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Evaluating the effect of the accountability audit of natural resources on carbon emissions reduction in China

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The accountability audit of natural resources (AANR) is a major institutional arrangement for advancing the construction of an ecological civilization in China. Based on the panel data of 271 cities in China from 2005 to 2017, this paper investigates the relationship between the AANR and carbon dioxide (CO_2) emissions using a multi-period difference-in-differences (DID) model. The results show that AANR significantly increases the CO₂ emission reduction rate by 0.009 units at the 5% significance level. The results still hold after a series of robustness tests. Given all else being equal, this significant effect is 0.001. Further analyses show that AANR improves pilot cities' CO2 emission reduction rates mainly by enhancing their green innovation capability. The mediating effect of cities' green technology innovation capability accounts for 96.00%, while the AANR's direct effect only accounts for 4.00%. The AANR has significantly positive effects of 0.017% and 0.029% for western cities and cities with high fiscal pressure at the 5% and 1% significance levels, respectively. Therefore, strengthening AANR implementation by enhancing the mediating efficiency of cities' green technology innovations and implementing dynamically differentiated AANR policies in Chinese meso-cities will contribute to the achievement of China's carbon peaking and carbon neutrality targets.

KEYWORDS

accountability audit of natural resources, carbon dioxide emission reduction rate, government concern for the environment, green technology innovation capability, multi-period difference-in-differences model

1 Introduction

Although high-carbon enterprises stagnated worldwide to varying degrees in 2020 due to the COVID-19 pandemic, China's CO_2 emissions were as high as 9.899 billion tons, which is a level far higher than those observed in other regions. According to the World Energy Statistical Yearbook (70th Edition), carbon emissions in the Asia–Pacific region accounted for 52% of total global emissions in 2020, with China accounting for as much as 30.70% of those emissions. Excessive CO_2 emissions destroy the ozone layer, cause global warming, and thus pose a great threat to human security. As the world's largest carbon emitter, China has undertaken many policy measures and actions to reduce carbon emissions. In 2020, the General Secretary of the Communist Party of China (CPC), Jinping Xi, proposed the goal of "achieving a carbon peak by 2030 and carbon neutrality by 2060" (i.e., the "dual carbon" goals). In 2021, the "Opinions on the Complete and Accurate Implementation of the New Development Concept to Achieve Carbon Peak and Carbon Neutrality" and the "Carbon Peaking Action Plan by 2030" were issued. In 2022, the CPC's 20th National Congress report proposed measures to engage in carbon emission and pollution reduction while actively and steadily moving toward carbon neutrality. Although China has made some achievements in reducing carbon emissions since then, there is still much progress to be made to achieve the "dual carbon" goals.

In China's existing environmental governance system, the central government is mainly responsible for formulating policies and providing normative guidance to local governments and enterprises. Local governments, as the intermediary between the central government and enterprises, enable information transmission between those parties. However, local officials are influenced by the traditional idea of "GDP championship," so their long-held practice of sacrificing the environment for GDP growth is difficult to change. Economic development has traditionally been pursued at the expense of environmental resources, and environmental protection has been either verbally guaranteed or not guaranteed at all. In this context, the accountability audit of natural resources (AANR) came into being to force local officials to realize the importance of environmental protection. In 2013, the Third Plenary Session of the 18th CPC Central Committee first proposed the AANR. In 2014, the National Audit Office organized Hubei, Shandong, Inner Mongolia, and other local audit organs to carry out the AANR. China continued to carry out pilot audits in stages from 2015 to 2017. In 2018, the AANR was fully implemented in China when it entered a normalized phase. The auditing authorities evaluate the environmental performance of leading actors using a scientific index system, the results of which serve as an important basis for the assessment, appointment, dismissal, compensation, and punishment of local officials. Specifically, in terms of carbon emissions, the auditing authorities focus on local governments' implementation of major initiatives aimed at achieving carbon peaking and carbon neutrality and scrutinize their formulation and implementation of low-carbon policies, their management and use of low-carbon funds, and the success of low-carbon engineering projects. However, the AANR, which is still in its incipient stages, still faces problems such as unclear delineations of responsibility, difficulty in data extraction, and underdeveloped assessment and evaluation systems (Zhu and Xu, 2022). These make the AANR suboptimal in its current state.

As an institutional innovation in China, the literature on the AANR has mainly focused on its theoretical basis and policy implementation effects. From a theoretical perspective, the existing literature mainly conducts normative research in the context of audit theory (Li and Yin, 2016), audit elements (Liu and Sun, 2016), and audit evaluation indices (Xiong et al., 2022). In terms of policy implementation effects, the existing literature is mostly empirical in nature and examines such factors as economic surplus management (Liu and Xie, 2018), green technology innovation (He and Feng, 2021), environmental information disclosure quality (Zhang and Li, 2021), and environmental investment at the firm level (Huang and Xie, 2022). At the macro level, existing literature investigates the effects of the AANR on urban innovation capability (Fu, 2022), regional environmental governance (Wu et al., 2020), and government officials (Zhu et al., 2022). These research studies affirm the AANR's positive effects. However, Yan et al. (2022) found that the AANR has a significant negative impact on corporate ESG. In addition, Wu et al. (2020) found that the implementation of the AANR has an insignificant impact on exhaust and smog emission improvement. Current interpretations of AANR's potential economic consequences have also not covered the mechanism of AANR's impact on carbon emission reduction efficiency.

There are lots of researchers who study the impact of auditing on carbon emissions. In the case of energy audits, researchers found that they can reduce energy use (Kontokosta et al., 2020) and carbon dioxide emissions from paper mills (Kong et al., 2013). Energy audits even achieve carbon emission reduction by improving energy use efficiency in industrial firms (Thollander et al., 2013; Kluczek and Olszewski, 2017). In terms of environmental auditing, the AANR reduces carbon emissions by utilizing more industrial capacity (Li and Guo, 2022). It also promotes agricultural technological progress to reduce agricultural carbon emission intensity (Liu et al., 2023). Zhao et al. (2022), on the other hand, found that air pollution audits curb carbon emissions but have no effect on carbon emission intensity. In summary, these scholars explore special audits' impacts on carbon emissions. They emphasize that auditing improves energy use efficiency to achieve carbon reduction. Research in the field of economics suggests that R&D for endogenous technological changes improves the effectiveness of the power sector's decarbonization (Jiang et al., 2023). However, there are fewer studies related to the AANR impact on carbon reduction efficiency based on a meso-city perspective.

As such, it remains unclear whether the AANR can reduce China's overall emission reduction rates and, if so, through which mechanisms it can exert its effect. Furthermore, whether and the degree to which the AANR effect varies across cities must also be investigated. This paper systematically assesses the AANR impact on the CO_2 emission reduction rate in pilot cities in China by adopting a multi-period difference in differences (DID) model with CO_2 emissions as the observation object during 2005–2017. The significant advantage of the multi-period DID model is that it treats the AANR as a policy dummy variable to quantify the changing effect of CO_2 reduction rates before and after the AANR implementation in the pilot cities. This can directly induce the potential CO_2 governance effects of the AANR implementation with which this paper is concerned.

This research aims to quantitatively analyze the AANR's externality effects on carbon emission reduction in order to reveal the key mechanisms underlying China's AANR implementation on carbon emission reduction in meso-cities so as to provide a scientific theoretical basis and practical policy support for effectively reducing CO₂ emissions. Our work's innovations are summarized as follows: (1) existing research studies have mainly investigated the AANR's economic consequences at the enterprise level. Research studies on the AANR impact on carbon emissions have mainly focused on improving energy use efficiency to reduce carbon emissions. However, there is limited literature that analyzes in depth the AANR impact on carbon emission reduction efficiency in mesocities in China. This paper expands the scope of research in this area. (2) We investigate whether the AANR impact on cities' carbon emission reduction efficiency varies significantly depending on the superimposed impact of central environmental protection inspections, geographical differences between east-central and western cities, the level of cities' green innovation capability, and the magnitude of financial pressure. It supplements the heterogeneity research on the AANR impact on carbon emission reduction efficiency. (3) This paper further examines the mechanism of the

AANR impact on cities' carbon emission reduction efficiency under the mediation effect of cities' green innovation capability. It enriches the research on the influencing factors of carbon emission reduction efficiency and improves the theoretical basis of this paper's conclusions and policy recommendations. The main contributions of this study include the following two aspects: on the one hand, against the background of the "dual carbon" goals and AANR, this paper investigates the AANR's impact on carbon emissions by constructing a multi-period DID model; on the other hand, it differentiates and reveals the influencing mechanisms in the difference between what the local government "says" and what it "does" with regard to carbon emissions, as represented by cities' green technology innovation capability. This study therefore not only supplements the existing studies but also helps local Chinese governments understand and implement the carbon emission reduction function of the AANR and provides meso-city level ideas and empirical evidence for achieving the "dual carbon" goals in China.

2 Theoretical analysis and hypothesis formulation

CO₂ emissions have negative economic externalities that cannot be regulated by the market mechanism. Thus, the Chinese government has to intervene using its "visible hand." However, there are still problems with the awareness and attitude of Chinese local officials toward CO2 emissions, thereby resulting in insufficient and inefficient policy implementation (Huang and Xie, 2022). After unveiling the AANR pilot project, local governments' appraisal systems have incorporated environmental protection as a mandatory indicator for evaluating Chinese local officials' performance. Based on the "rational man" assumption, local officials will seek to maximize their performance to enhance their own value (Chen, 2023). Local officials realize that their performance is no longer only judged on GDP growth and must now pursue a balance between GDP growth and environmental protection (Huang and Xie, 2022). To this end, local officials will strive to outperform on indicators with clear metrics such as energy conservation and emissions reduction, which are often the focus of auditing authorities. In particular, when local officials' carbon reduction efforts receive positive feedback from the central government, they will be motivated to further reduce carbon emissions and explore new models and pathways to achieving the "dual carbon" goals.

The AANR comprises multiple functions and exerts strong pressure on local governments' carbon emission reduction efforts (Zhu and Li, 2022). First, as an environmental regulation tool, the AANR comprehensively supervises the environmental performance of local officials and holds them accountable while urging the rectification and improvement of lingering problems. By scrutinizing low-carbon policy formulation and implementation, auditing authorities can determine whether local governments and relevant departments have upheld the emission targets. With the help of carbon fund auditing, they can decide whether local governments have misappropriated funds or retained idle carbon. They can also identify whether such projects have effective planning, delayed construction progress, or falsified data by checking the management of low-carbon projects (Li and Guo, 2022). Second, the AANR is characterized by lifelong accountability for ecological and environmental damage. Even if local officials achieve rapid carbon

emission reductions in their jurisdictions during their tenure through campaign-style governance, the auditing authorities will still monitor the subsequent air quality after their departure. This increases government officials' environmental responsibility. Local officials will therefore take effective measures to improve carbon emission governance to reduce their risk of being held accountable. Finally, the AANR reveals the shortcomings of local officials' ecological and environmental governance. In response to the problems identified by the audit, relevant departments can hold local officials accountable and urge them to rectify all aspects of their ecological and environmental governance. Therefore, the AANR ensures the achievement of scheduled CO_2 emission reduction targets.

Based on the above analysis, this paper proposes the following hypothesis:

H1: The implementation of the AANR improves the CO₂ emission reduction rate.

The previous section discusses the AANR impact on the CO_2 emission reduction rate. Next, we examine the AANR's transmission mechanism, which affects the CO_2 emission reduction rate from the perspectives of government's concern for environment and cities' green technology innovation capability.

First, we examine the potential transmission mechanism of the government's concern for the environment. Environmental governance will be focused on areas where the government's attention is directed (Shen et al., 2020). In recent years, China has attached great importance to ecological and environmental governance. The implementation of the AANR suggests that local officials' assessments will incorporate ecological and environmental protection, whether for the sake of personal promotion or exemption from accountability. In the context of carbon peaking and carbon neutrality, carbon reduction has become the key factor in China's ecological development, which will greatly improve the government's attention to environmental considerations. The government's concern for the environment (Wang et al., 2014) provides guidance for local carbon emission reduction efforts to a certain extent. On the one hand, this concern alleviates the possibility of contradictory policy implementations. Local officials often take the initiative to coordinate various departments in finding ways to reduce carbon emissions and improve carbon policy implementation. On the other hand, it sends a signal of the importance of carbon emission reduction and the urgency of attracting significant human, financial, and technological resources to the field of environmental management. As such, it provides an important impetus for carbon emission reduction.

Second, we examine the potential transmission mechanism of cities' green technology innovation capability. Local governments have a significant impact on innovation capability at the regional level (Zhu et al., 2022). After the implementation of the AANR, local governments realized that existing measures to meet environmental regulations, such as shutting down heavily polluting and high-emission enterprises, were undesirable. They also realized that they should encourage and incentivize enterprises in their jurisdictions to engage in green technology innovation (He and Feng, 2021). Local governments generally force enterprises to engage in green technology innovation generalized that subsidies. Improving cities' green technology innovation can reduce CO_2 emissions (Wang et al., 2019). It reduces regional carbon emissions through improved green production methods,

specialized division of labor, and cost savings. It also eliminates high-emission enterprises, improves energy efficiency, and reduces fossil energy consumption through industrial reconstruction and other means, thereby reducing carbon emissions (Gu et al., 2022).

Therefore, this paper proposes the following hypothesis:

H2: The AANR improves the CO_2 emission reduction rate by increasing the government's concern for the environment as well as cities' green technology innovation capability.

3 Research design

3.1 Sample and data sources

This paper uses the panel data of 271 prefecture-level cities across China from 2005 to 2017 as the research object. Because of the lack of a control group in 2018, when all cities implemented the AANR, it does not contain data from 2018 and beyond. We manually collected and verified pilot cities' data through official web pages, media reports, and the China Audit Yearbook. Twenty-six cities began implementing the AANR in 2014. Thus, we chose 2014 as the AANR reference year. We also calculated the CO2 emission reduction rate based on China's county-level carbon emission data in China's Carbon Accounting Database (CEAD) from 2005 to 2017. The texts of the government's work reports are taken from the official website of each city. China's Urban Statistical Yearbook and provincial statistical yearbooks offer the number of cities' green invention data. Data for control variables are from the CSMAR database. The EPS DATA database and the Chinese Research Data Services Platform (CNRDS) provide supplementary information.

This paper excludes regions with serious missing variable data and fills in some missing data by forward or backward interpolation. Finally, we obtained a total of 3,523 observations from 2005 to 2017, including 305 in the treatment group and 3,218 in the control group. To avoid the influence of extreme values on the results, we apply winsorization at the 1% and 99% levels on all continuous variables. In addition, we adjust the standard errors of all regression models for clustering at the city level.

3.2 Model setting and variable description

The impact of the implementation of the AANR on cities' CO_2 emission reduction rates may originate from policy- or time-generated effects. Accordingly, we must correctly measure the AANR's net policy effect on cities' CO_2 emission reduction rates. Here, we divide China's 271 prefecture-level cities into treatment and control groups according to whether they have implemented the AANR. The multi-period DID model is set as

$$Y_{it} = \alpha_0 + \beta_1 Audit_{it} + \phi X_{it} + \mu_i + \lambda_t + \varepsilon_{it}, \qquad (1)$$

where Y_{it} is the dependent variable (i.e., the CO₂ emission reduction rate of each city), *i* represents the city and *t* represents time, α_0 is the intercept term, and Audit_{it} is the key explanatory variable representing the interaction between the pilot city and time dummy variables. It indicates the net effect of AANR's implementation. X_{it} represents the control variables, μ_i is the city-fixed effect, λ_t is the time-fixed effect, and ε_{it} is the disturbance term. The coefficient β_1 of Audit_{it} measures the AANR's net effect on cities' CO₂ emission reduction rates. β_1 is negative if the AANR accelerates the growth of CO₂ emissions. Conversely, β_1 is positive if the AANR reduces the growth of CO₂ emissions.

(1) Explanatory variable. The CO_2 emission reduction rate (*Y*) is the opposite of the CO_2 emission growth rate, which is given by

$$Y_{it} = -\frac{E_{it} - E_{i(t-1)}}{E_{i(t-1)}},$$
(2)

where E_{it} and $E_{i(t-1)}$ denote the city's carbon emissions in years t and t-1, respectively. Eq. 2 calculates the carbon emission change in year t relative to year t-1. If carbon emissions in year t increase, Eq. 2 implies a negative carbon dioxide emission reduction rate; otherwise, Eq. 2 is positive. Eq. 2 illuminates each year's carbon emission increase or decrease along the time axis. It facilitates the following testing of the AANR's policy effects.

- (2) Explanatory variable. *Audit* is the key explanatory variable, which represents the interaction between the pilot city and time dummy variables. It takes the value of one when the pilot city starts to implement the AANR and thereafter; otherwise, it takes the value of zero.
- (3) Mediating variables. The government's work reports reflect the importance of government in environmental management. Hence, the total word count of "emission reduction," "low carbon," "CO₂," "energy consumption," "air," and "ecology" in the local government's work reports indicates their concern for the environment (*Gov*). The cities' green technology innovation capability (*Inno*) is the logarithm of the number of green inventions obtained in year +1.
- (4) Control variables. To ensure the accuracy of empirical results, we introduce other control variables that may affect CO₂ emissions into the multi-period DID model by referring to the existing literature (Xue et al., 2022). These variables include fiscal status (*Finance*), which is expressed as the ratio of general revenues to general expenditures; population density (*Lnpopd*), which is obtained by dividing the household population by the land area of cities' administrative region; economic development (*Lnpgdp*), as expressed by the logarithm of GDP *per capita*; the level of foreign investment (*Lnfdi*), which is the logarithm of the amount of actual foreign direct investment utilized at the end of the year; and industrial structure indicator (*Indust*), which is the ratio of secondary industry GDP to total GDP. The variable descriptions are summarized in Table 1.

4 Empirical results

4.1 Descriptive statistical analysis of variables

Table 2 shows the descriptive statistics of the variables. The minimum and maximum values of the CO_2 emission reduction

Variable type	Variable name	Variable meaning	Description
Dependent variable	Y	CO ₂ emission reduction rate Opposite of the CO ₂ emission growth rate	
Independent variable	Audit	AANR	A dummy variable that is 0 before a city starts to implement the AANR and 1 otherwise (i.e., the observing city has started to implement the AANR)
Mediating variable	Gov	Government carbon environmental concern	Total word count of "emission reduction," "low carbon," " CO_2 ," "energy consumption," "air," and "ecology" in local governmental work reports
	Inno	Cities' green innovation capability	This paper takes the logarithm of the number of green inventions obtained in the current year +1 as a proxy for cities' green technology innovation
Control variable	Finance	Fiscal status	Ratio of local fiscal general revenues to local fiscal general expenditures
	Lnpopd	Population density	Ratio of household registration population to the land area of an administrative region
	Lnpgdp	Economic development level	Logarithm of GDP per capita
	Lnfdi	Foreign investment level	Logarithm of the actual amount of foreign direct investment at the end of the year
	Indust	Industrial structure	Ratio of secondary industry GDP to total GDP.

TABLE 1 Variable information. All variables are extracted and transformed according to their descriptions.

TABLE 2 Descriptive statistics of variables.

Variable	Observed	Mean	Standard deviation	Minimum	Maximum
Y	3,523	-0.061	0.072	-0.295	0.102
Audit	3,523	0.087	0.281	0.000	1.000
Gov	3,523	15.372	11.191	0.000	79.000
Inno	3,523	2.116	1.713	0.000	8.845
Finance	3,523	0.491	0.224	0.125	1.047
Lnpopd	3,523	5.777	0.853	2.896	7.138
Lnpgdp	3,523	10.286	0.721	8.628	11.888
Lnfdi	3,523	11.670	1.834	6.542	15.657
Indust	3,523	0.487	0.101	0.208	0.730

rate (Y) are -29.50% and 10.20%, respectively, with a mean value of -6.10% and a standard deviation of 7.20\%. This infers that there is a large gap in the CO₂ emission reduction rate among cities. The mean of *Audit* is 0.087, which indicates that 8.70% of the cities are affected by the AANR. The descriptive statistics of other variables also illustrate the large differences among cities.

The mean of the carbon reduction rate before the implementation of the AANR (i.e., prior to 2014) was -0.065, which is much smaller than the mean value (-0.015) after the implementation of the AANR (i.e., 2014 and beyond). A variety of factors affect carbon reduction rates, one of which may increase the rate while another may decrease it. It is not possible to directly quantify from Figure 1 that the implementation of the AANR has enhanced the carbon reduction rate. Nevertheless, this does not affect our rough inference that hypothesis H1 is valid from the observations before and after the implementation of the AANR.

4.2 Correlation and multicollinearity analysis among variables

The variable correlations are shown in Table 3. The correlation coefficients of most variable pairs are below 0.50. The correlation between *Audit* and *Y* is 0.194 and is statistically significant. This preliminarily verifies Hypothesis H1. In addition, we perform a variance inflation factor (VIF) test on the variables. The average VIF is 2.15, and the maximum is 3.50, which is much less than 10. The test result indicates that there is no multicollinearity among variables.

4.3 Basic regression analysis of the AANR effect on the CO_2 emission reduction rate

Table 4 illustrates the AANR effect on the CO_2 emission reduction rate by fitting the DID model (1). Model (1) in Table 4



FIGURE 1

Trends in carbon reduction rates. The black scatters indicate the carbon reduction rate for cities where the AANR is not implemented. Red color scatters are the carbon reduction rates of cities that have implemented the AANR.

TABLE 3 Correlation coefficients among variables.

	Y	Audit	Gov	Inno	Finance	Lnpopd	Lnpgdp	Lnfdi	Indust
Y	1								
	(NA)								
Audit	0.194***	1							
	(11.73)	(NA)							
Gov	0.186***	0.210***	1						
	(11.23)	(12.75)	(NA)						
Inno	0.363***	0.254***	0.256***	1					
	(23.12)	(15.58)	(15.71)	(NA)					
Finance	0.019	-0.015	0.062***	0.574***	1				
	(1.13)	(-0.89)	(3.69)	(41.59)	(NA)				
Lnpopd	0.068***	-0.012	-0.045***	0.428***	0.436***	1			
	(4.04)	(-0.71)	(-2.67)	(28.10)	(28.75)	(NA)			
Lnpgdp	0.424***	0.253***	0.298***	0.714***	0.611***	0.179***	1		
	(27.78)	(15.52)	(18.52)	(60.51)	(45.80)	(10.80)	(NA)		
Lnfdi	0.189***	0.059***	0.091***	0.663***	0.661***	0.490***	0.595***	1	
	(11.42)	(3.51)	(5.42)	(52.55)	(52.27)	(33.35)	(43.93)	(NA)	
Indust	-0.011	-0.081***	-0.011	0.000	0.298***	0.188***	0.300***	0.117***	1
	(-0.65)	(-4.82)	(-0.65)	(0.00)	(18.52)	(11.36)	(18.66)	(6.99)	(NA)

***, **, and * denote significance at the 1%, 5%, and 10% levels, respectively. The result is the output of the Stata command "pwcorr_a." The variables have correlation coefficients of 1s with themselves, so the t-statistics for the correlation coefficients on the main diagonal do not exist. We identify this as "NA."

shows the regression results for the key explanatory variable Audit only. The estimated coefficient of Audit is significantly positive at the 5% significance level, thus indicating that the

AANR significantly improves the CO_2 emission reduction rate in the pilot cities. It verifies Hypothesis H1. Models (2) to (6) are the regression results after gradually adding control

Variable	Model (1)	Model (2)	Model (3)	Model (4)	Model (5)	Model (6)
Audit	0.009**	0.008**	0.009**	0.001**	0.001**	0.001**
	(2.29)	(2.26)	(2.34)	(2.57)	(2.57)	(2.57)
Finance		0.027**	0.027**	0.034***	0.034***	0.035***
		(2.53)	(2.50)	(3.06)	(3.05)	(3.07)
Lnpopd			-0.078***	-0.074***	-0.074***	-0.074***
			(-3.39)	(-3.21)	(-3.20)	(-3.29)
Lnpgdp				-0.014**	-0.014**	-0.009
				(-2.28)	(-2.12)	(-1.09)
Lnfdi					-0.000	-0.000
					(-0.14)	(-0.11)
Indust						-0.031
						(-1.11)
Constant	-0.061***	-0.074***	0.377***	0.494***	0.500***	0.458***
	(-191.62)	(-14.08)	(2.86)	(3.52)	(3.54)	(3.05)
City	YES	YES	YES	YES	YES	YES
Time	YES	YES	YES	YES	YES	YES
Observed value	3,523	3,523	3,523	3,523	3,523	3,523
Adjusted R ²	0.667	0.668	0.669	0.670	0.670	0.670

TABLE 4 Effects of the AANR on the CO₂ emission reduction rate versus different control variables.

***, **, and * denote significance at the 1%, 5%, and 10% levels, respectively. Robust t-statistics are in parentheses.

variables to Model (1). The estimated coefficients of *Audit* are still significantly positive at the 5% significance level, which further illustrates that the AANR dramatically improves the CO_2 emission reduction rate in the AANR pilot cities.

4.4 Robustness tests

4.4.1 Parallel trend test

The previous results suggest that the AANR improves the CO_2 emission reduction rate, but an important prerequisite for the DID model's results to hold is that the cities in the treatment and control groups must have the same trend in CO_2 emission reduction before AANR implementation. To verify this, this paper adopts the event analysis method to conduct a parallel trend test. The regression model of the parallel trend test is set as follows:

$$\begin{split} \Upsilon_{\rm it} &= \alpha_0 + \sum_{n=-3}^{-2} \beta_n {\rm pre}_n \times quota + \sum_{n=0}^{3} \beta_n {\rm post}_n \times quota + \phi {\rm X}_{\rm it} + \mu_i \\ &+ \lambda_t + \varepsilon_{\rm it}, \end{split}$$
(3)

where pre_n and $post_n$ are year dummy variables that denote the *n*th year before or after AANR implementation and take the value of 1 for pilot cities; otherwise, they are 0. Then, they are multiplied by *quota*, whose value is 1 for AANR pilot cities and 0 for non-AANR pilot cities.

In regression model (3), we choose the first period before the AANR implementation as the base period in the DID model. We also truncate the number of periods before AANR implementation as necessary. None of the estimated coefficients on β_n are significant before the implementation of the AANR (Table 5). This reflects that there is no significant difference in the CO₂ emission reduction rate between the treatment and control groups. After the AANR pilot, the estimated coefficients on β_n are roughly significant (Table 5). The CO₂ emission reduction rate of the treatment group is substantially higher than that of the control group. These results confirm the parallel trend hypothesis. In the third year after AANR implementation, the coefficients on β_n are significantly negative (Figure 2), which is likely due to related policies that have led to the diminishing influence of the government's "visible hand" and the increasing role of market mechanisms. However, this finding represents a research direction worthy of further investigation (Hu and Wang, 2022).

4.4.2 Placebo test I: setting up random control and treatment groups

The sample contingency or other factors may also lead to a significant effect on the AANR. To verify whether the effect of the AANR is real, this paper utilizes Stata 16.0 software to randomly sample the treatment and experimental groups for a placebo test. We repeat this process 5,000 times. Figure 3 implies that the distribution of the treatment effect estimates based on random sampling is approximately normally distributed with a mean value of 0. The

sted R^2	0.671	
e Adju		
erved sample	3,523	
Obse		
st ₃ × <i>quota</i>	-0.018** (-2.23)	
bo		
post ₂ × quota	0.024^{***} (3.13)	
×quota	.016** (2.47)	
post ₁	0.01	theses.
post ₀ × quota	0.006 (1.17)	bust t-statistics are in paren
pre2 × <i>quota</i>	0.004 (1.44)	nd 10% levels, respectively. Ro
pre_ 3 × quota	-0.002 (-0.40)	***, **, and * denote significance at the 1%, 5%, and 10% levels, respectively. Robust t-statistics
	Coefficient	***, **, and * denote

2

FABLE 5 Parallel trend test results for regression model

estimated AANR coefficients are dramatically different from those of the basic regression (approximately 0.009), as shown in Table 4. Therefore, the placebo test holds that the effect of the AANR on the CO_2 emission reduction rate is not significantly influenced by potential unobserved random factors. Thus, the reliability of the fitting results in Table 4 is further verified.

4.4.3 Placebo test II: changing the AANR implementation timing

We advance the AANR occurrence timing by 5, 4, and 3 years and rerun the regressions. The results are Models (1), (2), and (3) in Table 6. The estimated coefficients of *F5.Audit*, *F4.Audit*, and *F3.Audit* are statistically nonsignificant, indicating no effects from other unobservable variables. Thus, the benchmark results in Table 4 are robust. In China, the AANR is implemented on a yearly basis. The AANR exerts the greatest deterrent pressure on local officials in the observing year of censorship. The results in Table 6 are consistent with this fact.

4.4.4 Excluding the influence of extreme values

We continue to re-estimate the multi-period DID model with upper and lower 5% tailing for all continuous variables. The results are shown in Model (4) of Table 6. The AANR coefficient estimates are still markedly positive at the 5% significance level, and the magnitude is comparable to the basic regression coefficient estimates in Table 4. This somewhat verifies the reliability of the benchmark results.

4.4.5 Excluding interference from other factors

Since 2012, China has attached great importance to its ecological development and introduced a number of environmental governance policies in pursuit of this goal. Rationally, it must be determined whether the CO₂ emission reduction rate will be affected by related policies during the AANR pilot period. From 2016 to 2017, China continually carried out environmental protection inspections in 31 provinces and cities, whose implementation targets overlapped with those of the AANR to some extent (Huang and Xie, 2022). To exclude the interference of the same type of policy on the CO₂ emission reduction rate, this paper includes the environmental protection inspection variable (Inspect) in the multi-period DID regression model. If environmental protection inspection is conducted in the observing year, Inspect takes the value of 1 thereafter; otherwise; it takes the value of 0. Model (5) in Table 6 shows the fitting results. The estimated coefficient on the AANR pilot (Audit) is still significantly positive. Therefore, the fitting results of basic regression (1) in Table 4 remain robust.

5 Further analyses

5.1 Mechanism tests

The basic regressions (Table 4) and a series of robustness tests (Tables 5, 6; Figures 2, 3) suggest that the implementation of the AANR increases the cities' CO_2 emission reduction rate. However, we are yet to determine through which mechanism the AANR improves the cities' CO_2 emission reduction rate. We scrutinize the





impact of the AANR pilot on the CO_2 emission reduction rate from two perspectives: the government's concern for the environment and cities' green technology innovation capability. Drawing upon

the existing literature (Wen and Ye, 2014), we test these potential mechanisms by applying the mediating effect, as shown in Eq. 1 and Eqs 4, 5:

Variable	Model (1)	Model (2)	Model (3)	Model (4)	Model (5)
F5.Audit	0.000				
	(0.09)				
F4.Audit		0.005			
		(0.96)			
F3.Audit			0.004		
			(0.91)		
Audit				0.008**	0.009**
				(2.57)	(2.52)
Inspect					0.024***
					(6.44)
Finance	0.047***	0.051***	0.040***	0.029***	0.035***
	(3.38)	(3.58)	(3.11)	(2.94)	(3.05)
Lnpopd	-0.122**	-0.098**	-0.069*	-0.058***	-0.077***
	(-2.55)	(-2.04)	(-1.94)	(-3.15)	(-3.43)
Lnpgdp	-0.007	-0.016	-0.008	-0.014**	-0.010
	(-0.58)	(-1.42)	(-0.80)	(-2.17)	(-1.24)
Lnfdi	-0.003	-0.004^{*}	-0.003*	0.002	-0.000
	(-1.65)	(-1.73)	(-1.73)	(1.26)	(-0.17)
Indust	-0.139***	-0.118***	-0.075*	0.001	-0.028
	(-3.29)	(-2.65)	(-1.97)	(0.58)	(-1.02)
Constant	0.760**	0.711**	0.456*	-0.022	0.482***
	(2.37)	(2.24)	(1.90)	(-1.02)	(3.22)
City	YES	YES	YES	YES	YES
Time	YES	YES	YES	YES	YES
Observed sample	2,168	2,439	2,710	3,523	3,252
Adjusted R ²	0.606	0.573	0.583	0.723	0.671

TABLE 6 Robustness test results. Models (1), (2), and (3) are the result of placebo test II. Models (4) and (5) describe the effects of the AANR when excluding the influence of extreme values and interference from other factors, respectively.

***, **, and * denote significance at the 1%, 5%, and 10% levels, respectively. Robust t-statistics are in parentheses.

$$Gov_{it}(Inno_{it}) = b_1 + \beta_2 Audit_{it} + \phi X_{it} + \mu_i + \lambda_t + \varepsilon_{it}, \qquad (4)$$

$$\Upsilon_{it} = b_2 + \beta_3 Audit_{it} + \beta_4 Gov_{it} (Inno_{it}) + \phi X_{it} + \mu_i + \lambda_t + \varepsilon_{it}.$$
 (5)

Table 7 shows the regression results of the mediating effect model. Models (1) and (3) show that the coefficient estimates of the AANR (*Audit*) are significantly positive at the 5% and 1% levels. This indicates that the AANR significantly increases the government's concern for the environment and enhances cities' green technology innovation capability. The coefficient estimate of Gov in Model (2) of Table 7 is statistically nonsignificant. Furthermore, the Sobel test results show that the government's concern for the environment as a mediating variable is not significant. It implies no mediating significance of the local government's concern for the environment on the CO_2 emission reduction rate. The possible

reason for this finding lies in the AANR, as a newly introduced policy, being more likely to convey a new value tendency. However, due to limited cognition, a clear action roadmap has not yet been developed (Yang, 2016). Model (4) in Table 7 shows that the coefficient estimate on *Inno* is significantly positive at the 1% significance level. This verifies the mediating effect of cities' green technology innovation capability on the CO_2 emission reduction rate. In other words, when facing various environmental performance assessment pressures or promotion incentives brought about by the AANR, local officials will strengthen the CO_2 emission reduction rate by engaging in green technology innovations. We conclude that the affecting mechanism of the government's concern for the environment in H2 does not hold, while that of cities' green technology innovation capability holds. TABLE 7 Mechanism test results. Models (1) and (2) scrutinize the mediating effect of the government's concern for the environment (Gov), while models (3) and (4) show the mediating effect of the cities' green technology innovations (*Inno*).

Variable	Model (1)	Model (2)	Model (3)	Model (4)
	Gov	Y	Inno	Y
Audit	2.239***	0.010**	0.160***	0.009**
	(2.61)	(2.50)	(2.69)	(2.31)
Gov		0.000		
		(0.85)		
Inno				0.006***
				(4.65)
Finance	-2.382	0.035***	0.043	0.034***
	(-0.85)	(3.09)	(0.21)	(3.10)
Lnpopd	8.330*	-0.075***	1.250*	-0.083***
	(1.72)	(-3.32)	(1.95)	(-3.63)
Lnpgdp	7.735***	-0.009	-0.032	-0.008
	(4.19)	(-1.16)	(-0.21)	(-1.08)
Lnfdi	-0.290	-0.000	-0.016	-0.000
	(-1.13)	(-0.10)	(-0.76)	(-0.04)
Indust	-4.179	-0.031	-1.024**	-0.025
	(-0.81)	(-1.10)	(-2.09)	(-0.89)
Constant	-105.929***	0.466***	-4.131	0.484***
	(-3.30)	(3.10)	(-1.04)	(3.24)
City	YES	YES	YES	YES
Time	YES	YES	YES	YES
Observed value	3,523	3,523	3,523	3,523
Adjusted R2	0.373	0.697	0.901	0.672

***, **, and * denote significance at the 1%, 5%, and 10% levels, respectively. Robust t-statistics are in parentheses.

5.2 Heterogeneity analysis

5.2.1 Cities' geographical heterogeneity when conducting the AANR

The full sample is divided into east-central and western cities' subsamples by geographical location. From models (1) and (2) in Table 8, we find that in the western cities, the implementation of the AANR significantly increases the CO2 emission reduction rate in the pilot cities. In contrast, in the east-central cities, the positive effect of the AANR on the CO_2 emission reduction rate is not significant. In particular, the western cities show a 1.70% increase in the CO₂ emission reduction rate compared to the pre-AANR pilot. The reason for this finding may be that the level of development in the east-central cities is much higher than that in the western cities. This also means that carbon abatement costs are higher in the east-central cities (Jiang et al., 2023). Economic growth in the east-central cities also brings about problems associated with resource consumption and carbon emissions. The governments in the east-central cities may have also realized the importance of environmental protection before those in the western cities. Before the implementation of the AANR, officials in the east-central cities may have already started to deal with pollution problems arising from carbon emissions; thus, the impact of the AANR on the CO_2 emission reduction rate is not significant. In contrast to the east-central cities, the western cities have been slower to develop, and local officials may still be developing the economy at the expense of the environment. However, the implementation of the AANR has sounded an alarm for officials in the western cities. Local governments are forced by strong administrative pressure to increase environmental controls to reduce the CO_2 emission growth rate. In a word, the AANR has a significant effect on the CO_2 emission reduction rate in the western pilot cities.

5.2.2 Cities' fiscal pressure heterogeneity when conducting the AANR

The difference between local fiscal expenditures and local fiscal revenues is divided by local fiscal revenues, which represents fiscal pressure. We define the sample below the median of the fiscal pressure as low fiscal pressure; otherwise, it is high fiscal pressure. Then, the full sample is divided into

Model (1) Model (2) Model (3) Model (4) Y (east-central) Y (west) Y (high) Y(low) Audit 0.001 0.017** 0.029*** -0.000(0.22)(2.22)(4.29)(-0.05)0.089*** Finance 0.027** 0.046 0.002 (1.29)(0.12)(2.49)(3.23)-0.075*** -0.064 -0.136* -0.043 Lnpopd (-3.20)(-1.26)(-1.91)(-1.60)-0.001-0.028-0.028-0.009Lnpgdp (-0.06)(-1.40)(-1.58)(-0.72)Lnfdi 0.000 0.000 -0.002-0.001(0.10)(0.15)(-0.92)(-0.23)-0.064** 0.007 -0.034Indust -0.067(-2.00)(0.13)(-0.78)(-)-1.34)0 413*** 0 5 1 6 0.998* Constant 0 341* (1.53)(1.98)(1.75)(2.67)YES YES YES YES City YES YES YES Time YES Observed value 982 2,587 936 1,751 Adjusted R² 0.657 0.753 0.787 0.687

TABLE 8 Results of the heterogeneity analyses. Models (1) and (2) depict cities' geographical heterogeneity. Models (3) and (4) represent the heterogeneity effects of cities' fiscal pressure.

***, **, and * denote significance at the 1%, 5%, and 10% levels, respectively. Robust t-statistics are in parentheses.

high- and low-fiscal pressure subsamples. In the pilot cities with high fiscal pressure, the AANR significantly increases the CO_2 emission reduction rate by 2.90% compared to the pre-AANR pilot (Model (3) in Table 8). In contrast, the effect of the AANR on the CO_2 emission reduction rate is not significant in the pilot cities with low fiscal pressure (Model (4) in Table 8). One possible reason for this may be that officials in cities with high fiscal pressure focus on developing the regional economy, while cities with low fiscal pressure had sufficient financial resources to support carbon emission management activities before the AANR pilot. When implementing the AANR pilot, officials in the regions with high fiscal pressure started focusing on ecological management due to the incentive mechanisms and inspection pressures induced by the AANR, thus reducing CO_2 emissions.

6 Conclusion and discussion

6.1 Conclusion

This paper analyzed the panel data of China's 271 cities from 2005 to 2017 to explore the effect of the AANR on the CO_2 emission reduction rate. The AANR is used as a quasi-natural experiment to apply the multi-period DID model to empirically

scrutinize the AANR's CO2 emission reduction effect. Furthermore, a mediation model is adopted to verify the mechanism by which AANR affects CO₂ emissions. The main findings are as follows: first, the AANR significantly increases the CO₂ emission reduction rate. This result still holds after a series of robustness tests. The AANR is a top-down national ecological and environmental governance policy in China. Although it does not point to decarbonization alone, the empirical results confirm the AANR's positive externality on CO2 reduction. Second, the mechanism analysis shows that improving cities' green technology innovation capability is the main mediating mechanism through which the AANR improves the CO₂ emission reduction rate in pilot cities. The AANR has limited positive externality that directly contributes to CO₂ emission reduction in cities, and the wind vane effect of the AANR policy guides cities to innovate green technologies. High-carbon emitting segments will gradually complete the "trade-in," thus giving rise to the cities' CO2 emission reduction. There is no sufficient source of evidence to suggest that the AANR increases the CO₂ emission reduction rate through the government's concern for the environment. Third, the heterogeneity analysis suggests that the AANR plays a more vital role in China's western cities and cities with high fiscal pressure. The economies of cities in eastcentral China are more scalable and more costly in terms of carbon emission reduction. Therefore, the AANR's policy effect has stronger inertia. In addition, cities with high financial pressure tend to do well in AANR policy performance to relieve such pressure. This will send a positive signal to society and help obtain financial support.

6.2 Discussion

The following policy implications emerge from this research: first, the AANR improves the CO₂ emission reduction rate and implies that in the context of carbon peaking and carbon neutrality, all Chinese government departments should pursue both central and local carbon emission reduction strategies; establish a scientific carbon governance, analysis, and evaluation system; widen the scope of the AANR; and enhance local officials' awareness of their carbon emission-related responsibilities. Second, AANR's CO2 emission reduction effect mainly comes from the mediating effect of cities' green technology innovations and indicates that local governments should increase financial subsidies, technology subsidies, and tax preferences to mobilize enterprises to engage in green technology innovations while accelerating the innovation platform construction, actively cultivating innovative talent, and promoting the transfer and transformation of innovative technologies to enhance cities' low-carbon soft power. With the goals of reducing trust and financing costs at both ends of the green technology innovation capital and advancing the efficiency of meso-cities' green technology innovation mediation, China will gradually build more low-carbon cities through AANR implementation. Third, for cities in east-central and western China and cities with different fiscal pressures in applying the AANR for carbon emission reduction, local governments should implement dynamic and differentiated AANR policies, taking into account the cities' developmental characteristics and local conditions in a coordinated manner. It is due to the fact that most enterprises in a city have not adopted sustainable business models and do not prioritize endogenous green technological changes driven by research and development (R&D), thus leading to inefficient carbon emission management. Chinese cities should also develop appropriate audit content and standards so that the effect of the AANR is enhanced.

Currently, there are many studies on policy evaluation. However, few studies have evaluated the effect of the AANR on CO₂ emissions reduction. The most important contribution of this study is its quantitative evaluation of the effect of the AANR on CO2 emission reduction in China using a multi-period difference-in-differences model. One limitation is that only 271 cities were selected for the research sample due to data limitations. Although limited by the availability of data, the results of this paper provide a quantitative complement for the AANR to assist China in reaching its carbon peaking and carbon neutrality targets. Future research should use a broader sample to deepen our understanding of the effectiveness of the AANR. In addition, this study can be regarded as the first step in analyzing the AANR policy impact on carbon emission reduction. Future research can also investigate the mechanisms in the implementation of the AANR on corporate social responsibility, green innovation, and even business model innovations.

Data availability statement

The raw data supporting the conclusion of this article will be made available by the authors, without undue reservation.

Author contributions

LX and YS: conceptualization, data curation, formal analysis, investigation, methodology, software, validation, visualization, and writing–original draft. XL: conceptualization, data curation, funding acquisition, investigation, methodology, project administration, validation, and writing–review and editing.

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Conflict of interest

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

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