

Article **Promoting the Effectiveness of Climate Policy through Data Analysis**

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Abstract: In the face of the intensification of global climate change, formulating scientific climate policies is essential to addressing climate challenges. However, the effectiveness of these policies is often limited by numerous factors, such as political, economic, and technological constraints, which may impede their successful implementation. In this context, data analysis is crucial as it provides important support for the planning, implementation, and effectiveness evaluation of climate policies through in-depth exploration and research of numerous climate information. This article examines the crucial role of data analysis in the process of formulating climate policies, particularly in establishing policy objectives, optimizing resource allocation, and evaluating policy effectiveness. Relying on data-driven decision support, policy makers can accurately grasp the dynamics of climate change, adjust policy directions in a timely manner, enhance policy implementation, and promote global climate governance towards sustainable development goals.

Keywords: data analysis; climate policy; policy execution capability; public participation; cross disciplinary collaboration

1. Introduction

Faced with the global issue of climate change, countries around the world are making unremitting efforts to introduce and implement various policies to address climate change. The introduction of such policies relies on a massive amount of ecological environment data, socio-economic conditions, and technological progress data support. Given the complex and ever-changing nature of climate change, traditional policies often face the dilemma of low efficiency and unpredictable effects. With the rapid advancement of big data and artificial intelligence technology, data statistical analysis is increasingly becoming a powerful assistant for improving policy formulation. By utilizing professional analysis of climate data, decision-makers can more accurately predict climate change trends and evaluate the effectiveness of strategies. Additionally, they can adjust resource allocation and make timely revisions to strategies to ensure their sustained effectiveness. This article discusses the application of data statistical analysis in the field of climate policy and analyzes its important role in enhancing policy implementation.

2. Overview of Data Analysis

By applying mathematical principles, statistical methods, and computer technology, data analysis aims to screen, merge, model, and interpret the collected data, extracting key information and knowledge from it. With the continuous advancement of information technology, the application of data analysis has penetrated into many industries, especially in addressing climate change issues, providing scientific basis for processing and analyzing large-scale environmental data. In the process of dealing with climate change issues, data analysis is not only limited to primary statistical analysis of climate, temperature, precipitation and other indicators, but also focuses on exploring the deep

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Copyright: © 2025 by the authors. Submitted for possible open access publication under the terms and conditions of the Creative Commons Attribution (CC BY) license (https://creativecommons.org/license s/by/4.0/). internal connections of data to provide scientific decision-making support for policy makers. Cutting edge data analysis techniques are required for areas such as climate simulation, layout of environmental monitoring systems, and climate impact assessment. At present, the formulation of climate policies increasingly relies on massive data and artificial intelligence prediction algorithms, relying on precise data analysis to enhance the efficiency and effectiveness of policy implementation.

3. Application of Data Analysis in Climate Policy Formulation

3.1. Climate Data Collection and Integration

In the process of formulating climate policies, the starting point of data analysis is the collection and integration of climate information as shown in Figure 1. Given the multidimensional nature of climate change, which includes but is not limited to various factors such as temperature, precipitation, sea level rise, wind speed, humidity, and carbon dioxide content, these data sources are scattered and diverse, covering meteorological observation data, satellite remote sensing information, climate simulation analysis, etc. The collection of climate data involves a wide range of data providers, including meteorological departments, environmental protection agencies, international organizations such as the Office of the United Nations Framework Convention on Climate Change, and research institutions, collectively contributing a massive amount of climate observation data [1]. The government and relevant departments often take joint actions to ensure the integrity and accuracy of data, using various methods such as ground monitoring stations, satellite remote sensing technology, and climate simulation analysis to collect data. At the same time, information published on online platforms and social media, as well as environmental information collected by smart devices, have become important supplementary channels for climate data.



Figure 1. Analysis and Integration of Climate Data.

The frequency, time span, and spatial granularity of data collected through different channels vary, which requires a lot of preliminary preparation work to be carried out in the data integration stage, such as data cleaning, filling in missing values, and data standardization. Researchers and decision-makers use advanced data integration techniques to convert data from different channels into standard formats, striving to ensure the comparability and uniformity of the data. Thanks to the assistance of cutting-edge information technologies such as big data and cloud computing platforms, the efficiency and quality of climate data processing have been improved. With the continuous expansion of data scale, how to effectively manage and preserve the vast climate information database has become an urgent challenge. For this reason, many climate information Integration Center (CDC) and the Climate Data Storage Database (CDS), providing efficient channels for data exchange and analysis.

3.2. Construction of Climate Policy Scenarios Based on Data Analysis

When formulating climate policies, existing climate data must be used as the basis, and future uncertainties must be comprehensively considered to carry out multi-dimensional scenario prediction and evaluation [2]. By utilizing data analysis techniques, decision-makers can construct diverse climate scenario models, anticipate potential development paths, and provide a solid scientific foundation for informed policy formulation. The following Table 1 lists the key elements in constructing climate policy scenarios using data analysis:

Table 1. Factors Influencing Climate Policy Construction.

Factor	Describe	Application examples
Climate Change Models	Utilize existing climate simulation tools, such as global climate mod- els and regional climate models, to predict and analyze future climate change	Based on the prediction and analysis of various greenhouse gas emission sce- narios, the rising trend of global temper- ature in the next 50 years
Scenario as- sumption	Based on various policy options, technological innovations, and dif- ferent assumptions of economic and social progress, create model architectures for multiple simula- tion scenarios	Assuming that each country imple- ments differentiated emission reduction strategies and makes forward-looking predictions on global greenhouse gas concentration changes
Uncertainty analysis	Explore the core uncertainties in- herent in global climate change, including natural volatility and policy implementation effective- ness	In the process of analyzing policy effec- tiveness, it is necessary to fully consider the potential interference of natural fluc- tuations inherent in the climate system on the predicted results
Data Integra- tion and Multidimen- sional Anal- ysis	 Integrate diverse information re- sources such as meteorological data, geographic information, and economic indicators to implement comprehensive data analysis 	Integrating urban climate and demo- graphic data to analyze the strategies adopted by various cities in response to climate change
Sustainable	Comprehensive evaluation of the	Comprehensive assessment of the im-
Develop-	effects of various policies on sus-	pact of emission reduction policies on
ment Assess-	tainable development based on	economic development and employ-
ment	climate scenario predictions	ment

By applying the strategies listed in Table 1, data analysis techniques help decisionmakers understand the dynamics of climate change across various scenarios, anticipate potential effects of policy implementation, and provide strong scientific support for decision-making.

3.3. Policy Goal Setting and Resource Allocation Optimization

In the planning process of climate policy, data analysis provides solid scientific support for determining policy objectives and rational allocation of resources. Establishing appropriate policy objectives and implementing efficient resource allocation strategies are the guarantees for ensuring the expected results of climate policies. Given the global and complex nature of climate change, setting goals and allocating resources have become particularly difficult [3]. By utilizing data analysis techniques, decision-makers can optimize their goals in diverse contexts and scientifically plan scarce resources, enhancing the effectiveness of policy implementation. Establishing goals is an essential step in the formation of climate policies. Data analysis assists policy makers in setting realistic and feasible goals by reviewing historical climate data and predicting future climate change trends. For example, analyzing data on temperature changes, precipitation patterns, carbon emissions, and other factors over the past few decades can help determine the dynamics of global and regional climate change, providing data references for setting emission reduction targets, controlling temperature rise, and other policy objectives.

Reasonable allocation of resources is the core of achieving policy objectives. Faced with the challenge of climate change, it is necessary to mobilize massive funds and integrate various resources. With the help of data statistical analysis, decision-makers can scientifically allocate resources based on specific situations in different regions, industries, and time periods. For example, through in-depth data mining, government departments can accurately identify which regions are most threatened by climate change, and prioritize increasing resource investment in these regions.

3.4. Analysis of Policy Implementation Trends

In the process of implementing climate policies, analyzing the effectiveness of policy implementation is particularly crucial. The core of the execution trend lies in monitoring, recording, and conducting in-depth analysis of various key data during the policy implementation stage. By continuously tracking implementation effectiveness, decision-makers can evaluate the differences between actual results and established goals, providing references for policy optimization and revision. The in-depth analysis of policy implementation trends usually involves the integration and analysis of data from multiple perspectives, including but not limited to key indicators such as carbon emissions data, energy utilization, the proportion of renewable energy applications, and the effectiveness of greenhouse gas emissions reduction. Through the application analysis of time series data and the study of regression models, future execution trends can be estimated in advance. Taking the greenhouse gas emission reduction plan set by a certain region as an example, the region aims to achieve the ambitious goal of reducing carbon emissions by 30% by 2030. The trend of policy implementation can be quantitatively analyzed using the following mathematical models:

 $E_t = E_0 \times (1 - r)^t$

(1)

In formula (1), E_t represents the carbon emissions at time t, E_0 represents the initial carbon emissions, r is the annual reduction rate, and t is the number of years of policy implementation. Based on past data, regression methods are used to calculate the reduction ratio r, and this formula is then applied to achieve prediction and optimization. By continuously tracking the differences between emissions and established reduction targets, trend assessment can help government departments spot deviations in the implementation process and quickly identify areas where policies have failed to meet targets or have had poor results [4].

4. The Promoting Effect of Data Analysis on Policy Effectiveness

4.1. Improve Policy Implementation Capability

Data analysis plays an important role in enhancing the implementation of climate policies. The improvement of execution capability ensures that policy objectives are quickly and accurately implemented, while ensuring that specific measures can achieve expected results in specific implementation [5]. With in-depth data analysis, decision-makers can track the progress of policy implementation in real time, identify problems in a timely manner, and adjust strategies accordingly to ensure the smooth achievement of policy goals. Data analysis can provide accurate execution feedback information, allowing relevant departments to grasp the detailed status of policy implementation. By relying on real-time feedback from data, the government can quickly detect errors in the implementation process and fine-tune policy details to achieve optimized resource allocation. Data

analysis can also help decision-makers anticipate potential risks before policy implementation by building predictive models. By analyzing historical data and trends, decisionmakers can identify many key factors that affect policy implementation, such as technological barriers, insufficient funding, and delays in policy implementation. The following is an example Table 2 for evaluating policy implementation through data analysis:

Table 2. Policy Implementation Capability.

Year	Actual emis- sion reduc- tion (million tons)	Target emis- sion reduc- tion (million tons)	Execu- tion pro- gress (%)	Devia- tion analysis (%)	Recommended measure
2024	12	15	80	-20	Promote the widespread applica-
					tion of clean energy and achieve the
					optimization and upgrading of en-
					ergy structure
2025	16	18	89	-11	Enhance industrial efficiency and
					strengthen policy implementation
					effectiveness
2026	22	25	88	-12	Optimize carbon emission monitor-
					ing methods to ensure accurate and
					reliable data
2027	28	30	93	-7	Improve policy implementation
					processes and strengthen local gov-
					ernment support

Policy makers can use Table 2 to clearly see the specific status of policy implementation each year, formulate corresponding improvement strategies based on deviation analysis conclusions, and enhance the efficiency and overall effectiveness of policy implementation.

4.2. Promoting Policy Transparency and Public Participation

Data analysis has promoted transparency and public participation in climate policies. Policy transparency refers to the completeness of information disclosure at all stages of policy formulation and implementation, and public participation involves the level of participation of the general public in the planning, implementation, and evaluation of policies. These two points are crucial for optimizing policy effectiveness and enhancing public trust in policies. By using data analysis methods, policy makers can more intuitively demonstrate the implementation details and effectiveness of policies, improve transparency, and stimulate public participation enthusiasm through precise feedback systems. Data analysis can also make various information related to policy implementation more open and transparent. Government agencies can provide the public with a clearer understanding of policy implementation by releasing and analyzing data related to the environment, carbon emissions, energy use, and other factors [6].

Create a transparent data sharing system that allows the government to periodically disclose various information on climate change, while utilizing graphical tools such as statistical charts and dynamic curve graphs to present policy effectiveness. This approach can enhance public trust in climate policies and strengthen their legitimacy. The government collects various opinions and feedback from the public, enterprises, and research institutions through data analysis methods to refine policy plans. For example, using data mining methods to study hot topics on social networks, so that the government can grasp the public's concerns and positions on climate policies and make flexible adjustments in policy implementation. A common mathematical method is to use a weighted average model to evaluate the public engagement of different data sources, calculated as follows:

$$P = \frac{\sum_{i=1}^{n} w_i \times p_i}{\sum_{i=1}^{n} w_i}$$
⁽²⁾

In formula (2), *P* is the weighted average of public participation, w_i is the weight of the *i*-th data source (such as public survey feedback, social media analysis, etc.), p_i is the public participation index reflected by the *i*-th data source, and *n* is the number of data sources. Through this method, the government can gather data from different sources to comprehensively evaluate the level of public participation in climate policy formulation, enhance the quality of public interaction, and improve the transparency of policies.

4.3. Supporting Decision Making

Data analysis provides solid support for the formulation of climate policies, especially in dealing with complex environmental, social, and economic issues, providing decision-makers with scientific basis and precise judgment. Climate policy involves many interrelated variables, such as greenhouse gas emissions, energy use, and the dynamics of climate change. Relying solely on subjective experience or intuition is not sufficient to develop effective strategies. With the help of data analysis methods, policy makers can extract key insights from numerous variables and conduct comprehensive analysis and evaluation of this information to formulate more reasonable and evidence-based policies. Through in-depth research and analysis of past data, decision-makers can clearly identify the expected effects of various policy options and quantify them. By using regression methods based on historical data or forward-looking prediction algorithms, decisionmakers can estimate the ecological benefits, economic burdens, and social effects that different policy measures may bring about [7].

4.4. Achieving Cross Domain Collaboration

The response strategy to climate change involves collaborative efforts across various domains, rather than being limited to individual actions in a specific field. Interdisciplinary collaboration is crucial in this process, and data analysis is the core force that promotes this collaboration. It can eliminate information barriers, achieve the integration and in-depth analysis of data from different industries, and provide data support and communication platforms for interdisciplinary decision-making. With the help of advanced data analysis methods, responsible departments can collaborate and support one another, enhancing the overall effectiveness of policy implementation. The following is an example Table 3 of data analysis that reflects interdisciplinary collaboration, demonstrating the collaboration and interaction of different industries in the field of climate policy.

Table 3. Collaboration in Different Fields.

Field	Key data	Data analysis meth- ods	Collaborative goals			
climate	Trends in greenhouse Time series analysis Provide global climate change pre					
change	gas emissions and and regression mod-dictions to support policy goal set-					
	temperature changes	els	ting			
Energy sector	Energy consumption	Predictive modeling	Optimize energy structure and			
	and proportion of re-	and scenario analy-	support the achievement of emis-			
	newable energy	sis	sion reduction targets			
Transpor	Traffic flow, transpor	Multivariate analy	Develop low-carbon transporta-			
tation	tation emissions	winitivariate analy-	tion policies to reduce carbon			
tation		515	emissions			
Agricul-	Land use agricultural	Spatial data analy-	Optimize agricultural production			
tural sec-	Land use, agricultural	sis, model predic-	methods and reduce greenhouse			
tor	emissions	tion	gas emissions			

By integrating and analyzing data resources, relevant departments can achieve collaborative policy-making, enhance policy consistency and implementation efficiency, and promote more significant results in climate governance work.

5. Conclusion

Scientific climate data analysis plays an important role in the construction and implementation of climate strategies. By thoroughly analyzing climate data, policy makers are able to set policy goals more accurately, adjust resource allocation, enhance implementation efforts, and achieve the highest policy benefits. Data analysis also helps to enhance policy transparency, increase public participation enthusiasm, promote collaboration between different departments, and provide stronger support for global climate management. In the future, with the pace of technological advancement, data analysis is expected to play a more critical role in optimizing and implementing climate policies, providing more scientific and efficient solutions to address global climate change.

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