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OPEN SGD-OD: investigating the potential oxygen demand of submarine groundwater discharge in coastal systems

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Submarine groundwater discharge (SGD) supplies nutrients, carbon, metals, and radionuclide tracers to estuarine and coastal waters. One aspect of SGD that is poorly recognized is its direct effect on dissolved oxygen (DO) demand in receiving waters, denoted here as SGD-OD. Sulfate-mediated oxidation of organic matter in salty coastal aquifers produces numerous reduced byproducts including sulfide, ammonia, dissolved organic carbon and nitrogen, methane, and reduced metals. When these byproducts are introduced to estuarine and coastal systems by SGD and are oxidized, they may substantially reduce the DO concentration in receiving waters and impact organisms living there. We consider six estuarine and coastal sites where SGD derived fluxes of reduced byproducts are well documented. Using data from these sites we present a semiguantitative model to estimate the effect of these byproducts on DO in the receiving waters. Without continued aeration with atmospheric oxygen, the study sites would have experienced periodic hypoxic conditions due to SGD-OD. The presence of H₂S supplied by SGD could also impact organisms. This process is likely prevalent in other systems worldwide.

Hypoxia is a widespread and growing problem in estuaries and along continental shelves across the globe¹. It is often caused by respiration of organic matter derived from the overlying water column or upstream environments². Oxygen, however, can also be consumed through the oxidation of other reduced substances, concentrations of which are often enriched in the groundwater found within coastal aquifers. These coastal aquifers can be thought of as subterranean estuaries where freshwater and seawater meet, mix, and react with sediments in the aquifer and aquiclude^{3,4}. These reactions are often mediated by microorganisms⁵. The abiotic and biological reactions that occur within subterranean estuaries, especially those oxidizing organic matter (OM), enrich fluids in a suite of components, including nutrients, dissolved inorganic (DIC) and organic (DOC) carbon, sulfides (here we refer to H_2S but recognize HS⁻ is also present) and other trace gasses (CH₄ and N₂O), reduced metals (Fe²⁺ and Mn²⁺), and Ra^{2+4,6}. These reaction products dramatically alter the fluids delivered to surface estuaries and released into the coastal ocean by submarine groundwater discharge (SGD). As such, SGD components play critical roles in numerous coastal biogeochemical processes, such as biological production and community structure and as a source/sink of atmospheric CO₂^{7,8}. The reduced components in SGD also serve as electron donors in oxygen-consuming reactions that lower dissolved oxygen (DO) in coastal waters. Here, we explore the potential influence of SGD on estuarine and coastal DO concentrations and hypoxia (Fig. 1).

Oxygen is typically the dominant electron acceptor available for organic matter oxidation in meteoric (i.e., containing low total dissolved solids) groundwater, which contains about 0.28 mmol L^{-1} DO when saturated at 25 °C^4 . Saline groundwater, in contrast, contains sulfate ion (SO₄⁻²), a strong oxidizing agent. The average concentration of SO_4^{2-} in seawater is 28 mmol L⁻¹. Thus, in groundwater systems dominated by seawater, SO_4^{2-} may be as much as 100 times higher than the concentration of DO in freshwater⁴. In terms of oxidation capacity, each mmol of sulfate can oxidize 2 mmol of carbon [Eq. (1)], while each mmol of DO can only oxidize 1 mmol of C. Thus, the oxidation capacity of sulfate relative to DO is up to 200 times greater.

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Figure 1. Illustration of reactions within the subterranean estuary that enrich submarine groundwater discharge (SGD) in electron donors. When these electron doners are transported to coastal waters by SGD, they react with oxygen, reducing the dissolved oxygen content of receiving waters.

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$$2CH_2O + 2H^+ + SO_4^{2-} \rightarrow 2CO_2 + H_2S + 2H_2O$$
(1)

Because aquifer fluids containing sulfate can oxidize much more OM than systems with only DO, they produce more reduced byproducts, including $\rm NH_4^+, H_2S$, and additional DOC depending on the OC content within the aquifer. When these reduced byproducts are released by SGD, their oxidation in receiving waters drives a reduction in DO concentration. The extent of DO reduction depends on the volume of SGD, the concentrations and form of electron donors, the time scale and kinetics of the oxidation reactions, and other removal mechanisms.

This paper highlights the potential of SGD to decrease DO concentrations in estuarine and coastal waters. We use the term SGD-OD to refer to the potential oxygen demand by SGD⁹ and describe a semiquantitative technique for evaluating oxygen consumption at several sites. While the technique is based on limited data and assumptions regarding the behavior of SGD components once discharged, we nevertheless demonstrate that SGD has the potential to significantly deplete DO concentrations in multiple estuarine and coastal water systems.

SGD-OD mass balance model

To highlight the potential impact of SGD-OD, we developed a simple model using the mass balance of electrons needed to reduce DO in a typical marine ecosystem. During oxygen reduction, molecular oxygen is converted to oxidized substrate and/or water through the gain of four electrons. Thus, to reduce the DO concentration by 100 μ mol L⁻¹ requires 400 e⁻ L⁻¹. These electrons are supplied by the reduced byproducts (electron donors) carried by SGD. For example, to oxidize NH₄⁺ to NO₃⁻ requires a loss of 8 electrons (– 8e⁻) and oxidizing 100 μ mol L⁻¹ of NH₄⁺ to NO₃⁻ results in an electron loss of 800 e⁻ L⁻¹.

We recognize that Fig. 1 represents a highly simplified version of more complex processes. For example, some electron donors are not oxidized rapidly and thus the true reduction capacity also depends on the timescale and the effects of microorganisms⁵. We assume the inorganic components (primarily H_2S and NH_4^+) oxidize rapidly, within a few days¹⁰. However, OM is comprised of an array of compounds that degrade at highly variable rates, with less complex OM, such as carbohydrates and proteins, often preferentially utilized over other more complex molecules such as lignin¹¹. Labile OM, produced from fresh biomass, consumes DO more typically at a Redfield-type O_2 :C of $0.77^{12,13}$. In coastal systems OM consumption and biological oxygen demand (BOD) are most often dominated by dissolved organic matter (DOM) and is typically measured as the DO loss that occurs over a 5 to 28 day period¹⁴. While BOD rates vary significantly, consumption rates greater than 50% of DOC have been found in coastal systems influenced by urbanization¹⁵. The magnitude of this fraction likely differs depending on the environment. Hereafter, we conservatively assume 15% of the DOC in SGD is oxidized within a few days. This allows us to include DOC in the calculations without putting undue weight on this component. Since CH₄ in shallow systems evades to the atmosphere within a few hours¹⁵, and CH₄ oxidation rates can vary with salinity and temperature¹⁶, we reduce its potential effect by 60%. While this is a crude approximation, it does allow us to demonstrate the impact of CH₄ relative to other electron donors given this important by product¹⁷.

SGD study sites and results

Fluxes of SGD to estuarine and coastal waters occur episodically. During tidal cycles, SGD usually peaks during falling tide¹⁸. Evidence for longer time scales is found in changing radium isotope signals¹⁹⁻²² and in thermal records in continental shelf sediments^{22,23}. The thermal records show short (1–3 day) episodes of strong SGD that are associated with wind patterns that temporarily lower sea level^{22,23}. Storm events also produce strong episodic SGD^{24–27}. Here, average fluxes and concentrations are used in the model, while recognizing that episodic fluxes may have more serious consequences.

To understand the potential impact of SGD on DO concentration, knowledge of the salty SGD flux is required. One of the most common techniques for constraining salty SGD is the use of radium isotopes¹⁸. To highlight the potential impacts of SGD-OD on receiving waters, we use site examples where SGD fluxes have been well characterized using radium isotopes and are accompanied by electron donor concentrations. A brief review of the use of radium isotopes in these studies is provided in the Supplemental Information (SI). We use component inventories to describe electron transfers in these shallow environments and to compare across SGD flux studies. An inventory is calculated as the total amount of a component in the water column over a given area. For example, if NH_4^+ has a concentration of 35 mmol m⁻³ and is well mixed over a 2.5 m water column, the inventory is 87.5 mmol m⁻².

Okatee basin SGD fluxes

The Okatee River and salt marsh are located inland of Hilton Head Island in southeastern South Carolina, USA. This area was the site of the Land Use—Coastal Ecosystem Study (LU-CES) from 1999 to 2005, which studied the hydrography, hydrology, and biogeochemistry of the study area. During 2001–2002, hypoxic conditions (DO < 2 mg L⁻¹ or < 64 µmol kg⁻¹) were found in 21.5% of the observations in the estuary (n = 20,900)^{28,29}. The Okatee River is formed where two small creeks converge in the upper reaches of the study area. The hydrology and biogeochemistry teams focused on the upper Okatee Basin (length = 5.6 km, low tide volume = 590,000 m³, tidal prism = 711,000 m³). About 80% of the tidal prism that exits the upper Okatee returns essentially unmodified each tidal cycle, resulting in a residence time of 2–4 days³⁰.

Monitoring wells were installed perpendicular to the river along two transects in the Basin and radium isotopes, nutrients, carbon, sulfide and Fe²⁺ concentrations quantified. Moore et al.³⁰ estimated ²²⁶Ra fluxes from this system and measured high concentrations of nutrients and carbon in Okatee groundwaters. Porubsky et al.³¹ found significant correlations between NH₄⁺, PO₄³⁻, DOC, DIC, DON and ²²⁶Ra in the groundwater. Fluxes can be calculated if the components are strongly correlated with ²²⁶Ra and the flux of ²²⁶Ra from the groundwater is known. We follow Porubsky et al.³¹ who estimated mean fluxes of NH₄⁺, DOC, and DON into the Basin (Table 2). They did not estimate H₂S fluxes, so we used the correlation of H₂S and ²²⁶Ra (773 µmol dpm⁻¹, R² = 0.53) and the ²²⁶Ra flux of 1.5 × 10⁸ dpm day⁻¹ to estimate a mean H₂S flux of 116 kmol day⁻¹ to the Basin. The concentrations of N₂O, Fe²⁺ and CH₄ were low and therefore not considered to impact DO consumption significantly.

Areal component fluxes per tidal cycle (mol $m^{-2} tc^{-1}$) were estimated by dividing each component flux by the water area at high and low tide (Table 1). Each of the electron donor fluxes were multiplied by the electron exchange and the results were summed to determine the areal e^- flux. The e^- flux is dominated by H₂S, with NH₄⁺ contributing another 10%. Both DOC and DON are minor contributors. Increasing the fraction of DOC oxidized would have a minor impact at this and other study sites.

DO concentrations in the Okatee River range from < 30 to $> 300 \mu m L^{-127}$. At steady state, the flux of electron donors to the Okatee River could consume 71 to 450 $\mu mol L^{-1}$ of DO through each tidal cycle. This variability in potential DO reduction is primarily due to the differences in water coverage between high and low tide.

Component	Component flux* (kmol tc ⁻¹)	Areal flux** (mol m ⁻² tc ⁻¹)	e ⁻ supplied*** (mol m ⁻² tc ⁻¹)	Water depth (m)	DO reduction (mol m ⁻² tc ⁻¹)	DO reduction (µmol L ⁻¹ tc ⁻¹)	
High tide	High tide						
DOC	23.6	0.033	0.020	2.7	0.005	2	
NH4 ⁺	5.9	0.008	0.064	2.7	0.016	6	
H ₂ S	59.9	0.084	0.672	2.7	0.168	62	
DON	0.8	0.001	0.008	2.7	0.002	1	
Total			0.76		0.19	71	
Low tide							
DOC	23.6	0.116	0.070	1.5	0.017	12	
NH4 ⁺	5.9	0.029	0.233	1.5	0.058	39	
H ₂ S	59.9	0.295	2.361	1.5	0.590	390	
DON	0.8	0.004	0.032	1.5	0.008	5	
Total			2.69		0.69	450	

Table 1. Calculations of the supply of electrons to Okatee River. The areal component flux, electron (e⁻) flux, DO reduction, and volumetric DO reduction are provided on a per tidal cycle basis at both high tide (H) and low tide (L). All values are the mean of all individual sampling events (n = 8) with sufficient data to calculate a groundwater flux. *Based on a ²²⁶Ra flux of 1.5×10^8 dpm day^{-130,31} **High tide area = 7.13×10^5 m². **Low tide area = 2.03×10^5 m². ***We assume 15% of the total DOC flux is oxidized on a 2–4 day timescale.

Site/tio	le	Comp	Component flux (kmol tc ⁻¹)	Areal flux* (mol m ⁻² tc ⁻¹)	e ⁻ supplied** (mol m ⁻² tc ⁻¹)	Water depth (m)	DO reduction (mol m-2 tc-1)	$\begin{array}{c} DO \ reduction \\ (\mu mol \ L^{-1} \ tc^{-1}) \end{array}$
		DOC	2.23	0.012	0.01	0.65	0.002	3
		$\mathrm{NH_4}^+$	1.01	0.006	0.04	0.65	0.011	19
		H ₂ S	0.03	0	0	0.65	0	1
	Н	DON	0.18	0.001	0.01	0.65	0.002	3
		Fe	0.05	0	0	0.65	0	0
		CH_4	0.03	0	0	0.65	0	1
CI		Total			0.06		0.015	27
		DOC	2.23	0.203	0.12	1	0.035	30
		$\mathrm{NH_4^+}$	1.01	0.092	0.73	1	0.18	180
		H ₂ S	0.03	0.003	0.02	1	0.005	5
	L	DON	0.18	0.016	0.13	1	0.032	32
		Fe	0.05	0.005	0	1	0.001	1
		CH ₄	0.03	0.003	0.01	1	0.002	2
		Total			1.02		0.25	250
		DOC	59.9	0.122	0.08	0.62	0.018	25
		$\mathrm{NH_4^+}$	0.93	0.002	0.02	0.62	0.004	5
		H ₂ S	3.56	0.007	0.06	0.62	0.015	26
	Н	DON	0.91	0.002	0.01	0.62	0.004	5
		Fe	0.01	0	0	0.62	0	0
		CH_4	0.06	0	0	0.62	0	0
LINI		Total			0.17		0.041	61
		DOC	59.9	2.220	1.33	1	0.33	330
		$\mathrm{NH_4^+}$	0.93	0.035	0.28	1	0.069	69
		H_2S	3.56	0.132	1.05	1	0.26	260
	L	DON	0.91	0.034	0.27	1	0.067	67
		Fe	0.01	0	0	1	0	0
		CH_4	0.06	0.002	0.01	1	0.002	2
		Total			2.94		0.73	730
		DOC	25.4	0.079	0.05	0.81	0.012	14
		$\mathrm{NH_4}^+$	0.8	0.003	0.02	0.81	0.005	6
		H_2S	2.05	0.006	0.05	0.81	0.013	27
	Н	DON	0.82	0.003	0.02	0.81	0.005	6
		Fe	0.04	0.024	0.02	0.81	0.006	7
		CH_4	7.82	0	0	0.81	0	0
PC		Total			0.16		0.041	60
10		DOC	25.4	0.94	0.56	1	0.141	140
		$\mathrm{NH_4^+}$	0.8	0.03	0.24	1	0.059	59
		H_2S	2.05	0.076	0.61	1	0.152	150
	L	DON	0.82	0.03	0.24	1	0.060	60
		Fe	0.04	0.29	0.29	1	0.072	72
		CH_4	7.82	0.001	0.01	1	0.001	1
	Total			1.95		0.490	490	

Table 2. Calculations of the supply of electrons to at the 3 Sapelo Island study sites (CI, HN, and PC). The areal component flux, electron (e⁻) flux, DO reduction, and volumetric DO reduction are provided on a per tidal cycle basis at both high tide (H) and low tide (L). All values are the mean of all individual sampling events with sufficient data to calculate a groundwater flux at each study site (CI, n = 8, HN, n = 4, PC, n = 6). *High tide area for CI = 1.8×10^5 m², HN = 4.9×10^5 m², PC = 3.2×10^5 m². *Low tide area CI = 1.1×10^4 m², HN = 2.7×10^4 m², PC = 2.7×10^4 m². **We assume 15% of the total DOC flux and 40% of the CH₄ is oxidized on a 2–4 day timescale.

SGD is most pronounced during a falling tide¹⁸ and component fluxes interact with a smaller volume of water over a smaller area. As a result, the reduction potential of DO at low tide increases by more than a factor of 6 (Table 1) and could completely deplete the DO if components are consumed on a tidal timescale of a few hours. It is important to note, however, that SGD initially emerges at the start of ebb tide when there is more water in the system that dilutes the flux until absolute low tide. Furthermore, turbulence generated by exchange of the tidal prism in shallow water, in combination with river discharge, can rapidly entrain atmospheric oxygen into

the system. Buzzelli et al.²⁸ estimated mean DO utilization rates in the Okatee Basin of 0.15 mol m⁻² day⁻¹. The estimated potential DO reduction at high tide of 0.19 mol m⁻² tc⁻¹ could reduce 2.5 times this DO given the tidal cycle. That the Okatee River experiences only episodic versus pervasive hypoxic conditions suggests that atmospheric exchange in this shallow, turbulent system must explain the difference.

Three sites near Sapelo Island, GA

Sapelo Island is a ~ 67 km² barrier island situated between mainland Georgia, USA, and the Atlantic Ocean. Its landward coastline is characterized by expansive salt marshes connected to the adjacent estuary through a complex network of tidal channels and creeks. In 2008, transects of PVC monitoring wells were installed across 3 salt marshes around Sapelo Island with 30 cm screened intervals, 1–5 m beneath the marsh platform. These transects stretched from the bank of a tidal creek, across a salt marsh, and up to an adjacent upland area. The sites were designated CI, HN, and PC and are described in detail by Schutte et al.³² and in the SI. Samples for radium activity and concentrations of DOC, DON, NH₄⁺, H₂S, total Fe, and CH₄ were collected seasonally from each creek, ocean, and groundwater throughout 2008 and 2009. Schutte et al.³² used these data to estimate SGD using a radium mass balance for each sampling period. Further, they used ²²⁸Ra:²²⁶Ra mixing curves to identify the wells that tapped the sub-marsh aquifer and to indicate the wells most responsible for exchange with the tidal creek. They used this information to estimate the marsh component of SGD and multiplied SGD by the CH₄ concentration of the dominant sub-marsh aquifer to determine the SGD-driven CH₄ flux from the salt marsh. Here, we expand upon this work to determine the SGD-derived flux of other reduced constituents that may contribute to surface water DO demand (Table 2).

High tide total DO demand across all sites and time periods ranged from 4 to 110 μ mol L⁻¹ tc⁻¹ with a median value of 34 μ mol L⁻¹ tc⁻¹. Low tide total DO demand was an order of magnitude higher, ranging from 48 to 1500 μ mol L⁻¹ tc⁻¹ with a median value of 335 μ mol L⁻¹ tc⁻¹. The higher demand at low tide again reflects the order of magnitude lower volume of surface water in the estuary relative to high tide. There was between-site variability in total DO demand, with site HN having the highest demand and site CI having the lowest. However, there were no seasonal patterns in total DO demand either within or across sites.

The groundwater components that contributed most significantly to total DO demand were highly variable both spatially (CI, PC, and HN) and temporally (PC and HN). For example, at site HN, DOC contributed 41–45% of the total DO demand followed by H₂S (36–43%). At site CI, NH₄ was dominant, contributing 70–72% of the total DO demand. At site PC H₂S dominated (31–45%) DO demand followed by Fe²⁺ (12–15%).

Mississippi coast

Mississippi Sound is an estuary located in the northern Gulf of Mexico along the coasts of Mississippi and Alabama, USA. Hypoxic events and fish kills occur frequently along the Mississippi coast, often in the western-most section³³⁻³⁶. A time series of five stations on the western Sound beaches were conducted between July 2017 and November 2019, where surface water and groundwater samples were sampled for radium, NH₄⁺, DOC, CH₄, and Fe²⁺³⁷. Groundwater H₂S samples were collected in January 2023 from each of the five stations. A mixing model using ²²⁸Ra was constructed to determine the SGD flux into the Sound at each station per month, ranging from <0 (i.e., seawater intrusion) to 62 cm³ cm⁻² day⁻¹, with an average SGD flux of 9.9 cm³ cm⁻² day⁻¹ during summer and fall³⁷.

Lowest DO values averaged 207 μ mol O₂ L⁻¹ during the summer and early fall. Based on temperature data, the average saturation of the water was 259 μ mol O₂ L⁻¹, a reduction of 52 μ mol O₂ L⁻¹, or 0.05 mol DO m⁻² in a 1 m water column. This requires 0.2 mol e⁻ m⁻². In surface waters, there is a trend of decreasing DO with increasing ²²⁶Ra (Fig. 2) that qualitatively suggests that SGD is contributing to DO depletion.

Unlike the Okatee Basin and Sapelo Island, tidal influences were not directly measured and likely play a smaller role in SGD discharge in this system. The e load to coastal waters was therefore calculated on a daily basis



Figure 2. Dissolved oxygen versus ²²⁶Ra at near shore sites in the western Mississippi Sound. Despite the shallow depth of sample collection (1 m), low concentrations of DO are associated with high ²²⁶Ra activities along the Mississippi coast. Red circles denote samples collected during verified fish kills at the different sites.

using groundwater endmember concentrations collected from the 5 stations, the SGD flux, and the electron flux based on the number of electrons exchanged (Table 3). The e⁻ supply from SGD was 0.63 mol m⁻² day⁻¹³⁸. H₂S clearly dominated the electron balance. On average, the total DO demand from SGD was 160 µmol DO L⁻¹ day⁻¹, though the average DO concentration remained above 200 µmol L⁻¹. Continual aeration of these shallow waters appears to prevent DO concentrations from declining further. Atmospheric invasion of DO into the water column was calculated from the actual DO concentration, potential saturated DO, and the wind speed^{39,40}. The average atmospheric invasion of DO into the water column was 373 µmol DO L⁻¹ day⁻¹ of O₂ into the shallow water column^{39,40}. Turbulence could further increase aeration. During the summer and fall when fish kills were observed, the oxygen invasion exceeded 200 µmol L⁻¹ day⁻¹. Therefore, oxygen resupply in this shallow environment offset the DO reduction due to SGD. Three fish kills were verified during this study even though DO at our sites did not approach hypoxic conditions, perhaps due to the high abundance of hydrogen sulfide (see "Discussion"). Hypoxic conditions further offshore may have also led to the fish kills at these times.

Offshore South Carolina coast

Data from a monitoring station on the northern South Carolina, USA coast at Myrtle Beach reveal episodic periods of hypoxic conditions in bottom waters in the late summer. The station is maintained by Coastal Carolina University at the end of Apache pier, which extends 250 m into the ocean. Surface and bottom waters are monitored continuously. The real-time and archived data from Apache pier are available online: http://hydro metcloud.com/hydrometcloud/index.jsp.

Radium samples collected from the end of Apache pier in mid-August 2012 contain the highest ²²⁶Ra and ²²⁸Ra activities ever measured in the South Atlantic Bight, exceeding measurements earlier in the summer by about one order of magnitude²¹. After eliminating other sources of radium, Peterson et al.²¹ concluded the enrichment must be due to SGD from aquifers on the continental shelf. They used the ²²⁸Ra activity ratio (AR) in the samples to identify the source as an aquifer tapped by monitoring wells A and R located about 18 km offshore²¹. Using the average radium activities that had been measured in the wells, they determined that SGD from this aquifer could support an inventory of 1.7 m³ m⁻² of SGD in the study area.

Peterson et al.²¹ found average bottom water DO values changed at the end of Apache pier (4.5 to 6.5 m depth depending on tide) from 175 μ mol DO L⁻¹ (n = 8) prior to the discharge event on 4 August, to 102 μ mol DO L⁻¹ (n = 15) on 16–17 August, a reduction of 73 μ mol DO L⁻¹. Taking the bottom water thickness as 2 m based on temperature profiles, this translates into a reduction of 0.15 mol DO m⁻², requiring 0.6 mol e⁻ m⁻². Peterson et al.²¹ concluded that if the SGD contained no DO, dilution alone could explain the observed reduction in DO.

The composition of water in wells A and R was measured from 1999 to 2013. From these data (see SI), the average concentration (in μ mol L⁻¹) of each potential electron donor was used with the SGD inventory measured in August 2012 to calculate an e⁻ inventory of 3.53 mol m⁻² (Table 4). The inventory is six times higher than that needed to reduce bottom water DO concentrations by 75 μ mol L⁻¹. Because the site is close to the surf zone located only 250 m from shore, waves and turbulence at the air-sea interface must constantly resupply DO through atmospheric exchange.

Another episodic offshore SGD event was sampled in August 2019 (Table 4) with samples spanning about ~ 170 km from Apache Pier to 10–20 km offshore of Charleston, SC²². This episodic event was predicted based on the wind field in late July 2019. Bottom waters were depleted in DO and enriched in radium, but not to the extent as measured at Apache pier in 2012. Figure 3 compares the 2012 and 2019 DO and Ra data.

In August 2019 the bottom waters off Charleston contained an average of 124 μ mol DO L⁻¹. Unlike August 2012, the DO content of the bottom water immediately prior to the SGD event is unknown. We therefore use data from May 2019 when bottom water DO averaged 137 μ mol L⁻¹²². This implies a decrease of 13 μ mol DO L⁻¹ between May and August and a total e⁻ demand of 0.46 e⁻ m⁻² for the 8.9 m bottom water column. Based on the radium isotope composition, wells A and R were again identified as the source of the radium enrichment and an SGD inventory of 0.26 m³ m⁻² was estimated²². This translates into an e⁻ supply of 0.54 mol e⁻ m⁻², more than sufficient to account for the reduction in DO observed over the time period (Table 4).

Component	GW endmember (µM)	Areal flux (mol m ⁻² day ⁻¹)*	e ⁻ supplied (mol m ⁻² day ⁻¹)**	DO reduction (μ mol L ⁻¹ d ⁻¹)
H ₂ S	577	0.057	0.46	120
DOC	363	0.036	0.02	5
$\mathrm{NH_4}^+$	112	0.011	0.09	22
DON	71	0.007	0.06	14
Fe ²⁺	8	0.001	0.00	<1
CH ₄	4	0.000	0.00	<1
Total			0.63	160

Table 3. Calculation of the electron supply from SGD to the Mississippi Sound. *Based on SGD flux of 9.9 cm³ cm⁻² day⁻¹. **We assume 15% of the total DOC flux and 40% of the CH₄ is oxidized on a 2–4 day timescale.

Component	GW endmember (µmol L ⁻¹)	Component inventory (mol m ⁻²)	e ⁻ supplied*** (mol m ⁻²)	DO reduction (mol m ⁻²)	Water depth (m)	DO reduction (µmol L ⁻¹)
Aug. 2012						·
DOC	362	0.093*	0.371	0.09	2	46
NH4 ⁺	135	0.231*	1.847	0.46	2	230
H ₂ S	52	0.089*	0.711	0.18	2	89
DON	44	0.075*	0.602	0.15	2	75
Total			3.53	0.88		440
Aug. 2019		·	•	·		
DOC	362	0.014**	0.056	0.01	8.9	2
NH4 ⁺	135	0.035**	0.281	0.07	8.9	8
H ₂ S	52	0.014**	0.108	0.03	8.9	3
DON	44	0.011**	0.092	0.02	8.9	3
Total			0.54	0.13		16

Table 4. SGD components and their effects on DO off the coast of South Carolina measured during two SGD events. *Based on an SGD inventory of 1.7 m³ m⁻². **Based on an SGD inventory of 0.26 m³ m⁻². **We assume 15% of the total DOC flux is oxidized on a 2–4 day timescale.







Discussion

Hypoxia is recognized to be widespread, exerting significant biological stress in coastal ecosystems¹. For example, coastal zooplankton and fish suffer several deleterious effects, including reduced prey capture efficiency, growth and reproductive potential, and even death⁴¹. Hypoxic zones further diminish and compress habitats, by making deeper, cooler waters unavailable in the summer⁴². Indeed, ecosystems exposed to long periods of hypoxia are characterized by low annual secondary production and minimal to no benthic fauna. Hypoxic zones in the Baltic Sea and Chesapeake Bay are estimated to have caused a loss in secondary production of ~ 6000 to 10,000 MT C annually; for the Gulf of Mexico, this loss may be as high as 17,000 MTC annually¹. Increasing hypoxia also influences benthic biogeochemistry, both directly and indirectly. With the reduction in benthic fauna, sediment bioturbation is reduced, exacerbating the impacts of low DO on pore water chemistry, limiting oxygen-requiring reactions, *e.g.*, coupled nitrification/denitrification, and stimulating loss of metals and phosphorus from sediments into the overlying water column.

Top-down vs bottom-up hypoxia mechanism

The classic top-down mechanism for generating coastal hypoxia first involves the supply of abundant nutrients to coastal waters, which increases biological productivity. The high productivity increases OM sedimentation to the seabed where this OM is oxidized by DO and drives hypoxia in stratified bottom waters that cannot receive new DO by mixing with surface or offshore waters. SGD can play a top-down role in DO depletion by supplying excess nutrients. Many studies have concluded that SGD nutrient supply is often greater than the supply from

local rivers^{18,43-48}. Alternately, SGD also plays an immediate bottom-up role in decreasing DO concentrations by supplying electron donors to bottom waters that reduce DO directly.

Numerous papers suggest a link between SGD and low DO concentrations in estuarine and coastal waters^{49–54}. Few papers link the reduced components in SGD directly to oxygen consumption in these systems. Peterson et al.²¹ demonstrated that simple dilution of bottom water with minimal DO SGD input could explain the DO reduction at Apache Pier in 2011. Guo et al.⁵⁵ measured SGD fluxes to the Changjiang (Yangtze) River estuary in China based on a ²²²Rn mass balance model and found that SGD fluxes were higher in the summer when hypoxic conditions prevailed in the estuary and lower in the winter when hypoxic conditions were absent. They suggested SGD contributed to hypoxic conditions by either a top-down or bottom-up mechanism. Sanial et al.⁹ applied a multi-tracer model to evaluate chemical mass balances in bottom waters along the coastline south of the Mississippi Sound and concluded that a common mechanism must supply Ra isotopes, Ba, and Si. After eliminating other sources, they concluded SGD must supply these components, driving oxidation of reduced SGD species (NH₄⁺, H₂S, CH₄, DOC) and consuming DO in the process, thus promoting the development of seasonal hypoxia. Inverse correlations between the SGD proxy ²²⁸Ra and DO in bottom waters further substantiated their hypothesis.

Here, we provide a mechanistic link between SGD and DO reduction and present supporting data from a variety of disparate coastal environments. These results further offer insights into when and where SGD-OD is most likely to influence coastal hypoxia. Estuaries experience quite different potential DO depletions at low and high tide due to extreme changes in water depth and areal extent. In the studies highlighted here, potential depletions at high tide ranged from 27 to 71 μ mol L⁻¹. During low tide, potential depletions increased by an order of magnitude and would have resulted in anoxic conditions if no aeration occurred (Table 5).

Effects of H₂S besides DO reduction

Specific components of SGD, such as hydrogen sulfide, which at pH <7 is the most prominent sulfide species⁵⁶, may also have direct detrimental effects irrespective of DO. The 96-h LC₅₀ H₂S concentration for marine fish is 1.5 to 15 μ mol L⁻¹⁵⁷. For example, throughout the year, water in the Okatee estuary has a pH ~ 7³¹, meaning about 50% of dissolved sulfide is H₂S (the HS⁻ ion is much less toxic than H₂S)⁵⁷. This water usually contains some measurable H₂S with median concentrations much higher from April to September (hot) compared to October through March (cool) (Table 6). Here, the total dissolved sulfide concentration was divided by 2 to estimate the H₂S concentration. The number of samples having >1 µmol L⁻¹ during the hot period was 11 out of 13, while in the cool period only 3 of 8 samples exceeded 1 µmol L⁻¹. A sample collected on 26 April 2002 was omitted, as it had 145 µmol sulfide L⁻¹ and is viewed as an outlier. The average hot period H₂S concentrations are above the lower limit of 1.5 µmol L⁻¹ for 96-h LC₅₀. These H₂S concentrations will kill some organisms and likely stress many more.

Millero et al.⁵⁸ measured the half-life of H_2S in air-saturated seawater at pH 8.0 to be 26 ± 9 h. However, Luther et al.⁵⁹ demonstrated that abiotic H_2S oxidation rates yielded half-lives of hundreds of hours when conducted under oxic, clean, sterile conditions. Yet, when the sulfide oxidation rates were measured in the presence of chemolithotrophic microbes, light, and oxygen, they increased three orders of magnitude. The implication of these findings is that the residence time of H_2S will largely be determined by the population size and activity of microbial communities rather than by chemical oxidants alone.

Site	Potential DO reduction high tide (μ mol L ⁻¹ tc ⁻¹)	Potential DO reduction low tide (µmol L ⁻¹ tc ⁻¹)
Estuaries		
Okatee	71	450
CI	27	260
HN	61	740
PC	61	490
Coasts	e ⁻ available (mol m ⁻²)	Potential DO reduction (µmol L ⁻¹ day ⁻¹)
SC coast (2012)	3.53	440
SC coast (2019)	0.54	15
Miss sound	0.63	160

Table 5. Comparisons of the estuarine and coastal systems.

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Dates 2002-2005	Number samples	Average H ₂ S (µmol L ⁻¹)	Median H ₂ S (µmol L ⁻¹)	Number > 1 µmol L ⁻¹
Cool October-March	8	1.3	0.5	3
Hot April-September	13	1.7	2.1	11
All year	21	1.5	1.3	14

Table 6. Cool-Hot weather comparison of H₂S concentrations in the Okatee estuary.

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We estimated an SGD flux of 0.084 mol $H_2S m^{-2}$ to the Okatee estuary during a tidal cycle (Table 1). Assuming a 3-day residence time for the water, a 2.7 m mean depth and an H_2S concentration equal to 50% of the total dissolved sulfide, this SGD flux would produce an initial concentration of 93 µmol $H_2S L^{-1}$ before oxidation. With 93 µmol $H_2S L^{-1}$ as the initial concentration, a yearly median of 1.3 µmol $H_2S L^{-1}$ as the final concentration, and assuming first order kinetics, we determined a H_2S half-life of 0.5 days. This is about 1 tidal cycle during which the initial H_2S supply is exported with the tidal prism down the estuary. Given the half-life, only about 40% of this H_2S is present in the return flow as about 80% of the tidal prism returns to the upper estuary without significant mixing during each tidal cycle³⁰. Thus, only about 10% of the H_2S that is introduced in the upper estuary is supplied to the lower estuary. Of course, there may be additional SGD further downstream.

Conclusions

Electron donors supplied by SGD significantly reduce the DO concentrations in estuarine and coastal waters. Of the systems considered, sulfide (HS^-/H_2S) was the most dominant electron donor in about half the cases. Ammonia (NH_4^+) , DOC or DON were dominant in the rest. Although the potential to deplete DO below hypoxic conditions was certainly present in many cases, reductions were counterbalanced by invasion of oxygen from the atmosphere in the shallower coastal systems. Our use of average fluxes and concentrations may have further underestimated the DO potential during periods of high SGD.

The subterranean estuary is expanding because of sea level rise and mining of freshwater aquifers⁴. This expansion increases the contact between sulfate and OM that has not been in contact with seawater for thousands of years. The byproducts of sulfate–OM reactions enrich the subterranean estuary in a variety of electron donors. As these electron donors are transported to estuarine and coastal waters by SGD, the potential for DO reduction is very likely to increase. More extensive studies of SGD-OD should therefore be conducted in stratified waters to better understand the role of SGD in direct DO consumption in coastal ecosystems.

Data availability

All of the data used in this paper has been published in papers referenced in the text or is presented in the Supplementary Information.

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Competing interests

The authors declare no competing interests.

Additional information

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