u>https://doi.org/10.1002/rem.21430</u></li> </ul>
678	
679 680 681 682 683 684 685	<ul> <li>Hirschfeld, D., Behar, D., Nicholls, R. J., Cahill, N., James, T., Horton, B. P., Portman, M. E., Bell, R., Campo, M., Esteban, M., Goble, B., Rahman, M., Addo, K. A., Chundeli, F. A., Aunger, M., Babitsky, O., Beal, A., Boyle, R., Fang, J., Yokoki, H. (2023). Global survey shows planners use widely varying sea-level rise projections for coastal adaptation. Communications Earth &amp; Environment, 4(1), 102. <u>https://doi.org/10.1038/s43247-023-00703-x</u></li> </ul>
005	

686 687 688	Hirschfeld, D., Hill, K. E., & Plane, E. (2021). Adapting to sea level rise: Insights from a new evaluation framework of physical design projects. <i>Coastal Management</i> , 49(6), 636–661. <u>https://doi.org/10.1080/08920753.2021.1967563</u>
689 690 691	Hou, D. (2020). Sustainable remediation of contaminated soil and groundwater (1st ed.). Elsevier. <u>https://www.envirostor.dtsc.ca.gov/public/data_download</u>
692	
693 694 695	Hummel, M. A., Berry, M. S., & Stacey, M. T. (2018). Sea Level Rise Impacts on Wastewater Treatment Systems Along the U.S. Coasts. Earth's Future, 6(4), 622–633. <u>https://doi.org/10.1002/2017EF000805</u>
696	
697 698 699	Jakovovic, D., Werner, A. D., de Louw, P. G. B., Post, V. E. A., & Morgan, L. K. (2016). Saltwater upconing zone of influence. Advances in Water Resources, 94, 75–86. <u>https://doi.org/10.1016/j.advwatres.2016.05.003</u>
<ul> <li>700</li> <li>701</li> <li>702</li> <li>703</li> <li>704</li> </ul>	Kim, Y., Yoon, H., & Lee, SH. (2019). Freshwater-salt water interface dynamics during pumping tests. Acque Sotterranee - Italian Journal of Groundwater. <u>https://doi.org/10.7343/as-2019-381</u>
705 706 707	Michael, H., Russoniello, C., & Byron, L. (2013). Global assessment of vulnerability to sea-level rise in topography-limited and recharge-limited coastal groundwater systems. Water Resources Research. https://doi.org/doi: 10.1002/wrcr.20213
708 709 710 711 712	Muniruzzaman, M., & Rolle, M. (2015). Impact of multicomponent ionic transport on pH fronts propagation in saturated porous media: MULTICOMPONENT IONIC TRANSPORT AND PH FRONTS. Water Resources Research, 51(8), 6739–6755. <u>https://doi.org/10.1002/2015WR017134</u>
<ul> <li>713</li> <li>714</li> <li>715</li> <li>716</li> <li>717</li> </ul>	Noi, L. V. T., & Nitivattananon, V. (2015). Assessment of vulnerabilities to climate change for urban water and wastewater infrastructure management: Case study in Dong Nai river basin, Vietnam. Environmental Development, 16, 119–137. <u>https://doi.org/10.1016/j.envdev.2015.06.014</u>
718	
719 720 721	Office for Coastal Management (2016). NOAA Office for Coastal Management Sea Level Rise Data: 1-10 ft Sea Level Rise Inundation Extent [Dataset]. <u>https://www.fisheries.noaa.gov/inport/item/48106</u>
722	
723 724	Palermo, M. (1998). Design considerations for in-situ capping of contaminated sediments. Water Science and Technology, 37(6–7), 315–321.

725	
726 727 728 729	Parkinson, R. W. (2021). Speculation on the role of sea-level rise in the tragic collapse of the Surfside condominium (Miami Beach, Florida U.S.A.) was a bellwether moment for coastal zone management practitioners. Ocean & Coastal Management, 215, 105968. <u>https://doi.org/10.1016/j.ocecoaman.2021.105968</u>
730	
731 732 733	Peakall, D., & Burger, J. (2003). Methodologies for assessing exposure to metals: Speciation, bioavailability of metals, and ecological host factors. Ecotoxicology and Environmental Safety, 56(1), 110–121. <u>https://doi.org/10.1016/S0147-6513(03)00055-1</u>
734	
735 736	Plane, E.; Hill, K. (2017), Minimum Depth to Groundwater for Coastal Alameda County, Dryad, Dataset, <u>https://doi.org/10.6078/D1195K</u>
737	
738 739 740	Plane, E., Hill, K., & May, C. (2019). A Rapid Assessment Method to Identify Potential Groundwater Flooding Hotspots as Sea Levels Rise in Coastal Cities. Water, 11(11), 2228. <u>https://doi.org/10.3390/w11112228</u>
741	
742 743 744 745	Pratt, M., Hagedorn, K. and Becker, M., Bram, D., Chou, B., Gaines, A., Rodriguez Noriega, A., Canter, Z. (2022), Modeling of Potential Impact of Sea-Level Rise on Groundwater Contamination Vulnerability in California Coastal Aquifers, CSU COAST Annual Meeting.
746 747	https://www.calstate.edu/Documents/Pratt_CSULB_Presentation_COAST%20Annual%20Me eting.pdf (accessed April 30, 2023)
748	
749 750 751 752	Pu, H., Fox, P. J., Shackelford, C. D., & Qiu, J. (2021). Assessment of Consolidation-Induced Contaminant Transport for In Situ Capping of Subaqueous Contaminated Sediments. Journal of Geotechnical and Geoenvironmental Engineering, 147(8), 04021056. <u>https://doi.org/10.1061/(ASCE)GT.1943-5606.0002564</u>
753	
754 755	RStudio Team (2020). RStudio: Integrated Development for R. RStudio, PBC, Boston, MA URL http://www.rstudio.com/
756	
757 758 759	Rahimi, R., Tavakol-Davani, H., Graves, C., Gomez, A., & Fazel Valipour, M. (2020). Compound Inundation Impacts of Coastal Climate Change: Sea-Level Rise, Groundwater Rise, and Coastal Precipitation. Water, 12(10), 2776. <u>https://doi.org/10.3390/w12102776</u>
760	
761 762 763 764	Roghani, M., Li, Y., Rezaei, N., Robinson, A., Shirazi, E., & Pennell, K. G. (2021). Modeling Fate and Transport of Volatile Organic Compounds (VOCs) Inside Sewer Systems. Groundwater Monitoring & Remediation, 41(2), 112–121. <u>https://doi.org/10.1111/gwmr.12449</u>

765	
766 767 768	Rotzoll, K., & Fletcher, C. H. (2012). Assessment of groundwater inundation as a consequence of sea-level rise. Nature Climate Change, 3(5), 477–481. https://doi.org/10.1038/nclimate1725
769	
770 771 772	San Francisco Bay Conservation and Development Commission (2020). Vulnerable Communities, Ch. 2.6, in <i>Adapting to Rising Tides</i> , pp. 177-228. https://gis.data.cnra.ca.gov/datasets/BCDC::community-vulnerability-bcdc-2020/about
773	
774 775 776 777	Sangsefidi, Y., Bagheri, K., Davani, H., & Merrifield, M. (2023). Data analysis and integrated modeling of compound flooding impacts on coastal drainage infrastructure under a changing climate. Journal of Hydrology, 616, 128823. <u>https://doi.org/10.1016/j.jhydrol.2022.128823</u>
778	
779 780 781 782 783	Sbarbati, C., Barbieri, M., Barron, A., Bostick, B., Colombani, N., Mastrocicco, M., Prommer, H., Passaretti, S., Zheng, Y., & Petitta, M. (2020). Redox Dependent Arsenic Occurrence and Partitioning in an Industrial Coastal Aquifer: Evidence from High Spatial Resolution Characterization of Groundwater and Sediments. Water, 12(10), 2932. <u>https://doi.org/10.3390/w12102932</u>
784	
785 786 787 788	Sheng, Y., Li, G., Dong, H., Liu, Y., Ma, L., Yang, M., Liu, Y., Liu, J., Deng, S., & Zhang, D. (2021). Distinct assembly processes shape bacterial communities along unsaturated, groundwater fluctuated, and saturated zones. Science of The Total Environment, 761, 143303. <u>https://doi.org/10.1016/j.scitotenv.2020.143303</u>
789	
790 791 792 793 794	Shtienberg, G., Cantu, K., Mischke, S., Sivan, D., Norris, R. D., Rittenour, T. M., Edelman- Furstenberg, Y., Yasur-Landau, A., Sisma-Ventura, G., & Levy, T. E. (2022). Holocene sea-level rise and coastal aquifer interactions: Triggering mechanisms for environmental change and impacts on human settlement patterns at Dor, Israel. Quaternary Science Reviews, 294, 107740. <u>https://doi.org/10.1016/j.quascirev.2022.107740</u>
795	
796 797 798	Summers, K., Lamper, A., & Buck, K. (2021). National Hazards Vulnerability and the Remediation, Restoration and Revitalization of Contaminated Sites—1. Superfund. Environmental Management. <u>https://doi.org/10.1007/s00267-021-01459-w</u>
799	
800 801 802 803 804	<ul> <li>Sweet, W., Hamlington, B., Kopp, R., Weaver, C., Barnard, P. L., Bekaert, D., Brooks, W., Craghan, M., Dusek, G., Frederikse, T., Garner, G., Gaentz, A., Krasting, J., Larour, E., Marcy, D., Marra, J., Obeysekera, J., Osler, M., Pendleton, M., Zuzak, C. (2022). Global and Regional Sea Level Rise Scenarios for the United States (p. 111). National Oceanic and Atmospheric Administration.</li> </ul>

805 806	https://oceanservice.noaa.gov/hazards/sealevelrise/noaa-nos-techrpt01-global-regional-SLR- scenarios-US.pdf
807	
808 809 810 811	Tansel, B., & Zhang, K. (2022). Effects of saltwater intrusion and sea level rise on aging and corrosion rates of iron pipes in water distribution and wastewater collection systems in coastal areas. Journal of Environmental Management, 315, 115153. <u>https://doi.org/10.1016/j.jenvman.2022.115153</u>
812 813 814	U.S. Census Bureau. (2020). 2015-2019 American Community Survey 5-year Public Use Microdata Samples. United States Census Bureau. [Dataset]. https://data.census.gov/cedsi/table
815	
816 817 818	<ul> <li>U.S. EPA (2022). Contaminant of Concern Data for Decision Documents by Media, FYs 1982- 2020. EPA Superfund Data and Reports. [Dataset]. <u>https://semspub.epa.gov/src/document/HQ/401209</u>. Accessed August 19, 2022.</li> </ul>
819	
820 821 822 823	U.S. EPA Office of Land and Emergency Management (OLEM), (2021). Consideration of Climate Resilience in the Superfund Cleanup Process for Non- Federal National Priorities List Sites, OLEM Dir. No. 9355.1-120. <u>https://www.epa.gov/superfund/superfund-climate-resilience</u>
824	
825 826 827	U.S. EPA Office of Land and Emergency Management (2023). FAC - Superfund Site Boundaries (EPA). EPA GeoPlatform Hosted Feature Service. [Dataset]. <u>https://edg.epa.gov/data/PUBLIC/OLEM/OLEM-OSRTI/NPL_Boundaries.zip</u>
828	
829 830 831	Warner, S. D., Bekele, D., Nathanail, C. P., Chadalavada, S., & Naidu, R. (2023). Climate- influenced hydrobiogeochemistry and groundwater remedy design: A review. <i>Remediation</i> , 1–21. <u>https://doi-org.libproxy.berkeley.edu/10.1002/rem.21753</u>
832	
833 834 835	Wen, X., Lu, J., Wu, J., Lin, Y., & Luo, Y. (2019). Influence of coastal groundwater salinization on the distribution and risks of heavy metals. Science of The Total Environment, 652, 267–277. <u>https://doi.org/10.1016/j.scitotenv.2018.10.250</u>
836	
837 838 839	Werner, A. D., Jakovovic, D., & Simmons, C. T. (2009). Experimental observations of saltwater up-coning. Journal of Hydrology, 373(1–2), 230–241. <u>https://doi.org/10.1016/j.jhydrol.2009.05.004</u>
840	
841 842 843	Wondzell, S. M. (2015). Groundwater–surface-water interactions: Perspectives on the development of the science over the last 20 years. Freshwater Science, 34(1), 368–376. <u>https://doi.org/10.1086/679665</u>
844	

845	Yu, X., Luo, L., Hu, P., Tu, X., Chen, X., & Wei, J. (2022). Impacts of sea-level rise on
846	groundwater inundation and river floods under changing climate. Journal of Hydrology,
847	614, 128554. https://doi.org/10.1016/j.jhydrol.2022.128554
0.40	

848

# Yuan, C., Wei, Y., Xu, X., & Cao, X. (2023). Transport and transformation of arsenic in coastal aquifer at the scenario of seawater intrusion followed by managed aquifer recharge.

851 Water Research, 229, 119440. <u>https://doi.org/10.1016/j.watres.2022.119440</u>