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Standardization of the Evaluation Index System for Low-Carbon Cities in China: A Case Study of Xiamen

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Abstract: The construction of a reasonable evaluation index system for low-carbon cities is an important part of China's green development strategy in urban areas. In this study, based on the theoretical framework for the concept of low-carbon cities, the perspectives from three index systems—that is, the Drivers, Pressures, State, Impact, Response model of intervention (DPSIR), a complex ecosystem, and a carbon source/sink process—were integrated to extract common indicators from existing evaluation index systems for low-carbon cities. Subsequently, a standardized evaluation index system for low-carbon cities that contained five indicators—carbon emission, low carbon production, low carbon consumption, low-carbon policy, and social economic development—was established. Thereafter, Xiamen was selected for an empirical analysis by determining the indicator weight with an entropy weight method and by carrying out a comprehensive evaluation using a linear summation model. The results showed that the weights of the five selected primary indicators for the evaluation of low-carbon cities were: low-carbon production > low-carbon consumption > social economic development > carbon emission > low-carbon policy. Among the secondary indicators, the average entropy weight of “pollution emission” was the highest at 0.1591, while the average entropy weight of “urbanization rate” was the lowest at 0.0360. Furthermore, the comprehensive index of low-carbon development in 2015 was higher than that in 2010, while the rate of economic growth was greater than the growth rate of carbon emission, which indicated that the relative decoupling of economic growth from carbon emission was basically achieved.

Keywords: low-carbon city; evaluation index; standardization; entropy weight method; level

1. Introduction

In recent years, global warming has led to the gradual adoption of developmental models involving green, low-carbon, and circular economies [1]. China has become the largest energy producer and consumer in the world [2]. In 2016, China's carbon emissions accounted for 27.3% of the world's total carbon emissions, making China the world's largest carbon emitter [3]. Cities are the main contributors to carbon emissions, accounting for 75% of total emissions, and this proportion continues to rise with urbanization [4]. The UN's publication, “Transforming our World: the 2030 Agenda for Sustainable Development”, contains 17 sustainable development goals, and one of the key objectives is to take urgent action to address climate change and its impacts and promote sustainable development [5]. In the 2015 United Nations Climate Change Conference held in Paris, China submitted the Intended Nationally Determined Contributions (INDC) documents, which stated that China would reach its peak in CO₂ emissions around 2030 and would strive to decrease its CO₂

emission per unit Gross Domestic Product (GDP) in 2030 by 60–65% compared to that in 2005 [6]. In this context, the low-carbon development model has become the best choice for long-term global development [7]. Scholars have conducted extensive research focused on low-carbon development, and the evaluation of low-carbon cities has become a popular area of research. The study reviewed the four representative international low-carbon indicator systems and 14 representative Chinese low-carbon indicator systems. The primary indicators selected by scholars in constructing the index system are mainly related to energy, economy, society, and environment. The scope of evaluation is extensive, including an evaluation of the low-carbon development level of the world, the country, and the city. The evaluation results provide a realistic basis for city decision makers and managers to formulate and manage low-carbon development of cities, and may have a great role in promoting the low-carbon development of cities (Table 1). However, the lack of adequate standards related to low-carbon cities significantly constrains the strategic development, planning, and construction of low-carbon cities.

Table 1. The low-carbon evaluation index system at home and abroad.

Country	Year	Source	Indicator Category	Specific Evaluation Aspect
Saudi Arabia	2018	Azizalrahman, H.; Hasyimi, V. [8]	Economy, energy, land use, carbon and environment, transportation, waste and water	Evaluate the low-carbon development of ten low-carbon pilot cities at home and abroad.
Cambodia	2017	Hak, M.; Matsuoaka, Y.; Gomi, K. [9]	Demography, economy, energy, transportation and cross sector	Collect information from these sectors in Cambodia and formulate strategies for low-carbon development.
Malaysia	2015	Tan, S.T.; Yang, J.; Yan, J.Y. [10]	Economic, energy pattern, technology, social and living, carbon and environment, urban accessibility and waste	It is used to evaluate the low-carbon development level of 10 major domestic and foreign cities.
Latvia	2015	Kalnins, S.N.; Blumberga, D.; Gusca, J. [11]	Technological, economic, social, environmental, climate	—
America	2012	Zhou, N.; He, G.; Williams, C.; Fridley, D. [12]	Energy/climate, water, air quality, waste, mobility, economic health, land use and social health	—
Germany	2010	Lu, Q. [13]	Environment, economy, social culture and function, technology and process	Evaluating the overall performance of urban areas.
Global	2009	Pamlin, D. [14]	direct emissions, embedded emissions and global solutions	LCCI (Low-Carbon City Index): Evaluating the low-carbon development of global cities.
China	2018	Zhang, L.P.; Zhou, P. [15]	Economic, living quality, environment, consumer behavior	The low-carbon development level of 40 cities in China is evaluated and it is found that the low-carbon development of coastal cities in China is generally superior to other regions.
	2018	Yang, X.; Wang, X.C.; Zhou, Z.Y. [16]	Carbon emission per capita, carbon emission per unit of Gross Domestic Product (GDP), GDP per capita, population, urbanization rate, proportion of tertiary industry, main functional zone	GDP per Capita and Carbon emission per capita are used to evaluate the low-carbon development of 36 low-carbon pilot cities in the country and divide them into four types: Leading Cities, Developing Cities, Latecomer Cities and Exploring Cities.

Table 1. Cont.

Country	Year	Source	Indicator Category	Specific Evaluation Aspect
	2018	Du, H.B.; Chen, Z.N.; Mao, G.Z.; Li, R.Y.M.; Chai, L.H. [7]	Society, economy, energy, environment	Evaluate the low-carbon development of 30 provinces in the country from 2003 to 2013, and divide these cities into the highest, middle, and lowest three levels.
	2017	Ohshita, S.; Zhang, J.; Yang, L.; et al. [17]	CGLCI (China Green Low-Carbon City Index): economy, energy & carbon, environment & land use, policy & outreach	Evaluating the status of green and low-carbon development for a large number of Chinese cities.
	2013	Price, L.; Zhou, N.; Fridley, D.; Ohshita, S.; Lu, H.Y.; Zheng, N.; Fino-Chen, C. [18]	Residential buildings sector, commercial buildings sector, industry sector, transport sector, power sector	Evaluation of low-carbon development of provincial and municipal cities from the perspective of a variety of sectors.
	2010	Fu, Y.; Liu, Y.J.; Wang, Y.L. [19]	Economy, society, environment	—
	2011	Hua, J.; Ren, J. [20]; Xin, L. [21]		
	2017	Zhu, J.; Liu, X.M.; Zhang, Y. [22]	DPSIR model (involving energy consumption, carbon emissions, industry, transportation, construction, waste disposal)	—
	2010	Shao, C.F.; Ju, M.T. [23]		
	2012	Zhang, X.P.; Liu, J.; Fang, T. [24]		
	2011	Zhang, L.; Chen, K.L.; Cao, S.K. [25]	Carbon source (energy, industry, construction, transportation), carbon sink (land, green space)	—
	2011	Chu, C.L.; Ju, M.T.; Wang, Y.N.; Wang, Y.S. [26]		
	2011	The Media Alliance of China Low-Carbon Economy. [27]	Low-carbon development planning media communication, new and renewable sources of energy, low-carbon product application rate, percentage of greenery coverage, low-carbon commuting, low-carbon buildings, air quality, urban direct carbon reduction, public satisfaction and support rate, veto power	Chinese mainland cities.
	2010	Chatham House; Chinese Academy of Social Sciences; Energy Research Institute; Jilin University; E3G. [28]	Low-carbon productivity, low-carbon consumption, low-carbon resources, low-carbon policy	Evaluating and managing the city's low-carbon construction, which is used in Jilin's low-carbon development plan.

Therefore, based on a systematic review of existing index systems for low-carbon cities, this study comprehensively compared the advantages and disadvantages of each index system. In addition, by extracting reasonable common indicators and using relevant standards of urban construction promulgated by the Chinese government as a reference, this study attempted to construct a standardized evaluation index system for low-carbon cities. It is expected that this index system can be used by urban-level management departments to evaluate low-carbon development within cities, as well as by national-level management departments to evaluate and compare low-carbon development among different cities, so that a better path for the development of low-carbon cities can be explored.

2. Construction of the Index System

2.1. Theoretical Basis for Standardization of the Evaluation Index System

We conducted an in-depth comparison and systematic analysis of representative evaluation index systems for low-carbon cities in China and elsewhere. Subsequently, all index systems were classified into three categories according to the perspective from which the index system is constructed, while all indicators in each category of index systems were then summarized according to their frequency and commonality. It was found that the index systems were mainly constructed from the following three perspectives:

2.1.1. Orientation from the Drivers-Pressures-State-Impact-Response (DPSIR) Model of Intervention

Some evaluation index systems for low-carbon cities were constructed based on the DPSIR model, which emphasizes economic operations and their impact on the environment, as well as the relationships between economic operations and the environment. The DPSIR model is comprehensive, systematic, holistic, and flexible. Most of its “Drivers” are selected from the aspects of GDP, industrial output, and disposable income, while its “Pressures” are mainly selected from the aspects of resource consumption, energy consumption, and the mode of consumption. The “State” of the DPSIR model is mainly selected from the aspects of pollutant discharge and industry/energy structure, the “Impact” is mainly selected from the aspects of social development, ecological environment, and public evaluation, and the “Response” is mainly selected from the aspects of pollution control and carbon sink capacity (Table 2).

Table 2. Evaluation indicators of low-carbon cities, established based on the DPSIR model.

Category	Most Frequently Selected Indicator
Drivers	Gross regional product/per capita gross regional product, per capita disposable income of urban residents, urbanization rate
Pressures	Unit GDP energy/electricity/water consumption, per capita energy/water/electricity consumption, energy/electricity/water consumption per unit of industrial added value, public transportation vehicles per 10,000 people
State	Unit GDP carbon emissions, per capita carbon emissions, percentage of tertiary industry in GDP
Impact	Number of days with good or adequate ambient air quality, Engel coefficient, public perception of low-carbon cities
Response	Forest coverage, green coverage of built-up areas, per capita public green space

Source Index: [22–24,29].

The evaluation index systems constructed based on the DPSIR model summarizes the development level of low-carbon cities in terms of Drivers, Pressures, State, Impact, and Response. Such index systems help to facilitate an intuitive understanding of the assuring factors, problems,

status quo, and countermeasures required to maintain the development of low-carbon cities. As a result, such index systems can solve the problems faced by decision-makers with regard to developing effective urban management policies, which are difficult to achieve because it is often unclear which departments are responsible for low-carbon development, and the level of low-carbon development in specific sectors can be difficult to determine.

2.1.2. Orientation from the Complex Ecosystem

Based on the concept of the complex ecosystem, the index system for the evaluation of low-carbon cities can be set up by configuring indicators for the three subsystems of a city—that is, the social, economic, and environmental systems.

As a complex ecosystem, the indicators of low-carbon cities mainly characterize low-carbon development in the social, economic, and environmental subsystems. The indicators for the economic system are mainly relevant to total production output and per capita disposable income of urban residents. The indicators for the social system are mainly related to aspects of quality of life, consumption mode, transportation systems, and social security. The indicators for the environmental system are related to aspects of energy consumption structure, resource consumption, pollution emissions, carbon emissions, and ecological environment quality (Table 3).

Table 3. Evaluation indicators of low-carbon cities, established based on the complex ecosystem perspective.

Category	Most Frequently Selected Indicator
Economic system	GDP per capita, per capita disposable income of urban residents
Social system	Urbanization rate, Engel coefficient, number of public transportation vehicles per 10,000 people, proportion of clean energy vehicles, share of travel by public transportation, registered urban unemployment rate
Environmental system	Proportion of non-fossil energy consumption in total primary energy consumption, per capita energy/electricity/water consumption, sulfur dioxide, ammonia nitrogen and nitrogen oxide emissions and chemical oxygen demand, total carbon emissions, per capita carbon emissions, carbon emission intensity, forest coverage, green coverage in built-up areas, per capita public green space

Source index: [19–21,30–34].

It is easier for urban managers to understand the specific conditions of various sectors or industries in cities and to divide responsibilities among relevant decision makers if a low-carbon city is treated as a complex ecosystem, so that the level of low-carbon development can be analyzed systematically based on the social, economic, and environmental subsystems. However, such systems are only applicable to the internal evaluation of urban development, and are not applicable to the external evaluation of urban development. From the perspective of existing index systems, the indicators selected by each system and individual departments are not homogeneous, and the nature of such indicators does not consider all aspects of Drivers, Pressures, State, Impact, and Response.

2.1.3. Orientation from the Carbon Source/Sink Process Perspective

The index system for the evaluation of low-carbon cities can be established from the perspective of the carbon source/sink process (resources, production, consumption, emissions, and treatment).

In essence, the construction of an index system from the perspective of a carbon source/sink is an analysis of the level of low-carbon development in cities, with a focus on resources, production, consumption, emissions, and treatment. The process of production using resources and subsequent consumption and emissions can be considered as carbon source generation, and treatment is the carbon sink process. The carbon sources in cities mainly come from the industrial, transportation, and construction sectors, as well as from the household consumption of residents. In previous

research, the indicators to characterize carbon sources have mainly been selected from five aspects: energy, industry, transportation, construction, and household consumption of residents. In contrast, the indicators used to represent carbon sinks have mainly been related to aspects of green space (Table 4).

Table 4. Evaluation indicators of low-carbon cities, established based on the carbon source/sink process.

Category	Most Frequently Selected Indicator
Carbon source	Energy consumption per unit of GDP, proportion of clean energy vehicles, number of public transport vehicles owned by 10,000 people, share of travel via public transportation, proportion of energy-saving buildings, carbon emissions per unit of building area, carbon emissions per capita, per capita disposable income of urban residents, Engel coefficient, per capita water/electricity consumption of residents, and per capita energy consumption
Carbon sink	Per capita green public area, green area coverage of built-up area, forest coverage

Source index: [25,26].

The statuses of resource production and consumption, as well as pollution discharge and treatment, can be more clearly understood if the carbon level in cities is analyzed with a focus on resources, production, consumption, emission, and treatment. Therefore, such an approach is applicable for comparisons of the levels of low-carbon development among different low-carbon cities. However, based on the analysis using the DPSIR model, the index systems constructed from this perspective lack indicators characterizing the Drivers of low-carbon urban development. In addition, the low-carbon development profile of specific urban sectors is not fully reflected in such an approach—that is, indicators applicable to the internal evaluation of cities are not fully reflected.

In summary, the index systems constructed from the three perspectives described above have distinct advantages and disadvantages. Index systems generated from a single perspective can no longer meet the growing demand for more scientific and reasonable evaluation of the low-carbon development of cities. Therefore, we integrated the three perspectives described above to establish an evaluation index system for low-carbon cities that can be used for both internal (i.e., vertical) and external (i.e., horizontal) evaluation.

2.2. Low-Carbon Evaluation Index System Constructed from Three Perspectives

Based on our review of current evaluation index systems, and in strict accordance with pertinent scientific, systematic, hierarchical, dynamic, and operable principles, an index system was established from the perspectives of the DPSIR model, the complex ecosystem, and the carbon source/sink process. This model was constructed in reference to recognized index systems in China and elsewhere. The evaluation of the model was focused on low-carbon development, eco-cities, green cities, and sustainable development. After several rounds of systematic comparison, analysis and screening of existing index systems, ISO37120, the “Low-carbon eco-city evaluation tool for China”, the “Plan for low-carbon development in Jilin city”, the “Media alliance standard of China’s low-carbon economy”, the “China Green Development Index”, and the “Index system for the evaluation of low-carbon city construction in China” were selected as the primary references from which common indicators corresponding to low-carbon urban construction were extracted [12,22,27,28,35,36]. Subsequently, individual indicators were adjusted by consulting with experts in this field to construct a final standardized index system for low-carbon evaluation, which included five aspects: carbon emissions, low-carbon production, low-carbon consumption, low-carbon policies, and socio-economic development (Figure 1).

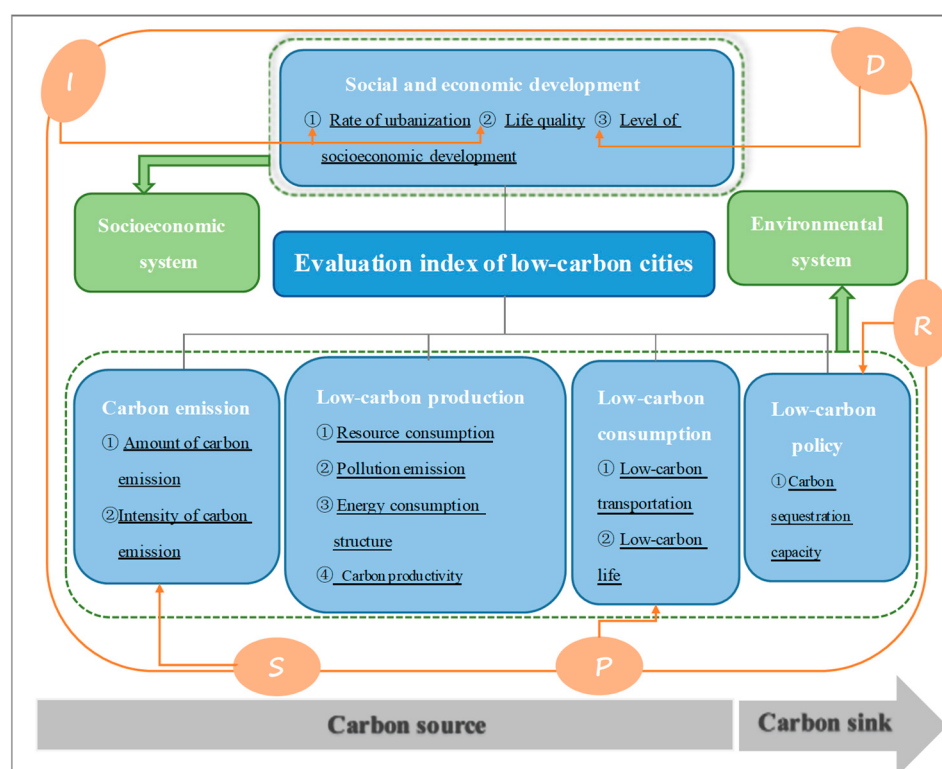


Figure 1. Framework for the evaluation index system of low-carbon cities.

From the range of evaluation indicators, the external evaluation selected carbon emission indicators to evaluate the low-carbon development of different cities, while the internal evaluation selected a set of indicators to reflect the low-carbon construction of different industries and departments within a city. The evaluation conducted with these indicators showed that they reflect the current status of low-carbon development, as well as low-carbon strategies and approaches for further improvement. The attributes of these indicators are also balanced with regard to positive and negative aspects. The positive indicators reflect social and economic development, carbon source and sink capacities, and energy conservation and environmental protection. The negative indicators reflect carbon emissions, pollution emissions, and resource consumption (Table 5).

Table 5. Evaluation index system for low-carbon cities.

Indicator Name			Indicator Attribute
Primary Indicator	Secondary Indicator	Tertiary Indicator	
Carbon emissions	Amount of carbon emissions	Total carbon emissions	–
		Per capita carbon emissions	–
	Intensity of carbon emissions	Carbon emissions per unit of GDP	–
Low-carbon production	Resource consumption	Energy consumption per unit carbon emissions	–
		Water consumption per unit carbon emissions	–
		Electricity consumption per unit carbon emissions	–
	Pollution emissions	Ammonia nitrogen emissions per unit of carbon emissions	–
		Chemical oxygen demand per unit of carbon emissions	–
		Nitrogen oxide emissions per unit of carbon emissions	–
		Sulfur dioxide emissions per unit of carbon emissions	–
	Energy consumption structure	Proportion of non-fossil energy in primary energy consumption	+
	Carbon productivity	GDP per unit carbon emissions	+

Table 5. Cont.

Primary Indicator	Indicator Name		Indicator Attribute
	Secondary Indicator	Tertiary Indicator	
Low-carbon consumption	Low carbon transportation	Proportion of clean energy vehicles	+
		Share of travel via public transportation	+
		Public transportation vehicles owned by every 10,000 people	+
	Low carbon life	Per capita household water consumption	–
		Per capita household electricity consumption	–
		Per capita production of household garbage	–
Low-carbon policy	Carbon sink capacity	Per capita green public space	+
		Green coverage in built-up areas	+
		Forest coverage	+
Social and economic development	Urbanization	Urbanization rate	–
		Engel coefficient	–
	Quality of life	Average life expectancy	+
		Registered urban unemployment rate	+
	Level of economic development	Per capita GDP	+
		Annual per capita disposable income of urban residents	+

Note: (+) in the table indicates a positive indicator and (–) indicates a negative indicator.

3. Methodology

The evaluation method is mainly reflected in the two key links of index weight determination and comprehensive evaluation. There are two main methods to determining the weight of indicators: subjective evaluation and objective evaluation. Subjective evaluation mainly focuses on the Analytic Hierarchy Process and the Delphi method. For example, Hua evaluated the low-carbon construction of 13 prefecture-level cities in Jiangsu Province based on an analytic hierarchy process, and the Media Alliance of China's Low-Carbon Economy used the Delphi method to evaluate the low-carbon development of mainland Chinese cities [20,27]. Objective evaluation methods mainly use the correlation coefficient method, the entropy weight method, and the factor analysis method. Tan used the entropy weight method to evaluate the low-carbon development of 10 domestic and foreign cities, and Yi used the factor analysis method to make an empirical analysis of the development level of low-carbon cities in the six central provincial capitals in 2008 [10,37]. In general, the subjective evaluation method determines the importance of each index according to subjective judgment, which has the advantages of a clear concept, simplicity, and feasibility; however, it is more easily interfered with by subjective factors. According to the standardized data of each index, the objective evaluation method automatically entrust weight according to certain rules. Although its advantages are rigorous calculation and objective evaluation, the results can change along with the data and the stability is poor. Furthermore, the comprehensive evaluation model mainly concentrates on Technology for Order Preference by Similarity to an Ideal Solution (TOPSIS), the Analytic Hierarchy Process (AHP), Fuzzy Comprehensive Evaluation (FCE), the Synthetical Index method, and the Content Analysis method, where comparisons of each method is presented in Table 6. The comprehensive evaluation model and weight-quantifying methods have their own advantages and disadvantages. In the actual evaluation, it is necessary to select the appropriate evaluation method according to the actual conditions.

Table 6. Comparison of various low-carbon evaluation models.

Method	Method Description	Advantages	Limitations	Reference
TOPSIS	According to the approaching degree of limited evaluation objects and idealized goals, the relative merits of existing objects are evaluated.	Making full use of the original information, the results are likely to be consistent with reality; is able to sort out the merits and faults of each evaluation object.	Low sensitivity	Zhang, X.L. [38]
AHP	This refers to the decision-making method which decomposes the elements related to the decision in regard to goals, criteria, schemes, and so on, and facilitates qualitative and quantitative analysis on this basis.	Systematic; results are simple and clear; less quantitative data needed	There are less quantitative data, more qualitative components, and is less convincing.	Yang, Y.F. [39]
FCE	According to the membership degree theory of fuzzy mathematics, qualitative evaluation is transformed into quantitative evaluation—that is, fuzzy mathematics makes an overall evaluation of things or objects restricted by various factors.	Good for solving fuzzy and difficult problems; is also suitable for solving various non-deterministic problems; strong systematicness.	Evaluation subjectivity is obvious, and the evaluation results are not comprehensive enough	Ma, L.; Liu, X.G.; Liu, Z.W. [40]
Synthetical Index	This is done through the comparison of two comprehensive total amounts to comprehensively reflect the total change degree of multiple individuals.	The evaluation process is systematic and comprehensive, the calculation is simple, and the data can be fully utilized.	The original data needs to be complete and the reliance on comparative standards is too strong; evaluation result lacks certain intuition	Wang, Y.Z.; Zhou, Y.Y.; Deng, X.Y. [41]
Content Analysis	Non-quantitative literature materials are converted into quantitative data, the content of the literature is quantitatively analyzed, and judgement and inference about the facts are made according to these data.	Systematic, objective, and quantitative	The classification and the operation is complicated	Zhou, G.H.; Singh, J.; Wu, J.C.; Sinha, R.; Laurenti, R.; Frostell, B. [29]

3.1. Carbon Emission Calculated Based on IPCC Assessment

Based on the IPCC Guidelines for Greenhouse Gas Inventories, calculation of urban carbon emissions primarily involves greenhouse gases generated by activities in five areas: energy activities, industrial processes, changes in land use, forestry and agricultural activities, and waste disposal [42]. The calculation principle is:

$$\text{Emissions} = \text{Activity level} \times \text{Emission factor}$$

The data on activity level were directly obtained or calculated from the statistical yearbook. The emission factor data were mainly obtained according to the “Guidelines for the Accounting Tools of Urban Greenhouse Gas (Test Version 1.0)” and relevant studies [43,44].

3.2. An Entropy Weight Method to Determine the Weight of Different Indicators

The entropy weight method is a mathematical method for calculating a comprehensive index based on the comprehensive consideration of the amount of information provided by various factors [45,46]. As an objective and comprehensive weighting method, the entropy weight method mainly determines the weight according to the amount of information transmitted by each indicator to the decision maker. For a certain indicator X_j , a larger difference in the values of X_{ij} indicates a greater role of this indicator in the comprehensive evaluation. If the values of an indicator are all equal, this indicator does not play a role in the comprehensive evaluation. The specific steps are as follows:

- (1) Establish an original matrix, X

$$X = \begin{bmatrix} X_{11} & X_{12} \dots & X_{1n} \\ X_{21} & X_{22} \dots & X_{2n} \\ \dots & \dots \dots \dots & \dots \\ X_{m1} & X_{m2} \dots & X_{mn} \end{bmatrix}_{m \times n} \quad (1)$$

where m is the number of objects to be evaluated, n is the number of evaluation indicators, and X_{ij} is the evaluation value of object i under indicator j , $i = 1, \dots, m$, $j = 1, \dots, n$, $m = 2$, and $n = 27$.

- (2) Matrix the indicators according to the same ratio and calculate the weight p_{ij} of indicator j in protocol i :

$$p_{ij} = \frac{X_{ij}}{\sum_{i=1}^m X_{ij}} \quad (2)$$

- (3) Calculate the entropy value e_j of indicator j :

$$e_j = \frac{-1}{\ln(m)} \sum_{i=1}^m (p_{ij} \times \ln p_{ij}) \quad (3)$$

Note: If $p_{ij} = 0$, define $p_{ij} \times \ln p_{ij} = 0$.

- (4) Determine the entropy weight w_j of indicator j :

$$w_j = \frac{1 - e_j}{\sum_{j=1}^n (1 - e_j)} \quad (4)$$

3.3. Comprehensive Evaluation Using a Linear Summation Model

The so-called linear summation model involves multiplying the weights of indicators by the processed data, followed by a simple summation [38]. It is performed as follows:

$$Y_k = \sum_{j=1}^n w_j X_j \quad (5)$$

where Y_k is the comprehensive evaluation level of object k , w_j is the weight of object k under indicator j , X_j is the normalized value of object k under indicator j , and n is the number of indicators for the evaluation object.

3.4. Overview of the Study Area

Xiamen is located in the central part of the west bank of the Taiwan Strait, at the center of the Golden Triangle of southern Fujian (north latitude $24^{\circ}23'$ to $24^{\circ}54'$ and east longitude $117^{\circ}52'$ to $118^{\circ}26'$). Xiamen has a tropical monsoon climate with long, hot, humid summers and warm winters. The annual level of precipitation in Xiamen is relatively high, and it receives a relatively large amount of solar radiation. At the end of 2015, Xiamen had a total population of 3.86 million, including an urban population of 1.68 million. In 2010, the National Development and Reform Commission of China issued the “Notice on Launching Pilot Projects for Low-Carbon Provinces and Low-Carbon Cities”, which included Xiamen as one of the “five provinces and eight cities” in the pilot study. Therefore, the analysis of Xiamen’s low-carbon development between 2010 and 2015 has practical guiding significance for the construction of low-carbon cities in Xiamen and across China.

3.5. Data Sources

The data used in this study were either obtained directly from statistical yearbooks, literature, and the websites of relevant departments, or by calculation. The yearbooks used in this study included the “Xiamen Special Economic Zone Yearbook 2011” and “Xiamen Special Economic Zone Yearbook 2016”, the “Fujian Statistical Yearbook 2011” and “Fujian Statistical Yearbook 2016”, and the “Fujian Energy Balance Sheet 2011” and “Fujian Energy Balance Sheet 2016”.

4. Results

4.1. Entropy Weight of Indicators and Changes in Entropy Weight

By selecting the profile of low-carbon development in Xiamen between 2010 and 2015 as the research object, five primary indicators, 12 secondary indicators, and 27 tertiary indicators were selected, and the weights of secondary indicators in 2010 and 2015 were calculated by the entropy weight method (Table 7). From the overall situation of indicator weights, the weights of indicators for pollution emissions, low-carbon life, and resource consumption were relatively higher than those of other indicators. From the perspective of changes in indicator weights, the weights of indicators for carbon emissions and pollution emissions decreased over time, while the weights of indicators for resource consumption, low-carbon life, and low-carbon transportation increased significantly over time. Among these indicators, the negative indicator “pollution emission” had the highest average entropy weight (0.1591). Therefore, this indicator played the most important role in the comprehensive evaluation of low-carbon development in Xiamen. The indicator “urbanization rate” had the smallest average entropy weight (0.0360).

Table 7. Entropy weight of evaluation indicators.

Year	2010	2015	Average
Carbon Emissions	0.0733	0.0714	0.0722
Intensity of Carbon Emissions	0.0416	0.0338	0.0376
Resource Consumption	0.1048	0.1143	0.1095
Pollution Emissions	0.1724	0.1456	0.1591
Energy Structure	0.0349	0.038	0.0365
Carbon Productivity	0.0343	0.041	0.0376
Low-Carbon Transportation	0.105	0.1139	0.1094
Low-Carbon Life	0.1094	0.1114	0.1109
Carbon Sink Capacity	0.1088	0.1082	0.1085
Urbanization	0.036	0.0363	0.036
Quality of Life	0.1107	0.1063	0.1084
Economic Development Level	0.0688	0.0798	0.0743

The entropy weights of the indicators were ranked as follows (largest to smallest): pollution emissions > low-carbon life > resource consumption > low-carbon transportation > carbon sink capacity > quality of life > economic development level > amount of carbon emissions > carbon productivity > intensity of carbon emissions > energy structure > urbanization. The importance of each primary indicator in the comprehensive evaluation of low-carbon development was ranked as follows (most to least important): low-carbon production > low-carbon consumption > social and economic development > carbon emissions > low-carbon policy. In addition, several secondary indicators, including pollution emissions, low-carbon life, and resource consumption, were found to be important factors for the evaluation of the level of low-carbon development in cities, as their entropy weights were relatively high. The entropy weights for the indicators of resource consumption, energy structure, carbon productivity, low-carbon transportation, low-carbon life, urbanization, and economic development level increased from 2010 to 2015, while the entropy weights for the indicators of amount of carbon emissions, intensity of carbon emissions, pollution emissions, carbon sink capacity, and quality of life decreased from 2010 to 2015. In the evaluation of the increase in entropy weight, the entropy weight of the indicator for low-carbon transportation increased the most (by approximately 32.38%), while the entropy weight of the indicator for urbanization increased the least (by approximately 0.83%). Among the indicators with entropy weights that decreased from 2010 to 2015, the entropy weight of the indicator for the intensity of carbon emissions decreased the most (by approximately 18.75%), while the entropy weight of the indicator for carbon sink capacity decreased the least (by approximately 0.55%) (Figure 2).

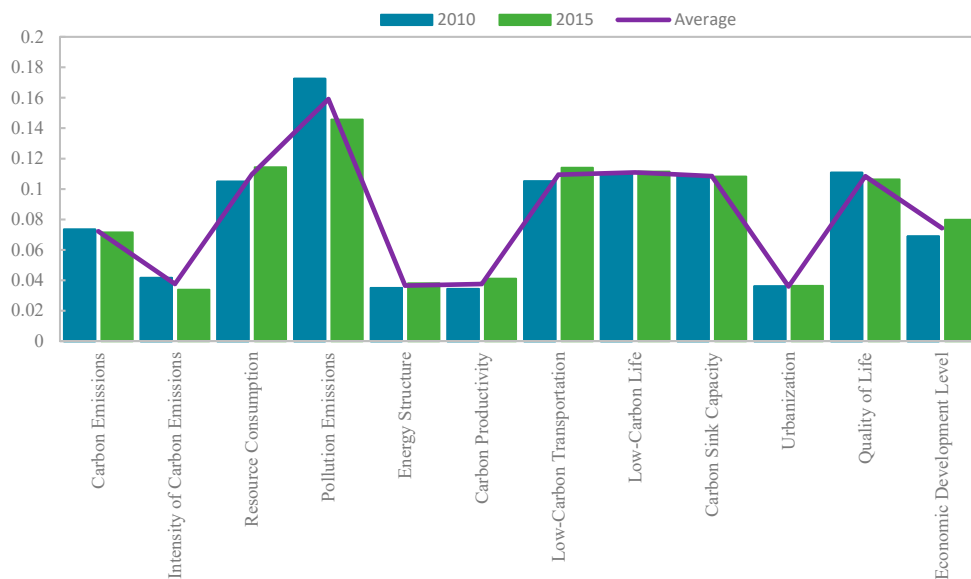


Figure 2. Entropy weights of the evaluation indicators.

4.2. Comprehensive Status Assessment

Overall, after five years of exploration and practice, low-carbon construction achieved remarkable results by the end of 2015. Based on the IPCC Guidelines for Greenhouse Gas Inventories and relevant research results in China and elsewhere, the carbon emission inventory from different routes (energy consumption, agricultural activities, land use change and forestry, and waste disposal) in Xiamen between 2010 and 2015 was roughly calculated (Figure 3).

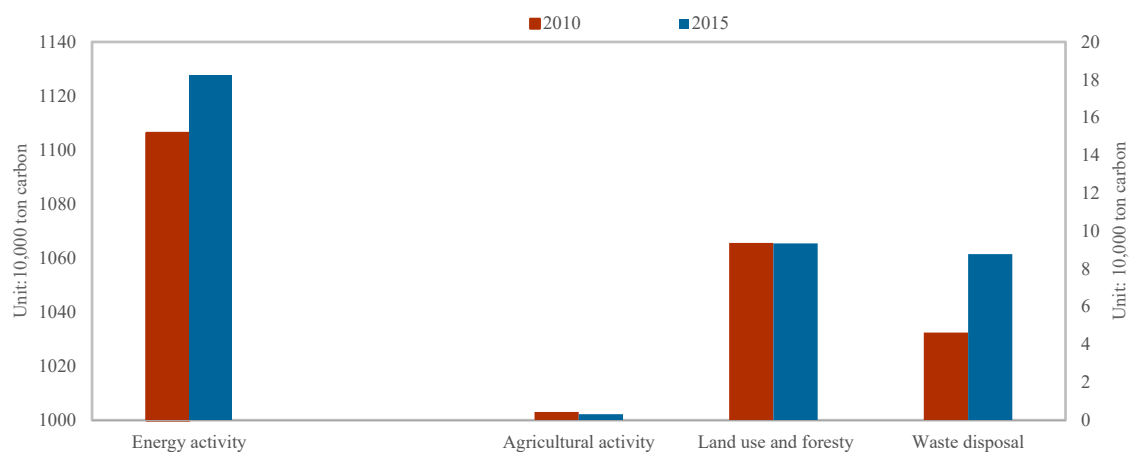


Figure 3. Carbon emissions in Xiamen in 2010 and 2015.

In addition, it should be noted that Xiamen has some particular natural geography and resource conditions. For example, steel, cement, and other industrial materials are not produced locally in Xiamen, but are imported from other places. Therefore, the industrial processes in Xiamen produce very little carbon emission, and hence was excluded from this study. From the perspective of carbon emissions, carbon emissions in Xiamen were mainly from energy consumption, followed by changes in land use and forestry, waste disposal, and agricultural activities. In 2015, after five years of low-carbon development in Xiamen, the carbon emissions generated by agricultural activities, and changes in land use and forestry were significantly reduced to levels lower than those in 2010. In addition, as compared to 2010, although the amount of carbon emission generated by energy consumption and waste disposal in 2015 increased and led to the increase in total carbon emissions, the growth rate of carbon emissions had slowed.

At the same time, compared with 2010, GDP in 2015 increased significantly. According to the decoupling theory [44], the relationship between carbon emissions and economic development showed that GDP increased, and carbon emissions also increased; however, the economic growth rate was higher than the growth rate of carbon emissions. Therefore, while economic growth was achieved, energy consumption was gradually reduced and decoupled from economic growth, to a relative decoupling state (Figure 4). In addition, the intensity of energy consumption for each unit of carbon emissions increased, and the efficiency of resource utilization gradually increased. In addition, pollutant emissions for each unit of carbon emissions decreased, thus improving the quality of the local air and environment to some extent.

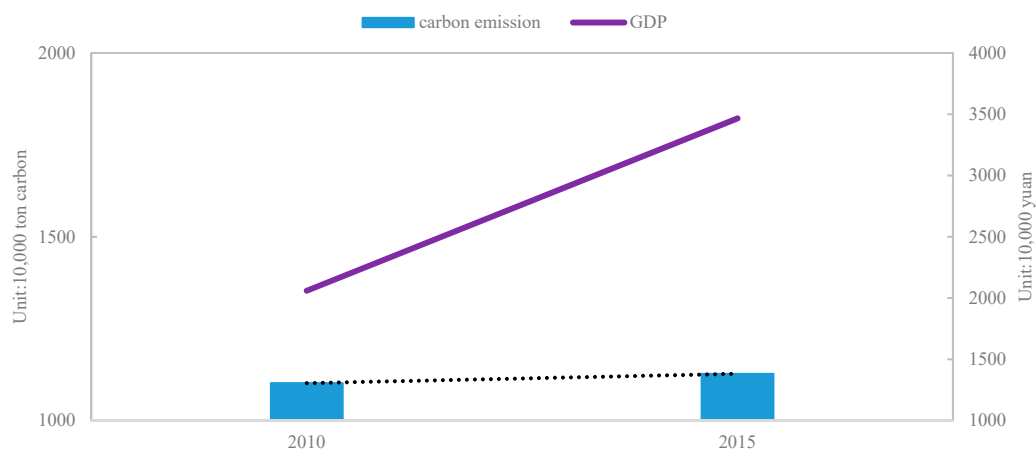


Figure 4. Changes in carbon emissions and GDP.

The values of positive evaluation indicators of low-carbon cities in Xiamen all increased from 2010 to 2015. The indicators of urbanization rate, energy consumption structure, low-carbon transportation, and carbon sink capacity changed the most. The values of the most negative evaluation indicators were reduced, with the exceptions of electricity consumption and waste generation. The increase in electricity consumption and waste generation is closely related to the large influx of residents into the city and the nature of the city itself. In 2015, the indicators of low-carbon development were significantly higher than those in 2010, in terms of low-carbon consumption, low-carbon policy, and social and economic development, while low-carbon development in terms of carbon emissions and low-carbon production require further improvement. However, in general, the comprehensive index of low-carbon development in Xiamen increased from 2010 to 2015, indicating that, after five years of construction and practice, the level of low-carbon development in Xiamen has increased (Figure 5).

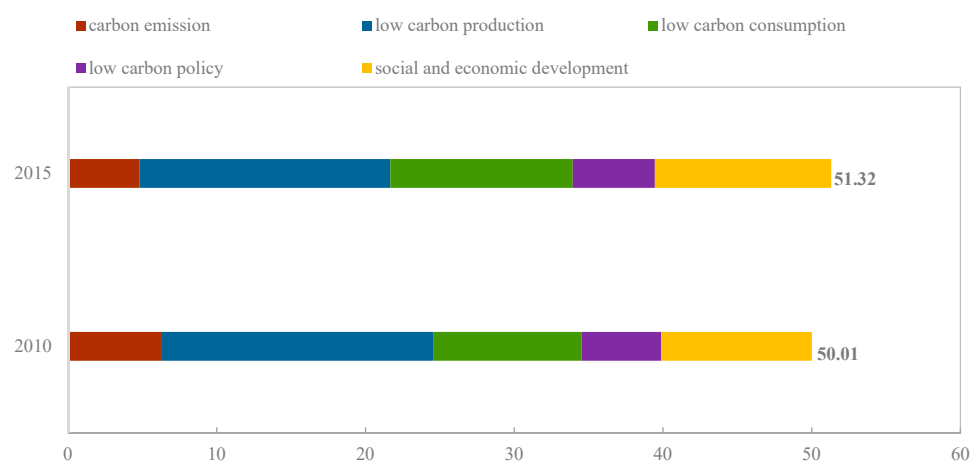


Figure 5. Level of low-carbon development in Xiamen.

5. Discussion

The major innovation of this study was the assessment of representative index systems in China and elsewhere to select a set of indicators for index standardization and construction of an index system for low-carbon cities. By combining the perspectives of three types of index systems, this study avoided the incompleteness of prior index systems constructed from a single perspective and fully integrated the advantages of each perspective, thus allowing us to build a more scientific and reasonable evaluation index system for low-carbon cities. In order to ensure the objectivity of the results, the indicators were all quantitative indicators, which reduced the impact of human subjective factors. At the same time, this approach ensured that the data for the selected indicators were easy to obtain, which made the evaluation protocol realistic and feasible. Another innovation of this research was the selection of an objective weighting method and the entropy weight method, which directly determines the importance of indicators according to changes in indicator data in order to assign weights to the indicators. As a result, fair evaluations can be ensured when different types of cities are compared. In the past, most of the relevant studies adopted qualitative weighting methods, such as the analytic hierarchy process. The shortcoming of this method is that it is too subjective, which makes the results of the evaluation less convincing. Based on the two innovations described above, this study established an evaluation index system for low-carbon cities that consisted of five primary indicators: carbon emissions, low-carbon production, low-carbon consumption, low-carbon policies, and socio-economic development. In addition, evaluations of low-carbon development in cities can be divided into two categories: internal evaluations and external evaluations. Internal evaluations mainly focus on vertical comparison within cities and evaluate the low-carbon development of cities by selecting indicators relevant to five aspects: carbon emissions, low-carbon production, low-carbon consumption, low-carbon policies, and social and economic development. In this way, low-carbon development, related to all the different aspects of cities, can be evaluated. External evaluations mainly involve horizontal comparisons of low-carbon development among all provincial capital cities and municipalities directly under the central government of China. By comparing the overall low-carbon development among these cities in terms of indicators related to carbon emissions, a comprehensive index ranking can be determined to reflect the real level of low-carbon development in these cities. At the same time, the relevant government administrations can also scientifically and reasonably evaluate the level of low-carbon development among similar cities using external evaluation, so that the cities can develop various improvement measures that are conducive to low-carbon development (Figure 6).

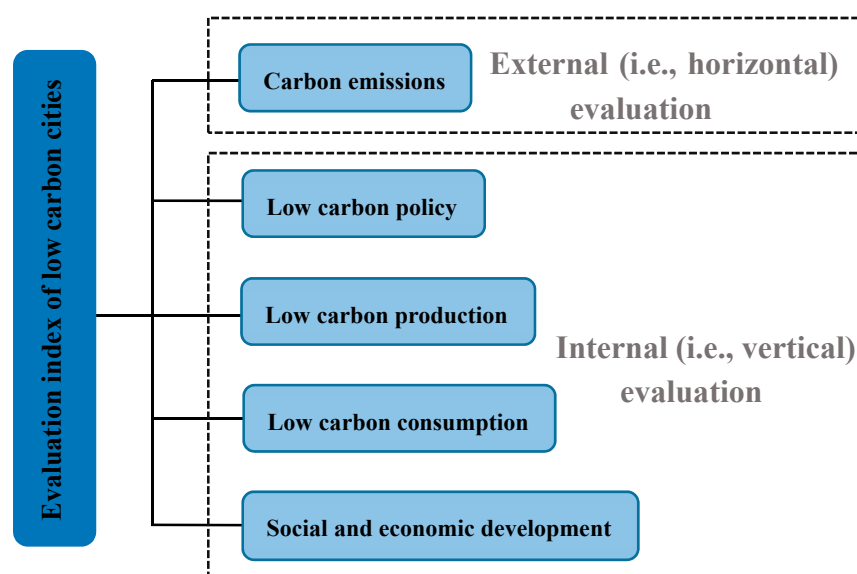


Figure 6. Method for selecting low-carbon evaluation index.

There are some shortcomings of this study. Due to limited data availability, some indicators were discarded despite their usefulness for evaluating low-carbon cities. For example, indicators for low-carbon buildings (proportion of energy-saving buildings, and energy consumption per unit building area), low-carbon technologies (capture and storage ratio of carbon dioxide), and low-carbon policies (completeness of low-carbon policies and regulations, public satisfaction with low-carbon cities) were excluded from this study. At the same time, when the carbon emissions of Xiamen were calculated according to the IPCC Guidelines for Greenhouse Gas Inventories, carbon emissions generated by industrial production were ignored because Xiamen has a particular natural geography and resource conditions. For example, steel, cement, glass, and other industrial products with high carbon emissions are not produced locally in Xiamen, but are instead imported from other places.

In future studies, we will explore a weighting method that utilizes qualitative and quantitative indicators, try to find an alternative for necessary indicators with limited data availability, and study the level of low-carbon development in cities with a longer time scale, while simultaneously considering the spatial scale of the analysis. At the same time, as this research is aimed at the standardization of indicators, we need to refer to the relevant standards of domestic and foreign cities to set the benchmark indicators. It is necessary to expand to a wider range of cities for comparison, such as at the global, regional, and national level.

6. Conclusions

Based on the results of previous studies, this study integrated three perspectives used to construct evaluation index systems for low-carbon cities. By extracting common indicators and adjusting individual indicators, a standardized evaluation index system for low-carbon cities was established. The established evaluation index system can be used to horizontally compare the levels of low-carbon development among different cities, as well as to evaluate the levels of low-carbon development in specific sectors or industries within a city. The content of these indicators reflects current problems and routes to improve low-carbon development. The newly developed index system uses a balanced configuration of positive and negative indicators, including five primary indicators for carbon emissions, low-carbon production, low-carbon consumption, low-carbon policies, and social and economic development. In addition, all indicators in the index system are quantitative indicators, and the relevant data can be obtained directly or calculated from statistical yearbooks. Therefore, in the future, quantitative comparisons of the levels of low-carbon development among different cities can avoid the uncertainty caused by human subjective factors, and the results of such evaluations will be more objective and comparable than the results of evaluations conducted using current index systems. Moreover, in comparison with current index systems, the newly developed index system can be used in a broader range of applications.

Using the entropy weight method, low-carbon development in Xiamen from 2010 to 2015 was evaluated quantitatively and comprehensively. Pollution emissions had the greatest impact on low-carbon development in Xiamen, while urbanization had the least impact. In terms of the comprehensive index of low-carbon development in Xiamen, the level of low-carbon development in 2015 was better than that in 2010 due to efforts at promoting energy conservation, emission reduction, and green development. In addition, in terms of carbon emissions, the growth rate of carbon emissions from energy activities, agricultural activities, changes in land use and forestry, and waste treatment slowed significantly in 2015 compared with that in 2010. In addition, the amount of carbon emission generated from agricultural activities, and changes in land use and forestry in 2015 was less than that in 2010. These changes were closely related to efforts at increasing afforestation and improving forest resource management. At the same time, the growth rate of carbon emissions was slower than the growth rate of economic development, and these rates were decoupled. Although the growth rate of carbon emissions slowed from 2010 to 2015, the total amount of carbon emission in 2015 was higher than that in 2010, mainly because energy activities were still the main source of urban carbon emissions. Furthermore, the amount of carbon emission generated by waste disposal was still high,

mainly because of Xiamen's large population, which generated a large amount of household waste. Moreover, most of the waste produced in Xiamen was destroyed by incineration, which also acted as an important contributor to carbon emissions.

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