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1 **Industrial SO<sub>2</sub> pollution and agricultural losses in China:**  
2 **Evidence from heavy air polluters**

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28  
29 **Abstract**

30 This paper aims to assess the agricultural losses caused by the 2069 state-monitored heavily  
31 air polluting enterprises located in 899 Chinese counties. We examine the correlation  
32 between per capita number of state-monitored enterprises and other socio-economic indices  
33 to show the negative impacts of sulphur dioxide (SO<sub>2</sub>) industrial air pollution on agricultural

34 development in the regions. Despite these enterprises being the main drivers of economic  
35 development in China's counties, surrounding agricultural land continues to be degraded  
36 because of the associated SO<sub>2</sub> emissions. The cost of agricultural losses due to pollution is  
37 estimated at US\$ 1.43 billion, representing 0.66% of the total agricultural value added of the  
38 899 Chinese counties. The findings highlight the importance of cleaner production and  
39 have policy implications for dealing with industrial air pollution.

40 **Keywords:** Yield loss; sulphur dioxide; externalities; Chinese counties; air quality  
41 monitoring; impact pathway.

42

### 43 **1. Introduction**

44 Most environmental challenges have their root sources in activities that are happening  
45 locally (ICLEI, 1993; Thomson and Jackson, 2007; Wei et al., 2010) and pursuing  
46 economic growth is no doubt one of them. China is a good example of this. A high-GDP  
47 fever by county-level governments<sup>1</sup> has produced astonishing results. Between 2000 and  
48 2006, the 13.8% annual average GDP growth of the middle China counties was much  
49 higher than the national level (Wei et al., 2010). This rapid economic development  
50 however has been a heavy burden on the environment.

51 The energy-extensive industries on which the Chinese counties have heavily relied for  
52 economic growth are largely based on fossil fuel consumption and this has caused  
53 increased emissions of sulphur oxides (SO<sub>x</sub>), nitrogen oxides (NO<sub>x</sub>), carbon dioxide (CO<sub>2</sub>),  
54 soot and fine particulates (Wang et al., 2007). The conventional air pollutants associated

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<sup>1</sup> County or county level division is the official English translation of the Chinese word Xian. It describes the third (or in some provinces second level) of the administrative hierarchy, although there are also autonomous counties. It is estimated that mainland China has 1,464 counties (<http://www.china-county.org/a/xianyujingjitansuo/2012/0529/7493.html>). In English Xian sometimes is translated as township.

55 with industrial development, such as PM<sub>10</sub> (particulate matter with a diameter of 10  
56 micrometres or less), SO<sub>2</sub> (sulphur dioxide), NO<sub>x</sub> (mono nitrogen oxides) and surface-level  
57 ozone cause considerable damage not only to human health but also affect the natural and  
58 social environment, including crops, forests, water resources, ecosystems, buildings,  
59 historical monuments etc. (Bell et al., 2011; Mirasgedis et al., 2008; Zhou, 2010). Industry  
60 released gases, such as SO<sub>2</sub>, can cause acid rain that affects the quality of the soil and the  
61 growth of crops leading to agricultural losses.

62 With SO<sub>2</sub> being such a significant air pollutant in China (Tian et al., 2012), the  
63 country's consecutive five-year plans have set specific targets for its reduction (10%  
64 between 2006 and 2010 and a further 8% between 2011 and 2015). However, due to the  
65 inconsistent availability and even lack of cleaner production technologies and pollution  
66 treatment facilities, the rapid regional industrialisation of many counties continues to create  
67 pollution and furthers environmental vulnerability (Wei et al., 2010). The high risks of  
68 people being exposed to pollution and overall deterioration of the natural environment  
69 have raised grave concerns about the hidden costs of economic development in the regions.

70 China has the highest output of grain and other staple foods in the world (Wong &  
71 Huang, 2012) and the agricultural sector is still the main source of income in regional areas.  
72 Many counties however have already started to promote the development of secondary  
73 industries, such as manufacturing, construction and public utilities (Wei et al., 2010), in  
74 addition to the resources sector. While achieving continuing rapid growth for these  
75 industries has been feasible, their demands and subsequent environmental pressures have  
76 raised sustainability concerns. Industrial projects are likely to take up large amounts of

77 land and if left unchecked are also likely to produce pollutants which threaten agriculture.

78 These damages imposed on society (and related costs) are considered to be external  
79 costs (or externalities). Agricultural loss due to industrial air pollution is one of them.  
80 Unless these costs are valued, it is difficult to assess the impact of industrialisation on  
81 farmers. The availability of estimates like this can encourage the government to put  
82 tougher regulations in place, including taxes and fines. The present study evaluates the  
83 damages caused by industrial SO<sub>2</sub> emissions on agricultural land and estimates that an  
84 alarming 0.66% of agricultural value-added is lost due to this type of pollution. Such a  
85 valuation of the damage cost of pollution on regional counties' agriculture is done for the  
86 first time and provides reliable validation for cleaner production policies and  
87 implementation of technologies that can avoid or mitigate the negative load of pollution.

88 Since the majority of farm land in China is found in the regions, the study analyses  
89 the agricultural economic impacts of industrial SO<sub>2</sub> emission caused by the 2069  
90 state-monitored heavily air polluting enterprises located in the counties, and examines the  
91 geographical distribution of the created external costs. This large sample of enterprises is  
92 identified by China's Ministry of Environmental Protection (MEP), the main agency  
93 charged with the responsibility to protect and monitor the state of the country's air, water  
94 and soil. The sample includes industrial enterprises with a relatively large volume of major  
95 and toxic pollutant discharge, centralised sewage treatment plants (with capacity  
96 of >10,000 tonnes/day) and hazardous waste disposal plants. They cover more than 65% of  
97 the total industrial pollution and the list is compiled on an annual basis by MEP together  
98 with the provincial environmental protection administration (Institute for Public and

99 Environmental Affairs, 2011). These key polluters are required to report to MEP on a  
100 seasonal basis.

101 Based on the country's 2008 environmental statistical data and over 80 thousand  
102 enterprises investigated for their emissions of SO<sub>2</sub> and NO<sub>x</sub>, China's environmental  
103 authorities identified 3472 enterprises as in need of strict monitoring for airborne pollution.  
104 Nearly 60% or 2069 of these enterprises are located in 899 counties, with the others  
105 situated in urban provincial or prefectural areas. The year 2008 is the latest for which  
106 detailed data are available and hence this is also the year for which we estimate the  
107 agricultural losses caused by these enterprises.

108 The article has the following structure. Section 2 positions this study within the area  
109 of quantifying external costs of industrial pollution in China. The analytical approach for  
110 the external cost evaluation model and data examination used, described in Section 3 form  
111 the methodology of the valuation. The assessment of the agricultural losses is presented in  
112 Section 4 which also includes an analysis of the correlations between the key airborne  
113 polluters and the socio-economic development in the counties. Section 5 reflects on policy  
114 implications and finally, conclusions are provided in Section 6.

115

## 116 **2. External costs of industrial pollution**

117 Environmental external costs in China are fast becoming an active area of research.  
118 Existing studies include damage costs from fossil fuel electricity generation (Zhang et al.  
119 (2007), physical damages from air and water pollution (World Bank, 2007), environmental  
120 damage of pollution in major Chinese cities (Wei et al., 2009), including Wuhan (Wu et al.,

121 2005), Taiyuan (Mestl et al., 2005) and Daqing (Sun and Yang, 2007). This research  
122 continues the focus on China by analysing agricultural losses due to industrial pollution.

123 Air pollution affects agriculture through various channels. According to Cao (1989),  
124 the ambient concentrations of SO<sub>2</sub> and fluoride typical for some Chinese cities and  
125 industrial areas in the 1980s, can reduce the growth and yield of local crops and vegetables  
126 by 5-25%. Ground (or surface)-level ozone and its precursors (such as carbon monoxide,  
127 methane, non-methane volatile organic compounds and nitrogen oxide) are other important  
128 industry-related pollutants causing considerable agricultural losses (Wang et al., 2007). The  
129 synergistic effects of ozone and SO<sub>2</sub> make industrial air pollution even more threatening to  
130 agriculture (Chen et al., 1996).

131 As a major air pollutant resulting from industrial processes, SO<sub>2</sub> has been under close  
132 scrutiny in China since 1970s. Despite the importance of surface-level ozone as well as  
133 other pollutants and ozone precursors, the data about them are still patchy. By comparison,  
134 there are reliable data available about SO<sub>2</sub> emissions which reached 17.05 million tonnes  
135 with industrial SO<sub>2</sub> emissions accounting for 84% (National Bureau of Statistics, 2011).  
136 China's rapid industrialisation has so far been closely linked to this pollutant (Wei et al.,  
137 2012); however nobody has yet quantified the external costs of industrial SO<sub>2</sub> emissions in  
138 relation to agricultural losses. As regional economic development further expands, having  
139 a good understanding of its impact on agriculture will strengthen the case for  
140 implementation of industrial cleaner production.

141

### 142 **3. Methods**

143 The methods used to estimate the agricultural losses due to air pollution include the human  
144 capital approach (Ridker, 1967), opportunity cost and market value method (Xia et al.,  
145 1995; Xu and Zhao, 2004; Wu and Wang, 2007) and impact pathway approach (Carbonell  
146 et al., 2007). The methodology of the ExternE project, initiated in 1992 and funded by the  
147 European Commission, is an example of the latter and uses a detailed bottom-up impact  
148 pathway approach (IPA). It has proven a widely accepted method for environmental  
149 external cost assessment (Mirasgedis et al., 2008; Thanh and Lefevre, 2000; Wei et al.,  
150 2009) as it applies a consistent accounting framework for the assessment of externalities  
151 associated with various airborne pollution emissions (European Commission, 2005;  
152 Carbonell et al., 2007; Rabl and Holland, 2008; Mirasgedis et al., 2008). This is the  
153 method adopted also for this study.

154

### 155 **3.1 Quantification analysis of agricultural losses due to industrial air pollution**

156 For the quantitative evaluation of the impact of SO<sub>2</sub> on agriculture, we assess the  
157 agricultural losses resulting from this airborne pollutant associated with the state-monitored  
158 enterprises in China's counties based on ExternE (European Commission, 2005). This  
159 analysis follows the pathway with IPA providing a logical and transparent way of  
160 quantifying the external costs. Emissions and other types of negative externalities, such as  
161 risk of accidents, are quantified and subjected to impact assessment and valuation.

162 The principal steps of the IPA are as follows:

163 (1) **Emission:** this involves specification of the relevant technologies and pollutants;  
164 for example, kg of oxides of particulates per GWh emitted by a power plant at a specific



165 site. In this case to estimate the agricultural losses, the key pollutant is SO<sub>2</sub>. As air quality  
166 monitoring stations are located only in the large and middle-sized cities, data from direct  
167 measurement of air pollutants on county locations are not available. Hence, we use  
168 estimates based on enterprise caused pollution as explained in point (2) below.

169 (2) **Dispersion:** this involves calculation of increased pollutant concentrations in all  
170 affected regions, for example, incremental concentration of particulates, using models of  
171 atmospheric dispersion and chemistry for particulates formation.

172 For this study, it was impossible to collect the data of ambient concentrations for the  
173 2069 enterprises monitored for airborne pollution. The typical installation method  
174 developed by Mirasgedis et al. (2008) was used instead to estimate the impacts of airborne  
175 pollution. Since most of the enterprises monitored for airborne pollution are in the sectors  
176 of mining, mineral products, smelting and pressing of metals, production and supply of  
177 electric power and heat power, processing of petroleum and coking, they all have high  
178 volumes of SO<sub>2</sub> emission according to the MEP regulations (Institute for Public and  
179 Environmental Affairs, 2011). The enterprises monitored for airborne pollution belong to  
180 different industry sectors and there are differences in their specific SO<sub>2</sub> emissions.  
181 However, there is no data available at county level about SO<sub>2</sub> emissions by individual  
182 industrial installations. The county averages for SO<sub>2</sub> discharge per enterprise are available  
183 in the 2008 Environmental Statistics Database<sup>2</sup>. Therefore, we assume that the number of  
184 enterprises monitored for airborne pollution in each county multiplied by the average  
185 estimate for SO<sub>2</sub> discharge could be used as a proxy in the ExternE model for the volume

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<sup>2</sup>Ministry of Environmental Protection (MEP), [http://www.zhb.gov.cn/gkml/hbb/bgt/201001/t20100119\\_184559.htm](http://www.zhb.gov.cn/gkml/hbb/bgt/201001/t20100119_184559.htm).

186 of generated pollution. By using this proxy to estimate the dispersion process we  
187 underestimate the level of pollution since the analysed industrial enterprises have been  
188 identified as heavy air polluters. As it becomes clear later in the analysis, despite this  
189 underestimation, the size of agricultural loss due to airborne pollution is alarmingly high.

190 According to regulations issued by MEP, the atmospheric impact of pollution sources  
191 should be assessed at three levels taking into consideration environmentally sensitive areas  
192 such as urban areas, nature reserves and scenic spots, namely 16–20 km for level 1, 10–14  
193 km for level 2 and 4–6 km for level 3 (SEPA, 2006). As the key monitored polluters  
194 discharge comparatively large amounts of pollutants we consider them having a level 1  
195 impact, with each affecting an area of 324 km<sup>2</sup> (or a square with an 18 km – middle of the  
196 level 1 interval – side). Overall this is quite a conservative estimate given the fact that the  
197 size of the impact according to EU standards can stretch up to 100 km.

198 Furthermore, ambient air quality in China is classified (according to the Prevention  
199 and Control of Atmospheric Pollution Law) in three zone classes: class I zones include  
200 nature reserves, scenic spots and areas subject to special protection; class II zones include  
201 mixed residential areas, prospective residential areas, cultural centres, industrial zones and  
202 rural areas; and class III zones include special industrial zones. The ambient air quality  
203 standards are clearly defined for the three zone classes and are also closely monitored.  
204 According to the 2009 Statistical Yearbook of China (National Bureau of Statistics, 2009),  
205 the concentrations of SO<sub>2</sub> in 85.2% of the Chinese cities in 2008 corresponded to class II.  
206 Hence we assume that the 2069 enterprises monitored for airborne pollution also fall  
207 within class II zones, and we take accordingly the SO<sub>2</sub> concentration limit value as 0.06

208 mg/m<sup>3</sup> as an estimate for the air pollution they generate. This is an estimate

209 (3) **Impact:** this step requires calculation of the dose from the increased concentration  
210 of pollutants, followed by calculation of impacts (damage in physical units) from this dose,  
211 using a dose-response function; for example, the yield losses of wheat due to high  
212 concentration of SO<sub>2</sub>.

213 Agricultural losses due to air pollution are mainly yield losses caused by increased  
214 levels of SO<sub>2</sub> (European Commission, 2005). The function for effects on agriculture from  
215 SO<sub>2</sub>, recommended in the ExternE methodology is adapted from Baker et al. (1986). The  
216 function assumes that yield will increase with increase of SO<sub>2</sub> from 0 to 6.8 ppb, and  
217 decline thereafter. It is used to quantify changes in crop yield for wheat, barley, rice, potato,  
218 sugar beet, oats etc. (see Table 1).

219 < Table 1 about here >

220 There also exist other dose-response functions to estimate yield losses due to SO<sub>2</sub>. For  
221 instance, Spash (1997) argues that the critical load of SO<sub>2</sub> for indirect effects on  
222 agricultural crops is 30 µg/m<sup>3</sup>, with agricultural crops generally less sensitive than natural  
223 vegetation and forests. Another example is the Air Pollution Emission Experiments and  
224 Policy (APEEP) analysis model employed by Henry III et al. (2011) to determine the  
225 damages caused by SO<sub>2</sub> emissions from the facilities governed by the Acid Rain Program –  
226 a traditional integrated assessment model of air pollution to account for damages to human  
227 health, visibility, crops, recreation and timber (Muller and Mendelsohn, 2007). However,  
228 the dose-response functions proposed by Baker et al. (1986) are most widely used to assess  
229 the yield losses due to SO<sub>2</sub> (European Commission, 2005; Krewitt et al., 1998; Mirasgedis

230 et al., 2008; Wei et al., 2009; Czarnowska and Frangopoulos, 2012). The dose-response  
231 functions for yield loss assessments are considered universal (Ridker, 1967) and they have  
232 been applied to assess agricultural losses in different countries and regions (Van Dingenen  
233 et al., 2009 show satisfactory results for Europe, US, China, southern India and South-East  
234 Asia; Mauzerall and Wang, 2001 for US, Europe and Asia; Muller and Mendelsohn, 2007  
235 for US; Wei et al., 2009 for China).

236 In the context of this analysis the exposure-response functions proposed by the  
237 ExternE Project (European Commission, 2005) have been used. Notwithstanding the fact  
238 that these functions were created by and for developed countries, some data can be  
239 transferred from the ExternE Project and other can be calculated or estimated in indirect  
240 ways when no local data are available or the information is incomplete (Carbonell et al.,  
241 2007). In 2008, the total output of staple crops, such as rice, wheat, maize and potato, in  
242 China was 478 million tons, accounting for 90.5% of the total output of farm products  
243 (National Bureau of Statistics, 2009). The three main crops, namely rice, wheat and potato,  
244 are covered by the dose-response functions in Table 1 and these functions are used with  
245 Chinese values per unit (to replace the European ones).

246 (4) **Cost:** this requires the economic valuation of the impacts; for example,  
247 multiplication by the cost incurred in the case of asthma.

248 The impacts and costs are summed up over all affected recipients. This involves a  
249 multidisciplinary systems analysis, with input from engineers, dispersion modellers,  
250 epidemiologists, ecologists and economists amongst others. For some impacts, for example  
251 visual intrusion, the passage from impact to cost is more direct, without the need for

252 intermediate steps. The result of an IPA is the damage cost per impact, and if the results are  
 253 for a specific source of impact that should be indicated. The IPA is a logically  
 254 straightforward approach, but the details of its implementation differ between studies (Rabl  
 255 and Holland, 2008).

256 Estimating the monetary value of food losses is normally done using the method of  
 257 market value in the country area. We adapted the methodology of the ExternE project using  
 258 China's grain prices. According to China's grain buying pricing policy in 2008, the lowest  
 259 buying prices were early indica rice (US\$221.7/t, or RMB ¥ 1540/t), white wheat  
 260 (US\$221.7/t, or RMB ¥ 1540/t), red and mix wheat (US\$207.3/t, or RMB ¥ 1440/t). In this  
 261 study, we use a price that is just above the lowest level, namely US\$223.2/t (RMB ¥ 1550/t)  
 262 to define the price for the crop loss.

263 According to the above definition, we can estimate the agricultural economic loss  
 264 (economic loss of crops)  $A$  in equation 1:

$$265 \quad A = 324 \cdot G / S \cdot P \cdot (1 - u_{\text{agriculture-SO}_2}) / (1 + u_{\text{agriculture-SO}_2}) \cdot N \quad (1)$$

266 where  $S$  represents the area of a county with the monitored enterprise(s)<sup>3</sup>;  $G$   
 267 represents the crop production for the year from the county;  $P$  is the average crop price  
 268 represented by US\$223.2/t (RMB ¥ 1550/t);  $u_{\text{agriculture-SO}_2}$  is the rate of crop production  
 269 under the influence of SO<sub>2</sub> and  $N$  is the number of enterprises monitored in the county;  $G/S$   
 270 is the average output of a county with the monitored enterprise(s),  $u_{\text{agriculture-SO}_2}$  is  
 271 calculated by using the equation in Table 1 where the SO<sub>2</sub> concentration value is  
 272 0.06mg/m<sup>3</sup> (as explained above). Since  $G$  is the crop production affected by SO<sub>2</sub>, we need

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<sup>3</sup> We use "area of a county" instead of "area of arable land of a county" as the neighbouring areas to polluting enterprises are not always arable land. For example, they can be other industrial or residential areas.

273 to correct for agricultural loss.  $(-u_{agriculture-so_2})/(1+u_{agriculture-so_2})$  represents the rate of crop  
274 loss for  $G$ . Hence  $324 \cdot G/S \cdot P \cdot (-u_{agriculture-so_2})/(1+u_{agriculture-so_2})$  is the agricultural  
275 economic loss caused by one monitored enterprise<sup>4</sup>.

276

## 277 **3.2 Data collection**

278 The data for the enterprises monitored for airborne pollution were obtained from the  
279 MEP's website (<http://datacenter.mep.gov.cn/>). This website provides a district code which  
280 allows to identify the county where each enterprise is located. Other county data, including  
281 agricultural value added, total output of crops, district areas, individual income, population  
282 etc. were obtained from the 2009 Statistical Yearbook of the cities and counties in China  
283 (National Bureau of Statistics, 2009). Using the number of enterprises monitored for  
284 airborne pollution, the agricultural losses in the 899 counties were calculated with the  
285 approach developed above (as show in Equation 1).

286

## 287 **4. Results and discussion**

### 288 **4.1 Geographical distribution of the state-monitored heavily air polluting enterprises**

289 The number of enterprises monitored for waste gases emissions in each county represents  
290 to a certain extent the level of airborne industry pollution generated there. In order to  
291 explore the geographical distribution of the enterprises monitored for airborne pollution,  
292 we conducted cluster analysis on the number ( $N$ ) of enterprises hosted by each of the 31  
293 provinces of China (excluding Hong Kong, Macau and Taiwan due to the unavailability of

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<sup>4</sup> The equation does not cover the situation when the aggregated area of impact from all monitored heavily polluting enterprises is bigger than the total area of the county, namely  $324 \cdot N > S$ . This is not the case for any of the 899 counties analyzed in this study. If this happen to be the case, then  $A = S \Sigma G / S \Sigma P \Sigma (-u_{agriculture-SO_2}) / (1 + u_{agriculture-SO_2})$ .

294 detailed data). The results are presented in Figure 1 and they show four groups of counties.

295 < Figure 1 about here >

296 **Group 1:  $0 \leq N \leq 4$**

297 This group includes Beijing, Tianjin, Shanghai, Hainan and Tibet. It is logical to see  
298 the two extremes of development included in this group. Beijing, Tianjin and Shanghai's  
299 geographical areas are small but economically well developed while Hainan and Tibet are  
300 still industrially underdeveloped.

301 **Group 2:  $31 \leq N \leq 59$**

302 This group includes Liaoning, Jilin, Heilongjiang, Anhui, Fujian, Guangdong,  
303 Chongqing, Guihou, Yunnan, Gansu, Qinghai, Ningxia and Xinjiang. Geographically, these  
304 provinces are located in west China, northeast China and the southeast coastal part of  
305 China. The industrial development in the west regions is still at an early stage. Although  
306 the industrial foundation is better in the northeast part of China, it is developing at a slow  
307 rate. The industrial economy is more developed in the southeast coastal provinces, but  
308 these are mainly light industries which generate less pollution.

309 **Group 3:  $78 \leq N \leq 103$**

310 This group includes Zhejiang, Jiangxi, Henan, Hubei, Hunan, Guangxi and Shaanxi.  
311 These provinces are located mainly in middle China. With the implementation of the rising  
312 middle China government strategy, the industrial economies of these provinces are  
313 undergoing fast development and this is regarded as more important than environmental  
314 protection.

315 **Group 4:  $131 \leq N \leq 177$**

316 This group includes Hebei, Shanxi, Inner Mongolia, Jiangsu, Shandong and Sichuan.  
317 These provinces are known as large heavily industrial provinces with industries such as  
318 coal mining, iron and steel smelting, machinery building etc. Both energy consumptions  
319 and waste gases emissions in these provinces are enormous.

320

#### 321 **4.2 Frequency distribution of the state-monitored heavily air polluting enterprises**

322 The situation with threatening airborne pollution in China's counties is adverse, with 899  
323 of the 2071 counties being home of the monitored enterprises. More than half of these 899  
324 counties, namely 52% host more than 2 state-monitored enterprises and 6.8 % of them host  
325 5 or more (see Figure 1). At the very extreme end of the spectrum, the county of Jiangyin  
326 in Jiangsu province hosts 26 enterprises which are predominantly in the field of thermal  
327 power and steel manufacturing.

328 < Figure 2 about here >

329

#### 330 **4.3 Agricultural losses caused by SO<sub>2</sub> emission**

331 Using formula (1), the agricultural losses caused by the 2069 enterprises monitored for  
332 airborne pollution in each of the 899 counties were estimated. To better visually describe  
333 the geographic difference, they were merged into provincial agricultural losses, according  
334 to the enterprises' district codes and the results are shown in Table 2. This aggregation  
335 includes only county-based heavy air polluters and does not include pollution from other  
336 city-based enterprises.

337 < Table 2 about here >



338 In 2008, the agricultural losses due to SO<sub>2</sub> are 1425.907 million US\$, representing  
339 0.66% of the agricultural value added in China in 2008. In the past few years SO<sub>2</sub>  
340 emissions had remained constant and in some provinces had even increased. The situation  
341 of the agricultural losses due to SO<sub>2</sub> is remaining to threaten the agricultural product.  
342 However, the losses also show obvious geographical differences. We try to analysis the  
343 relationship between economic growth and agricultural losses in different provinces which  
344 can provide relevant and valuable information of the hidden costs of growth and the future  
345 prospects of agricultural sustainability.

346 We use the ratio of agricultural losses to agricultural value added (RALAVD) as a  
347 measure for the agricultural sustainability of economic growth in each county. The value of  
348 RALAVD indicates the proportion of agricultural income losses caused by SO<sub>2</sub>, as shown  
349 in Table 2. The 2008 fluctuation range of RALAVD is from 0.00% to 2.95% for the 31  
350 provinces, the highest being for Shanxi and the lowest for Beijing.

351 We further examine the geographical distribution of agricultural losses across  
352 provinces. For the sample size (N=31), we use interval grouping. As proposed by Spiegel  
353 and Stephens (1999) and Frankfort-Nachmias and Leon-Guerrero (2008), we divide the  
354 counties into 4 groups according to the RALAVD average. The results from the grouping  
355 are presented on the map in Figure 3.

356 < Figure 3 about here >

357 **Group1:  $0.00\% \leq \text{RALAVD} \leq 0.38\%$**

358 This group includes 13 provinces (Beijing, Fujian, Gansu, Guagndong, Guangxi,  
359 Hainan, Heilongjiang, Hunan, Liaoning, Inner Mongolia, Tibet, Xinjiang and Yunan),

360 whose RALAVD is below 0.38%. Most of them had lower number of the state-monitored  
361 heavily air polluting enterprises or higher agricultural value added.

362 **Group 2:  $0.39\% < \text{RALAVD} \leq 0.86\%$**

363 There are 12 provinces in this group (Anhui, Guizhou, Henan, Hubei, Jilin, Jiangxi,  
364 Qinghai, Shanghai, Sichuan, Tianjin, Zhejiang, and Chongqing), most of them located in  
365 middle China. There are large traditional agricultural areas in these regions, however  
366 agricultural development has been affected negatively by the rapid industrialisation.

367 **Group 3:  $0.86\% \leq \text{RALAVD} \leq 1.47\%$**

368 This group includes five provinces (Hebei, Jiangsu, Ningxia, Shandong and Shaanxi).  
369 Four of them host high numbers of enterprises monitored for airborne pollution. Although  
370 there are only 31 enterprises monitored in Ningxia, its agricultural value added is still very  
371 low (US\$ 667.61 million).

372 **Group 4:  $\text{RALAVD} \geq 2.95\%$**

373 Only the province of Shanxi belongs to this group. It has the highest number of  
374 enterprises monitored for airborne pollution and a lower agricultural value added. The  
375 volume of SO<sub>2</sub> emitted by Shanxi in 2009, i.e. 12680 thousand tons, accounted for 25.9%  
376 of the national total<sup>5</sup>.

377 Table 3 shows that air pollution was high across China's counties, which resulted in  
378 significant agricultural damage. Figure 3 represents the geographical differences in  
379 RALAVD for the 31 provinces with group III and IV having low agricultural sustainability.  
380 The provinces in these two groups are located in middle and eastern China. They are also

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<sup>5</sup> [http://www.stats.gov.cn/tjsj/qtsj/hjtjzl/hjtjsj2009/t20101201\\_402687113.htm](http://www.stats.gov.cn/tjsj/qtsj/hjtjzl/hjtjsj2009/t20101201_402687113.htm).

381 the main grain and other crop output regions<sup>6</sup>.

382 Agricultural production is the main source of income for most rural households. With  
383 industrialisation, the absence of stable compensation mechanisms always causes conflicts  
384 between the polluting enterprises and the affected farmers. Collective protest events often  
385 happen when environment conflicts cannot be properly solved. On some occasions,  
386 farmers had to protest many times to put pressure on the polluting enterprises and get the  
387 local government to start resolving the problems. It is necessary to establish stable proper  
388 and long-term compensation mechanisms for farmers who are affected by industrial air  
389 pollution.

390

#### 391 **4.4 Correlation between agricultural losses and regional industrial SO<sub>2</sub> emissions**

392 The factors triggering agricultural losses by the state-monitored heavily air polluting  
393 enterprises are very complicated and also come with countless uncertainties, which make it  
394 hard to estimate the precise correlation between current data on the monitored  
395 concentration of SO<sub>2</sub> and the dose-response from SO<sub>2</sub> receptors. Considering that the  
396 agricultural losses caused by SO<sub>2</sub> are related to industrial waste gases emission in the  
397 regions, we analysed the correlation between the agricultural losses for each province and  
398 the respective volumes of industrial waste gas emissions to verify the accuracy of the loss  
399 estimates.

400 Table 3 indicates that there is significant positive correlation between agricultural

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<sup>6</sup> The map in Figure 3 is different from the 2008 acid rain map for China which shows that acid rain mostly affected the Yangtze River basin which has a high level of urbanisation. In addition to climate change, increasing urbanisation leads to higher car use in these cities and more SO<sub>2</sub> emissions subjecting them since 2000 to severe acid rain (Xie et al., 2009). Acid rain is also carried by strong winds and often this is towards the South of China where the highest precipitation rates are the highest.



423 With the fast progress towards industrialisation, the share of agriculture in China's  
424 economy is steadily decreasing. The proportion of the agricultural value added diminished  
425 from 28% in 2002 to 26% in 2005 and in 2008 it further dropped to 23%. As an economic  
426 sector which provides essential necessities for people's life, the role of agriculture for the  
427 country's socio-economic development cannot be ignored.

428 Airborne pollution generated by the strictly monitored enterprises has caused large  
429 agricultural losses. According to the above estimates, agricultural losses in China's  
430 counties reached U\$1.4 billion in 2008. This affects the socio-economic development in  
431 the counties. On the other hand, if the further development of the industrial economy in the  
432 counties continues to be dominated by coal (as it has been the case until now), there will be  
433 more enterprises and growing waste gas emissions, causing further airborne pollution and  
434 impacting environmental quality. In order to explore the relationship between the number  
435 of monitored enterprises and the counties' socio-economic development, this study  
436 analysed the correlation between the number of enterprises and socio-economic indices.  
437 The calculation of the correlation coefficients is based on data for the 899 counties and per  
438 capita indices. The results are shown in Table 4.

439 < Table 4 about here >

440 The correlation between the per capita number of enterprises monitored for airborne  
441 pollution and per capita industrial and agricultural GDP is shown to be significantly  
442 positive with the correlation coefficient reaching 0.411 (Pearson or 0.316 Spearman). In  
443 addition, the correlation of the per capita number of enterprises monitored for airborne  
444 pollution and per capita industrial value added reached 0.416 (Pearson or 0.322 Spearman),

445 which demonstrates that the industrial economy of China's counties still mainly follows an  
446 extensive developmental model. The economic development of the counties has been  
447 sustained by high consumption and highly polluting industrial enterprises, consequently  
448 the environmental damages caused by the emitted waste gases and other pollutants are very  
449 difficult to be restored.

450 We further conducted a correlation analysis between the per capita agricultural losses  
451 and per capita industrial value added in the 899 counties. The Pearson Correlation is 0.196,  
452 and Significance (2-tailed) is 0.000, indicating that industrialisation has a negative effect  
453 on agricultural development. However, the average of agricultural losses in the counties  
454 represents only 0.16% of the industrial value added, which is much lower than the average  
455 of RALAVD. This means that local governments have more incentive to promote industry  
456 development rather than reduce agricultural losses.

457 Despite the big output by the enterprises monitored for airborne pollution, the local  
458 governments should also emphasise reducing the impacts of enterprise pollution on  
459 agriculture, human health and the ecology. The policies may include encouraging  
460 industrial enterprises to adopt new technology and approaches to cut down the use of  
461 energy as well as strictly constraining the development of industrial projects that are likely  
462 to produce severe pollutants. In 1995, the Chinese government released Planning Outlines  
463 for National Ecological Demonstration Area (1996-2050) to improve the sustainability of  
464 the country's counties and between 2001 and 2006 MEP designated 528 ecological  
465 demonstration counties or cities. These counties have succeeded in overcoming the conflict  
466 between environmental protection, social development and economic growth, which

467 proves that it is possible to balance pollution control and economy development. However,  
468 more work needs to be done to cut pollution across all counties and industrial enterprises in  
469 China.

470 The correlation coefficients between the per capita number of state-monitored heavily  
471 air polluting enterprises and the other two indices, including per capita agricultural value  
472 added and per capita crop production, are both negative. Although some correlation  
473 coefficients are not significant, the negative coefficients reflect that the monitored  
474 enterprises have definitely caused a certain level of loss in crop production for agriculture.  
475 The significant positive correlation between RECGDP1 and per capita number of  
476 monitored enterprises can even better show the aggressiveness of polluting enterprises for  
477 the agricultural sector. The higher the number of enterprises, the higher the agricultural  
478 losses, therefore the development of counties' economy has been achieved at the price of  
479 sacrificing agriculture.

480 The correlation coefficients between per capita number of enterprises monitored  
481 strictly for waste gases and other socio-economic indices, including per capita financial  
482 income, per capita bank balance and urbanisation rate are all positive. The increasing  
483 number of monitored enterprises represents the growth of the industrial economy in  
484 counties, which potentially improves people's quality of life and can promote development  
485 and progress in society. Comparing the correlation coefficients, the influencing effect of  
486 the increase in the number of monitored enterprises on the increase of governmental  
487 revenue reached 0.347 (Pearson, or 0.360 Spearman) which is significantly higher than the  
488 effect on improving the level of people's income (Pearson 0.171, Spearman 0.29). This has

489 resulted in more willingness by the counties' governments, than by the public, to host  
490 monitored enterprises. In addition, the state-monitored heavily air polluting enterprises  
491 have attracted a significant number of rural labour force. The loss of rural labour creates  
492 further challenges for the agricultural sector.

493

#### 494 **5. Policy implication**

495 Despite using only SO<sub>2</sub> emissions as representative of the industry created airborne pollution,  
496 the results from the above analysis are alarming. The correlation between per capita number  
497 of state-monitored enterprises and other socio-economic indices show the negative impacts  
498 of industrial air pollution on agricultural development in the regions. The study found a  
499 direct link between industrial SO<sub>2</sub> emission and agricultural losses in the context of recent  
500 regional development in China. Hence, it is not enough to measure the burden and monitor  
501 SO<sub>2</sub> emissions and effluents, the important issue we raised here is the urgency of  
502 implementation of the cleaner production policy to avoid or mitigate the burden due to the  
503 air pollutant emission (Shi et al., 2008; Taylor, 2006).

504 The pathway to implement the cleaner production policy in China's counties is a  
505 complex area where the interests of industry are often competing with those of the general  
506 public with government stepping in when needed and possible. There is a large range of  
507 policies and initiatives, including voluntary (such as ISO 14001) and regulatory  
508 compliance at a local, national or international level, that aim at reducing pollution and  
509 adopting cleaner production. However, lax environmental enforcement is one of the top  
510 three barriers to adopt the cleaner production in the small- and medium-sized enterprises in



511 China (Shi et al., 2008). Many argue that direct regulation is the main driver behind cleaner  
512 production which works better than economic or voluntary measures (Testa et al., 2012), or  
513 internal technical and managerial barriers (Shi et al., 2008). Miller et al. (2008) describe  
514 the history of pollution prevention in the US leading to the Pollution Prevention Act  
515 adopted in 1990, but stress that in recent times there are declining public sector support  
516 (compared to areas such as education, healthcare, war and terrorism), rival business  
517 priorities (such as increasing market share through marketing and new product  
518 development) and lack of documenting the progress made (including no legal requirement  
519 to report, no comprehensive data collection systems, inability and costs associated with  
520 such data gathering). By comparison, China had air pollution prevention and control (1995)  
521 and water pollution prevention and control (1996) laws which in 2002 were replaced by the  
522 Cleaner Production Act (a world first). Nevertheless, legislation alone has not been very  
523 successful in reducing pollution and the country faces a similar range of challenges as  
524 described by Miller et al. (2008). There needs to be a focus on what makes industry take  
525 action and according to Higgins (1999), this includes pollution inventories, information on  
526 enterprise performance, environmental management systems, negotiated agreements and  
527 government-industry partnerships. The monitoring of enterprises is an important  
528 component in curbing pollution but there needs to be further efforts in negotiating  
529 agreements and building partnerships which can secure not only waste reduction but also  
530 minimal impact on agricultural production. Location of large industrial plants should be  
531 decided through negotiating agreements and partnerships, in a way that compromises the  
532 least any agricultural production systems. Furthermore, public-private partnerships are

533 seen as preferred policy instrument for achieving cleaner production (Shin et al., 2008).

534 Economic activities are fundamental in lifting people out of poverty and increasing  
535 human standards of life (Shin et al., 2008). Industrialisation and industry development are  
536 part of this process. However if an enterprise is generating pollution that negatively  
537 impacts on the lives of other sections of society, and farmers in particular, there are two  
538 ways of mitigating any damage: by stricter environmental regulations or through offering  
539 compensations to those affected. The patchy evidence about strengthening discharge  
540 standards in China (Wang et al., 2011) shows that while there might be some  
541 improvements, including in SO<sub>2</sub> emissions, not all pollution is being arrested.  
542 Compensation hence should be introduced for rural workers whose livelihoods are being  
543 affected by industry. Further improvements in environmental legislation to drastically  
544 adopt cleaner production are also needed. The US experience shows that industry-related  
545 environmental management programs should be performance based (Zarker and Kerr, 2008)  
546 and China has made the first step by closely monitoring the key polluters.

547 An essential characteristic of cleaner production in industry is the principle for  
548 “reduction at source” which also leads to improved economic performance, particularly in  
549 terms of profitability (Cagno et al., 2005; Nishitani et al., 2011; Shadiya et al., 2012). This  
550 should encourage companies to regularly examine their manufacturing processes,  
551 particularly if there are financial payments for ecological compensation triggered by  
552 pollution. Companies’ own pollution minimisation policies and strategies can also play a  
553 key role in reducing their environmental impact (Driussi and Jansz, 2006), including  
554 negative effects on agriculture.

555 After experiencing a prolonged period of significant economic growth China is yet to  
556 realise that only a development that does not destroy the environment can be a source for  
557 long-term sustainability. This is something that the globalised economy and international  
558 professional community are also struggling with, in spite of numerous sustainable  
559 development initiatives (Lozano et al., 2011). There are however some positive examples  
560 from transition economies, such as Poland, where companies are increasingly responding  
561 to pressure from social and actors (Kronenberg and Bergier, 2012). The Chinese counties  
562 that are currently industrialising may have the opportunity to avoid repeating previous  
563 mistakes, particularly if local governments are strict about pollution prevention.

564

## 565 **6. Conclusion**

566 This paper assessed the agricultural losses caused by the 2069 enterprises (located in 899  
567 counties), identified by the Chinese government as requiring strict monitoring for airborne  
568 pollution because of their high industrial waste gas emissions. The analysis shows that in  
569 2008 close to US\$ 1.5 billion (or 0.66% of the total agricultural value added) was lost due to  
570 industrial air pollution. These alarming results emphasise the urgent need for effective  
571 environmental policies and strategies related to cleaner production.

572 Although there are regional differences, the economic development of China's  
573 counties has come at a high cost for the environment and the large agricultural losses  
574 should not be ignored. In China, the wheat-production loss ratios in the Beijing districts are  
575 between 6 and 15%, which is considered medium range in most regions (Zhang and Wang,  
576 2010). If the damage caused to agriculture by air pollution continues to rise, the Chinese

577 people will face the risk of food supply shortages and contamination. Cleaner production  
578 hence becomes a crucial issue for the Chinese counties. There is mounting evidence that  
579 the growing environmental challenges cannot be solved by technological or societal  
580 sciences alone, and an integrated, multi-disciplinary and multi-stakeholder approach,  
581 including governmental policies, educational programs, technical assistance programs and  
582 many other initiatives is needed (Klemes et al., 2012; Lozano García, 2006).

583 Regional governments have played a leading role in promoting cleaner production  
584 (Geng et al., 2010). Since industrial development in many counties is inevitable, proper  
585 standards and instructions to restrict the pollution emission by the industrial enterprises are  
586 needed. The counties of central and west China, in particular need to avoid pollution  
587 intensive industries to be shifted from the east for the purpose of economic development. If  
588 the environment is sacrificed in the pursuit of large industrial projects, the damages caused  
589 to crop production will soon wipe off any real economic benefits.

590 Despite the reasonable methodology and findings of this study in assessing the  
591 agricultural losses due to industrial SO<sub>2</sub> emission, the accounting procedure involves many  
592 uncertainties. They accompany each step of the adopted impact-pathway approach  
593 (Mirasgedis et al., 2008). For example, as there are no specific data available for the  
594 ambient concentrations of SO<sub>2</sub> for all of the 2069 enterprises monitored for airborne  
595 pollution in the 899 counties, the estimated results may not reflect exactly the differences  
596 of agriculture losses caused by each enterprise. Also, the dose–response function for  
597 agricultural losses based on the ExternE methodology may not represent well the crop  
598 yield response to SO<sub>2</sub> in China. Furthermore, as there are not quality data available this

599 study does not include ground-level ozone and NO<sub>x</sub> influences on the crop yield and these  
600 are expected to be manifold larger. Even without accounting for these factors, the outcomes  
601 of the study are already indicative of the significance of the problems and the need for  
602 policy reaction.

603

604

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766

767

**Table 1** Quantification of agricultural impacts due to SO<sub>2</sub><sup>a</sup>

<i>Impact category</i>	<i>Dose-response functions</i>	<i>Crop</i>
Yield loss	$0.74x_{SO_2} - 0.055x_{SO_2}^2$ ( $0 < x_{SO_2} < 13.6$ ppb) $-0.69x_{SO_2} + 9.35$ ( $x_{SO_2} > 13.6$ ppb)	Sunflower, wheat, potato, rice, rye, oats, tobacco, barley, sugar beet

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<sup>a</sup> The information presented in this table has been mainly derived by *coSenseLE*, European Commission (2005).

**Table 2** Agriculture losses due to the strictly monitored enterprises, 2008

Province	Number of enterprises monitored for airborne pollution in the county	Agricultural losses <sup>a</sup> (million US\$)	Agricultural value added <sup>a</sup> (million US\$)	RAL AVD (%)	Class
Beijing <sup>b</sup>	0	0	608.203	0	1
Fujian	32	7.615	5904.244	0.13	1
Gansu	33	6.333	2216.056	0.29	1
Guangdong	44	10.585	9075.310	0.12	1
Guangxi	96	29.152	9713.026	0.30	1
Hainan	2	0.374	658.420	0.06	1
Heilongjiang	35	14.848	5929.672	0.25	1
Hunan	91	57.679	15203.345	0.38	1
Liaoning	45	29.841	10061.896	0.30	1
Inner Mongolia	132	20.443	7705.983	0.27	1
Tibet	1	0.035	15.236	0.23	1
Xinjiang	59	3.762	4480.555	0.08	1
Yunnan	34	7.780	3206.457	0.24	1
Anhui	34	40.441	6059.207	0.67	2
Guizhou	52	18.516	3518.732	0.53	2
Henan	78	92.893	10857.443	0.86	2
Hubei	88	58.742	11380.713	0.52	2
Jilin	40	34.400	7564.477	0.45	2
Jiangxi	88	56.057	7211.675	0.78	2
Qinghai	34	3.378	682.992	0.49	2
Shanghai	3	2.287	450.184	0.51	2
Sichuan	131	99.435	14088.532	0.71	2
Tianjin	4	3.209	702.193	0.46	2
Zhejiang	94	63.165	8199.469	0.77	2
Chongqing	38	29.984	4968.587	0.60	2
Hebei	177	174.951	14852.475	1.18	3
Jiangsu	146	163.498	15863.546	1.03	3
Ningxia	31	9.806	667.608	1.47	3
Shandong	175	266.200	25454.401	1.05	3
Shaanxi	103	45.246	4650.429	0.97	3
Shanxi	149	75.251	2553.027	2.95	4
National Total	2069	1425.907	214504.092	0.66	-

774 <sup>a</sup> US\$1=6.948RMB (data from the Bank of China, <http://www.boc.cn>).

775 <sup>b</sup> As Beijing has no strictly monitored enterprises, the values of the related variables are  
776 zero.

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**Table 3** Correlation between agricultural losses and the industrial waste gas emissions

Industrial waste gas emissions		Total Volume of Industrial Waste Gas Emission	Total Volume of Sulphur Dioxide Emission by Industry	Total Volume of Industrial Dust Emission by Industry
Agricultural losses	Pearson Correlation <sup>a</sup>	0.688**	0.695**	0.468**
	Sig., 2-tailed)	0.000	0.000	0.009
	Spearman's rho	0.731**	0.771**	0.711**
	Correlation Coefficient <sup>a</sup>			
	Sig., 2-tailed)	0.000	0.000	0.000

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<sup>a</sup> \*\* Correlation is significant at the 0.01 level (2-tailed).

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**Table 4** Per capita number of enterprises monitored for airborne pollution and socio-economic indices correlation coefficient

Variables	Per capita number of monitored enterprises	
	Pearson Correlation <sup>a</sup>	Spearman's Rho Correlation Coefficient <sup>a</sup>
Per capita industrial and agricultural added value	0.411**	0.316**
Per capita industrial value added	0.416**	0.322**
Per capita agricultural value added	-0.005	-0.029
Per capita crop production	-0.033	-0.103**
RECGDP1 <sup>b</sup>	0.262**	0.306**
Per capita revenue	0.347**	0.360**
Per capita bank balance	0.171**	0.293**
Urbanisation rate	0.319**	0.358**
Agricultural labour participation rate	-0.223**	-0.356**

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<sup>a</sup> \*\* Correlation is significant at the 0.01 level (2-tailed).

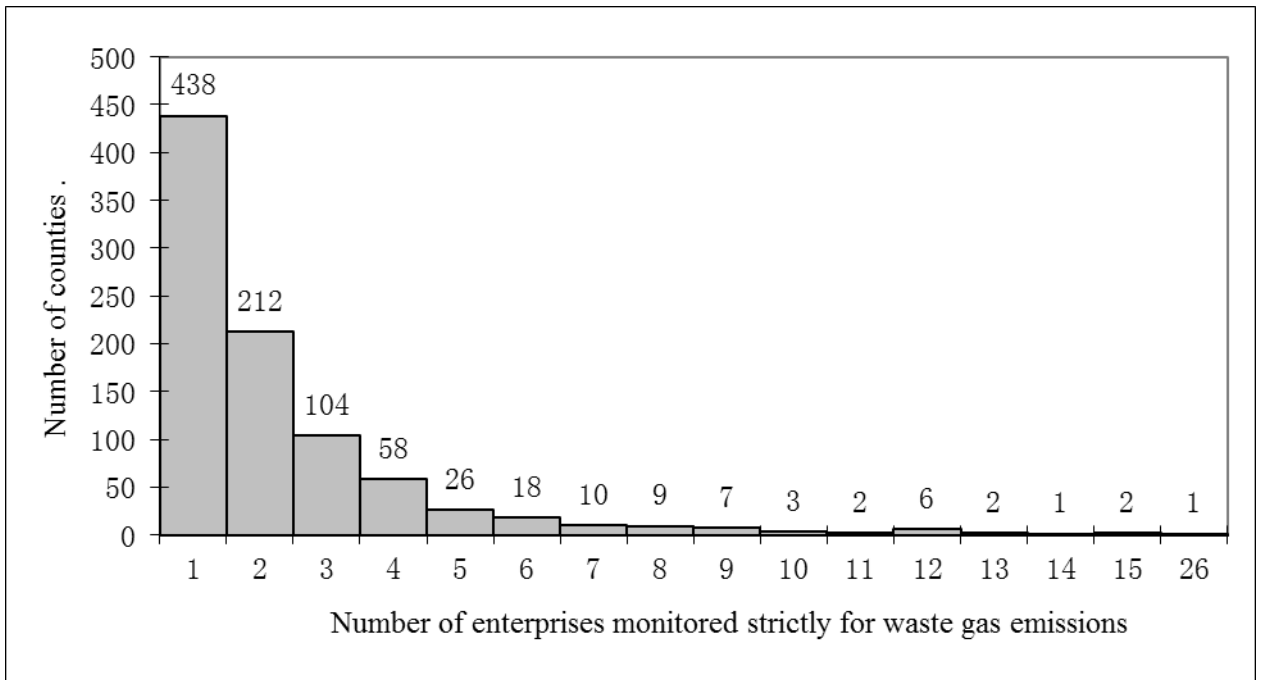
<sup>b</sup> RECGDP1 is the ratio of the agricultural losses caused by the enterprises monitored for airborne pollution to agricultural GDP.

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**Figure 1** Cluster analysis results for Chinese state-monitored heavily air polluting enterprises

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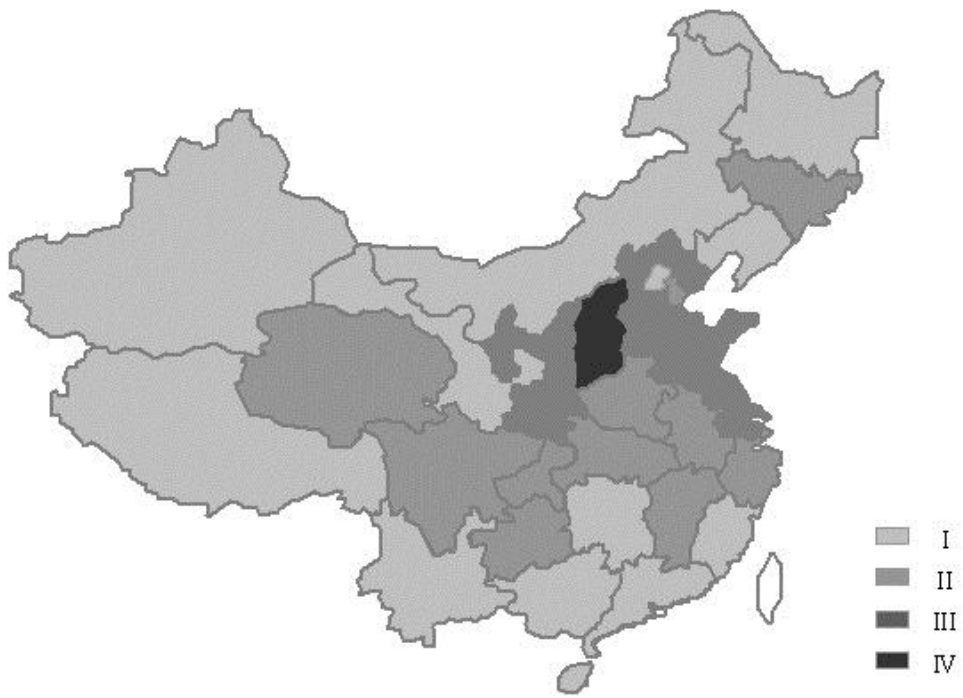
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**Figure 2** Distribution of the number of enterprises strictly monitored for waste gas emissions

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**Figure 3** Groups of counties in China according to RALAVD