

# The role of environmental regulation, industrial upgrading and resource allocation on foreign direct investment: Evidence from 276 Chinese cities

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## Research Article

**Keywords:** Environmental regulation, Foreign direct investment, Industrial upgrading, Resource allocation, Spatial Durbin model

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1 **The role of environmental regulation, industrial upgrading and resource**  
2 **allocation on foreign direct investment: Evidence from 276 Chinese cities**

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11 **Abstract**

12 Environmental pollution is becoming more and more prevalent in China, accompanied by the excessive  
13 expansion of the country's foreign direct investment in the scale of resource-based industries. This  
14 article uses the panel data of 276 prefecture-level cities in China from 2003 to 2016 to estimate the  
15 impact of environmental regulation on foreign direct investment by employing the Spatial Durbin  
16 model. The empirical results show that: *firstly*, environmental regulation, and foreign direct investment  
17 have an obvious spatial correlation. *Secondly*, environmental regulation significantly inhibits foreign  
18 direct investment and has significant negative space spillover. *Thirdly*, non-eastern cities'  
19 environmental regulation has significantly greater inhibitory effects on foreign direct investment than  
20 eastern cities, and the key cities' environmental regulation has greater inhibitory effects than ordinary  
21 cities. *Finally*, from the perspective of industrial upgrading and resource configuration, environmental  
22 regulation has significantly promoted foreign direct investment and have significant negative space  
23 spillovers. Therefore, the reasonable use of environmental regulatory measures through industrial  
24 upgrading and resource configuration to attract clean, capital-intensive and technology-intensive  
25 enterprises and to achieve the effect of "decontamination and clean" for foreign-funded enterprises is  
26 critical.

27 **Keywords:** Environmental regulation; Foreign direct investment; Industrial upgrading; Resource  
28 allocation; Spatial Durbin model

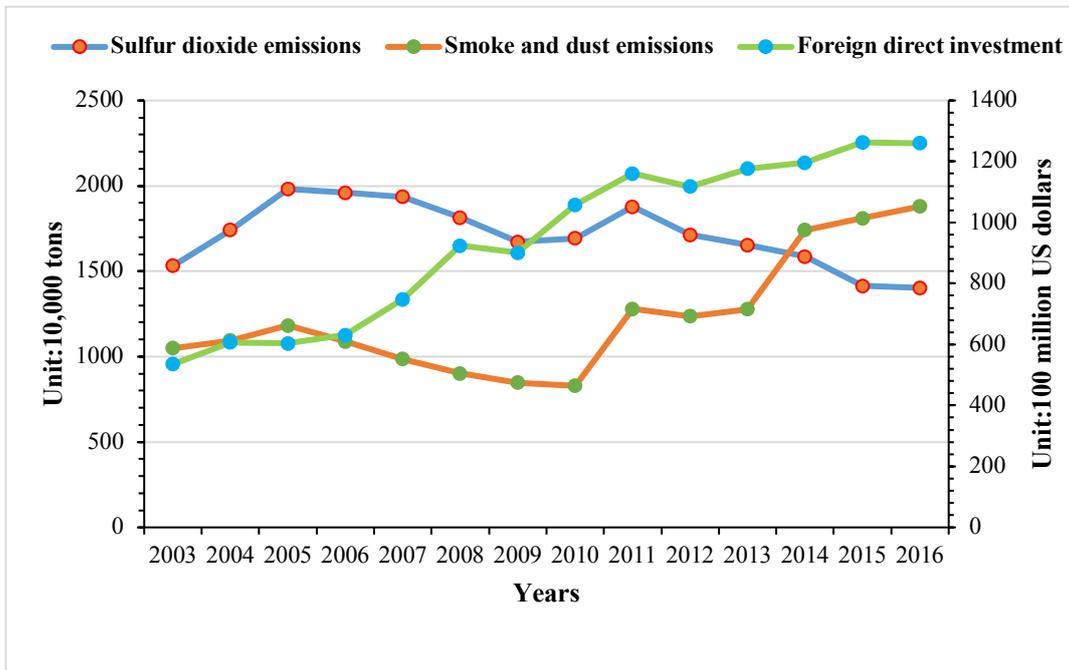
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29 **1. Introduction**

30 Since the reform and opening up, China has achieved world-renowned economic achievements.  
31 However, the traditional extensive development model, that is, to undertake industrial transfer from  
32 developed countries, has brought high environmental costs. In addition to the call for "green water and  
33 green mountains are golden mountains and silver mountains", the most stringent "Environmental  
34 Protection Law of the People's Republic of China" has also been revised and put forward by the  
35 Chinese government to realize the harmonious unity of economic development and ecological  
36 civilization. Most scholars have always regarded foreign direct investment (FDI) as one of the  
37 important reasons for the rapid growth of China's economy and the rapid improvement of production  
38 technology (Blalock et al., 2008). However, with the excessive expansion of foreign direct investment  
39 in the scale of resource-based industries, the problem of environmental pollution has become more and  
40 more worrying (Miao et al., 2019). From 2003 to 2016, China's sulfur dioxide emissions decreased  
41 from 1531.71 to 1402.5 kilo-tons, smoke and dust emissions increased from 1049 to 1879.1 kilo-tons,  
42 and foreign direct investment soared from 535.05 to 1260.01 million US dollars (see Fig. 1). Therefore,  
43 how to reasonably use environmental regulations to restrict the inflow of high-polluting foreign-funded  
44 enterprises and how to effectively attract the inflow of clean, capital-intensive and technology-intensive  
45 foreign-funded enterprises has important practical and theoretical significance.



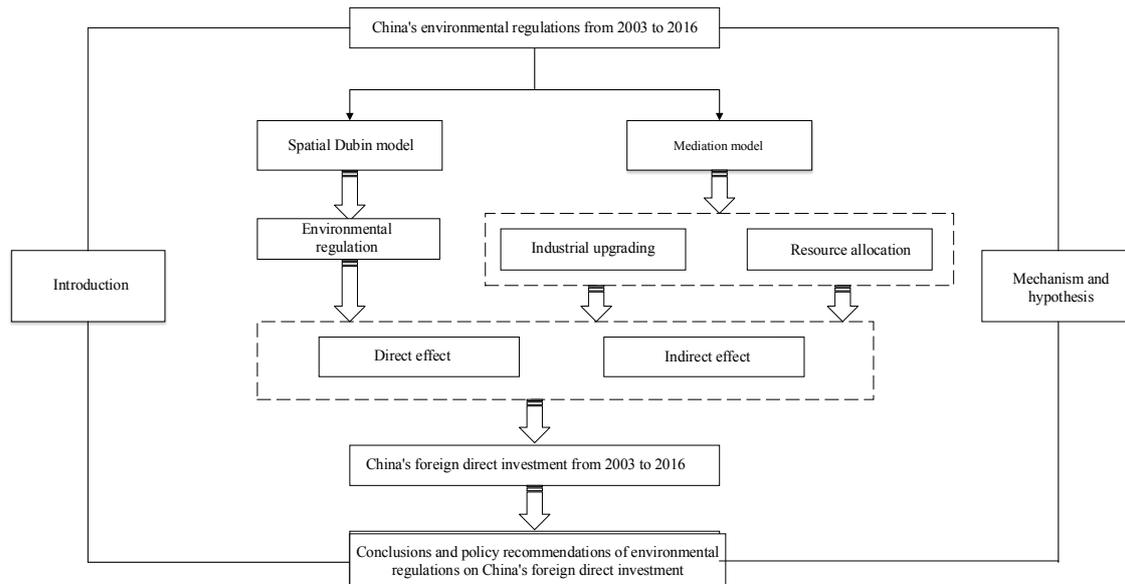
46  
47 **Fig. 1** Trends of environmental pollution and foreign direct investment

48 At present, the research topics of environmental regulation and foreign direct investment are  
49 considered by scholars at home and abroad to have the following two viewpoints. On the one hand, in  
50 order to concentrate on the development of core industries in the country and keep the core industries  
51 in the leading position in the global industrial chain, the "pollution paradise" hypothesis holds that

52 high-pollution, high-energy-consuming industries are transferred from countries with more developed  
53 economies and stricter environmental standards to countries with less developed economies and less  
54 stringent environmental standards. Later, as less developed countries' economic strength and  
55 environmental protection standards continue to increase, industries with high pollution and high energy  
56 consumption will continue to shift to countries with weaker environmental regulations. On the other  
57 hand, the "pollution halo" hypothesis stipulates that foreign-funded enterprises with a higher level of  
58 production technology will have technology spillover effects on enterprises in the host country.  
59 Enterprises in the host country move towards an environment-friendly development model by  
60 improving production technology, adjusting the industrial structure, and improving resource allocation  
61 efficiency. At present, there is abundant literature on research topics of environmental regulation and  
62 foreign direct investment at home and abroad. However, based on the panel data of prefecture-level  
63 cities and from the perspective of industrial upgrading and resource allocation, there are relatively few  
64 documents discussing the impact of environmental regulations on foreign direct investment.

65 The possible marginal contributions of this paper are as follows. *First*, according to the panel data  
66 of 276 prefecture-level cities in China from 2003 to 2016, the impact of environmental regulations on  
67 foreign direct investment has been empirically analyzed through the spatial Dubin model. *Second*, the  
68 sample of prefecture-level cities is divided into eastern cities and non-eastern cities, ordinary cities and  
69 key cities for heterogeneity analysis. *Third*, from industrial upgrading and resource allocation  
70 perspectives, the impact of environmental regulations on foreign direct investment has been empirically  
71 analyzed.

72 The remainder of the article is organized as follows. Section 2 introduces the direct influence  
73 mechanism of environmental regulation on foreign direct investment and discusses the influence  
74 mechanism of environmental regulation on foreign direct investment from the perspective of industrial  
75 upgrading and resource allocation. In Section 3, the estimation methodology and the data utilized in  
76 this study are briefly interpreted. Section 4 provides the empirical results and discussion. In Section 5,  
77 the conclusions and related policy guidelines are proposed. The research framework is shown in Figure  
78 2.



79

80

**Fig. 2** Research framework

81 **2. Mechanism and hypothesis**

82 **2.1 The mechanism of environmental regulation affecting foreign direct investment**

83 *Firstly*, as China's economic development level and environmental regulatory requirements continue to  
 84 increase, Chinese provinces and cities will be gradually driven by environmental regulatory measures  
 85 to restrict the inflow of high-polluting and high-energy-consuming foreign-funded enterprises. To  
 86 achieve the effect of "decontamination and cleaning", China's provinces and cities have changed their  
 87 original development models and actively attracted foreign-funded enterprises such as clean,  
 88 capital-intensive and technology-intensive enterprises. The technology spillover effects of  
 89 environmentally friendly foreign-funded enterprises have been effectively used by Chinese provinces  
 90 and cities to accelerate the green innovation of local enterprises (Cai et al., 2016). *Secondly*,  
 91 foreign-funded enterprises are forced by China's increasingly stringent environmental regulations to  
 92 introduce advanced equipment and improve production technology; thereby, enabling domestic  
 93 foreign-funded enterprises to improve their competitive position in the industry. However, in the long  
 94 run, as the cost of innovation continues to increase, the inflow of foreign direct investment in  
 95 economically developed regions will decrease. *Finally*, the environmental policy game caused by  
 96 Chinese local governments to attract foreign direct investment is significant (Zhu et al., 2011).  
 97 Therefore, according to the hypothesis of "competition to the bottom", to gain a comparative advantage  
 98 in fierce market competition, that is, to attract the inflow of foreign direct investment, local  
 99 governments in China may compete to relax environmental regulations and lower environmental  
 100 standards. However, from an overall point of view, local governments in China have made  
 101 environmental regulations have a significant inhibitory effect on foreign direct investment to  
 102 implement the comprehensive goal of environmental regulations. Based on the above analysis, the  
 103 research hypothesis H1 is proposed as follows:

104 *H1: Foreign direct investment is significantly inhibited by environmental regulations.*

105 **2.2 From the perspective of industrial upgrading, the mechanism of environmental regulation on**  
106 **the impact of foreign direct investment**

107 *First*, from a short-term perspective, increasingly stringent environmental regulations will increase the  
108 marginal cost of enterprises and have a crowding-out effect on the R&D costs of enterprises, which is  
109 not conducive to the adjustment of enterprises' structure, and thus cannot achieve industrial upgrading.  
110 Moreover, with the high cost of pollution control, foreign-funded enterprises that have failed to achieve  
111 industrial upgrading will not maintain a leading position in their industry and can only move to  
112 countries or regions with relatively weak environmental regulations. *Second*, from a long-term  
113 perspective, according to the "innovation compensation" effect (Porter et al., 1995), companies are  
114 forced by the pressure of environmental regulations and rising marginal costs to introduce advanced  
115 technology and equipment, carry out technological innovation, and adjust product structure. Companies  
116 digest high pollution costs internally through the above methods, complete industrial upgrades, and  
117 maintain their leading position in the industry (Tong et al., 2016). *Third*, from the perspective of  
118 product demand (DIMELIS\*, 2005) and commodity export structure (Kneller et al., 2007), the survival  
119 and development space of domestic enterprises with relatively backward production technology will be  
120 squeezed by foreign-funded enterprises with relatively advanced production technology. Domestic  
121 enterprises are forced to upgrade their production technology by foreign-funded enterprises with more  
122 advanced production technology, which has caused the domestic industry to transform from  
123 labor-intensive industries to capital-intensive and technology-intensive industries as a whole, which  
124 means that industrial upgrading has been completed (Wen et al., 2009). *Fourth*, from an overall point of  
125 view, under increasingly stringent environmental regulations, foreign-funded enterprises that have  
126 completed industrial upgrades are still profitable and will invest further. That is to say, from the  
127 perspective of industrial upgrading, environmental regulations significantly promote foreign direct  
128 investment. Based on the above analysis, the research hypothesis H2 is proposed as follows:

129 *H2: From the perspective of industrial upgrading, foreign direct investment is significantly promoted*  
130 *by environmental regulations.*

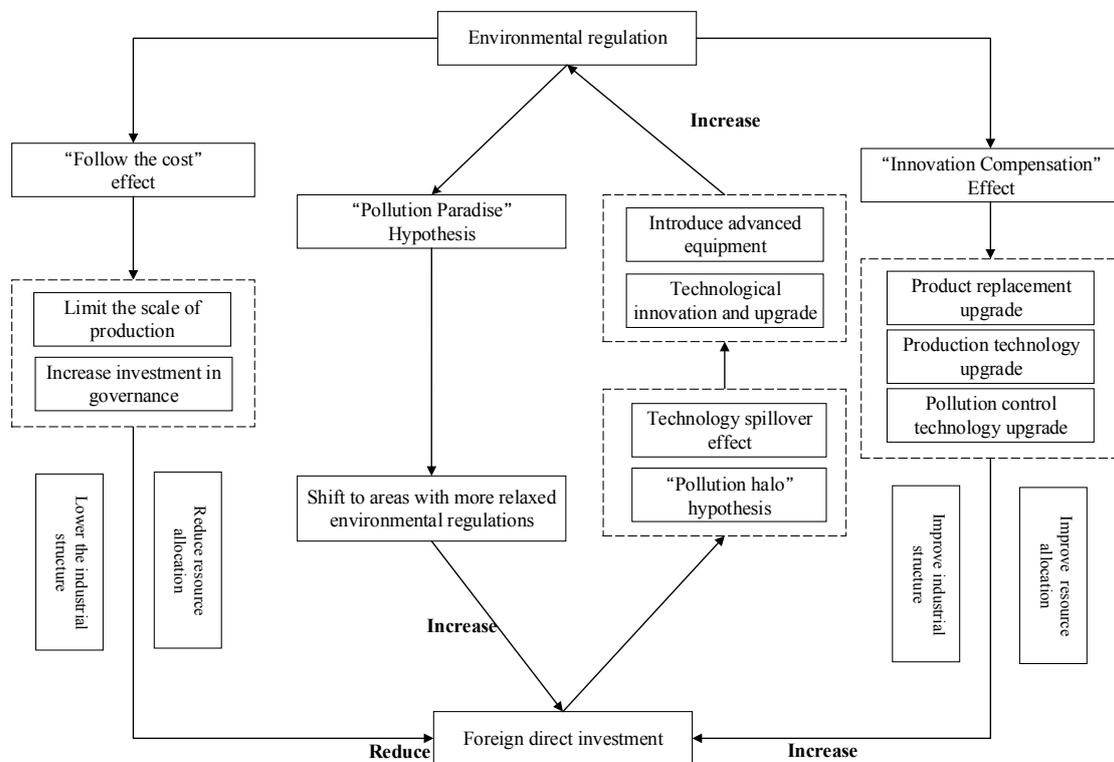
131 **2.3 From the perspective of resource allocation, the mechanism of environmental regulation**  
132 **affecting foreign direct investment**

133 First of all, based on the effect of "following costs", under the circumstance that the technological level  
134 remains unchanged, companies will be forced to fully or partially estimate their increased  
135 environmental costs due to the growth of environmental regulatory pressures. The above situation has  
136 led to a sharp increase in the marginal cost of enterprises and a decrease in resource allocation and  
137 production efficiency (Tang et al., 2020). Moreover, due to the increase in pollution control costs,  
138 foreign-funded enterprises with slower resource allocation efficiency will no longer maintain their  
139 leading positions in the industry and can only move to countries or regions with weaker environmental

140 regulations. On the contrary, companies will be motivated by reasonable environmental regulations to  
 141 carry out technological innovation and other production activities. They will be prompted to optimize  
 142 resource allocation to improve economic performance so that companies can internalize pollution  
 143 control costs and maximize net profits (Borsatto et al., 2019). Secondly, from the perspective of the  
 144 competitive effect of foreign direct investment, with the inflow of foreign-funded enterprises with  
 145 higher production technology levels, domestic enterprises with relatively backward production  
 146 technology levels are forced by industry competition pressure to improve production efficiency by  
 147 optimizing resource allocation methods. As a result, the overall production efficiency of the industry  
 148 has been maintained at a relatively high level. Moreover, from the perspective of the technology  
 149 spillover effect of foreign direct investment, domestic companies can improve their own production  
 150 efficiency by learning the production technology and management models of clean and technological  
 151 foreign companies, thereby indirectly promoting the overall resource allocation efficiency and green  
 152 innovation of the city (Zhang et al., 2020). Finally, from an overall point of view, under strict  
 153 environmental regulations, foreign-funded enterprises still have substantial profits by optimizing the  
 154 allocation of resources, driving further investment. That is to say, from the perspective of resource  
 155 allocation, environmental regulations significantly promote foreign direct investment. Based on the  
 156 above analysis, the research hypothesis H3 is proposed as follows:

157 **H3:** From the perspective of resource allocation, foreign direct investment is significantly promoted by  
 158 environmental regulations.

159



160

161

Fig. 3 Mechanism analysis

## 162 3. Methods and data

### 163 3.1 Econometric methodology

#### 164 3.1.1 Construction of the benchmark regression model

165 According to the hypothesis of "Pollution Heaven" and "Pollution Halo", there is a U-shaped  
166 relationship between environmental regulation and foreign direct investment. In particular, foreign  
167 direct investment is decreased with the strengthening of environmental regulation. When environmental  
168 regulation develops to a certain stage, the foreign direct investment will reach the lowest value at the  
169 turning point. Then, with the enhancement and optimization of environmental regulation, clean and  
170 technology-intensive foreign-funded enterprises will continue to flow in. Therefore, this article  
171 establishes an econometric model based on the hypotheses of "Pollution Heaven" and "Pollution Halo"  
172 to study environmental regulation and foreign direct investment.

173 This paper introduces the performance-based environmental regulation index into the model, test  
174 whether there is a u-shaped relationship between environmental regulation and foreign direct  
175 investment. Furthermore, foreign direct investment is also affected by the rate of urbanization, society's  
176 overall economic level, marketization level, the degree of openness to trade, and infrastructure  
177 construction. Therefore, add urbanization rate, per capita GDP, marketization level, trade openness, and  
178 infrastructure construction as control variables to the model to get the following basic econometric  
179 model:

$$180 \quad \ln FDI_{i,t} = \beta_0 + \beta_1 \ln ER_{i,t} + \beta_2 \sum_{k=1}^5 \ln X_{k,i,t} + \alpha_i + \mu_i + \varepsilon_{i,t} \quad (1)$$

181 In the formula,  $FDI_{i,t}$  indicates the foreign direct investment of area  $i$  in  $t$  year;  $ER_{i,t}$  indicates the  
182 environmental regulation of area  $i$  in  $t$  year;  $X_{k,i,t}$  indicates the control variable;  $\alpha_i$  and  $\mu_i$  represent the  
183 fixed effect of region and year respectively;  $\varepsilon_{i,t}$  indicates the random perturbed variable.

#### 184 3.1.2 Spatial Dubin model

##### 185 3.1.2.1 The design of the Spatial Dubin model

186 The Spatial Dubin model (SDM) is a combined extended form of the spatial lag and error models. As  
187 the only model that can obtain unbiased coefficient estimates, it can take into account the spatial  
188 dependence of the dependent variables and the spatial correlation of the independent variables  
189 simultaneously. As China's foreign direct investment and environmental regulation may have a spatial  
190 correlation, this paper proposes the SDM. The specific form is as follows:

$$191 \quad \ln FDI_{i,t} = \rho \sum_{j \neq i}^N W_{i,j,t} \ln FDI_{j,t} + \beta_1 \ln ER_{i,t} + \beta_2 \sum_{k=1}^5 \ln X_{k,i,t} + \gamma_1 \sum_{j \neq i}^N W_{i,j,t} \ln ER_{j,t} + \\ 192 \quad \gamma_2 \sum_{i \neq j}^N W_{i,j,t} \sum_{k=1}^5 \ln X_{k,i,t} + \alpha_i + \mu_i + \varepsilon_{i,t} \\ 193 \quad (2)$$

### 194 3.1.2.2 The design of the mediation model

195 First of all, on the one hand, according to "innovation compensation", strict environmental regulatory  
196 measures will force companies to carry out technological innovation and other production activities,  
197 prompting companies to complete industrial upgrading by adjusting product structure and other  
198 methods. On the other hand, from the perspective of product demand and commodity export structure,  
199 domestic enterprises' survival and development space will be squeezed by foreign-funded enterprises  
200 with a higher level of production technology, forcing domestic companies to upgrade their industries.  
201 Therefore, to study the adjustment effect of industrial upgrading on environmental regulation, this  
202 article adds interactive items of industrial upgrading and environmental regulation to the model; the  
203 following model is obtained:

$$\begin{aligned} 204 \quad \ln FDI_{i,t} = & \rho \sum_{j \neq i}^N W_{i,j,t} \ln FDI_{i,t} + \beta_1 \ln ER_{i,t} + \beta_2 \ln IND_{i,t} + \beta_3 (\ln ER_{i,t} \times \ln IND_{i,t}) + \\ 205 \quad & \beta_4 \sum_{k=1}^5 \ln X_{k,i,t} + \gamma_1 \sum_{j \neq i}^N W_{i,j,t} \ln ER_{i,t} + \gamma_2 \sum_{j \neq i}^N W_{i,j,t} \ln IND_{i,t} + \\ 206 \quad & \gamma_3 \sum_{j \neq i}^N W_{i,j,t} (\ln ER_{i,t} \times \ln IND_{i,t}) + \gamma_4 \sum_{i \neq j}^N W_{i,j,t} \sum_{k=1}^5 \ln X_{k,i,t} + \alpha_i + \mu_i + \varepsilon_{i,t} \\ 207 \quad (3) \end{aligned}$$

208 Next, on the one hand, reasonable environmental regulation will encourage companies to  
209 internalize pollution control costs and maximize net profits by optimizing resource configuration. On  
210 the other hand, according to the technology spillover effect of foreign direct investment, domestic  
211 enterprises' resource configuration is optimized by learning the production technology of clean and  
212 technological foreign-funded enterprises, ultimately realizing the improvement of the overall  
213 production efficiency of the society. Therefore, to study the adjustment effect of resource configuration  
214 on environmental regulation, in this paper, the interactive items of resource allocation and  
215 environmental regulation are added to the model, and the following model is obtained:

$$\begin{aligned} 216 \quad \ln FDI_{i,t} = & \rho \sum_{j \neq i}^N W_{i,j,t} \ln FDI_{i,t} + \beta_1 \ln ER_{i,t} + \beta_2 \ln TFP_{i,t} + \beta_3 (\ln ER_{i,t} \times \ln TFP_{i,t}) + \\ 217 \quad & \beta_4 \sum_{k=1}^5 \ln X_{k,i,t} + \gamma_1 \sum_{j \neq i}^N W_{i,j,t} \ln ER_{i,t} + \gamma_2 \sum_{j \neq i}^N W_{i,j,t} \ln TFP_{i,t} + \\ 218 \quad & \gamma_3 \sum_{j \neq i}^N W_{i,j,t} (\ln ER_{i,t} \times \ln TFP_{i,t}) + \gamma_4 \sum_{i \neq j}^N W_{i,j,t} \sum_{k=1}^5 \ln X_{k,i,t} + \alpha_i + \mu_i + \varepsilon_{i,t} \\ 219 \quad (4) \end{aligned}$$

220 In the formula,  $IND_{it}$  indicates the industrial upgrading of area  $i$  in  $t$  year;  $TFP_{it}$  indicates the  
221 resource allocation of area  $i$  in  $t$  year;  $\rho$  indicates the spatial autocorrelation coefficient;  $\gamma$  indicates the  
222 influence of other factors in the neighboring region on the foreign direct investment factors in the  
223 region;  $W_{i,j,t}$  indicates a standardized spatial geographic distance matrix.

### 224 3.1.2.3 The construction of the spatial weight matrix

225 *Firstly*, the spatial weight matrix is introduced to control the regional spatial geographic effect in the  
226 spatial econometric model. Therefore, a correct and reasonable spatial weight matrix should be able to  
227 accurately measure the spatial spillover effect. According to Tobler's first law of geography, everything  
228 is related, but things nearby are more related than things far away (Tobler, 1970; Li et al., 2018).

229 Especially for air pollutants, the spread of air pollutants across regions is obvious under the influence  
230 of atmospheric circulation. At present, spatial economists mainly use geographic distance matrix and  
231 economic weight matrix to analyze spatial effects. Based on the influence of spatial location factors on  
232 economic variables, this paper constructs a geographic distance matrix. *Secondly*, although with the  
233 continuous development of the economy and the deepening of exchanges between different countries  
234 and regions, environmental regulation between regions not only depends on the factors of spatial  
235 distance but also on factors such as the level of economic development between regions(Wang et al.,  
236 2019) but in practice, for the spatial spillover effect of pollutant emissions between regions,  
237 geographical distance is more important than economic distance. *Finally*, from an overall point of view,  
238 this article chooses the geographic distance matrix as the reference matrix, calculates as follows:

$$239 \quad IND_{i,t} = \begin{cases} d, & i \neq j \\ 0, & i = j \end{cases} \quad (5)$$

240 In this formula,  $d$  indicates the distance between the centers of  $i$  and  $t$  in two regions or the  
241 distance between two points (provincial capital cities).

## 242 **3.2 Data**

### 243 **3.2.1 Explained variable: foreign direct investment**

244 In terms of foreign direct investment data, firstly, as China's trade opening continues to deepen, foreign  
245 direct investment has become one of the important factors to promote China's economic development;  
246 secondly, with the excessive expansion of foreign direct investment in the scale of resource-based  
247 industries, the problem of environmental pollution is becoming more and more worrying. According to  
248 previous literature, this article adopts the actual use amount of foreign direct investment in each region  
249 and uses RMB's annual average rate against USD to convert into RMB, which represents foreign direct  
250 investment (FDI). In addition, this paper uses the percentage of foreign direct investment in GDP by  
251 region to replace the actual use of foreign direct investment (Huang et al., 2021) for the stability test.

### 252 **3.2.2 The core explanatory variable: environmental regulation**

253 Until now, the methods of measuring environmental regulation are mainly divided into cost-based  
254 environmental regulation indicators and performance-based environmental regulation indicators. Next,  
255 because of the lack of official data on air quality emissions fees and pollution investments, it may be  
256 inaccurate to use pollution charges and pollution investments to measure environmental regulation.  
257 Then, because the cost of pollution is closely related to the level of regional industrial development, the  
258 gross industrial output value is closely related to the government's lowered threshold of the  
259 environmental pollution to attract the inflow of foreign-funded enterprises; therefore, the payment cost  
260 of pollution control is used as a measure of environmental regulation, may cause serious endogenous  
261 problems (Jaffe et al., 1997). The last, given the shortcomings of cost-based environmental regulation

262 indicators, this paper adopts performance-based environmental regulation indicators by linear weighted  
 263 sum method and use the two individual indicators of SO<sub>2</sub> removal rate and industrial smoke dust  
 264 removal rate in each region to construct a comprehensive index of environmental regulation intensity  
 265 (Wang et al., 2014). Specific steps are as follows:

266 The first step standardizes the two indicators of SO<sub>2</sub> removal rate and industrial smoke dust  
 267 removal rate:

$$268 \quad er_{i,t,j}^* = (er_{i,t,j} - \min(er_{t,j})) / (\max(er_{t,j}) - \min(er_{t,j})) \quad (6)$$

269 In the formula,  $er_{i,t,j}$  indicates the original value of the  $j$  type indicator of area  $i$  in  $j$  year;  $\min(er_{t,j})$   
 270 indicates the minimum value of the  $j$  type indicator in all regions in  $t$  year;  $\max(er_{t,j})$  indicates the  
 271 maximum value of the  $j$  type indicator in all regions in  $t$  year;  $er_{i,t,j}^*$  indicates the standardized value of  
 272 the  $j$  type indicator in area  $i$  in  $t$  year.

273 The second step calculates the adjustment coefficients  $z_{i,t,j}$  of the two individual indicators of SO<sub>2</sub>  
 274 removal rate and industrial smoke dust removal rate, respectively. Due to different proportions of the  
 275 above two indicators in different regions and different levels of emissions in the same area, different  
 276 weights are assigned to different indicators to ensure that it accurately reflects the degree of pollution  
 277 control in each area. The specific calculation method is as follows:

$$278 \quad z_{i,t,j} = \frac{er_{i,t,j}}{\sum_i er_{i,t,j}} \bigg/ \frac{gdp_{i,t}}{\sum_i gdp_{i,t}} \quad (7)$$

279 In the formula,  $z_{i,t,j}$  indicates the adjustment coefficient of  $j$  type indicator in  $i$  area in  $t$  year;  $er_{i,t,j}$ ,  
 280  $gdp_{i,t}$  respectively indicate the  $j$  type indicators and GDP of each region in  $t$  year. Third step,  
 281 according to the standardized value  $er_{i,t,j}^*$  and adjustment coefficient  $z_{i,t,j}$  of SO<sub>2</sub> removal rate and  
 282 industrial smoke dust removal rate, calculate the comprehensive index of environmental regulation:

$$283 \quad ER_{i,t} = \sum_{j=1}^2 z_{i,t,j} er_{i,t,j}^* / 2 \quad (8)$$

### 284 3.2.3 Mediator

#### 285 3.2.3.1 Industrial upgrading

286 *Firstly*, from a macro perspective, industrial upgrading is manifested as the transformation of the  
 287 industrial structure from a low-level form to a high-level form. *Secondly*, from a micro perspective,  
 288 industrial upgrading is manifested in the overall transformation of domestic industries from  
 289 labor-intensive industries to capital-intensive and technology-intensive industries. Meanwhile,  
 290 industrial upgrading is also manifested in transferring production factors from industrial sectors with

291 lower production efficiency to industrial sectors with higher production efficiency. According to  
292 previous literature, use the shares of the thrice industries and their comparative relationships to measure  
293 industrial upgrading (Yuan et al., 2014). The specific calculation method is as follows:

$$294 \quad IND_{i,t} = \sum_{m=1} (m^2 \times ind_{i,t,m}) \quad (8)$$

295 In the formula,  $IND_{i,t}$  indicates the industrial upgrading of area  $i$  in  $t$  year;  $m$  indicates the serial  
296 number of the thrice industries;  $ind_{i,t,m}$  respectively indicate the proportion of the primary industry,  
297 secondary industry and tertiary industry in GDP.

### 298 3.2.3.2 Resource allocation

299 About resource configuration, this article uses the DEA-Malmquist index method to measure resource  
300 allocation. According to previous literature, this article uses labor and capital as input factors, taking  
301 the gross regional product as an output factor. The specific input and output elements are processed as  
302 follows: output indicators, calculated using the gross regional product and converted the gross regional  
303 product level to 2003. Input indicators, labor input is expressed by the number of employees in each  
304 city over the years, capital input is measured by fixed capital stock, this data is not directly available  
305 and needs to be calculated, this article uses the perpetual inventory method to calculate the stock of  
306 fixed capital (Zhou et al., 2020). The specific calculation method is as follows:

$$307 \quad K_{i,t} = I_{i,t} + (1 - \delta) \times K_{i,t-1} \quad (9)$$

308 In the formula,  $K_{i,t}$  indicates the capital stock of area  $i$  in  $t$  year;  $I_{i,t}$  indicates the amount of fixed  
309 asset investment in area  $i$  in  $t$  year;  $\delta$  is depreciation rate, assign a value of 6%. The initial year capital  
310 stock uses the depreciation of fixed assets of the year multiplied by 10%.

### 311 3.2.4 Control variables

312 Following existing literature, this article uses urbanization rate as the control variable, calculated as the  
313 ratio of urban population to total population at the end of the year; per capita GDP represents the  
314 overall economic level of a region; the ratio of fiscal expenditure to GDP represents the level of  
315 marketization; the ratio of total import and export to GDP represents the degree of trade openness; per  
316 million square meters of road area represent infrastructure construction.

### 317 3.2.5 Data sources

318 *First*, due to the availability and reliability of the data, this paper finally selects the panel data of 276  
319 prefecture-level cities in China from 2003 to 2016. *Second*, taking into account the lack of data in Tibet  
320 and other regions and the lack of data in Hong Kong, Macau, and Taiwan, this article uses 30 provinces  
321 other than Tibet, Hong Kong, Macau, and Taiwan for research. *Third*, the data used in this article all

322 come from EPS and CEIC databases. Table 1 provides the names, descriptions and descriptive statistics  
 323 of the variables in this study.

324 **Table 1.** Descriptive statistics.

Variable	Variable description	Mean	Standard deviation	Min	Max
<b>FDI</b>	Actual use of foreign direct investment	3498.106	7298.838	0.001	86000
<b>ER</b>	Environmental regulation	1.487	1.610	0.000	35.297
<b>IND</b>	Industrial upgrading	5.419	0.558	2.769	10.571
<b>TFP</b>	Resource allocation	0.527	0.225	0.086	1.000
<b>URB</b>	Urbanization rate	0.372	0.194	0.037	1.000
<b>PGDP</b>	per capita GDP	32000	32000	1891.034	300000
<b>MAKL</b>	Marketization level	0.156	0.087	0.031	0.872
<b>TRADE</b>	Trade openness	0.200	0.365	0.000	3.514
<b>INF</b>	Infrastructure	13.312	17.013	0.410	146.488

## 325 **4. Results and discussion**

### 326 **4.1 Spatial autocorrelation test**

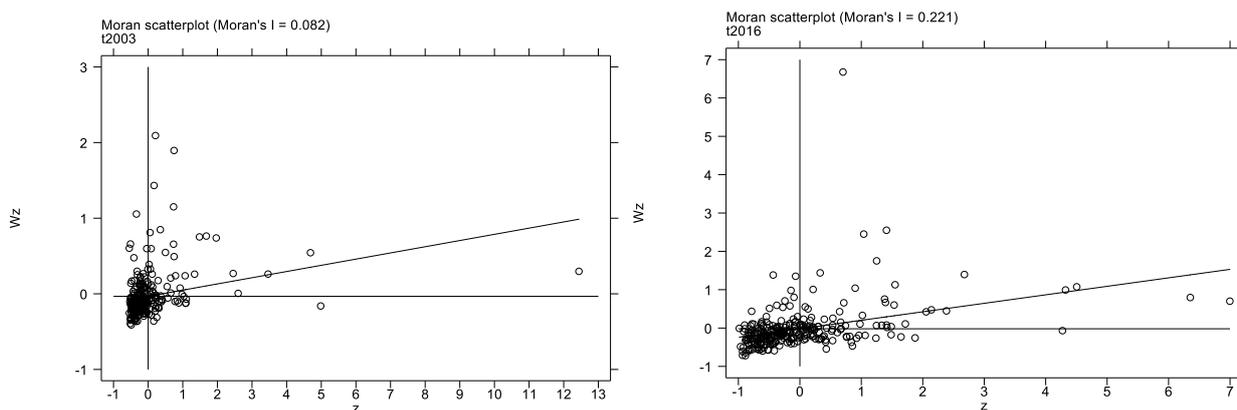
327 First of all, this study uses the Moran I index to judge whether foreign direct investment and  
 328 environmental regulations between regions are spatially correlated. Specifically, when the index is  
 329 greater than 0, it indicates that a certain economic variable in each region is spatially positively  
 330 correlated; that is, there is spatial agglomeration. When the index is less than 0, it indicates that a  
 331 certain economic variable in each region is negatively correlated in space; that is, there is spatial  
 332 exclusion. When the index is equal to 0, it indicates that a certain economic variable is not related to  
 333 the regional distribution. Secondly, according to Table 2, foreign direct investment and environmental  
 334 regulations are significantly positive at the 1% level. It shows that foreign direct investment and  
 335 environmental regulations in various regions have an obvious positive autocorrelation in space, that is,  
 336 spatial agglomeration. Specifically, the Moran I index of foreign direct investment has shown a  
 337 downward trend as a whole. This shows that the spatial correlation of foreign direct investment is  
 338 gradually weakening; that is, the spatial distribution of foreign direct investment is becoming more and  
 339 more balanced. The Moran I index of environmental regulations is showing an upward trend as a whole,  
 340 which indicates that the spatial relevance of environmental regulations is gradually strengthening. With  
 341 the continuous advancement of the construction of ecological civilization, the exchanges of  
 342 environmental regulations between various regions have been continuously deepened, which has made  
 343 the spatial relevance of environmental regulations continue to rise. Finally, the local Moran I scatter  
 344 plot reflects the local spatial correlation characteristics of environmental regulations and foreign direct  
 345 investment, and the specific results are shown in Figures 4 and 5. In 2003 and 2016, whether it was  
 346 environmental regulations or foreign direct investment, most prefecture-level cities fell into the first  
 347 and third quadrants. This result indicates the rejection of the null hypothesis that "environmental

348 regulations and foreign direct investment are randomly distributed in space", indicating that both  
 349 environmental regulations and foreign direct investment are spatially correlated, which is consistent  
 350 with the global spatial correlation test results. Therefore, based on the above analysis, this study uses a  
 351 spatial econometric model to conduct an empirical analysis of environmental regulations and foreign  
 352 direct investment.

353 **Table 2.** Moran I Index.

Variable	Foreign direct investment	Environmental regulation
t2003	0.273***	0.082***
t2004	0.267***	0.138***
t2005	0.257***	0.140***
t2006	0.270***	0.099***
t2007	0.258***	0.125***
t2008	0.246***	0.121***
t2009	0.237***	0.123***
t2010	0.183***	0.137***
t2011	0.158***	0.170***
t2012	0.148***	0.195***
t2013	0.117***	0.191***
t2014	0.111***	0.165***
t2015	0.156***	0.193***
t2016	0.134***	0.221***

354 **Note:** \*\*\*, \*\*, and \* indicate significance at the 1%, 5%, and 10% levels, respectively.



**Fig. 4.** Partial Moran I scatter plot of foreign direct investment.

355

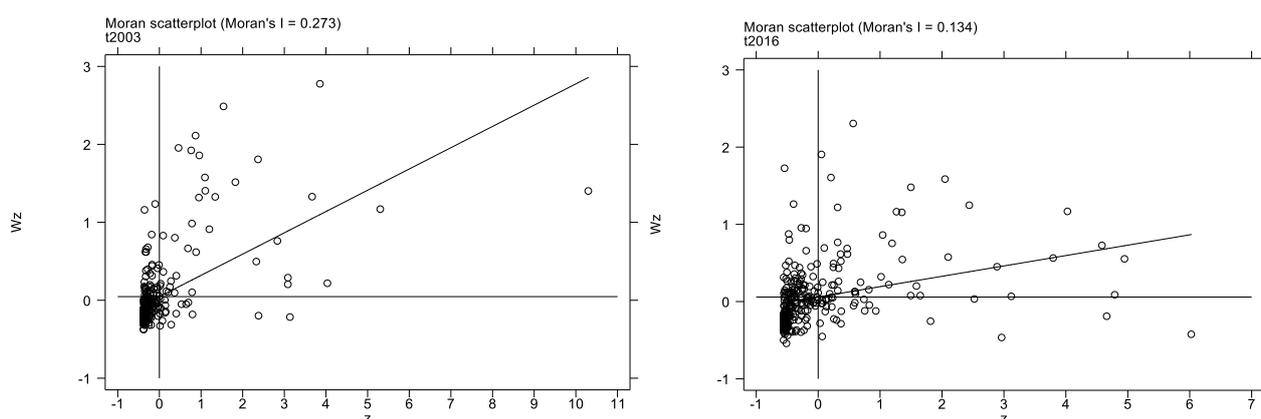


Fig. 5. Partial Moran I scatter plot of environmental regulation.

#### 356 4.2 Baseline estimation

357 In order to select a suitable spatial measurement model, this study conducted a series of tests as follows,  
 358 and the results are shown in Table 3. *Firstly*, the LM test is used to judge whether the model can be  
 359 simplified into a spatial autoregressive model or a spatial error model. This result shows that the null  
 360 hypothesis of no spatial error term and no spatial lag term is rejected at the 1% level. *Secondly*, LR and  
 361 Wald tests are further used to show that the spatial Dubin model is more suitable than the spatial  
 362 autoregressive model and the spatial error model. *Thirdly*, because prefecture-level city-level data is  
 363 used for empirical analysis in this study, and each city has its own characteristics, the Hausman test is  
 364 used to determine whether to choose a space and time double fixed effects model for estimation.  
 365 Finally, based on the above analysis, the spatial Dubin double fixed model is used in this study to  
 366 conduct an empirical analysis of the relationship between environmental regulations and foreign direct  
 367 investment.

368 This study uses the OLS basic regression model, spatial autoregressive model, spatial error model,  
 369 and spatial Dubin model to conduct empirical research on the relationship between foreign direct  
 370 investment and environmental regulation. The specific results are shown in Table 3. This result shows  
 371 that no matter which model is adopted, the coefficient of environmental regulation is significantly  
 372 negative at the 1% level. That is, foreign direct investment is significantly inhibited by environmental  
 373 regulations, and the research hypothesis H1 is initially verified. This may be the result of increasingly  
 374 stringent environmental regulations in various regions. *First*, under the call of "green water and green  
 375 mountains are golden mountains and silver mountains", increasingly stringent environmental  
 376 regulations have been proposed by the Chinese local government. This measure raised the marginal  
 377 cost of "environmentally unfriendly" and other foreign-funded enterprises, which in turn made them  
 378 withdraw from the market, and the inflow of high-polluting, high-energy-consuming foreign-funded  
 379 enterprises has been consciously restricted or prohibited by the Chinese local government. *Second*,  
 380 according to the "pollution halo" hypothesis, in order to achieve the effect of "decontamination and  
 381 cleaning", clean, capital-intensive and technology-intensive foreign-funded enterprises are actively

382 introduced by the Chinese government and the technology spillover effects of foreign-funded  
 383 enterprises such as "environmentally friendly" are effectively used to promote the spread of cleaner  
 384 production technologies (Kim et al., 2019; Yu et al., 2020). However, as a whole, as the cost of  
 385 innovation increases, foreign-funded enterprises will still move to countries or regions with weaker  
 386 environmental regulations.

387 **Table 3.** Benchmark estimation results

Variable	OLS	SAR	SEM	SDM
lnER	-0.485***	-0.139***	-0.133***	-0.138***
Control variable	control	control	control	control
Individual fixation		control	control	control
Time fixation		control	control	control
R <sup>2</sup>	0.4366	0.1807	0.2026	0.0511
LongL		-5181.7230	-5184.7939	-5164.9203
N	3864	3864	3864	3864
Wald_spatial_lag				22.00***
LR_spatial_lag				21.98***
Wald_spatial_error				32.59***
LR_spatial_error				33.03***
Hausman		27.61***		38.40***

388 **Note:** \*\*\*, \*\*, and \* indicate significance at the 1%, 5%, and 10% levels, respectively.

### 389 4.3 Decomposition effect

390 In order to judge whether the spatial spillover effect is significant, this study uses partial differentiation  
 391 to decompose the spatial effects of the spatial Dubin model into direct and indirect effects. After that,  
 392 the significance of the indirect effects of explanatory variables is used in this study to determine  
 393 whether the spatial spillover effects are significant, and the total effects are numerically equal to the  
 394 sum of the direct effects and the indirect effects. The specific results are shown in Table 4. *First*, from  
 395 the perspective of core explanatory variables, the coefficient of environmental regulation is  
 396 significantly negative at the 1% level. It shows that foreign direct investment is significantly inhibited  
 397 by environmental regulations and further validates the research hypothesis H1. In addition, the indirect  
 398 effects of environmental regulations are significantly negative at the 1% level. It shows that  
 399 environmental regulations will reduce local foreign direct investment and have significant negative  
 400 space spillover. This may be the result of environmental decentralization and competition between  
 401 regional governments. Because local governments have a certain degree of autonomy in formulating  
 402 regulations, this inevitably leads to different levels of environmental regulation in different regions (Jin  
 403 et al., 2005; Zheng, 2007).

404 On the other hand, the significant negative spatial spillover of environmental regulations may be  
 405 caused by the "top-to-top competition" of local governments for environmental governance from the  
 406 perspective of environmental decentralization. In order to release the ability signal to the higher-level

407 government and increase its own promotion "weight", compared with neighboring regions, the intensity  
 408 of environmental governance has been further strengthened by the local government, resulting in  
 409 greater restrictions on the inflow of high-polluting and high-energy-consuming foreign-funded  
 410 enterprises. *Secondly*, in terms of control variables, on the one hand, the direct and indirect effects of  
 411 per capita GDP are both significantly positive at the level of 1%. It shows that foreign direct  
 412 investment is significantly promoted by per capita GDP, and per capita GDP has a significant positive  
 413 space overflow. This may be because the higher the per capita GDP, the more developed the overall  
 414 economic level of the society, and the more foreign companies are willing to invest in this area. On the  
 415 other hand, the direct effect of trade openness is significantly positive at the 1% level, and the indirect  
 416 effect is significantly negative at the 1% level. It shows that foreign direct investment is significantly  
 417 promoted by trade openness, and trade openness has a significant negative space spillover. This may be  
 418 because the higher the degree of local trade openness, the fewer restrictions on foreign companies  
 419 entering the local area, leading to more foreign companies' inflow.

420 **Table 4.** Decomposition effect results

Effect type	lnER	lnURB	lnPGDP	lnMAKL	lnTRADE	lnINF
<b>Direct effect</b>	-0.149***	-0.718***	0.551***	0.238	0.149***	-0.035
<b>Indirect effect</b>	-0.442***	-0.569	1.632***	1.979***	-0.456***	-0.129
<b>Total effect</b>	-0.591***	-1.287***	2.182***	2.217***	-0.307**	-0.164

421 **Note:** \*\*\*, \*\*, and \* indicate significance at the 1%, 5%, and 10% levels, respectively.

#### 422 4.4 Heterogeneous effects

423 (1) In order to compare the differences in the impact of environmental regulations on foreign direct  
 424 investment between different regions, according to the economic zone classification standard of the  
 425 National Bureau of Statistics of China, the sample of prefecture-level cities is divided into eastern cities  
 426 and non-eastern cities in this study. *First*, according to the results in Table 5, on the one hand, the  
 427 estimated results of eastern cities are relatively close to the national estimates; that is, the coefficient of  
 428 direct effect is significantly negative at the 1% level, and the coefficient of indirect effect is also  
 429 significantly negative. It shows that foreign direct investment is significantly suppressed by foreign  
 430 direct investment, and environmental regulations have a significant negative space overflow. On the  
 431 other hand, the coefficient of indirect effects in non-eastern cities is not significant, indicating that the  
 432 environmental regulations of non-eastern cities do not have spatial spillover effects. *Secondly*, it can be  
 433 seen from the above analysis that the difference between the estimation results of eastern cities and  
 434 non-eastern cities is more obvious. This may be the result of the overall economic difference between  
 435 eastern cities and non-eastern cities. On the one hand, cleaner and more technological foreign-funded  
 436 enterprises are attracted by eastern cities with more developed economies and complete infrastructure.  
 437 Based on its rich economic resources, optimized resource allocation and technology spillover effects of  
 438 foreign direct investment have been effectively used by local governments in eastern cities to take the  
 439 road to high-quality and sustainable development. Moreover, because the more demanding ecological  
 440 environment construction is proposed by residents of eastern cities with higher economic levels, the

441 regional government has proposed more stringent environmental regulations than surrounding cities to  
 442 further restrict the inflow of high-polluting foreign-funded enterprises. On the other hand, the  
 443 technology spillover effect of foreign direct investment cannot be fully and effectively used by the  
 444 local governments of non-eastern cities with relatively backward economic development and education  
 445 to improve the economic and technological level of local cities. As a result, it is impossible to attract  
 446 high-quality foreign-invested enterprises, resulting in a substantial reduction in foreign direct  
 447 investment in non-eastern cities (Yang et al., 2019). Moreover, compared with surrounding cities, more  
 448 stringent environmental governance measures cannot be proposed by local governments in non-eastern  
 449 cities, resulting in environmental regulations that cannot generate spatial spillovers.

450 (2) In order to compare the differences in the impact of environmental regulations on foreign  
 451 direct investment between different levels of cities, the sample of prefecture-level cities is divided into  
 452 ordinary cities and key cities in this study. First of all, according to the results in Table 5, on the one  
 453 hand, the estimated results of ordinary cities and the whole country are relatively consistent, and  
 454 environmental regulations are significantly negative at the 1% level. It shows that foreign direct  
 455 investment is significantly inhibited by environmental regulations. On the other hand, the direct effect  
 456 of key cities is significantly negative at the 1% level and is significantly smaller than the direct effect  
 457 coefficients of national and ordinary cities. At the same time, the spatial coefficient of key cities is not  
 458 significant, and the indirect effect is only significantly negative at the 10% level, indicating that there is  
 459 no spatial spillover of environmental regulations in key cities. Secondly, it can be seen from the above  
 460 analysis that the difference between the estimation results of ordinary cities and key cities is more  
 461 obvious. This may be due to the difference in administrative hierarchy between ordinary cities and key  
 462 cities. Based on their own positioning and rich economic resources, key cities will look at the whole  
 463 country, improve their sustainable development capabilities through technological innovation and  
 464 industrial upgrading, and further restrict the inflow of high-polluting foreign-funded enterprises. On the  
 465 other hand, the administrative barriers between key cities are relatively strong, presenting a situation of  
 466 "fighting each other", resulting in no spatial spillover effect of environmental regulations.

467 **Table 5.** Results of heterogeneous effects.

Variable	Eastern cities	Non-eastern cities	Ordinary city	Key cities
$\rho$	0.429***	0.118***	0.337***	0.008
lnER	-0.094***	-0.139***	-0.143***	-0.355***
$W \times \ln ER$	-0.456***	-0.069	-0.251***	-0.500
Direct effect	-0.126***	-0.140***	-0.153***	-0.355***
Indirect effect	-0.831***	-0.092	-0.436***	-0.496*
Total effect	-0.957***	-0.232*	-0.590***	-0.850***
Control variable	control	control	control	control
Individual fixation	control	control	control	control
Time fixation	control	control	control	control
$R^2$	0.2067	0.0121	0.0413	0.5806
LongL	-1253.6794	-3437.1707	-4723.8769	-286.9635

N	1526	2338	3444	420
<b>Hzusman</b>	44.94***	29.63***	43.21***	23.08**

468 **Note:** \*\*\*, \*\*, and \* indicate significance at the 1%, 5%, and 10% levels, respectively.

#### 469 **4.5 Mediation effect**

470 (1) In order to explore the impact of environmental regulations on foreign direct investment from the  
471 perspective of industrial upgrading, this study conducted the following research, and the specific results  
472 are shown in Table 6. *First*, the direct effect of the interaction term between environmental regulation  
473 and industrial upgrading is significantly positive at the 1% level, and the indirect effect is significantly  
474 negative at the 1% level. It shows that from the perspective of industrial upgrading, foreign direct  
475 investment is significantly promoted by environmental regulations; that is, the research hypothesis H2  
476 is verified, and environmental regulations have significant negative spatial spillovers. Secondly, it can  
477 be seen from the above analysis that this may be the result of the "innovation compensation" effect of  
478 environmental regulations. On the one hand, based on the effect of "innovation compensation",  
479 reasonable environmental regulations will appropriately increase the marginal cost of enterprises,  
480 forcing enterprises to increase their R&D capital through financing and other methods and improve the  
481 level of production technology. In the end, while guiding the overall green development of society (Du  
482 et al., 2021), this initiative will transform from labor-intensive to capital-intensive and  
483 technology-intensive through the "survival of the fittest" approach, which is industrial upgrading. On  
484 the other hand, a higher level of product structure will bring a higher level of economic development.  
485 Based on its own higher level of economic development, the local government will adopt more  
486 stringent environmental governance measures than surrounding cities, resulting in further restrictions  
487 on the inflow of high-polluting foreign-funded enterprises so that local cities can take an  
488 environmentally friendly development path.

489 (2) In order to explore the impact of environmental regulations on foreign direct investment from  
490 the perspective of resource allocation, this study conducted the following research, and the specific  
491 results are shown in Table 6. *Firstly*, the direct effect of the interaction term between environmental  
492 regulation and resource allocation is significantly positive at the 1% level, and the indirect effect is  
493 significantly negative at the 1% level. It shows that from the perspective of resource allocation, foreign  
494 direct investment is significantly promoted by environmental regulations; that is, the research  
495 hypothesis H3 has been verified, and environmental regulations have a significant negative spatial  
496 spillover effect. *Secondly*, it can be seen from the above analysis that this may be the result of the  
497 "innovation compensation" effect of environmental regulations. On the one hand, in order to achieve  
498 the optimization of resource allocation and the maximization of economic performance, the efficiency  
499 of resource utilization and the degree of coupling and coordination between various economic  
500 resources can be improved by reasonable environmental regulations through technological innovation.  
501 On the other hand, foreign direct investment and the level of economic development are promoted by  
502 higher resource allocation efficiency. Based on its own higher level of economic development, the  
503 construction of an ecological civilization with higher requirements than surrounding cities was

504 proposed by the local government, thereby further restricting the inflow of foreign-funded enterprises.  
 505 In addition, it should be noted that the coefficient of resource allocation is significantly negative,  
 506 indicating that foreign direct investment is significantly suppressed by resource allocation. This may be  
 507 because the resource allocation is too low, that is, more than half of the samples with resource  
 508 allocation less than 0.5. The low resource allocation efficiency is not conducive to the inflow of  
 509 foreign-funded enterprises.

510 **Table 6.** Mediating effect results

Variable	Industrial upgrade	Resource allocation
$\rho$	0.343***	0.360***
lnER	-1.819***	0.115**
lnIND	0.949**	
lnTFP		-0.300***
lnER $\times$ lnIND	1.018***	
lnER $\times$ lnTFP		0.306***
W $\times$ lnER	3.286***	-0.857***
W $\times$ lnIND	2.527**	
W $\times$ lnTFP		0.345
W $\times$ (lnER $\times$ lnIND)	-2.131***	
W $\times$ (lnER $\times$ lnTFP)		-0.743***
Direct effect	lnER	-1.722***
	lnIND	1.011***
	lnTFP	
	lnER $\times$ lnIND	0.955***
Indirect effect	lnER $\times$ lnTFP	0.284***
	lnER	3.912**
	lnIND	4.278**
	lnTFP	0.362
Total effect	lnER $\times$ lnIND	-2.619***
	lnER $\times$ lnTFP	
	lnER	2.190
	lnIND	5.289***
Total effect	lnTFP	0.062
	lnER $\times$ lnIND	-1.664*
	lnER $\times$ lnTFP	
Control variable	control	control
Individual fixation	control	control
Time fixation	control	control
$R^2$	0.0626	0.0330
LongL	-5141.5115	-5137.4860
N	3864	3864
Hausman	37.39***	46.35***

511 **Note:** \*\*\*, \*\*, and \* indicate significance at the 1%, 5%, and 10% levels, respectively.

512 **4.6 Robustness test**

513 In order to verify whether the relationship between environmental regulations and foreign direct  
 514 investment is sound, the following methods are used. The specific results are shown in Table 7. First,  
 515 the calculation method of the explained variable was replaced by this study as the actual use of foreign  
 516 direct investment as a percentage of GDP. Secondly, considering that the spatial weight matrix is the  
 517 basis of the spatial measurement model, the spatial weight matrix is replaced by the spatial geographic  
 518 adjacency matrix in this study. Third, the calculation method of the explained variable and the spatial  
 519 weight matrix are replaced simultaneously. Finally, based on the above analysis, the robustness results  
 520 are basically consistent with the above results, which provides evidence for the reliability of the above  
 521 results.

522 **Table 7.** Robustness test results

Variable	Dependent variable replacement	Weight matrix replacement	Dependent variable and weight matrix replacement
$\rho$	0.544***	0.176***	0.275***
lnER	-0.031	-0.146***	-0.038*
$W \times \ln ER$	-0.160**		
$W^* \times \ln ER$		-0.002	-0.060
Direct effect	-0.042**	-0.147***	-0.043**
Indirect effect	-0.371**	-0.031	-0.089*
Total effect	-0.413***	-0.178***	-0.133**
Control variable	control	control	control
Individual fixation	control	control	control
Time fixation	control	control	control
$R^2$	0.0044	0.0360	0.0055
LongL	-4101.5487	-5164.6888	-4146.2845
N	3864	3864	3864
Hausman	50.10***	69.56***	87.02***

523 **Note:** \*\*\*, \*\*, and \* indicate significance at the 1%, 5%, and 10% levels, respectively.

524 **5. Conclusions and policy recommendations**

525 Based on panel data of 276 prefecture-level cities in China from 2003 to 2016, verified the relationship  
 526 between environmental regulation and foreign direct investment by using SDM. The findings are as  
 527 follow: *Firstly*, foreign direct investment is significantly inhibited by environmental regulation; the  
 528 inflow of foreign-funded enterprises in neighboring regions are significantly inhibited by the  
 529 improvement of local environmental regulation; that is, environmental regulation has a significantly  
 530 negative spillover effect. *Secondly*, the environmental regulation of eastern cities has a significant  
 531 inhibitory effect on foreign direct investment. At the same time, the environmental regulation of eastern  
 532 cities has a significantly negative spillover effect; however, the indirect effect of non-eastern cities is  
 533 not significant. *Thirdly*, the environmental regulation of ordinary cities and key cities significantly

534 inhibit foreign direct investment, and the environmental regulation of ordinary cities have a significant  
535 negative spatial spillover effect. The environmental regulation of key cities does not have spatial  
536 spillover. *Finally*, in the perspective of industrial upgrading, environmental regulation plays a  
537 significant role in promoting foreign direct investment. The inflow of foreign-funded enterprises is  
538 significantly inhibited by the improvement of local environmental regulation in neighboring regions;  
539 that is to say, environmental regulation has a significantly negative spatial spillover effect. In the  
540 perspective of resource configuration, environmental regulation also has a significant role in promoting  
541 foreign direct investment and has a significantly negative spatial spillover. At the same time, too low  
542 resource configuration efficiency will significantly inhibit foreign direct investment. Based on the  
543 above conclusions, the following policy recommendations are put forward:

544 *Firstly*, from a national perspective, environmental regulation has a significant inhibitory effect  
545 on foreign direct investment. On the one hand, reasonable environmental governance policies and  
546 moderate environmental regulation measures can produce the "innovation compensation" effect to  
547 achieve the effect of "decontamination and preservation" for foreign-funded enterprises. Domestic  
548 enterprises can use the technology spillover effect of foreign direct investment to upgrade production  
549 technology, introduce advanced equipment, attract clean, capital-intensive and technology-intensive  
550 foreign-funded enterprises, and take the road of high-quality and sustainable development. On the other  
551 hand, environmental regulation has a significantly negative spatial spillover effect. In the context of  
552 environmental decentralization, the "top-to-top competition" of local government environmental  
553 governance has been strengthened; that is, environmental decentralization has a positive role in  
554 promoting local environmental governance. Environmental governance measures strengthened by local  
555 government competition while significantly suppressing foreign direct investment are more likely to  
556 appear a "one-size-fits-all approach" phenomenon. Therefore, it is necessary to formulate perfect and  
557 reasonable environmental control measures and adopt different environmental control measures to deal  
558 with foreign-funded enterprises with different pollution levels and development levels, but also to  
559 further improve the local government competition mode under the context of environmental  
560 decentralization.

561 Next, on the one hand, there are obvious differences between eastern cities and non-eastern cities  
562 in China. *First*, foreign direct investment is significantly inhibited by the environmental regulation of  
563 the eastern city; the environmental regulation also has significantly negative spatial spillover. Therefore,  
564 the eastern cities with a relatively developed economy and comprehensive infrastructure should  
565 continue to strengthen environmental regulation and establish a long-term mechanism for  
566 environmental regulation to drive enterprise technological innovation through technological innovation  
567 and other methods to make up for economic losses that restrict high pollution-related foreign  
568 companies. *Second*, the non-eastern city environmental regulation has a significant inhibitory effect on  
569 foreign direct investment, but its indirect effect is not significant. Therefore, non-eastern cities with  
570 relatively backward economies should actively adopt higher education and talent attraction and other  
571 methods to improve cities' overall technological innovation level to make full use of the technological  
572 spillover effect of foreign direct investment to develop the economy.

573 On the other hand, there are obvious differences in the spatial spillover effects of environmental  
574 regulation intensity between key cities and ordinary cities in China. The environmental regulation of  
575 ordinary cities has significant negative spatial spillovers, but the environmental regulation of key cities  
576 does not have spatial spillovers. Therefore, key cities should strengthen exchanges on the construction  
577 of ecological civilization, break down administrative barriers between cities, form the integration of  
578 environmental governance and avoid a "fragmented" pattern of environmental governance, ultimately,  
579 it enables enterprises to carry out technological innovation, and avoid the "free ride" behavior of  
580 enterprises.

581 At last, on the one hand, in the perspective of industrial upgrading, environmental regulation  
582 significantly promotes foreign direct investment and has a significantly negative spatial spillover effect.  
583 Therefore, *firstly*, more direct foreign investment will be directed into the technological innovation  
584 sector, and the technological spillover effect of foreign direct investment shall be fully utilized to  
585 complete the industrial upgrading of enterprises. *Secondly*, it is possible to appropriately lower the  
586 environmental regulatory threshold for foreign-funded enterprises with lower pollution levels to better  
587 exert the promotion effect of foreign direct investment on industrial upgrading. *Finally*, eastern cities  
588 with relatively developed economies can make full use of foreign direct investment to upgrade their  
589 industries; however, non-eastern cities with relatively backward economies are more suitable to force  
590 enterprises to upgrade their industries through the "innovation compensation" effect of environmental  
591 regulation. On the other hand, in resource configuration, environmental regulation also significantly  
592 promotes foreign direct investment and has a significantly negative spatial spillover effect. Therefore,  
593 local governments should make full use of the "innovation compensation" effect of environmental  
594 regulation to force enterprises to upgrade production technology. Meanwhile, local governments can  
595 also strengthen subsidies for enterprise technology innovation and provide low-interest loans to  
596 enhance the enterprise's resource allocation efficiency, thus attracting environmentally friendly,  
597 technical, and other foreign companies.

## 598 **Declarations**

- 599 • **Ethics approval and consent to participate:** Not applicable
- 600 • **Consent for publication:** Not applicable
- 601 • **Availability of data and materials:** All data generated or analyzed during this study are included  
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- 609 • **Authors' contributions:** **Wei Qiu:** Conceptualization, writing-original draft, formal analysis, data  
610 handling, and methodology. **Yaojun Bian:** Supervision, funding acquisition. **Jinwei Zhang:**  
611 Writing-review and editing, **Muhammad Irfan:** Supervision, Writing-review and editing, variable  
612 construction.

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