



Article

# Assessment of the Sustainable Utilization Level of Water Resources in the Wuhan Metropolitan Area Based on a Three-Dimensional Water Ecological Footprint Model

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Abstract: The shortage and overexploitation of water resources restrict the sustainable development

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of metropolitan areas. To evaluate the sustainable utilization level of water resources, we identified the occupancy of natural capital stock and the consumption of natural capital flow by water resources consumption and analyzed the factors influencing water resources consumption in metropolitan area development. We took the Wuhan Metropolitan Area in China from 2010 to 2019 as the research object and introduced footprint depth and size, the water ecological footprint (WEF) model was expanded into the three-dimensional WEF model. Based on this model, an evaluation system for the sustainable utilization level of water resources was constructed with five indices-water ecological deficit, water ecological surplus, water ecological pressure, WEF depth, and WEF size. Finally, the driving factors of WEF change were analyzed using the Logarithmic Mean Divisia Index. The evaluation of the sustainable utilization level of water resources showed that the Wuhan Metropolitan Area as a whole experienced water ecological surplus from 2010 to 2019, but there were different degrees of water ecological deficit in its inner urban areas, and the most serious cumulative deficit was 5.02 ha/cap in Ezhou. In 2011 and 2019, the sustainable utilization level of water resources in the metropolitan area reached a relatively unsustainable state. Xianning was the urban area with the most sustainable utilization level of water resources. During the study period, the metropolitan area did not occupy the natural capital stock of water resources, and the natural capital flow of water resources in the inner urban areas could meet the demand of the current consumption of the region in 2010 and 2016. The analysis of the driving factors of WEF change showed that economic development effect and population pressure effect had a positive driving effect on WEF change, while WEF intensity effect and water resources carrying capacity effect had the opposite effect. Finally, according to the research results, it can be seen that improving the efficiency of water resources utilization, protecting the natural capital stock of water resources, realizing differentiated

regional development through the market economy and developing water policy can be helpful to

**Keywords:** three-dimensional water ecological footprint model; sustainable utilization level of water resources; LMDI; Wuhan Metropolitan Area

improve the level of sustainable water resources utilization.

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#### 1. Introduction

Water, as the vital natural resource, plays a critical supporting role in the development of human society and the maintenance of ecosystem [1–4]. Currently, coping with the shortage and overexploitation of water resources has become a global challenge [5–8]. Rapid urbanization has increased the demand of human society for water resources and its related ecosystem services [9–13] and further increases this challenge. Metropolitan areas, as regional units which generally exist in developed nations and participate in global competition and international division of labor [14–18], are the most concentrated areas of human activities. So, the sustainable utilization of water resources in such areas needs thorough specific attention.

The ecological footprint model, proposed by Rees and Wackernagel [19–22], reveals the relationship between ecological carrying capacity and the consumption of natural resources based on the concept of carrying capacity. The model has been widely used to evaluate the sustainability of human society by unifying measures of different types of natural resources [23,24]. Subsequently, scholars constructed the water ecological footprint (WEF) model based on the concept of ecological footprint, used the land area to represent water resources consumption and regional water resources supply capacity (i.e., the total amount of water resources within the region, consisting of precipitation and the reserves of surface water and groundwater), namely, WEF, and water ecological carrying capacity (WECC), respectively [25]. Meanwhile, the evaluation of the sustainable utilization level of water resources based on WEF is gradually emerging. For instance, Wang et al. calculated the per capita WEF and WECC and analyzed the water resources ecological pressure index to assess the sustainable utilization level of water resources in Hubei, China [25]. Li et al. comprehensively evaluated the utilization of water resources and the spatial and temporal evolution of WEF and WECC in the lower Yellow River [26]. Su et al. calculated WEF and WECC of four urban areas in China and suggested that adjusting industrial structure and repairing the inequality of water resources can promote the sustainable development of social economy [27]. As a kind of natural capital, water has two attributes of stock and flow of natural capital [28]. In the event that the capital stock of water resources is occupied, a series of serious consequences will restrict the sustainable development of human beings, such as the depletion of water resources and the decline of groundwater levels [29-32]. However, it should be noted that existing studies did not consider the occupation of natural capital stock (NCS) and the consumption of natural capital flow (NCF) by WEF.

If NCF cannot meet the demand of consumption, this would threaten sustainable development [17]. Ecological economics has reached a consensus that increasing sustainable development as far as possible could prevent a decrease in NCS [33]. To solve this problem, Niccolucci et al. [34,35] introduced footprint size and footprint depth to the ecological footprint model to reflect the occupation of NCS and NCF consumption, respectively. Subsequently, NCS and NCF were included in the assessment of regional sustainable development. Therefore, to identify the occupation of NCS and the consumption of NCF by WEF, we need to expand the WEF model into a three-dimensional model.

China is a country with uneven distribution of water resources [36–38], and water shortage is one of the major constraints to the development of many Chinese urban areas [39,40]. To this end, the Chinese government has issued a series of regulations on water management, development and protection, such as the Groundwater Management Regulation issued on September 15, 2021 [41]. Therefore, factors influencing the change in WEF need to be identified. Decomposition analysis is used to quantify changes with time for a wide range of variables [42], and the method mainly consists of the Laspeyres Index [43,44], the Adaptive Weighting Divisia Index [45] and the Logarithmic Mean Divisia Index (LMDI) [46]. The LMDI can effectively solve the residual term, zero data and negative value problem, and is widely applied in the analysis of factors influencing water footprint [47], ecological footprint [48], carbon footprint [49], etc.

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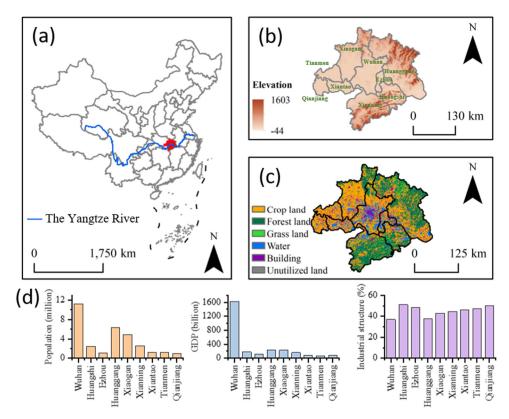
Therefore, we took the Wuhan Metropolitan Area, a typical metropolitan area in central China, as the research object to achieve the following research aims: (1) construct a three-dimensional WEF model; (2) construct an evaluation index system for the regional sustainable utilization level of water resources based on the model; (3) analyze the factors influencing the change in WEF using the LMDI. This research would help to improve and supplement the theoretical system of sustainable water resources development by constructing a three-dimensional WEF model and introducing two indicators of NCF and NCS [25–27]. In addition, we provide references for government policies and plans in the metropolitan area development, water resources allocation and dispatching and industrial structure adjustment by analyzing the contribution of WEF intensity, economic development, population pressure and WECC to the change in WEF based on LMDI.

#### 2. Materials and Methods

## 2.1. Study Area and Data Sources

The Wuhan Metropolitan Area is located in central China, in eastern Hubei province—situated in the middle reach of the Yangtze River (Figure 1a), with Wuhan as the urban center, surrounded by Huangshi, Ezhou, Xiaogan, Huanggang, Xianning, Xiantao, Tianmen, and Qianjiang, a regional economic union composed of eight urban areas (Figure 1b). It is a national resources-saving and environmentally-friendly society and a comprehensive construction reform pilot area. The metropolitan area is also an important engine driving the rise of central China and one of the key relay points for the coordinated development of east, central and west China, with the Yangtze River Basin Economic Belt as the axis. The total land area of the study area is  $5.81 \times 10^4$  km<sup>2</sup>, and the terrain is generally high in the north, northeast and south, and gradually decreases to the west and central areas (Figure 1b). Landforms are diverse, with plains (including hills) accounting for approximately 50% of the total area, hills for approximately 30%, and mountains (middle and low mountains) for 20% (Figure 1b). The regional water system is developed (Figure 1c), and there are numerous rivers and lakes—the total amount of freshwater resources is  $333.06 \times 10^8$  m<sup>3</sup>. Its water resources are not evenly distributed in time and space. The metropolitan is imbalanced in terms of socio-economic development (Figure 1d). At the end of 2019, the resident population was 31.90 million, the Gross Domestic Product (GDP) was 2.77 trillion ¥ and secondary industry accounted for 40.17%.

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**Figure 1.** Overview of the Wuhan Metropolitan Area. (a) Relative location of the Wuhan Metropolitan Area; (b) the terrain and 9 urban areas and prefectures in the Wuhan Metropolitan Area; (c) land use in the Wuhan Metropolitan Area in 2020; (d) the population, GDP and industrial structure (the proportion of secondary industry) of the Wuhan Metropolitan Area in 2019.

Data on GDP and population are all obtained from Hubei Statistical Yearbooks (2011–2020) and water-related data are all from the Hubei Water Resources Bulletin (2011–2020). Data on topography and land use are from the Resource and Environment Science and Data Center (https://www.resdc.cn/)(accessed on 1 November. 2021).

## 2.2. Construction of a Three-Dimensional Water Ecological Footprint Model

Ecological footprint depth represents the portion that exceeds the range of the ecological carrying capacity and could be expressed as follows: How many hectares of land are needed to provide sufficient resources to meet the consumption requirement of humans on per unit land? How many years are needed to regenerate the resources that humans will consume in the current year [50]? The value of ecological footprint depth is between  $[1, +\infty)$ , and when it is greater, the amount of capital consumed is greater. The ecological footprint size is the size of the capital flow within the limited ecological carrying capacity, and when it is greater, the region is more sustainable.

We refer to the definition above to expand the existing WEF model into a three-dimensional model. The calculation is as follows:

$$WEF_{depth} = 1 + \max(WEF - WECC, 0) / WECC$$
 (1)

$$WEF_{size} = min (WEF, WECC)$$
 (2)

$$WEF = WEF_{depth} \cdot WEF_{size}$$
 (3)

where the WEF<sub>depth</sub> and the WEF<sub>size</sub> are the regional WEF depth and size, respectively. When the WEF<sub>depth</sub> is greater than 1, the NCS is used.

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The WEF model includes WECC and WEF, which reflect the supply and consumption of regional water resources. In this paper, WEF is defined as the area of water resources land occupied by humans that can continuously provide resources. WEF includes three types: production WEF (PWEF), domestic WEF (DWEF) and ecological WEF (EWEF). The calculation is as follows:

WEF 
$$= PWEF + DWEF + EWEF = N \cdot wef$$
 (4)

PWEF = 
$$N \cdot pwef = a \cdot Q_{p/P}$$
 (5)

DWEF = 
$$N \cdot dwef = a \cdot Q_{d/}P$$
 (6)

EWEF = 
$$N \cdot \text{ewef} = a \cdot Q_{e/P}$$
 (7)

where N is the population, a is the global equilibrium factor of water resources, and P ( $m^3$ /ha) is the global average productivity of water resources. WEF, PWEF, DWEF and EWEF are the per capita WEF (ha/cap), PWEF (ha/cap), DWEF (ha/cap) and EWEF (ha/cap), respectively.  $Q_P$  ( $m^3$ ),  $Q_d$  ( $m^3$ ) and  $Q_e$  ( $m^3$ ) represent the regional water consumption of production, domestic and ecological, respectively.

WECC represents the water resources supply ability that could sustainably support the development of resources, the ecosystem, and society under certain management conditions and development stages. The calculation is as follows:

$$WECC = N \cdot wecc = \alpha \cdot \phi \cdot a \cdot Q/P \tag{8}$$

where  $\alpha$  is the biodiversity compensation coefficient [25] (the proportion of resources remaining after deducting water resources for maintaining water ecological environmental quality and biodiversity to total water resources), and  $\varphi$  is the water production factor [51]. The parameters required for the above calculations are presented in Appendix A Table A1.

### 2.3. Indicators Used to Assess Water Resources' Sustainable Utilization level

In this paper, water ecological deficit (WED) and surplus (WES), the water pressure index (WPI), WEF<sub>depth</sub> and WEF<sub>size</sub> are used to assess water resources' sustainable utilization level.

## 2.3.1. Water Ecological Deficit and Surplus

In terms of deficit and surplus [21,22,52], the WED is referred to as the water capacity of water consumption activities that consume more water resources than natural capital and lead to an imbalance in water load, and the WES is referred to as the scenario in which human activities consume water resources but remain within WECC. The WED and WES can be used to quantify the water resources' sustainable utilization level of a region and is the difference between WECC and WEF. When the difference is negative, it is the WED. If not, it is the WES.

### 2.3.2. Water Pressure Index and the Sustainable Utilization Level of Water Resources

The WPI is the "threat state" of WEF to WECC and refers to the degree of water consumption activities with the water resources and the water resources' sustainable utilization level. The indicator could be calculated as follows [53]:

$$WPI = \frac{WEF}{WECC}$$
 (9)

If WPI is between 0 and 1, the supply of water resources exceeds the demand, and WEF is within the reasonable range. If WPI = 1, the supply and demand are balanced. If WPI > 1, the demand is greater than the supply and WECC is in an unsustainable state (Table 1).

**Table 1.** The level of water resources' sustainable utilization based on the WPI value (refer to [54]).

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| Level of Water Resources' Sustainable<br>Utilization | WPI         | Representation State     |
|--|-------------|--------------------------|
| 1  | < 0.50      | Very sustainable         |
| 2  | 0.5 - 0.8   | Relatively sustainable   |
| 3  | 0.81 - 1.00 | Relatively unsustainable |
| 4  | 1.01-1.50   | Quite unsustainable      |
| 5  | 1.51-2.00   | Very unsustainable       |
| 6  | >2.00       | Completely unsustainable |

Very sustainable means water resources consumption is within the supply of water resources, and consumption will not lead to water depletion. Completely unsustainable means the consumption of water resources exceeds the supply and also threatens regional ecological environmental quality and biodiversity.

# 2.3.3. Water Ecological Footprint Depth and Size

When the consumption rates of water resources are faster than the regeneration rates, the resources inventory may be depleted. Technological progress could reduce the WED by improving the existing WECC, i.e., by building the water storage facilities. However, technological progress does not compensate for the fact that resources are scarce [14]. Therefore, it is necessary to evaluate the utilization level of NCS and NCF by water resources consumption through a three-dimensional WEF model.

# 2.4. Driving Factors of Water Ecological Footprint Change

The LMDI is selected to identify factors influencing the change in WEF. These factors are divided into four effects in the paper—WEF intensity (WEFI) effect, the economic development (ED) effect, the population pressure (PP) effect and the WECC effect. The calculation is as follows:

$$WEF^{t} = \frac{WEF}{GDP} \cdot \frac{GDP}{POP} \cdot \frac{POP}{WECC} \cdot WECC$$
 (10)

$$\Delta WEFI = \sum_{i} \left( \frac{WEF^{t} - WEF^{0}}{lnWEF^{t} - lnWEF^{0}} \right) \times ln \frac{WEFI^{t}}{WEFI^{0}}$$
(11)

$$\Delta ED = \sum_{i} \left( \frac{WEF^{t} - WEF^{0}}{lnWEF^{t} - lnWEF^{0}} \right) \times ln \frac{ED^{t}}{ED^{0}}$$
 (12)

$$\Delta PP = \sum_{i} \left( \frac{WEF^{t} - WEF^{0}}{lnWEF^{t} - lnWEF^{0}} \right) \times ln \frac{PP^{t}}{PP^{0}}$$
(13)

$$\Delta WECC = \sum_{i} \left( \frac{WEF^{t} - WEF^{0}}{lnWEF^{t} - lnWEF^{0}} \right) \times ln \frac{WECC^{t}}{WECC^{0}}$$
(14)

where t is the year. WEFI =  $\frac{\text{WEF}}{\text{GDP}}$  represents WEFI, ED =  $\frac{\text{GDP}}{\text{POP}}$  represents the ED, and PP =  $\frac{\text{PP}}{\text{WECC}}$  represents the PP and means the population pressure on WECC. WEF<sup>0</sup> is defined as the base-period WEF, WEF<sup>t</sup> is the end-stage WEF, and  $\triangle$ WEF represents the change in WEF from base-period to end-stage. Therefore, the change in WEF can be expressed as:

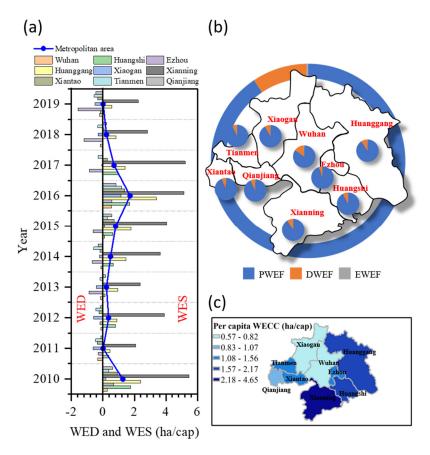
$$\Delta WEF = WEF^{t} - WEF^{0} = \Delta WEFI + \Delta ED + \Delta PP + \Delta WECC$$
 (15)

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#### 3. Results

## 3.1. Per Capita Water Ecological Deficit and Surplus

The per capita WEF, per capita WECC, per capita WED and WES of the Wuhan Metropolitan Area from 2010 to 2019 were calculated according to Equations (4) and (8) (Figure 2). For the Wuhan Metropolitan Area, the per capita WEF was always within the range of the per capita WECC and there was no deficit (Figure 2a). In 2016, per capita WES was the highest during the period 2010–2019. This is because the range in the per capita WEF was small, and 2016 was a wet season in the metropolitan area, resulting in sufficient water resources supply (Appendix A Table A2). However, per capita WED and WES of urban areas within the metropolitan area was quite different. The cumulative WED of Ezhou was highest at 5.02 ha/cap from 2010 to 2019, which indicated that Ezhou had the highest per capita WEF (Appendix A Table A3) in the metropolitan area with a smaller WECC (Figure 2c). Xianning and Huanggang had no WED, and Huangshi, with a higher WECC, only had a deficit in 2019. Overall, the sustainable utilization level of regional water resources is more affected by WECC and leads to regional differences. However, to realize the sustainable utilization of water resources and sustainable development of the social economy, it needs to be carried out within the scope of WECC. Therefore, the composition of WEF needs to be further analyzed.



**Figure 2.** Per capita water ecological deficits (WED) and surplus (WES), and composition of water ecological footprint (WEF) and per capita water ecological carrying capacity (WECC) of the Wuhan Metropolitan Area. (a) Dynamics of WED and WES. (b) The average composition of WEF during the period 2010~2019. PWEF, DWEF and EWEF are the production WEF, the domestic WEF and the ecological WEF, respectively. (c) Per capita WECC during the period 2010~2019 (cumulative WECC/cumulative population).

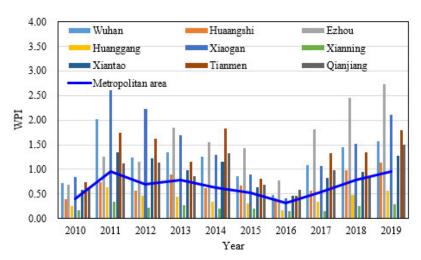
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PWEF was the chief component of WEF of the Wuhan Metropolitan Area and its inner urban areas (Figure 2b). Among the nine urban areas, Wuhan had the smallest proportion of PWEF in WEF, and also had the smallest per capita WEF and PWEF (Appendix A Tables A3 and A4). This is because although Wuhan had the highest GDP, its low proportion of secondary industry inhibited the growth of WEF (Figure 1d). However, the emergence of its WED emphasizes that it still needs to further improve the efficiency of water resources utilization.

At the same time, the spatial distribution of the per capita WECC was mainly concentrated in the southeast of the metropolitan area. For urban areas without WED, the industrial scale could be appropriately increased to develop GDP, but it still needs to be carried out within the scope of WECC and improve the utilization efficiency of water resources.

#### 3.2. Water Resources' Sustainable Utilization Level Assessment

Equation (9) was used to calculate the WPI of the Wuhan Metropolitan Area from 2010 to 2019 (Figure 3).



**Figure 3.** Changes in the water pressure index (WPI) in the Wuhan Metropolitan Area from 2010 to 2019.

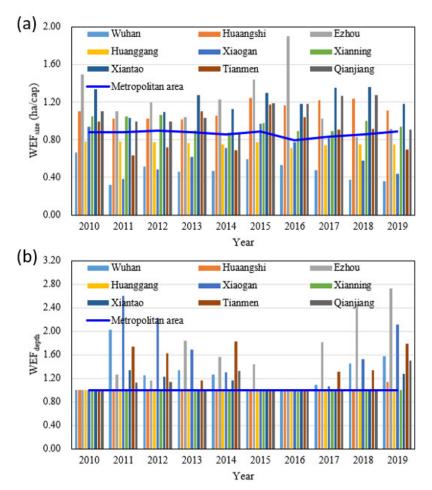
The WPI of the metropolitan area fluctuated between 0.31 and 0.96 from 2010 to 2019, and the WPI was always lower than 1. In 2011 and 2019, the WPI was the highest at 0.96 and was the lowest in 2016 at 0.31. The level of water resources' sustainable utilization reached level 3 (relatively unsustainable) in 2011 and 2019, it was in the state of relatively sustainable in the periods 2012–2015 and 2017–2018, and the state of very sustainable in 2010 and 2016. When WECC was smaller, the grade of water resources' sustainable utilization level was higher. However, overall, the metropolitan area was still in the state of sustainable development of water resources consumption.

In terms of the inner urban areas of the metropolitan area, the WPI of each urban were showed the same dynamics and there was a significant difference between those urban areas. The WPI of Huanggang and Xianning was always lower than 0.5, and it was always the lowest in Xianning. During the period 2010–2012, the WPI in Xiaogan was the highest; and in 2011 and 2012, Xiaogan was in the state of completely unsustainable. Excluding 2014, the WPI in Ezhou was the highest.

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## 3.3. Natural Capital Occupation Analysis

WEF<sub>size</sub> and WEF<sub>depth</sub> reflect the NCS occupation and NCF consumption by WEF, respectively, and the result is shown in Figure 4. In terms of the Wuhan Metropolitan Area, WEF<sub>size</sub> did not substantially change and only fluctuated around 0.87 (ha/cap) and WEF<sub>depth</sub> was always 1 from 2010 to 2019. Thus, the NCF is used first, the NCS is not occupied and the supply capacity of water resources is unaffected.



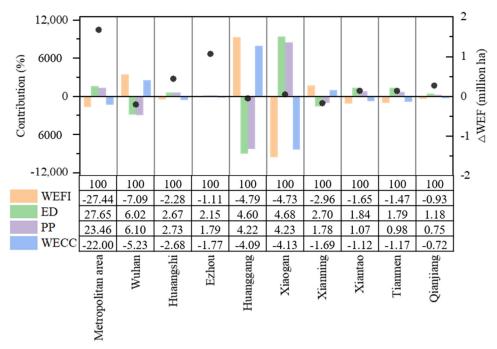
**Figure 4.** Water ecological footprint size (**a**, WEF<sub>size</sub>) and depth (**b**, WEF<sub>depth</sub>) of the Wuhan Metropolitan Area during the period 2010–2019.

However, in terms of inner urban areas in the metropolitan area, WEF<sub>size</sub> of Ezhou was the highest during the periods 2010–2012 and 2014–2016, and excluded 2010 and 2016, WEF<sub>depth</sub> of Ezhou was greater than 1. In 2019, WEF<sub>depth</sub> was the highest and reached 2.73, suggesting that 2.73-fold the current area was required to support the water resources consumption of Ezhou. In terms of the urban areas which consumed water resources NCF and occupied water resources NCS, water resources utilization was unsustainable. The reason is that the supply of NCF would decrease over the following year, and reduce WECC by the accumulative nature of WED [10]. Adverse effects on local water environment, such as aquifer depletion [31,32], are caused. Therefore, these urban areas must develop their industries within the scope of region's WECC, and determine the scale of industries and urban areas by setting production and people based on WECC.

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## 3.4. Factors Influencing Water Ecological Footprint Change

Considering that WEF is more easily affected by human production and management activities. In this paper, WEF increment of the Wuhan Metropolitan Area in China from 2010 to 2019 was decomposed into four effects—WEFI effect, ED effect, PP effect and WECC effect (Figure 5). The change in their values is shown in Appendix A Tables A5—A8. Both ED and PP were effects that lead to the increase in WEF of the metropolitan area and nine urban areas within it, while WEFI effect and WECC effect had the opposite effect.



**Figure 5.** Decomposition results of factors affecting water ecological footprint change ( $\triangle$ WEF) in the Wuhan Metropolitan Area from 2010 to 2019.

In terms of the metropolitan area, WEF increased by 1.67 million ha from 2010 to 2019, ED effect was the main effect of WEF and resulted in an increased WEF of 27.65 million ha. On the contrary, WEFI effect was the chief negative effect that inhibited the increase in WEF. This is consistent with previous research conclusions [47,55]. Meanwhile, we found that PP effect had a positive effect on the increase in WEF, which was second only to ED effect. This is because the increase in population not only reduces WECC by occupying wetlands through urban expansion [56,57] but improves WEF by expanding the industrial scale, thus showing a positive driving effect on the change in WEF. However, WECC effect inhibited the change in WEF, which may be because the reduction in WECC forces water-consuming industries to improve the utilization efficiency of water resources and reduce the consumption of water resources, that is, to use WECC to limit the industrial scale.

In terms of the inner urban areas of the metropolitan area, the contribution of the four effects to the change in WEF was significantly different, but the relative relationship between each effect and WEF change was consistent with that of the metropolitan area.

# 4. Discussion

The three-dimensional WEF model was constructed in this paper and was incorporated into the evaluation system of the sustainable utilization level of water resources. The advantage of this model is that it can quantitatively analyze the utilization of water resources capital by human activities, which is an important topic in the quantitative field of sustainable development [58,59]. Wang et al. believed that the sustainability of regional development was related to time variables, so they used Arima to predict the ecological footprint [54]. However,

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Yang et al. believed that human activity occupation of NCS will reduce the NCF in the next year, thus restricting the sustainability of human development [14]. This paper also reached a similar conclusion that a significant increase in WECC could reduce WEFsize, thereby increasing NCF and supplementing historical WED. Different from the ecological footprint, the range in WECC is greater than that of WEF. Therefore, it is emphasized that human activities should be constrained by the multi-year average of WECC to avoid the accumulation of WED and enhance the sustainability of water resources utilization. Meanwhile, we believe that the three-dimensional WEF model could be more widely applied in Central Asia and Africa, where water resources are scarce [60,61].

# 5. Conclusions and Implications

### 5.1. Conclusions

To identify the occupancy of natural capital stock and the consumption of natural capital flow by water resources consumption in the Wuhan Metropolitan Area, we extended the water ecological footprint model into a three-dimensional water ecological footprint model. By analyzing the relationship between the supply and demand of water resources in the metropolitan area and its inner urban areas, the sustainable utilization level of water resources was evaluated, and the stock occupancy and flow consumption of natural capital were integrated into the evaluation system of the sustainable utilization level of water resources. The three-dimensional water ecological footprint model provided a new perspective for the assessment of sustainable utilization level of water resources.

- 1. During the period 2010–2019, the change in water ecological carrying capacity was larger than water ecological footprint, and there was no water ecological deficit in the Wuhan Metropolitan Area. Water ecological deficit and surplus were different for inner urban areas of the metropolitan area, Ezhou had the highest cumulative water ecological deficit with 5.02 ha/cap. Water ecological footprint of production was the main component of the water ecological footprint of the metropolitan area. The spatial distribution of per capita water ecological carrying capacity was mainly concentrated in the southeast of the metropolitan area. In general, although there was no water ecological deficit in the metropolitan area, there were great differences in water ecological footprint and water ecological carrying capacity of the inner urban areas, leading to different degrees of deficit.
- 2. The level of water resources' sustainable utilization level in the Wuhan Metropolitan Area was relatively unsustainable in 2011 and 2019. Xianning was the most sustainable urban area in terms of water resources utilization among the nine urban areas within the metropolitan area. In the periods 2011–2012 and 2018–2019, the sustainable utilization level of water resources in some urban areas was in the state of completely unsustainable.
- 3. Regarding the natural capital flow consumption and the natural capital stock occupancy in the Wuhan Metropolitan Area, there was never occupancy of natural capital stock. In the periods 2011–2015 and 2017–2019, there were always some urban areas occupying on natural capital stock, and Ezhou was always one of them. This indicates that the natural capital flow cannot meet the water resources consumption demand, and that the high occupation of the natural capital stock would seriously hinder the recovery of water ecological carrying capacity.
- 4. The factors affecting the change in water ecological footprint were divided into four effects— water ecological footprint intensity effect, economic development effect, population pressure effect and water ecological carrying capacity effect—and the relative contribution of each effect was determined using the Logarithmic Mean Divisia Index. Economic growth effect and population pressure effect had a positive driving effect on the change in water ecological footprint, while the intensity effect of water ecological footprint and water ecological carrying capacity effect had the opposite effect.

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## 5.2. Implications

This paper suggests that the local government should strengthen control of water resources consumption in the production sector, and take the annual average water ecological carrying capacity of the region as the upper limit of production, living and ecological water consumption in the region. Therefore, the metropolitan area should be encouraged to eliminate or upgrade systems with low water resources utilization efficiency; apply strict restrictions at the industrial scale, the population scale and the city scale based on water resources supply capacity; and improve water efficiency.

Second, the protection of water sources should be strengthened, the scale of urban expansion should be carefully planned, and the natural capital flow of water resources in the dry season should be ensured to meet the production, living and ecological needs of the region. Further, the occupation of natural capital stock of water resources should be reduced.

Thirdly, it is suggested that based on the market economy, methods such as water ecological compensation could be used to restrain the consumption of water resources and realize the allocation of water resources in areas with high water consumption and promote differentiated regional development models and water policy.

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# Appendix A

**Table A1.** Related parameters of the calculation of water ecological footprint and water ecological carrying capacity.

| Item   | Value      | Reference |
|--|------------|-----------|
| global equilibrium factor of water resources (a)   | 5.19       | [26]      |
| global average productivity of water resources (P) | 3140 m³/ha | [62]      |
| biodiversity compensation coefficient ( $\alpha$ ) | 0.4        | [25]      |
| water production factor (φ)                        | 1.79       | [63]      |

**Table A2.** Dynamics of water ecological footprint (WEF, ha) and water ecological carrying capacity (WECC) of the Wuhan Metropolitan Area from 2010 to 2019.

|      | WEF           | WECC          |
|------|---------------|---------------|
| 2010 | 26,622,716.56 | 65,444,575.06 |
| 2011 | 26,911,968.15 | 28,028,210.87 |
| 2012 | 27,421,050.96 | 39,104,667.88 |
| 2013 | 27,078,907.64 | 34,588,307.40 |
| 2014 | 26,397,926.75 | 42,019,213.21 |
|      |               |               |

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| 2015 | 27,733,442.68 | 53,443,993.93 |
|------|---------------|---------------|
| 2016 | 24,971,503.18 | 79,759,020.84 |
| 2017 | 26,330,159.24 | 49,233,305.27 |
| 2018 | 27,202,872.61 | 35,025,489.20 |
| 2019 | 28,297,070.06 | 29,369,375.63 |

**Table A3.** Dynamics of per capita water ecological footprint (WEF, ha/cap) of each urban area within the Wuhan Metropolitan Area from 2010 to 2019.

|      | Wuhan | Huangshi | Ezhou | Huanggang | Xiaogan | Xianning | Xiantao | Tianmen | Qianjiang |
|------|-------|----------|-------|-----------|---------|----------|---------|---------|-----------|
| 2010 | 0.66  | 1.10     | 1.49  | 0.78      | 0.93    | 1.04     | 1.33    | 0.99    | 1.10      |
| 2011 | 0.65  | 1.02     | 1.40  | 0.78      | 1.00    | 1.04     | 1.37    | 1.10    | 1.11      |
| 2012 | 0.65  | 1.02     | 1.39  | 0.77      | 1.09    | 1.06     | 1.34    | 1.18    | 1.13      |
| 2013 | 0.62  | 1.02     | 1.91  | 0.76      | 1.05    | 0.90     | 1.28    | 1.28    | 1.03      |
| 2014 | 0.60  | 1.05     | 1.91  | 0.75      | 0.92    | 0.88     | 1.30    | 1.26    | 1.16      |
| 2015 | 0.59  | 1.24     | 2.06  | 0.78      | 0.97    | 0.97     | 1.30    | 1.17    | 1.19      |
| 2016 | 0.53  | 1.16     | 1.90  | 0.71      | 0.78    | 0.89     | 1.18    | 1.04    | 1.18      |
| 2017 | 0.53  | 1.22     | 1.86  | 0.75      | 0.87    | 0.89     | 1.35    | 1.20    | 1.27      |
| 2018 | 0.54  | 1.24     | 2.03  | 0.75      | 0.88    | 1.00     | 1.36    | 1.23    | 1.27      |
| 2019 | 0.56  | 1.26     | 2.48  | 0.75      | 0.92    | 0.94     | 1.50    | 1.24    | 1.36      |

**Table A4.** Dynamics of per capita production water ecological footprint (PWEF, ha/cap) of each urban area within the Wuhan Metropolitan Area from 2010 to 2019.

|      | Wuhan | Huaangshi | Ezhou | Huanggang | Xiaogan | Xianning | Xiantao | Tianmen | Qianjiang |
|------|-------|-----------|-------|-----------|---------|----------|---------|---------|-----------|
| 2010 | 0.58  | 1.02      | 1.41  | 0.72      | 0.88    | 0.97     | 1.25    | 0.93    | 1.04      |
| 2011 | 0.57  | 0.95      | 1.32  | 0.72      | 0.93    | 0.98     | 1.30    | 1.02    | 1.04      |
| 2012 | 0.56  | 0.94      | 1.31  | 0.71      | 1.01    | 0.98     | 1.27    | 1.10    | 1.05      |
| 2013 | 0.53  | 0.94      | 1.82  | 0.70      | 0.97    | 0.82     | 1.20    | 1.20    | 0.96      |
| 2014 | 0.51  | 0.97      | 1.82  | 0.68      | 0.85    | 0.79     | 1.22    | 1.19    | 1.08      |
| 2015 | 0.50  | 1.16      | 1.97  | 0.71      | 0.89    | 0.89     | 1.22    | 1.10    | 1.11      |
| 2016 | 0.44  | 1.07      | 1.80  | 0.63      | 0.69    | 0.81     | 1.09    | 0.96    | 1.09      |
| 2017 | 0.43  | 1.13      | 1.76  | 0.67      | 0.79    | 0.81     | 1.27    | 1.12    | 1.18      |
| 2018 | 0.45  | 1.15      | 1.93  | 0.67      | 0.80    | 0.91     | 1.28    | 1.14    | 1.17      |
| 2019 | 0.47  | 1.17      | 2.38  | 0.67      | 0.84    | 0.85     | 1.41    | 1.15    | 1.25      |

**Table A5.** The water ecological footprint intensity (WEFI,  $ha/10^4 \text{ } \text{Y}$ ) in the Wuhan Metropolitan Area and its inner urban areas from 2010 to 2019.

|      | Wuhan l | Huaangshi | Ezhou | Huanggang | Xiaogan | Xianning | Xiantao | Tianmen | Qianjiang | Metropolitan Area |
|------|---------|-----------|-------|-----------|---------|----------|---------|---------|-----------|-------------------|
| 2010 | 0.71    | 0.39      | 0.68  | 0.25      | 0.84    | 0.16     | 0.59    | 0.74    | 0.64      | 0.41              |
| 2011 | 2.03    | 0.74      | 1.26  | 0.63      | 2.61    | 0.33     | 1.34    | 1.74    | 1.12      | 0.96              |
| 2012 | 1.25    | 0.57      | 1.16  | 0.46      | 2.23    | 0.21     | 1.23    | 1.63    | 1.14      | 0.70              |
| 2013 | 1.34    | 0.89      | 1.84  | 0.45      | 1.68    | 0.28     | 0.98    | 1.16    | 0.86      | 0.78              |
| 2014 | 1.26    | 0.61      | 1.56  | 0.34      | 1.30    | 0.19     | 1.16    | 1.83    | 1.32      | 0.63              |
| 2015 | 0.85    | 0.67      | 1.43  | 0.30      | 0.89    | 0.19     | 0.64    | 0.81    | 0.68      | 0.52              |
| 2016 | 0.49    | 0.41      | 0.77  | 0.17      | 0.40    | 0.15     | 0.46    | 0.47    | 0.59      | 0.31              |
| 2017 | 1.09    | 0.56      | 1.81  | 0.35      | 1.06    | 0.15     | 0.83    | 1.32    | 0.99      | 0.53              |
| 2018 | 1.45    | 0.98      | 2.46  | 0.47      | 1.52    | 0.26     | 0.95    | 1.34    | 0.85      | 0.78              |
| 2019 | 1.57    | 1.14      | 2.73  | 0.57      | 2.11    | 0.30     | 1.27    | 1.79    | 1.50      | 0.96              |

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**Table A6.** The economic development (ED, 10<sup>4</sup> ¥/cap) in the Wuhan Metropolitan Area and its inner urban areas from 2010 to 2019.

| Wı        | ıhan   | Huaangshi | Ezhou      | Huanggang | g Xiaogan | Xianning  | Xiantao   | Tianmen    | Qianjiangl | Metropolitan Area |
|-----------|--------|-----------|------------|-----------|-----------|-----------|-----------|------------|------------|-------------------|
| 2010 56,3 | 369.55 | 28,411.69 | 37,682.55  | 13,993.83 | 16,628.66 | 21,110.03 | 24,763.40 | 15,467.23  | 30,726.22  | 31,693.95         |
| 2011 67,4 | 187.03 | 38,027.10 | 46,706.95  | 16,829.47 | 19,858.24 | 26,418.56 | 31,991.55 | 520,052.59 | 39,895.57  | 38,891.87         |
| 2012 79,0 | 089.13 | 42,644.41 | 53,167.93  | 19,141.21 | 22,866.96 | 30,747.07 | 37,485.23 | 323,989.54 | 46,501.05  | 45,288.35         |
| 2013 88,5 | 64.58  | 46,707.57 | 59,687.80  | 21,314.78 | 25,528.54 | 35,094.57 | 42,556.96 | 528,332.04 | 51,754.20  | 50,849.11         |
| 2014 97,4 | 102.59 | 49,753.39 | 64,850.77  | 23,299.80 | 27,867.44 | 38,737.35 | 47,364.49 | 932,213.53 | 56,603.10  | 55,914.48         |
| 2015 102, | 808.34 | 49,963.38 | 68,901.37  | 25,262.12 | 29,872.90 | 41,087.75 | 51,741.13 | 335,948.61 | 58,201.46  | 59,474.90         |
| 2016 110, | 648.23 | 52,952.75 | 74,667.29  | 27,308.50 | 32,149.13 | 43,861.05 | 56,406.79 | 38,578.66  | 62,597.71  | 64,146.52         |
| 2017 123, | 110.83 | 59,882.61 | 84,122.95  | 30,308.31 | 35,447.20 | 48,710.50 | 62,985.10 | )41,156.99 | 69,622.80  | 71,514.00         |
| 2018 133, | 988.72 | 64,246.17 | 93,281.99  | 32,151.66 | 38,880.08 | 53,568.99 | 70,186.84 | 146,463.10 | 78,238.10  | 78,291.56         |
| 2019 144, | 695.06 | 71,496.95 | 107,584.22 | 36,676.61 | 46,766.92 | 62,587.51 | 76,174.90 | 52,174.12  | 84,114.48  | 86,777.49         |

**Table A7.** The population pressure (PP, cap/ha) in the Wuhan Metropolitan Area and its inner urban areas from 2010 to 2019.

|      | Wuhan                   | Huaangshi               | Ezhou                   | Huanggang               | Xiaogan                 | Xianning                | Xiantao                 | Tianmen                 | Oianiiano N             | letropolitan Area       |
|------|-------------------------|-------------------------|-------------------------|-------------------------|-------------------------|-------------------------|-------------------------|-------------------------|-------------------------|-------------------------|
| 2010 | 1.08 × 10 <sup>-4</sup> | 3.50 × 10 <sup>-5</sup> | 4.58 × 10 <sup>-5</sup> | 3.15 × 10 <sup>-5</sup> | 8.97 × 10 <sup>-5</sup> | 1.54 × 10 <sup>-5</sup> | 4.42 × 10 <sup>-5</sup> | 7.43 × 10 <sup>-5</sup> | 5.84 × 10 <sup>-5</sup> | 4.62 × 10 <sup>-5</sup> |
| 2010 | 1.00 ^ 10 -             | 3.50 × 10 °             | 4.56 ^ 10 °             | 3.13 ^ 10 °             | 0.57 ^ 10 °             | 1.54 ^ 10 °             | 4.42 ^ 10 °             | 7.43 ^ 10 °             | 3.64 ^ 10 °             | 4.02 ^ 10 °             |
| 2011 | $3.10 \times 10^{-4}$   | $7.22 \times 10^{-5}$   | $9.05 \times 10^{-5}$   | $8.07 \times 10^{-5}$   | $2.61 \times 10^{-4}$   | $3.20 \times 10^{-5}$   | $9.72 \times 10^{-5}$   | $1.59 \times 10^{-4}$   | $1.01 \times 10^{-4}$   | 1.09 × 10 <sup>-4</sup> |
| 2012 | $1.93 \times 10^{-4}$   | $5.54 \times 10^{-5}$   | $8.35 \times 10^{-5}$   | $6.01 \times 10^{-5}$   | $2.05 \times 10^{-4}$   | $2.02 \times 10^{-5}$   | $9.12 \times 10^{-5}$   | $1.39 \times 10^{-4}$   | $1.01 \times 10^{-4}$   | 7.83 × 10 <sup>-5</sup> |
| 2013 | 2.16 × 10 <sup>-4</sup> | 8.70 × 10 <sup>-5</sup> | 9.62 × 10 <sup>-5</sup> | 5.83 × 10 <sup>-5</sup> | 1.61 × 10 <sup>-4</sup> | 3.06 × 10 <sup>-5</sup> | 7.67 × 10 <sup>-5</sup> | 9.10 × 10 <sup>-5</sup> | 8.34 × 10 <sup>-5</sup> | 8.89 × 10 <sup>-5</sup> |
| 2014 | 2.12 × 10 <sup>-4</sup> | 5.84 × 10 <sup>-5</sup> | 8.15 × 10 <sup>-5</sup> | 4.51 × 10 <sup>-5</sup> | 1.41 × 10 <sup>-4</sup> | 2.21 × 10 <sup>-5</sup> | 8.90 × 10 <sup>-5</sup> | $1.45 \times 10^{-4}$   | $1.14 \times 10^{-4}$   | 7.35 × 10 <sup>-5</sup> |
| 2015 | $1.44 \times 10^{-4}$   | 5.37 × 10 <sup>-5</sup> | 6.95 × 10 <sup>-5</sup> | 3.88 × 10 <sup>-5</sup> | 9.17 × 10 <sup>-5</sup> | 1.99 × 10 <sup>-5</sup> | 4.93 × 10 <sup>-5</sup> | 6.87 × 10 <sup>-5</sup> | 5.71 × 10 <sup>-5</sup> | 5.84 × 10 <sup>-5</sup> |
| 2016 | 9.20 × 10 <sup>-4</sup> | 3.50 × 10 <sup>-5</sup> | 4.05 × 10 <sup>-5</sup> | 2.43 × 10 <sup>-5</sup> | 5.19 × 10 <sup>-5</sup> | 1.66 × 10 <sup>-5</sup> | 3.90 × 10 <sup>-5</sup> | 4.49 × 10 <sup>-5</sup> | 4.95 × 10 <sup>-5</sup> | 3.94 × 10 <sup>-5</sup> |
| 2017 | 2.08 × 10 <sup>-4</sup> | 4.57 × 10 <sup>-5</sup> | 9.74 × 10 <sup>-5</sup> | 4.63 × 10 <sup>-5</sup> | 1.22 × 10 <sup>-4</sup> | 1.64 × 10 <sup>-5</sup> | 6.12 × 10 <sup>-5</sup> | $1.10 \times 10^{-4}$   | 7.79 × 10 <sup>-5</sup> | 6.42 × 10 <sup>-5</sup> |
| 2018 | 2.68 × 10 <sup>-4</sup> | 7.89 × 10 <sup>-5</sup> | 1.21 × 10 <sup>-5</sup> | 6.31 × 10 <sup>-5</sup> | $1.73 \times 10^{-4}$   | 2.61 × 10 <sup>-5</sup> | 6.98 × 10 <sup>-5</sup> | $1.10 \times 10^{-4}$   | 6.66 × 10 <sup>-5</sup> | 9.08 × 10 <sup>-5</sup> |
| 2019 | $2.80 \times 10^{-4}$   | 9.00 × 10 <sup>-5</sup> | $1.10 \times 10^{-4}$   | 7.62 × 10 <sup>-5</sup> | $2.28 \times 10^{-4}$   | 3.14 × 10 <sup>-5</sup> | 8.47 × 10 <sup>-5</sup> | $1.44 \times 10^{-4}$   | 1.11 × 10 <sup>-4</sup> | 1.09 × 10 <sup>-4</sup> |

**Table A8.** The water ecological carrying capacity (WECC, ha) in the Wuhan Metropolitan Area and its inner urban areas from 2010 to 2019.

|      | Wuhan | Huaangshi | Ezhou | Huanggang | Xiaogan | Xianning | Xiantao | Tianmen | QianjiangN | Aetropolitan Area |
|------|-------|-----------|-------|-----------|---------|----------|---------|---------|------------|-------------------|
| 2010 | 0.09  | 0.07      | 0.02  | 0.20      | 0.05    | 0.16     | 0.03    | 0.02    | 0.02       | 0.65              |
| 2011 | 0.03  | 0.03      | 0.01  | 0.08      | 0.02    | 0.08     | 0.01    | 0.01    | 0.01       | 0.28              |
| 2012 | 0.05  | 0.04      | 0.01  | 0.10      | 0.02    | 0.12     | 0.01    | 0.01    | 0.01       | 0.39              |
| 2013 | 0.05  | 0.03      | 0.01  | 0.11      | 0.03    | 0.08     | 0.02    | 0.01    | 0.01       | 0.35              |
| 2014 | 0.05  | 0.04      | 0.01  | 0.14      | 0.03    | 0.11     | 0.01    | 0.01    | 0.01       | 0.42              |
| 2015 | 0.07  | 0.05      | 0.02  | 0.16      | 0.05    | 0.13     | 0.02    | 0.02    | 0.02       | 0.53              |
| 2016 | 0.12  | 0.07      | 0.03  | 0.26      | 0.09    | 0.15     | 0.03    | 0.03    | 0.02       | 0.80              |
| 2017 | 0.05  | 0.05      | 0.01  | 0.14      | 0.04    | 0.15     | 0.02    | 0.01    | 0.01       | 0.49              |
| 2018 | 0.04  | 0.03      | 0.01  | 0.10      | 0.03    | 0.10     | 0.02    | 0.01    | 0.01       | 0.35              |
| 2019 | 0.04  | 0.03      | 0.01  | 0.08      | 0.02    | 0.08     | 0.01    | 0.01    | 0.01       | 0.29              |

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