

## GEOPHYSICS

# Marine electrical imaging reveals novel freshwater transport mechanism in Hawai'i

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Conventional hydrogeologic framework models used to compute ocean island sustainable yields and aquifer storage neglect the complexity of the nearshore and offshore submarine environment. However, the onshore aquifer at the island of Hawai'i exhibits a notable volumetric discrepancy between high-elevation freshwater recharge and coastal discharge. In this study, we present a novel transport mechanism of freshwater moving from onshore to offshore through a multilayer formation of water-saturated layered basalts with interbedded low-permeability layers of ash/soil. Marine electromagnetic imaging reveals ~35 km of laterally continuous resistive layers that extend to at least 4 km from west of Hawai'i's coastline, containing about 3.5 km<sup>3</sup> of freshened water. We propose that this newly found transport mechanism of fresh groundwater may be the governing mechanism in other volcanic islands. In such a scenario, volcanic islands worldwide can use these renewable offshore reservoirs, considered more resilient to climate change-driven droughts, as new water resources.

## INTRODUCTION

The global occurrence of vast offshore freshened groundwater reservoirs (1–3) may be used as a new resource to supply the increasing demand for water in the era of climate change-driven droughts (4, 5). Onshore aquifers are one of Hawai'i's most critical natural resources, providing the vast majority of water for drinking, irrigation, domestic, commercial, and industrial needs (6). Volcanic eruptions, characterized by complex heterogeneous geology that includes lava flows, ash beds, faults, dikes, and lava tubes, form the young volcanic terrestrial aquifers situated on the island of Hawai'i (6, 7). Hydrogeologists typically assume that freshwater resources on volcanic islands are composed of a shallow lens of freshwater floating on seawater (8). Hydrogeological studies often overlook formation heterogeneities, such as tight confining layers, despite their ability to extend freshwater resources far offshore (9, 10). In the nearshore land-to-sea transition zone, groundwater in Hawai'i often presents a thin freshwater basal lens overlying seawater (11–13). Because of the nearly continuous subsidence of young Hawaiian volcanoes (14, 15), the Hualalai offshore region situated on the west flank of Hawai'i island is composed of subaerial lava flow drapes partially covered by drowned coral reef terraces with low sediment content (16). The slope break that marks the western-most edge of the Hualalai subaerial shield lies at a depth of ~800 to 950 m below current sea level and has an estimated age of ~0.33 million years (Ma) (16).

Conventional hydrogeologic framework models for onshore aquifers assume thinning of the basal lens as the coastline is approached and freshwater heads decline, with dominant freshwater discharge to the ocean through coastal springs (7). However, for the Hualalai coastline, there is considerable evidence of submarine vents discharging freshwater to the ocean on a regional scale (17–21). In addition, prior groundwater isotope studies (22, 23) suggest a substantial volumetric discrepancy of ~40% (18,000 m<sup>3</sup>/day) in fresh groundwater recharge-to-discharge balance measured between the Hualalai vol-

cano and its corresponding coastline. Investigation of the source of this discrepancy has motivated this study.

Marine controlled-source electromagnetic (CSEM) geophysical methods are sensitive to contrasts in bulk electrical resistivity (24, 25), primarily controlled by porosity and pore fluid properties of oceanic structures (26, 27). The substitution of conductive seawater with freshwater will increase the electrical resistivity of any geological formation (28). Various marine CSEM techniques were proven successful in imaging the electrical structure of continuous offshore freshened groundwater in different coastal sediment environments such as those of New Zealand (29), the U.S. Atlantic coast (2, 30), and nearshore Israel (31, 32). In volcanic geology, where seawater-saturated basalts have resistivities of <10 ohm-m (33), submarine freshwater-saturated basalts will manifest as 600– to 1100-ohm-m resistive anomalies (34) embedded in a conductive background of seawater-saturated basalts.

Here, we present a novel multilayer transport mechanism of freshwater from onshore to offshore in Hawai'i's complex geology. Using high-resolution marine CSEM imaging, we reveal the flow path, interconnectivity, and spatial distribution of deep submarine freshened groundwater layered bodies and an extensive reservoir of purely freshwater within the submarine southern flank of the Hualalai aquifer, offshore west of Hawai'i. In addition, we provide a regional scale freshened/freshwater volumetric estimation. This is the first marine CSEM study that maps offshore submarine freshwater in a volcanic setting.

## RESULTS

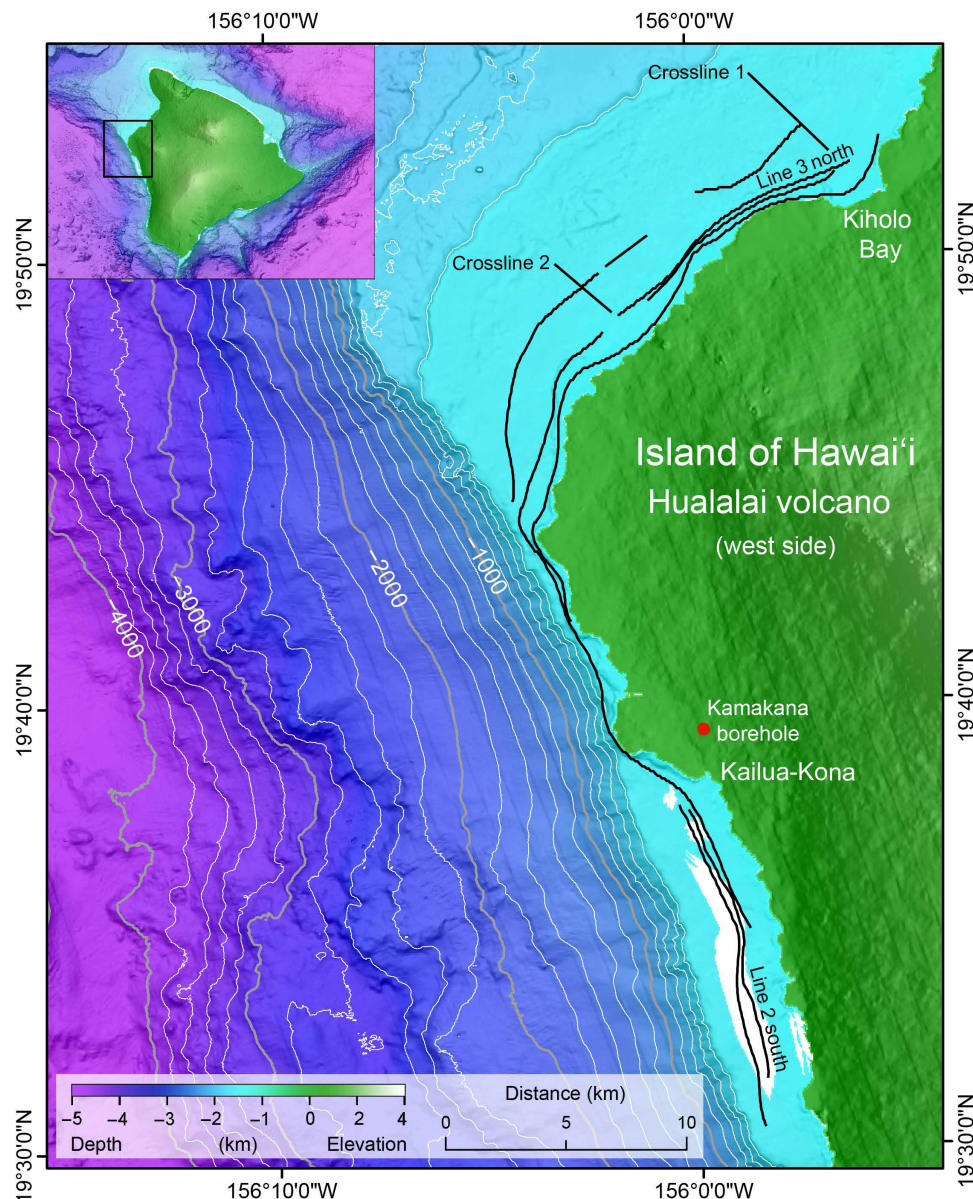
### Multilayer electrical resistivity formation offshore the island of Hawai'i

To image the electrical formation of the submerged flank of the Hualalai volcano offshore west of Hawai'i (Fig. 1), we used a newly developed surface-towed CSEM system (35). Presurvey synthetic modeling demonstrates this CSEM system capability to image the electrical structure of the subsurface to a depth of ~500 m below the seafloor, at water depths <100 m. This surface-towed system records spatially dense multifrequency data using four receivers distributed evenly over ~1 km array (fig. S1). Our marine survey included

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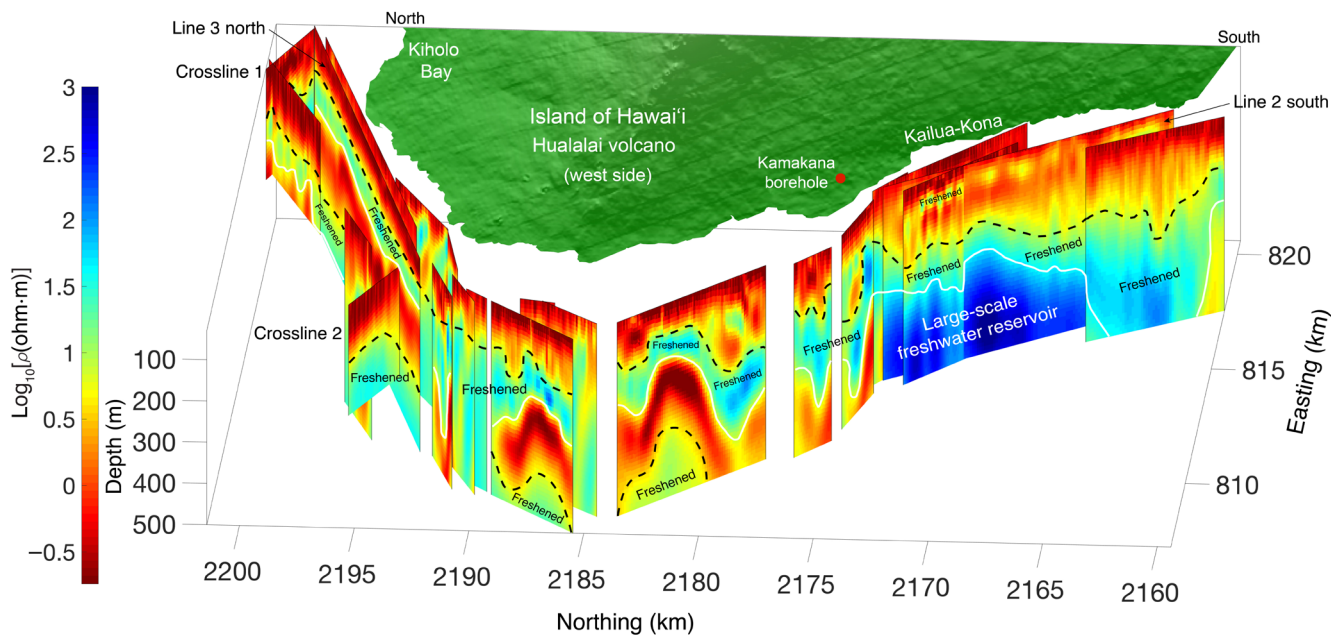
**Fig. 1. Study area and survey layout.** Map of the study area parallel to the Hualalai terrestrial aquifer at Kona, offshore west of Hawai'i. The black lines denote the survey towlines (10 inlines and 2 crosslines). White lines denote depth contours of 200 m, and gray lines denote the depth contours of 1000 m. Inset map: The island of Hawai'i, with black rectangle indicating the main map area. Areas with no bathymetry data are shown in white. Bathymetry data: Courtesy of Hawai'i Mapping Research Group.

10 towlines parallel to the Hualalai terrestrial aquifer at incremental distances from the coastline (inline tows) and two perpendicular towlines (crossline tows), covering an offshore region of about 4 km wide and 40 km long, producing ~200 km of continuous CSEM data (Fig. 1).

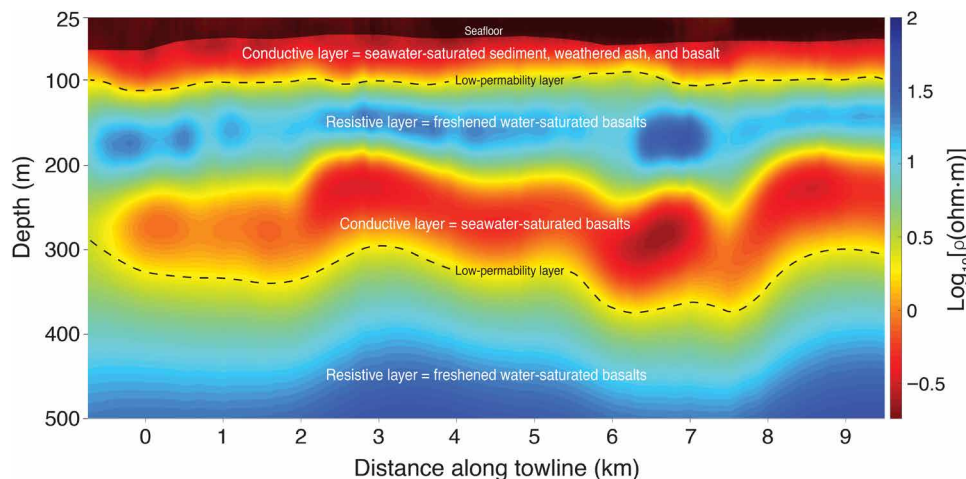
We performed isotropic and anisotropic inversions to the CSEM data using a standard deterministic nonlinear regularized two-dimensional (2D) inversion algorithm (36), producing 22 individual inversion models. These models show a sequence of alternating conductive and resistive layers that extend laterally ~35 km parallel to the coastline with only moderate changes in depth (Fig. 2). The upper conductive layer extends from the seafloor to a depth of ~100 m, presenting low electrical resistivity (~0.2 to 1 ohm-m), most likely

resulting from the combination of seawater-saturated sediment, weathered ash, and basalts (Figs. 2 and 3). The lower conductive layer situated between ~200- and 350-m depth shows electrical resistivity of ~0.8 to 2 ohm-m (Fig. 3). Two resistive layers exist between ~100- and 200-m and between ~350- and 500-m depths, presenting a resistivity range of ~50 to 100 ohm-m (Figs. 2 and 3). On the basis of the age of lavas associated with the Hualalai volcano (16), the age of these deep resistive layers is most likely in the range of a few hundred thousand years.

The alternating conductive/resistive horizontal layers revealed by our isotropic inversion models are most likely confined by low-permeability thin horizons of ash/soil (37), which formed above the Hualalai coastline and were armored by lava flows before



**Fig. 2. Multilayer electrical resistivity formation offshore the island of Hawai'i.** Fence diagram showing 2D isotropic CSEM inversion models of 20 discretized survey lines parallel to the Kona coastline and two crosslines. The color scale shows  $\log_{10}[\rho(\text{ohm}\cdot\text{m})]$ , with blue and red colors corresponding to resistive and conductive features, respectively. Blue shaded areas starting at  $\sim 100\text{-m}$  depth denote horizontal layers of resistive anomalies that represent freshened water-saturated basalts, confined by low-permeability horizons of ash/soil (black dashed lines). White lines denote the deeper boundary of these freshened horizontal layers. The spatially extensive and highly resistive area ( $\sim 1000\text{ ohm}\cdot\text{m}$ ) offshore Kailua-Kona represents a large-scale freshwater reservoir that extends from  $\sim 250\text{-}$  to  $\sim 500\text{-m}$  depth. The models derived from the data acquired by three/four surface-towed CSEM receivers at 3, 7, and 13 Hz (10 models), and 3 and 7 Hz (12 models). The models' vertical exaggeration is approximately 16. Table S1 presents the parameterization and properties of the inversion models.



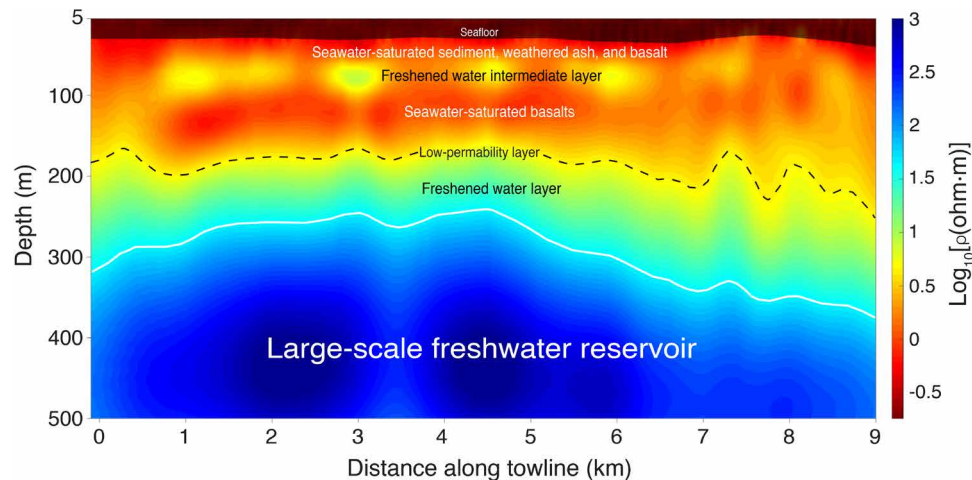
**Fig. 3. Line 3 north inversion model.** Model showing the electrical resistivity structure of line 3 north (see line location in Figs. 1 and 2). The color scale shows  $\log_{10}[\rho(\text{ohm}\cdot\text{m})]$ . This multilayer inversion model is composed of four lateral formations: two conductive seawater-saturated basalt layers intermitted by two resistive freshened water-saturated basalts. Low-permeability thin horizons of ash/soil (dashed lines) separate the conductive and resistive layers. The model was derived from the data acquired by three surface-towed CSEM receivers at 3 and 7 Hz. Inversion error floors include amplitude, 7%, and phase, 4%.

submergence (16). These low-permeability confining layers overlay freshened water layers, displacing more dense seawater to overlaying basaltic formations (Fig. 3). Such a pattern of alternating conductive and resistive horizontal layering is often caused by electrical anisotropy due to sediment grain alignment (38). However, our anisotropic inversion models present a similar layering pattern, thus confirming the capability of our isotropic inversions (Fig. 2) to resolve these anomalous resistive freshened groundwater bodies adequately.

The inversion models of both the inline and crosslines collocate the resistive layers (Fig. 2). The inversion model of crossline 2 presents a deep anomalous resistive layer that extends up to a distance of at least 4 km offshore west of Hawai'i (Fig. 2).

#### Large-scale submarine freshwater reservoir

Parallel to Hualalai's southern flank, the inversion models of four consecutive survey lines consistently detected a deep large-scale



**Fig. 4. Line 2 south inversion model.** Model showing the electrical resistivity structure of line 2 south (see line location in Figs. 1 and 2). The color scale shows  $\log_{10}[\rho(\text{ohm}\cdot\text{m})]$ . The deep and laterally continuous resistive body ( $\sim 1000$  ohm-m) represents a large-scale freshwater reservoir (area bounded by a white line). A low-permeability thin layer (black dashed line) separates between the upper seawater-saturated (resistivity of  $\sim 1$  to  $3$  ohm-m) basalts and the freshened water layer ( $\sim 5$  to  $50$  ohm-m) situated between  $\sim 190$ - to  $320$ -m depths. A moderately resistive body ( $\sim 5$  to  $10$  ohm-m) exists between  $\sim 60$ - to  $100$ -m depths, interpreted as an intermediate layer of freshened water. The conductive layer beneath the seafloor ( $\sim 30$ - to  $50$ -m depth) indicates seawater-saturated sediment, weathered ash, and basalts. The model was derived from the data acquired by four surface-towed CSEM receivers at 3 and 7 Hz. Inversion error floors include amplitude, 7%, and phase, 4%. This inversion converged to an RMS misfit of 0.99 after eight iterations. The model-to-data fits and normalized residuals are shown in fig. S4.

anomalous resistive body that extends up to  $\sim 2.5$  km offshore south of Kailua-Kona (Fig. 2). This sizable resistor is at least  $\sim 10$  km long and  $\sim 250$  m thick, exhibiting a resistivity of  $\sim 1000$  ohm-m (Fig. 2). The CSEM inversion model of survey line 2 south demonstrates the spatial extent and the highly anomalous resistivity of this large-scale submarine feature (Fig. 4). Such a high level of electrical resistivity indicates an extremely low salinity freshwater reservoir. Freshwater-saturated subaerial Mauna Kea basalts presented similar resistivities (34).

## DISCUSSION

### Resistivity to salinity calculation and freshened/freshwater volumetric estimation

Given the prevalence of fractured basaltic rocks in Hawai'i (39), we interpret the two resistive layers ( $\sim 50$  to  $100$  ohm-m) shown in Figs. 2 and 3 as freshened (moderately brackish) water-saturated basalts, with a salinity range of 3.2 to 6.8 ppt, calculated using Archie's law (40), assuming an average porosity of 20% and a cementation exponent of 2.57 [typical values for Hawai'i's subaerial lava rocks; (41, 42)], and the equations of state (43). Volumetric estimation on a regional scale suggests that these water-saturated basaltic layers accommodate at least  $3.5$  km<sup>3</sup> of freshened water, as calculated by Eq. 1

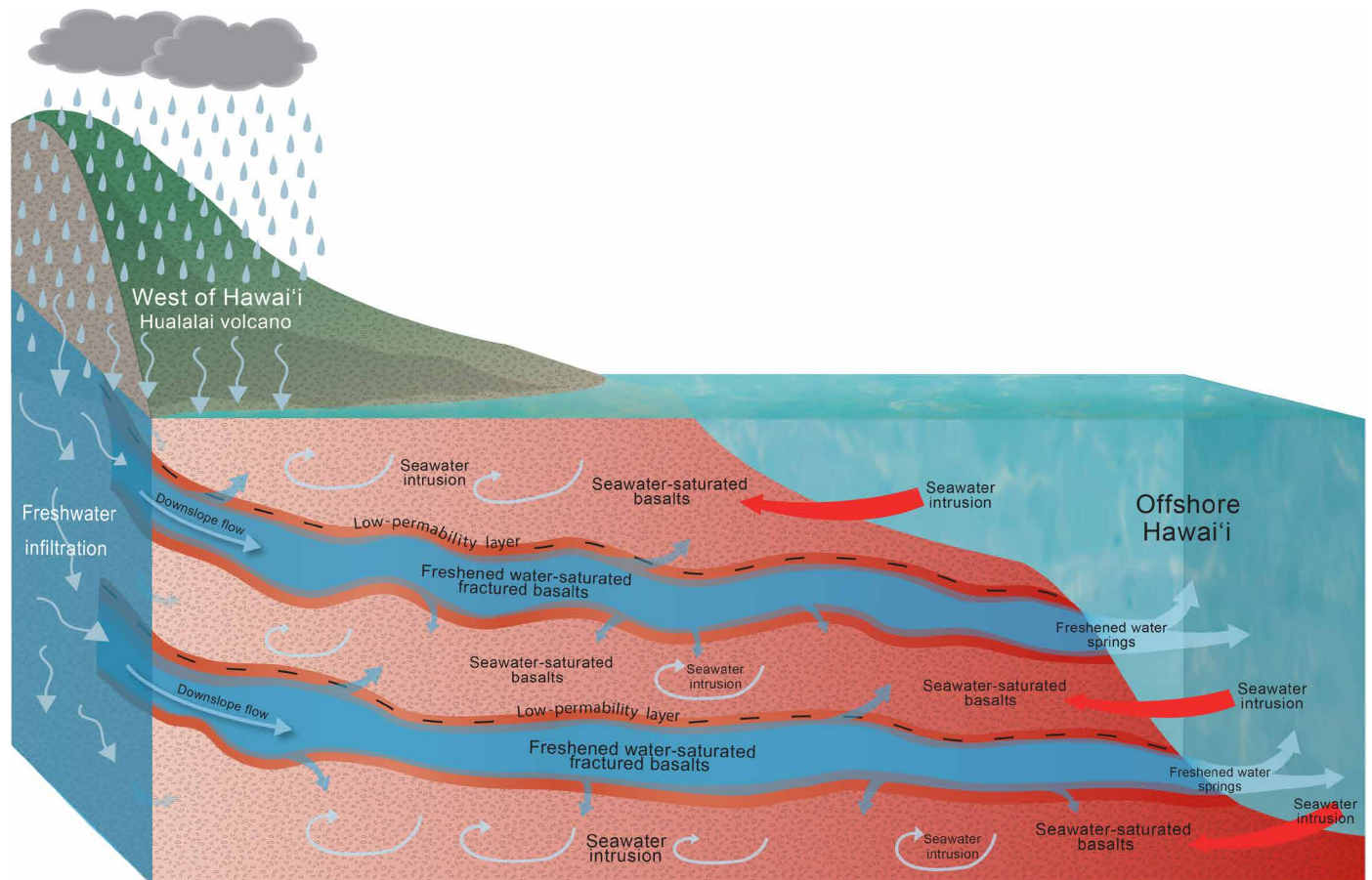
$$F_V = F_X \times F_Y \times F_Z \times \phi \quad (1)$$

$F_V$  represents the freshened water volume,  $F_X$  the resistive layers' average width (2 km, assuming continuous extension from the coastline),  $F_Y$  the resistive layers' horizontal length (35 km),  $F_Z$  the resistive layers' vertical extension (0.25 km), and  $\phi$  the average porosity (20%).

To estimate the salinity and volume of the large-scale freshwater reservoir detected offshore south of Kailua-Kona (Figs. 2 and 4), we

applied Archie's equation (40) to calculate the formation pore fluid resistivity, using a formation bulk resistivity of  $\sim 1000$  ohm-m (as derived from the CSEM inversions), cementation exponent of 2.57, and porosities of  $20\% \pm 5\%$ , as 5% change in porosity may significantly affect the estimate of pore water salinity (29). Note that these low porosities and high cementation values [representative to Hawai'i basalts (42)] suggest that a substantial volume of fresh pore fluid is required to yield a formation bulk resistivity of  $\sim 1000$  ohm-m. Our calculation for formation pore fluid resistivity at porosities of 15, 20, and 25% yielded pore fluid resistivities of 7.5, 15, and 28 ohm-m, respectively. Pore fluid resistivities of 7.5, 15, and 28 ohm-m are equivalent to salinities of 0.62, 0.29, and 0.15 ppt, respectively, as calculated by the equations of state (43). Because water with a salinity  $< 0.5$  ppt is defined as pure freshwater (44), we consider this reservoir to be saturated entirely by freshwater at porosities of 20 and 25%. Thus, given the dimensions of this large-scale reservoir, we estimate that it contains a freshwater volume of at least 1.25 and 1.56 km<sup>3</sup> at porosities of 20 and 25%, respectively. A porosity of 15% (salinity of 0.62 ppt) will result in reservoir volume of 0.93 km<sup>3</sup>, saturated by freshened water. Summing the volumes of both the freshened water layers and the large-scale freshwater reservoir, we infer that the region mapped in this study offshore west of Hawai'i contains a freshened/freshwater volume of at least 4.75 km<sup>3</sup>, assuming a porosity of 20%.

We note that the offshore distance and depth extent of these freshened/freshwater reservoirs are not fully constrained because of data acquisition limitations of the surface-towed CSEM system (35). Therefore, the inferred reservoirs may reach depths greater than 500 m and extend to the shelf edge ( $\sim 6$  to 8 km offshore). In this case, the reservoirs' volumes would be substantially higher than the minimum values estimated above. These reservoirs of freshwater offshore Hawai'i are most likely renewable, as implied from point-source fluxes of freshwater from the seafloor to the water column (20, 21).



**Fig. 5. Fresh groundwater onshore-to-offshore transport mechanism.** Illustration showing a multilayer conceptual model of the transport mechanism of fresh groundwater from onshore to offshore in Hawai'i. Fresh groundwater recharge from rainfall infiltrates the subsurface basalts and migrates toward the coastline. Low-permeability ash/soil layers intercept and perch the downslope migration (hydrostatic head driven) of freshwater where the freshwaters are above the water table. Below the water table, the low-permeability ash/soil layers act as confining formations. The freshwaters trapped below the confining formations flow through permeable fractured basalts and mix with seawater to form freshened groundwater while displacing gravitationally denser seawater. At the shelf edge, the freshened groundwater flows are released to the ocean as springs. Above and below the freshened water-saturated basaltic formations, seawater-saturated basalts exist as a result of seawater intrusions from the ocean toward the land.

### Multilayer transport mechanism of deep submarine freshwater to offshore

On the basis of our CSEM inversion models, we present a new conceptual hydrogeologic model that describes the transport mechanism of freshwater from onshore to offshore at the island of Hawai'i (Fig. 5). In this region, rainwater that percolates through the porous basalts along the western flank of Hawai'i island recharges the Hualalai terrestrial aquifer. Less permeable ash/soil layers intercalated with the more permeable lava flows intercept the freshwater as they infiltrate and migrate toward the coastline. If these low-permeability ash/soil layers are above the local water table, they act as perching formations, whereas, below the water table, low-permeability layers serve as confining formations (6, 7, 45, 46). Hydrostatic head channels the freshwater below the confining formations, enabling its flow beneath sea level through permeable basalts while displacing gravitationally more dense seawater (Fig. 5). With high head levels, these freshwater flows may extend to the submerged flank of the volcanic edifice or alternately discharge into overlying saltwater saturated basalts if the confining formation terminates within the interior of the volcanic pile (45, 46).

Our model illustrates the flow of deep submarine freshwater to offshore Hawai'i via a multilayer basaltic formation. Onshore borehole data acquired in the Hualalai terrestrial aquifer support this conceptual hydrogeological model (see below). However, the offshore component of the model is based solely on our electrical imaging and, thus, ideally requires future validation by boreholes, seismic, and hydrogeological marine studies.

### Observations of multilayer freshwater formations onshore the island of Hawai'i

Multiple onshore drilling studies conducted across the island of Hawai'i support the transport mechanism of freshwater from onshore to offshore, as illustrated by our conceptual model in Fig. 5. Salinity data obtained from the Kamakana borehole, located onshore Hualalai, in west Hawai'i (Fig. 1), indicate the presence of a low-permeability layer at 300 to 315 m deep, which acts as a confining layer to a freshwater layer beneath (fig. S5). The borehole depths of both the low-permeability and freshwater layers are consistent with the offshore depths of the low-permeability/freshwater layers shown in our inversion model of survey line 2 south (Fig. 4), located ~3 km

diagonally to Kamakana borehole (Fig. 2). Furthermore, several production/monitoring wells at higher elevations on the west flank of Hualalai have encountered either similar multilayered aquifers (fresh-salt-fresh) or elevated freshwater hydrostatic heads more than sufficient to displace seawater to the depths observed by our offshore resistivity models.

In the east of Hawai'i island, resistivity surveys identified shallow resistive anomalies that represent high-elevation groundwater on the east flank of Mauna Kea (34). In addition, resistivity log from the PTA2 borehole (situated west of Mauna Kea) exhibits a notable increase in resistivity at a depth of 1130 m, most likely associated with freshwater-saturated basaltic rocks (47). Drilling resistivity logs from borehole KP-1 located on the eastern flank of Hawai'i detected a shallow freshwater basal lens underlain by saltwater-saturated rocks (37, 46). Beneath these saltwater-saturated rocks, a deeper-buried freshwater aquifer exists between ~320- and 520-m depth trapped below subsided soil horizon that marks the former surface of Mauna Kea, which the Mauna Loa basalt subsequently covered (37, 48). Below this ~200-m-thick aquifer, a zone with salinities similar to seawater exists at depths greater than 700 m. A borehole drilled 2 km away from KP-1 detected both the 320-m-deep freshwater aquifer and additional deeper confined freshwater-saturated intervals to depths >3 km (15).

It is unlikely that the high resistivities observed in our CSEM models (Figs. 2 to 4) result from lithologic alterations in the submerged flanks of Hualalai because drilling into the near-shore flanks of Mauna Kea encountered typical subaerial lavas subsided more than 1 km below current sea level (15). Given the similarity in ages of Hualalai with Mauna Kea (16), we would expect typical shield building subaerial basalts within the resistive strata offshore.

Tracing the flow paths of dissolved silica in Hawai'i demonstrated that the direct flow of submarine freshwater is a powerful mechanism for subsurface chemical weathering and solute flux from land to the ocean. Thus, calculations of weathering fluxes at young volcanic islands must include freshwater discharge to the ocean (49). 3D simulations of lava tubes (acting as conduits in a less permeable matrix of lava flows) suggest that submarine freshened groundwater accumulations occur offshore west of Hawai'i because of heterogeneous permeability and porosity (50). Therefore, lava tube conduits may be the primary source that supplies substantial volumes of water to the large-scale submarine freshwater reservoir detected by our inversion models (Figs. 2 and 4). Radiocarbon age dating of water samples collected from the Hualalai coastal aquifer infers that deep freshwater reservoirs have prolonged cycle time; thus, it is more resilient to climate change (51).

### Evidence for multilayer freshwater formations at other volcanic islands

To the best of our knowledge, no electromagnetic (EM) studies have been performed offshore at any other volcanic islands to confirm our proposed mechanism of freshwater transport from onshore to offshore via a multilayer basaltic formation. However, EM studies conducted in coastal areas of other volcanic islands such as Santa Cruz Island, Galapagos (33); Grande Comore Island, Comoros (52); Piton de la Fournaise volcano, Reunion (53, 54); Fogo Island, Cape Verde (55); and Maui Island, Hawai'i (41) all present hydrogeological layered formations analogous to the submarine multilayer formation we revealed. For example, a 3D airborne resistivity

model of the Santa Cruz Island shows three main hydrogeological units that extend to a maximum depth of 300 m: a top unit of unsaturated-fractured basalt (<800 ohm-m), followed by a unit of seawater-saturated basalt (<10 ohm-m), and a deep freshwater-saturated basaltic unit with resistivity values ranging from 50 to 200 ohm-m (33). The resistivity values of the seawater-saturated and freshwater-saturated units correspond to the top two layers presented in our inversion models, extending from the seafloor to a depth of ~200 m (Figs. 2 and 3).

The studies above provide evidence for the existence of multilayer freshwater formations at the coastline of five other volcanic islands, thus supporting our findings' global-scale applicability. Consequently, we suggest that our unprecedented hydrogeologic conceptual flow model (Fig. 5) plays a more prominent role than previously recognized in the transport mechanism of freshwater from onshore to offshore in volcanic islands.

This study reveals a novel mechanism that transports substantial volumes of freshwater from onshore aquifer to deep submarine aquifer offshore Hawai'i via a multilayer basaltic formation. We propose that this transport mechanism may be the governing mechanism in other volcanic islands. Thus, such a mechanism may provide alternative renewable resources of freshwater to volcanic islands worldwide where the impacts of climate change decrease water availability. Our findings emphasize the importance of recognizing offshore submarine freshened/freshwater groundwater in future aquifer modeling to use water resources of volcanic islands. The large-scale submarine freshwater reservoir found here can potentially provide water to the island of Hawai'i with high energetic efficiency and minimal impact on terrestrial and marine ecosystems.

## METHODS

### Data acquisition and processing

In September 2018, we collected ~200 km of surface-towed CSEM data by towing a 40-m-long dipole antenna ~0.5 m deep behind the survey boat at an average speed of 3.5 knots. The dipole antenna transmitted a 100-A current using a doubly symmetric square waveform (56) at a fundamental frequency of 1 Hz (sampling rate of 250 Hz), generating a source dipole moment of 5.09 kAm. A higher signal-to-noise ratio (SNR) characterizes this waveform at higher frequencies than the standard square wave and other typical waveforms. The survey boat surface towed four broadband EM receivers at offsets 268, 536, 804, and 1072 m (fig. S1). A dorsal unit positioned 30 m behind the EM receiver array recorded the water depth, surface water conductivity, and temperature. Each EM receiver recorded the inline horizontal electric field on a 2-m dipole positioned ~0.65 m below the sea surface (fig. S1). GPS units and electronic compasses logged the receivers' timing and positions, as well as orientations, respectively (35). The transmitter's and receivers' GPS units (positioned above sea level, directly exposed to satellites) provided continuous timing synchronization (accuracy of 10 ns), thus yielding stable phase values.

The recorded CSEM data were Fourier transformed to the frequency domain and stacked over 60-s intervals, which corresponds to ~20-m lateral distance between transmitter stack points, producing amplitude and phase responses per each receiver as a function of position and frequency harmonics. The stacked amplitude and phase responses were then merged with the transmitter's and receivers' navigational information.

**CSEM 2D inversion scheme**

For our CSEM inversion, we used the strongest harmonics of the doubly symmetric square waveform (56), which in this case corresponds to high-frequency harmonics 3, 7, and 13 Hz. These frequencies produced quality data with high sensitivity to the interrogated depth beneath the seafloor (fig. S3). Thus, in combination with high data density, the frequencies yielded high-resolution inversion models. To invert the CSEM data for electrical resistivity, we used the open-source MARE2DEM code, a 2D nonlinear regularized inversion method that uses a parallel goal-oriented adaptive finite element algorithm (36). MARE2DEM is based on the Occam's inversion, which searches for the smoothest model that fits the data to a pre-defined root-mean-square (RMS) target misfit (57).

The inversion-starting model discretization includes fixed parameters for a  $10^{13}$  ohm-m air layer, 0.2 ohm-m half-space for the seawater column defined as free parameters, and 10 ohm-m half-space for the subseafloor region. A high-resolution (2 m by 2 m) multibeam system recorded the bathymetry used in the inversion modeling. Quadrilateral elements (36) discretized both the seawater column and the subseafloor (fig. S3). The 40-m-long dipole transmitter and the 2-m-long towed CSEM receiver dipoles were modeled as finite dipole lengths. Our finite dipole inversions produced models with high sensitivity of the data to model parameters (fig. S3). The inversions' horizontal-to-vertical roughness varies between 2 and 10 as a function of width-to-depth ratio. All the resistivity inversion models (Fig. 2) fit the data to an RMS misfit of  $\sim 1.0$ . Table S1 details the parameterization and properties of the 2D isotropic CSEM inversion models.

**SUPPLEMENTARY MATERIALS**

Supplementary material for this article is available at <http://advances.sciencemag.org/cgi/content/full/6/48/eabd4866/DC1>

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