## **ENVIRONMENTAL STUDIES**

# Groundwater releases CO<sub>2</sub> to diverse global coastal ecosystems

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Coastal ecosystems play a major role in marine carbon budgets, but substantial uncertainties remain in the sources and fluxes of coastal carbon dioxide (CO<sub>2</sub>). Here, we assess when, where, and how submarine groundwater discharge (SGD) releases CO<sub>2</sub> to shallow coastal ecosystems. Time-series observations of dissolved CO<sub>2</sub> and radon (<sup>222</sup>Rn, a natural groundwater tracer) across 40 coastal systems from 14 countries revealed large SGD-derived CO<sub>2</sub> fluxes. The mean groundwater partial pressure of CO<sub>2</sub> was 35 times higher than surface seawater. The mean SGD derived CO<sub>2</sub> flux was 148 ± 226 millimoles per square meter per day (mmol m<sup>-2</sup> day<sup>-1</sup>), resulting in a mean waterair CO<sub>2</sub> flux of 80 ± 133 mmol m<sup>-2</sup> day<sup>-1</sup>. Tidal rather than diel cycles drove CO<sub>2</sub> enrichment in most ecosystems. Tidally driven SGD was the primary CO<sub>2</sub> source in mangroves, salt marshes, tidal flats, estuaries, and canals. Overall, we expand current knowledge of marine carbon cycles by demonstrating SGD as an important source of CO<sub>2</sub> that requires inclusion in coastal carbon budgets.

#### **INTRODUCTION**

The land-ocean interface plays an essential role in modulating Earth's changing climate and the global carbon budget (1). Despite covering a small area globally, this region contributes disproportionately large carbon fluxes. Continental shelves are often atmospheric CO<sub>2</sub> sinks, whereas rivers and estuaries are usually sources of CO<sub>2</sub> to the atmosphere (1–3). Processes such as primary production and respiration, calcification/dissolution, temperature variations, gas exchange, and riverine discharge control CO<sub>2</sub> dynamics in coastal waters (4–6). Although these processes have been extensively studied, uncertainties of ~50% persist in key terms of coastal carbon budgets (1, 7). Submarine groundwater discharge (SGD), an important but often overlooked source of nutrients to coastal surface waters, may also be a major source of carbon, further contributing to the large uncertainties in coastal carbon budgets (8–10).

SGD constitutes all flow of groundwater and porewater from the seabed to the coastal ocean, including terrestrial fresh groundwater inputs and seawater recirculated through sediments (11). Fresh groundwater flows are only  $\sim$ 0.6% of the total global freshwater inputs into the ocean but may be important in many estuaries, salt

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marshes, and coral reefs (10). Recirculated seawater is often driven by tides and accounts for >90% of the total SGD in most sites where it has been quantified (12–14). Total SGD often results in brackish, anoxic water inputs affecting coastal biogeochemistry (11, 15–17). For instance, total nitrogen and phosphorus fluxes from SGD exceed river fluxes in ~60% of the sites where both sources have been quantified (8). Although the impact of SGD on global nutrient fluxes is now widely recognized (18), the contribution from SGD to carbon budgets remains poorly understood. High concentrations of CO<sub>2</sub> can accumulate in coastal groundwater. This CO<sub>2</sub> can then be transported to coastal waters via SGD (19), eventually be released into the atmosphere (20–22), modify seawater pH (23, 24), and alter coastal carbon budgets (25).

Resolving SGD and coastal carbon budgets is challenging due to spatiotemporal variability and complex driving forces (9). Radon ( $^{222}$ Rn) is an effective SGD tracer because it is enriched in both fresh water and saline water in contact with sediments and is only detectable within a short distance from the source due to its short half-life (3.8 days) and water-air exchange (24–26). Mass-balance models of  $^{222}$ Rn are commonly used to estimate SGD (26, 27). When coupled with CO<sub>2</sub>, continuous, high-resolution measurements of  $^{222}$ Rn can be used to explore links between SGD and carbon dynamics in aquatic ecosystems (28).

Here, we address knowledge gaps in coastal carbon budgets by hypothesizing that SGD is an essential source of  $CO_2$  to coastal waters. We compiled high-resolution dissolved partial pressure of  $CO_2$  (*P*CO<sub>2</sub>), <sup>222</sup>Rn, and dissolved oxygen (DO; proxy for photosynthesis/ respiration) observations from 40 diverse study sites (Fig. 1 and table S1) across nine coastal ecosystems worldwide to assess the relative importance of SGD and biological activity as drivers of *P*CO<sub>2</sub>. We also quantify SGD-derived CO<sub>2</sub> fluxes to coastal waters and examine the contrasting effects of tidal (physical processes) and diel (primary production and respiration) drivers. Although prior regional studies demonstrated that SGD can be a source of CO<sub>2</sub> to some coastal waters (*29–32*), this synthesis shows that SGD is usually a source of CO<sub>2</sub> to diverse coastal systems worldwide. Overall, our observations

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**Fig. 1. Location of study sites worldwide and general summary of observations.** (**A**) The map depicts 40 observation sites across 5 continents and 14 countries. The symbol size represents the mean  $CO_2$  saturation levels in surface water, and the color scale represents the ecosystem type. The inset highlights locations along the east coast of Australia. Details about specific locations and sources of data are summarized in fig. S1 and table S1. (**B**) The panels show the distribution of  $Pco_2$ , <sup>222</sup>Rn, and DO levels in surface water categorized by ecosystem type. Boxplots reveal the median levels of the three parameters along with their interquartile ranges. Jittered dots representing individual data points enable identification of outliers falling outside whiskers. Additional details about surface water observations can be found in table S4.

challenge the conventional perception that river inputs and respiration are the only major sources of  $CO_2$  in coastal waters.

#### **RESULTS AND DISCUSSION**

#### Widespread oversaturation of CO<sub>2</sub>

Our observations at 40 coastal sites (fig. S1) collected over the span of a decade provide a unique opportunity to investigate coastal  $CO_2$ sources and dynamics. Coastal surface water  $PcO_2$  levels were up to 17 times higher than atmospheric levels, indicating oversaturation of  $CO_2$  in all ecosystems (Fig. 1).  $CO_2$  oversaturation was substantial in tidal rivers (~1900%), salt marshes (~580%), and mangroves (~450%), whereas coral reefs and seagrass meadows exhibited relatively lower saturation levels of ~110% (table S2). Oversaturation of  $CO_2$  can result from the transfer of dissolved organic (33) and inorganic carbon (34) via SGD to coastal waters, from river inputs, and local respiration. Decomposition of organic matter is enhanced in nutrient-enriched groundwater, adding to the release of  $CO_2$  from coastal aquifers (35, 36). Relatively lower  $CO_2$  oversaturation levels occurred in ecosystems with high DO in their water column due to intense primary production (Fig. 1).  $Pco_2$  than coastal surface water (fig. S2). Highly productive, shallow ecosystems such as canals and estuaries exhibited ~90 times greater  $Pco_2$  in groundwater than surface water. Organic-rich blue carbon ecosystems, namely mangroves and salt marshes, along with coral reefs and coastal lakes had moderate enrichment with groundwater  $Pco_2$  being ~25 times greater than surface waters. Groundwater  $CO_2$  enrichment is attributed mostly to the accumulation of aerobic and anaerobic respiration products following microbial breakdown of organic matter (31) as well as silicate weathering and carbonate precipitation in groundwater (37). In systems such as canals, estuaries, and coral reefs, surface water  $CO_2$  removal by photosynthesis also enhances the perceived enrichment of groundwater due to an increase in groundwater-to-surface water ratio of  $Pco_2$ .

Coastal groundwater exhibited, on average, 35 times greater

All coastal ecosystems were either near-equilibrium or undersaturated in DO (table S2). Coastal lakes, canals, and coral reefs exhibited near-equilibrium oxygen saturation. However, tidal ecosystems, including mangroves, estuaries, salt marshes, and tidal rivers, were undersaturated at ~75%. The oxygen undersaturation is consistent with aerobic respiration in both ground and surface waters using oxygen and producing  $CO_2$ . Thus, SGD enriches  $CO_2$  in surface waters, bringing these ecosystems toward hypercapnia (abnormally high levels of  $P_{CO_2}$ ) (38). In coastal lakes, algal blooms and eutrophication occasionally attenuate hypercapnia by releasing oxygen and consuming  $CO_2$  during the day, potentially masking SGD-derived  $CO_2$  inputs (39). As expected, groundwaters were undersaturated in DO and approached zero in many cases (table S3). The overall negative correlations between surface water radon and DO (fig. S3) support recent suggestions that coastal seawater deoxygenation may be partially explained by SGD (40).

#### Tidally driven SGD as a source of CO<sub>2</sub>

SGD traced by <sup>222</sup>Rn was a major source of CO<sub>2</sub> in mangroves, salt marshes, tidal flats, estuaries, and canals (Fig. 2 and fig. S4). Contrastingly, biological activity (traced by oxygen) had a greater influence on CO<sub>2</sub> in shallow coastal systems such as coral reefs and coastal lakes (fig. S5). These results were further supported by a driver-response relationship using a cumulative sum (CUSUM) analysis (fig. S6) as well as a significant (P < 0.05) positive correlation between CO<sub>2</sub> and <sup>222</sup>Rn and a negative correlation of CO<sub>2</sub> with DO (Fig. 2). The relationship between PCO<sub>2</sub> and salinity was either absent or weak (table S4). Freshwater sources include direct rainfall, rivers, and fresh groundwater. Rainfall cannot be a CO<sub>2</sub> source because it has PCO<sub>2</sub> values in equilibrium with the atmosphere, much lower than our observations in nearshore seawater. The low or negligible correlations between the groundwater tracer <sup>222</sup>Rn and salinity suggest that recirculated seawater, not fresh groundwater, was the major source of <sup>222</sup>Rn. All sites were located nearshore by potential groundwater sources (fig. S1). The often-insignificant salinity versus PCO<sub>2</sub> correlations (Fig. 1) imply that seawater recirculation in sediments rather than freshwater inputs drove CO<sub>2</sub> supersaturation during the observation periods.

The driver-response (CUSUM) analysis (fig. S6) supports the interpretation from correlations (Fig. 2) to suggest that SGD drives CO<sub>2</sub> dynamics in tidally dominated ecosystems. Radon activities of >5 dpm/liter in these ecosystems explained increasing  $PCO_2$  (fig. S6). Aerobic respiration traced by oxygen was the dominant process driving CO<sub>2</sub> inputs in shallow, highly productive ecosystems with low <sup>222</sup>Rn activities of <2 dpm/liter and high oxygen. Similarly, undersaturated DO values <75% are coupled to enhanced CO<sub>2</sub>. Lower DO values are expected near groundwater sources (40, 41). Temperature plays a major role in open-ocean  $PCO_2$  distribution with supersaturated warm tropical waters acting as sources to the atmosphere and undersaturated cold polar waters acting as a sink (42). As expected, we observed higher  $PCO_2$  values in warm mangrove waters and low values in cold waters in Sweden and Iceland (fig. S7), but the trends were highly scattered compared to other  $PCO_2$  controls.

Tides can modulate SGD and CO<sub>2</sub> in coastal ecosystems on timescales of hours (low-high and ebb-flood tidal cycles; Fig. 3 and figs. S8 to S10) to weeks (spring-neap cycles; fig. S11) (13, 43). Tidal pumping refers to the infiltration of seawater into coastal aquifers at high tide and subsequent discharge at low tide (44, 45), releasing CO<sub>2</sub>-enriched groundwater to the coastal ocean. The maximal hydraulic gradient between coastal aquifers and the ocean typically occurs at low tide (46, 47) during spring tides (48, 49), increasing SGD (47). Delayed groundwater discharge (50) may generate greater radon and CO<sub>2</sub> responses in surface water during the early flood tide than during the ebb tide at a similar water level (fig. S10). Tides also control the duration and frequency of intertidal zone inundation in coastal wetlands, enhancing the area available for sediment-water exchange (43) and potentially enhancing both radon and CO<sub>2</sub> in receiving surface waters following tidal flooding of large intertidal areas during spring tides (21, 51, 52). Overall, tidal pumping occurs



**Fig. 2. Correlations between**  $P_{CO_2}$  **and the proxies for groundwater** (<sup>222</sup>Rn) **and productivity (DO).** (A) Significant positive correlations were found between  $P_{CO_2}$  and <sup>222</sup>Rn in 25 of 40 sites (see also figs. S4 and S5). The points above the black line in the insets depict surface water  $P_{CO_2}$  levels exceeding atmospheric  $P_{CO_2}$ . The small points represent individual time-series observations, whereas the larger points represent site-specific means. (B) CO<sub>2</sub> versus <sup>222</sup>Rn, DO, and salinity *r* values for each site (refer to figs. S4 and S5 and table S4).



**Fig. 3. Comparative analysis of tidal and diel effects.** The effects on *Pco<sub>2</sub>*, <sup>222</sup>Rn, and DO in surface water, captured during peak hours (fig. S10) of diel and tidal cycles across 40 study sites. The tidal and diel effect indices (TEI and DEI, respectively) describe the relative effect of tidal and diel processes. The white area depicts the region primarily influenced by tides, whereas the gray area represents the region primarily influenced by diurnal cycles. Each point represents an individual study location. The size of the points varies with the tidal range (m) for each site. The color scheme represents the ecosystem type. Two outliers were excluded.

on multiple timescales and delivers a radon signal from sediments and a carbon dioxide signal from organic matter respiration, enhancing  $CO_2$  in tidal environments.

On hourly timescales, the tidal influence on  $CO_2$  was five times greater than that of diurnal day-night cycles in canals, mangroves, estuaries, salt marshes, tidal rivers, and tidal flats (Fig. 3). Tidally driven SGD and  $CO_2$  enhancement were also apparent from the inverse correlation between  $CO_2$  and water depth in ~50% of the coastal systems (table S4). Diurnal rhythms governed  $CO_2$  dynamics in nontidal coastal lakes and some coral reefs (fig. S8). Light and dark periods regulate biological activity (e.g., photosynthesis and respiration) (53). Prior time-series observations in nearshore waters have primarily focused on diurnal patterns concluding that  $CO_2$  is strongly governed by biological activity (54, 55). Our analysis covering multiple tidal timescales (figs. S8 to S11) reveals that tidally driven SGD was also a key driver of  $CO_2$  dynamics in nearshore waters.

We compare surface water time-series observations to groundwater end-member concentrations to further assess whether SGD was a major source of CO<sub>2</sub> to surface waters. Projecting the regression of  $Pco_2$  versus <sup>222</sup>Rn in surface waters to the groundwater end-member (fig. S12) revealed that the SGD proxy <sup>222</sup>Rn best explains CO<sub>2</sub> enrichment in eight of nine ecosystem types. If we assume that groundwater is the only source of CO<sub>2</sub> to surface waters, then mixing CO<sub>2</sub>-enriched groundwater with depleted surface seawater should result in a projection toward the groundwater end-member. A nonlinear relationship implies that other drivers influence CO<sub>2</sub> dynamics. This was the case for coastal lakes, where the projected CO<sub>2</sub> deviated by ~370% from the predicted groundwater end-member (table S2), implying major CO<sub>2</sub> sources beyond groundwater.

#### SGD versus water-air CO<sub>2</sub> fluxes

This study compiled the largest available dataset on SGD-derived  $CO_2$  in coastal ocean, addressing a major gap in coastal carbon assessments (3). Radon mass balances revealed that mean groundwater

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discharge rates were the lowest in the two nontidal coastal lakes and highest in a coral reef receiving direct hydrothermal inputs (table S5). Uncertainties in radon mass-balance models are often high due to natural variability in groundwater discharge rates and the multiple terms of radon mass-balance models (27, 56, 57). The largest uncertainties exceeding 100% occurred when groundwater discharge rates approached zero in a coastal lake, and relatively lower uncertainties occur when SGD rates are larger than 20 cm/day.

Multiplying these site-specific radon-derived SGD rates (table S5) by the CO<sub>2</sub> groundwater end-member (table S3) led to a mean SGD-derived CO<sub>2</sub> flux of  $148 \pm 226 \text{ mmol m}^{-2} \text{ day}^{-1}$  across all ecosystems. Uncertainties propagations range from <10% in three coral reefs to >100% in three estuaries due to large natural variability in groundwater CO<sub>2</sub> concentrations. SGD-derived CO<sub>2</sub> fluxes were highest in ecosystems such as tidal rivers (Fig. 4) due to high CO<sub>2</sub> enrichment in groundwater (58). In contrast, coastal lakes and seagrass meadows had the lowest SGD-derived CO<sub>2</sub> fluxes. Tidal pumping enhances SGD in nearshore ecosystems with nearby tidal flats and beaches (21, 46). Seagrass meadows efficiently consume seawater CO<sub>2</sub> through photosynthesis (59), hindering CO<sub>2</sub> accumulation into the water column from sources such as SGD. Moreover, subtidal seagrass meadows have reduced influence of tidal pumping, lowering SGD fluxes.

The mean CO<sub>2</sub> water-air flux in all ecosystems was  $80 \pm 133$  mmol m<sup>-2</sup> day<sup>-1</sup> with 85% of the sites releasing CO<sub>2</sub> to the atmosphere (table S2). Water-air CO<sub>2</sub> fluxes for coral reefs and seagrass meadows were near equilibrium when averaged over complete diel and tidal cycles. Coastal lakes were the only ecosystem type where the CO<sub>2</sub> water-air flux substantially exceeded groundwater-derived fluxes likely due to low groundwater inputs and other CO<sub>2</sub> sources (Fig. 4). Tidal rivers and salt marshes exhibited the highest CO<sub>2</sub> water-air fluxes that exceed previously established global averages (5, 30). Notably, the mean water-air CO<sub>2</sub> flux in salt marshes was ~7 times greater than the global average reported in the literature (60).



**Fig. 4. Summary of SGD-derived and water-air CO<sub>2</sub> fluxes (mmol m<sup>-2</sup> day<sup>-1</sup>).** Mean (median) values depicted for SGD-derived and water-air CO<sub>2</sub> fluxes for different ecosystem types. SGD-derived CO<sub>2</sub> fluxes received by the surface waters are in brown circles. Water-air CO<sub>2</sub> fluxes are in blue circles. Arrows represent SGD-derived CO<sub>2</sub> fluxes (top). The circle and arrow sizes qualitatively represent the value of the flux (refer to tables S2 and S5). Icons from T. Saxby retrieved from https://ian.umces.edu/media-library/.

Other ecosystems had mean water-air CO<sub>2</sub> flux rates comparable to those reported in the literature (61–63). For instance, a mean water-air CO<sub>2</sub> flux of 46 ± 54 mmol m<sup>-2</sup> day<sup>-1</sup> was observed in our mangrove sites, which is comparable to global mean fluxes ranging from 43 to 72 mmol m<sup>-2</sup> day<sup>-1</sup> (64–67). Observed CO<sub>2</sub> water-air fluxes in this study are partly attributed to SGD given the proximity of surface water measurements to SGD sources (fig. S13) (1, 68).

The median zero-radon intercept from the <sup>222</sup>Rn versus CO<sub>2</sub> scatterplots (fig. S4) was ~411 µatm (mean =  $1200 \pm 2290$  including freshwater outliers), a value remarkably close to atmospheric equilibrium (~400 to 418 µatm depending on the year of observations) when no CO<sub>2</sub> sources are present in surface waters. The widespread surface water CO<sub>2</sub> enrichment at high <sup>222</sup>Rn concentrations further demonstrates that SGD saturates water column CO<sub>2</sub> and prevents further absorption of atmospheric CO<sub>2</sub> in highly productive coastal waters. The delivery of SGD into high alkalinity seawater will lead to buffering of a fraction of SGD-derived CO<sub>2</sub> input to form bicarbonate ions (*69*). Ecosystems with high respiration rates and lower buffering capacity such as tidal rivers and coastal lakes deviate from this pattern (*70*) and are clear outliers.

#### **Summary and implications**

Our multiple lines of evidence including a driver-response analysis (fig. S6), correlation analysis (Fig. 2), projections of surface water observations to groundwater end-members (fig. S12), groundwater observations (fig. S2), and local-scale flux estimates (Fig. 4) converge to the conclusion that groundwater enriched surface water

CO<sub>2</sub> in all tidal, nearshore shallow ecosystems. Across all globally distributed ecosystems, mean SGD-derived CO<sub>2</sub> and water-air CO<sub>2</sub> fluxes were 148 ± 226 and 80 ± 133 mmol m<sup>-2</sup> day<sup>-1</sup>, respectively. Groundwater-derived CO<sub>2</sub> may drive local coastal acidification due to increased CO<sub>2</sub> inputs, which is especially important in sensitive ecosystems like coral reefs (71). Tides modulated nearshore seawater CO<sub>2</sub> enrichment via tidal pumping enhancing groundwater exchange across the land-ocean continuum.

Our observations add conceptual insight into coastal carbon cycle investigations. Existing coastal carbon budgets emphasize river inputs, transformations within estuaries, and exchange with intertidal wetlands (72). Intertidal wetlands are SGD and CO<sub>2</sub> exchange hotspots. Tidally driven groundwater exchange in intertidal mangrove and salt marsh sediments accelerates organic matter respiration (43), explaining the particularly high fluxes observed in those ecosystems. Intertidal wetlands often cover small areas of river catchments but may account for over 50% of the total terrestrial carbon fluxes reaching the ocean as observed in Australia (73). Groundwater-derived CO2 fluxes in mangroves and salt marshes return 12 to 16% of the total primary productivity to the atmosphere (7), somewhat minimizing the potential for carbon sequestration in sediments. Our estimated groundwaterderived CO<sub>2</sub> fluxes are site specific and can contribute toward reducing uncertainties in local carbon budgets. Although our observations imply widespread impacts of SGD on coastal seawater CO<sub>2</sub> enrichments, the available datasets are not enough to allow for reliable global extrapolations. The best-sampled ecosystems are mangroves (n = 12sites) and coral reefs (n = 7). The mean SGD-derived CO<sub>2</sub> fluxes in those ecosystems range from 1 to 540 mmol  $m^{-2} day^{-1}$  and have large natural variabilities that create major challenges for reasonably upscaling and extrapolating the data.

This study emphasizes the need for process-based investigations of groundwater-mediated coastal carbon dynamics and highlights the paucity of data in African, Middle Eastern, and European regions. Additional observations are particularly important in data poor ecosystems such as coastal lakes (n = 2 sites), salt marshes (n = 2), and seagrass meadows (n = 3). Filling these data gaps is crucial to further build confidence in interpretations, enable globalscale extrapolations, and fully quantify the contribution from SGD to global coastal carbon budgets. Overall, our results highlight that coastal carbon budgets and management approaches to maximize coastal carbon sequestration should consider SGD (74) alongside better understood carbon sources such as rivers, pelagic respiration, and anthropogenic inputs.

#### **MATERIALS AND METHODS**

#### **Data acquisition**

We compiled high-resolution CO<sub>2</sub> and <sup>222</sup>Rn time-series observations from 40 different locations worldwide (Fig. 1, fig. S1, and table S1). The sites represent nine major coastal ecosystem types (coral reef, mangrove, salt marsh, canal, freshwater tidal river, estuary, tidal flat, coastal lake, and seagrass meadow) (fig. S1). The criteria for inclusion of a dataset were availability of observations for the groundwater tracer <sup>222</sup>Rn (temporal resolution of ~30 min; dpm liter<sup>-1</sup>), Pco<sub>2</sub> (temporal resolution of ~10 min; µatm), temperature (°C), and salinity for at least two tidal cycles. Additional parameters include DO (%), wind speed (m/s), and water depth (m). Of 40 locations, 32 datasets were previously published, and 8 datasets are original (table S1). All measurements were aligned so that the time stamps are the same for all variables. After alignment, the data were processed in Python (version 3.10.11). The conceptual model was created with Inkscape (version 0.93).

#### **Time-series observations**

The same sampling methods were used to obtain continuous surface water time-series observations from all 40 sites. <sup>222</sup>Rn was measured to quantify SGD fluxes. In these studies, CO2 and <sup>222</sup>Rn observations were obtained using a (LI-COR)-RAD7 coupled system (28). The LI-COR measures the PCO<sub>2</sub>, and the RAD7 (Durridge Inc.) measures the <sup>222</sup>Rn concentration based on its alpha-emitting daughter <sup>218</sup>Po with precisions of 2 µatm and 10%, respectively (28). To obtain high-resolution observations, we pumped surface water into a showerhead air-water equilibrator (RAD AQUA). The air in the headspace of this equilibrator is then circulated through a Drierite desiccant into the calibrated LI-COR and RAD7 setup. The airwater equilibrator and gas detectors were connected in a closed air loop with the gas detectors connected in series.

The LI-COR measures the PCO<sub>2</sub> every second. The <sup>222</sup>Rn concentrations were integrated over 10- to 60-min intervals depending on the concentrations encountered. Time lags of about 10 min are expected for CO<sub>2</sub> and 30 min for <sup>222</sup>Rn due to air-water equilibration time and radioactive decay within the air loop (28). Corrections were made to adjust for these time lags. The dry molar concentration of  $CO_2$  was converted to  $PcO_2$  using temperature and salinity (75). The concentrations of <sup>222</sup>Rn were calculated from solubility coefficients (76).

#### Ancillary parameters

Calibrated Hydrolab MS5 optical sensors, miniDOT DO loggers, Hach LDO with luminescent sensors, and Van Essen and Hobo conductivity-temperature-depth sondes were used to measure the DO, depth, temperature, and salinity in surface water. The temporal resolution of observations ranged between 1 and 30 min and was aligned to <sup>222</sup>Rn time steps. Wind speeds were obtained from weather stations located within 10 km of the observation sites. For sites where wind speeds were not available, we used reanalysis data from ERA5 (77). The raw reanalysis data were then processed in MATLAB to obtain hourly wind speeds. Atmospheric CO<sub>2</sub> levels at each sampling site and date were obtained from historical trends documented by the National Oceanic and Atmospheric Administration (NOAA) (noaa.gov).

#### Groundwater end-member sampling

Discrete groundwater samples were collected near the surface water time-series sampling locations as summarized in table S3. The groundwater observations were compared to surface water values and used to estimate local-scale SGD-derived CO2 fluxes that can be compared to local water-air CO<sub>2</sub> fluxes. Groundwater endmembers were obtained from a push-point piezometer system or monitoring bores up to ~1 m deep. A peristaltic pump was used to sample the groundwater from bores or push-point piezometer systems (78). The tubing and bores were flushed several times prior to sampling. A handheld multiprobe was used to determine the ancillary water quality parameters such as the temperature, DO, and salinity. For analysis of <sup>222</sup>Rn, groundwater was sampled in a 6-liter high-density polyethylene bottle that was then connected to the RAD7 (79). The groundwater CO<sub>2</sub> values were determined from the head-space equilibration technique and a Picarro G2201-i (80) or from the analysis of dissolved inorganic carbon and alkalinity using the CO2Sys program (81) with carbonate system constants from Mehrbach et al. (82) refit by Dickson and Millero (83). Groundwater end-members are not available for seven sites, preventing calculations of SGD-derived CO<sub>2</sub> fluxes at all sites. The groundwater sample size then ranged from 3 to 48 with 20 of 40 sites having >10 samples (table S3).

#### CO<sub>2</sub> flux calculations

Water-air fluxes for  $CO_2$  (Eq. 1) were calculated using the method described in ref. (84)

$$F = kK_0 \Delta P co_2 \tag{1}$$

where F is the water-air  $CO_2$  flux, k is the gas transfer velocity for  $CO_2$  (m day<sup>-1</sup>),  $\Delta P CO_2$  is the water-air gradient of  $P CO_2$  (µatm), and  $K_0$  is the solubility coefficient of CO<sub>2</sub> (mol kg·atm<sup>-1</sup>) determined as a function of temperature and salinity (85). The gas velocity was determined using Eq. 2

$$k = 0.31(u)^2 (Sc/660)^{-0.5}$$
<sup>(2)</sup>

where k is the gas transfer velocity for  $CO_2$  (m day<sup>-1</sup>), Sc is the Schmidt number, and u is the wind speed (m/s). This approach assumes that wind is the main driver of turbulence and CO<sub>2</sub> exchange at the air-water interface. In some cases, currents and tidal variations may enhance turbulence (86). Because current observations are not available for most sites, we report conservative, wind-driven CO<sub>2</sub> fluxes that can be directly compared across multiple ecosystems.

### **Radon mass-balance model**

Groundwater discharge rates were calculated using <sup>222</sup>Rn massbalance models as explained in detail in the local-scale studies listed in table S1 and a recent review paper (*27*). In short, the <sup>222</sup>Rn mass balance accounts for all or most of the sources and sinks of <sup>222</sup>Rn in surface waters (Eq. 3). The sources include groundwater inputs, <sup>226</sup>Ra decay, sediment diffusion, and upstream inputs. The potential sinks include evasion, downstream exports, and <sup>222</sup>Rn decay (*31, 87*)

$$F_{gw}Rn_{gw} + F_{up}Rn_{up} + D_{dif}A + {}^{226}Ra\lambda_{222}V = F_{down}Rn_{down} + {}^{222}Rn\lambda_{222}V + J_{atm}$$
(3)

where  $F_{gw}$  stands for the groundwater discharge (m<sup>3</sup>/day),  $Rn_{gw}$  is the mean groundwater end-member concentration (dpm m<sup>-3</sup>),  $F_{up}Rn_{up}$  is for the <sup>222</sup>Rn flux upstream or mixing onshore (dpm day<sup>-1</sup>),  $D_{dif}$  is the diffusive <sup>222</sup>Rn flux (dpm m<sup>-2</sup> day<sup>-1</sup>), A is the wetted surface area of the section (m<sup>2</sup>), V is the water volume (m<sup>3</sup>), and <sup>226</sup>Ra $\lambda_{222}V$  is for the <sup>222</sup>Rn inputs from <sup>226</sup>Ra decay (dpm day<sup>-1</sup>).  $F_{down}Rn_{down}$  is for the downstream or offshore <sup>222</sup>Rn flux (dpm day<sup>-1</sup>), <sup>222</sup>Rn $\lambda_{222}V$  is the <sup>222</sup>Rn decay (dpm day<sup>-1</sup>), and  $J_{atm}$  represents the atmospheric <sup>222</sup>Rn evasion rate (dpm day<sup>-1</sup>). Minor changes to this <sup>222</sup>Rn mass-balance approach are required depending on the local geomorphology. For example, tidal creeks in mangroves and salt marshes require the integration of all fluxes over complete tidal cycles (50). Straight shorelines result in estimated fluxes over 1-hour time steps using a nonsteady approach (87).  $J_{atm}$ was determined using wind speed (Eq. 4) (88)

$$J_{\rm atm} = k \left( C_{\rm w} - \alpha C_{\rm air} \right) \tag{4}$$

where k is the gas transfer velocity (m day<sup>-1</sup>) at the boundary of airwater that has been corrected for the Schmidt number for <sup>222</sup>Rn at in situ temperature and salinity,  $C_{\rm w}$  is the concentration of <sup>222</sup>Rn in water,  $C_{\rm air}$  is the concentration of <sup>222</sup>Rn in the atmosphere, and  $\alpha$  is the Ostwald solubility.

#### Data analysis and interpretation

Pearson correlation coefficients were calculated between  $Pco_2$  versus <sup>222</sup>Rn, DO, and salinity. A relationship was considered at least moderately correlated if  $-0.5 \ge r \ge 0.5$ . Confirmation of driver-response relationships between  $Pco_2$ , <sup>222</sup>Rn, and DO was conducted using a CUSUM driver-response analysis (89). In this analysis, potential drivers (<sup>222</sup>Rn and DO) are paired with a response variable ( $Pco_2$ ). The drivers are then sorted into ascending order. The CUSUM for the response variable ( $s_i$ ) is calculated using Eq. 5, where  $z_i$  represents the *i*th value in the standardized dataset

$$s_i = z_i + s_{i-1} \tag{5}$$

The slope of the CUSUM trend relative to the driving variable can indicate increasing, decreasing, or no effect relationships between driver and response variables.

We also assessed whether  $Pco_2$  was driven by diel or tidal (low tide versus high tide) cycles (fig. S11). A strong diel cycle (day versus night) signature implies that photosynthesis and respiration are the primary controls on  $Pco_2$  (39). In comparison, tidal cycle predominance (low tide versus high tide) implies that hydraulic head gradients between groundwater and the ocean (steeper at low tide) are the main driver of  $Pco_2$  dynamics (50). We calculated diel and tidal indices for each successive low-high tide and day-night cycle (Eq. 6 and fig. S9). Data from every location were selected within the range of ±1 hour from the peak hour of each low tide, high tide, day (12:00), and night (00:00) (fig. S10) with respect to the local time zone. We then calculated the mean values of DO saturation (%),  $^{222}$ Rn (dpm/liter), salinity, and  $P_{CO_2}$  (µatm) for each data bracket. Once the data were selected, two new coefficients were computed to quantify the impact of tidal and diel cycles on the parameter ( $\eta$ )

Tidal effect index (TEI) = 
$$\frac{\sqrt{(\eta_{\rm H} - \eta_{\rm L})^2}}{\overline{\eta}};$$
 (6)  
Diurnal effect index (DEI) =  $\frac{\sqrt{(\eta_{\rm D} - \eta_{\rm N})^2}}{\overline{\eta}}$ 

where  $\eta_H$ ,  $\eta_L$ ,  $\eta_D$ , and  $\eta_N$  denote the parameter value during high tide, low tide, day, and night, respectively.  $\overline{\eta}$  is the parameter mean for the entire measurement period.

To further assess whether surface water  $P_{CO_2}$  was driven by CO<sub>2</sub>enriched groundwater inputs, we projected the linear regression of  $P_{CO_2}$  versus <sup>222</sup>Rn to the expected groundwater end-member measurements (fig. S12). In this analysis, groundwater samples are expected to mix linearly with low  $P_{CO_2}$  and low <sup>222</sup>Rn surface seawater. Any deviations from this simple mixing are interpreted as additional sources or sinks of CO<sub>2</sub> (90). If the deviation is above the projected line (positive deviation), then additional CO<sub>2</sub> sources are affecting observations. Contrastingly, if this deviation is below the projected line (negative deviation), then this can be attributed to separate CO<sub>2</sub> sinks distinct from mixing. A deviation quotient (DQ) was calculated to quantify the magnitude of the deviation (Eq. 7)

$$DQ(\%) = \frac{D}{P_{CO_{2gw}}} \times 100$$
(7)

where *D* is the distance of deviation from the linear projection (µatm) and  $\overline{P_{\text{CO}_{2gw}}}$  is the mean of  $P_{\text{CO}_2}$  in groundwater end-member samples (µatm). Equation 8 was used to calculate the deviation from the projected line (*D*)

$$D = \left[ \left( S \times \overline{\mathrm{Rn}_{\mathrm{gw}}} \right) + In \right] - \overline{P_{\mathrm{CO}_{2\mathrm{gw}}}}$$
(8)

where S represents the slope of correlation between surface water  $P_{CO_2}$  with <sup>222</sup>Rn, *In* represent the intercept value between surface water  $P_{CO_2}$  and <sup>222</sup>Rn, and  $\overline{P_{CO_{2gw}}}$  is the mean of  $P_{CO_2}$  in groundwater endmember samples (µatm). The criteria that were chosen for acceptable range of deviation was  $-100\% \le DQ \le 100\%$ . If DQ was within this range, then it was inferred that surface water  $P_{CO_2}$  dynamics closely resemble that of the control and hence SGD is the primary driver of the CO<sub>2</sub> dynamics in these coastal waters. The conclusions were drawn based on interpretation of the various lines of evidence mentioned.

Supplementary Materials This PDF file includes:

Figs. S1 to S13 Tables S1 to S5 References

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