



Article Evaluating the Human–Water Relationship over the Past Two Decades Using the SMI-P Method across Nine Provinces along the Yellow River, China

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Abstract: The foundation for ensuring the sustainable utilization of natural resources and human wellbeing lies in achieving a harmonious balance between nature and humans. In the Yellow River basin (YRB), numerous water crises, including floods, droughts, soil erosion, and water pollution, threaten its crucial role as a significant economic belt and ecological barrier. Unfortunately, less comprehension regarding the complex human-water relationship in this region has impeded watershed water management decision-makers from identifying key priorities for intervention. Here, we selected 29 evaluation indicators, including water resources, environment, ecology, society, economy, and science and technology from three dimensions: healthy water systems, sustainable human systems, and synergy of human-water system. We applied the entropy weight method, hierarchical analysis, and Single index quantification, multiple index synthesis, and poly-criteria integration (SMI-P) methods to quantify the spatial-temporal variation of the human-water harmony degree (HWHD) in nine provinces of the YRB from 2002 to 2021. We observed a consistent increase in the HWHD across all provinces in the YRB in the past two decades. Notably, five provinces have transitioned from Complete disharmony ($0 \le HWHD \le 0.2$) to Nearly complete disharmony ($0.2 < HWHD \le 0.4$). Additionally, the average growth rate of the downstream provinces is faster compared to those upstream. By 2021, the HWHD of upstream provinces like Sichuan and Ningxia, constrained by slower growth, became the two lowest provinces of the YRB, at 0.19 and 0.12 respectively. These findings offer valuable guidance for the region and similar areas grappling with the complex challenges of human-water conflicts, providing insights to navigate and address such dilemmas effectively.

Keywords: harmony theory; harmony evaluation; water resources management; spatial-temporal analysis

1. Introduction

Water serves as the fundamental resource for humanity and is indispensable for fostering social development and well-being [1,2]. As the global population and societal development continue to rise, the increasing demand for water resources exacerbates its impact on the water environment [3]. The escalating water crisis, encompassing issues like water scarcity, flood disasters, and polluted groundwater, threatens human survival and sustainable development, posing a significant challenge to global social security [4,5]. The projected global urban population experiencing water scarcity is expected to triple by 2050 compared to the levels observed in 2016 [5]. Moreover, populations exposed to river flooding are predicted to increase by 4–20 fold by the years of 2100 [6]. Therefore, comprehending the interplay between human and water systems and promoting their sustainable development has become both urgent and imperative.



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The human system, centered around humanity, encompasses social activities, economic development, scientific and technological progress, and other factors critical to human survival [7]. Accordingly, the water system comprises the water consumption and demand of related sectors, as well as the environmental background conditions of water resources. The interplay between human activities and water environment status is exceptionally intricate [8]. Currently, the quantification of this relationship employs either single or comprehensive indicators. When focusing on single indicators, researchers often construct evaluation metrics based on the contrast between water supply and demand, with commonly employed measures such as water shortage index [9], water stress index [10], water use efficiency [11,12], and others. However, these single indicators reflect only one aspect of the complex relationship. Conversely, comprehensive indicators and integrated assessment models offer a more holistic approach, such as the water poverty index [13,14], water resources carrying capacity index [15], water security index [16], and human–water harmony index [17]. These comprehensive metrics offer a more nuanced understanding of the multifaceted relationship within the human-water system, helping to promote synergies between human development and water environment health.

Related research of human-water harmonious is a forward-looking exploration grounded in the mechanisms of interaction, adaptation, and balance principle within human-water system [17]. Its primary objective is to promote a virtuous cycle within the human–water system. This will enhance the self-maintenance and renewal capabilities of the water system, ensuring that water resources can offer enduring support and assurance sustainable economic growth and social development [18]. Research on human-water harmonious has evolved from qualitative inquiries at the beginning of the 21st century to a more quantitative approach today. Key components of this research now encompass the exploration of interaction mechanisms within human–water systems, the quantitative analysis and simulation of the human-water relationship, and the optimization of schemes promoting such harmony [19–21]. These studies have found widespread application across various scales, including national, provincial, urban, and watershed levels. In this study by Ding et al. [17], 27 indicators related to social development, system coordination, and public satisfaction were utilized to establish the Human-Water Harmony Index (HWHI) grounded in the concept of harmony with its application to five megalopolises of China. Building upon this framework, Zuo et al. [18] determined the harmonious balance constraint and regulation by quantifying the equilibrium state of the human–water relationship of six criteria in 43 countries along the Belt and Road. Duan et al. [19] constructed a human–water-nexus-based evaluation system, in which 13 indicators of 8 sustainable development goals (i.e., SDGs 2, 6, 8, 9, 11, 12, 13, and 17) associated with water, society, and ecology criteria were analyzed. These studies evaluate human-water relationship by examining specific factors related to water resources within human systems, including water quantify, water quality, water use structure, and the dynamic balance between supply and demand. Unfortunately, they primarily focus on enhancing the health of water systems and promoting the sustainable development of human systems, while overlooking the harmonized development of the two [17,22]. The latter aspect is crucial for promoting the healthy, orderly, and sustainable development of both systems simultaneously.

Yellow River Basin (YRB) serves as a representative example of human–water interaction [23,24]. The basin's environment is significantly influenced by human activities, meanwhile, water resource scarcity emerges as a critical constraint for the socio-economic development of the region [25]. Nonetheless, a comprehensive analysis of the evolution of the human–water relationship in the YRB is hindered by the insufficient simulation on key process, vital variables, mutual feedback relationships, and a lack of comprehension regarding common mechanisms. Simultaneously, both domestically and internationally, there is a scarcity of research cases focusing on identifying the evolutionary mechanisms and assessing the external effects of the synergistic mechanism between water resources utilization and human activities in the large river basins [26]. To address these knowledge gaps, we selected 29 evaluation indicators to construct the Human–water harmony degree (*HWHD*) evaluation framework, encompassing three dimensions: healthy water systems, sustainable human systems, and synergy between human and water systems. Meanwhile, we combined the Entropy Weight method (EW) and Analytic Hierarchy Process (AHP) into one framework to determine every indicator's weight. According to the harmony theory, we employed the Single index quantification, multiple index synthesis, and poly-criteria integration (SMI-P) method to quantify the *HWHD*. Generally, we analyzed the intricate relationship between humans and water in YRB from 2002 to 2021 and explore their synergistic development from an integrated perspective. Hence, the systematic quantification of the dynamic evolving process of the *HWHD* in the YRB can serve as a scientific foundation for fostering ecological health and sustainable development within the YRB. Furthermore, it can facilitate to the development of earth system science in China through integrated basin research.

2. Methods

2.1. Calculation of Comprehensive Weight

As an objective weighting method, EW judges the degree of dispersion of the index through the information entropy of the index data, while it neglects the actual demand of decision-makers for indicators [27]. AHP judges the relative importance of each indicator according to the experience of decision makers, however, the evaluation results are prone to fluctuate due to subjective human factors [28]. It is desired an integrated EW-AHP method should be developed to overcome the above issues [29]:

$$w_i = \frac{\alpha_i \times \beta_i}{\sum\limits_{i=1}^n \alpha_i \times \beta_i} (i = 1, 2, \dots, n)$$
(1)

 w_i , α_i , and β_i are the comprehensive, subjective, and objective weights of the index *i*, respectively.

2.2. Calculation of HWHD

Here, we utilized the evaluation approach of SMI-P to assess the *HWHD* [30]. *HWHD* is further segmented into the three sub-harmony degrees (*SHD*), named healthy water systems (*HED*), sustainable human systems (*HAD*), and synergy between human and water systems (*DED*), respectively. The *SHD* of each indictor was determined based on the assumed fuzzy membership within the range of [0, 1] as shown in Figure 1 [19]. These *SHD* are detailed in the following calculated equations [31].

$$HED(T) = \sum_{i=1}^{n_1} w_i SHD_1(Y_1^i(T))$$
(2)

$$DED(T) = \sum_{i=1}^{n_1} w_i SHD_2(Y_2^i(T))$$
(3)

$$HAD(T) = \sum_{i=1}^{n_1} w_i SHD_3(Y_3^i(T))$$
(4)

where *T* and *n* indicate the time and number of indicator; $Y_n^i(T)$ shows the indicator value; w_i presents the indicator's weight; $SHD_{\alpha i}[Y^i(T)]$ indicates the sub-harmony degree; and HED(T), HED(T), and HAD(T) represent the sub-harmony of each criterion, respectively. Then, the final *HWHD* can be achieved as follows:

$$HWHD(T) = HED(T)^{\beta_1} \times DED(T)^{\beta_2} \times HAD(T)^{\beta_3}$$
(5)

where HWHD(T) is the final human–water harmony degree; β_1 , β_2 , and β_3 are the weights of each criteria, respectively; generally, the weights of each criteria are assumed as equal (i.e., 1/3). The harmony grading standards were based on the final *HWHD* and were equally segmented into five intervals from 0 to 1 [31].



Figure 1. Study framework.

3. Case Study

As the second longest river in China, YRB covers approximately 7950 hm². It constitutes 2.56% of the national total water resources, while sustains 12% of the population, irrigates 13% of farmland, and contributes 13% of food and 14% of GDP in China [27]. In 2021, the total population in YRB is 421 million, and the GDP is CNY 28,778.3 billion. However, the per capita water resources in this basin are 26,824 m³ per person, occupying about 1/4 of the world average level, which evolves into the biggest contradiction in the YRB. Due to the serious imbalance between social and economic development and natural hydrological process and ecosystem process, the YRB is one of the most prominent and complicated areas in China. It has become a national strategic plan to protect the ecological environment and promote the high-quality development of the YRB. Meanwhile, several national development plans were also published toward the harmonious human–water relationship. In detail, during the 14th Five-Year Plan, the water ecological environmental protection work should pay more attention to human–water harmony by the Ministry of Ecology and Environment of the people's Republic of China. In the year of 2024, opinions of thoroughly promoting the construction of Beautiful China were published by the CPC and State council, aiming at accelerating the modernization of harmonious coexistence between human and nature, especially for building the pilot zone for ecological protection and high-quality development of the YRB.

Thus, we built a comprehensive human–water harmony evaluation system to promote the implementation of national strategies. As shown in Figure 1, the constructed human–water harmony evaluation system encompasses three aspects: the evaluation indicators of *HWHD*, calculation of weights based on AHP and EW, and the spatio-temporal analysis of *HWHD* in the YRB from 2002 to 2021.

To reflect the prominent contradictions between human and water systems in nine provinces of YRB in the past two decades, we employed 29 indicators to construct a humanwater harmony evaluation system based on harmony theory, including three dimensions: healthy water systems, sustainable human systems, and synergy between human and water systems [21], as shown in Table 1. A healthy water system necessitates the preservation of ecological functions in rivers, lakes, groundwater, and other water sources, with robust selfrepair and renewal capabilities and resistance to shocks. Thus, we chose Water resources per capita, Water resources utilization rate, and Per capita COD emission to express the health conditions. Sustainable water systems require socio-economic development to be managed in a way that doesn't compromise life support on earth. Thus, indicators of Proportion of employees in the tertiary industry, Per capita disposable income of urban residents, and Per capita disposable income of rural residents were presented for development. Synergy between human and water systems mandates that water systems must provide necessary and robust support for human and social economic development. Meanwhile, humans are expected to continually safeguard the health of rivers and take proactive measures to transform the relationship between humans and water into a virtuous cycle. Therefore, the synergy indicators were chosen in terms of Water supply ratio of industry, Water supply ratio of domestic, and Water supply ratio of ecology.

Criterion Layer	Classification Layer	Indicator Layer	Unit	Criterion Attribute	Worst Value	Difference Value	Pass Value	Optimal Value	Optimal Value
Health degree of water system	Water resources subsystem	Water resources per capita	Person	Positive	130	1115	2100	2600	3100
		Water resources utilization rate	%	Negative	100	80	60	42	24
	Water environment subsystem	Waste water discharge per CNY 10,000 of industrial added value	Ton	Negative	80	53	26	20	14
		Per capita COD emission	Ton	Negative	0.04	0.03	0.02	0.011	0.002
	Water ecological subsystem	Green coverage rate of built-up area	%	Positive	29	32	35	40	45

Table 1. Evaluation indicator standard threshold.

Criterion Layer	Classification Layer	Indicator Layer	Unit	Criterion Attribute	Worst Value	Difference Value	Pass Value	Optimal Value	Optimal Value
	Social development subsystem	Natural population growth rate	‰	Negative	10	8	6	4	2
		Urbanization rate	%	Positive	37	43.5	50	65	80
		population density	Person/km ²	Negative	4000	2300	650	400	148
		Proportion of employees in the tertiary industry	%	Positive	20	34	48	59	70
		Engel's coefficient for urban residents	%	Negative	60	55	50	40	30
		Per capita disposable income of urban residents	Yuan	Positive	7700	16,350	25,000	62,500	100,000
		Per capita disposable income of rural residents	Yuan	Positive	2500	5650	8800	26,900	45,000
		Per capita grain yields	Kilogram	Positive	14	232	450	1225	2000
		Per capita comprehensive water consumption	m ³	Negative	800	610	420	290	160
-	Economic development Subsystem	Per capita GDP	Yuan	Positive	39,000	60,000	81,000	190,500	300,000
Development degree of human system		Per capita fiscal revenue	Yuan	Positive	3500	8750	14,000	19,500	25,000
		Per capita total social fixed asset investment	Yuan	Positive	17,000	68,500	120,000	1,060,000	2,000,000
		Proportion of output value of tertiary industry in GDP	%	Positive	20	32.5	45	57.5	70
		GDP growth rate	%	Positive	2	3.5	5	7	9
		Growth rate of output value of tertiary industry	%	Positive	7	9	11	12	13
	Science and technology development subsystem	Water consumption per CNY 10,000 of GDP	m ³	Negative	450	250	50	30	10
		Water consumption per CNY 10,000 of industrial added output	m ³	Negative	65	47	28	17	5
		Irrigation water per mu of farmland	Cubic meter	Negative	450	400	350	245	140
		Reuse rate of urban industrial water	%	Positive	22	55	88	93	98
		College students per 10,000 people	Person	Positive	32	181	330	415	500
Harmony degree of human water system	Water supply subsystem	Water supply ratio of Agriculture	%	Negative	91	77	63	46.5	30
		Water supply ratio of Industry	%	Positive	3	11.5	20	32.5	45
		Water supply ratio of Domestic	%	Positive	5	9	13	15	17
		Water supply ratio of Ecology	%	Positive	1	2.5	4	6	8

Table 1. Cont.

During the data processing, most data were obtained by the national statistical yearbooks. Some non-uniform data such as water resources per capita, proportion of output value of tertiary industry in GDP, and college students per 10,000 people were obtained by the statistical yearbooks of each province in the YRB. Several indicators such as per capita grain yields, urbanization rate, and irrigation water per mu of farmland were collected from Chinese economic and social big data research platform. A linear interpolation approach was also introduced to address the issue of missing data and fill in the continuous data from 2002 to 2021. All the source data are illustrated in this paper and are available from http://data.stats.gov.cn, https://data.cnki.net, (accessed on 30 December 2023), or the corresponding author upon reasonable request.

4. Results

4.1. Result of Weight

Weight is a parameter used to measure the contribution of each indicator to the system. The accuracy of the weights directly affects the accuracy of the evaluation results. There are many methods to determine weights, including subjective weight and objective weight. Subjective weight is determined by the evaluator's subjective understanding of the index, which is greatly influenced by the evaluator's subjective influences. Objective weight is determined by the objective law between the index data, which is greatly influenced by the original data of the index. In order to avoid the subjectivity and one-sidedness of a single method affecting the evaluation results, this paper adopts a comprehensive weight that uses multiple weights. Its subjective weight uses the analytic hierarchy process, its objective weight uses the entropy weight, and its comprehensive weight is used to synthesize the two weights [31]. Table 2 shows the subjective weights, objective weights, and comprehensive weights of each indicator in the nine provinces studied based on the EW-AHP method. Overall, the indicators with large subjective weights are the green coverage rate of built-up area, water resources utilization rate, and the waste water discharge per CNY 10,000 of industrial added value, which are 0.14, 0.11, and 0.10, respectively. The indicators with large objective weights are Water resources per capita and the water supply ratio of ecology, which are 0.18 and 0.07, respectively. According to the comprehensive weight calculation method which was introduced in 2.1, the comprehensive weights of the water supply ratio of ecology and the water resources per capita are relatively large: 0.22 and 0.17, respectively.

4.2. Temporal Variation of HWHD

Figure 2 illustrates the temporal trend of the *HWHD* in the YRB during 2002–2021. Our analysis reveals that although the *HWHD* of the nine provinces in the Yellow River basin has remained in Nearly complete disharmony or Complete disharmony (*HWHD* < 0.4) over the past 20 years, there has been an upward trend. By 2021, five provinces had transitioned from Complete disharmony ($0 \le HWHD \le 0.2$) to Nearly complete disharmony ($0.2 < HWHD \le 0.4$). Notably, provinces such as Shandong, Inner Mongolia, and Shaanxi exhibit substantial increases in *HWHD*, with variations of 0.18, 0.17, and 0.17, respectively. Conversely, upstream basin provinces like Sichuan and Ningxia experience mitigated increases, rising only by 0.10 and 0.12, respectively, from 2002 to 2021 (as shown in Figure 3). In addition, the *HWHD* in Ningxia is notably lower than that of other provinces, consistent with the findings of Shi et al. (2023) [21]. This can be attributed to Ningxia's lowest water resources per capita among all provinces, which holds the higher weight among all evaluation indicators. It's also related to the disparities in economic and technological development, geographic and climatic factors, as well as pertinent national or local regulations.



Figure 2. The temporal changes of *HWHD* across nine provinces in the YRB from 2002 to 2021.



Figure 3. Spatial distribution of *HWHD* across nine provinces for the mean of 2002 to 2021.

Table 2. Comprehensive weights of indicators in nine provinces.

Indicator Layer	Subjective Weight	Objective Weight	Comprehensive Weight	
Water resources per capita	0.0238	0.1859	0.1675	
Water resources utilization rate	0.1190	0.0037	0.0165	
Waste water discharge per CNY 10,000 of industrial added value	0.1071	0.0073	0.0296	
Per capita COD emission	0.0357	0.0135	0.0182	
Green coverage rate of built-up area	0.1429	0.0109	0.0588	

Indicator Layer	Subjective Weight	Objective Weight	Comprehensive Weight
Natural population growth rate	0.0039	0.0178	0.0026
Urbanization rate	0.0317	0.0216	0.0259
population density	0.0025	0.0339	0.0033
Proportion of employees in the tertiary industry	0.0051	0.0294	0.0057
Engel's coefficient for urban residents	0.0204	0.0139	0.0107
Per capita disposable income of urban residents	0.0089	0.0586	0.0197
Per capita disposable income of rural residents	0.0089	0.0634	0.0214
Per capita grain yields	0.0143	0.0550	0.0298
Per capita comprehensive water consumption	0.0470	0.0142	0.0252
Per capita GDP	0.0145	0.0536	0.0294
Per capita fiscal revenue	0.0243	0.0634	0.0584
Per capita total social fixed asset investment	0.0131	0.0674	0.0335
Proportion of output value of tertiary industry in GDP	0.0183	0.0288	0.0199
GDP growth rate	0.0504	0.0206	0.0392
Growth rate of output value of tertiary industry	0.0223	0.0033	0.0028
Water consumption per CNY 10,000 of GDP	0.0251	0.0047	0.0045
Water consumption per CNY 10,000 of industrial added output	0.0381	0.0047	0.0067
Irrigation water per mu of farmland	0.0089	0.0116	0.0039
Reuse rate of urban industrial water	0.0138	0.0135	0.0071
College students per 10,000 people	0.0570	0.0288	0.0621
Water supply ratio of agriculture	0.0168	0.0237	0.0151
Water supply ratio of industry	0.0079	0.0395	0.0117
Water supply ratio of domestic	0.0376	0.0348	0.0496
Water supply ratio of ecology	0.0805	0.0725	0.2209

Table 2. Cont.

4.3. Spatial Variation of HWHD

Figure 3 gives the spatial variation of HWHD in 2002, 2006, 2011, 2016, and 2021, along with the average HWHD over the past two decades. With the exception of 2012-2015, *HWHD* of Ningxia has always been lower than other provinces. However, since 2006, *HWHD* of Ningxia has been significantly improved. It mainly due to the influence of economy, science and technology, and the per capita GDP and per capita financial revenue have notably improved. The water consumption per CNY 10,000 of GDP and growth rate of output value of tertiary industry decreased significantly. Over the past two decades, HWHD has notably improved in most of provinces, particularly in Shandong Province. Thanks to the increase in available water resources and the decrease in water consumption, the water resources utilization rate in Shandong province has decreased year by year. Consequently, its *HWHD* increased gradually, and the *HWHD* value reached 0.21 after 2020. In contrast, given the considerably lower value of the water supply ratio of ecology in Sichuan, which acts as the direct driving index of HWHD, coupled with its slow growth rate, the overall HWHD growth rate in the region is relatively sluggish. As a result, by 2020, Sichuan ranks as the third lowest in HWHD after Ningxia and Gansu. Additionally, we observed that the *HWHD* in downstream areas is generally higher than that in upstream areas, but this gap between upstream and downstream has been diminishing in recent years.

4.4. The Evaluation Results of Three Subsystems

The evaluated results in the three sub-criterion, healthy water systems (*HED*), sustainable human systems (*HAD*), and synergy between human and water systems (*DED*), are depicted in Figure 4. Overall, the harmony degrees of each subsystem across the nine provinces improved from 2002 to 2021. Furthermore, the harmony degrees of each subsystem varied among the provinces. For instance, the *HED* in the nine provinces exhibited less fluctuation and maintained consistent increments from 2002 to 2021. Among these provinces, Inner Mongolia demonstrated the highest growth range, rising from 0.10 to 0.27, with a notable increase observed in 2013. This surge can be attributed to a significant reduction in Water resources utilization rate in the same year. Meanwhile, the *HED* of Sichuan showed a fluctuating upward trend due to changes in the total amount of water resources- and utilization rate.



Figure 4. The four dimensions of HWHD across the nine provinces in YRB from 2002 to 2021.

The *DED* of nine provinces also maintained upward trends from 2002 to 2021. Notably, these provinces in downstream, such as Inner Mongolia, exhibited the highest incremental change, reaching 0.15. This change is primarily associated with societal, economic, and scientific developments. Specifically, Inner Mongolia's per capita disposable income of urban residents, Green coverage rate of built—up area, and water consumption per CNY 10,000 of industrial added value increased from 0 (Complete disharmony) to 0.7 (Fair harmony), 0.8 (Complete harmony), and 0.8 (Complete harmony), respectively. Moreover, the *DED* of Inner Mongolia experienced Flat growth during 2002–2021, attributed to a series of pragmatic and effective policy measures that enhanced the potential of industrial production and improved market supply–demand relationships.

The *HAD* of Henan experienced significant growth over the past 20 years, with a substantial increase observed from 2013 to 2017. This notable rise can be attributed to the considerable increase in indicators such as domestic water supply and ecological water supply during this period. Specifically, the supplied water resources increased by 6.8×10^8 m³ and 13.7×10^8 m³, respectively. The harmony degree associated with water supply ratio of domestic and water supply ratio of ecology increased from 0.6 (Fair harmony) to 1 (Complete harmony) and from 0.3 (Nearly complete disharmony) to 1 (Complete harmony), respectively. These improvements may result from the "Most Stringent Water Resource Management System" in 2013 was put into practice, leading to adjustments in total water utilization and irrigated water.

5. Discussion

Upon quantifying the harmony between humans and water in nine provinces of the YRB, our findings underscore the decisive role of the government's active guidance and

investment in enhancing the living environment. For example, the *HWHD* value of Qinghai from 2011 to 2015 was notably lower than its overall change trend, reflecting extreme incoordination issues between the water system and the human system during this period. During this period, Qinghai Province actively increased its number of and investment in agricultural water conservancy projects in large and medium—sized irrigation areas, while vigorously expanding its area of efficient water—saving irrigation. Consequently, its proportion of the agricultural water supply decreased from an average of 80% during the 12th Five—Year Plan period (2011–2015) to less than 75.38% in 2016. As a result, the *HWHD* increased from an average of 0.09 to more than 0.18 after 2016.

Currently, the YRB faces prominent issues such as ecological fragility, water shortage, and weak resources carrying capacity. These issues interact with each other, becoming key restrictions for achieving the national development goals. Thus, it is of great significance to break the boundaries of single factors and single fields, and build a multi-dimensional, multi-objective and multi-system collaborative governance from the perspective of whole basin system. Moreover, water resources are the core factor restricting the protection and development of the YRB. The rigid constraints of water resources should be further implemented, especially for increasing the ecological water rationing in the upstream and adopting the water right replacement in the middle and downstream. Future studies should insist on using water to determine the city, land, people, and production, and improve the promote the intensive and economical water resources utilization.

6. Conclusions and Limitations

To learn about the human–water relationship in large river basins, we studied the changes in the *HWHD* in the YRB over the past two decades. We mainly considered 29 evaluation indicators, encompassing healthy water systems, sustainable human systems, and synergy between human and water systems in the YRB to construct an evaluation framework for human–water harmony. We analyzed the evolution trend of the overall *HWHD* and the above three sub–criterion in nine provinces of the YRB during 2002–2021. The results showed that there was a consistent increase in the *HWHD* across all provinces along the YRB in the last 20 years. Particularly noteworthy is the substantial growth in the *HWHD* observed in downstream provinces like Shanxi, Henan, and Shandong, exceeding 0.20 (Nearly complete disharmony) in 2021. In contrast, upstream provinces such as Ningxia have shown slower growth, at 0.11, resulting in this province having the lowest *HWHD* by 2021, at 0.12 (Complete disharmony).

Our results disclosed that the *HWHD* of the nine provinces showed a consistent increase during the past two decades; these findings provided valuable strategies for dealing with the future human–water relationship in the YRB. However, limitations need to be further considered in the future evaluation works. Due to data limitations, our analysis focused solely on the harmonious relationship between humans and water of nine provinces in the YRB, overlooking regional differences within provinces. Future studies could refine the research to the county scale or even the grid scale with sufficient survey data. This would enable the exploration of spatial differences and correlations of human–water harmony from upstream to downstream of large river basins, considering factors such as nature, climate, geographical conditions, and regional trade.

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