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# Investigating the evolution of landscape patterns in historical subdeltas and coastal wetlands in the Yellow River Delta over the last 30 years: A geo-informatics approach

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Historically, the river course and coastline of the Yellow River Delta changed frequently, and many studies focused on these change trends and their driving forces. Few studies have explored the influence of historical river channels and historical coastlines on the response of modern landscape patterns. This study examines the impact of channel migration and coastline evolution on the modern landscape pattern of historical subdeltas and coastal wetlands, utilizing a combination of Geo-informatics and Remote Sensing images in 1989, 1998, 2009, and 2016. The results showed that: (1) Subdeltaic landscapes changed from 1998 to 2016, with slight changes in most landscape types in the Ancient Qing Shui Course Subdelta (AQSD), an increase in building sites by 17% in the Zhimai Course Subdelta (ZMSD), a decrease in the proportion of Phragmites/cogongrass communities by 15.8% in the Diao Kou Course Subdelta (DKSD), and domination by natural landscapes in the Modern Qing Shui Course Subdelta (MQSD). (2) Coastal wetlands also experienced changes, with an increase in cultivated land to 60% in the coastal wetlands of CWI, a decline in natural landscapes, and an increase in artificial landscapes in the coastal wetlands of CWII and CWIII, and domination by natural landscapes but an increase in salt fields and culture ponds by 3.45% in the coastal wetlands of CWIV. (3) Channel migration and coastline evolution influenced the direction of landscape succession, causing the landscapetype centroids in the entire delta to move eastward or northward. (4) Throughout the delta, the human tendency to live by rivers was observed. This was due to the availability of freshwater from these rivers, which led to the expansion of inhabited areas and man-made water bodies along the river banks. Channel migration and coastline evolution aggravated the salinization of coastal wetlands and promoted the salt industry and aquaculture in some estuaries of the Yellow River. In general, human activities play a dominant role in shaping the landscape pattern in the Yellow River Delta, but they were largely restricted to historical channel migration and historical coastline evolution.

#### KEYWORDS

Yellow River Delta, Geo-informatic Tupu, landscape pattern, channel migration, coastal evolution

### **1** Introduction

Landscape patterns consist of landscape elements or complexes, and refer to the way they are arranged spatially, including their types, quantities, and distribution. The purpose of exploring the evolution of landscape patterns is to explain the relationship between landscape patterns and ecological processes to infer the factors driving landscape change and to predict development trends (Zeng et al., 2011; Peng et al., 2015). In recent years, many studies of landscape patterns have focused on exploring the relationship between landscape patterns and ecological processes (Fu et al., 2010; Li et al., 2016; Li et al., 2017), the forces driving landscape patterns (Liu et al., 2014b; Cong et al., 2019), the influence of data sources on landscape pattern analysis (Ottinger et al., 2013; Liu et al., 2014a), and gradient analysis of landscape patterns (Wu et al., 2017; Tanner and Fuhlendorf, 2018). The research methods have involved the use of 2-dimensional (2D) and 3-dimensional (3D) landscape index analyses (Cao et al., 2015; Ding et al., 2017), the construction of numerical models (Wang et al., 2012; Yang et al., 2014), the use of buffer analyses (Zhao and Lu, 2017), and the use of moving split-window analyses (Liu et al., 2017).

The modern Yellow River Delta (YRD) is one of the youngest, most extensive, and most biodiverse estuarine coastal wetlands in China's warm temperate region (Chu et al., 2006; Li et al., 2009; Li et al., 2013; Chen et al., 2016). In recent years, human activities, changes in the water and sediment of the Yellow River, and coastal erosion have impacted the landscape of the Yellow River Delta (YRD), leading to complex and dramatic changes in landscape types and an increased rate of landscape evolution. This makes the study of the evolution of the YRD's landscape pattern significant (Ottinger et al., 2013; Meng et al., 2017; Cong et al., 2019). Currently, research on the landscape patterns of the Yellow River Delta (YRD) has mainly focused on quantifying the area and landscape index (Cabral and Costa, 2017), lacking sufficient clarity in the spatial expression of changes in the YRD's landscape pattern. Moreover, many studies have analyzed the changes in the overall landscape pattern of the YRD (e.g., Chu et al., 2006; Ottinger et al., 2013; Cong et al., 2019). The impact of river and shoreline changes on the YRD landscape pattern is underresearched, particularly the impact of abandoned channels and shorelines. Studying their influence on the landscape pattern over time creates a scientific basis for future research on the evolution and driving forces of the YRD landscape pattern.

The Geo-informatic Tupu approach involves the use of a group of digitized maps, images, tables, or curves to reveal the internal structure of geographic elements and the rules of spatial differentiation (Chen et al., 2000; Qi and Chi, 2001). Graphics and historical data are two of its key features, and the Geoinformatic Tupu method can invert the geography of the past and can also predict some geographic phenomena in the future. Additionally, the combination of graphs and spectra using the Geo-informatic Tupu method can provide quantitative spatiotemporal information on the dynamic characteristics of landscape patterns (Qi and Chi, 2001; Chen et al., 2020). At present, the Geo-informatic Tupu approach is widely used in geographical research areas, including global change, regional development patterns, disaster impact, agriculture production, urban construction, development planning, and resource assessments (Chen et al., 2020). In summary, the application of the Geo-informatic Tupu method to the study of the landscape pattern in the YRD is a usable research method.

This study applied the Geo-informatic Tupu approach (Chen et al., 2000) to analyze the impact of river channels and coastline evolution on the evolution of landscape patterns in four historical subdeltas: AQSD (Ancient QingShui Course Subdelta), ZMSD (Zhimai Course Subdelta), DKSD (Diaokou Course Subdelta), and MQSD (Modern QingShui Course Subdelta). The influence of the historical river and coastline evolution on the modern landscape patterns provided an explanation of the mechanism driving the evolution of landscape patterns in the whole YRD.

### 2 Study area

The YRD is bordered by Bohai Bay to the north and Laizhou Bay to the east (Figures 1A, B). This delta developed as a result of frequent channel migration and sediment deposition (Cui and Li, 2011). Since the Yellow River shifted course from the South Yellow Sea to the Bohai Sea in 1855, the Yellow River has migrated many times (Xue, 1994). For example, from 1855 to 1889, alluvium deposited by the Yellow River formed the AQSD (Figure 1C). From 1929 to 1934, the Yellow River flowed southward into Laizhou Bay and formed the ZMSD (Figure 1C). From 1964 to 1976, it flowed northward into the Bohai Sea and formed the DKSD (Figure 1C). From 1976 to the present, the Yellow River has flowed eastward into Laizhou Bay, forming the MQSD (Figure 1C) (Xue, 1994; Wu et al., 2015; Ji et al., 2020). The modern YRD is composed of subdeltas that formed in different periods. Its coastline has also undergone significant changes. From 1855 to 1934, the northeastern and northern coastlines of the YRD advanced significantly towards the sea, while the eastern and southeastern coastlines of the YRD extended seaward to a lesser degree. From 1934 to 1959, the northeastern coastline protruded seaward, the northern coastline retreated landward due to severe wave erosion, and the eastern and southeastern coastline extended seaward due to deposition. From 1974 to 1988, the eastern and northeastern coastlines underwent significant seaward extension. From 1988 to 1998, the eastern coastline protruded seaward. The evolution of the river and coastline is primarily influenced by sedimentation, seawater erosion, and freshwater scouring, which can change the soil's water content and salinity, which, in turn, impacts the vegetation coverage of the land surface.

In this study, we aim to investigate the impact of river channel and coastal changes on landscape patterns over approximately 30 years. To achieve this, we analyzed subdeltas that were formed during different periods, including AQSD (1855-1889), ZMSD (1929-1934), DKSD (1964-1976), and MQSD (2007-present) as shown in Figure 1. In particular, we focused on investigating the coastal wetlands at four crucial points in history, namely 1855, 1934, 1974, and 2009, in order to understand the evolution of coastal



wetland landscapes. These study areas are referred to as Coastal Wetland I (CWI), Coastal Wetland II (CWII), Coastal Wetland III (CWII), and Coastal Wetland IV (CWIV), respectively, each outlined by the shoreline of the corresponding year. To assist with statistical analysis, we defined buffer zones with 20 km landward and 10 km seaward boundaries, which encompass the

## 3 Data and methods

### 3.1 Data sources

coastal wetlands.

In this section, the main operations are the geometric refinement of remote sensing imagery, vectorization of historical data, and landscape classification. The data utilized primarily include:

- Maps of the Yellow River channels, coastline, and subdeltas from 1855 to 1976 (Liu, 2003);
- (2) A 1:50,000 topographic map from 1984;
- (3) Field survey data from the YRD: in October 2016, a field trip to the YRD was conducted to collect landscape data from the 107 sites (the observation position is shown in Figure 1, and detailed information on the observation position is described in Table S1 of the Supplementary Materials);
- (4) To evaluate the interdecadal scale changes in the YRD over the past 30 years, we selected remote sensing images with an interval of approximately 10 years. The remote sensing images used in this study were exclusively taken in September or October, due to the unique autumnal coloration of landscapes in the YRD that aids in landscape classification (Liu et al., 2018). Four remote

sensing image datasets provided by the US Geological Survey (USGS) for 1989, 1998, 2009, and 2016 were finally selected as the data sources of the landscape classification (Figure 2 and Table 1).

#### 3.2 Data processing

Historical data related to the Yellow River, coastline, and subdelta distribution maps from 1855 to 1976 were digitally processed, georeferenced, and vectorized using ArcGIS. These results were then corrected using remote images and underwent various transformations, including projection transformation, geometric precision correction, data fusion, image resampling, and enhancement processing (Ottinger et al., 2013; Jiang et al., 2015). The processing of remotely sensed data was performed to obtain coastline data and enhance classification accuracy. The initial steps of processing, including radiometric calibration, geometric correction, cropping, and image enhancement, were performed on the remotely sensed data. Subsequently, the data underwent the KT transform and unsupervised classification, and the coastline was extracted using the instantaneous water boundary method.

The analysis of landscape-type centroids was utilized in this study to investigate the dynamic changes in various landscape types, which were automatically calculated in ArcGIS. By assessing the distribution of landscape types during each study period, the spatial trends in landscape changes could be determined (Fu et al., 2013). In the event that a landscape type experiences uniform changes in both area and spatial position, its center of mass remains relatively stable. However, if there is a substantial alteration in the area or spatial position in a single direction, the center of mass will exhibit a noticeable shift. The calculation of the area-weighted change in the center of mass of the landscape types allows for the evaluation of the pattern and trend of spatial change within the landscape. The migration of the landscape-type centroids was calculated in terms of distance and direction using measuring tools and the COGO toolbar in ArcGIS, respectively.

In recent years, the YRD region has seen an increase in soil salinization due to the impact of rising sea levels, fluctuations in



Image	Acquisition date	Bands	Resolution	Path	Row	Data source
TM	1988.09.30	7	30 m	121	34	USGS
TM	1998.09.10	7	30 m	121	34	USGS
TM	2009.10.26	7	30 m	121	34	USGS
OLI	2016.10.29	8	15 m	121	34	USGS

TABLE 1 List of images used in this research.

groundwater levels, and a decrease in runoff from the Yellow River. This has resulted in more severe salinization and distinct spatial changes in the YRD. (Wang et al., 2018). Influenced by the migration of the Yellow River channel and coastline evolution, the salt content and water content in the soil vary greatly in different areas of the YRD and are the key factors determining the types of vegetation communities (Meng et al., 2016). Therefore, this study combined remote sensing images with field observation data and then classified the landscape types of the YRD into 9 categories according to the characteristics of the vegetation communities (Table 2).

According to the definition of the landscape classification system above, this study applied the unsupervised classification method to the characteristics of the YRD to classify the information in the remote sensing images from four periods and then visually interpreted the classification results. First, field surveys (observation locations are shown in Figure 1) and land use survey data from the same period were used to verify the accuracy of the interpretation results in 2016, and the interpretation accuracy was 92.15%. Then, the landscape of the YRD was extracted from remote sensing images in 2009, 1998, and 1988 by the same method, and the use of land use survey data from the same periods for accuracy verification showed that the interpretation accuracy was 93.12%, 92.68%, and 90.12%, respectively (Table 3). The interpretation accuracy met the research requirements. Finally, the interpretation results of the four periods were divided according to the range of the subdelta and coastal wetlands to analyze the impact of the changes in the Yellow River channel and coastline on the landscape structure of the YRD.

This paper mainly explored the influence of the Yellow River channel and coastline evolution on the landscape pattern of the YRD according to the landscape characteristics and succession in the YRD. The subdeltas and coastal wetlands in the different periods were superimposed onto the landscape structure maps for 1988, 1998, 2009, and 2016. Then, we obtained the landscape pattern distribution of the subdeltas and coastal wetlands of the YRD in different periods (Figures 3, 4), and the ratio of the area of each landscape type to the total area was calculated. We obtained a map of the proportions of the total area of the subdelta and coastal wetland landscapes in the different periods (Figures 5, 6). We extracted the regional centroids of the subdelta and coastal wetland landscapes in the different periods, and then the regional centroid was integrated into a Geo-informatic Tupu to explore the landscape succession characteristics (Figures 7, 8).

### 4 Results

# 4.1 The landscape pattern of the YRD based on Geo-informatics

## 4.1.1 Analysis of subdelta landscape patterns in different periods

In the subdeltas analyzed, the cultivated land typically made up a high proportion of the total area over the four periods (Figure 5 and Table 4). For instance, the proportion of cultivated land in the AQSD ranged from 64.41% to 77.16% from 1988 to 2016, making it the dominant landscape type. The other landscape types, excluding cultivated land, building sites and rivers, and artificial water bodies, had relatively low proportions and remained largely unchanged over time (with a change of less than 5%). However, the proportion of cultivated land decreased over time, and the proportion of building sites increased, indicating that human activities were the primary driver of changes in the landscape structure in the AQSD.

In the ZMSD, the areas of salt fields, culture ponds, forests, building sites, rivers, and artificial water bodies increased over time. The most notable increase was in the area of building sites, which showed a steady annual increase and reached a peak of nearly 17% during the period 1998-2009, becoming the second most dominant landscape type in the ZMSD.

In the DKSD region, the proportion of sea area, bare flats, salt fields, culture ponds, and Chinese tamarisk and *Suaeda glauca* communities showed significant changes of more than 5%, while the proportion of other landscape types varied by less than 5%. The Chinese tamarisk and *Suaeda glauca* communities showed the greatest changes, with a decrease from 21.16% in 1988 to 5.36% in 2016.

In the MQSD, In the MQSD region, a significant proportion of the land was used for agriculture (22.07%) and bare flat areas (26.50%) in 2016. The other landscape types comprised a relatively

TABLE 2 The Yellow River Delta landscape classification scheme.

	1	2	3	4	5	6	7	8	9
Landscape type	Sea area	Bare flats	Salt fields and culture ponds	Chinese tamarisk and the <i>Suaeda glauca</i> communities	Phragmites/ cogongrass communities	Cultivated land	Forests	Building sites	Rivers and artificial water bodies

#### TABLE 3 Evaluation of classification accuracy.

	Number of sample points for ground-based observation types										
	Year	Sea area	Bare flats	Salt field and culture pond	Chinese tamarisk and Suaeda glauca community	Phragmites/ cogongrass community	Cultivated land	Forest	Building sites	Rivers and artificial waters	Average Classification accuracy (%)
Reference categories		5	10	15	14	7	12	16	23	5	
Classification	1988	5	10	15	13	9	10	17	21	7	90.12
categories	1998	4	11	16	14	5	9	18	24	6	92.68
	2009	5	9	14	15	10	13	14	19	8	93.12
	2016	5	11	15	14	8	14	15	20	5	92.15





small portion, generally less than 10%. The area of bare flat lands decreased by 6.16% from 2009 to 2016, while the other landscape types remained relatively unchanged, with variations of less than 5%.

# 4.1.2 Analysis of coastal wetland landscape patterns in different periods

In CWI, CWII, and CWIII, cultivated land accounted for the largest proportion of the total area and was thus the dominant landscape type. In addition, the percentages of salt fields and culture ponds relative to the total area increased continuously to more than 20% from 1988 to 2016, making them the second most dominant landscape type (Figure 6 and Table 5).

In CWI, there were large differences in the various types of landscapes. The percentage of cultivated land was 58.50%, while

that of the sea area was 0.02% in 1988. The areas of the various landscapes changed slightly over time, but the areas of salt fields and culture ponds, and building sites increased by 7.69% and 12.10%, respectively, during 1998–2009.

In CWII, the areas of natural landscapes (bare flats, Chinese tamarisk, *Suaeda glauca* communities, and *Phragmites*/cogongrass communities) decreased. Among them, the area of the *Phragmites*/ cogongrass communities decreased by 14.29% during 1998-2009. In contrast, the area of artificial landscapes (including building sites, salt fields, and culture ponds) increased.

The evolution of the landscape pattern in CWIII was similar to that in CWII. In CWIV, the sea area was 21.51% in 2009. From 2009 to 2016, the bare flat area declined by 4.81%, while the area of salt fields and culture ponds increased by 1.83%. The areas of the other landscape types changed slightly.



# 4.2 The succession pattern in the YRD based on Geo-informatic analysis

# 4.2.1 Analysis of subdelta succession patterns in different periods

The landscape types in the AQSD were scattered and mainly distributed along the river. During the different periods, the characteristics of the artificial landscape types changed obviously. The regional centroids of cultivated land occurred mainly in the vicinity of the Yellow River but moved farther away from the river in 2016. Furthermore, the regional centroids of the building sites and rivers and artificial water bodies expanded away from the river channel over time (Figure 7).

The landscape succession patterns in the ZMSD and the DKSD were similar; in comparison to those in the AQSD, the regional centroids were more concentrated and tended to occur along the Yellow River channel. Although the regional centroids of the different landscape types changed according to the period, they were basically distributed along the direction of the river, including those of forestland, building sites, cultivated land, *Phragmites/* cogongrass communities, salt fields, culture ponds, rivers and artificial water bodies, Chinese tamarisk, *Suaeda glauca* 

communities, bare flats, and sea areas. Over time, the distribution of cultivated land and building sites were greatly affected by human activities, which significantly changed along the direction of the river course.

In the MQSD, the distribution centers of cultivated land, forestland, rivers and artificial water bodies, *Phragmites/* cogongrass communities, Chinese tamarisk, and *Suaeda glauca* communities were located near the Yellow River channel and were distributed along the extension direction of the river channel. Studies have shown that the regional centroids of these landscapes are mainly affected by freshwater from the Yellow River (Zhao et al., 2013). The regional centroids of the salt fields, culture ponds, building sites, rivers and artificial water bodies, and bare flats were distributed on both sides of the river, far from the channel.

# 4.2.2 Analysis of coastal wetland succession patterns in different periods

Unlike the pattern of subdelta landscape succession, there were no significant changes in the coastal wetland landscape in a single period. In CWI, building sites and rivers, and artificial water bodies, which were greatly affected by human activities, were distributed on the landward side, and they migrated along the coast to the north



and south over time. The building sites migrated southward along the coastline to the southernmost point of the coastal wetland after 1998. Rivers and artificial water bodies migrated to the northernmost point of coastal wetlands after 1998 and moved to the southernmost point along the coastline in 2009. The changes in the other landscape centers were not obvious (Figure 8).

In CWII and CWIII, the changes in all landscape types except for building sites and cultivated land were small. The building sites and cultivated land areas migrated from the land to the sea, perpendicular to the coastline, during 1988–2016.

In CWIV, the landscapes were basically identical in 2009 and 2016, and the landscape structure had obvious regularity. From the ocean to the land, the sea area, bare flats, salt fields, culture ponds, Chinese tamarisk, *Suaeda glauca* communities, *Phragmites/* cogongrass communities, building sites, rivers and artificial water bodies, forestland, and cultivated land were distributed in turn.

In CWIV, the landscapes of the bare flats, Chinese tamarisk, *Suaeda glauca* communities, *Phragmites*/cogongrass communities, forestland, and building sites were mostly distributed near the Yellow River estuary. The landscapes of the cultivated land areas, salt fields, culture ponds, and sea areas were located in the north. The landscapes of rivers and artificial water bodies were distributed in the south.

### **5** Discussion

The main factors affecting the landscape pattern change in the YRD include the evolution of the Yellow River channel and coast, storm surge, and human activities and policies (Bi et al., 2011; Cao et al., 2015). The landscape types in the AQSD and the ZMSD were mainly artificial landscapes. Over time, the cultivated land gradually decreased in area, the building sites increased, and the building site landscape was mainly distributed along the river. Among the subdeltas considered, the AQSD and the ZMSD formed the earliest, and there have been only small changes in the land area since their formation. Thus, the coastline had a relatively low impact on the landscape pattern during these periods. However, the Yellow River channel runs through the two subdeltas, ensuring an ample supply of water resources for the communities located along both its banks. Thus, due to the high intensity of development and utilization (Table 6), human activities have had a strong



influence on landscape succession (Liu et al., 2012; Li et al., 2013; Chen et al., 2014; Liu et al., 2018; Cong et al., 2019). The impact of the Yellow River channel on the landscape is mainly reflected in the extension of the artificial landscape types along the river to the sea.

The natural landscape types in the DKSD and the MQSD were characterized by bare flats, *Phragmites*/cogongrass communities, Chinese tamarisk, and the *Suaeda glauca* communities, which were distributed along the river. The succession of each natural landscape also progressed toward the river channel. The artificial landscapes in these areas, including cultivated land, salt fields, and culture ponds, were mainly distributed along the Yellow River channel. Building sites were concentrated in certain areas, and there was no significant change in their center of distribution over time (Liu et al., 2012).

The Yellow River channel provides water for the landscape along its course, and the soil on both sides of the river is fertile and suitable for cultivation. Therefore, most natural and artificial landscape types tend to also be associated with the Yellow River. In addition, the landscape of the DKSD was also affected by the human salt industry and aquaculture, and the bare flat area decreased while the artificial water area increased. Thus, all of the landscape types except for construction land migrated from the sea



to the land perpendicular to the coastline because of the increased artificial aquaculture water bodies in the DKSD.

However, the MQSD, which was formed by sediment deposition over the previous 40 years, is the youngest of the four subdeltas (Liu et al., 2013). The newly formed subdelta mainly consists of a silty coast with soft and loose soil (Bi et al., 2010). Its remote location from the city center and the difficulty of utilizing the land make it relatively less impacted by human activities (Chi et al., 2018).

In summary, the growth of the human population and the progression of urbanization have led to an increase in demand for both residential and cultivated land. This has resulted in a substantial increase in the size of residential areas and artificial irrigation water areas along the ancient QingShui River (1855-1889), Zhimai River (1929-1934), Diaokou River (1964-1976), and Yellow River (1996-present). However, the development of the petrochemical and aquaculture industries has led to a significant expansion of artificial water bodies, including salt pans and shrimp ponds, and oil extraction facilities, at the cost of reducing the size of natural habitats such as Chinese tamarisk, *Suaeda glauca* communities, and *Phragmites/cogongrass* communities.

This paper focused on the impact of the historical river channel and coastline evolution on modern landscape patterns and the

	Sea area	Bare flats	Chinese tama- risk and the <i>Suaeda glauca</i> communities	Phragmites/ cogongrass communities	Salt fields and culture ponds	Cultivated land	Forests	Building sites	Rivers and artificial water bodies	
1988	/	/	0.00%	1.72%	5.32%	77.16%	7.96%	3.12%	4.71%	AQSD
1998	/	/	+0.58%	+0.69%	-4.85%	-3.30%	-5.22%	+6.72%	+5.38%	
2009	/	/	+1.98%	/	-3.36%	-7.90%	-3.95%	+11.25%	+3.71%	
2016	/	/	+2.85%	/	-3.72%	-12.75%	-2.63%	+12.16%	+5.80%	
1988	0.31%	1.27%	1.99%	6.47%	8.37%	64.29%	0.65%	6.93%	9.72%	ZMSD
1998	-0.26%	+0.72%	+2.97%	-0.22%	-7.77%	-5.16%	+0.36%	+3.06%	+6.30%	
2009	-0.02%	-1.31%	+9.48%	-6.17%	-6.83%	-16.19%	+1.00%	+16.58%	+2.74%	
2016	-0.01%	-0.01%	+10.12%	-6.17%	-6.69%	-18.51%	+0.50%	+17.09%	+4.28%	
1988	20.43%	13.13%	3.52%	21.16%	7.43%	26.32%	4.43%	0.74%	2.84%	DKSD
1998	+4.00%	+0.68%	-0.82%	-9.07%	+8.60%	-2.49%	-1.91%	+0.14%	+0.87%	
2009	+6.61%	-2.58%	+4.99%	-17.37%	-0.70%	+6.62%	-1.05%	+3.61%	-0.13%	
2016	+5.42%	-5.01%	+13.66%	-15.80%	-1.99%	-0.74%	-0.64%	+4.94%	+0.16%	
1988	/	/	/	/	/	/	/	/	/	MQSD
1998	/	/	/	/	/	/	/	/	/	
2009	6.94%	28.23%	7.23%	5.70%	8.43%	29.65%	1.71%	8.25%	3.86%	
2016	-0.33%	-6.16%	-0.81%	+3.98%	+1.16%	-3.15%	+1.19%	+0.07%	+4.05%	

TABLE 4 Percentage	changes in the area of	the subdelta landscape	types relative to	the total area in different	periods.
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(The changes, shown as "+" and "-" values, were calculated as the percentage of the landscape in 1988).

direction of the succession of the YRD. Ottinger et al. (2013) suggested that the landscape changes in the YRD were mainly caused by a considerable increase in built-up areas, while changes in coastal areas were closely associated with the coastward expansion of salt fields and culture ponds. Thus, we further clarify the temporal and spatial evolution characteristics of the main landscape types at the subdelta scale. For the convenience of discussion, we divide the main landscape types into artificial landscapes (forestland, building sites, rivers and artificial water bodies, salt fields, and culture ponds) and natural landscapes (bare flats, Chinese tamarisk, and Phragmites/cogongrass communities). As Figure 9 shows, according to the calculated migration direction and distance of landscape-type centroids (Table S2), we found that the centroids of some artificial landscapes moved slowly to the north during 1998-2016. The shift in salt fields and culture ponds was 12.2 km, which was much larger than the shifts in cultivated land (3.1 km) and forestland (7.6 km). However, the migration direction of building sites and rivers, and artificial water bodies (i.e., mainly southeast) was not consistent with the above three types of artificial landscapes. Over the past 20 years, the urban built-up area of Dongying city has been expanding to the east near the coastline, and large reservoirs have been built on the plain to the east of the city (Figure 1). Thus, the landscape changes in building sites and rivers and artificial water bodies are loosely related to urban planning. The centroids of the natural landscape moved to the east, with the bare

flats moving 30.6 km to the southeast, the Chinese tamarisk moving 21.4 km to the east, and the cogongrass communities moving 16.7 km to the northeast. Therefore, the different migration directions and distances of the centroids in artificial landscapes and natural landscapes essentially reflect that the changes in the Yellow River channel have led to different geomorphic development processes in the subdeltas, which directly affect human activities and the development of natural vegetation. Due to the diversion of the Yellow River channel to the southeast and the interruption of the sediment supply, the DKSD (1964-1976) is now in the stage of coastal erosion, resulting in wetland ecological degradation (Huang et al., 2012). With the development of the economy and society, human activities are increasing, resulting in an increase in cultivated land, salt fields, aquaculture ponds, and building sites. However, for the MQSD (1976-1996), the modern river course of the Yellow River generally flows to the southeast. At present, the coastline continues to advance toward the sea, which leads to the continuous expansion of the wetland ecosystem. Moreover, the Yellow River Estuary National Nature Reserve was established in 1992, which has significantly reduced the interference of human activities. Finally, the centroids of natural landscape types in the YRD moved to the southeast from 1998 to 2016.

In summary, according to the migration directions of the landscape-type centroids, most of the landscapes tended to migrate toward the east or north. Moreover, for the whole YRD, the human tendency to live near rivers was also observed here.

	Sea area	Bare flats	Chinese tamarisk and the <i>Suaeda glauca</i> communities	Phragmites/ cogongrass communities	Salt fields and culture ponds	Cultivated land	Forests	Building sites	Rivers and artificial water bodies	
1988	/	4.89%	2.62%	11.03%	9.54%	58.50%	2.95%	4.89%	5.58%	CWI
1998	0.02%	-1.88%	+0.02%	-7.01%	+2.94%	-2.08%	+0.67%	+3.53%	+3.79%	
2009	+0.03%	-4.37%	+1.16%	/	+7.60%	-5.89%	-0.49%	+7.85%	+0.12%	
2016	+0.01%	-4.69%	+18.94%	-10.74%	+12.1%	-5.52%	+0.00%	+8.16%	-0.28%	
1988	9.20%	16.72%	5.63%	17.18%	11.40%	31.60%	1.55%	0.33%	6.39%	CWII
1998	+1.27%	-2.34%	+1.81%	-8.72%	+7.12%	-1.09%	+0.03%	+0.95%	+0.97%	
2009	+2.53%	-11.38%	-0.74%	-14.93%	+18.55%	+4.36%	+0.02%	+2.63%	-1.04%	
2016	+1.26%	-12.47%	-0.99%	-14.29%	+21.67%	+0.68%	-0.32%	+2.93%	+1.53%	
1988	9.46%	15.20%	5.19%	20.55%	12.73%	26.87%	1.15%	3.55%	5.30%	CWIII
1998	-4.00%	+4.00%	-1.00%	-11.00%	+11.50%	-1.00%	+0.50%	+0.50%	+0.50%	
2009	+0.26%	-4.80%	-0.56%	-17.67%	+12.25%	+5.17%	+0.15%	+5.60%	-0.40%	
2016	+2.30%	-8.88%	-0.77%	-16.80%	+14.81%	+1.51%	-0.12%	+7.00%	+0.95%	
1988	/	/	/	/	/	/	/	1	/	CWIV
1998	/	/	/	/	/	/	/	1	/	
2009	21.51%	12.21%	2.53%	2.45%	35.43%	16.21%	0.54%	5.09%	4.03%	
2016	-0.18%	-4.81%	+1.45%	+2.15%	+1.83%	-0.87%	-0.12%	+0.85%	-0.30%	

TABLE 5	Percentage changes in the area of	coastal wetland landscape	types relative to the total	area in different periods.

(The changes, shown as "+" and "-" values, were calculated based on the percentage of the landscape in 1988).

Inhabited areas expanded along the course of the Yellow River in different historical periods due to the freshwater supplies (e.g., LiJin, YanWo, and HeKou along the Ancient QingShui River; KenLi and Dongying along the ZhiMai River; and Gudao and XianHe along the DiaoKou River); similarly, artificial water bodies for domestic and industrial and agricultural use also expanded along the river (Figure 3). Along with historical river channel migration, urbanization increased gradually, and the centroid of inhabited areas stabilized in the eastern part of Ninghai, which has not been affected by river changes since 1934. The estuaries of the Yellow River in different historical periods were more salinized due to seawater intrusion, which led to the transformation of vegetation into salt fields and culture ponds, especially for the estuaries of the Yellow River in ZMSD and the DKSD but not for the Yellow River Estuary National Nature Reserve in the MQSD (Figure 3). The range of coastline change was much lower than

that of Yellow River channel migration. This aggravated the salinization of coastal land in the coastal wetlands from 1988 to 2016 but promoted the development of the salt industry and aquaculture (Figure 4). In general, human activities dominated the landscape pattern in the YRD; however, they were largely restricted by historical channel migration and historical coastline evolution.

The obtained results of landscape pattern succession showed that the degree of salinization in the YRD has increased and that the ecosystem has tended to become more fragile over time. It is necessary to make more rational use of limited water resources, optimize the industrial structure, engage in ecotourism, and achieve green and sustainable development. Moreover, it is essential to return farmland to forest and grassland, improve soil salinization bioremediation ability, and bring into play the carbon sink capacity of the YRD to help achieve the dual carbon goal.

TABLE 6	Population,	urban area,	and	GDP	of	Dongying	from	1988	to	2016
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Year	Population	Population growth rate (%)	Urban area (km²)	GDP (×10 <sup>8</sup> ¥)
1988	-	8.73	7418	65.74
1998	169.18	9.51	7923	315.67
2009	201.78	3.15	7923	2058.97
2016	213.21	10.73	8243	3479.60



## 6 Conclusion

- (1) In the four historical subdeltas, the proportion of cultivated land to the total area was generally high, making it the dominant landscape type. The proportion of cultivated land area decreased over time, while the proportions of building sites and salt fields, and culture ponds increased. The landscape structures of the AQSD and the ZMSD were dominated by human activities along the Yellow River channels (1885-1889 and 1929-1934). Most of the landscape-type centroids in the DKSD tended toward the Yellow River (1976-present) and were perpendicular to the shoreline and migrated from the sea toward the land. This was the case with all landscape types except built-up land. The centroid of the landscape types in the MQSD, which were along the Yellow River (1976-present), changed slightly, except for the Chinese tamarisk, which is protected in the Yellow River Estuary National Nature Reserve.
- (2) Cultivated land dominated the coastal wetlands in CWI, CWII, and CWIII, and the percentages of salt fields and culture ponds increased to more than 20% from 1988 to 2016, with this landscape type becoming the second most dominant landscape type. The sea area accounted for the largest proportion of the total area in CWIV. From 2009 to 2016, the area of bare flats declined by 5%, while the areas of salt fields and culture ponds increased by 3.45% in CWIV.
- (3) According to the migration direction and distance of the landscape types, we found that the centroids of the artificial landscapes gradually shifted northward, while the centroids of the natural landscapes moved eastward between 1998 and 2016. This also indicated the human tendency to live

near rivers. Inhabited areas and artificial water bodies expanded along the river courses due to freshwater supplies. The estuaries of the Yellow River in different historical periods transformed from vegetation to salt fields and culture ponds. The salinization of coastal wetlands was exacerbated by channel migration and coastline evolution, but it also fueled the growth of the salt industry and aquaculture. Human activities greatly impact the landscape in the YRD but are largely limited by past channel migration and coastal evolution.

### Data availability statement

The original contributions presented in the study are included in the article/Supplementary Material. Further inquiries can be directed to the corresponding authors.

## Author contributions

QW and CZ designed the research. LZ and XY analyzed data and wrote the manuscript, which was edited by all of the co-authors. SC, JY, CD refined the interpretations. All authors contributed to the article and approved the submitted version.

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### **Conflict of interest**

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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### Supplementary material

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fmars.2023.1115720/ full#supplementary-material

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