Decomposition Analysis of Wastewater Pollutant Discharges in Industrial Sectors of China (2001–2009) Using the LMDI I Method

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Abstract: China’s industry accounts for 46.8% of the national Gross Domestic Product (GDP) and plays an important strategic role in its economic growth. On the other hand, industrial wastewater is also the major source of water pollution. In order to examine the relationship between the underlying driving forces and various environmental indicators, values of two critical industrial wastewater pollutant discharge parameters (Chemical Oxygen Demand (COD) and ammonia nitrogen (NH₄-N)), between 2001 and 2009, were decomposed into three factors: i.e., production effects (caused by change in the scale of economic activity), structure effects (caused by change in economic structure) and intensity effects (caused by change in technological level of each sector), using additive version of the Logarithmic Mean Divisia Index (LMDI I) decomposition method. Results showed that: (1) the average annual effect of COD discharges in China was −2.99%, whereas the production effect, the structure effect, and the intensity effect were 14.64%, −1.39%, and −16.24%, respectively. Similarly, the average effect of NH₄-N discharges was −4.03%, while the production effect, the structure effect, and the intensity effect were 16.18%, −2.88%, and −17.33%, respectively; (2) the production effect was the major factor responsible for the increase in COD and NH₄-N discharges, accounting for 45% and 44% of the total contribution, respectively; (3) the intensity effect, which accounted for 50% and
48% of the total contribution, respectively, exerted a dominant decremental effect on COD and NH₄-N discharges; intensity effect was further decomposed into cleaner production effect and pollution abatement effect with the cleaner production effect accounting for 60% and 55% of the reduction of COD and NH₄-N, respectively; (4) the major contributors to incremental COD and NH₄-N discharges were divided among industrial sub-sectors and the top contributors were identified. Potential restructuring and regulation measures were proposed for pollutant reduction.

**Keywords:** decomposition analysis; industrial wastewater pollutant discharges; LMDI I method; China

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1. Introduction

If any region can be seen as a microcosm with both the environmental and developmental problems and opportunities facing the World, particularly the developing countries, it is China. Since 1978 China’s gross domestic product (GDP) has experienced an annual growth of ten percent, making China the fastest growing country [1]. China’s industrial GDP showed remarkable growth rate of over 10% between 2001 and 2009 (see Figure 1). In 2007, China’s GDP stood at US$3.38 trillion, which made China the world’s third largest economy as far as GDP is concerned [2]. China’s economic growth, industrialization, and urbanization coupled with inadequate investment in basic water supply and treatment infrastructure have resulted in widespread water pollution, and China is quickly moving in the direction of becoming one of the world’s biggest polluters. A report from United Nations Environmental Programme (UNEP) demonstrated that environmental damages were resulting in significant losses of GDP in China each year [3]. More and more attention has been paid to whether or not the country’s development is sustainable and when and how its environmental conditions will be improved.

**Figure 1.** Changes of China’s industrial gross domestic product during 2001–2009 (Data resources: Annual Statistic Report on Environment in China—ASREC [4]).
In 1991, Grossman innovatively put forward the concept of Environmental Kuznets Curves (EKC) to explain the relationship between economic development and environmental quality. The process can be expressed as an inverted “U”-shape, i.e., three stages from harmony to disorder, followed by coordination [5]. However, the inverted “U”-shape is not the sole possible relationship between the two, so economic development is not the exclusive solution to environmental problems [6,7]. To identify the underlying mechanisms of economic progress and environmental degradation, several theories and empirical methods were put forward during the past three decades, i.e., the econometric regression, the structural decomposition analysis (SDA) and the index decomposition analysis (IDA) [8]. IDA is a useful technique for quantifying a large number of underlying factors that contribute to the changes in environmental quality by decomposing these changes at the sector level. The advantage of IDA is that it can be readily applied to various available data at different levels of aggregation [9]. With respect to IDA, there have been a variety of different index methods available, such as Laspeyres index [10] and the Divisia index [11,12]. In 1997, Ang and Choi [13] first put forward the multiplication version of the Logarithmic Mean Divisia Index (namely LMDI II), which resolved the residual problem in the Divisia index method but led to a new problem of discontinuity in aggregation. Ang and Liu proposed the additive version of the Logarithmic Mean Divisia Index (LMDI I), which was complete in decomposition and consistent in aggregation, and efficient in handling zero values [14]. LMDI I is widely used in the industrial energy conservation, and SO₂ & CO₂ emission reduction analysis [15,16]. However, few attempts have focused on the interaction analysis between the industry wastewater pollutant discharges and the economic growth.

China’s 12th Five-Year Plan (2011–2015) aims to achieve an average annual GDP growth of 7% while protecting the environment with an aim to reduce emissions of chemical-oxygen demand (COD) and ammonia nitrogen (NH₄-N) by 8% and 10%, respectively, over the five-year period. In order to achieve harmonized development between economic growth and environmental sustainability, China must strengthen its environmental regulations.

During the period of 2001–2009, industrial COD and NH₄-N discharges in wastewater showed an overall declining tendency (see Figure 2a), and the average annual decreases were 148,927.7 t and 14,580.3 t, respectively. The discharge efficiency (amount of pollutant discharges per 10⁴ CNY, in Figure 2b) of COD and NH₄-N shows an obvious decline trend from the year 2001 to the year 2009 with the exception of 2005. It is important to know the cause of this change, and to achieve a clear understanding of the relationships among the economic development, the technology improvement, the structure adjustment and the wastewater pollutant discharges. This will make contribution for the policy and regulations making to ensure the realization of COD and NH₄-N reduction goal.

This paper analyzes the impact of different factors on the change of China’s industrial COD and NH₄-N discharges. The aim of the paper is to identify the dominant factors driving the change of these COD and NH₄-N discharges. Based on the two critical pollutants emission from industrial wastewater, the representative IDA method LMDI I is used to demonstrate the interaction mechanism. The changes in industrial pollutant discharges were decomposed into the scale of economic activities (production effect), the technological level of each sector (intensity effect), and the economic structure (structure effect).
This paper is organized as follows: Section 2 describes the LMDI I method and the data used. Section 3 presents the impacts of different factors on the changes of China’s industrial COD and NH₄-N discharges based on LMDI I. Section 4 presents the conclusions, and the last section offers some policy implications.

2. Methodology and Data

2.1. Principle and Basic Model

IDA is a useful and meaningful tool for quantifying a large number of underlying driving forces that contribute to changes. The underlying theory of IDA is the definition of a governing function relating an aggregate indicator to a number of pre-defined factors of interest, thus identifying the respective effects of the factors on the aggregate [17]. According to Sun [18], changes in China’s industrial wastewater discharges can be attributed to production effects, intensity effects, and structure effects. In addition, the intensity effect can be divided into cleaner production effect and pollution abatement effect. To illustrate how the IDA approaches work, some related variables are listed in Table 1.

| Variables | Meaning of variables |
|-----------|----------------------|
| Eᵢₜ, Eᵢ₀ | Industrial pollutant discharge in sector i in year t and year 0, respectively |
| Eᵣ, E₀ | Total industrial pollutant discharge in year t(Eᵣ = ∑ Eᵢₜ) and year 0, respectively |
| eᵢₜ, eᵢ₀ | Industrial pollutant production in sector i in year t and year 0, respectively |
| eᵣ, e₀ | Total industrial pollutant production in year t(eᵣ = ∑ eᵢₜ) and year 0, respectively |
| Gᵢₜ, Gᵢ₀ | Production of industrial sector i in year t and year 0, respectively |
| Gᵣ, G₀ | Total industrial production in year t(Gᵣ = ∑ Gᵢₜ) and year 0, respectively |
| Sᵢₜ, Sᵢ₀ | Production share of industrial sector i in year t(Sᵢₜ = Gᵢₜ/Gᵣ) and year 0, respectively |
| Iᵢₜ, Iᵢ₀ | Discharge intensity in sector i in year t(Iᵢₜ = Eᵢₜ/Gᵢₜ) and year 0, respectively |
| Tᵢₜ, Tᵢ₀ | Production intensity in sector i in year t(Tᵢₜ = eᵢₜ/Gᵢₜ) and year 0, respectively |
| Aᵢₜ, Aᵢ₀ | Discharge rate in sector i in year t(Aᵢₜ = Eᵢₜ/eᵢₜ) and year 0, respectively |
Table 1. Cont.

| Variables | Meaning of variables |
|-----------|----------------------|
| $\Delta E_{tot}$ | Total change in industrial pollutant discharge from year 0 to $t$ ($\Delta E_{tot} = E_t - E_0$) |
| $\Delta E_{pde}$ | Impact of production change on the aggregate industrial pollutant discharge |
| $\Delta E_{str}$ | Impact of structural change on the aggregate industrial pollutant discharge |
| $\Delta E_{ity}$ | Impact of intensity change on the aggregate industrial pollutant discharge |
| $\Delta E_{tec}$ | Impact of clean technologies change on the aggregate industrial pollutant discharge |
| $\Delta E_{aba}$ | Impact of pollution abatement change on the aggregate industrial pollutant discharge |
| $\Delta E_{rsd}$ | Residual terms |

Grossman and Krueger [19] and De Bruyn [20] adopted the basic IDA model in the environmental quality analysis. In this paper, we express the aggregate industrial wastewater pollutant discharges as a summation of all sectors, and decompose the impact index of industrial wastewater pollutant discharges as follows:

$$ E_t = G_t \times E_t / G_t = G_t \times \sum (E_{i,t}) / G_t = G_t \times \sum (I_{i,t} \times S_{i,t}) / G_t = G_t \times \sum (I_{i,t} \times S_{i,t}) $$  

(1)

$$ I_{i,t} = (e_{i,t} / G_{i,t}) \times (E_{i,t} / e_{i,t}) = T_{i,t} \times A_{i,t} $$  

(2)

2.2. Methodology

Decomposition can be carried out either multiplicatively or additively with the same data of $i$ industrial sectors. The additive case is the direct decomposition of a quantity change, which is provided in the chosen measurement unit as the factorized effects. The multiplicative case measures the change by dividing the aggregate intensity of one year, with the factorized effects provided in indices [21]. In summary, different decomposition methods involve approaches formulated differently, which lead to different estimates on the right hand side of the equations. Among the two methods, the results of additive decomposition can be easily to understand and “difference” change is decomposed, whereas the results of multiplicative decomposition can be graphically presented and the “ratio” of an aggregate is obtained.

In additive decomposition, the total change ($\Delta E_{tot}$) is decomposed into three different effects associated with the following factors: $\Delta E_{pde}$ (production effect), $\Delta E_{str}$ (structure effect), and $\Delta E_{ity}$ (intensity effect). Moreover, the intensity effect ($\Delta E_{ity}$) is decomposed into two different effects, i.e., $\Delta E_{tec}$ (clean-production effect), and $\Delta E_{aba}$ (pollution abatement effect). The additive decomposition takes the form below:

$$ \Delta E_{tot} = E_t + E_0 = \Delta E_{pde} + \Delta E_{str} + \Delta E_{ity} + \Delta E_{rsd} = \Delta E_{pde} + \Delta E_{str} + \Delta E_{tec} + \Delta E_{aba} + \Delta E_{rsd} $$  

(3)

If $\Delta E_{rsd} = 0$, the method is considered as a perfect decomposition with no residual terms. Here, the additive LMDI I is presented below:

$$ \Delta E_{pde} = \sum (E_{i,t} - E_{i,0}) \ln (G_i / G_0) / \ln (E_{i,t} / E_{i,0}) $$  

$$ \Delta E_{str} = \sum (E_{i,t} - E_{i,0}) \ln (S_{i,t} / S_{i,0}) / \ln (E_{i,t} / E_{i,0}) $$  

$$ \Delta E_{ity} = \sum (E_{i,t} - E_{i,0}) \ln (I_{i,t} / I_{i,0}) / \ln (E_{i,t} / E_{i,0}) $$  

$$ \Delta E_{tec} = \sum (E_{i,t} - E_{i,0}) \ln (e_{i,t} / e_{i,0}) / \ln (E_{i,t} / E_{i,0}) $$  

$$ \Delta E_{aba} = \sum (E_{i,t} - E_{i,0}) \ln (A_{i,t} / A_{i,0}) / \ln (E_{i,t} / E_{i,0}) $$  

(4)
2.3. Data Source

Since 2001, China’s industrial sectors have been divided into 40 sub-sectors (see appendix Table A1) in the China Statistical Yearbook (CSY) [22]. Considering the data availability, consistency and the detailed classification of industrial sub-sectors, the time-series data from 2001 to 2009 issues of ASREC [4] and CSY [22] were obtained. In this study, industrial added values at current prices are converted into 2001 constant prices. Since the price indices are not available at the levels of industrial sub-sectors, the added values at constant prices for each sector are derived using the price indices of the industrial sector.

3. Results and Discussion

Based on LMDI I, the influencing factors of China’s industrial COD and NH$_4$-N discharges in wastewater were analyzed between 2001 and 2009. A positive value of contribution indicates an incremental effect on industrial pollutant discharges, while a negative value indicates a decremental effect.

3.1. Yearly Comparisons

The yearly contribution of different effects to China’s industrial COD and NH$_4$-N discharge were given in Tables 2 and 3. As shown in Table 2, from 2001 to 2009 the industrial COD discharges decreased on average $14.89 \times 10^4$ t, and the effects brought about by the production scale, structural scale, intensity scale, cleaner production scale and pollution abatement scale were $72.97 \times 10^4$ t, $-6.93 \times 10^4$ t, $-80.94 \times 10^4$ t, $-53.37 \times 10^4$ t and $-27.57 \times 10^4$ t, respectively. Similarly, the average change of industrial NH$_4$-N discharges was $-1.46 \times 10^4$ t, and the $\Delta E_{pbn}$, $\Delta E_{str}$, $\Delta E_{ity}$, $\Delta E_{tec}$, and $\Delta E_{aba}$ were $5.85 \times 10^4$ t, $-1.04 \times 10^4$ t, $-6.27 \times 10^4$ t, $-3.43 \times 10^4$ t and $-2.84 \times 10^4$ t, respectively. Among the change effect of the different influencing factors, the average value of intensity scale ranked first and the value was mostly negative, indicating that intensity scale was the most effective measures to control pollutants emission, which were confirmed by the study of SO$_2$ emissions in China [12] and SO$_2$ emissions in Germany and Holland [20].

Table 3 suggests that the average annual change effect of COD discharges was $-2.99\%$, and the effects brought by production scale, structural scale, intensity scale, cleaner production and pollution abatement were $14.64\%$, $-1.39\%$, $-16.24\%$, $-10.71\%$ and $-5.53\%$, respectively. Likewise, the average effect changes of NH$_4$-N discharges was $-4.03\%$, and the $\Delta E_{pbn}$, $\Delta E_{str}$, $\Delta E_{ity}$, $\Delta E_{tec}$, and $\Delta E_{aba}$ were $16.18\%$, $-2.88\%$, $-17.33\%$, $-9.48\%$ and $-7.85\%$, respectively.

3.1.1. Production Effect

Between 2001 and 2009, China’s industrial sectors experienced rapid growth. As a result, the production effects ($\Delta E_{pbn}$) of China’s industrial pollutants (including COD and NH$_4$-N) discharges were always positive with COD ranging from $46.40 \times 10^4$ t to $103.29 \times 10^4$ t and NH$_4$-N ranging from $3.03 \times 10^4$ t to $9.16 \times 10^4$ t (shown in Table 2).
Table 2. Contribution of different effects to China’s industrial COD and NH₄-N discharges (Unit: 10⁴ t).

| Period    | ΔE̴<sub>plan</sub> | ΔE̴<sub>str</sub> | ΔE̴<sub>ty</sub> | ΔE̴<sub>tec</sub> | ΔE̴<sub>aba</sub> | ΔE̴<sub>tot</sub> | ΔE̴<sub>plan</sub> | ΔE̴<sub>str</sub> | ΔE̴<sub>ty</sub> | ΔE̴<sub>tec</sub> | ΔE̴<sub>aba</sub> | ΔE̴<sub>tot</sub> |
|-----------|-------------------|-----------------|-----------------|-----------------|----------------|-----------------|------------------|-----------------|-----------------|-----------------|----------------|------------------|
| 2001–2002 | 68.17             | −16.27          | −86.53          | 74.03           | −160.56        | −34.63          | 5.23             | −3.58           | 0.02            | 2.87            | −2.84          | 1.68              |
| 2002–2003 | 57.22             | 14.69           | −93.93          | −76.66          | −17.28         | −22.03          | 4.73             | 3.61            | −9.09           | −8.95           | −0.15          | −0.76              |
| 2003–2004 | 77.13             | −17.49          | −49.63          | −54.14          | 4.51           | 10.01           | 6.52             | −3.56           | −1.48           | 1.78            | −3.26          | 1.47              |
| 2004–2005 | 80.63             | −15.83          | −23.29          | −47.14          | 23.84          | 41.51           | 7.33             | −1.12           | 3.25            | 0.63            | 2.62          | 9.46              |
| 2005–2006 | 103.29            | 9.08            | −142.98         | −126.66         | −16.32         | −30.61          | 9.16             | 0.51            | −20.11          | −11.90          | −8.21          | −10.43             |
| 2006–2007 | 79.14             | 17.78           | −126.41         | −121.65         | −4.76          | −9.49           | 7.35             | 1.82            | −16.13          | −13.00          | −3.13          | −6.96              |
| 2007–2008 | 51.82             | −17.06          | −82.98          | −50.68          | −32.30         | −48.22          | 3.46             | −4.41           | −2.92           | 2.68            | −5.60          | −3.86              |
| 2008–2009 | 46.40             | −30.31          | −41.78          | −24.10          | −17.68         | −25.68          | 3.03             | −1.60           | −3.69           | −1.56           | −2.13          | −2.26              |
| Average   | 72.97             | −6.93           | −80.94          | −53.37          | −27.57         | −14.89          | 5.85             | −1.04           | −6.27           | −3.43           | −2.84          | −1.46              |

Table 3. Contribution of different effects to China’s industrial COD and NH₄-N discharges (%).

| Period    | ΔE̴<sub>plan</sub> | ΔE̴<sub>str</sub> | ΔE̴<sub>ty</sub> | ΔE̴<sub>tec</sub> | ΔE̴<sub>aba</sub> | ΔE̴<sub>tot</sub> | ΔE̴<sub>plan</sub> | ΔE̴<sub>str</sub> | ΔE̴<sub>ty</sub> | ΔE̴<sub>tec</sub> | ΔE̴<sub>aba</sub> | ΔE̴<sub>tot</sub> |
|-----------|-------------------|-----------------|-----------------|-----------------|----------------|-----------------|------------------|-----------------|-----------------|-----------------|----------------|------------------|
| 2001–2002 | 13.68             | −3.26           | −17.36          | 14.86           | −32.22         | −6.95           | 14.47            | −9.89           | 0.07            | 7.93            | −7.86          | 4.65              |
| 2002–2003 | 11.48             | 2.95            | −18.85          | −15.38          | −3.47          | −4.42           | 13.07            | 9.98            | −25.15          | −24.73          | −0.41          | −2.09              |
| 2003–2004 | 15.48             | −3.51           | −9.96           | −10.86          | 0.91           | 2.01            | 18.04            | −9.86           | −4.10           | 4.92            | −9.02          | 4.08              |
| 2004–2005 | 16.18             | −3.18           | −4.67           | −9.46           | 4.79           | 8.33            | 20.26            | −3.09           | 8.98            | 1.74            | 7.24          | 26.14              |
| 2005–2006 | 20.73             | 1.82            | −28.69          | −25.42          | −3.28          | −6.14           | 25.34            | 1.41            | −55.59          | −32.89          | −22.70         | −28.85             |
| 2006–2007 | 19.90             | 3.57            | −25.37          | −24.41          | −0.96          | −1.90           | 20.33            | 5.03            | −44.61          | −35.94          | −8.67          | −19.24             |
| 2007–2008 | 10.40             | −3.42           | −16.65          | −10.17          | −6.48          | −9.68           | 9.57             | −12.20          | −8.06           | 7.42            | −15.48         | −10.68             |
| 2008–2009 | 9.31              | −6.08           | −8.38           | −4.84           | −3.55          | −5.15           | 8.36             | −4.42           | −10.19          | −4.31           | −5.88          | −6.25              |
| Average   | 14.64             | −1.39           | −16.24          | −10.71          | −5.53          | −2.99           | 16.18            | −2.88           | −17.33          | −9.48           | −7.85          | −4.03              |
The average production effects on the changes of COD and NH\(_4\)-N discharges were \(72.97 \times 10^4\) t and \(5.85 \times 10^4\) t, respectively, indicating the expansion in economic scale has caused an increase in water pollutant discharges. Year 2001–2006 witnessed a rapid increase in economic scale, and the production effect showed a rising tendency with an average annual value of 12.84% (see Table 3). This may be caused by the implementation of macroeconomic policies like expansion of domestic demand and increase of investment, which encouraged a large number of infrastructure construction and industrial projects. Industrial GDP growth rate remained at an average value of 18.11% (see Figure 1), and it made the economic development a major contributor to industrial COD and NH\(_4\)-N discharges. From 2007 to 2009, the industrial GDP kept declining, finally down to 12.59% in 2009, and the corresponding production effect also fell to a certain extent. This is probably because in the Seventeenth National Congress of the Communist Party of China in 2007, China promoted the conservation culture by basically forming an energy- and resource-efficient and environment-friendly structure of industries, pattern of growth and mode of consumption. It is reasonable to conclude that the continued growth in industrial GDP scale accelerated COD and NH\(_4\)-N discharges. The slower the GDP grows the smaller the contribution it makes to COD and NH\(_4\)-N discharges. Therefore, China will still have to face the pressure from GDP growth and industrial pollutions discharges in the foreseeable future.

3.1.2. Structure Effect

Unlike the production effect (\(\Delta E_{pdr}\)), the structure effect (\(\Delta E_{str}\)) showed no significant regularity. The structure effect was relatively stable, as shown in Tables 2 and 3. The change values of COD was ranging from \(-30.31 \times 10^4\) t (–6.08%) to \(17.78 \times 10^4\) t (3.57%), while in the majority of cases it was negative and the average annual value was \(-6.93 \times 10^4\) t (–1.39%); while in the case of NH\(_4\)-N, the change values were between \(-4.41 \times 10^4\) t (–12.20%) and \(3.61 \times 10^4\) t (9.98%), whereas in most instances it was negative and the average annual value was \(-1.04 \times 10^4\) t (–2.88%). Consequently, changes of economic structure in China’s industry played a certain role in reducing COD and NH\(_4\)-N discharges, but to a small extent. Through the analysis of atmospheric pollutants emissions in the American Midwest during the period of 1970–2000, Tao et al. also concluded that the decrease of emission level could be contributed to by 80% by the intensity effect and 20% by the structure effect [23]. The reason may lie in that the industrial structural change over the past nine years is insufficient because of slow change effect. Therefore, industrial water pollutant reduction by structure adjustment should be a long-term policy goal. In respect of industrial pollutants reduction, China’s economic structure optimization has a long way to go.

3.1.3. Intensity Effect

As shown in Table 2, in most cases the intensity effect (\(\Delta E_{itc}\)) showed the maximum negative values among the influencing factors for both COD and NH\(_4\)-N, indicating that the industrial pollutants reduction was mainly due to the technological progress in the industrial sectors. Particularly, the average total change (\(\Delta E_{tot}\)) of industrial COD discharges during 2001 and 2009 was \(-14.89 \times 10^4\) t, while the change brought by production effect, intensity effect and structure effects were \(72.97 \times 10^4\) t, \(-6.93 \times 10^4\) t and \(-80.94 \times 10^4\) t, respectively. Obviously, it was the intensity effect that accounted for
543% of the average total change of industrial COD discharge that pushed industrial COD discharges downward. It was the same situation in NH₄-N discharges. The intensity effect is the overall reflection of various environment laws and regulations, tax policies, and other measures, taking direct investment in pollution control as an example. A dominant intensity effect manifests the effectiveness of the various government measures used to reduce pollutant discharges.

As shown in Table 2, the average intensity effect on the changes of COD discharges was $-80.94 \times 10^4$ t, the cleaner production effect ($\Delta E_{tec}$) and pollution abatement effect ($\Delta E_{aba}$) were $-53.37 \times 10^4$ t and $-27.57 \times 10^4$ t, respectively, indicating that both the cleaner production effect and the pollution abatement effect had a decremental effect on industrial COD discharges. Furthermore, the cleaner production effect and pollution abatement effect accounted for 66% and 34% of the intensity effect, respectively, while in the case of NH₄-N the ratios were 55% and 45%, respectively, indicating that the cleaner production effect played a major role.

**Figure 3.** The average changes of industrial pollutant discharges for all sub-sectors between 2001 and 2009 (a) COD; (b) NH₄-N.

3.2. Sector Comparisons

As the industrial wastewater pollutant discharges are the sum of all sub-sectors, it is essential to decompose the contribution of each sector to the production effect, structure effect, intensity effect, cleaner production effect and pollution abatement effect. The results are given below.
3.2.1. COD Case

Figure 3a showed that there was an increase in COD discharge from fifteen industrial sectors (including textile manufacture, processing of food from agricultural products, mining and processing of non-ferrous metal ores and so on), and the total increment was $3.17 \times 10^4$ t, accounting for $-21.32\%$ of the average total change; the discharges of twenty-five industrial sectors (including manufacture of paper and paper products, manufacture of beverages, manufacture of foods and so on) decreased, and the total decrease was $-18.07 \times 10^4$ t, accounting for $121.32\%$ of the total change.

The main contributors to the production effect of COD emissions were manufacture of paper and paper products, processing of food from agricultural products, manufacture of raw chemical materials and chemical products, manufacture of textiles and manufacture of beverages (see Table 4). These five sectors increased by 69.63\% the total production effect over the period of 2001–2009. Therefore, these five sectors should be the top sectors to reduce industrial COD emissions. One potential option to reduce industrial COD emission, or at least limit its growth rate would be policies to slow down the expansion of these sectors’ economic scale or encourage restructuring to less COD discharge sectors.

Table 4 The top five contributing sub-sectors to the average production effect of industrial COD discharges ($10^4$ t).

| Industry sectors                                    | Production effect |
|-----------------------------------------------------|-------------------|
| Manufacture of paper and paper products              | 27.74             |
| Processing of food from agricultural products        | 9.72              |
| Manufacture of raw chemical materials and chemical products | 7.96          |
| Manufacture of textile                              | 4.78              |
| Manufacture of beverages                            | 3.60              |
| Subtotal of the five sub-sectors                     | 50.81             |
| Total sum of all industrial sub-sectors              | 72.97             |

The top six contributors to the accumulated structure effect increased $2.361 \times 10^4$ t due to an increase in output shares (see Table 5). However, over the same period there was a decrease in industrial COD emission, thanks to other sectors like manufacture of raw chemical materials and chemical products and processing of food from agricultural products (see Figure 3a).

Table 5. The top six contributing sub-sectors related to the structure effect and share rate of COD changes between 2001 and 2009.

| Industry sectors                                      | Share rate (%) | ΔEstr ($10^4$ t) |
|------------------------------------------------------|----------------|-----------------|
| Manufacture of paper and paper products               | 2.25           | 2.83            | 0.693           |
| Smelting and pressing of ferrous metals               | 7.78           | 10.22           | 0.516           |
| Production and distribution of water                  | 0.10           | 0.05            | 0.430           |
| Manufacture of communication equipment, computers and |                |                 |                 |
| Other electronic equipment                            | 4.04           | 11.35           | 0.313           |
| Manufacture of electrical machinery and equipment     | 0.51           | 2.27            | 0.234           |
| Manufacture of transport equipment                    | 7.26           | 10.46           | 0.175           |
The total amount of COD decrement in the structure effects in these three sectors was $5.30 \times 10^4$ t, and this offset accounted for 224.36% of the average total structure effects of the top six sectors (presented in Table 5) between 2001 and 2009. Furthermore, the clean-technology effect of other sectors accounted for 84% of the intensity effect and had an incremental effect on COD discharge, and this might indicate that the other sectors include some sectors with low clean-technology; while the pollution abatement effect for mining of other ores played a major role in the increase of COD discharges. So these two industrial sectors should be the top sectors to boost their intensity effect.

### 3.2.2. NH₄-N Case

Overall, during the period of 2001–2009, the average total change of China’s industrial NH₄-N discharge in wastewater was $-1.46 \times 10^4$ t, and the effects brought by economic scale, economic structure and technological level of the sector were $5.85 \times 10^4$ t, $-1.04 \times 10^4$ t, and $-6.27 \times 10^4$ t, respectively. Figure 3b showed that there was an increase in NH₄-N discharge from twenty-two industrial sectors (including mining and washing of coal, other sectors, manufacture of textile and so on), and the total increment was $0.39 \times 10^4$ t, accounting for $-26.74\%$ of the average total change; the discharges of eighteen industrial sectors (including manufacture of general purpose machinery, mining and processing of nonmetal ores, mining of other ores and so on) decreased, and the total decrement was $-1.85 \times 10^4$ t, accounting for 126.74% of the average total change. The main contributors to the average production effect of industrial NH₄-N discharges were manufacture of raw chemical materials and chemical products, manufacture of paper and paper products, processing of food from agricultural products, manufacture of foods, manufacture of textile and smelting and pressing of ferrous metals (see Table 6). These six sub-sectors increased 76.08% of the average total production effect over the period of 2001–2009. Therefore, these six sectors should be the top sectors to reduce industrial NH₄-N discharge.

#### Table 6. The top six contributing sub-sectors related to the average production effect of industrial NH₄-N discharges ($10^4$ t).

| Industry sectors                              | Production effect |
|-----------------------------------------------|-------------------|
| Manufacture of raw chemical materials and chemical products | 2.72 |
| Manufacture of paper and paper products        | 0.52 |
| Processing of food from agricultural products  | 0.48 |
| Manufacture of foods                          | 0.27 |
| Manufacture of textile                        | 0.23 |
| Smelting and pressing of ferrous metals        | 0.23 |
| Subtotal of the five sub-sectors               | 4.45 |
| Total sum of all industrial sub-sectors        | 5.85 |

The top six contributors to the accumulated structure effect increased $0.117 \times 10^4$ t/year due to an increase in output shares (see Table 7). Over the same period, the changes of NH₄-N emission in output shares for manufacture of raw chemical materials and chemical products and other sectors decreased (see Figure 3b). The total amount of decrement of NH₄-N emission from the structure...
effects in these two sectors was $0.87 \times 10^4$ t, and this offsets accounted for 745.38% of the average total structure effects of the top six sectors during 2001 and 2009.

Table 7. The top six contributing sub-sectors with related to the structure effect and share rate of NH$_4$-N changes during 2001–2009.

| Industry sectors                                      | Share rate (%) | ΔEstr $(10^4$ t) |
|--------------------------------------------------------|----------------|------------------|
| Smelting and pressing of ferrous metals                 | 7.78           | 0.053            |
| Manufacture of communication equipment, computers and other electronic equipment | 4.04           | 0.021            |
| Production and distribution of water                    | 0.10           | 0.017            |
| Manufacture of transport equipment                      | 7.26           | 0.016            |
| Manufacture of electrical machinery and equipment       | 0.51           | 0.006            |
| Manufacture of paper and paper products                 | 2.25           | 0.004            |

Particularly, the effect brought by technological level of other sectors, mining and washing of coal was positive, with the value of $0.262 \times 10^4$ t and $0.014 \times 10^4$ t, respectively; while the structure effect were $-0.339 \times 10^4$ t and $-0.005 \times 10^4$ t, respectively. Thus, the intensity effect of the other sectors, mining and washing of coal didn’t play its due role and the technological level should be improved. Additionally, the effect brought by technological level of other sectors, mining and washing of coal was positive with the cleaner production effect accounting for 98% of the intensity effect.

4. Conclusions

Over period of 2001–2009, China’s industrial COD discharges decreased 14.89 million tons, and the contribution by production scale, structural scale, intensity scale, cleaner production scale and pollution abatement scale were $72.97 \times 10^4$ t, $-6.93 \times 10^4$ t, $-80.94 \times 10^4$ t, $-53.37 \times 10^4$ t and $-27.57 \times 10^4$ t, respectively. Likewise, the average changes of industrial NH$_4$-N discharges were $-1.46 \times 10^4$ t, and the $\Delta E_{pdn}$, $\Delta E_{str}$, $\Delta E_{iv}$, $\Delta E_{lec}$ and $\Delta E_{aba}$ were $5.85 \times 10^4$ t, $-1.04 \times 10^4$ t, $-6.27 \times 10^4$ t, $-3.43 \times 10^4$ t and $-2.84 \times 10^4$ t, respectively. The results also indicate that:

(1) Production effect was the major contributor to the increment of COD and NH$_4$-N discharges in industrial wastewater, while the intensity effect played a crucial role in COD and NH$_4$-N reduction.

(2) As one of the two parts in the intensity effect, the clean-technology effect played a major role in pollution reduction.

(3) Compared with the production effect and intensity effect, the structure effect played a minor role. However, it did decrease industrial pollution discharges between 2001 and 2009, so industrial structure adjustment should be a long-term policy goal in pollution reduction.

(4) The main contributors to the average production effect of the industrial COD discharges were manufacture of paper and paper products, processing of food from agricultural products, manufacture of raw chemical materials and chemical products, manufacture of textile and manufacture of beverages, while the main contributing sub-sectors to the average production effect of the industrial NH$_4$-N discharges were manufacture of raw chemical materials and
chemical products, manufacture of paper and paper products, processing of food from agricultural products, manufacture of foods, manufacture of textile and smelting and pressing of ferrous metals. Therefore, these sectors should be the top sectors to offset the growth of industrial COD or NH$_4$-N discharges.

5. Policy Implications

China’s 12th Five-Year Plan (2011–2015) is aiming for average annual GDP growth of 7% and environment protection by cutting the release of COD and ammonia nitrogen (NH$_4$-N) by 8% and 10%, respectively. In order to achieve harmonized development of both economic growth and environmental sustainability, China must strengthen its environmental regulations. Our research results suggest the following pollution reduction strategies:

(1) Manufacture of paper and paper products, processing of food from agricultural products, manufacture of raw chemical materials and chemical products, manufacture of textile and manufacture of beverages should be the top sectors for industrial COD reduction. Manufacture of raw chemical materials and chemical products, manufacture of paper and paper products, processing of food from agricultural products, manufacture of foods, manufacture of textile and smelting and pressing of ferrous metals should be the top sectors for industrial NH$_4$-N reduction. One potential option to reduce industrial COD and NH$_4$-N discharged in wastewater, or at least to limit its growth rate would be policies that slow down the expansion of these sectors’ economic scale or encourage their restructuring and adjustment to less pollution sectors. Policies should be implemented to encourage the growth of low pollution sectors, and to limit the expansion of pollutants-intensive sectors through the reduction of their exports or the expansion of their imports.

(2) Mining of other ores and mining and washing of coal should be the top sectors to import or upgrade advanced technologies.

(3) Economic growth should be integrated with harmonized industrial development and industrial pollutants (both COD and NH$_4$-N) reduction.

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**Appendix**

| Industrial sectors                                      | ID  | Industrial sectors                                      | ID   |
|---------------------------------------------------------|-----|---------------------------------------------------------|-----|
| Mining and Washing of Coal                              | I1  | Manufacture of Medicines                                | I21 |
| Extraction of Petroleum and Natural Gas                 | I2  | Manufacture of Chemical Fibers                          | I22 |
| Mining and Processing of Ferrous Metal Ores             | I3  | Manufacture of Rubber                                   | I23 |
| Mining and Processing of Non-ferrous Metal Ores         | I4  | Manufacture of Plastics                                 | I24 |
| Mining and Processing of Nonmetal Ores                  | I5  | Manufacture of Non-metallic Mineral Products             | I25 |
| Mining of Other Ores                                    | I6  | Smelting and Pressing of Ferrous Metals                  | I26 |
| Processing of Food from Agricultural Products           | I7  | Smelting and Pressing of Non-Ferrous Metals              | I27 |
| Manufacture of Foods                                    | I8  | Manufacture of Metal Products                           | I28 |
| Manufacture of Beverages                                | I9  | Manufacture of General Purpose Machinery                 | I29 |
| Manufacture of Tobacco                                  | I10 | Manufacture of Special Purpose Machinery                 | I30 |
| Manufacture of Textile                                  | I11 | Manufacture of Transport Equipment                       | I31 |
| Manufacture of Textile Wearing Apparel, Footware, and Caps | I12 | Manufacture of Electrical Machinery and Equipment        | I32 |
| Manufacture of Leather, Fur, Feather and Related Products | I13 | Manufacture of Communication Equipment, Computers and Other Electronic Equipment | I33 |
| Processing of Timber, Manufacture of Wood, Bamboo, Rattan, Plam, and Straw Products | I14 | Manufacture of Measuring, Instruments and Machinery for Cultural Activity and Office Work | I34 |
| Manufacture of Furniture                                | I15 | Manufacture of Artwork and Other Manufacturing           | I35 |
| Manufacture of Paper and Paper Products                  | I16 | Recycling and Disposal of Water                          | I36 |
| Printing, Reproduction of Recording Media               | I17 | Production and Distribution of Electric Power and Hear Power | I37 |
| Manufacture of Articles for Culture, Education and Sport Activity | I18 | Production and Distribution of Gas                       | I38 |
| Processing of Petroleum, Coking, Processing of Nuclear Fuel | I19 | Production and Distribution of Water                     | I39 |
| Manufacture of Raw Chemical Materials and Chemical Products | I20 | Other Sectors                                           | I40 |

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