

# Strategic Interactions in Environmental Regulation Enforcement: Evidence from Chinese Provinces

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**Strategic Interactions in Environmental Regulation Enforcement:  
Evidence from Chinese Provinces**

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Les commentaires et analyses développés n'engagent que leurs auteurs qui restent seuls responsables des erreurs et insuffisances.

### ***Abstract***

This paper studies whether Chinese provinces set strategically their environmental stringency when faced with interprovincial competition for mobile capital. Using Chinese provincial data and spatial panel econometric models, we find that Chinese provinces do engage in this kind of strategic interaction, particularly among those with similar industrial structure. Furthermore, we haven't found evidence of asymmetric responsiveness suggested by the race to the bottom theory. Finally, the one-sided fiscal decentralization is likely to strengthen the strategic behavior. These empirical results call for a skeptical attitude towards China's decentralization of environment policy implementation as well as its fiscal arrangements.

JEL Classification: R5, H7, Q5, C2

Key Words: China, strategic interaction, pollution, spatial panel

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## 1. Introduction

Interjurisdictional relationship in environmental policymaking is an important subject in environmental federalism literature. Primarily focusing on the vertical division of responsibilities among different levels of government (Oates and Portney, 2003), environmental federalism researchers pay great attention to decentralization. For more than two decades, decentralization has been promoted by major international institutions in the worldwide and has become a trend in many developing countries (World Bank, 2000). However, despite its numerous advantages (Hayek, 1945; Oates, 1999; Tiebout, 1956), no consensus has been achieved on the efficiency of decentralization in providing environmental services (Fredriksson *et al.*, 2006). One common opponent opinion is that decentralized authority can lead to strategic interaction among jurisdictions and result in inefficient environmental policy. According to the capital-competition theory, in order to attract mobile capital, jurisdictions will choose strategically their environmental regulatory enforcement vis-à-vis their competitors. In the U.S. context, critics of decentralization often argue that states are primarily concerned with economic development and will relax their environmental regulation to gain an advantage over other states (Konisky, 2007).

Critical to the efficiency of decentralization, strategic interaction among governments is a major focus of theoretical and empirical work in public economics. Brueckner (2003) classifies strategic interaction models into two branches, namely spillover models and resource-flow models. Although these models were initially developed for fiscal or public finance policymaking, they are also widely used in environmental federalism studies to investigate strategic interaction in environmental policymaking among the U.S. states and among European countries. According to Fredriksson and Millimet (2002), fears of a destructive competition and excessive pollution were a significant factor leading to the

formation of the EPA in 1968 and the regulatory harmonization policy across the European Union.

China offers an interesting field to conduct strategic interaction researches. On one hand, environmental policy implementation system is strongly decentralized in China. Testing for strategic interaction in environmental regulatory enforcement will help us to understand the efficiency of this system. In this country, while the Ministry of Environmental Protection is in charge of the establishment of environmental laws, regulations, standards and policies, environmental policy implementation is the responsibility of the Environmental Protection Bureaus at regional and local level (OECD, 2006). In 2009, more than 90% of national public expenditures on environment were realized at subnational level. Chinese provincial governments have *de facto* power over environmental stringency enforcement. On the other hand, Chinese provinces are very likely to engage in capital competition. It is well known that Chinese local officials are appointed by the central government. Several studies show that after the 1978 reform, Chinese central government has created a yardstick competition among local officials in evaluating the latter on the basis of economic performance (Li and Zhou, 2005; Maskin *et al.*, 2000; Qian and Xu, 1993). This economic performance based competition can give local governments strong incentives to engage in capital completion at the cost of environment.

However, to our knowledge, very few studies have investigated strategic interaction in environmental regulation enforcement among Chinese jurisdictions. In this paper, we try to contribute to this part of literature in studying whether Chinese provinces set strategically their environmental stringency vis-à-vis their competitors for mobile capital. First we test for the existence of strategic interaction. Then we examine whether the strategic interaction follows the asymmetric pattern suggested by the race to the bottom theory. Finally, we study whether this strategic interaction is conditional on fiscal decentralization. The rest of paper is

organized as follows: in section 2, a brief literature review is made on theoretical and empirical studies of environmental regulatory strategic interaction. Our estimation strategy is presented in section 3. In section 4 we report our empirical results. And in the last section we conclude.

## **2. Literature review**

According to Revelli (2005), local governments can be thought of as interacting with one another along three main channels: preferences, constraints and expectations, which correspond respectively to the spillover, resource-flow and yardstick competition models classified in Brueckner (2003). Although these models were originally created to explain fiscal and public finance policymaking, they can be and have been already borrowed by a lot of environmental strategic interaction researches. Capital-competition models can be classified into the constraints interaction (or resource-flow) models. This branch of models is originally presented by tax competition theory (Oates, 1972). Tax competition theory assumes that jurisdictions compete with each other using tax rates for a fixed amount of mobile resource, in order to maximize local welfare (Brueckner and Saavedra, 2001; Buettner, 2001; Wilson, 1986). In the field of environmental regulatory enforcement, competition can take place among jurisdictions if they compete with each other with environmental stringency for a fixed amount of mobile capital. A great number of theoretical studies address this subject (Dijkstra, 2003; Glazer, 1999; Kuncce, 2004; Kuncce and Shogren, 2002, 2005, 2007; Levinson, 1997; Markusen *et al.*, 1995; Oates and Schwab, 1988; Roelfsema, 2007; Wellisch, 1995). These studies establish the framework to analyze welfare implication of interjurisdictional environmental regulatory competition. Particularly, many of them are interested in the “race to the bottom” hypothesis, under which destructive competition leads to excessively lax environmental stringency.

Numerous studies have found empirical evidences of environmental regulatory strategic interaction. For example, Fredriksson and Millimet (2002) measure the regulatory stringency by the environmental abatement costs and find that U.S. states do incorporate asymmetrically their neighboring states' regulatory stringency into their own decision making, i.e., a state is incited to apply higher abatement costs if its neighbors with relatively stringent regulations increase theirs. Using two panels of data on states' regulatory stringency, Levinson (2003) examines whether regulatory competition becomes more severe during the Reagan administration, when state control of environmental policy is greater. He finds that "states behave strategically, reacting to other states' environmental standard stringency when setting their own," but he doesn't find convincing evidence that competition steepened during the Reagan administration. Woods (2006) conducts an analysis of state surface-mining regulation to determine if the enforcement gap between a state and its competitor affects the stringency of the former. He finds evidence for a race to the bottom because states adjust their enforcement in response to their competitors when the enforcement stringency of the former exceeds that of the latter. Konisky (2007) compiles data on state enforcement of three U.S. federal pollution control programs: the CAA, the CWA, and the RCRA.<sup>1</sup> He constructs two measures of annual state enforcement effort: the annual number of sampling inspections and the unweighted sum of informal and formal punitive actions. Using spatial panels, he finds robust evidence of strategic regulatory behavior across the U.S. states. However, his evidence does not support the asymmetric pattern of strategic interaction predicted by the race to the bottom theory.

### **3. Estimation strategy**

This section presents the strategy we will use in the empirical analysis and different issues to be considered in estimation.

#### **3.1. Spatial econometric issues**

The standard way to test empirically for strategic interaction is using a spatial-lag model (Brueckner, 2003). This model is typically considered as the formal specification for the equilibrium outcome of a spatial or social interaction process, in which the value of the dependent variable for one agent is jointly determined with that of the neighboring agents (Elhorst, 2010). In a spatial-lag model, the pattern of interaction among jurisdictions is modeled by specifying a particular weighting matrix. The standard spatial-lag panel model can be written as follows:

$$Y_{it} = \delta \sum_{j \neq i} \mathbf{W}_{ijt} Y_{jt} + \boldsymbol{\beta} \mathbf{X}_{kit} + \mu_i + d_t + \varepsilon_{it}$$

$$|\delta| < 1, \quad i = 1, \dots, N, \quad k = 1, \dots, K, \quad t = 1, \dots, T \quad (1)$$

where index  $i$  is for the cross-sectional dimension (provinces in our sample),  $t$  is for the time dimension,  $Y_{it}$  is the dependent variable,  $\mathbf{W}_{ijt}$  is an  $N^2$  ordered spatial weight matrix describing the importance of assigned to jurisdiction  $j$  by jurisdiction  $i$  at time  $t$ ,  $\sum_{j \neq i} \mathbf{W}_{ijt} Y_{jt}$  is the spatially lagged dependant variable,  $\mathbf{X}_{kit}$  is an  $(N, K)$  vector of independent variables,  $\boldsymbol{\beta}$  is a  $(K, 1)$  vector of fixed but unknown parameters,  $\delta$  is the spatial autoregressive coefficient,  $\mu_i$  denotes a spatial specific effect which controls for all space-specific time-invariant variables whose omission could bias the estimates in a typical cross-sectional study,  $d_t$  is a time specific effect which controls for all unobservable space-invariant omitted variables, and  $\varepsilon_{it}$  is an independently and identically distributed error term with zero mean and variance  $\sigma^2$ .

In (1),  $\sum_{j \neq i} \mathbf{W}_{ijt} Y_{jt}$  is endogenous because of simultaneous causation with regard to  $Y_{it}$ . In order to address this problem, two methods have been developed. The first one is a maximum likelihood (ML) estimator proposed by Anselin (1988), and the second one is a two-stage

least squared instrumental variables (2SLS-IV) method proposed by Kelejian and Prucha (1998). According to Anselin (1988), spatial autocorrelation across data can emerge in two ways: on one hand, spatial-lag autocorrelation emerges when  $Y_{it}$  and  $\sum_{j \neq i} \mathbf{W}_{ijt} Y_{jt}$  are simultaneous determined by each other; on the other hand, spatial-error autocorrelation emerges if error terms are spatially autocorrelated with each other. Before using the ML estimator, a choice between spatial-lag and spatial-error models must be made, otherwise estimation of (1) can provide false evidence of strategic interaction (Brueckner, 2003). For this purpose, Anselin *et al.* (1996) propose the Lagrange Multiplier (LM) test and its robust version. However, the LM test as well as the ML estimator requires a normal distribution of error terms, otherwise test statistics would be biased (Elhorst, 2010).

Unfortunately, Jacque-Bera statistics reported in Table 1 suggest that normal distribution condition can't be satisfied in this paper. That's why we turn to the alternative 2SLS-IV method. The 2SLS-IV approach has been used in numerous strategic government interaction studies (Figlio *et al.*, 1999; Fredriksson and Millimet, 2002b; Levinson, 2003). This IV method has the virtue of not depending on normal distribution hypothesis. Moreover, Kelejian and Prucha (1998) show that their method generates a consistent estimate even in the presence of spatial-error dependence. The standard application of the 2SLS-IV approach is to instrument for  $Y_{jt}$  with a subset of the weighted characteristics of competitors-  $\sum_{j \neq i} \mathbf{W}_{ijt} \mathbf{X}_{kjt}$ .

The first stage of the 2SLS takes the form of (2):

$$\sum_{j \neq i} \mathbf{W}_{ijt} Y_{jt} = a + \mathbf{b} \sum_{j \neq i} \mathbf{W}_{ijt} \mathbf{X}_{kjt} + \eta_{it}, \quad i=1, \dots, N, \quad k=1, \dots, K, \quad t=1, \dots, T \quad (2)$$

where  $\sum_{j \neq i} \mathbf{W}_{ijt} \mathbf{X}_{kjt}$  is a subset of weighted average of competitors' characteristics, which satisfies the instrument exclusion restrictions.

### **3.2. Identification issues**

Two major issues arise when one tries to identify potential strategic interaction among jurisdictions. The first one is to identify neighbors against non-neighbors. The second one is to assign appropriate relative importance to each designated neighbor. Both of these issues have to be addressed in constructing weighting matrices which reflect interaction patterns among jurisdictions.

Concerning neighbors against non-neighbors identification, it is reasonable to assume that the decision making of a Chinese province may be affected by only a certain number of other provinces (defined as its neighbors), and not by all other provinces. In the literature, different neighbor definitions have been adopted. The simplest and commonly used one is a geographical contiguous definition. This definition assumes that jurisdictions interact with each other if they share common borders. The corresponding weighting matrix for contiguous neighbors is a contiguity matrix. In a contiguity matrix, “one” is given to two cities sharing common border and “zero” in the opposite case. A second way to define neighbors is based on geographical distance: jurisdictions are considered as neighbors if the geographical distance between them is inferior to a certain critical value. A third way to identify neighbors is based on similarity criteria. This definition assumes that jurisdictions may interact with each other not because they share the same border but because they share a set of similarities, e.g., the same region, similar industrial structure, similar income per capita, similar racial composition, etc. In the U.S. context, two regional classifications are frequently used, namely the BEA (Bureau of Economic Analysis) classification and the classification proposed by Crone (1998/1999).

It is also important to assign relative importance to different neighbors. Implicit in the choice of weights is the assumption that states may be more responsive to environmental policy in neighboring states responsible for greater generation of transboundary pollution or

greater competition for capital. Different weighting schemes have been adopted in the literature. For example, Fredriksson *et al.* (2004) and Fredriksson and Millimet (2002) each use three different schemes, namely equal weights, population weights, and income weights. Konisky (2007) uses population weights and argued that results are not sensitive to weighting choice. In a distance matrix, neighbors are weighted by the inverse of geographical distance (Madariaga and Poncet, 2007). In an income similarity matrix, neighbors are weighted by the inverse of absolute value of income per capita difference (Case *et al.*, 1993).

Identification of interaction pattern is an important issue. As argued in Revelli (2005), although spatial econometric methods allow testing for existence of strategic interaction, they do not allow discriminating among different theoretical explanations for the observed spatial autocorrelation. The simple reason is that although strategic interaction models can be based on different assumptions, they conduct to the same reaction function for empirical analysis (Brueckner, 2003). In this paper, we try to test for capital-competition driven strategic interaction among Chinese provinces. For this purpose, different weighting matrices are adopted. First of all, classical contiguity matrices with equal, population and income weights are used to test for the overall effect. It is notable that strategic interaction associated to these geographically based patterns may be a mix of different effects (e.g., pollution spillovers, capital competition.) As a result, in order to test more specifically for capital competition, an industrial structure similarity matrix is constructed with yearly sectorial data of each province. This matrix weights a province's neighbor by an index of industrial structure similarity between them.<sup>2</sup> The implicit assumption is that competition for capital is more likely to take place between provinces with similar industrial structures. Because no geographical constraints are imposed to industrial structure similarity, there is no reason to expect that this matrix captures pollution spillovers.

### 3.3. Asymmetric effects model

Following Fredriksson and Millimet (2002) and Konisky (2007), we consider an alternative model where provinces' responsiveness is asymmetric:

$$Y_{it} = \delta_0 I_{it} \sum_{j \neq i} \mathbf{W}_{ijt} Y_{jt} + \delta_1 (1 - I_{it}) \sum_{j \neq i} \mathbf{W}_{ijt} Y_{jt} + \beta \mathbf{X}_{kit} + \mu_i + d_t + \varepsilon_{it}$$

$$i = 1, \dots, N, \quad k = 1, \dots, K, \quad t = 1, \dots, T \quad (3)$$

where

$$\left\{ \begin{array}{l} I_{it} = 1, \text{ if } Y_{it} > \sum_{j \neq i} \mathbf{W}_{ijt} Y_{jt}; \\ I_{it} = 0, \text{ otherwise.} \end{array} \right.$$

This specific asymmetric pattern is suggested by the race to the bottom theory, according to which a province responds to its competitors only if its own regulatory situation is at a disadvantage vis-à-vis its competitors.<sup>3</sup> In (3),  $I_{it} = 1$  if province  $i$ 's own environmental stringency is above that of its competitors, i.e.,  $i$  is at a disadvantage for attracting mobile capital relative to its competitors. On the contrary,  $I_{it} = 0$  if province  $i$ 's own environmental stringency is below that of its competitors, i.e.,  $i$  is at an advantage for attracting mobile capital relative to its competitors. The race to the bottom theory suggests that  $\delta_0 > 0$ , and that  $\delta_1$  should not be statistically different from zero.

### 3.4. Nonlinear effects model

It is possible that strategic interaction among provinces is not linear and is conditional on certain provincial characteristics, e.g., fiscal arrangements. China has a one-sided fiscal decentralization: while public expenditures are largely decentralized, fiscal revenues are recentralized after 1994. In this context, subnational governments suffer from significant fiscal imbalances and have excessively heavy expenditure responsibilities which are

mismatched with their revenue assignments (World Bank, 2002). These governments depend largely on intergovernmental transfers, which are not always transparent or adequate. It is argued that in many poor localities, fiscal gap has led to the under-provision of basic public services (Martinez-Vazquez *et al.*, 2007). Environment can also be victim of this situation: given the severe budgetary pressures, local governments may use lax environmental stringency as a tool for attracting mobile capital and creating taxable resources. If this is the case, fiscal imbalance will matter for capital-competition driven strategic interaction. It is reasonable to assume that provinces with greater fiscal imbalance would be likely to react more strategically when enforcing their environmental stringency. In order to control for this nonlinear effect, we introduce an interaction  $\mathbf{W}_{ijt} Y_{jt} * IMB_{it}$ , where  $IMB_{it}$  is an indicator of fiscal imbalance of province  $i$  in year  $t$ . The nonlinear effects model to estimate is as follows:

$$Y_{it} = \delta \sum_{j \neq i} \mathbf{W}_{ijt} Y_{jt} + \varphi \cdot IMB_{it} * \sum_{j \neq i} \mathbf{W}_{ijt} Y_{jt} + \pi \cdot IMB_{it} + \beta \mathbf{X}_{ikt} + \mu_i + d_t + \varepsilon_{it}$$

$$i = 1, \dots, N, \quad k = 1, \dots, K, \quad t = 1, \dots, T \quad (4)$$

#### 4. Empirical analysis - strategic interaction among Chinese provinces

##### 4.1. Data and variables

We use a panel dataset of 30 Chinese provinces (Tibet, Hongkong and Macao excluded) over the period 2004-2009. The main sources of data are China Statistical Yearbook (2005-2010), China Environment Yearbook (2005-2010) and China Industrial Economic Statistical Yearbook (2005-2010). 2004 is chosen as the beginning year of our study because it is the year when China Industrial Economic Statistical Yearbook starts to publish consistent data of added values by industrial sector for each province. Before that year, data of several sectors, e.g., textile garments, shoes and caps products, and special equipment manufacturing industry,

were not reported. Since consistent sectorial data are indispensable to construct our industrial similarity weighting matrix, we decide to focus on the period post-2004.

The dependent variable ( $Y$ ) is provincial pollution levy per industrial added value. We use this indicator as a proxy of environmental stringency. The nationwide implementation of pollution levy system in China was started in 1982 (Wang and Wheeler, 2005). First designed for above-standard waste water discharges, this system was expanded to both below-standard and above-standard waste water discharges and air pollution in the 1990s (Wu, 2010). Provincial levy per industrial added value can be proxy of the environmental stringency for several reasons: first, In China, concentration standards for levy collection are set jointly at the national and provincial levels thus vary across provinces (Dean *et al.*, 2009). Secondly, pollution levy is an economic instrument implemented at local level. Several studies show that levy affects significantly polluters' behaviors (Dasgupta *et al.*, 2001; Wang and Wheeler, 2003).

Finally, different from other studies which use levy per volume of pollution (e.g., Dean *et al.* (2009)), we use levy per industrial added value because only aggregated levy data (without details by pollutant) have been reported during the period 2004-2009. As a result, levy per industrial added value is a proxy of the overall environmental stringency.

In order to test for nonlinear effects, provincial fiscal imbalance ( $IMB$ ) is introduced in equation (4).  $IMB$  is a vertical imbalance indicator defined by (5):

$$IMB_{it} = \frac{Transfers_{it}}{Expenditures_{it}}, \quad t = 1, \dots, T, \quad i = 1, \dots, I \quad (5)$$

where  $i$  denotes the province,  $t$  denotes the year,  $Transfers_{it}$  denotes the total fiscal transfers that province  $i$  receives from the central government in year  $t$ , and  $Expenditures_{it}$  denotes the consolidated budgetary expenditures spent by province  $i$  in year  $t$ . The construction of  $IMB$  is

inspired by IMF's Government Finance Statistics (GFS), where vertical imbalance of a country is measured by transfers to sub-national governments as a share of sub-national government expenditures. In this paper, *IMB* measures the degree to which province *i* relies on transfers from central government to support its expenditures.<sup>4</sup>

Other independent variables are introduced to control for provincial characteristics. First of all, one may argue that levy per industrial added value of a province is not only determined by its environmental stringency but also by the pollution intensity of its industrial production. It is true that a province with weak environmental standards may collect high levy per industrial added value if more pollution is associated to its unit of industrial production. In order to control for this endogeneity, we introduce intensities of two major industrial pollutants – SO<sub>2</sub> and COD (chemical oxygen demand) per industrial added value (*SO<sub>2</sub>intensity* and *CODintensity*). Then, in following the environmental Kuznets curve (EKC) hypothesis, we include gross regional product (*GRP*) per capita (a proxy of income per capita), its squared term (*GRP*<sup>2</sup>) and its cubed term (*GRP*<sup>3</sup>). Income per capita reflects economic development level of a province. It is considered to affect its environmental performance of the latter because an economically more developed province may care more about environment and have more resources for environmental protection. After that, population density (*Density*) is also included. Population density can affect environmental performance through economic scale effects. Governments may also make more efforts to abate pollution where it's more densely populated. In addition, Wang *et al.* (2003) show that state-owned enterprises have more bargaining power with local environmental authorities when negotiating the enforcement of pollution levy. As a result, we suppose that the importance of state-owned sector in a province's industry may have an effect on its environmental stringency. To capture this effect, we introduce the proportion of industrial added value realized by state-owned enterprises (*State*). Moreover, two openness variables – trade opening

(*Trade*) and FDI (*FDI*) are also included. Trade opening may affect a province's industrial structure and further more affect its environmental stringency through the "composition" effect<sup>5</sup> (Cole and Elliott, 2003). We introduce FDI because environmental levy enforcement is shown to have effect on FDI localization among provinces (Dean *et al.*, 2009; He, 2006). It is possible that provinces with different levels of FDI have different level of incentives use pollution levy for attracting foreign capital. Furthermore, public pressure can also affect the enforcement of environmental levy (Wang and Di, 2002; Wang and Wheeler, 2003). Two variables are introduced to control for this effect: citizen complaint letters (*Letters*) regarding environmental issues and percentage of population with high-education (*Edu*). Finally, provincial specific effects and year dummies are introduced to control for non-observed provincial or yearly specific effects. Variable definition and descriptive statistics are reported in Appendix 2 and 3.

## **4.2. Estimation results**

Estimation results are reported first for contiguity matrices with different weighting schedules and then for industrial structure similarity matrix with linear, asymmetric and nonlinear effects.

### **4.2.1. Results with contiguity matrices**

Table 1 presents estimation results of equation (1) with contiguity matrices. Equal weights, population weights, and income weights are used respectively. Jacque-Bera test statistics show strongly abnormal residuals, which lead us to prefer IV estimator to ML estimator. Hausman test statistics allow rejecting its null hypothesis in none of the specifications. So efficient models with random effects are preferred and adopted. Column 1 presents results with equally weighting contiguity matrix. Column 2 presents results with population weighting contiguity matrix, and column 3 presents results with income weighting contiguity

matrix. A subset of  $\mathbf{W}_{ijt} \mathbf{X}_{ijt}$  is used as instruments in all regressions.<sup>6</sup> Kleibergen-Paap rk LM statistics indicate that we can reject the null hypothesis of underidentified instruments for all 2SLS regressions; the null hypothesis of exogenous  $\sum_{j \neq i} \mathbf{W}_{ijt} Y_{ijt}$  is strongly rejected for equal and income weights and cannot be rejected at 5% level for population weights; Hansen statistics show that we can't reject the null hypothesis that the instruments satisfy the orthogonality conditions at the confidence level of 5%.

Results show that for equal and income weights, everything else being equal, geographical contiguous provinces do interact strategically with each other and in the same direction in setting their environmental stringency enforcement. However, the strategic interaction found in these two cases is weak in level (with elasticities inferior to 0.1) and in significance. (The null hypothesis of zero strategic interaction cannot be rejected at the confidence level of 5%.) Regarding population weights, the absence of strategic interaction cannot be rejected at 10% level. These results suggest that strategic interaction among contiguous provinces is weak and positive, if there is any. Nevertheless, we should be skeptical facing these results because as stated previously, contiguity is a very simplified interaction pattern: on one hand, provinces may interact with each other even if they don't share common borders; on the other hand, given different theoretical explanation behind strategic interaction, the weak evidence may simply be due to a mix of different driving effects.

Table 1: Results of (1) with different weighting contiguity matrices

$Y=Levy$	Equally weighting contiguity matrix	Population weighting contiguity matrix	Income weighting contiguity matrix
$\sum_{j \neq i} \mathbf{W}_{ij} Y_{jt}$	0.069* (0.056)	0.079 (0.131))	0.090* (0.057))
<i>GRP3</i>	-0.231*** (0.001)	-0.233*** (0.001)	-0.223*** (0.001)
<i>GRP2</i>	5.357*** (0.001)	5.406*** (0.001)	5.165*** (0.001)
<i>GRP</i>	-40.845*** (0.001)	-41.160*** (0.001)	-39.405*** (0.001)
<i>SO2intensity</i>	0.562*** (0.000)	0.565*** (0.000)	0.583*** (0.000)
<i>CODintensity</i>	0.070 (0.543)	0.071 (0.564)	0.064 (0.589)
<i>Density</i>	0.144** (0.045)	0.161** (0.021)	0.162** (0.015)
<i>State</i>	-0.179 (0.606)	0.415 (0.562)	0.527 (0.453)
<i>Trade</i>	-0.327 (0.214)	-0.323 (0.241)	-0.307 (0.244)
<i>FDI</i>	-3.323 (0.110)	-3.485 (0.108)	-3.271 (0.117)
<i>Letters</i>	-0.085*** (0.001)	-0.084*** (0.002)	-0.082*** (0.002)
<i>Edu</i>	-0.367 (0.838)	-0.155 (0.932)	-0.184 (0.916)
<i>Dum2005</i>	0.081 (0.210)	0.076 (0.270)	0.075 (0.272)
<i>Dum2006</i>	0.076 (0.293)	0.069 (0.356)	0.072 (0.328)
<i>Dum2007</i>	-0.045 (0.671)	-0.042 (0.710)	-0.030 (0.781)
<i>Dum2008</i>	0.045 (0.777)	0.056 (0.746)	0.072 (0.664)
<i>Dum2009</i>	-0.037 (0.853)	-0.013 (0.954)	0.010 (0.964)
Constant	97.672*** (0.003)	98.082*** (0.002)	93.876*** (0.003)
Number of obs	180	180	180
Number of groups	6	6	6
Centered R2	0.520	0.511	0.521
Uncentered R2	0.986	0.985	0.987
Jacque-Bera test Prob>chi2		(0.000)	
Hausman test Prob>chi2	(0.645)	(0.612)	(0.940)
Kleibergen-Paap rk LM statistic Prob>chi2	(0.000)	(0.000)	(0.005)
Anderson-Rubin Wald test Prob>chi2	(0.021)	(0.154)	(0.005)
Hansen J statistic Prob>chi2	(0.146)	(0.458)	(0.225)

Note: Heteroscedastic-consistent *p-value* in parentheses, with \*\*\*, \*\* and \* denoting significance at 1, 5 and 10 percent level, respectively

#### 4.2.1 Strategic interaction with industrial structure similarity matrix

Estimation results with industrial structure similarity matrix are presented in Table 2. The first column reports results for linear strategic interaction as specified in (1); the second column reports results for asymmetric strategic interaction as specified in (3); and the third column

reports results for nonlinear strategic interaction as specified in (4). In all 2SLS regressions, models with random effects are preferred. Test statistics show that our specifications are fitted: the null hypothesis of underidentified instruments and the null hypothesis of the absence of endogeneity are rejected at 5%; the null hypothesis of overidentified instruments cannot be rejected at 5%.

Table 2: Strategic interaction with industrial structure similarity matrix

	Results of (1)	Results of (3)	Results of (4)
$IMB_{it} * \sum_{j \neq i} \mathbf{W}_{ijt} Y_{ijt}$			2.106** (0.032)
$I_{it} \sum_{j \neq i} \mathbf{W}_{ijt} Y_{ijt}$		1.461* (0.071)	
$(1 - I_{it}) \sum_{j \neq i} \mathbf{W}_{ijt} Y_{ijt}$		1.519* (0.061)	
$\sum_{j \neq i} \mathbf{W}_{ijt} Y_{ijt}$	1.947** (0.050)		1.869** (0.049)
<i>GRP3</i>	-0.240*** (0.002)	-0.221*** (0.003)	-0.310*** (0.000)
<i>GRP2</i>	5.664*** (0.001)	5.168*** (0.003)	7.151*** (0.000)
<i>GRP</i>	-44.020*** (0.001)	-39.891*** (0.002)	-54.721*** (0.000)
<i>SO2intensity</i>	0.438*** (0.001)	0.398*** (0.000)	0.449*** (0.000)
<i>CODintensity</i>	0.141 (0.230)	0.100 (0.273)	0.151 (0.178)
<i>Density</i>	0.144* (0.057)	0.153*** (0.007)	0.128* (0.094)
<i>State</i>	-0.509 (0.226)	-0.191 (0.580)	-0.543 (0.214)
<i>Trade</i>	-0.211 (0.486)	-0.145 (0.584)	-0.099 (0.739)
<i>FDI</i>	-2.668 (0.189)	-2.472 (0.146)	-2.290 (0.265)
<i>Letters</i>	-0.094*** (0.000)	-0.073*** (0.002)	-0.097*** (0.000)
<i>Edu</i>	-0.028 (0.988)	-0.149 (0.922)	1.136 (0.567)
<i>IMB</i>			13.143** (0.042)
<i>Dum2005</i>	-0.041 (0.688)	-0.042 (0.638)	-0.123 (0.287)
<i>Dum2006</i>	0.049 (0.547)	0.012 (0.875)	0.031 (0.706)
<i>Dum2007</i>	0.044 (0.712)	-0.037 (0.710)	0.131 (0.265)
<i>Dum2008</i>	0.554* (0.067)	0.323 (0.202)	0.931*** (0.005)
<i>Dum2009</i>	0.676 (0.102)	0.390 (0.270)	1.231*** (0.008)
Constant	120.567*** (0.000)	105.775*** (0.001)	146.316*** (0.000)
Number of obs	180	180	180
Number of groups	6	6	6
Centered R2	0.472	0.636	0.463
Uncentered R2	0.985	0.993	0.988
Hausman test Prob>chi2	(0.338)	(0.076)	(0.783)
Kleibergen-Paap rk LM statistic Prob>chi2	(0.000)	(0.000)	(0.000)
Anderson-Rubin Wald test Prob>chi2	(0.013)	(0.000)	(0.037)
Hansen J statistic Prob>chi2	(0.110)	(0.056)	(0.216)

Note: Heteroscedastic-consistent *p-value* in parentheses, with \*\*\*, \*\* and \* denoting respectively significance at 1, 5 and 10 percent level

Obviously, strategic interaction among provinces with similar industrial structure is much stronger and more significant than what was found among contiguous neighbors. When linear effect is considered, estimation results of equation (1) show that everything else being equal, a province would decrease (increase) its own environmental levy per industrial added value by 1.947% if its weighted competitors decrease (increase) theirs by 1%. The null hypothesis of zero strategic interaction can be rejected at the confidence level of 5%. These results suggest that environmental regulation stringencies of industrial competitors are effectively strategically determined.

When equation (3) is estimated, results reported in the second column don't show evidence of asymmetric responsiveness. According to the race to the bottom theory, only the coefficient of  $I_{it} \sum_{j \neq i} \mathbf{W}_{ijt} Y_{jt}$  should be positive and significant. However, we find that the coefficients of  $I_{it} \sum_{j \neq i} \mathbf{W}_{ijt} Y_{jt}$  and  $(1 - I_{it}) \sum_{j \neq i} \mathbf{W}_{ijt} Y_{jt}$  are both positive and weakly significant. This finding suggests that, no matter whether a province's environmental stringency is stricter or not than its competitors, strategic interaction is not asymmetrically differential as predicted by the race to the bottom theory.<sup>7</sup>

Finally, estimation results of the nonlinear effects model (4) are reported in the last column. Consistent with the prediction in section 3, the interaction  $\mathbf{W}_{ijt} Y_{jt} * IMB_{it}$  has a positive and significant coefficient of 2.106, which suggests that strategic interaction among provinces is conditional on provincial fiscal imbalance. The more a province is fiscally dependent on central government's transfers for expenditure, the more strategically it will set its environmental stringency vis-à-vis its competitors. These results are helpful to understand the potential inefficiency of China's actual fiscal decentralization system for public good provision, especially in the environmental protection domain. Marginal effects of

competitors' environmental stringency conditional on fiscal imbalance are presented in Appendix 4. Over the period 2004-2009, the province which has the strongest strategic interaction would be Qinghai, with a mean marginal effect of 3.688; the province which has the weakest strategic interaction would be Beijing, with a mean marginal effect of 2.233. In other words, everything else being equal, a decrease (an increase) of 1% in environmental stringency of their competitors would induce Qinghai and Beijing to decrease (increase) their own environmental stringency by 3.688% and 2.233%, respectively. It is notable that the significant nonlinear effects suggest that our strategic interaction is indeed driven by capital competition rather than pollution spillovers. The reason is that severe fiscal pressure can create strong incentives to attract mobile resources but has little to do with transboundary pollution problems.

Concerning control variables, GRP per capita, its squared and cubed terms have significant coefficients in all regressions. Population density has always a positive and significant coefficient, suggesting that everything else being equal, environmental stringency is stricter where it is more populated. In addition, complaint letter number has always a negative and significant coefficient, suggesting that public pressure weakens environmental stringency. This seems against intuition but is not surprising: public pressure of a province and its environmental stringency may be simultaneously affected. It is normal that stricter environmental stringency leads to fewer complaints. Given that complaint letter number is only a control variable, we don't address its endogeneity in this paper.

## **5. Conclusion:**

Critics of decentralization often argue that capital competition and strategic interaction among jurisdictions in environmental regulatory enforcement may lead to inefficiently weak stringency and excessive pollution. Although this subject has been extensively studied in the U.S. context, very little attention has been given to the case of China. This paper contributes

to the environmental federalism literature in addressing the question of whether Chinese provinces engage in strategic environmental policymaking.

More specifically, we study whether Chinese provinces set strategically their environmental stringency vis-à-vis their competitors for mobile economic investment. It seems to us that this capital-competition driven strategic interaction is high likely to exist because, on one hand, Chinese central government has created a economic-performance based yardstick competition among local officials thus a strong local political incentive to attract investment; on the other hand, environmental policy implementation is largely decentralized, which endows Chinese local governments *de facto* authority of environmental stringency enforcement and the possibility to use it as investment-attracting instrument. Using Chinese provincial data and spatial panel econometric methods, we find that Chinese provinces do engage in strategic interaction when they set their pollution levy. Moreover, this strategic interaction is particularly strong among provinces with similar industrial structure (i.e., potential competitors for attracting mobile capital). Furthermore, we haven't found evidence of asymmetric responsiveness suggested by the race to the bottom theory. Provinces respond strategically no matter whether they are at an advantage or a disadvantage. Finally, the one-sided fiscal decentralization arrangements may strengthen strategic interaction.

Our empirical results in Chinese context lead us to take a skeptical attitude about the decentralization of environment policy implementation in this country. The strategic interaction among provinces driven by capital competition could be one of the reasons for China's severe environmental degradation. Meanwhile, it is notable that the positive interaction also suggests a possibility to improve the whole environment beginning by some pilot regions. After all, it would be of great importance to develop more appropriate institutions for environmental protection and resource allocation in China, in paying more attention to both vertical and horizontal interjurisdictional relations.

**Notes**

1. Abbreviations of three federal pollution control programs: the Clean Air Act (CAA), the Clean Water Act (CWA), and the Resource Conservation and Recovery Act (RCRA).
2. Different indices have been proposed in the literature to estimate structure similarity between economies (Brixiova et al., 2010; Krugman, 1991; Landesmann and Szekely, 1995; UNIDO, 1979). In this paper, we utilize the index proposed by UNIDO (1979). More details on the construction of this index can be found in Appendix 1.
3. The race to the bottom theory suggests also another asymmetric pattern: a jurisdiction responds only if the weighted average of its competitors' environmental enforcement efforts drop from the previous year (Konisky, 2007). We haven't tested for this model because quasi total observations in our sample have decreasing pollution levy over the period 2004-2009.
4. Following the GFS indicator, IMB doesn't distinguish conditional transfers versus general purpose transfers, due to data unavailability.
5. The "composition" effect refers to the way that trade liberalization changes the mix of a country's production towards those products where it has a comparative advantage.
6. The contiguity matrix with equal weights is not time-variant.
7. In the U.S. context, Fredriksson and Millimet (2002) and Konisky (2007) haven't found asymmetric effects suggested by the race to bottom theory neither.

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## Appendix 1: Industrial structure similarity index (UNIDO, 1979)

In order to construct our Industrial structure similarity matrix, we use the industrial structure similarity index proposed by UNIDO (1979). This index can be calculated as follows:

$$S_{ijt} = \frac{\sum_{k=1}^n X_{ikt} X_{jkt}}{\sqrt{\sum_{k=1}^n X_{ikt}^2 \sum_{k=1}^n X_{jkt}^2}}, \quad i=1, \dots, N, \quad j \neq i, \quad t=1, \dots, T$$

where  $i$  and  $j$  denote provinces,  $t$  denotes the year,  $S_{ijt}$  is the industrial structure similarity index between province  $i$  and province  $j$ ,  $k$  denotes the industry,  $X_{ikt}$  and  $X_{jkt}$  denote the employment number (or added value) in (created by) industry  $k$  in provinces  $i$  and  $j$ , respectively.  $S_{ijt}$  has a value between zero and one and increases with the similarity level between province  $i$  and province  $j$ .  $S_{ijt}$  takes the value “one” when province  $i$  and province  $j$  have exactly the same industrial structure. In this paper, default of sectorial added value data in several years, we calculate  $S_{ijt}$  with employment data of 27 industrial sectors published in China Industrial Economic Statistical Yearbook (2005-2010). These 27 sectors are: production and supply of electric power and heat power, manufacture of electrical machinery and equipment, manufacture of textile wearing apparel, foot ware and caps, manufacture of textile, mining and processing of nonmetal ores, manufacture of nonmetallic mineral products, mining and processing of ferrous metal ores, smelting and pressing of ferrous metals, manufacture of chemical fibers, manufacture of raw chemical materials and chemical products, manufacture of transport equipment, manufacture of metal products, mining and washing of coal, processing of food from agricultural products, processing of petroleum, coking, processing of nuclear fuel, manufacture of foods, manufacture of beverages, manufacture of communication equipment, computers and other electronic equipment, manufacture of general purpose machinery, manufacture of tobacco, manufacture of medicines, manufacture of measuring instruments and machinery for cultural activity and office work, mining and processing of non-ferrous metal ores, smelting and pressing of non-ferrous metals, manufacture of paper and paper products and manufacture of special purpose machinery.

## Appendix 2: Variable names and significations

Variable names	significations
<i>Y</i>	Pollution levy per industrial added value (in log)
<i>wY</i>	Spatially lagged Pollution levy per industrial added value (in log)
<i>GRP</i>	Gross regional product per capita(USD at 2005 price, in log)
<i>SO2intensity</i>	SO2 emission per industrial added value (tons per 10000 USD at 2005 price, in log)
<i>CODintensity</i>	Chemical oxygen demand per industrial added value (tons per 10000 USD at 2005 price, in log)
<i>Density</i>	Population density (persons per km <sup>2</sup> , in log)
<i>State</i>	Proportion of industrial added value created by state-owned enterprises
<i>Open</i>	Ratio between the total trade and gross regional product
<i>FDI</i>	Ratio between actually used foreign direct investments and gross regional product
<i>Letters</i>	Number of complaint letters regarding environmental issues (in log)
<i>Edu</i>	Percentage of population with high education
<i>IMB</i>	Vertical fiscal imbalance indicator
<i>Dum2005</i>	1 if the year of 2005, 0 if not
<i>Dum2006</i>	1 if the year of 2006, 0 if not
<i>Dum2007</i>	1 if the year of 2007, 0 if not
<i>Dum2008</i>	1 if the year of 2008, 0 if not
<i>Dum2009</i>	1 if the year of 2009, 0 if not

## Appendix 3: Summary Statistics

Variable	Obs.	Mean	Standard Deviation	Minimum	Maximum
<i>Y</i>	180	0.002	0.001	0.000	0.009
<i>GRP</i>	180	2861.228	2075.915	511.462	11961.220
<i>SO2intensity</i>	180	0.233	0.215	0.017	1.150
<i>CODintensity</i>	180	0.058	0.072	0.001	0.547
<i>Density</i>	180	403.948	527.151	7.486	3029.969
<i>State</i>	180	0.451	0.191	0.059	0.834
<i>Open</i>	180	0.358	0.411	0.045	1.668
<i>FDI</i>	180	0.027	0.020	0.001	0.082
<i>Letters</i>	180	18231.950	19796.200	50.000	105942.000
<i>Edu</i>	180	0.072	0.050	0.025	0.289
<i>IMB</i>	180	0.520	0.185	0.141	0.930
<i>Dum2005</i>	180	0.167	0.374	0.000	1.000
<i>Dum2006</i>	180	0.167	0.374	0.000	1.000
<i>Dum2007</i>	180	0.167	0.374	0.000	1.000
<i>Dum2008</i>	180	0.167	0.374	0.000	1.000
<i>Dum2009</i>	180	0.167	0.374	0.000	1.000

## Appendix 4: Nonlinear marginal effects conditional on IMB

	Overall	2004	2005	2006	2007	2008	2009
Mean	2.964	3.029	2.950	2.948	2.969	2.937	2.952
Minimum	2.165	2.300	2.262	2.241	2.187	2.165	2.203
Lower quartile	2.626	2.668	2.621	2.571	2.530	2.540	2.631
Median	3.078	3.129	3.063	3.067	3.111	3.078	3.045
Upper quartile	3.214	3.290	3.143	3.161	3.205	3.219	3.222
Maximum	3.827	3.827	3.759	3.637	3.623	3.674	3.605
S.D.	0.390	0.378	0.379	0.378	0.421	0.416	0.393
Observation number	180	180	180	180	180	180	180