



1	Human Activities Caused Hypoxia Expansion in a Large Eutrophic
2	Estuary: Non-negligible Role of Riverine Suspended Sediments
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#### 21 Abstract

22 Increase in riverine nutrient loads was generally recognized as the primary cause of 23 coastal deoxygenation, whereas the role of other riverine factors, especially suspended 24 sediments, has received less attention. This study aims to discern the impacts of 25 anthropogenic alterations in various riverine inputs on the subsurface deoxygenation 26 over the past three decades in a large river-dominated estuary, the Pearl River Estuary 27 (PRE). By utilizing the physical-biogeochemical model, we reproduced the observed dissolved oxygen (DO) conditions off the PRE in the historical period (the 1990s with 28 29 high-suspended sediments-DO and low-nutrient inputs) and the present period (the 30 2010s with low-suspended sediments-DO and high-nutrient inputs). Due to the decadal changes in riverine inputs, the PRE has witnessed more extensive and persistent low-31 32 oxygen events during summer in the 2020s, with larger spatial extents of  $\sim$ 2926 km<sup>2</sup> for low oxygen (DO < 4 mg/L, increased by  $\sim$ 148% relative to the 1990s) and 617 km<sup>2</sup> 33 34 for hypoxia (DO < 3 mg/L, by 192%) and longer duration (by ~15-35 days), evolving 35 into three distinct hypoxic centers controlled by different factors. Model experiments 36 suggested that the decreased riverine DO content (46%) has led to a low-oxygen 37 expansion in the upper regions, accounting for 44% to the total increment. Meanwhile, 38 the increased nutrient levels (100% in nitrogen and 225% in phosphorus) and the 39 declined suspended sediment concentration (60%) have jointly promoted the primary 40 production and bottom oxygen consumptions (dominated by sediment oxygen uptake), 41 thus resulting in a substantial enlargement of low-oxygen area (104%) and hypoxic area 42 (192%) in the lower reaches. Our results revealed a more critical role of the riverine 43 suspended sediment decline in the exacerbation of eutrophication and deoxygenation 44 off the PRE via improving light conditions to support higher local productivity, which 45 could further amplify the effect combined with the growth in nutrients and confound 46 the effectiveness of hypoxia mitigation under nutrient controls. Overall, in the context 47 of global changes in riverine suspended sediments, it is imperative to reassess the 48 contribution of riverine inputs to the coastal deoxygenation worldwide over the past





- 49 decades, given that the impact of suspended sediments has been constantly overlooked
- 50 in relevant investigations.
- 51 Key words: Deoxygenation; suspended sediments; nutrient inputs; decadal changes;
- 52 Pearl River Estuary

# 53 Graphical Abstract



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55 DO process under low human activities (left) and high human activities (right). Note that 56 pollution indicates DIN, DIP and low oxygen water from the discharge.

#### 57 **1. Introduction**

58 Hypoxia emerges when dissolved oxygen (DO) concentration drops below 3 mg/L 59 in aquatic systems. It is an undesirable phenomenon which can lead to a series of 60 biological and ecological consequences, such as damaging the habitat for aquatic 61 organisms and imposing detrimental effects on the ecosystem community structure (Diaz and Rosenberg, 2008; Roman et al., 2019). Due to the substantial impacts from 62 human socioeconomic activities, coastal regions have become a hotspot for hypoxia 63 64 (Breitburg et al., 2018; Pitcher et al., 2021). Moreover, long-term exacerbation of 65 hypoxia with spatial expansion and increased intensity has been frequently reported in estuarine and coastal regions worldwide during the past decades, including the Baltic 66





Sea (Carstensen et al., 2014), the northern Gulf of Mexico (Bianchi et al., 2010),
Chesapeake Bay (Murphy et al., 2011), the Yangtze River Estuary (Chen et al., 2017),

and the Pearl River Estuary (Hu et al., 2021).

70 Plenty of studies were conducted to reveal the mechanism of hypoxia formation 71 and evolution in coastal regions. It has been widely recognized that coastal 72 deoxygenation is largely attributed to the eutrophication-driven production of organic 73 matters (Su et al., 2017; Wang et al., 2016), which sink to the subsurface waters and 74 bottom sediments, leading to intense oxygen depletion (Wang et al., 2014). This would induce hypoxia when the density stratification restricts DO replenishment from the 75 surface waters (Wang et al., 2018). One important reason underlying eutrophication and 76 77 hypoxia is the excessive nutrients that are discharged into the water column and 78 stimulate phytoplankton blooms (Cullen, 2015; Wang et al., 2016; Wang et al., 2021). 79 In addition, an improved light condition, e.g., due to the decreased suspended sediment 80 loads, could also favor the enhancement of local production and hence hypoxia (Ge et 81 al., 2020; Huang et al., 2022). The effects of nutrient and light conditions vary in coastal 82 systems due to different hydrodynamic and topographic features, which makes the 83 formulation of hypoxia mitigation strategies more challenging. Therefore, a 84 quantitative assessment on the importance of these factors in generating hypoxia is 85 crucial for understanding the primary drivers of hypoxia evolution and for proposing 86 effective countermeasures.

87 A case in point is the Pearl River Estuary (PRE), which is situated in the northern South China Sea and close to the Guangdong-Hong Kong-Macao Great Bay Area (Fig. 88 89 1a). Owing to the relatively large nutrient inputs and vertical stratification formed by 90 freshwater plume, hypoxia typically occurs during summer in the bottom waters of the 91 PRE. Before the 2000s, it was an episodic and small-scale issue because of the 92 synergetic effect of shallow topography, high turbidity (Ma et al., 2022), and the 93 intermittent stratification due to periodic disturbance by the tides. However, large-scale 94 occurrences of low oxygen (when DO < 4 mg/L) and hypoxia were frequently reported





95	in recent years. For example, it was estimated that the low-oxygen area within the PRE
96	achieved 1000 $\rm km^2$ and 1500 $\rm km^2$ during summer in 2010 (Wen et al., 2020) and 2015
97	(Li et al., 2018), respectively, which were nearly double to that before the 2000s (Li et
98	al., 2020b). Hu et al. (2021) compiled historical observations over four decades to
99	investigate the long-term deoxygenation trend and its spatial expansion in the PRE.
100	They highlighted the significant contributions of increased nutrient and decreased
101	sediment fluxes from the Pearl River to the exacerbation of low-oxygen conditions in
102	the region. Besides, the low-oxygen inflows from the Pearl River could also contribute
103	to the low-oxygen area in the upper estuary (Hu et al., 2021). Nevertheless, a
104	quantitative understanding of their relative contributions to the low-oxygen expansion
105	in the PRE is lacking, particularly in different subregions (Fig.1b) where the
106	mechanisms controlling the low-oxygen conditions are different (Li et al., 2020a).
107	In this study, we use a coupled physical-biogeochemical model to investigate the
108	decadal changes (the 1990s versus the 2010s) in summertime DO contents and related
109	biogeochemical processes in the PRE and to quantify the relative contributions of the

changing riverine inputs (including nutrients, suspended sediments, and oxygen content;
Fig. 1c-f) to the long-term expansion of low oxygen (DO < 4 mg/L) and hypoxia (DO</li>

112 < 3 mg/L) in the region.

## 113 **2. Material and methods**

#### 114 **2.1 Study area**

The PRE and its adjacent shelf waters (Fig. 1a) represent an estuarine system under intensive human activities. One major anthropogenic impact in the PRE is the terrestrial substances fed by the Pearl River, which is the third largest river in China with an average annual runoff of  $3.26 \times 10^8$  m<sup>3</sup> (Luo et al., 2002), through eight river outlets, including Humen, Jiaomen, Hongqili, Hengmen, Modaomen, Jitimen, Hutiaomen, and Yamen (Fig. 1a). The long-term DO and water quality data used here were collected from open sources (e.g. government websites) and published studies





- 122 (Table S1). Over the past few decades, the terrestrial inputs from the Pearl River has
- 123 experienced remarkable changes in oxygen content, sediment loads, and nutrients
- 124 including dissolved inorganic nitrogen (DIN) and dissolved inorganic phosphorus (DIP)
- 125 (Fig. 1c-f). Consequently, the ecological environments of the PRE have changed
- 126 significantly.



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Fig. 1. (a) Study area of the PRE and sampling sites during 1985-2017; (b) five subregions and a transect along the coastal transition zone used for analysis; (c) annual loads of suspended sediments (SS) from the Pearl River; (d-f) the summertime concentrations of nutrients (DIN, DIP) and dissolved oxygen (DO) in the river outlets of the PRE.

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In the 1990s, the PRE displayed a low level of eutrophication due to the weak urbanization in the upstream regions and high turbidity because of the absence of largescale hydraulic facilities, e.g., dams, which could block the suspended sediments from being transported into the estuary. Until the late 1990s, at least 8636 reservoirs were





138 established in the Pearl River basin, the vast majority of which were built after China's 139 reform and opening up in 1980 (Wu et al., 2016). After the 2000s, with the acceleration 140 of urbanization and construction of hydraulic facilities, the PRE has undergone a 141 significant increase in nutrients and decline in sediment loads (Fig. 1c-e), both of which 142 are favorable for phytoplankton blooms and therefore for eutrophication and hypoxia. 143 These long-term variations of riverine substances have also been reported by Lai et al. 144 (2022) and Hu et al. (2021). In the meantime, the oxygen content in the PRE has 145 exhibited a notable drawdown with significant expansions in low-oxygen extents in 146 recent summers (Fig. 2), which has been revealed by the cruise observations in the PRE 147 (Li et al., 2021; Su et al., 2017; Hu et al., 2021; Lu et al., 2018).



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Fig. 2. (a) Interannual variations of low-oxygen area (HA4, DO < 4 mg/L) and hypoxic area (HA3, DO < 3 mg/L) in the bottom waters of the PRE during summer estimated from the cruise observations (note that the grey patches represent the lack of data); spatial distributions of summer-averaged DO concentrations during (b) 1991-1996 and (c) 2013-2017.

## 154 **2.2 Model settings and validation**

#### 155 **2.2.1 Model descriptions and settings**

156 A 1D-3D coupled physical-biogeochemical model, which has been extensively

verified and applied in the PRE (Wang et al., 2017; Wang et al., 2018; Hu et al., 2011;

- 158 Zhang et al., 2022), was utilized here to reproduce the oxygen dynamics under the long-
- 159 term changes in riverine nutrients, suspended sediment concentration (SSC), and





160 oxygen content (Fig. 1c-f). For the sake of conciseness in the main text, detailed descriptions on the physical and suspended sediment modules were provided in the 161 162 Supplement (Text S1). Regarding the biogeochemical module, it is based on the Row-163 Column Aesop (RCA), which simulates interactive cycles of oxygen, carbon, nitrogen, phosphorus, and silicon in the water column (Fizpartick, 2004). As for the oxygen 164 165 dynamics, it can be described as follows:  $\frac{\partial DO}{\partial t} = -\left(u\frac{\partial DO}{\partial x} + v\frac{\partial DO}{\partial y} + w\frac{\partial DO}{\partial z}\right) + \frac{\partial}{\partial x}\left(A_H\frac{\partial DO}{\partial x}\right) + \frac{\partial}{\partial v}\left(A_H\frac{\partial DO}{\partial v}\right) + \frac{\partial}{\partial z}\left(K_H\frac{\partial DO}{\partial z}\right) + \frac{\partial}{\partial x}\left(K_H\frac{\partial DO}{\partial$ 166 Rea + Phot + WCR + SOD167 (1)where *DO* represents the dissolved oxygen concentration (mg/L);  $-\left(u\frac{\partial DO}{\partial x} + v\frac{\partial DO}{\partial y} + v\frac{\partial DO}{\partial y}\right)$ 168  $w \frac{\partial DO}{\partial z}$  represents the horizontal and vertical advection of oxygen (mg O<sub>2</sub> L<sup>-1</sup> day<sup>-1</sup>); 169  $\frac{\partial}{\partial x} \left( A_H \frac{\partial DO}{\partial x} \right) + \frac{\partial}{\partial y} \left( A_H \frac{\partial DO}{\partial y} \right) + \frac{\partial}{\partial z} \left( K_H \frac{\partial DO}{\partial z} \right)$  represents the horizontal and vertical 170 diffusion of oxygen (mg  $O_2 L^{-1} day^{-1}$ ); Rea and Phot, WCR, and SOD represent the 171 172 rates of air-water oxygen exchange, photosynthesis, water column respiration, and 173 sediment oxygen demand, respectively (unit: mg O<sub>2</sub> L<sup>-1</sup> day<sup>-1</sup>). The SOD is calculated 174 by the sediment flux module (SFM) coupled to the RCA. The sediment module 175 simulates the sedimentation and remineralization of organic carbon, nitrogen, and 176 phosphorus, and dynamically estimates the oxygen and nutrient fluxes across the 177 sediment-water interface (Fizpartick, 2004). 178

The growth of phytoplankton is co-limited by temperature, light, and nutrient conditions. The calculation of gross primary production (*GPP*, mg C L<sup>-1</sup> day<sup>-1</sup>) of phytoplankton in RCA (Fizpartick, 2004) is determined as:

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$$GPP = G_{Pmax} * e^{-\beta (T_{opt} - T)^2} * G_N(N) * G_I(I) * P_c$$
 (2)

where  $G_{Pmax}$  is the maximum grow rate of phytoplankton at the optimum temperature (day<sup>-1</sup>);  $T_{opt}$  is the optimum temperature (°C);  $\beta$  is the shaping coefficients; T is the water temperature (°C);  $G_I(I)$  is the light limitation factor;  $G_N(N)$  is the nutrient limitation factor;  $P_c$  is the phytoplankton biomass (mg C L<sup>-1</sup>).

186 The nutrient limitation factor is parameterized as:





187 
$$G_N(N) = Min\left(\frac{DIN}{K_{mN} + DIN}, \frac{DIP}{K_{mP} + DIP}, \frac{Si}{K_{mSi} + Si}\right)$$
(3)

188 where DIN, DIP, and Si represent the concentration (mg L<sup>-1</sup>) of dissolve inorganic 189 nitrogen (including  $NO_3^-$  and  $NH_4^+$ ), dissolve inorganic phosphorus ( $PO_4^{3-}$ ), and dissolve inorganic silicon (SiO<sub>3</sub><sup>2-</sup>), respectively;  $K_{mN}$ ,  $K_{mP}$ , and  $K_{mSi}$  represent the 190 half-saturation constants (mg L<sup>-1</sup>) for DIN, DIP, and Si, respectively. It should be noted 191 192 that a higher nutrient limitation factor  $G_N(N)$  indicates a weaker nutrient limitation 193 effect on phytoplankton growth (Fizpartick, 2004). Moreover, the nitrogen and 194 phosphorus limitation are more significant than silicon limitation within the PRE, thus 195 this study mainly focuses on the former.

196 The light limitation factor  $G_I(I)$  is parameterized as:

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$$G_{I}(I) = \frac{e}{k_{e}H} \left[ \exp\left(\frac{-I_{0}(t)}{I_{s}}e^{-k_{e}H}\right) - exp\frac{-I_{0}(t)}{I_{s}} \right]$$
(4)

$$198 k_e = k_{ebase} + k_c * a_{cchl} * P_c + k_{sed} * SSC (5)$$

199 
$$I_0 = I_{surf} * e^{-\kappa_e * H}$$
 (6)

where *H* is the depth of water column (m);  $I_0$  is the incident light intensity at the segment surface (ly day<sup>-1</sup>);  $I_s$  is the saturating light intensity (ly day<sup>-1</sup>);  $k_e$  is the light extinction coefficient (m<sup>-1</sup>);  $k_{ebase}$  is the background light extinction coefficient of water (m<sup>-1</sup>);  $k_c$  is the phytoplankton-related extinction coefficient (m<sup>2</sup> mg<sup>-1</sup> Chla);  $a_{cchl}$ is the ratio of chlorophyll to phytoplankton carbon biomass;  $k_{sed}$  is the SSC-related extinction coefficient (m<sup>2</sup> mg<sup>-1</sup> SSC);  $I_{surf}$  is the instant light radiation received at the water surface (ly day<sup>-1</sup>) (Fizpartick, 2004; Zhang and Li, 2010).

To estimate the spatial characteristics of light conditions, we also calculated the eutrophic depth in the PRE, which is defined as the water depth reached by 1% of the surface light intensity ( $I_0$ ). Basically, a larger eutrophic depth indicates a better light condition for phytoplankton growth.

#### 211 2.2.2 Model validation

The coupled physical-biogeochemical model mentioned above has already beenvalidated against a variety of observations for several periods, which showed good





214	performance in reproducing the physical conditions, suspended sediment dynamics,
215	and biogeochemical cycles in the PRE. We briefly summarized the validation results
216	here. For the physical and suspended sediment modules, Hu and Li (2009) has applied
217	the 1D-3D coupled model to establish 30-day realistic simulations for July 1999 and
218	February 2001. The simulated water levels, discharges, salinity, and SSC agreed well
219	with the observations in the Pearl River network and the PRE for both periods, with
220	correlation coefficients all greater than 0.65 in summer. The simulated SSC at the
221	surface was also compared to satellite remote sensing data, which showed a fairly close
222	spatial pattern and comparable concentration magnitude. Furthermore, Wang et al.
223	(2017) provided an extensive model validation using field data collected from four
224	seasonal cruises in 2006, with high correlations for water levels (> 0.95), salinity (>
225	(0.90) and temperature (> $(0.80)$ ) and low root-mean-standard-errors between the
226	simulation and observations in summer.

227 Then, the biogeochemical module was established and used to explore the nutrient 228 and oxygen dynamics off the PRE in July 1999 and January-December 2006 (Hu and 229 Li, 2009; Wang et al., 2017). The point-to-point comparisons with the water quality 230 profiles indicated that the biogeochemical module was robust to reproduce the spatial 231 distributions of ammonia, nitrate, phosphorus, oxygen, and chlorophyll a in the PRE. 232 In addition, Wang et al. (2017) has compared the simulated oxygen kinetic terms 233 (including the air-sea re-aeration rate, water-column respiration and production rates, 234 and sediment oxygen demand) with observations in summer, which demonstrated the 235 model's capability in representing the important oxygen source-sink processes (e.g., oxygen consumptions across the sediment-water interface) in the PRE. Detailed model 236 237 settings and parameters can be found in Wang et al. (2017).

#### 238 **2.3 Model experiments**

Based on the well-validated model run in 2006 (Wang et al., 2017), the present
study performed diagnostic simulations for two representative periods, characterized





241	by low nutrients and high suspended sediments and oxygen content during 1991-1996
242	(referring as to the "1990s case"; Table 1) versus high nutrients and low suspended
243	sediments and oxygen content during 2013-2017 (referring as to the "2010s case").
244	Each case was run from 1 January to 31 August, driven by climatological physical
245	conditions (freshwater discharges and wind speeds) averaged over 1990-2017 and by
246	mean observed values of riverine water quality components in the corresponding period.
247	Specifically in summertime (a period used for formal analysis here), the riverine
248	concentrations were set to 1.0 mg/L (DIN), 0.02 mg/L (DIP), and 6.5 mg/L (DO) in the
249	1990s case, while they were set to 2.0 mg/L, 0.065 mg/L, and 3.5 mg/L in the 2010s
250	case (Table 1). The riverine SSC was specified at $40 \text{ mg/L}$ in the 2010s according to the
251	in-situ observation near the Humen outlet in 2015 summer (Chen et al., 2020), and was
252	set to 100 mg/L in the 1990s based on the ratio of the sediment loads between the 1990s
253	and the 2010s (2.5 times). Furthermore, three additional model scenario simulations
254	were conducted in order to disentangle the individual impact of each varying riverine
255	input on the summer deoxygenation off the PRE. The setting of each scenario was
256	identical to that of the 1990s case except that the riverine nutrients, SSC, and DO were
257	separately replaced by the representative value in the 2010s (referring as to the "High-
258	nutrient case", "Low-SSC case", and "DO-restore case", respectively; Table 1).

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Table 1. Riverine inputs (in unit of mg L-1) for model experiments.					
Cases	DIN	DIP	DO	SSC	
1990s	1.0	0.020	6.5	100	
2010s	2.0	0.065	3.5	40	
High-nutrient	2.0	0.065	6.5	100	
Low-SSC	1.0	0.020	6.5	40	
DO-restore	2.0	0.065	6.5	40	

# 261 **3. Results**





#### **3.1 Responses of eutrophication to human-induced changes in**

#### 263 the PRE

#### **3.1.1 Long-term variations in water quality distributions**

265 To examine changes in eutrophication (a key process affecting DO dynamics) and its influential factors during summer in the PRE, we compared the simulated 266 267 distributions of SSC, nutrients, Chl a, and POC in the surface waters between the 1990s 268 and the 2010s cases (Fig. 3) as well as their vertical integrations in subregions (Table 2). Model results showed that the surface SSC within the PRE largely declined during 269 270 the two periods. In the 1990s, SSC maintained at a high level in the inner Lingdingyang Bay (see its location in Fig. 1b), ranging from 70.0 to 100.0 mg/L (Fig. 3a). Due to the 271 272 consecutive sinking along with water transport, SSC dropped to  $\sim 10.0$  mg/L in the 273 lower reaches of the PRE. While in the 2010s, the riverine sediment loads have 274 remarkably decreased, resulting in a corresponding drawdown in SSC downstream (Fig. 275 3b-c). Overall, the vertically-integrated SSC content in the inner Lingdingyang Bay and 276 lower PRE dropped by 56.1% and 45.6%-47.3% to 244.5 mg/m<sup>2</sup> and 38.4-69.2 mg/m<sup>2</sup>, 277 respectively (Table 2).

278 In terms of nutrients, the variation induced by riverine inputs was also evident 279 during the two periods, acting on the main estuary in association with the spreading of the river plume. As shown, the DIN content in the 1990s was mostly below 1.5 mg/L 280 281 within the entire PRE (Fig. 3d). With respect to the 2010s, the DIN concentration has 282 increased by 0.8 mg/L and 0.2 mg/L in the surface waters of the upper Lingdingyang 283 Bay and the lower PRE, respectively (Fig. 3e-f). The vertically-integrated DIN mass 284 has increased by 41.9%-102% in the PRE (Table 2). A similar situation occurred with 285 respect to DIP, with its content increasing from 0.04 mg/L in the 1990s to 0.07 mg/L in 286 the 2010s in the high-DIP area adjacent to the middle Lingdingyang Bay (Fig. 3g-i). In 287 terms of vertical integration, DIP increased by 9%-108%, with the lowest increases located in the Hong Kong waters downstream of the estuary (Table 2). 288





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Fig. 3. Simulated distributions of (a-c) SSC, (d-f) DIN, (g-i) DIP, (j-l) Chl a, and (m-o)
POC concentrations in the surface waters of the PRE for the 1990s (left panels) and the
2010s (middle panels) as well as their differences (right panels).

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> 295 296











297 In response to changes in light (affected by the SSC content) and nutrient 298 conditions, phytoplankton biomass has substantially grown in the 2010s, indicated by 299 the increased Chl a concentration. In the 1990s, the phytoplankton biomass was at a 300 low level, with the Chl *a* generally below 8.0  $\mu$ g/L in the surface waters (Fig. 3j). As 301 for the 2010s, significant phytoplankton blooms were found along the Modaomen sub-302 estuary, outer Lingdingyang Bay, and Hong Kong waters (Fig. 3k-l), with the vertically-303 integrated Chl a content rising by 31.0  $\mu$ g/m<sup>2</sup> (by 78.7% compared to the 1990s), 32.2 304  $\mu g/m^2$  (79.1%), and 34.6  $\mu g/m^2$  (46.6%), respectively (Table 2). As a result of the 305 elevated primary production, a great amount of organic matter was produced in the PRE. Spatially coupled to the growth of Chl a (Fig. 31), the POC content has significantly 306 307 increased in the 2010s, especially in the lower PRE (Fig. 3m-o), with the verticallyintegrated concentration increasing by 1.5-2.0 mg/m<sup>2</sup> (by 27.4%-32.6% compared to 308 the 1990s) over the water column (Table 2). 309

#### 310 **3.1.2 Long-term variations in nutrient and light limitations**

311 The primary production in the PRE was controlled by the synergistic effects of 312 nutrient and light conditions. We calculated the nutrient limitation factor and the 313 eutrophic depth to quantify the intensity of nutrient limitation and light limitation on 314 algae growth. It should be noted that a smaller nutrient limitation index and a shallower 315 eutrophic depth represent a stronger nutrient limitation and a stronger light limitation, 316 respectively. Results showed that the nutrient limitation exhibited a distinct estuary-317 shelf gradient, in which the Hong Kong waters experienced more severe nutrient 318 limitation than the Modaomen sub-estuary and Lingdingyang Bay (Fig. 4a, c). 319 Specifically, the nutrient limitation index decreased from the upper estuary (0.94) to the 320 Hong Kong waters (0.83) in the 1990s. By contrast, the light limitation has attenuated 321 along the river plume transport, largely ascribed to the decreased SSC (Fig. 3a-b). 322 Compared to the Hong Kong waters, the regions adjacent to river outlets underwent 323 more severe light limitation, shown by the eutrophic depth (Fig. 4b) increasing from 324 the Lingdingyang Bay (1.3 m) and Modaomen sub-estuary (9.5 m) to the Hong Kong





325 waters (20.7 m).

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Fig. 4. Simulated distributions of (a, c) nutrient limitation index for the growth ofphytoplankton and (b, d) euphotic depth (in unit of m) in the 1990s and the 2010s.

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331 Due to the growth in nutrient loads, nutrient limitation has relieved in the 2010s. 332 For instance, the nutrient limitation index in the Hong Kong waters has increased to 333 0.85 (by 2.4% of the 1990s) in the 2010s (Table 2). In comparison, the relief of light 334 limitation was more evident with the reduced riverine suspended sediments. The 335 deepening of the euphotic depth in the Lingdingyang Bay was significantly greater than that in the lower estuary (Fig. 4b, d). In the inner Lingdingyang and middle 336 337 Lingdingyang Bays, the euphotic depth increased by 1 m and 2.2 m (by 76.9% and 338 110.0% relative to the 1990s, Table2), respectively. The alterations in light conditions in the remaining area were relatively minor, with the eutrophic depth increasing to 11.2 339 m (by 17.9%) in the Modaomen sub-estuary and to 21 m (by 1.4%) in the Hong Kong 340 341 waters during the 2010s (Table 2).





# 342 **3.2 Responses of DO dynamics to human-induced changes in**

#### 343 the PRE

#### 344 **3.2.1 Variations in DO distributions and hypoxia occurrences**



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Fig. 5. (a-c) Surface DO and (d-f) bottom DO distributions, (g-i) vertical DO distributions along the transect (see its location in Fig. 1b), and (j-l) low-oxygen frequency (HF4, DO < 4 mg/L) and (m-o) hypoxia frequency (HF3, DO < 3 mg/L) in the bottom waters of the PRE for the 1990s (left panels) and the 2010s (middle panels) as well as their differences (right panels).</li>





351 Our model results demonstrated significant changes in the spatial pattern of 352 summertime DO and hypoxia incidences from the past to the present (Fig. 5). The 353 surface DO concentration in the 1990s was generally higher than 6 mg/L and exhibited 354 an increasing trend towards the shelf regions (Fig. 5a). While in the 2010s, the surface 355 DO has undergone an evident increase by 0.2-0.3 mg/L (Fig. 5b-c), with an oxygen-356 enriched zone in the lower PRE, which was closely coupled to the surface high Chl a 357 value (Fig. 3k). However, low-oxygen events (DO < 4 mg/L) have appeared in the 358 surface waters adjacent to the river outlets in the 2010s (Fig. 5b) due to the low DO 359 influx from the Pearl River along with the freshwater discharge.

In the bottom waters, the observed shift from small-scale hypoxia in the 1990s to 360 361 extensive hypoxia in the 2010s (Fig. 2b-c) was well reproduced by our model (Fig. 5d-362 e). In the 1990s, the low-oxygen events were primarily concentrated along the western side of the PRE (i.e. the Modaomen sub-estuary and adjacent waters; Fig. 5d). The 363 simulated low-oxygen area (HA4) and hypoxic area (HA3) were approximately 1179.7 364 km<sup>2</sup> and 211.3 km<sup>2</sup> (Table 3), respectively, which is consistent with the observational 365 estimates of 802  $\pm$  437 (mean  $\pm$  standard deviation) and 131  $\pm$  84 km<sup>2</sup> during the 366 367 summers of 1994-1999 (Fig. 2a). The low-oxygen conditions have considerably 368 worsened over the estuary in the 2010s (Fig. 5e-f), especially evident in the inner 369 Lingdingyang Bay, outer Lingdingyang Bay, and Hong Kong waters. The bottom DO 370 levels have dropped to 2.8-4.1 mg/L on average in the five subregions (Table 2). 371 Simultaneously, the simulated low-oxygen area (HA4) has increased to ~1.5 times larger than that in the 1990s, reaching 2925.5 km<sup>2</sup> (Table 3). The enlarged low-oxygen 372 coverage in our model is consistent with the observational estimates of  $2715 \pm 1068$ 373 km<sup>2</sup> during 2013-2017 (Fig. 2a). Besides, the simulated hypoxic area (HA3) has 374 375 approximately increased by twofold and reached 617.2 km<sup>2</sup> in the 2020s, which is also 376 comparable to the observational estimates of  $901 \pm 591$  km<sup>2</sup> during 2013-2017. 377





#### 378

379 Table 3. Simulated low-oxygen (HA4, DO < 4 mg/L) and hypoxic (HA3, DO < 3

- 380 mg/L) areas in the bottom waters of the PRE and their changes relative to the
- 381 1990s.

Cases	HA4 (km <sup>2</sup> )	Percentage of	HA3 (km <sup>2</sup> )	Percentage of
Cases		change		change
1990s	1179.7	/	211.3	/
2010s	2925.5	+148%	617.2	+192%
High-nutrient	1542.6	+31%	282.5	+34%
Low-SSC	1737.0	+47%	412.4	+95%
DO-restore	2409.7	+104%	617.2	+192%

382

383 In addition, the two observed hypoxic centers along the coastal transition zone (i.e., 384 the Modaomen sub-estuary and Hong Kong waters; Fig. 2b-c) were also successfully 385 reproduced by our model, showing heterogeneous deoxygenation features in terms of spatial extents and duration (Fig. 5g-o). In the 1990s, the low-oxygen conditions in 386 387 these two centers were confined to a relatively small extent, especially in the Hong 388 Kong waters, where the simulated thickness of low oxygen (DO < 4 mg/L) was less 389 than 1 m (Fig. 5g). The low-oxygen and hypoxic waters probably sustained for 18-76 390 days and 4-23 days within the hypoxic centers during the three summer months (June-August), respectively, synonymous with 20.5%-84.5% of low-oxygen occurrences 391 392 (HF4) and 4.8%-25.2% of hypoxia occurrences (HF3) in summer (Fig. 5j, m; Table 2). 393 As for the 2010s, the estimated thickness of hypoxia in the Modaomen sub-estuary has 394 substantially increased to ~1.5 m, while the low-oxygen thickness in the Hong Kong 395 waters has reached  $\sim 5$  m (approximately 4 m thicker relative to the 1990s; Fig. 5h). Furthermore, the duration of the low-oxygen and hypoxic events in the 2010s was 396 prolonged, roughly at 55-89 days (61.0%-99.1% of HF4) and 19-51 days (21.4%-56.5% 397 398 of HF3) in the hypoxic centers (Fig. 5k, n; Table 2), respectively.

#### **399 3.2.2 Variations in bottom oxygen consumption**

400 To further explore the mechanism of long-term deoxygenation off the PRE, we 401 investigated the oxygen consumption rates and their changes during the two periods





- 402 (the 1990s versus the 2020s). We specifically focused on the oxygen consumption at
  403 the bottom layers covering the 20% of the water depth above the sediments, where the
  404 majority of hypoxic events in the PRE occurred (Fig. 5).
- 405 As shown in Table 2, the predominant oxygen sink in the bottom waters of the PRE was sediment oxygen demand (SOD) induced largely by the remineralization of 406 407 organic matter in sediments, whereas water column respiration (WCR) only accounted 408 for 15.2% of the bottom oxygen consumption on average. Over the past three decades, 409 both the WCR and SOD have generally enhanced in the PRE, primarily attributed to 410 the growth in local production of organic matter associated with aggravated eutrophication (Fig. 3j-o). Particularly, the SOD in the outer Lingdingyang Bay and 411 412 Hong Kong waters has remarkably increased from 0.28-0.92 mg O<sub>2</sub> L<sup>-1</sup> day<sup>-1</sup> in the 1990s to 1.12-1.48 mg  $O_2 L^{-1}$  day<sup>-1</sup> in the 2010s (Table 2), which contributed to 80%~95% 413 414 of the increment in total oxygen consumption. Although the absolute increase of SOD in the Modaomen sub-estuary was comparatively small, the SOD in the 2010s has 415 416 almost doubled compared to the 1990s, leading to a substantial increase in the 417 occurrence of hypoxic events in this region (Fig. 5d-o).

# 3.2.3 Disentangling contributions of riverine oxygen, suspended sediments, and nutrient changes on deoxygenation

420 As detailed in Section 2.3, three scenario simulations were performed to quantify 421 the relative contributions of riverine changes to the decadal low-oxygen expansion in 422 the PRE (Table 1). In general, the riverine impacts on DO and related biogeochemical 423 factors varied significantly between subregions (Figs. 6-7). Specifically, increasing the 424 riverine nutrient levels from the 1990s to the 2020s alone (High-nutrient case) led to a 425 marked drawdown in the bottom DO around the lower PRE (by over 0.2 mg/L relative 426 to the 1990s; Fig. 6a). The DO decline, extending from the Modaomen sub-estuary to 427 the Hong Kong waters, was ascribed to the elevated phytoplankton biomass (Fig. 7b) 428 facilitated by better nutrient conditions, which subsequently sustained stronger bottom 429 oxygen depletions compared to the 1990s (Fig. 7c). Among the subregions, the Hong





430 Kong waters was more susceptible to the changes in riverine nutrients as it was subject 431 to comparatively severe nutrient limitation (Table 2). Therefore, with the improvement 432 of nutrient utilization, this region experienced more pronounced deoxygenation in 433 association with significant alterations in Chl a content and SOD (increased by 14.2  $\mu$ g/m<sup>2</sup> and 0.26 mg O<sub>2</sub> L<sup>-1</sup> day<sup>-1</sup>, respectively, equivalent to 47.1% and 46.4% of their 434 total increments over the past three decades; Fig. 7). While in the inner Lingdingyang 435 436 Bay, the increased nutrient inputs only caused a slight change in Chl a content because 437 the phytoplankton growth in this region was mostly light limited due to high water 438 turbidity (Table 2). The concomitant changes in SOD and bottom DO were fairly small 439 as well. Collectively, the high-nutrient scenario alone resulted in a 31% and 34% growth 440 in the area affected by low oxygen (HA4) and hypoxia (HA3) relative to the 1990s, 441 respectively (Table 3).



442

Fig. 6. Bottom DO changes induced by (a) riverine nutrient increases (the High-nutrient
case minus the 1990s case), (b) riverine SSC declines (the Low-SSC case minus the
1990s case), (c) the combined effects of nutrient increases and SSC declines (the DOrestore case minus the 1990s case), and (d) riverine DO declines (the DO-restore case
minus the 2010s case), respectively.





(-)		DO	(1	ng L <sup>-1</sup> )	
(a) Inner Lingdingyang	-0.11	-0.08	-1.03		
Middle Lingdingyang	-0.15	-0.14	-0.41	-0.1	
Modaomen	-0.18	-0.47	-0.66	-0.2	
Outer Lingdingyang	-0.21	-0.58	-0.84	-0.3	
Hongkong	-0.41	-0.45	-0.84	-0.4	
		2		-0.5	
(b)		Chl a	0	ug m <sup>-2</sup> )	
Inner Lingdingyang	0.08	1.84	2.05	25	
Middle Lingdingyang	0.34	10.40	11.22	20	
Modaomen	4.62	27.82	31.02	15	
Outer Lingdingyang	4.61	29.11	32.22	- 10	
Hongkong	14.22	21.90	30.22	5	
				- 0	
(a)		SOD (	mg O <sub>2</sub> L <sup>-1</sup>	day-1)	
(C) Inner Lingdingyang	< 0.05	< 0.05	< 0.05	0.8	
Middle Lingdingyang	< 0.05	< 0.05	< 0.05	0.6	
Modaomen	0.05	0.17	0.22	0.4	
Outer Lingdingyang	0.19	0.62	0.84	0.2	
Hongkong	0.26	0.32	0.56		
wigh nutrient Low SSC 2010s					

448

Fig. 7. Changes of (a) bottom DO concentration, (b) vertically-integrated Chl *a* content,
and (c) SOD in subregions of the PRE for the High-nutrient, the Low-SSC, and the
2010s cases relative to the 1990s case.

452

453 Compared with the High-nutrient case, reducing the riverine suspended sediment loads from the 1990s to the 2020s alone (Low-SSC case) imposed a greater impact on 454 455 the DO conditions, causing more extensive and intense deoxygenation through the PRE (Fig. 6b). Apparent DO decline (exceeding 0.3 mg/L relative to the 1990s) occurred 456 within the lower PRE, similar to that of the changing riverine nutrients described above. 457 458 This is also attributed to the intensified SOD (with an increment of 0.17-0.62 mg O<sub>2</sub> L<sup>-</sup> <sup>1</sup> day<sup>-1</sup>, accounting for 57.1%-77.3% of the total increment during the two periods; Fig. 459 7c), accompanied by a prominent increase in Chl a content (by 21.9-29.1  $\mu$ g/m<sup>2</sup>, 460





461 accounting for 72.4%-90.3% of the total increment; Fig. 7b) due to the improved light 462 condition (the relief of light limitation; Table 2). The SSC-induced changes in these 463 biogeochemical factors were more pronounced in the outer Lingdingyang Bay and 464 Modaomen sub-estuary than in other regions including the Hong Kong waters, which coincided with the alterations in deoxygenation among the subregions (Fig. 7). Overall, 465 466 under the low-SSC scenario the low-oxygen area (HA4) and hypoxic area (HA3) 467 expanded by 47% and 95% compared to the 1990s, respectively (Table 3). In addition, 468 it is important to note that the low-SSC-induced exacerbation could be further escalated by superimposing with the effect of high nutrient inputs (Fig. 6c). As shown, the 469 combined actions of decreasing SSC and increasing nutrients (DO-restore case) 470 471 promoted a larger area of bottom waters off the lower PRE to develop into a low oxygen or hypoxic state, yielding a substantial expansion of low-oxygen conditions (reaching 472 2409.7 km<sup>2</sup> of HA4 and 617.2 km<sup>2</sup> of HA3; Table 3) that eventually exceeded the sum 473 474 of changes induced by individual riverine input.

475 With respect to the influence of altered riverine DO influx, it could be deduced from the difference between the 2010s and the DO-restore cases (Fig. 6d). There was a 476 477 considerable DO decrease (by over 0.8 mg/L) in the bottom waters adjacent to the river 478 outlets (also in the surface waters) owing to the low-oxygen inflows from the upstream 479 river channels. The impact of these low-oxygen waters was largely restricted within the 480 upper Lingdingyang Bay under the effects of air-sea reoxygenation and water-column 481 mixing along with the river plume transport. Collectively, reducing the riverine DO content from the 1990s to the 2020s alone resulted in an enlargement of low-oxygen 482 area by nearly 515.8 km<sup>2</sup> (derived by subtracting the HA4 of the 2010s case from that 483 484 of the DO-restore case; Table 3).

#### 485 4. Discussion





# 486 4.1 Impacts of decadal changes in riverine inputs on 487 deoxygenation off the PRE

488 By combining the long-term observations with simulations from the physical-489 biogeochemical coupled model, we have elucidated the subsurface deoxygenation and 490 associated mechanisms driven by changes in a variety of riverine inputs over the past 491 three decades in a typical eutrophic estuarine system, namely the Pearl River Estuary 492 (PRE). With the rapid socio-economic development, the inorganic nitrogen and 493 phosphorus contents flowing into the PRE during summer have approximately increased by 100% and 225% from the historical period (1990s) to the present period 494 495 (2020s), respectively (Table 1). Also, the riverine SSC has decreased by  $\sim 60\%$ , 496 consequent to the intense human activities such as dam construction (Liu et al., 2022) and reforestation (Cao et al., 2023). Besides, the amplified oxygen depletion fueled by 497 498 terrestrial pollutants discharged into the upstream rivers has led to a lower riverine DO 499 concentration (dropped by 46%) entering the estuary (Ma et al., 2024). These alterations 500 have jointly triggered more extensive and persistent low-oxygen conditions in the 501 bottom waters of the PRE (Fig. 5). Based on our model estimation, the summertime 502 low-oxygen (DO < 4 mg/L) and hypoxic (DO < 3 mg/L) areas in the PRE have risen 503 by 148% and 192% during the two periods, respectively (Table 3), together with a 504 significant increase in the vertical thickness (expanding upwards by ~1-4 m) and the 505 duration (extending by ~15-35 days during June-August) of low-oxygen events.

More interestingly, the PRE has developed three distinct hypoxic centers (including the inner Lingdingyang Bay, Modaomen sub-estuary, and Hong Kong waters) controlled by different dominant factors, which renders the deoxygenation problem in this region as a great reference for estuaries and coastal systems worldwide. Specifically, the impact of riverine low-oxygen waters was confined within the upper estuary close to the river outlets, leading to a ~44% increase in the low-oxygen area relative to the 1990s. Such local low-oxygen issue could be mitigated to a large extent if the riverine





513 DO recovered to a comparatively higher level (e.g., ~6.5 mg/L in the 1990s) according 514 to the DO-restore scenario (Fig. 6d). By comparison, the deoxygenation in the lower 515 estuary primarily followed the classic eutrophication-driven paradigm. As indicated in 516 the High-nutrient and the Low-SSC cases, the increased nutrient inputs and declined 517 suspended sediment loads have separately alleviated the nutrient and light limitations 518 on algae growth in the region, thereby stimulating phytoplankton blooms and local 519 production of organic matter to support subsurface oxygen consumption (dominated by 520 sediment oxygen uptake, SOD; Fig. 7). Our results also indicated that the riverine SSC 521 reduction played a more important role in driving the long-term low-oxygen expansion 522 in the PRE. Its synergistic effect with the riverine nutrient changes could further amplify 523 the exacerbation of eutrophication and subsequent deoxygenation, resulting in an 524 enlarged growth in the low-oxygen area (by 104%) and hypoxic area (by 192%) that was notably larger than the total of their partial contributions (Table 3). 525

526 It is worth mentioning that the relative importance of the riverine nutrient and SSC 527 changes were different between the two hypoxic centers in the lower PRE, depending 528 upon their distances from the river outlets. Closer to the river outlets, the Modaomen 529 sub-estuary and its surrounding waters (located on the western side of the coastal 530 transition zone off the PRE) possessed a fairly high SSC level, which imposed a 531 stronger light limitation on the growth of phytoplankton in the region, ultimately 532 making the oxygen dynamics more susceptible to the decline in riverine SSC. On the 533 contrary, the Hong Kong waters and adjacent coastal areas (located on the eastern side of the coastal transition zone) far from the river outlets were less affected by the riverine 534 535 inputs, where the relatively low nutrient levels promoted more sensitive responses of 536 biogeochemical processes (e.g. primary production and SOD) and hypoxia occurrences 537 to nutrient variations.





# 538 4.2 Nutrient control and hypoxia mitigation in the context of

#### 539 sediment declines

540 Our results underscored the substantial spatial variability in the regulation of riverine inputs on deoxygenation, which implies the necessity for establishing more 541 542 refined and targeted strategies for hypoxia mitigation. Compared with the riverine 543 nutrients, the influences of SSC on eutrophication and hypoxia have received less 544 attention. It follows that there might be overestimations of the nutrient impacts in the 545 previous studies without considering SSC to ensure the model simulation aligning with the observed deoxygenation. Such an overfitting problem could further lead to an 546 547 optimistic assessment on the hypoxic mitigation effect under a certain nutrient control 548 plan. Therefore, it is imperative to disentangle or re-evaluate the contribution of riverine nutrients and SSC to the coastal deoxygenation over the past decades. As exemplified 549 550 in our study for the PRE, a more stringent nutrient reduction might be required to curb 551 the deoxygenation issue given the low SSC status at present.

552 Furthermore, it should be noted that although the dam constructions in the Pearl 553 River Basin have mostly completed since the 2000s, it is still unclear whether the 554 declining trend of riverine SSC will persist in the future. For instance, the reforestation 555 in recent years has shown to be effective in reducing the summer freshwater discharges 556 and sediment loads in the Pearl River Basin (Cao et al., 2023). Therefore, the role of 557 riverine SSC variations remains critical for oxygen dynamics in the future, which poses greater challenges and uncertainties for eutrophication and hypoxia mitigation. Similar 558 559 problems also exist in other estuaries and coastal systems suffering hypoxia. For example, it was reported that the decrease of riverine SSC (by  $\sim$ 56%) appeared to be 560 561 the predominated factor for the intensifying eutrophication (with a 61% increase in the 562 Chl a concentration) in the Yangtze River Estuary over the past decades (Wang et al., 2019). In addition, several modelling studies have showed that the dam constructions 563 564 in the upper regions of Guadiana Estuary have significantly reduced the water turbidity





and exacerbated eutrophication in the lower estuary (Domingues et al., 2012; Barbosa et al., 2010). A global-scale survey revealed that the sediment loads in 414 major rivers has approximately decreased by 51% since the 2000s due to human activities (Dethier et al., 2022), suggesting that the deteriorating eutrophication and deoxygenation in the context of sediment declines has become a global concern and merits more attention and investigations in the future.

571 Some caveats to our work require further studies. For example, apart from 572 anthropogenic activities, alterations in regional physical conditions aligning with 573 climate changes could also regulate the long-term deoxygenation in coastal regions (Chen et al., 2024). The impacts of ocean warming on deoxygenation (Laurent et al., 574 575 2018) remain unclear in the PRE as well. While these factors have not been considered 576 in this study, the relative contributions of human activities and climate changes represent a significant topic for future investigations, which can facilitate a more 577 578 comprehensive understanding of oxygen dynamics and hypoxia development in 579 estuaries and coastal systems.

#### 580 **5. Conclusion**

581 We applied a well-validated physical-biogeochemical model to reconstruct the 582 summertime oxygen distributions in the PRE during two representative periods (the 583 1990s and the 2010s) and to disentangle the contribution of alterations in riverine inputs 584 (i.e., suspended sediments, nutrients, and oxygen concentration) to the long-term deoxygenation off the PRE based on a suite of model experiments. We found that owing 585 586 to the changes of riverine inputs over the past three decades, the low-oxygen and hypoxic areas in the bottom waters of the PRE have expanded by about 1.5 times and 587 588 two-fold, respectively, with the duration time prolonged by ~15-35 days in summer. 589 Concurrently, three hypoxic centers dominated by distinct factors were identified. 590 Scenario simulations revealed that the decline in riverine oxygen concentration has 591 caused a low-oxygen expansion (by  $\sim 44\%$ ) in the upper PRE. By comparison, the





592 alterations in riverine nutrients and suspended sediments have separately provided 593 better nutrient and light conditions to promote higher production of labile organic 594 matter, which jointly maintained considerable oxygen depletions and exacerbated the 595 low-oxygen conditions in the lower PRE. The relative importance of the changing 596 riverine nutrients and suspended sediments to deoxygenation varied between 597 subregions. The suspended sediment reduction was the predominated factor in the 598 downstream regions close to the river outlets (e.g. the Modaomen sub-estuary), while 599 the nutrient increase exerted a more substantial influence in the regions far from the 600 river outlets (e.g. the Hong Kong waters). Our study highlights the significant role of the declined suspended sediments in the low-oxygen expansion off the PRE, which can 601 602 further amplify the effect in association with the increasing nutrients. Therefore, in the 603 context of global regimes changes of riverine suspended sediments, we call for an urgent re-evaluation of the impacts of riverine inputs on deoxygenation in addition to 604 605 nutrients in order to better understand the mechanism controlling hypoxia and thereby 606 proposing effective mitigation strategies.

607

#### 608 CRediT authorship contribution statement

Yue Nan: Investigation, Model experiments, Formal analysis, Visualization,
Writing-original draft. Zheng Chen: Model experiments, Writing-review. Bin Wang:
Writing-review. Bo Liang: Writing-review. Jiatang Hu: Project administration,
Supervision, Conceptualization, Writing-review & editing.

#### 613 **Declaration of competing interest**

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

#### 617 Acknowledgements





- 618 This work was supported by a grant from the Southern Marine Science and
- 619 Engineering Guangdong Laboratory (Zhuhai) (Project. SML2023SP220) and two
- 620 consulting projects (ZB-2023-005, ZB-2023-054) to JH.

# 621 Data availability

- 622 Data will be made available on request.
- 623





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