ORIGINAL ARTICLE

# Energy efficiency and CO<sub>2</sub> emissions in Swedish manufacturing industries

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Abstract This paper analyses the trends in energy consumption and CO2 emissions as a result of energy efficiency improvements in Swedish manufacturing industries between 1993 and 2008. Using data at the two-digit level, the performance of this sector is studied in terms of CO<sub>2</sub> emissions, energy consumption, energy efficiency measured as energy intensity, value of production, fuel sources, energy prices and energy taxes. It was found that energy consumption, energy intensity and CO<sub>2</sub> emission intensity, measured as production values, have decreased significantly in the Swedish manufacturing industries during the period studied. The results of the decomposition analysis show that output growth has not required higher energy consumption, leading to a reduction in both energy and  $CO_2$ emission intensities. The role of structural changes has been minor, and the trends of energy efficiency and CO<sub>2</sub> emissions have been similar during the sample period. A stochastic frontier model was used to determine possible factors that may have influenced these trends. The results demonstrate that high energy prices, energy

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C. I. Pardo Martínez (🖾) Faculty of Environmental Engineering, University of La Salle, Bogotá, Colombia e-mail: cipmusa@yahoo.com taxes, investments and electricity consumption have influenced the reduction of energy and  $CO_2$  emission intensities, indicating that Sweden has applied an adequate and effective energy policy. The study confirms that it is possible to achieve economic growth and sustainable development whilst also reducing the pressure on resources and energy consumption and promoting the shift towards a low-carbon economy.

**Keywords** Energy efficiency · CO<sub>2</sub> emissions · Decomposition analysis · Stochastic frontier model · Swedish manufacturing industries

JEL Q40  $\cdot$  Q54  $\cdot$  C02  $\cdot$  C23  $\cdot$  L06

# Introduction

Energy is an important factor in the production of goods and services, and socioeconomic development in general. As a result, the levels of energy consumption, especially electricity, have been often used as indicators of progress and economic development. More recently, increasing awareness about the impacts of energy harnessing and use, as well as the scarcity of resources, has led to efforts to reduce energy dependency and shift economies towards low-carbon options. Many of these efforts are translated into energy policies to motivate and accelerate changes in the patterns of energy generation and use—an important move towards sustainability. This includes major efforts to increase energy efficiency in industries and other sectors of the economy.

Energy efficiency improvements are expected to reduce demand and, consequently, the need for new investments in energy infrastructure. In addition, it will help reduce energy factors in production, and minimize environmental impacts, whilst also guaranteeing continued welfare improvements. However, several researchers have demonstrated that increased energy efficiency has led to increased productivity and economic growth, but not necessarily to a reduction of energy consumption, because energy efficiency only plays a limited role in determining total energy consumption (Smil 2005; IEA 2008a, b; Tsao et al. 2010). In other words, an industry may save energy, but this does not necessarily help reduce total energy consumption because increased energy efficiency improvements may occur simultaneously with increased production, which, in turn, leads to an increase in the total energy consumption. This so-called rebound effect has been discussed by Bentzen (2004) and Allan et al. (2007) in the context of manufacturing industries; Schipper and Groub (2000) and Sorrell (2007) regarding the link between energy consumption and economic growth; and Dimitropoulos (2007) and Schettkat (2009) in relation to economic theory, among others.

Studies on energy efficiency in industries have mainly focused on energy-intensive sectors and, in particular, on the specific effects of energy policy, new technologies or energy prices on energy efficiency variations and improvements. Different methods of analysis have been used, including decomposition analysis and econometric models. Decomposition analysis has been applied in studies on energy demand and gas emissions using several methods as Laspeyres and logarithmic mean Divisia methods.<sup>1</sup> In studies on energy demand, e.g. Reddy and Ray (2010), in the context of Indian manufacturing industries, showed that improvements in energy efficiency are achieved mainly by structural changes; Weber (2009), in the USA, found that improvements in energy efficiency were caused mainly by structural changes in the economy; and Unander (2007), in manufacturing industries of ten IEA countries, showed that structural changes have determined shifts in energy use and efficiency. In studies on gas emissions, e.g. Diakoulaki and Mandaraka (2007) studied EU manufacturing industries finding relevant progress in decoupling the growth of manufacturing industries and carbon emissions; Bhattacharyya and Matsumura (2010) analysed the reduction in greenhouse gas emissions in 15 countries of the European Union finding that emission intensity has reduced significantly due mainly to changes in the energy mix and a reduction in energy intensity, and Sheinbaum et al. (2010) examined energy-related CO<sub>2</sub> emissions in Latin America, demonstrating that the reduction of CO<sub>2</sub> emissions in these countries has not been significant due to an increased dependence on fossil fuels in their energy mix. The Laspeyres method has been applied by Taylor et al. (2010) in IEA countries, demonstrating that energy efficiency has played a role in shaping trends in final energy use, and Cahill and Gallachoir (2010) monitored energy efficiency trends in European industry using this method, among other studies. The logarithmic mean Divisia method has been applied by, among others, Lee and Oh (2006) in APEC countries to analyse CO<sub>2</sub> emissions, finding that efficiency gains in energy and fuel substitution contributed to decreased CO<sub>2</sub> emissions, and Hammond and Norman (2011) in UK manufacturing who studied energy-related carbon emissions and demonstrated that the decrease in emissions was caused by a reduction in energy intensity studies.

Econometric models have been applied using various concepts, including production functions, energy demand models or general equilibrium analysis. Pardo Martinez (2010) studied the effects of investments on energy efficiency in Colombian manufacturing industries, demonstrating the positive relationship of these two variables. Sands and Schumacher (2009) used a computable general equilibrium model, which indicated that improvements in energy efficiency contribute to reduced CO2 emissions. Wei (2007) applied the Cobb-Douglas production function and found that higher energy efficiency leads to expanded production and also higher energy consumption, and measures encouraging energy use efficiency are better than those encouraging energy production efficiency if the aim is to limit total energy use.

However, despite the valuable contributions of previous studies, the effects of energy efficiency on energy consumption and  $CO_2$  emissions in Swedish manufacturing industries have not been analysed. To improve energy policies aimed at increasing energy efficiency and reducing greenhouse gas emissions in industry, better understanding is needed about the patterns of

<sup>&</sup>lt;sup>1</sup> For more details, see a survey of index decomposition analysis (Ang and Zhang 2000).

energy use, energy efficiency and CO<sub>2</sub> emissions, and the factors that determine trends in the various industries. To perform such an analysis, we need, on the one hand, detailed data at various aggregation levels and the application of models and methods that can generate reliable and consistent information to support policy design (IEA 2008a, b). On the other hand, it is also important to understand the nature of the industry and its transformation over time. Many industries are global in nature, so national analysis needs to be complemented with an overall analysis of the global trends within each specific industry so that energy efficiency improvements can be pursued globally over the medium and long terms. This study is limited to manufacturing industries in the Swedish context and can be seen as a starting point for broader analysis.

In the Swedish context, studies on energy efficiency and  $CO_2$  emissions have included several topics. (1) Decomposition analyses of energy consumption and CO<sub>2</sub> emissions have showed that fuel substitution, improvement and transformation of the energy system and processes, as well as changes in consumption patterns, have led to the reduction of CO2 emissions (Löfgren and Muller 2010; Kander and Lindmark 2006). (2) Studies on the relationship between investments, CO<sub>2</sub> emissions and energy efficiency have demonstrated that CO2 emissions and energy efficiency have influenced investment decisions. Energy price levels and research and development expenditures determine the investment size in this field. These studies identified the need for adequate and reliable methods to support the decision-making process (Sandberg and Söderström 2003; Svensson and Berntsson 2010; Hammar and Löfgren 2010). (3) Analyses of the effects of energy policies on improvements in energy efficiency identified several effective strategies to enhance energy efficiency, including energy prices, carbon and energy taxes, voluntary agreements, the application of energy management systems, audits and incentives for emissions reductions through fuel substitution (Johansson 2006; Henriksson and Söderholm 2009; Linden and Carlsson-Kanyama 2002). Other studies have analysed the barriers to the implementation of energy efficiency measures and the effects of some energy programmes on small and medium enterprises (Rohdin and Thollander 2006; Thollander et al. 2007; Thollander and Dotzauer 2010). However, these studies have not included an analysis of the specific effects of energy efficiency improvements on energy consumption and  $CO_2$  emissions over time, nor have they used empirical analysis to evaluate other variables such as energy prices and taxes, kind of fuels and investments with their respective trends. The main contribution of this study is the analysis of the role of energy efficiency on energy use and  $CO_2$  emissions using a decomposition analysis and a production frontier model to determine the impact of various instruments of energy policy used in the Swedish manufacturing industries. Moreover, this study is supported by the importance that is placed on improvements in energy use and the reduction of greenhouse emissions where energy efficiency has become a crucial strategy for sustainable economic development and climate stabilisation today and in the near future to migrate towards a low-carbon economy.

The objective of this paper was to study and analyse the effects of energy efficiency improvements and other variables on energy consumption and  $CO_2$  emissions in Swedish manufacturing industries. For that, we use decomposition analysis and a production frontier model, as explained in detail in "Methodology and data analyses". "The Swedish manufacturing industries—features and trends" provides an overview of Swedish manufacturing industries. "Energy intensity and  $CO_2$  emission intensity in Swedish manufacturing industries" describes the trends in energy intensity and  $CO_2$  emission intensity in Swedish manufacturing industries. "Results and discussion" presents and discusses the results, and "Conclusions" closes with the major conclusions.

#### Methodology and data analyses

#### Decomposition analysis

The first method used in this study is decomposition analysis at the manufacturing industry level to estimate and evaluate energy use and  $CO_2$  emissions. This method examines several factors such as the activity, structure and intensity which influence trends in energy consumption, energy intensity and  $CO_2$  emissions with respect to the production value. Moreover, the concept of energy from "efficiency" has the following perspectives, according to Thomas (2009): In the macroeconomic aggregated perspective, energy efficiency is either denoted as energy intensity (energy input is related to monetary output parameters) or reciprocally as energy productivity (the ratio of production is related to energy consumed); the efficiency of energy conversion (the ratio of generated end-use energy to primary energy or to secondary energy used); and the energy end-use efficiency (the proportion of amount of energy used for the satisfaction of personal needs and energy use for non-personal demands). In this study, we used the concept of energy intensity.<sup>2</sup>

The decomposition analysis involves the division and decomposition of energy and emissions in explanatory variables from the aggregate data. Ang and Zhang (2000) described various methodologies for applying this technique. We selected the multiplicative log-mean Divisia method explained by Ang and Liu (2001), which allows an adequate decomposition at different levels of aggregation. This method is used to determine the effects of structural change in manufacturing production on the total energy consumption. It also allows the identification of the various causes of changes observed in energy use within the manufacturing industries.

In this study, the relative changes are explained using the log percentage change (Ln%) instead of ordinary percentages because this last method has asymmetric and non-additive properties. Following the method of Tornqvist and Vartia (1985), where the relative changes of two numbers *x* and *y* are described as  $Ln\%=Ln(y/x)\times100=[(y-x)/Ln(y,x)]\times100$ , signifying that the log difference is literally a relative difference with respect to the logarithm mean. Ln% is symmetric,<sup>3</sup> additive<sup>4</sup> and normed, which is desirable for assessing relative changes.

Three indicators have been used in this study: (1) *energy intensity*, (2) *energy consumption* and (3)  $CO_2$  *emissions*. These indicators are applied using the equations below where (1) and (2) follow Ang and Zhang (2000) and (3) follows Ausubel (1995) and Lise (2006).

1. Energy intensity: the total change in aggregate energy intensity ( $EI_{agg}$ ) is decomposed into a structural effect ( $F_{str}$ ) that is associated with the manufacturing industrial composition of the sector and an intensity effect  $(F_{int})$  that is related to changes in the sector's energy intensity.

$$EI_{agg} = \sum_{i} S_{i,t} \times EI_{i,t}$$
(1)

EIagg Aggregate energy intensity

- $S_{i,t}$  Production share of sector *i* in year  $t = Y_{i,t}/Y_t$
- $EI_{it}$  Energy intensity of sector *i* in year  $t(=)E_{i,t}/Y_{i,t}$
- $E_{i,t}$  Energy consumption of sector *i* in year *t*
- $Y_{i,t}$  Unit of activity or production of sector *i* in year *t*
- $Y_t$  Total manufacturing industrial production in year t

$$F_{totEI} = \mathrm{EI}_t / \mathrm{EI}_0 = F_{str} \times F_{int}$$
<sup>(2)</sup>

 $F_{\text{totEI}}$  Total change in aggregate energy intensity  $F_{\text{str}}$  Structural effects

F<sub>int</sub> Intensity effects

$$F_{str} = \exp\left\{\sum_{i} \frac{\operatorname{Ln}(\omega_{i,t}\omega_{i,0})}{\sum_{i} \operatorname{Ln}(\omega_{i,t}\omega_{i,0})} \operatorname{ln}\left(\frac{S_{i,t}}{S_{i,0}}\right)\right\}$$
(3)

$$F_{str} = \exp\left\{\sum_{i} \frac{\operatorname{Ln}(\omega_{i,t}\omega_{i,0})}{\sum_{i} \operatorname{Ln}(\omega_{i,t}\omega_{i,0})} \ln\left(\frac{\operatorname{EI}_{i,t}}{\operatorname{EI}_{i,0}}\right)\right\}$$
(4)

- $\omega_i$  Energy share of sector *i* in year *t* (= $E_{i,t}/E_t$ )
- $E_t$  Total energy consumption in year t
- t = 0, the base year (1993)

where Ln(x, y) = (y-x)/1ny/x

2. Energy consumption (EC): this explains the change in energy use in absolute terms based on the inclusion of a production effect ( $F_{pdn}$ ) that is related to changes in the production levels in the entire industrial sector.

$$E_t = \sum_i Y \times S_i \times \mathrm{EI}_i \tag{5}$$

$$F_{totEC} = E_t / E_0 = F_{pdn} \times F_{str} \times F_{int}$$
(6)

$$F_{\text{pdn}} = \exp\left\{\sum_{i} \frac{\text{Ln}(\omega_{i,t}, \omega_{i,0})}{\sum_{i} \text{Ln}(\omega_{i,t}, \omega_{i,0})} \ln\left(\frac{Y_{t}}{Y_{0}}\right)\right\}$$
(7)

 $F_{\rm pdn}$  Production effects

 $F_{\text{totEC}}$  Total change in aggregate energy consumption

<sup>&</sup>lt;sup>2</sup> 'Energy intensity' refers to the amount of energy used to obtain one unit of production, whereas ' $CO_2$  emission intensity' is the amount of  $CO_2$  emissions generated to obtain one unit of production.

<sup>&</sup>lt;sup>3</sup> It is independent of the point which is taken as the point of comparison.

<sup>&</sup>lt;sup>4</sup> Successively relative changes can be added.

3.  $CO_2$  emission intensity: this explains changes in the level of  $CO_2$  emissions through three factors: activity, structure and intensity.

$$COI_{agg} = \sum_{i} S_{i,t} \times COI_{i,t}$$
(8)

- COI<sub>agg</sub> Aggregate CO<sub>2</sub> emission intensity
- $COI_{i,t} CO_2 ext{ emission intensity of sector } i ext{ in year } t \\ (=CO_{i,t}/Y_{i,t})$
- $CO_{i,t}$  CO<sub>2</sub> emissions of sector *i* in year *t*
- $TC_{tot}$   $\frac{COI_t}{COI_0} = F_{pdn} \times F_{str} \times F_{int}$
- $TC_{tot}$  Total change aggregate  $CO_2$  emission intensity

$$F_{str} = \exp\left\{\sum_{i} \frac{\operatorname{Ln}(\psi_{i,t}, \psi_{i,0})}{\sum_{i} \operatorname{Ln}(\psi_{i,t}, \psi_{i,0})} \ln\left(\frac{S_{i,t}}{S_{i,0}}\right)\right\}$$
(9)

$$F_{int} = \exp\left\{\sum_{i} \frac{\operatorname{Ln}(\psi_{i,t}, \psi_{i,0})}{\sum_{i} \operatorname{Ln}(\psi_{i,t}, \psi_{i,0})} \ln\left(\frac{\operatorname{COI}_{i,t}}{\operatorname{COI}_{i,0}}\right)\right\}$$
(10)

- $\psi_i$  CO<sub>2</sub> emissions share of sector *i* in year  $t (=COI_{i,t}/CO_t)$
- $CO_{i,t}$   $CO_2$  emissions associated to the energy consumption of sector *i* in year *t*
- $CO_t$  Total  $CO_2$  emissions in year t

## Econometric model

The second method in this study follows the works of Stern (2010) and Greene (2011). The selected econometric model is a production frontier model estimated for the period 1993–2008 using a set of data at the two-digit level of statistical aggregation for the Swedish manufacturing industry (ISEC 15-36).<sup>5</sup> This model describes the variations in energy intensity and CO<sub>2</sub> emission intensity across Swedish manufacturing industries based on the levels of capital, labour and a residual term, *u*, that characterises the state of energy efficiency determined by a manufacturing industry according to its technology level. These values are estimated using a

panel data stochastic frontier model developed by Battese and Coelli (1992, 1995) in which the effects of the variables on energy intensity and  $CO_2$  emission intensity are the opposite of their effects on the distance of frontier. The models for energy intensity and  $CO_2$ emission intensity are as follows:

$$\operatorname{Ln}\frac{E_{it}}{Y_{it}} = -\alpha_{0} + \alpha_{k} \ln\left(\frac{K}{Y}\right)_{it} + \alpha_{L} \ln\left(\frac{L}{Y}\right)_{it} + \delta_{FF} \ln(\mathrm{FF})_{it} \\
-\delta_{Ele} \ln(\mathrm{Ele})_{it} - \beta_{INV} \ln\left(INV\right)_{it} + u_{it} + v_{it} \\
\ln u_{i} \sim N^{+} \left(\Gamma'z_{i}, \sigma_{u}^{2}\right) \\
\ln v_{i} \sim N\left(0, \sigma_{v}^{2}\right)$$
(11)

$$\begin{aligned} \mathrm{Ln}\frac{\mathrm{CO}_{it}}{Y_{it}} &= -\alpha_{0} + \alpha_{k} \ln\left(\frac{K}{Y}\right)_{it} + \alpha_{k} \ln\left(\frac{L}{Y}\right)_{it} + \delta_{FF} \ln\left(\mathrm{FF}\right)_{it} \\ &- \delta_{Ele} \ln\left(\mathrm{Ele}\right)_{it} - \beta_{INV} \ln\left(\mathrm{INV}\right)_{it} + u_{it} + v_{it} \\ \ln u_{i} &\sim \mathrm{N}^{+} \left(\Gamma' z_{i}, \sigma_{u}^{2}\right) \\ \ln u_{i} &\sim \mathrm{N} \left(0, \sigma_{v}^{2}\right) \end{aligned}$$

$$\end{aligned}$$

Note that  $\alpha$ ,  $\delta$ ,  $\beta$  are the regression-type coefficients estimated with the maximum likelihood technique that makes distributional assumptions of  $u_{it}$  and  $v_{it}$ (Kumbhakar and Lovell 2000; Hadri et al. 2003). *Y* is the gross production in euros; *E* is the final energy consumption, CO is dioxide carbon emissions, *K* is the capital stock of the industries, *L* is the employment level in the industries, FF and Ele are fossil fuel and electricity consumption, respectively, and INV is the investments for every manufacturing industry *i* in each year *t*.

In Eqs. 11 and 12,  $E_{it}/Y_{it}^{6}$  and  $CO_{it}/Y_{it}$  are the dependent variables (*Y* is measured as the production value). From the estimation, we define the algebraic signs of the coefficients which are determined for every variable whether there is a positive or negative effect on energy efficiency and  $CO_2$  emission intensity. In other words, the positive sign indicates direct influence (e.g. the most capital-intensive sectors are also the more energy-intensive) and the negative sign reflects inverse influence (e.g. sectors with high investments are expected to be low energy-intensive).

v is a normally distributed random error term supposed to characterise the measurement error. u is the state of energy efficiency in manufacturing industry *i*.

<sup>&</sup>lt;sup>5</sup> A list of the sectors is shown in the Appendix.

<sup>&</sup>lt;sup>6</sup> Energy efficiency is commonly defined as energy intensity, that is, the quantity of energy required per unit of output or activity. This definition implies that when the relationship between energy and production decreases over time, energy efficiency has improved.

The logarithm of u is a random variable that can only take non-negative values which is modelled as the non-negative part of a normal distribution with mean  $\Gamma' z_i$ .  $z_i$  is a vector of the following additional variables that explain the differences in energy efficiency and  $CO_2$  emission intensity across Swedish manufacturing industries: lnEP is the log of energy prices and lnCO<sub>2</sub>tax and lnEtax the log of the CO<sub>2</sub> emission tax expenditures and the log of the energy tax expenditures for every manufacturing industry *i* in each year *t*, respectively.

Following Stern and Jotzo (2010), the total factor of productivity in each year in every Swedish manufacturing industry can be calculated as follows. A residual series is computed according to

$$\operatorname{Ln} \widehat{u}_{it} = \operatorname{Ln} \frac{E_{it}}{Y_{it}} + \widehat{\alpha}_0 + \widehat{\alpha}_k \ln\left(\frac{K}{Y}\right)_{it} + \widehat{\alpha}_L \ln\left(\frac{L}{Y}\right)_{it} + \delta_{FF} \ln\left(FF\right)_{it} - \delta_{Ele} \ln\left(Ele\right)_{it} - \beta_{INV} \ln\left(INV\right)_{it} - v_{it}$$
(13)

where the measurement error,  $v_i$ , is estimated via the maximum likelihood procedure.

# Data analyses

Data necessary to conduct the econometric analysis were provided by SCB (Statistics Sweden) through the Swedish Environmental Accounts and Statistical database. These organisations use data at two-digit levels of disaggregation according to the International Standard Economic Classification (ISEC Rev. 3.1). ISEC defines the manufacturing sector as an agglomeration of units engaged in the physical or chemical transformation of materials, substances or components into new products. The specific sectors for Sweden, retrieved from Statistics Sweden, are listed in the Appendix. All monetary data were converted to 2000 euro values. The time period selected in this analysis was determined by the availability of detailed data for the intersectoral Swedish manufacturing industries over the period 1993-2008. The data used in this study are as follows:

• *Y* is the output measured as gross production in euros. Several studies have indicated that the production value is a better reference than the value added for energy intensity analysis. When used as

the output measure, the value added tends to exaggerate changes in efficiency and is, thus, relatively more vulnerable to economic change than the production value (Freeman et al. 1997; Pardo Martinez 2009).

- *E* is energy measured as the final energy consumption in terajoules.
- CO is dioxide carbon emissions measured as tonnes of CO<sub>2total</sub>.
- *K* is the capital stock of the industries in euros.
- *L* is the employment level in every Swedish manufacturing industry.
- FF is the consumption of fossil fuels measured in terajoules. We expected that a higher consumption of fossil fuels generates higher energy intensity and CO<sub>2</sub> emission intensity.
- Ele is the electricity consumption measured in terajoules. We would expect a higher electricity consumption to be associated with more energy efficiency.
- INV is the investments measured in euros. We would expect higher investments to associate positively with energy efficiency.
- EP is the energy prices measured in euros. We would expect a direct relationship between energy prices and the energy price because higher energy prices, for example, ought to encourage more rapid adoption of energy-saving technologies and thus lead to faster energy efficiency growth (Worrel and Galitsky 2008).
- *E*<sub>tax</sub> and CO<sub>2 tax</sub> are the energy and CO<sub>2</sub> emission tax expenditures measured in euros, respectively. We would expect higher values of these variables to associate positively with energy efficiency.

# The Swedish manufacturing industries—features and trends

Swedish manufacturing industries are recognised worldwide as the most automated ones. They have also gone through a transformation from traditional, labour-intensive industries to a knowledge-based service industry generating sustained economic growth with a wide range of developments in technology, research and development, clean production and innovation (Lundquist et al. 2008; Schön 2007).

In 2008, there were around 61681 manufacturing companies in Sweden, consuming approximately

1,485 PJ, or 45 % of the energy consumed by industrial activities in the country (Statistics Sweden). Swedish manufacturing industries represent 36 % of the total production value, 25 % of the total value added and 22 % of the total employment in the national economy. Figure 1 shows trends in energy consumption, CO<sub>2</sub> emissions, production value, value added and employment in this segment of industries for the study period (1993-2008). Energy consumption and employment decreased by 1.5 and 0.7 %, respectively, whilst production value, value added and  $CO_2$  emissions increased by 82, 88 and 8 %, respectively, during the period. These results indicate that, whereas Swedish manufacturing industries have generally increased production, they have reduced energy consumption at the cost of some minor increase in CO<sub>2</sub> emissions. This achievement demonstrates that it is possible to produce sustained economic growth whilst using less energy resources and controlling the amount of CO<sub>2</sub> emissions, which is consistent with sustainable development.

Figure 2 shows trends in energy consumption by the kind of fuel used by Swedish manufacturing industries such as electricity, fossil fuels and biofuels. Whereas electricity consumption increased, the use of other fuels decreased, summing up to a small reduction in the total energy consumption in these industries. In particular, there has been a shift away from fossil fuels in line with the shifts made in the structure of energy types used by the industry. This relates also to the move made in Sweden away from low efficiency or more polluting fuels such as coal and petroleum products to cleaner and more efficient fuels such as electricity and biofuels. This trend and consequent achievement is consistent with UNEP (1976) and

**Fig. 1** Trends in energy consumption, CO<sub>2</sub> emissions and economic variables in Swedish manufacturing industries, 1993–2008

Pardo Martinez's (2011) analysis in the context of manufacturing industries. However, it should also be pointed out that inefficiencies have been moved to the supply side. Although the total Swedish energy consumption has remained rather unchanged since 1970, the total supply increased by 1.43 % per year on average as a result of the increasing use of nuclear power in the Swedish energy matrix.

# Energy intensity and CO<sub>2</sub> emission intensity in Swedish manufacturing industries

Energy intensity and  $CO_2$  emission intensity are defined as the energy used or  $CO_2$  emissions generated per unit of economic production, respectively. In this study, the production value is used to measure economic production and analyse trends in Swedish manufacturing industries. Figure 3 shows trends in energy intensity and  $CO_2$  emission intensity. Both indicators display the same tendencies. Energy intensity and  $CO_2$  emission intensity and  $CO_2$  emission intensity and  $CO_2$  emission intensity. Both indicators display the same tendencies. Energy intensity and  $CO_2$  emission intensity have decreased by 46 and 41 %, respectively, in relation to production values. In fact, all Swedish manufacturing industries have presented a downtrend of these indicators in the period analysed, especially after 2000.

### **Results and discussion**

Results of the decomposition analysis

To estimate and analyse the trends in energy use and  $CO_2$  emissions in the Swedish manufacturing industries, we apply the multiplicative log-mean Divisia







method I, as explained in the "Methodology and data analyses". The results of the decomposition analysis are shown in Tables 1 and 2. Notice that a value of 1 indicates that the variable had no effect on the aggregate intensity, energy consumption or  $CO_2$  emissions. Values >1 indicate a contribution to greater aggregate intensity, energy consumption or  $CO_2$  emissions, whereas values lower than 1 imply an increase in energy efficiency and a decrease in  $CO_2$  emission intensity.

# Results for the decomposition of energy intensity

Table 1 shows the results for the decomposition of aggregate energy intensity, electricity intensity and fossil fuel intensity, with production value as the economic measure of output in the Swedish manufacturing industries. The aggregate of energy intensity in manufacturing industries decreased considerably during the sample period. Structural changes and energy intensity effects show similar trends, indicating that both contributed to lower the aggregate energy intensity in the economy. When it comes to structural changes, the energy-intensive sectors decreased production at an

average of 2 % during the sample period, whereas non-energy-intensive sectors increased production at an average of 6 %. Intensity effects dominated over structural effects, indicating that the decrease in aggregate energy intensity was primarily caused by a decrease in the intensity, which could be due to changes or improvements in technology.

# Results for the decomposition of energy consumption

The results of the energy consumption analysing the aggregate energy intensity and production effects for energy, electricity and fossil fuel consumption are shown in Table 1. In the Swedish manufacturing industries, growth in production did not lead to increases in the aggregate energy intensity, indicating that this sector produced more with less energy. This is a sign that improvements in technology and production standards actually took place, which led to higher productivity and lower energy use in manufacturing industries. This is certainly a positive result for Sweden and indicates the efficiency of Swedish energy policies in pursuing sustainable development according to national, regional and global agenda.





Table 1 Results of decomposition analyses for energy intensity and energy consumption in the Swedish manufacturing industries

	1993	1994	1995	1996	1997	1998	1999	2000	2001	2002	2003	2004	2005	2006	2007	2008
Energy																
$F_{\rm str}$	1	0.999	0.999	1.001	0.999	0.999	0.998	0.994	0.996	0.995	0.995	0.994	0.993	0.993	0.993	0.993
F <sub>int</sub>	1	0.993	0.989	0.990	0.986	0.978	0.981	0.980	0.975	0.977	0.977	0.973	0.971	0.966	0.966	0.962
F <sub>pdn</sub>	1	1.007	1.013	1.015	1.016	1.020	1.022	1.024	1.025	1.024	1.024	1.026	1.028	1.031	1.033	1.031
$E_{\text{consumption}}$	1	1.008	1.031	1.068	1.043	0.973	1.054	1.061	1.005	1.028	1.023	0.998	0.997	0.973	0.980	0.902
EI <sub>agg</sub>	1	0.902	0.849	0.874	0.805	0.714	0.737	0.688	0.653	0.664	0.654	0.608	0.585	0.543	0.529	0.497
Electricity																
$F_{\rm str}$	1	0.998	0.999	0.999	0.998	0.999	0.998	0.999	1.000	0.997	0.996	0.995	0.993	0.991	0.991	0.991
F <sub>int</sub>	1	0.993	0.987	0.987	0.988	0.986	0.984	0.980	0.981	0.977	0.975	0.971	0.969	0.974	0.972	0.971
F <sub>pdn</sub>	1	1.006	1.012	1.013	1.016	1.021	1.023	1.028	1.030	1.026	1.026	1.027	1.026	1.030	1.032	1.029
Ele <sub>consumption</sub>	1	0.991	0.997	1.018	1.060	1.107	1.119	1.128	1.173	1.055	1.028	0.989	0.936	1.068	1.072	1.010
EleIagg	1	0.887	0.821	0.833	0.819	0.812	0.783	0.731	0.762	0.682	0.657	0.602	0.549	0.595	0.578	0.556
Fossil fuels																
$F_{\rm str}$	1	0.999	0.999	1.000	0.998	0.999	0.996	0.995	0.997	0.996	0.995	0.994	0.993	0.994	0.993	0.994
F <sub>int</sub>	1	0.999	0.991	0.993	0.987	0.983	0.980	0.977	0.977	0.974	0.974	0.968	0.966	0.961	0.958	0.957
F <sub>pdn</sub>	1	1.007	1.012	1.013	1.016	1.020	1.020	1.025	1.026	1.026	1.025	1.026	1.028	1.032	1.034	1.032
FF <sub>consumption</sub>	1	1.088	1.060	1.100	1.040	1.043	0.997	1.027	1.051	0.998	1.001	0.921	0.907	0.887	0.870	0.828
FFI <sub>agg</sub>	1	0.974	0.873	0.900	0.804	0.765	0.698	0.666	0.683	0.645	0.640	0.561	0.532	0.494	0.469	0.456

 $F_{str}$  structural effect,  $F_{int}$  intensity effect,  $F_{pdn}$  production effects,  $EI_{agg}$  aggregate energy intensity,  $EleI_{agg}$  electricity intensity,  $FFI_{agg}$  fossil fuel intensity,  $E_{consumption}$  overall energy consumption,  $Ele_{consumption}$  electricity consumption,  $FF_{consumption}$  fossil fuel consumption

The results also demonstrate that the decrease in fossil fuel consumption has improved energy efficiency and reduced energy consumption. This has been partly achieved through fuel substitution and a change in the mixture of fuels from inefficient, dirty or fossil fuels with high carbon content, such as coal and petroleum products, towards more efficient, clean or non-fossil fuels with low carbon content, such as natural gas and biomass. In addition, there has been an ambitious attempt to address sustainable development in a context of improved energy security, technological deployment and restructuring of energy markets in Sweden (Silveira 2001). Certainly, achieving adequate fuel substitution to reduce  $CO_2$  emissions and

energy consumption, and economic growth at the same time, often requires shifts in relative economic conditions (fuel prices), technological innovation (with adequate competitiveness) and regulations to promote energy efficiency, clean production and markets for clean fuels (Hoeller and Wallin 1991; Steinbuks 2010; Pacini and Silveira 2010).

#### Results for the decomposition of the $CO_2$ emissions

Table 2 depicts the results of decomposition analysis using the  $CO_2$  emissions indicator. The results are similar to those obtained from the two previous methods, indicating the close relationship between the

Table 2 Results of decomposition analyses of  $CO_2$  emissions for the Swedish manufacturing industries

1993	1994	1995	1996	1997	1998	1999	2000	2001	2002	2003	2004	2005	2006	2007	2008
1	0.999	0.999	1.000	0.998	0.999	0.996	0.995	0.997	0.996	0.995	0.994	0.994	0.994	0.994	0.994
1	0.999	0.991	0.993	0.985	0.982	0.978	0.974	0.974	0.973	0.972	0.967	0.964	0.960	0.957	0.955
1	0.974	0.876	0.903	0.784	0.752	0.677	0.631	0.654	0.623	0.610	0.543	0.513	0.479	0.448	0.433
	1993 1 1 1	1993199410.99910.974	19931994199510.9990.99910.9990.99110.9740.876	1993         1994         1995         1996           1         0.999         0.999         1.000           1         0.999         0.991         0.993           1         0.974         0.876         0.903	1993         1994         1995         1996         1997           1         0.999         0.999         1.000         0.998           1         0.999         0.991         0.993         0.985           1         0.974         0.876         0.903         0.784	1993         1994         1995         1996         1997         1998           1         0.999         0.999         1.000         0.998         0.999           1         0.999         0.991         0.993         0.985         0.982           1         0.974         0.876         0.903         0.784         0.752	1993         1994         1995         1996         1997         1998         1999           1         0.999         0.999         1.000         0.998         0.999         0.996           1         0.999         0.991         0.993         0.985         0.982         0.978           1         0.974         0.876         0.903         0.784         0.752         0.677	1993         1994         1995         1996         1997         1998         1999         2000           1         0.999         0.999         1.000         0.998         0.999         0.996         0.995           1         0.999         0.991         0.993         0.985         0.982         0.978         0.974           1         0.974         0.876         0.903         0.784         0.752         0.677         0.631	1993         1994         1995         1996         1997         1998         1999         2000         2001           1         0.999         0.999         1.000         0.998         0.999         0.996         0.995         0.997           1         0.999         0.991         0.993         0.985         0.982         0.978         0.974         0.974           1         0.974         0.876         0.903         0.784         0.752         0.677         0.631         0.654	1993         1994         1995         1996         1997         1998         1999         2000         2001         2002           1         0.999         0.999         1.000         0.998         0.999         0.996         0.995         0.997         0.996           1         0.999         0.991         0.993         0.985         0.982         0.978         0.974         0.973           1         0.974         0.876         0.903         0.784         0.752         0.677         0.631         0.654         0.623	1993         1994         1995         1996         1997         1998         1999         2000         2001         2002         2003           1         0.999         0.999         1.000         0.998         0.999         0.996         0.995         0.997         0.996         0.995           1         0.999         0.991         0.993         0.985         0.982         0.978         0.974         0.973         0.972           1         0.974         0.876         0.903         0.784         0.752         0.677         0.631         0.654         0.623         0.610	1993         1994         1995         1996         1997         1998         1999         2000         2001         2002         2003         2004           1         0.999         0.999         1.000         0.998         0.999         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.997         0.997         0.996         0.997         0.997         0.997         0.997         0.972         0.967           1         0.974         0.876         0.903         0.784         0.752         0.677         0.63	1993         1994         1995         1996         1997         1998         1999         2000         2001         2002         2003         2004         2005           1         0.999         0.999         1.000         0.998         0.999         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.997         0.996         0.995         0.994         <	1993         1994         1995         1996         1997         1998         1999         2000         2001         2002         2003         2004         2005         2006           1         0.999         0.999         1.000         0.998         0.999         0.996         0.995         0.997         0.996         0.995         0.994 <t< th=""><th>1993       1994       1995       1996       1997       1998       1999       2000       2001       2002       2003       2004       2005       2006       2007         1       0.999       0.999       1.000       0.998       0.999       0.996       0.995       0.997       0.996       0.995       0.995       0.994       <td< th=""></td<></th></t<>	1993       1994       1995       1996       1997       1998       1999       2000       2001       2002       2003       2004       2005       2006       2007         1       0.999       0.999       1.000       0.998       0.999       0.996       0.995       0.997       0.996       0.995       0.995       0.994 <td< th=""></td<>

F<sub>str</sub> structural effect, F<sub>int</sub> intensity effect, COI<sub>agg</sub> aggregate CO<sub>2</sub> emission intensity

improvements in energy efficiency and the reduction of  $CO_2$  emission intensity in the Swedish case. Also, these results are consistent with several studies that have identified energy efficiency as the most costeffective way of improving energy use patterns and increasing both energy security and productivity whilst also achieving carbon emission reduction targets (Capros et al. 1998; Boyd and Pan 2000; UNF 2007).

The results of the decomposition analysis using this indicator show that the reduction in energy consumption has contributed to a lower aggregate  $CO_2$  intensity. Similarly, structural effect had a minor role in the reduction of  $CO_2$  emission intensity. These results highlight the fact that the Swedish manufacturing industry has increased its output whilst reducing energy consumption, maintaining its production structure and reducing the effects on climate change. Therefore, the results of the Swedish experience demonstrate that clean production paves the way to sustainable development.

#### Results of econometric model

Thus far, the results of the study show that the Swedish manufacturing industries have reduced their energy consumption by 1.5 % in a 16-year period (1993–2008) and that output growth has not required higher energy consumption. This led to a decrease in energy intensity and  $CO_2$  emission intensity. The trends of energy efficiency and  $CO_2$  emissions have been similar during the sample period. To understand the possible factors that have influenced these trends, we applied the production frontier model explained in "Econometric model", where energy intensity and  $CO_2$  emission intensity are the dependent variables and the production factors, kinds of fuels, investments, energy prices and taxes are the independent variables (see Tables 3 and 4).

# The energy intensity model

Table 3 shows the results of the stochastic frontier model for energy intensity. Capital and fossil fuel consumption have a significant positive influence on energy intensity, that is, in a context of increased amount of fixed assets and higher fossil fuel consumption, energy intensity increases. Electricity consumption, investments, total factor of productivity, energy prices, energy and  $CO_2$ taxes have a significant negative influence on energy intensity, indicating that increasing these variables serves as an incentive to lower energy intensity, thus leading to higher energy efficiency.

The results of the production factors indicate that Swedish manufacturing industries are more capitalintensive than labour-intensive, which demonstrates that the segment has developed and applied innovative technologies towards a greater level of automation. Changes from labour-intensive production to mediumand high-technology-intensive production can induce labour-saving technical progress and increased output. In fact, this has been observed in the context of mediumand high-technology industries in developed countries (Morrison and Siegel 2001; Yun 2008).

The results pertaining to the kinds of fuels demonstrate that increases in electricity consumption generate reduction in energy intensity, whereas decreases in fossil fuel consumption lead to higher energy efficiency in the Swedish manufacturing industries. The use of oil has decreased significantly in the last decades, in parallel with increased electricity consumption and achievements in energy efficiency. This inter-fuel substitution began with the oil price shocks of the 1970s, when governments and enterprises started searching for alternative fuels to reduce oil consumption and dependency. In 1970, the shares of oil and electricity consumption in Swedish industries were 48 and 21 %, respectively, whereas currently, the proportions are 12 and 36 %, respectively, indicating that oil has been replaced by other kinds of fuels such as electricity, gas, heat or biomass (Swedish Energy Agency 2009a).

The influence of investments on energy efficiency is positive, meaning that higher investments generate higher energy efficiency, or reduced energy intensity in the manufacturing industries. Currently, investments in energy efficiency and clean energy are triggered by regulatory requirements, on the one hand, and the need to increase productivity and reduce production costs, on the other hand (EPA 2007). The patterns of investments are, in fact, consistent with several programmes being implemented in Sweden to promote energy efficiency improvements. The Swedish long-term agreement programme for energy efficiency in energy-intensive industries (PFE), for example, includes standardised energy management systems, energy audits and identification of measures to reduce energy demand and intensity. It was launched in January 2005 and has become a successful voluntary programme. It has achieved an annual reduction of 2,909.33 TJ in energy use through the application of 872 measures and new investments

Parameter	[1]	Parameter	[1]		
Constant	-4.559 <sup>a</sup> (0.956)	Constant	5.858 <sup>a</sup> (0.232)		
Capital	$0.880^{\rm a}$ (0.022)	Total factor productivity	$-1.598^{a}$ (0.084)		
Labour	0.026 (0.045)	Energy prices	$-0.928^{a}$ (0.076)		
Electricity consumption	-0.338 <sup>a</sup> (0.130)	$CO_2$ tax	$-0.089^{a}(0.030)$		
Fossil fuels consumption	1.643 <sup>a</sup> (0.152)	Energy tax	$-0.340^{a}(0.032)$		
Investments	-0.173 <sup>b</sup> (0.088)				
$\sigma^2$	3.314	$\sigma^2$	4.021		
Г	0.929	Γ	0.942		
$\sigma_{\mu}^2$	3.079	$\sigma_{\mu}^2$	3.790		
$\sigma_{\rm v}^2$	0.234	$\sigma_{\rm v}^2$	0.230		
LogL	-288.72	LogL	-277.96		
No. Obs	336	No. Obs	329		

 Table 3 Stochastic frontier model for explaining energy efficiency in Swedish manufacturing industries (dependent variable: energy intensity)

The results in this table are estimated from Eq. 11. Values outside the parentheses are the estimated coefficients; values in parentheses are the standard errors. The negative sign before the coefficient reflects inverse influence; lack of the negative sign indicates direct influence

<sup>a</sup> Significant at the 1 % level

<sup>b</sup> Significant at the 10 % level

<sup>c</sup> Significant at the 5 % level

made by companies (Ottosson and Petersson 2007; Stenqvist et al. 2009).

In addition, the investments in the manufacturing industries have been motivated by several subsidies,

Table 4 Stochastic frontier model for explaining  $CO_2$  emission intensity in the Swedish manufacturing industries (dependent variable:  $CO_2$  emission intensity)

Parameter	[1]	Parameter	[1]
Constant	-0.685 (1.233)	Constant	10.49 <sup>a</sup> (0.405)
Capital	$0.876^{a}$ (0.023)	TFP	-1.601 <sup>a</sup> (0.086)
Labour	0.019 (0.045)	Energy prices	$-0.906^{a}(0.076)$
Electricity consumption	$-0.422^{a}$ (0.139)	Energy tax	$-0.082^{a}(0.033)$
Fossil fuels consumption	1.676 <sup>a</sup> (0.168)	CO <sub>2</sub> tax	$-0.350^{\mathrm{a}}(0.031)$
Investments	$-0.202^{\rm b}$ (0.089)		
$\sigma^2$	2.330	$\sigma^2$	3.261
Г	0.896	Γ	0.927
$\sigma_{\mu}^2$	2.089	$\sigma_{\mu}^2$	3.026
$\sigma_{\rm v}^2$	0.240	$\sigma_{\rm v}^2$	0.235
LogL	-289.08	LogL	-283.55
Obs.	336	Obs.	329

The results in this table are estimated from Eq. 12. Values outside the parentheses are the estimated coefficient; values in parentheses are the standard errors. The negative sign before the coefficient reflects inverse influence; lack of the negative sign indicates direct influence

<sup>a</sup> Significant at the 1 % level

<sup>b</sup> Significant at the 5 % level

<sup>c</sup> Significant at the 10 % level

which have included payments from the Swedish government to producers aimed at shifting the kinds of fuels and improving energy use patterns. Figure 4 shows the trend in these subsidies between 2000 and 2008 and the relationship between subsidies, energy intensity and energy consumption in the Swedish manufacturing industry. As shown here, there is close relationship between investments on technology and the improvements achieved in energy use patterns. A joint effort of the stakeholders, especially in the industrial sector and the government, has led to reduced energy consumption and increased energy efficiency through the application of adequate top-down and bottom-up instruments with a sustainable development approach.

Energy prices have a significant negative coefficient, indicating that higher energy prices promote energy efficiency and conservation. These results are consistent with energy price trends in Sweden where oil prices increased by 70 % on average between 2000 and 2008, and electricity prices for the industrial sector almost doubled during the same period (Swedish Energy Agency 2010). This strategy has apparently worked to promote energy efficiency. However, increases in energy prices are not sufficient to achieve energy efficiency. Therefore, it is important to simultaneously create policies to encourage industries to invest in energy efficiency technologies and incentive good practices in energy use so that they can save energy and reduce energy costs and environmental impacts whilst maintaining competitiveness (SME 2009; Henning and Trygg 2008; Johansson et al. 2007; Thollander et al. 2005, 2007).

Another factor analysed here was the energy and CO<sub>2</sub> taxes, which have had a significant impact on energy intensity, demonstrated by substantial improvements in energy efficiency. Energy taxes have been used in Sweden both as a fiscal tax source and as a policy instrument to motivate and strengthen energy-saving actions. Taxes are also designed to favour low-carbon fuels.<sup>7</sup> These taxes have been integrated with a variety of instruments and mechanisms not only to ensure their effectiveness as energy and climate policy but also to maintain the competitiveness of the Swedish

manufacturing industries. A permanent dialogue among all stakeholders has generated higher applicability and effectiveness of the measures for society (Fouquet and Johansson 2008; Price et al. 2008; Ptak 2010).

### The CO<sub>2</sub> emission intensity model

The results of the CO<sub>2</sub> emission intensity study using the stochastic frontier model are shown in Table 4. The results are similar with respect to the previous model, which again demonstrates the close relationship between improvements in energy efficiency and the reduction of CO<sub>2</sub> emission intensity. Labour, capital and fossil fuel consumption have a positive influence, and capital and fossil fuel consumption are significant on CO<sub>2</sub> emission intensity, indicating that increasing these variables leads to a higher CO2 emission intensity. On the other hand, electricity consumption, investments, total factor of productivity, energy prices, energy taxes and CO<sub>2</sub> taxes have a significant negative effect on CO<sub>2</sub> emission intensity, indicating that increasing these variables leads to a lower CO<sub>2</sub> emission intensity.

Capital and labour have a positive relationship with  $CO_2$  emission intensity, but only capital is significant, indicating that the most capital-intensive sectors are also the most  $CO_2$ -intensive. These results concur with theory. More capital-intensive economies should be less energy- and carbon-intensive due to substitution between capital and energy (Koetse et al. 2008; Stern 2010).

The results of the kinds of fuels show that increases in electrical consumption and a decrease in fossil fuel consumption have led to a lower CO<sub>2</sub> emission intensity. These results are consistent with increases in the consumption of renewable energy sources. However, Sweden has also made major investments and additions of power capacity from nuclear power, which largely explains why the rapid increase in electricity demand could take place without major increases in CO<sub>2</sub> emissions. Whilst the results are consistent with long-term energy policies that prioritize low-carbon alternatives, the nuclear path is still a debatable question in Sweden and elsewhere when it comes to long-term sustainability (IEA 2008a, b; Swedish Energy Agency 2009b; IAEA 2009; Wolde-Rufael and Menyah 2010; WNA 2011).

Investments in Swedish manufacturing industries show that higher investments lead to lower  $CO_2$ 

<sup>&</sup>lt;sup>7</sup> According to the Swedish Ministry of the Environment, the total revenue from environment-related taxes and fees amounted to roughly 7 billion euros per year, with higher taxes on non-eco-friendly consumption, primarily energy and carbon dioxide (www.sweden.gov.se/sb/d/5400/a/43594).



Source: Environmental Accounts at Statistic Sweden. Data is available from 2000.

Fig. 4 Energy-related subsidies and changes in energy consumption and energy efficiency in the Swedish manufacturing industry, 2000–2008

emission intensity. Several programmes have motivated environmental investment in manufacturing industries, especially in energy-intensive industries. Among these programmes, we can mention the Climate Investment Programmes (Klimp<sup>8</sup>) and the voluntary programme for energy efficiency in energy-intensive industries (Swedish Energy Agency 2009a). Furthermore, the Swedish government has offered increasing emission reduction subsidies (see Fig. 5). As a result of these efforts, investments in clean technologies have grown significantly, mainly in renewable electricity production, biofuels and techniques for increasing energy efficiency (Swedish Energy Agency 2009b). CO<sub>2</sub> emissions and CO<sub>2</sub> emission intensity have, in fact, decreased (see Fig. 5). This also demonstrates that an adequate energy and climate change policy requires both government support and the industrial sector to improve environmental performance and reduce carbon emissions, in line with increased productivity and economic growth.

Energy prices also have contributed to the reduced  $CO_2$  emission intensity in Sweden, suggesting that with high energy and carbon prices,  $CO_2$  emission intensity tends to fall. The trends in  $CO_2$  emissions are sensitive to the relative prices of energy. This means that when energy prices fall, the  $CO_2$  emission

intensity tends to increase because there is less incentive to improve or invest in energy savings or lowcarbon emission technologies and innovations (Bowen et al. 2009). For this reason, it is important to adopt an adequate energy price policy that encourages lower energy consumption and the use of clean and lowcarbon technologies.

The application of energy and  $CO_2$  taxes has been effective at reducing  $CO_2$  emission intensity; according to empirical results, these two variables are statistically significant, leading to positive environmental effects. This demonstrates that higher energy taxation reduces  $CO_2$  emissions, improves efficient energy use, promotes renewable energy production and use, and provides incentives for sustainable development.

### Conclusions

The results of the decomposition analysis showed a decrease in the aggregate energy intensity and the aggregate  $CO_2$  emission intensity, which was caused by a decrease of energy intensity and fuel substitution, whereas the role of structural changes has been minor. Moreover, the growth in production did not lead to increases in the aggregate energy intensity and  $CO_2$  emission intensity, indicating that this sector produced more with less energy consumption and fewer emissions.

The results of the stochastic frontier model for energy efficiency and  $CO_2$  emission intensity indicate

<sup>&</sup>lt;sup>8</sup> For more details, see http://www.naturvardsverket.se/en/In-English/Start/Legislation-and-other-policy-instruments/Economicinstruments/Investment-Programmes/Climate-Investment-Programmes-Klimp/.

**Fig. 5** Trends of emissionreduction subsidies, CO<sub>2</sub> emissions and CO<sub>2</sub> emission intensity in Swedish manufacturing industries



that capital and fossil fuel consumption influence energy and CO2 emission intensities. Thus, the most capital-intensive sectors are also the most energyand CO<sub>2</sub>-intensive. Higher fossil fuel consumption leads to increases in energy and CO2 emission intensities. Electricity consumption, investments, total factor of productivity, energy prices, and energy and CO<sub>2</sub> taxes have a significant and negative influence on energy and CO<sub>2</sub> emission intensities, implying that increasing these variables leads to lower energy intensity and higher energy efficiency. This phenomenon indicates that increased energy efficiency and decreased CO<sub>2</sub> emission intensity can be achieved through changes in economic conditions (energy prices and taxes), incentives for investments in clean or low-carbon technologies and adequate energy policy instruments. However, despite important achievements in energy use and emission reductions in Swedish manufacturing industries, it is now important to also encourage energy efficiency in other industries, particularly the rapidly growing sectors in which energy consumption is increasing and could result in higher CO<sub>2</sub> emissions in the medium and long terms. Future studies could also examine trends in energy and CO2 emissions in specific sectors and use physical indicator to determine how economic shocks and other factors influence the results of energy efficiency and decrease of CO<sub>2</sub> emissions.

The Swedish experience offers relevant information for the formulation, development and strengthening of energy policies in manufacturing industries elsewhere. As shown, economic instruments (e.g. energy prices and energy taxes) and technical instruments have driven fuel substitution, investments in clean technologies and, consequently, substantial improvements in energy efficiency and reduction in  $CO_2$  emissions. These results demonstrate that it is possible to achieve economic growth and sustainable development through steady advancement towards a low-carbon economy.

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# Appendix. List of Swedish manufacturing industries at the two-digit level

In this study, the following sectors were used based on Statistics Sweden (Swedish Environmental Accounts and Statistical database):

15-16 Manufacture of food products, beverages and tobacco

17 Manufacture of textiles

18 Manufacture of wearing apparel

19 Tanning and dressing of leather

20 Manufacture of wood and wood products

21 Manufacture of paper and paper products

22 Publishing and printing

23 Manufacture of coke, refined petroleum products and nuclear fuel

24 Manufacture of chemicals and chemical products

25 Manufacture of rubber and plastics products

26 Manufacture of non-metallic mineral products

27 Manufacture of basic metals

28 Manufacture of fabricated metal products

29 Manufacture of machinery and equipment

30 Manufacture of office machinery and computers

31 Manufacture of electrical machinery and apparatus

32 Manufacture of radio, television and communication equipment 33 Manufacture of medical and optical instruments, watches and clocks

34 Manufacture of motor vehicles, trailers and semi-trailers

35 Manufacture of other transport equipment

36 Manufacture of furniture and other manufacturing

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