



# CO<sub>2</sub> emission characteristics and reduction responsibility of industrial subsectors in China

Xinru Lin<sup>a</sup>, Yiting Zhang<sup>b</sup>, Chenyi Zou<sup>a</sup>, Lihong Peng<sup>a,\*</sup>

<sup>a</sup> College of the Environment & Ecology, Xiamen University, Xiang'an South Road, Xiang'an District, Xiamen 361102, China

<sup>b</sup> Policy Research Center, Hubei Academy of Environmental Science, Bayi Road, Hongshan District, Wuhan 430072, China

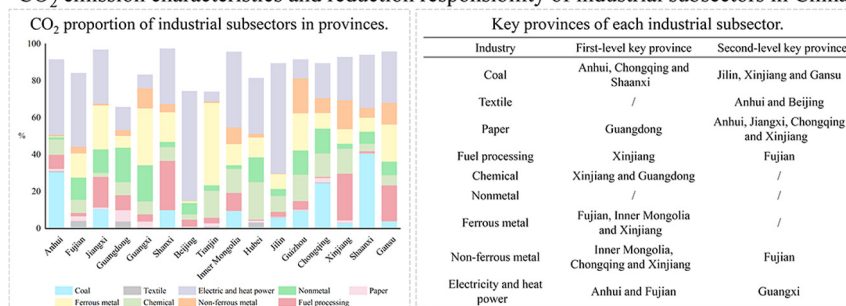


## HIGHLIGHTS

- This paper calculates the CO<sub>2</sub> emissions of industrial subsectors in China's provinces.
- This paper analyzes the CO<sub>2</sub> emission characteristics of selected subsectors in provinces and economic regions.
- This paper identifies the industrial subsectors that each province should focus on.
- This paper provides constructive suggestions for policymakers to promote low-carbon economy and sustainable development.

## GRAPHICAL ABSTRACT

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## ABSTRACT

Industrial subsectors have an important role in reducing China's carbon dioxide (CO<sub>2</sub>) emissions. The present study analyzes the CO<sub>2</sub> emission characteristics of selected subsectors. Results show that the electric and heat power sector is the major industrial CO<sub>2</sub> emitter, and CO<sub>2</sub> emissions of most sectors present huge inter-provincial and inter-regional differences. Then, the CO<sub>2</sub> emission reduction responsibility of provincial-level industrial subsectors is confirmed by the decoupling model. Results show that the development of a low-carbon economy in the nonmetal sector is ideal, and the economic growth in Shanxi and Guizhou is moving toward a low-carbon and energy-saving mode. Moreover, the subsectors that each province should focus on are identified. Finally, constructive suggestions for policymakers to promote low-carbon economy and sustainable development are provided.

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## 1. Introduction

Global warming, which is mainly caused by an increase of carbon dioxide (CO<sub>2</sub>) concentration in the atmosphere (IPCC, 2007; Letcher, 2019), is a serious environmental challenge. China is the world's largest CO<sub>2</sub> emitter (Le Quéré et al., 2017) and promises

to reduce its CO<sub>2</sub> emission per unit of GDP by 18% from the 2015 level, according to the country's "13th Five-Year Plan". China has a vast territory. To achieve the national goal, provincial administrative regions (hereafter called provinces) need to work together. Industry, as a dominant factor of the national economy, is a major energy consumer and source of CO<sub>2</sub> emissions (Shan et al., 2018; Wang et al., 2019). Therefore, studying the CO<sub>2</sub> emission characteristics of the industrial subsectors of each province, as well as their responsibility to reduce these emissions, is a matter of urgency.

Correct CO<sub>2</sub> emission accounting is not only the basis of analyzing CO<sub>2</sub> emission characteristics, but supports identification,

\* Corresponding author at: Room A119, College of the Environment & Ecology, Xiamen University, Xiang'an South Road, Xiang'an District, Xiamen 361102, China.

E-mail addresses: [xr.lin@stu.xmu.edu.cn](mailto:xr.lin@stu.xmu.edu.cn) (X. Lin), [zhangyt@lanhit.com](mailto:zhangyt@lanhit.com) (Y. Zhang), [33120182202178@stu.xmu.edu.cn](mailto:33120182202178@stu.xmu.edu.cn) (C. Zou), [lhpeng@xmu.edu.cn](mailto:lhpeng@xmu.edu.cn) (L. Peng).

selection, introduction, and implementation of CO<sub>2</sub> emission reduction plans and measures (Schaltegger and Csutora, 2012). The main accounting methods used by existing studies are life cycle assessment (LCA; Ji and Chen, 2016; Wang and Chen, 2018; Kennelly et al., 2019), input–output model (Wang et al., 2018c; Liu and Fan, 2017; Zhang, 2018; Li et al., 2018), and emission factor approach (Zhao and Wu, 2018; Fan et al., 2013; Lin and Nelson, 2019; Du et al., 2019a). As a widely used method to quantify the environmental impact of a given product throughout its entire life cycle (ISO, 2006), LCA is considered as a promising tool to obtain potential CO<sub>2</sub> emissions (Antón and Díaz, 2014). However, LCA always leads to truncation errors (Ward et al., 2018) and provides limited functions in macro-analysis (Antón and Díaz, 2014). Input–output model is well described, consistent, and can be applied in direct and indirect CO<sub>2</sub> emissions accounting. However, this model has a high data requirement (Kennelly et al., 2019). Unfortunately, the input–output tables of China's provinces have not been updated for many years. Emission factor approach, which is supported by the Intergovernmental Panel on Climate Change (IPCC) and adopted in “Guidelines for National Greenhouse Gas Inventories,” is an authoritative, reliable and convenient method for measuring CO<sub>2</sub> emissions from energy activities (Ma et al., 2019). For instance, Yang and Liu (2017) applied emission factor approach to calculate China's urban household CO<sub>2</sub> emissions from commercial energy, such as coal, liquefied petroleum gas (LPG), and gasoline in 2015. Wang et al. (2018a) employed emission factor approach to estimate CO<sub>2</sub> emissions generated by transportation in China from 1990 to 2015. Wang and Jiang (2019) used emission factor approach to calculate the energy-related CO<sub>2</sub> emissions in China from 2000 to 2014. In summary, emission factor approach meets the requirements of our study.

Responsibility sharing in CO<sub>2</sub> emission reduction is the key to achieve the national reduction goal at the minimum cost. Some scholars allocate the total CO<sub>2</sub> emission allowances to provinces (Dong et al., 2018; Yu et al., 2019; Xie et al., 2019) or industrial sectors (Yang et al., 2017; Zhang and Hao, 2017; Zhu et al., 2018) to clarify their responsibility to reduce CO<sub>2</sub> emissions. Others identify the responsibility by concerning the nexus between economic growth and CO<sub>2</sub> emissions. Environmental Kuznets curve (EKC; Wang et al., 2017b; Riti et al., 2017) and decoupling model (Luo et al., 2017; Zhao et al., 2017) are the two general methods (Wu et al., 2018). Compared with EKC, decoupling model is easier to understand and operate (Wang et al., 2017a), and provides a real-time dynamic relationship between economic growth and pollutant emission (Wang and Yang, 2015). Thus, decoupling model has received increasing attention in the field of sustainable development. Wang et al. (2017b) adopted the Tapio model to analyze the decoupling relationship between economic growth and CO<sub>2</sub> emission of the transportation industry in Jiangsu Province from 1995 to 2012. Jiang et al. (2018) employed Tapio model to quantify the decoupling effects of CO<sub>2</sub> emissions in China's six major sectors from 2000 to 2014. Du et al. (2019b) applied Tapio decoupling model to investigate the relationship between economic growth and CO<sub>2</sub> emission from the construction industry of China's 30 provinces for the 2005–2015 period. Additionally, several studies also explored the driving forces of decoupling combined with decomposition method (Zhao et al., 2017; Wang et al., 2018b).

Numerous province-level decoupling studies have been completed in China, but evidently, most of them have focused on a specific industry or a certain province, and systematic comparative analyses involving multiple provinces and industries are lacking. Furthermore, existing studies have often targeted major sectors, such as industry, construction, and manufacturing, and lack in-depth exploration of other industrial subsectors. This study attempts to fill certain gaps identified in the literature. According

to the CO<sub>2</sub> emissions of industrial subsectors in China's provinces calculated by the emission factor approach, the CO<sub>2</sub> emission characteristics of selected subsectors are discussed from the perspective of provincial and economic region. The decoupling model confirmed the responsibility to reduce emissions of provincial-level industrial subsectors. We aim to produce an efficient guidance and reference to promote the low-carbon economy and sustainable development.

## 2. Methods and data

### 2.1. Calculation of CO<sub>2</sub> emissions

We used the emission factor approach to calculate CO<sub>2</sub> emissions of industrial subsectors in China's provinces. The function is shown in Eq. (1):

$$C_i^t = \sum_{j=1}^n E_{ij}^t F_j \quad (1)$$

where  $C_i^t$  represents the CO<sub>2</sub> emissions from the  $i$ -th sector in  $t$  year,  $E_{ij}^t$  represents the  $j$ -th energy consumption of the  $i$ -th sector in  $t$  year, and  $F_j$  represents the CO<sub>2</sub> emission factor of the  $j$ -th energy.

According to the China Energy Statistical Yearbook, the types of energy used to calculate CO<sub>2</sub> emissions are raw coal, cleaned coal, other washed coal, coke, crude oil, gasoline, kerosene, diesel oil, fuel oil, LPG, refinery gas, natural gas, heat and electricity. Their CO<sub>2</sub> emission factors come from the “Guidelines for Provincial Greenhouse Gas Inventories” (Climate Division, National Development and Reform Commission, China, 2011).

### 2.2. Determining responsibility to reduce CO<sub>2</sub> emissions

#### 2.2.1. Decoupling model

Decoupling theory was first proposed by the Organization for Economic Co-operation and Development (OECD) in 2002 (OECD, 2002), but the original decoupling model has led to poor stability of the calculated results due to high sensitivity in the choice of benchmark years (Zhao et al., 2016; Wu et al., 2018). Tapio decoupling model (Tapio, 2005) overcomes the problem with its flexible incremental analysis. The decoupling elasticity  $\varepsilon$  of CO<sub>2</sub> emission ( $C$ ) and economic growth (output values, denoted as  $V$ ) in a certain industrial subsector of a province can be measured as follows:

$$\varepsilon = \frac{\delta C}{C_0} / \frac{\delta V}{V_0} \quad (2)$$

where subscript 0 denotes the base year, and  $\delta C$  and  $\delta V$  represent the increments of CO<sub>2</sub> emissions and output values, respectively, between the base and target years.

We adopt the judgment presented by Zheng and Zhang (2013) considering that the output value of China's industrial subsectors increased from 2005 to 2014. The decoupling states can be classified into two categories: decoupling ( $\varepsilon \leq 0.5$ ) and coupling ( $\varepsilon > 0.5$ ). Strong decoupling with  $\varepsilon < 0$  is the most ideal state because of the implication that the low-carbon economy has been achieved. By contrast, the greater the value of  $\varepsilon$ , the more CO<sub>2</sub> is emitted per unit of output, which means that the industrial subsectors in coupling state should undertake additional responsibility to reduce CO<sub>2</sub> emissions.

#### 2.2.2. Selection of key industrial subsectors

We count the energy consumption by industrial subsectors from 2000 to 2014. As shown in Fig. 1, the following 8 sectors consume 80% of the total energy consumption in industry: smelting and pressing of ferrous metals (hereafter called ferrous metal); manufacture of raw chemical materials and chemical products

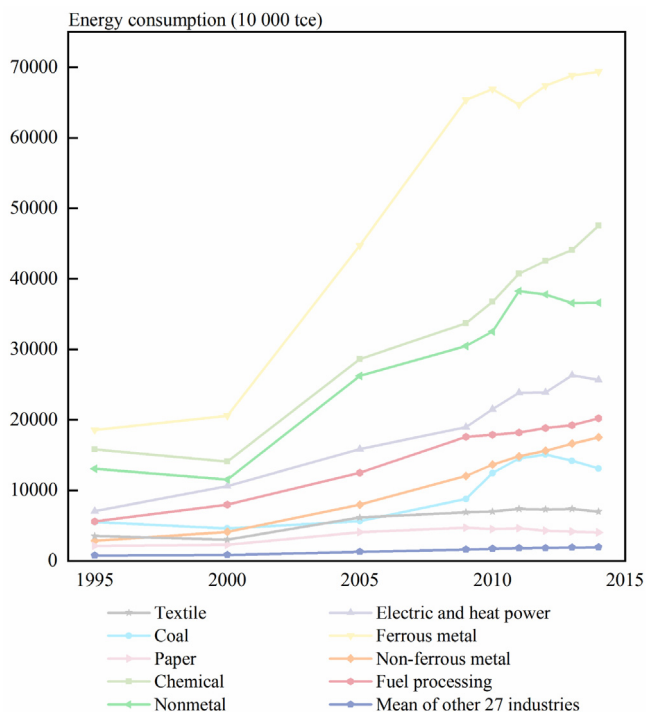


Fig. 1. Energy consumption of industrial subsectors in 2000–2014.

Table 1  
Industrial subsectors covered by carbon trading pilot areas.

Area	Sub-industry
Beijing	Electric and heat power, cement, petrochemical, other industrial enterprises, service, urban rail transit, bus passenger transport
Shanghai	Steel, petrochemical, chemical, non-ferrous metal, electric power, building material, textile, paper, rubber, chemical fiber, etc.
Tianjin	Steel, chemical, electric and heat power, petrochemical, oil and gas production, etc.
Chongqing	Industrial enterprises with emissions of $\geq 20,000$ tons of CO <sub>2</sub> in any year from 2008 to 2012
Hubei	Steel, chemical, cement, automobile making, electric power, non-ferrous metal, glass, paper, etc.
Shenzhen	Enterprises with emissions of $\geq 3000$ tons of CO <sub>2</sub> in any year
Guangdong	Electric power, steel, petrochemical, cement, civil aviation, paper

(chemical); manufacture of non-metallic mineral products (non-metal); production and supply of electric power and heat power (electric and heat power); processing of petroleum, coking and processing of nuclear fuel (fuel processing); smelting and pressing of non-ferrous metals (non-ferrous metal); mining and washing of coal (coal); and manufacture of textile (textile).

The industrial subsectors covered by carbon trading pilot areas are shown in Table 1. Aside from the eight sectors mentioned, manufacture of paper and paper products (paper) has received wide attention.

In summary, we finally select 9 industrial subsectors as the objects of the study. They are ferrous metal, chemical, nonmetal, electric and heat power, fuel processing, non-ferrous metal, coal, textile, and paper.

### 2.3. Data sources

The output values and energy consumption of industrial subsectors are collected from China Energy Statistical Yearbook

2006–2015. The study includes 16 provinces in China, namely, Guangdong, Anhui, Fujian, Jiangxi, Guangxi, Shanxi, Beijing, Tianjin, Inner Mongolia, Hubei, Jilin, Guizhou, Chongqing, Xinjiang, Shaanxi, and Gansu. Others are excluded because of the unavailability of data.

## 3. Results and discussion

### 3.1. CO<sub>2</sub> emission characteristics in provinces

Fig. 2 shows the proportion of CO<sub>2</sub> emissions from 9 key industrial subsectors in each province to its total industrial CO<sub>2</sub> emissions. In addition to Guangdong, the 9 key sectors in the remaining provinces have a cumulative proportion of  $\geq 75\%$ . This proportion exceeds 90% in 10 provinces, which fully illustrates the representativeness of the 9 industrial subsectors.

CO<sub>2</sub> emissions from the electric and heat power sector are the highest. As an important livelihood support, the sector contributes nearly 60% of total industrial CO<sub>2</sub> emissions in Beijing and Jilin;  $>40\%$  in Anhui and Inner Mongolia; about 20% in most provinces; and only 7.44% and 5.23% in Guangxi and Tianjin, respectively.

The ferrous metal sector, which mainly includes ironmaking, steelmaking and ferroalloy smelting, is one of the important raw material industrial subsectors in China. The sector accounts for 45% of total industrial CO<sub>2</sub> emissions in Tianjin; between 20% and 30% in Gansu, Guizhou, Jiangxi, and Guangxi; approximately 10% in most provinces; and  $<1\%$  in Beijing and Anhui.

The proportion of CO<sub>2</sub> emissions from coal sector to total industrial CO<sub>2</sub> emissions shows large inter-provincial differences:  $\geq 30\%$  in Shaanxi and Anhui, and  $<1\%$  in Guangdong, Beijing and Fujian. These results are closely related to coal resource endowment. A similar situation occurs in the fuel processing sector, which contributes 25% of the total industrial CO<sub>2</sub> emissions in Shanxi and Xinjiang but only  $<1\%$  in Hubei and Chongqing. The same is true for the non-ferrous metal sector.

The chemical sector has a relatively balanced proportion (10%) of CO<sub>2</sub> emissions in all provinces. The textile sector and the paper

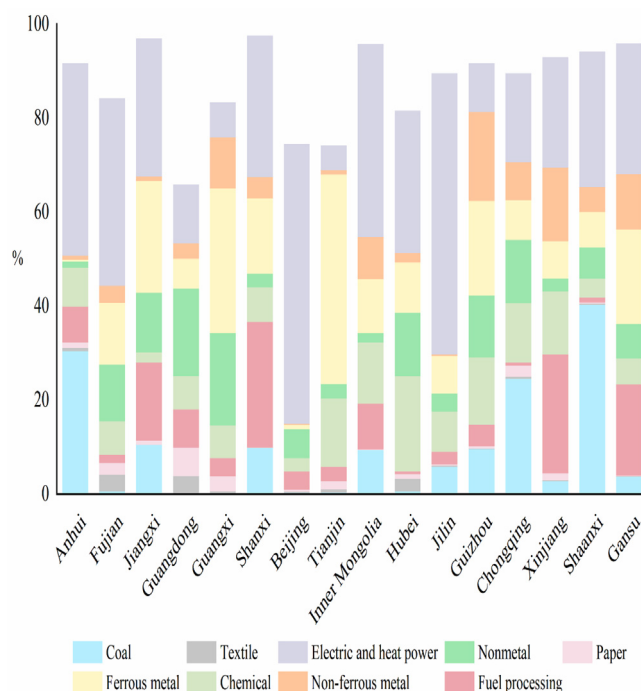


Fig. 2. CO<sub>2</sub> proportion of 9 industrial subsectors in 16 provinces.

sector have the least contribution to total industrial CO<sub>2</sub> emissions, but they still have a place in Guangdong and Fujian.

3.2. CO<sub>2</sub> emission characteristics in economic regions

According to the division of China's four economic regions, Inner Mongolia and Jilin are in Northeast China; Anhui, Jiangxi, Shanxi, and Hubei are in Central China; Fujian, Guangdong, Beijing, and Tianjin are in East China; and Guangxi, Guizhou, Chongqing, Xinjiang, Shaanxi, and Gansu are in West China. Fig. 3 shows the proportion of CO<sub>2</sub> emissions from 9 key industrial subsectors in each economic region to its total industrial CO<sub>2</sub> emissions.

The CO<sub>2</sub> emission characteristics of industrial subsectors differ from one region to another. The textile and paper sectors are classified as light industries. They have great technical and resource advantages in East China. As a result, they contribute more CO<sub>2</sub> emissions in East China than in other regions. With rich coal reserves in West and Central China, the coal sector contributes nearly 13% of total industrial CO<sub>2</sub> emissions in these two regions, but only 0.29% in East China. Owing to the low dependence on

fixed resources, the proportions of CO<sub>2</sub> emissions from the chemical, nonmetal and fuel processing sector to total industrial CO<sub>2</sub> emissions vary minimally among the four economic regions. The electric and heat power sector plays a pivotal role in all economic zones. The sector contributes half of industrial CO<sub>2</sub> emissions in Northeast China and up to 20% in West China. The CO<sub>2</sub> emissions by the non-ferrous metal sector are mainly emitted in West China, and the ferrous metal sector emits more CO<sub>2</sub> in East and West China.

3.3. Responsibility to reduce CO<sub>2</sub> emissions

The decoupling elasticity of industrial subsectors in each province and the proportion of their CO<sub>2</sub> emissions to total industrial CO<sub>2</sub> emissions in 2014 (hereafter referred to as CO<sub>2</sub> proportion) are shown in Fig. 4. In this study, the industrial subsectors that are in coupling state and have high CO<sub>2</sub> proportion are required to shoulder additional responsibility.

The coal sector presents coupling in Anhui, Fujian, Tianjin, Hubei, Jilin, Gansu, Chongqing, Xinjiang and Shaanxi. In Fujian,

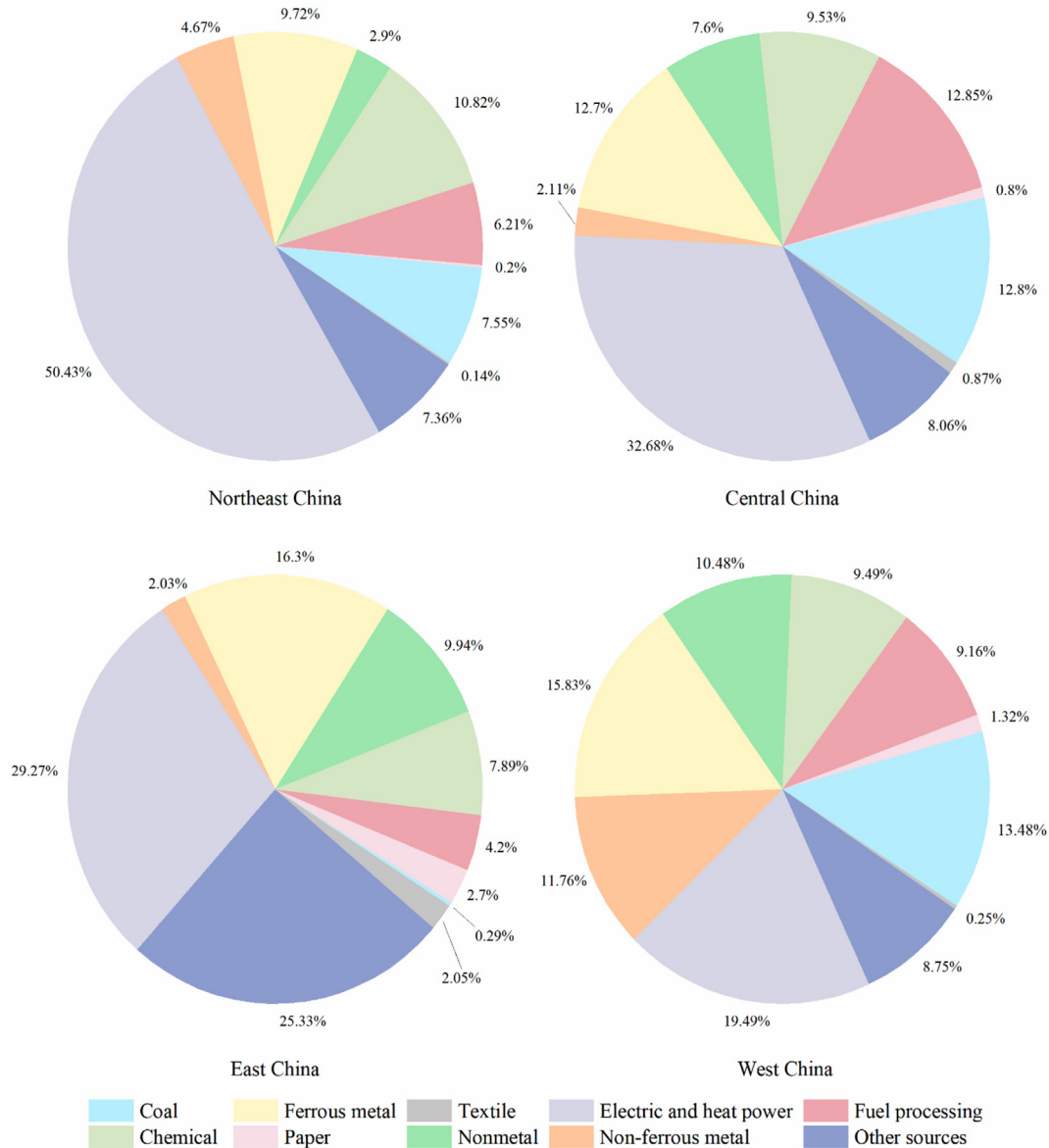


Fig. 3. CO<sub>2</sub> proportion of 9 industrial subsectors in 4 economic regions.

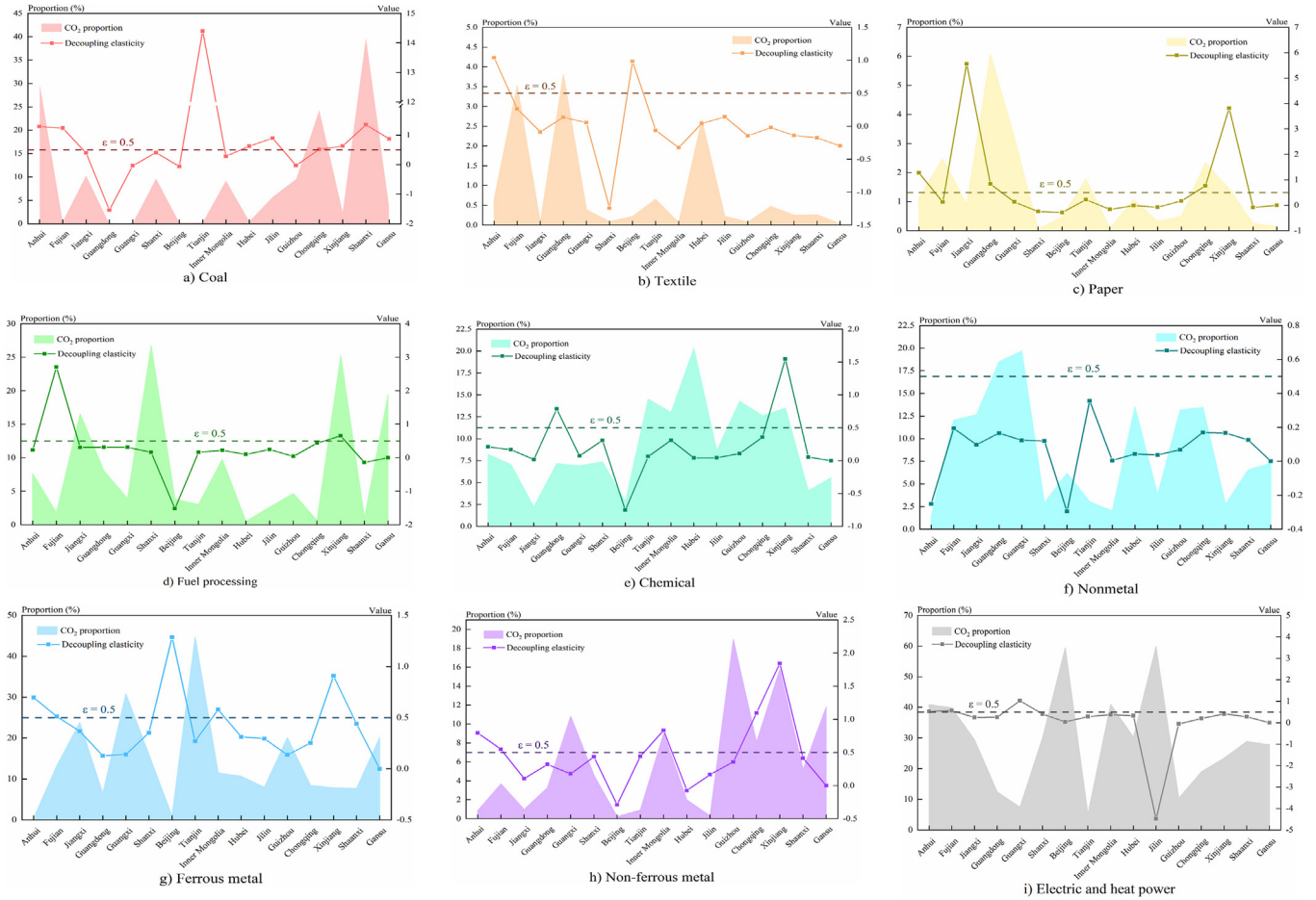


Fig. 4. Decoupling elasticity and CO<sub>2</sub> proportion of industrial subsectors in provinces.

Tianjin and Hubei, the CO<sub>2</sub> proportion of the coal sector is <1%, far below 30%, 24%, and 40% in Anhui, Chongqing, and Shaanxi, respectively. The rates are 5.8% in Jilin, 2.7% in Xinjiang, and 3.7% in Gansu. Therefore, Anhui, Chongqing, and Shaanxi are selected as the first-level key provinces for CO<sub>2</sub> emission reduction in coal sector, and Jilin, Xinjiang, and Gansu are its second-level key provinces.

The coupling state of the textile sector occurs in Anhui and Beijing. As their CO<sub>2</sub> proportion is not high, the two provinces are selected as the second-level key provinces to strengthen low carbon construction in the textile sector.

The paper sector of Jiangxi, Anhui, Guangdong, Chongqing, and Xinjiang is in a coupling state. Among them, the decoupling elasticity in Jiangxi is particularly high at 5.56. The CO<sub>2</sub> proportion in Guangdong (6.08%) is several times more than the other four provinces (1.14% in Anhui, 0.91% in Jiangxi, 2.35% in Chongqing, and 1.44% in Xinjiang). After comprehensive consideration, Guangdong is selected to be the first-level key province to assume a major CO<sub>2</sub> reduction responsibility in the paper sector, and Jiangxi, Anhui, Chongqing, and Xinjiang are the second-level key provinces.

The fuel processing sector presents coupling in Fujian and Xinjiang. The decoupling elasticity in Fujian (2.70) is much greater than that in other provinces, but the CO<sub>2</sub> proportion is only 1.8% in Fujian while that in Xinjiang is as high as 25%. As a result, Xinjiang is selected as the first-level key province for CO<sub>2</sub> emission reduction in the fuel processing sector, and Fujian is the second-level key province.

The coupling state of the chemical sector occurs in Guangdong and Xinjiang. With the high CO<sub>2</sub> proportion in Guangdong (7.2%)

and Xinjiang (13.5%), these provinces are both selected as the first-level key provinces to reduce CO<sub>2</sub> emissions in the chemical sector.

The nonmetal sector shows a unique behavior. It can be observed from Fig. 4 that all provinces are in a decoupling state, indicating that the development of the sector is relatively ideal. Anhui and Beijing present the best decoupling performance with decoupling elasticity below zero. The nonmetal sector in Anhui and Beijing achieved economic growth along with the decrease of CO<sub>2</sub> emissions. All industrial subsectors should strive to move toward such a state.

The ferrous metal sector of Anhui, Fujian, Beijing, Inner Mongolia, and Xinjiang is in coupling state. In Anhui and Beijing, the CO<sub>2</sub> proportion of ferrous metal sector is <1% whereas that in Fujian, Inner Mongolia, and Xinjiang is about 10%. Thus, Fujian, Inner Mongolia, and Xinjiang are selected as the first-level key provinces to strengthen low carbon construction in the ferrous metal sector.

The non-ferrous metal sector presents coupling in Anhui, Fujian, Inner Mongolia, Chongqing, and Xinjiang. Considering the high CO<sub>2</sub> proportion of the non-ferrous metal sector in Inner Mongolia (9.01%), Chongqing (8.07%), and Xinjiang (15.75%), these three provinces are selected as the first-level key provinces for CO<sub>2</sub> emission reduction in non-ferrous metal sector. The CO<sub>2</sub> proportion in Fujian is relatively low (3.68%), so Fujian is selected as the second-level key province of the sector. Anhui is not considered because of its extremely low CO<sub>2</sub> proportion (only 0.86%).

The coupling state of the electric and heat power sector occurs in Anhui, Fujian, and Guangxi. The CO<sub>2</sub> proportion of the sector in these three provinces is 41%, 40%, and 7.4%, respectively. As a

**Table 2**  
Key provinces of each industrial subsector.

Industry	First-level key province	Second-level key province
Coal	Anhui, Chongqing and Shaanxi	Jilin, Xinjiang and Gansu
Textile	/	Anhui and Beijing
Paper	Guangdong	Anhui, Jiangxi, Chongqing and Xinjiang
Fuel processing	Xinjiang	Fujian
Chemical	Xinjiang and Guangdong	/
Nonmetal	/	/
Ferrous metal	Fujian, Inner Mongolia and Xinjiang	/
Non-ferrous metal	Inner Mongolia, Chongqing and Xinjiang	Fujian
Electricity and heat power	Anhui and Fujian	Guangxi

result, Anhui and Fujian are selected as the first-level key provinces to reduce CO<sub>2</sub> emissions from the electric and heat power sector, and Guangxi is the second-level key province.

Table 2 provides a summary.

Only the industrial subsectors of Shanxi and Guizhou are in a decoupling state, which means that the overall low-carbon development capacity of the two provinces is strong, and their mode of economic growth is moving toward low-carbon and energy-saving. Although Shanxi is a major energy consumer, since 2008, it has undergone large-scale restructuring and shut down many coal enterprises, thereby resulting in a negative growth of CO<sub>2</sub> emissions in recent years. Guizhou is rich in mineral resources, but its exploitation and utilization are limited by the presence of mountains. Thus, the CO<sub>2</sub> emissions in Guizhou increase slowly, which is why subsectors in Shanxi and Guizhou exhibit decoupling.

Anhui, Fujian, and Xinjiang have the largest number of industrial subsectors in coupling state. In the past decade, Xinjiang has developed rapidly supported by the West Development Strategy in China. Inevitably, the development of high energy-consuming industries has brought high emissions. Following Shanghai, Zhejiang and Jiangsu, Anhui and Fujian have become the key provinces with economic growth in East China. As a result, energy consumption is significantly faster, and CO<sub>2</sub> emissions increase sharply, thereby promoting coupling.

We are pleased to find that other provinces have only one or two industrial subsectors in coupling state, which means that most of the provincial industrial subsectors are on the road to a low-carbon economy.

#### 4. Conclusions and policy suggestions

Industrial subsectors are the focus of energy conservation and emission reduction in China. We apply the emission factor approach to calculate the CO<sub>2</sub> emissions of industrial subsectors in China's provinces during the 2005–2014 period. The conclusions on CO<sub>2</sub> emission characteristics are as follows: (1) The sum of CO<sub>2</sub> emissions from these nine industrial subsectors (including ferrous metal, chemical, nonmetal, electric and heat power, fuel processing, non-ferrous metal, coal, textile, and paper) accounts for an average of 87.5% of the total industrial CO<sub>2</sub> emissions in the provinces. (2) The electric and heat power sector has the largest average contribution to the total industrial CO<sub>2</sub> emissions of provinces, at 29.1%, while the textile sector has the smallest, only 0.8%. (3) From the perspective of economic regions, the electric and heat power sector remains the major CO<sub>2</sub> emitter, but the sector with the least CO<sub>2</sub> emissions is different in each region, such as the textile sector in Northeast and West China, the paper sector in Central China, and the coal sector in East China. (4) The CO<sub>2</sub> proportion of

most industrial subsectors presents huge inter-provincial and inter-regional differences.

To promote a low-carbon economy and achieve the goal of national CO<sub>2</sub> emission reduction, we identified the reduction responsibility of industrial subsectors in provinces by considering the nexus between their economic growth and CO<sub>2</sub> emissions. The decoupling model was employed and the conclusions are as follows: (1) The development of the low-carbon economy in the nonmetal sector is ideal. (2) The CO<sub>2</sub> emission reduction pressure of textile, fuel processing, and chemical is mainly concentrated in 2 provinces. And CO<sub>2</sub> reduction in the coal, paper, ferrous metal, and electric and heat power sector needs the joint efforts of 3–5 provinces. (3) The economic growth in Shanxi and Guizhou is moving toward low-carbon and energy-saving mode. Other provinces can properly refer to their experience to achieve continuous improvement in decoupling. (4) Anhui, Fujian, Xinjiang and Chongqing need to undertake the major CO<sub>2</sub> emission reduction responsibility of 3–5 industrial subsectors. The economic growth of these four provinces is achieved at the cost of excessive CO<sub>2</sub> emission, and the various CO<sub>2</sub> reduction plans have not achieved their designated goals. (5) The other 10 provinces (Guangdong, Jiangxi, Guangxi, Beijing, Tianjin, Inner Mongolia, Jilin, Hubei, Shaanxi, and Gansu) need to focus on CO<sub>2</sub> reduction in 1 or 2 sectors.

Given the preceding conclusions, we propose the following policy recommendations.

At the national level, attention must be paid to reducing CO<sub>2</sub> emissions in the electric and heat power sector, which is proved to be the major industrial CO<sub>2</sub> emitter. Promoting the development and deployment of new nuclear technologies is an effective way to reduce CO<sub>2</sub>. Setting mechanisms and incentives to support large-scale dissemination of centralized solar thermal power generation and photovoltaic technologies is critical (Grande-Acosta and Islas-Samperio, 2017). In management, the implementation of large and seasonal storage capacity also makes sense (Lamont, 2019). Note that the national carbon emission trading system, with the electric and heat power sector as a breakthrough, was officially launched in 2017. We recommend that the energy trading system that focuses on source control be included in the agenda for good cooperation.

At the provincial level, Shanxi and Guizhou need to maintain the continuous and strong policy enforcement in developing a low-carbon economy. Other provinces have to propose the specific emission reduction plans and phase-in targets for the industrial subsectors selected by our study, and formulate appropriate CO<sub>2</sub> emission reduction measures according to the characteristics of various sectors. For energy-dependent sectors, such as coal processing, optimizing the energy structure has only a slight positive effect on the reduction of CO<sub>2</sub> emissions because the dominant position of coal will not change in the short term. Therefore, the focus should be on technical innovation. For light sectors, such as paper manufacturing, the recovery of the energy from biomass loss will help reduce net CO<sub>2</sub> emissions (Wang et al., 2016), and the advanced technology and scientific management can minimize CO<sub>2</sub> emissions in the production process.

#### Declaration of Competing Interest

The authors declare that there is no conflict of interest regarding the publication of this article.

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