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Hydrodynamical transport structure and lagrangian connectivity of circulations in the Pearl River Estuary

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Using a three-dimensional (3D) hydrodynamic model, this study explored the seasonal hydrodynamic transport structure in the Pearl River Estuary and illustrated the intrinsic connectivity under multiscale motions from a Lagrangian perspective. Generally, the surface Lagrangian residual current (U_1) is uniformly southwestward/ southeastward in summer/winter, with a stronger intensity in the lower estuary. The bottom U₁ features in the southeastward direction in the upper estuary and northwest direction in the lower estuary. The fluvial-tide interaction line advances southeastward and northwestward in summer and winter, respectively. The U₁ captured the major transport processes and was in good agreement with the mean surface sediment transport patterns. In the transition region between Lantau Island and Neilingding Island, where it is largely affected by the interaction between the periodic tidal current and river discharge, the spatially averaged U_{L} showed intensified intratidal variations and had a larger difference with the locally temporally averaged Eulerian residual current. The remarkable Lagrangian coherent structures that illustrated the transport paths and transport convergence regions were identified, which are generally consistent with the bottom sediment depocenters. Based on the Lagrangian connectivity analysis, it was revealed that a barrier between the western and eastern estuaries existed, which was weakened by the strong river discharge during summer. Two convergence regions near the Macau and Hong Kong waters were identified, where the sediment and pollutants easily settled. The study demonstrated the importance of the Lagrangian view in understanding the hydrodynamic process and transport structure in the estuary-shelf regions.

KEYWORDS

hydrodynamical transport structure, Lagrangian analysis, circulation connectivity, residual current, pearl river estuary

Introduction

Estuaries, as key locations between the open sea and rivers, often sustain large populations, economies, and valuable ecosystems (Gill et al., 2001; Gillanders et al., 2003; Wang et al., 2015). The water motion inside estuaries and the associated mass transport have a great influence on estuarine and marine ecosystems. Because they are jointly driven by atmospheric forcings, tides, riverine discharge, and coastal currents over the adjacent shelf circulation, the hydrodynamic structure and transport pattern in the estuary-shelf system are naturally complicated. Given the multiscale motion in coastal estuaries, the residual current usually ultimately determines the long-term transport patterns of materials such as sediments, phytoplankton, and pollutants in estuarine areas (Stacey et al., 2001; Xing et al., 2012; Li et al., 2014; Xuan et al., 2016).

The Pearl River Estuary (PRE) is located in southern China (112°45'-113°50'E, 21°31'-23°10'N) and links the Pearl River, the second largest river in China in terms of discharge (annual average discharge: 10,000 m³/s), and the northern South China Sea (NSCS). The triangle-shaped PRE narrows northward in the upper estuary, and the width of the PRE gradually increases to approximately 60 km at the lower estuary, where the shelf is connected (Figure 1). Water motion inside the estuary is jointly driven by winds, tides, and riverine discharges (Lai et al., 2018; Liu et al., 2020). Moreover, the circulation in the lower estuary can be directly modulated by the strong shelf current in the NSCS. The multiscale motion determines the mass transport,

alters its connectivity with the adjacent shelf waters, and plays a critical role in determining the water renewal and biogeochemical processes inside the estuary (Li et al., 2020; Li et al., 2021). Thus, the PRE is a valuable model site for providing new knowledge on residual current and mass transport in a complex environment. However, previous studies have primarily focused on the mean Eulerian current. The intrinsic mass transport structure may be blurred by oceanic currents and how different regions are connected by complicated physical motions, as well as the associated timescales and mass transports remain less understood.

Lagrangian tracking is an effective way to analyze the transport processes in estuaries, which helps to determine the origin and fate of specific water masses (Feng et al., 1986; Jonsson et al., 2004; Ju et al., 2009; Muller et al., 2009; Liu and Chua, 2016). As a combination of the Lagrangian and Eulerian methods, Lagrangian coherent structures (LCSs) can be identified from fluid motions, which represent the strongest repelling or attracting material lines, thus distinguishing water masses with different motion characteristics and the barriers between different circulation regions. It has proven to be a valuable and appropriate tool for simplifying the transport and mixing in fluid flows and diagnosing the transport properties of materials (Branicki and Wiggins, 2010; Wei et al., 2013). Many methods have been proposed to identify LCSs, and finite-time Lyapunov exponents (FTLEs) are widely used (Wei et al., 2013; Berta et al., 2014; Wei et al., 2018). The ridges in the FTLE fields can be used as barriers to mass transport and identify the LCSs in



FIGURE 1

(A) Location and topography of the Pearl River Estuary (PRE). QAI: Qi'ao Island, NLI: Neilingding Island, LTI: Lantou Island, LXI: Longxue Island. (B) The monthly PRE river discharge (10⁴ m³/s). (C, D) The seasonal mean wind speed (m/s) during summer (June–August) and winter (December-February). Atmospheric forcing data were provided by the ERA5 atmospheric reanalysis data from the European Center for Medium-Range Weather Forecasts (ECMWF), and the monthly averaged riverine discharge data were provided by Chu et al. (2022).

the flow field (Haller and Yuan, 2000; Haller, 2015; Wei et al., 2018).

To illustrate the transport structure and further understand the hydrodynamic intrinsic connectivity among different subregions in the PRE and the adjacent shelf region, the Lagrangian investigations were conducted in this study using the results from a climatological three-dimensional (3D) hydrodynamic model. The remainder of this paper is organized as follows. Section 2 introduces the numerical model and methodology for particle tracking. In Section 3, the seasonal hydrodynamic transport structure is revealed and compared with the net mean surface sediment transport pattern. Then, the intrinsic connectivity among the various subdomains of the PRE is illustrated based on the Lagrangian coherent structures (LCSs) and transport proportion matrix. This paper is summarized in Section 4.

Methodology

Numerical model

The Regional Ocean Modeling System (ROMS) (Shchepetkin and McWilliams, 2005) was used to simulate hydrodynamics in the study area. The model domain was bounded by the latitudes of 18.67°N and 24.66°N and the longitudes of 110.19°E and 120.45°E, which covers the PRE and the shelf region of the NSCS to resolve the multiscale interactive processes in the PRE and the adjacent shelf. The horizontal grid spacing was approximately 400 m. We used the terrain-following s-ordinate (Song and Haidvogel, 1994) to discretize the water column into 30 levels, and a higher resolution was used in both the surface and bottom boundary layers. To better illustrate the representative characteristics of the multiscale motions, we conducted process-oriented studies with climatologically averaged monthly atmospheric forcing and river discharges (Figures 1B-D). Atmospheric forcing data, including wind, heat flux, and precipitation, were provided by the ERA5 atmospheric reanalysis data from the European Center for Medium-Range Weather Forecasts (ECMWF) and applied to force ocean circulation using the bulk flux computation algorithm (Fairall et al., 2003). Monthly averaged riverine discharge data were provided by Chu et al. (2022). The subtidal flows and hydrographic properties were extracted from the numerical simulation of the Northern South China Sea, which has been used successfully in the water exchange and interannual variability of shelf circulation (Cai et al., 2022; Deng et al., 2022). To better represent the climatological seasonality of the shelf circulation, we applied the monthly averaged shelf circulation as the subtidal forcing along the southern, western, and eastern open boundaries of the computational domain. The harmonic constants of tides in the computational domain were computed and validated by Zu et al. (2008) using Oregon Tide

Inverse Software (Egbert and Erofeeva, 2002). The tidal current was included along the open boundaries using the advanced dual-wave transmission-permitting algorithm proposed by Liu and Gan (2016; 2020). The major constituents of the semidiurnal (M_2 , S_2 , K_2 , and N_2) and diurnal (K_1 , O_1 , P_1 , and Q_1) tides and the M_4 tide were applied along the open boundary to impose tidal forcing in the computational domain. The simulation well captured the hydrodynamic and circulation featured in this region as illustrated in previous investigations and observed data. We exported the ocean current data with an interval of 20 min in summer (June–August) and winter (December– February) to better resolve the motions determined by complicated forcings. The saved data will be used in the offline Lagrangian tracking and following analysis.

Lagrangian particle tracking

In this study, the net residual current in the PRE regions was examined based on off-line particle tracking using the Lagrangian TRANSport model (LTRANS v.2b), which is a popular off-line three-dimensional particle tracking module (e.g., North et al., 2011; Henry et al., 2018; Pearson et al., 2019; Liang et al., 2021). Using the high-frequency ocean current data retrieved from the validated hydrodynamic model, it was developed to simulate the movement of passive tracers, particles with sinking or floating behavior, such as sediment or oil droplets, and planktonic organisms, such as oyster larvae. It includes the fourth-order Runge–Kutta scheme for particle advection and reflective boundary conditions on solid walls, specific particle behavior routines, and settlement algorithms.

From the Lagrangian perspective, the transport processes are tracked by following fluid particles to identify the trajectories starting from or arriving at a given point. The transport equations were discretized along a moving frame of reference, and the particle positions and velocities were also considered between the Eulerian grid points. The Lagrangian residual velocity (Zimmerman, 1979; Feng et al., 2008) is expressed as

$$\vec{\underbrace{U}}_{L}\left(\vec{\underbrace{x}},t_{0};\tau\right) = \frac{\vec{\underbrace{x}}\left(t_{0}+\tau\right) - \vec{\underbrace{x}}\left(t_{0}\right)}{\tau}$$
(1)

where $\overline{x}(x, y, z)$ is a three-dimensional position vector in the Cartesian coordinate system, t_0 is the initial time for an arbitrary water parcel to be tracked, \overline{x} is the initial position vector, and τ is the tracking period. In this study, the particles were released at each grid inside the PRE and tracked for 25 h to indicate the net motion after approximately one diurnal tidal cycle. The movement pattern over a longer period can be understood by the accumulation of the $U (\overline{x}, \tau; t_0)$. The numerical experiments also indicated that a longer tracking period did not change the major transport pattern (figure not

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shown). As illustrated in the previous numerical and theoretical investigations (e.g., Feng et al., 1986; Feng et al., 2008; Muller et al., 2009; Liu et al., 2012; Liu et al., 2021), U in the generally non-linear system highly depended on the initial time, even in a purely periodic, single tidal constituent-driven barotropic system. To remove the dependence of the residual current on the initial release time and illustrate the mean seasonal transport pattern, the particles were released every 2 h within 3 months of summer and winter.

Lagrangian coherent structures

To identify LCSs, the FTLE was calculated, which involved the simulation of the particle paths in an advection flow. FTLE fields represent the finite time average of the maximum expansion or contraction rate of a pair of passive advection fluid materials. It can be calculated as (e.g., Wei et al., 2018)

$$\sigma_{t_0}^{\tau}(x_0) := |\tau|^{-1} In \| \partial_{x_0} x(t_0 + \tau; t_0, x_0) \|$$
(2)

where $\| \|$ denotes the spectral norm. Consider an arbitrary fluid particle located at x_0 in the study area at time t_0 after being transported by the flow for a time interval τ , the particle is moved to $x(t_0+\tau;t_0,x_0)$ at time $t=t_0+\tau$. The latter is obtained by integrating the particle trajectory equation (1). Repelling and attracting LCSs are then defined (Haller and Yuan, 2000; Shadden et al., 2005; Haller, 2011) as maximizing the ridges of the FTLE field computed forward (t > 0) and backward (t < 0) in time, respectively.

The high values in FTLE fields are associated with the LCSs that are defined as the ridges of the FTLE field. In the region where the FTLE < 0, fluid particles tend to converge, and pollutants converge here. In the region where the FTLE > 0, a higher value means a higher separation rate between two neighboring particles; the positive line in the FTLE can be regarded as the material transport path (e.g., Shadden et al., 2005; Liang et al., 2014).

Results and discussion

Estuarine circulation

The seasonally averaged features of the representative hydrodynamic conditions revealed in the simulation during summer and winter were examined in the study area, which captured the mean features of circulations neighboring the PRE, as illustrated in previous studies (e.g., Zu and Gan, 2015; Liu and Gan, 2020; Cai et al., 2022). In summer, strong gravity circulation was observed in the lower estuary, where the surface current flowed southeastward and the bottom current flowed northwestward (Figures 2A, C). In the upper estuary,

induced by strong river discharge in the wet season, both the surface and bottom currents flowed seaward. Driven by the southwesterly monsoon, coastal upwelling with northeastward along-shore currents formed over the NSCS shelf. Sea surface temperature and salinity generally showed the characteristics of shelf upwelling, forming a northeastward-extending belt of cold salty water in the coastal seas to the east of the PRE (Figures 3A, C). In winter, when weaker discharges occur, the gravitational circulation was generally preserved but with weakened intensity (Figures 2B, D). Compared with summer conditions, bottom waters invaded further landward in the estuary, while the seaward flow was still observed in the surface layers. Because of the extensive northeasterly wind, the shelf current flowed southwestward with a larger magnitude than that in the summer (Figures 2B, D). Affected by the monsoon, buoyant water flowed southwestward in the estuary and was arrested by the southwestward shelf current after leaving the estuary, forming a cold salt wedge estuary (Figures 3B, D).

Seasonal Lagrangian transport structure

For simplicity, we first checked the seasonally averaged U_L with a different release time at the surface and bottom layers (Figures 4A–D). In general, the surface U_L inside the PRE was uniformly southwestward/southeastward in summer/winter (Figures 4A, B) and stronger (approximately 20 cm/s) in the lower PRE than that in the upper PRE. Over the shelf, owing to the different monsoon directions, the surface U_L flowed in a northwest/southeast direction (Figures 4A, B). Unlike the surface residual current, the bottom residual currents exhibited more complicated distributions. In summer, intensified fluvial dynamics occupied the region from the northwestern estuary to the northwest of Neilingding Island. The runoff from the northwest was transported southward along the west bank of the estuary and to the east of Qi'ao Island, forming a weak clockwise pattern around Qi'ao Island (Figure 4C). In winter, buoyant waters mainly rushed out of the estuary along the western bank of the PRE due to the reduced runoff and changes of wind direction (Lai et al., 2015), whereas saline shelf water occupied the lower estuary neighboring the eastern bank (Zheng et al., 2014), and the fluvial-tide interaction line advanced northwest. Then, the residual currents from the lower east channel resulted in a significant northwestward bottom residual current until it reached the north of Qi'ao Island and deflected southward by the plume, forming a counterclockwise pattern around Qi'ao Island (Figure 4D). In the lower PRE, the bottom U_L tended to flow northwestward (Figures 4C, D). Because the U_L indicates the averaged motions of different spatial locations on the trajectory, compared with the timeaveraged Eulerian residual current at fixed location (U_E) the upper U_L had a similar pattern but was not locally intensified



over the deep channels (Figure 2), and the magnitude of the upper layer U_L was weaker than that of U_E . In the bottom layer, the discrepancies mainly occurred in the region to the north of Lantau Island, where the U_L featured onshore intrusion, which is opposite to Eulerian one. In the upper and lower estuaries, where the deep layer motions were dominated by relatively stable river discharge and shelf current, the U_L and U_E shared a similar pattern.

The U_L represented the mean transport pattern of particles driven by the hydrodynamical motions, and as illustrated in previous investigations, the mean bottom residual currents can explain the major surficial sediment transport pattern (STP) over the estuary (Liu et al., 2012; Zhang et al., 2013). Thus, the STP in the PRE from various published papers (Xiao, 2012; Shi et al., 2015; Li and Li, 2018; Zhang et al., 2019; Chu et al., 2020; Wei et al., 2021) were combined to give the long-term mean transport pattern and to validate the transport pattern of the bottom U_L (Figure 4E). Although the calculated U_L ignored the sedimentation and resuspension processes, it was in good agreement with the mean STP, which also proved that the model and simulated U_L captured the major transport processes in the PRE. Being similar to the bottom U_L , the sediments were transported southward in the upper PRE and northward in the lower PRE in both summer and winter.

Seasonally, the STP varied in spatial ranges that sediment transported further southward/northward in summer/winter. In the middle of the estuary, with fluvial-tide interactions, the STP showed a complicated structure. As also shown in the bottom U_L , the STP near Qi'ao Island was counterclockwise in winter and clockwise in summer (Zhang et al., 2013; Wei et al., 2021). Around the west bank of the lower PRE, which was reported to be a depositional center (Yang et al., 2019), both the U_L and STP had an overall westward transport trend and convergence pattern. However, it was also noted that the bottom U_L showed a relatively large difference with the STP around the northeast of Neilingding Island, possibly due to the sand mining activities that were declared in our previous study (Chu et al., 2020).

To further illustrate the intraseasonal variability of the U_L , the depth-averaged temporal standard deviation (STD) of the residual current in the zonal and meridional directions was calculated for summer and winter as follows (Liu et al., 2012):

$$STD_{u} = \sqrt{\frac{1}{n-1} \sum_{i=1}^{n} (u_{Li} - \overline{u_{L}})^{2}}$$
 and

$$STD_{\nu} = \sqrt{\frac{1}{n-1} \sum_{i=1}^{n} (\nu_{Li} - \overline{\nu_L})^2}$$
 (3)

where u_L and v_L are the U_L in the zonal and meridional directions, respectively, and n is the number of U_L obtained from



tracking using Equation 1. The high STD_v /STD_u values represent regions where the u_L / v_L is sensitive to the initial time. Inside the estuary, the temporal variability of the U_L is dominated by motions in the north-south direction with high STD_{ν} Figures 5C, D). The high STD_{ν} occurred mainly in the region between Lantau Island and Neilingding Island in both summer and winter, where strong fluvial-tide interactions and U_L featured opposite directions to the U_E (Figure 4). The time series of the U_L and the sea level illustrated that the high STD is mainly induced by the intratidal (period of ~25 h) and springneap tidal variabilities (not shown). A larger STD_v also existed along the western coast of the estuary near Macau in winter, where buoyant water was arrested. Over the shelf, the current has a larger component in the west-east direction, and the temporal variability is mainly controlled by the STD_{μ} (Figures 5A, B).

The bottom U_L was used as an example to illustrate its intratidal variability and dependence on initial time. The surface U_L showed a similar dependence on the initial time. In summer, the U_L with the initial time (t_0) at high tide generally moved southward in the PRE, with a high magnitude of approximately 0.1 m/s (Figure 6A). For the U_L at low tide, the U_L changed to the northward direction in the lower estuary, but in the upper estuary, it remained in the southward direction due to the strong river discharge (Figure 6C). To the north of Qi'ao Island and Neilingding Island, the eastward U_L occurs associated with the convergence of the southward U_L from the upper estuary and northward U_L from the lower estuary. Given the reduced fluvial dynamics in winter, when water parcels are released at high tide, the bottom U_L is transported northward in most areas of the PRE, except for the convergence pattern near Qi'ao Island (Figure 6B). In contrast, the bottom U_L at low tide features a stronger intrusion over the entire estuary with a magnitude larger than 0.1 m/s (Figure 6D).

The background colors indicate the U_L magnitude.

Lagrangian coherent structures and transport connectivity

To explore the intrinsic transport structure and how different regions are connected, the LCSs were examined based on the FTLE in the bottom layer, where they had a more complicated structure and explained the major transport pattern, such as for sediment in the PRE regions. It was calculated following the methods of Onu et al. (2015) and Wei et al. (2018). The high-value ridge lines of the FTLE generally act as transport barriers and can be used to identify LCSs in the flow field.



In summer, high freshwater discharge enters the estuary through the four northwest outlets, and the associated sediment input accounts for the majority of the annual riverine sediment supply. The northwest forms the main transport path for materials, corresponding to the patches of highly positive FTLE values (L1, Figure 7A). An obvious highly positive FTLE can also be found in the southwest of Shenzhen Bay to the south of Middle Shoal (L2, Figure 8A). Along these ridge lines, fluid particles with high dispersion are the main material transport barriers. The negative FTLE regions present the convergence of residual currents, mainly around the southeast of Qi'ao Island, southeast of Macau, and northeast of Shenzhen Bay. These regions indicate fluid particle consolidation, such that the material tends to deposit under weak hydrodynamic conditions. It is interesting to note that the negative FTLE regions correspond well to the depocenters of the PRE revealed in previous investigations (Figure 7C). The riverine sediments from the three western outlets (i.e., Jiaomen, Hongqili, and Hengmen outlets) were trapped at the west shoals due to low bottom shear stress (Zhang et al., 2019), forming two depocenters around the northwest of Qi'ao Island and east of Macau water (Figure 7C). Meanwhile, the sediments released near the tidal channel (Humen outlet) were more deposited at the east shoal, i.e., the northwest of Shenzhen Bay (Figure 7C).

Similarly, during the winter, the positive FTLE values in the upper PRE correspond to river outlet channels (L1). In the middle estuary, a belt of the FTLE ridge existed from the west of Qi'ao Island to Shenzhen Bay in the eastern part (Figure 7B). In the lower estuary, L3 and L4 from the continental shelf to the west coast of the estuary (Figure 7B) indicated the possible material transport from the shelf to the estuary. The negative FTLE value is mainly around the east shoal, south of the west shoal, and northwest of Lantau Island in winter. In contrast to summer, the freshwater discharges and sediment loads decrease sharply in winter seasons in the PRE; thus, salt intrusion is enhanced and brings more marine sediments into the estuary, and the estuarine turbidity maximum zones will shift, as well as the depocenters. Sediments from the open sea via the southwest of Lantau Island, forming two major depocenters around Macau and the north of Lantou Island, consisting of fluvial and marine sediments (Figure 7D).

Generally, the sediment source-to-sink process in the PRE corresponded well with the spatial distribution of the FTLE. Following its distribution, the sediment mainly enters the PRE from the northwest outlets and the south open sea, supplying the sediment source to the PRE, which consists of the fact that the sediment in the PRE is composed of terrestrial sources and marine sources (Wu and Zhao, 1982; Liu et al., 2007; Li et al., 2016; Wu et al., 2018; Chu et al., 2020). The terrestrial sediments



were mainly derived from the Pearl River basin and drained through the three river-dominated outlets in the west. Due to the decline of the elevation slope and the backwater effect of the tidal current, the coarser sediment deposited around the west shoal and the finer particles continued to move toward the southeast through the west channel, eventually entered the adjacent shelf, or were intercepted around Lantou Island. The "source-to-sink" process of these terrestrial sediments can be consistent from the FTLE ridge, i.e., L1 (Figures 7A, B) to the negative FTLE center in the upper PRE region. For the marine sediments, they mainly entered the estuary through the east channel and the south of west channel. Some of them stayed close to the bay mouth under the control of shelf current, while some moved northwestward and were deposited in the west shoal when they encountered runoff (Li, 2017; Chu et al., 2020). This can be demonstrated from the FTLE ridge of L2-L4 (Figure 7) and the negative FTLE regions near Macau and Hong Kong waters.

The summer and winter results are consistent with previous predictions from a large number of complex sediment analyses (Wu and Zhao, 1982; Li, 2017; Yang et al., 2019; Chu et al., 2020), but Lagrangian analysis provides a similar answer in a more concise manner, thus providing a very useful method for interpreting predicted surface sediment transport and detecting the "source-to-sink" processes of estuarine sediments.

The FTLE field showed the different transport pattern between the east and west sides of PRE with reduced the exchanges. The zonal FTLE ridge (e.g., L2) separated the upper and middle estuary, and the lower estuary can be directly modulated by the strong shelf current. Thus, based on the structure illustrated from the FTLE, we divided the PRE into six subregions (R_i , *i*=1,2,...,6), including the shelf (Shelf), Macau water (Macau), Hong Kong water (HK), northwestern estuary (NW), Shenzhen water (SZ), and northeastern estuary (NE) (Figure 8B). These regions were generally separated by the ridges of the bottom FTLE. To quantitatively explore connectivity, the fluid transport proportions were established between these subregions (i.e., boxes in the fluid domain) within a given time interval. This transport ratio could be obtained from a Lagrangian perspective by following the trajectories of fluid particles and recording their initial and final positions (i.e., starting and ending subregions, Figure 8A). In this study, the particles were released uniformly inside each subregion and tracked for 30 days. The calculation with a different tracking time showed that it generally provided a reasonable and relatively stable connection pattern in the PRE, which was consistent with the basic transport pattern in the FTLE and U_L.

For each subregion (R_i), the flow proportion among these subregions can be given by the percentage (P_{ij}) of particles



transported from the starting subregion R_i to the ending subregion R_j (N_{Ri→Rj} to the total number of particles released (N_{Ri}) as follows:

$$P_{ij} = \frac{N_{Ri-Rj}}{N_{Ri}} \times 100 \% (N_{Ri-Rj} \le N_{Ri})$$
(4)

Since the PRE was divided into six subregions, a 6×6 transport matrix P_{ij} was defined to represent the connectivity between them. The results are illustrated in (Figures 8C, D), where the x-axis represents the subregions that release the particles, and the y-axis indicates the subregions that receive the particles. Thus, the value of P_{ij} indicates the distribution of particles in ending subregions (region *j* on y-axis) after leaving the releasing subregion (region *i* on x-axis).

During winter, the majority of the shelf water was trapped by the strong shelf current, while part of it (~40%) intruded into the estuary and mainly stayed within the Macau region (Figure 8D).

Inside the estuary, there was a transport barrier, from a Lagrangian perspective, between the western and eastern sides of the PRE, particularly in the upper estuary, although they were spatially close. The NW and Macau particles moved predominantly on the western side without entering the eastern side. Similarly, the particles released from the eastern side (SZ and NE) mainly remained within the eastern estuary, and only a small part (~20%) of SZ water enters the NW region (Figure 8D). This is consistent with the fact that the east and west sides of the PRE are controlled by different dynamics (Mao et al., 2004). In addition, the two subregions, HK and Macau, appear to be convergence zones, which have low FTLE values and weak connections with other subregions. Although they were directly adjacent to the strong shelf current, most (~60%) of the water remained inside the original region after 1 month. Consistent with previous studies, sediment and pollutants settled easily in these areas and have previously been reported as



depocenters in the PRE (Figure 7, Yang et al., 2019; Chu et al., 2020).

During the summer, intrusive particles/water from the shelf region can be transported to the HK and Macau regions and affected by the bottom intrusion; the majority of the particles released from Macau (~80%), HK (~60%), and NW (~80%) remained in the original region. Associated with the intensified river discharge, the barriers between the western and eastern estuaries still existed but were reduced so that a higher proportion of particles from SZ (~30%) and NE (~40%) regions were able to move to the Macau waters than winter time. Similar to winter, HK and Macau are two distinct convergence zones that the waters from other subregions have a high possibility to accumulate in those two regions. This is consistent with the previous investigation that the western region near Macau and the eastern region near HK were reported to have a significant hypoxia and low dissolved oxygen in summer, mainly because of the convergence of water (Li et al., 2020).

Conclusions

Using a 3D hydrodynamic model and Lagrangian investigation, this study explored the seasonal hydrodynamic transport structure in the PRE and illustrated the intrinsic connectivity under multiscale motions from a Lagrangian perspective.

The transport structure was obtained based on Lagrangian tracking. Generally, the surface U_L was uniformly southwestward/ southeastward in summer/winter and relatively stronger in the lower PRE than in the upper PRE. The bottom residual currents exhibited more complex distributions. In summer, the intensified fluvial dynamics occupies the region from the northwestern estuary to the northwest of Neilingding Island, where the U_L flowed in a southeastward direction in the upper estuary and northwestward in the lower direction. In winter, buoyant waters mainly rush out of the estuary along the western bank, and the fluvial–tide interaction line advances further to the northwest. The difference between the spatially averaged U_L and local temporally averaged U_E mainly occurred between Lantau Island and Neilingding Island, a transition



region largely affected by the interaction between the periodic tidal current and river discharge. In this region, the U_L features an onshore intrusion, whereas the U_E exhibits a convergence pattern. Although the calculated U_L ignored the sedimentation and resuspension processes, it captured the major transport processes and was in good agreement with the mean STP.

Remarkable LCSs exist in the PRE that generally define the transport paths and convergence regions. The highly positive FTLE values are the river outlets and channels in the PRE, where the fluid particles with high dispersion are the main material transport paths; the regions with strongly negative FTLE values present a convergence of residual currents, mainly concentrated in the south of the west shoal and northwest of Lantau Island, where they are reported as depocenters in the PRE. Based on the FTLE structure, a connectivity analysis was conducted among the subregions of the PRE. There was a distinct barrier between the northwest and northeast sides of the estuary during the winter and summer. In addition, two convergence regions near the Macau and Hong Kong waters were identified in both the summer and winter seasons, which is consistent with the results from the LCSs and sediment analysis. Sediment and pollutants easily settle in regions that were also previously reported as the

depocenters of the PRE and regions experiencing strong hypoxia. Lagrangian analysis provides a way to extract the spatial geometry of hydrodynamics by providing the sketches of the major circulation in estuaries. It proved to be a useful diagnostic method for understanding the hydrodynamic process and transport structure in the estuary-shelf regions.

Data availability statement

The raw data supporting the conclusions of this article will be made available by the authors, without undue reservation.

Author contributions

ZC and ZL contributed to conception and design of the study. NC, GL, and PY conducted the data analysis and developed the method. ZC and ZL validated the results. NC wrote the first draft of the manuscript. GL, YD, and JX contributed to the manuscript revision. All authors contributed to read and approved the submitted version.

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