

Environmental Kuznets Curve in Croatia: panel data approach with Croatian counties

Kuznetsova krivulja okoliša u Hrvatskoj: pristup analize panel podataka nad hrvatskim županijama

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ABSTRACT

Concept of sustainable development (SD) has been in the focus of researchers and policy makers in the last two decades. SD is closely linked to the preservation of environment. This paper focuses on finding Environmental Kuznets Curve (EKC) relationship between economic development and pollution in Croatia. In order to empirically evaluate existence of this curve, data on 21 counties for different pollutants and income per capita has been obtained for the period 2008-2016. Different specifications of the relationship are observed: linear, quadratic and cubic, with addition of examining whether the Croatia's accession to the EU has made a significant impact on lowering pollution. Moreover, variables in levels and differences have been analyzed in models. Results show that no EKC relationship is found for all pollutants (CO, CO₂, NO₂, SO₂ and PM₁₀) and that entering EU had a positive impact on diminishing pollution in Croatia.

Keywords: air pollution, Croatian counties, Kuznets curve, panel data

SAŽETAK

Koncept održivog razvoja je u fokusu istraživača i nositelja ekonomskih politika posljednja dva desetljeća. Održivi razvoj je povezan s očuvanjem okoliša. Ovo istraživanje se usmjerava na pronalazak Kuznetsove krivulje okoliša (EKC, engl. *Environmental Kuznets Curve*) između ekonomskog razvoja i zagađenja u Hrvatskoj. Kako bi se empirijski procijenila krivulja, podaci o 21 županiji za različite vrste zagađenja su prikupljeni za razdoblje od 2008. do 2016. godine. Različite specifikacije povezanosti se razmatraju: linearna, kvadratna i kubna, uz dodatno razmatranje je li ulazak Hrvatske u Europsku Uniju imao značajan pozitivan učinak na smanjenje zagađenja. Dodatno, u modelima su analizirane varijable u razinama te u prvim diferencijama. Rezultati analize ukazuju da ne postoji EKC povezanost za sve razmatrane oblike zagađenja (CO, CO₂, NO₂, SO₂ i PM₁₀) te da je ulazak Hrvatske u EU imao pozitivan učinak na smanjenje emisija zagađenja u Hrvatskoj.

Ključne riječi: hrvatske županije, Kuznetsova krivulja, panel podaci, zagađenje zraka

INTRODUCTION

With the strongest globalization today and the industry which draws energy resources significantly, there has been an ongoing debate on the concept of sustainable development in the last couple of decades. Sustainable development is defined as rational usage of all resources which does not diminish total wealth of a country for future generations (Pezzey, 1989; Barbier et al., 1990). Since the beginning of 1990s, there has been a rise of research which finds empirical evidence on economic development having a positive effect on environment protection in the long run. A relationship has been discovered between economic development and environment pollution, known under the name Environmental Kuznets Curve, EKC (Kuznets, 1955). Selden and Song (1994) were the first ones to coin the term EKC. The original Kuznets curve observed the relationship between economic development and inequality. The EKC regarding the environment looks at the relationship between development and pollution in a similar way. As an economy is developing over time, environment pollution is getting bigger. However, after the economy reaches certain level of wealth (income) per capita, the pollution gets smaller. Thus, sustainable development should not present a problem after the economy reaches certain level of income. Of course, pollution reduction is not a spontaneous consequence of the development (see Arrow et al., 1995; Grossman and Krueger, 1996). It is a consequence of conscientious measures of economic policies and a higher awareness level of citizens in the country. As country becomes more industrialized over time, the pollution gets higher because environment is not in primary focus at that point. Moreover, as the country gets more developed, leading sectors of the economy become more "clean", regulation of pollution is introduced and people become more environmentally aware. Over the years, there has been a rise in research which tries to examine the EKC relationship both for developed and developing countries. Based upon the experience of developed countries, trends for developing ones are being forecasted in order to overcome some problems developing countries are

facing today. Some of the explanations for the existence of the EKC relationship are the following ones. Costantini and Martini (2006) make distinction between supply side and demand side explanations. Demand side explanations consist of reasoning: when income rises, people are more willing to pay a higher living standard. Thus, from a certain level of income per capita, people are willing to pay more for clean environment compared to the rate of their income growth (clean environment is considered as a luxury good). Supply side is explained in Grossman and Krueger (1995), based upon scale economics and technology effects.

The focus on the relationship between the economic development and pollution has been more profound from the beginning of 1990s. Since economic development affects the pollution level and its changes over time, the EKC curve is being tested more often, by more sophisticated methods and datasets. Moreover, sustainable development should not present a problem in an economy when it reaches a certain level of development, it is important to obtain information on the relationship between those two variables and to implement better economic policies to achieve best results. By analysing previous research, a scarcity of papers which deal with transition countries such as Croatia can be found. Croatia, as other CEE (Central and Eastern European) countries, has gone through dramatic economic, political and social changes in the late 1980s and early 1990s. Those changes could have made consequences on the environment, among other factors. In the last 20 years, liberalization of the market and the whole economy, transformation of the economy and other related issues with opening the once socialistic economy has been prolonged. This also had significant effects on different aspects of the economies, including Croatia. Moreover, Croatia faced many structural and legislation changes due to its accession to the European Union, whose member it became in 2013. Some of the most prominent consequences were the increase of the total wealth and income in the economy, structural changes and relationship towards the environment, especially towards sustainable development. Thus, the purpose of

this study is to examine the effects of economic changes in Croatia on environment, by examining existence of the EKC relationship. Previous research which has included Croatia, observed other countries as well (by looking at several CEE countries at once). In that way, panel data was observed and general conclusions were made for a group of countries as a whole. Only two papers until now exist which focuses solely on Croatia, where authors examine only CO₂ emissions on a time series basis. This paper extends the existing research on other pollutants as well and uses data on 21 Croatian counties in order to obtain more insights into the EKC relationship. Consequently, a more detailed discussion on EKC relationship, as well as consequences on economic policy making can be made. Thus, the novelty of this research can be found in analysing the panel data set of Croatian counties for major pollutants (CO₂, CO, PM₁₀, NO₂ and SO₂) for the period 2008-2016 for the first time in the literature so better insights into the EKC relationship could be obtained. There are several reasons on why this research focuses on 5 different pollutants and the county level of analysis. Firstly, there are some regional differences between the level of pollution of different pollutants, due to county being mostly focused on e.g. industry or it being a tourist attraction. In that way, different levels of pollutants can be found by comparing the counties over time. Next, by observing the panel data approach, by combining the spatial and time aspect of the analysis, more data gets available for the analysis (statistical reasoning). Moreover, the panel approach enables obtaining specific county effects due to differences between them on the economic basis, population density, air pollution levels (e.g. countries with refineries compared to those which do not have heavy industry). Since some of the counties heavily rely on manufacturing and pharmaceuticals (Koprivnica-Križevci county), some have problems with development after the War of Croatian independence (Vukovar-Srijem county), others heavily rely on tourism as main income generator (e.g. Dubrovnik-Neretva county with more than 60% of total income from tourism; Croatian Chamber of Economy, HGK, 2016). HGK (2016) adds that there are great differences in economic

strength between the counties, such as Virovitica-Podravina county and Požega-Slavonija county with the Index of economic strength being on 2/3 of the level of the Croatian average, compared to Grad Zagreb which is 49% above the Croatian average.

The rest of the paper is structured as follows. Second section gives an overview of newer relevant literature which examines the EKC relationship for different countries. Third section describes the methodology used in the study and the fourth section gives results from the empirical analysis. The final, fifth section concludes the paper.

Previous research

Since research on exploring EKC relationship is rapidly growing over the past couple of decades, this section focuses on initial papers which have started the debate, as well as most recent ones which explore countries similar to Croatia. Formal name of EKC curve is derived after S. Kuznets and his famous hypothesis of an inverted U-shape of the curve describing the relationship between income and inequality (Kuznets 1955). Popularization of the relationship between income and pollution has begun with seminal work of Grossman and Krueger (1991), Shafik and Bandyopadhyay (1992) and Panayotou (1993). Grossman and Krueger (1991) was the first empirical study on EKC relationship, where authors observed NAFTA countries. Shafik and Bandyopadhyay (1992) research results had a great impact in literature, due to their results being published in the World Development Report (IBRD 1992). However, lot of research has appeared which looks at the methodological part critically (see, for example, Arrow et al., 1995; Stern et al., 1996).

A summary of relevant research is shown in Tables 1-5, where time span, observed units and pollutants, as well as the main results with some remarks are shown. Table 1 displays the initial relevant research of EKC, which has started the empirical evaluation of the curve. Research in Table 1 mostly focuses on obtaining data from a lot of countries over the world in order to include both developed countries and those which are developing. Papers utilize

panel data regression from a methodological standpoint, without testing for causality between observed variables. Thus, majority of the research from this era usually finds the inverted U shape which EKC assumes. Furthermore, these early papers do not test for unit roots in the panel data, due to majority unit root tests being developed almost 20 years after these papers have been published. So, a possibility of some spurious results is present. Table 2 depicts the main results for developed countries in order to get some insights into what happens in the long run when a country's economy becomes stronger. In that way, policy makers in Croatia can observe positive practices. Again, panel data techniques are the most commonly used ones, due to having more data based upon cross section and time series standpoints. The inverted U shape is most common conclusion here as well. For Croatia, this could potentially be important for the empirical results in this research. Namely, if a positive relationship is found between the income and pollution emissions, this could mean that Croatia is still in the upward phase of the inverted U shape curve. Moreover, due to this country being relatively young with small number of data available, if a relationship is found, it could be a positive one as stated, due to this country being in the phase of restructuring and development.

Table 3 extracts only CO₂ pollution, since it is a main contributor to global warming and accounts for 80% of all EU greenhouse gas emissions (European Commission, 2018). Majority of existing research focuses either solely on CO₂ or includes this pollutant in the analysis with other ones. Here, authors focus more on different methodologies, such as observing only time series if possible, authors include Granger causality testing due to implementing assumptions that not only does the income affect the pollution level, but a feedback relationship could be found. This conclusion is what some authors end up with. Thus, it is important to include the fact that changes in pollution levels affect the rest of the economy, either throughout investments or national projects, etc.

Next, Table 4 presents results of various other pollutants and the EKC relationship existence for

various countries, since this study observes pollutants as well. Results in this table reveal that when analysis includes different stages of economic growth (country or city level), the inverted U shape of the EKC is found. This means that if the analysis includes different stages of economic development, either by focusing on one country or on a panel dataset, the long-term relationship described in theory could be found. Moreover, when the short and long terms are both included in the analysis, the results sometimes conclude that there is no short-term relationship (in both ways) between the GDP and pollution. Thus, the result in this study could be expected to go in that direction as well.

Analysis of previous studies resulted with couple of conclusions. Majority of authors focus on static panel models, by using fixed effects model. There is less research which uses dynamic models by adding lagged value of the pollutant variable in the model, which has both economic and econometric meaning. Economic interpretation is in Agravas and Chapman (1999) and Auffhammer et al. (2001), where authors claim that income does not have instantaneous effects on pollution. It has rather lagged effects. Econometric meaning of including lagged values of the dependent variable as independent one is due to existence of autocorrelation in the model. Moreover, some of the studies do not test for stationarity of variables when using static or dynamic regression models, which could lead to spurious regression problems. Stern (2004) has already warned about this problem in such studies.

Some papers extend the initial model by adding variables which can explain the specific reasons for pollution in some countries. For example, studies of countries in development add variables such as access to drinking water, phone lines supply and other basic measures of development. Countries in transition are observed by adding liberalization effects and other measures which those countries had to implement (see Archibald et al., 2009). Different structures of the economy can contribute to the pollution as well. That is why some research depicts the total economy into different sectors and observes effects of income from different sectors

to the pollution. By observing the EKC curve proof in real data, conclusions are often contradictory. Some authors find the typical EKC curve, whilst others find other functional relationship forms between income and pollution: linear, cubic and others (please see Tables 1 to 5). Linear relationship is contradictory to the explanations of sustainable development. Cubic relationship means that two income levels are important. First level is explained as the level in the quadratic relationship (typical EKC curve), while the second level of income is when pollution starts to increase again.

Finally, it can be seen in Table 5 how scarce research on Croatia is. There exist only several recent papers (to author's knowledge) which analyze EKC relationship, but only for carbon dioxide emissions. Previous research regarding Croatia is very scarce. Only several papers were found at this point which concern Croatia. First research was that of Panayotou (1993) where Croatia was included as part of Yugoslavia. Second research was of Mor and Jindal (2012), where Croatia was included in the panel data set. Authors observed CO₂ pollution only, for the period from 1997 to 2008 and the results showed that there is a U shaped relationship between pollution and income, including Croatia. This meant that no EKC relationship was confirmed in the observed period. Jošić, Jošić and Janečić (2016) is one of the two detailed research which observed only Croatia. Authors observe only CO₂ emissions by employing linear regression for the period 1990-2013. They found very weak linear relationship in short-term between the observed variables. When authors included population density and openness of the economy, the variables were not statistically significant. Since no EKC relationship was found, authors explained it with overextended process of consumption of all sectors in the economy and not industrial production. Other research which focused on Croatia was Ahmad et al. (2017). Authors focused on quarterly based data on CO₂ emissions, and observed both the short and long term in the analysis. Only GDP and emissions were included as variables of interested, with bidirectional relationship found in the short run and GDP to pollution in the long run. Thus, the results could indicate some spurious

conclusions due to not including other relevant factors in the model (i.e. control variables).

Thus, this study is going to observe other pollutants as well because there is no study existing on effects of development on them. Moreover, by observing Croatian counties by employing panel data, more data is available in order to empirically evaluate EKC relationship in Croatia.

MATERIALS AND METHODS

Since the empirical part of the research deals with panel data (cross sectional with time series combined), this research opted to utilize panel regression. Panel data methodology is widely known in literature, thus this section gives a brief overview of basics by following Greene (2003) and Wooldridge (2002). A basic static panel model is the pooled model denoted as:

$$y_{it} = \alpha + \sum_{k=1}^K \beta_k x_{itk} + \varepsilon_{it}, \quad i \in \{1, 2, \dots, N\}, t \in \{1, 2, \dots, T\}, \quad (1)$$

where N denotes number of observed units, T number of time periods, y_{it} value of dependent variable of i -th observed unit in period t , α is the constant equal for each observed unit and it does not change in time, x_{ijk} is the value of k -th independent variable of i -th observed unit in time t , β_k is the value of k -th parameter and ε_{it} is error term of i -th observed unit in time t . Assumptions of the pooled models are:

$$\varepsilon_{it} \sim i. i. d. (0, \sigma_\varepsilon^2) \text{ and } \text{cov}(x_{itk}, \varepsilon_{it}) = 0, \forall i, t, k \quad (2)$$

i.e. all error terms are independently and identically distributed across all observed units and time periods, with expected value 0 and constant variance, with all variables x_{itk} non-dependent on error terms.

Since pooled model is used when all of the observed units are randomly selected in every time period t , it is useful to use for random samples. Thus, more commonly, models with fixed or random effects are used. The double fixed effects model is the following one:

$$y_{it} = \alpha_i + \lambda_t + \sum_{k=1}^K \beta_k x_{itk} + \varepsilon_{it}, \quad i \in \{1, 2, \dots, N\}, t \in \{1, 2, \dots, T\}, \quad (3)$$

in which the constant changes for each observed unit (α_i) and time period (λ_t). Model (3) could include only unit effects or time effects, depending upon the assumptions

Table 1. Results from initial research on environmental Kuznets curve

| Authors | Observed units | Period | Emissions | Econometric methodology | Variables used in the study | EKC hypothesis | Causality |
|---------------------------------|--|------------------|---|-------------------------|---|--|------------------|
| Grossman and Kruger (1991) | 52 cities over the world | 1977, 1982, 1988 | SO ₂ , dark matter and SPM | Panel regression | Location dummies, population density, trend variable. Emission variables in levels. Income variable adjusted for PPP. | Inverted U shape (EKC confirmed). | GDP to pollution |
| Shafik and Bandyopadhyay (1992) | 47 cities over the world | 1972-1988 | 10 pollutants | Panel regression | Location dummies, trend variable. Income variable adjusted for PPP. | Only two air pollutants have inverted U shape (EKC confirmed), for others no relationship was found or negative linear relationship. | GDP to pollution |
| Panayotou (1993) | 55 developed and developing countries | 1987-1988 | SO ₂ , SPM, NO ₂ | Panel regression | Rate of deforestation, population density. Variables expressed per capita. Croatia included in Yugoslavia. | Inverted U shape (EKC confirmed). | GDP to pollution |
| Selden and Song (1994) | 22 OECD countries and 8 developing countries | 1979-1987 | CO, NO _x , SO ₂ , SPM | Panel regression | GDP and pollutants | Linear positive relationship for CO; inverted U shape for NO and SO ₂ (EKC confirmed). | GDP to pollution |

CO₂ - carbon dioxide, CO - carbon monoxide, SO₂ - sulphur dioxide, (S)PM₁₀ - (suspended) particulate matter micrograms, NO_x - nitrogen oxide emission.

Table 2. Results from research on environmental Kuznets curve, developed countries

| Authors | Observed units | Period | Emissions | Econometric methodology | Variables used in the study | EKC hypothesis | Causality |
|---------------------------------|-------------------|------------------|---|------------------------------|--|--|------------------|
| Cole et al. (1997) | 11 OECD countries | 1970-1992 | CO ₂ , NO _x , SO ₂ , water pollution | Panel regression | Country dummies, technology level | Inverted U shape (EKC confirmed) for all pollutants except water | GDP to pollution |
| List and Gallet (1999) | USA states | 1929-1994 | SO ₂ , NO | Panel regression | Population density, high school graduates, median age Variables expressed per capita. | Inverted U shape (EKC confirmed) | GDP to pollution |
| Roca et al. (2001) | Spain | 1973 (1980)-1996 | CO ₂ , CH ₄ , N ₂ O, SO ₂ , NO _x , NMVOC | OLS time series | Variables expressed per capita. Nuclear energy and coal consumption added | Inverted U shape (EKC confirmed) only for SO ₂ , positive linear relationship for others. | GDP to pollution |
| Xuemei (2005) | 24 OECD countries | 1975-1990 | CO ₂ | Simultaneous equation system | Population, technology proxy, capital added | Inverse EKC, contrary to many previous results (due to methodology). | Bidirectional |
| Dijkgraaf and Vollebergh (2005) | 24 OECD countries | 1960-1997 | CO ₂ | Panel regression | Population, energy consumption. Variables expressed per capita | EKC exists when only using panel data | GDP to pollution |

CO₂ - carbon dioxide, SO₂ - sulphur dioxide, NO_x - nitrogen oxide emission, CH₄ - methane, N₂O - nitrous oxide, NMVOC - non-methanic volatile organic compounds.

Table 3. Results from research on environmental Kuznets curve, CO₂ pollutant

| Authors | Observed units | Period | Emissions | Econometric methodology | Variables used in the study | EKC hypothesis | Causality |
|---------------------------|--|-------------|-----------------|--|---|---|--|
| Dinda and Coondoo (2006) | 88 countries, developing and developed ones | 1960 - 1990 | CO ₂ | Error correction model Granger causality tests | CO ₂ emissions and GDP per capita | Quadratic and cubic forms of EKC found. | Bidirectional relationship |
| Galeotti and Lanza (2005) | 108 countries Subsamples of OCED and non-OECD countries observed. | 1971-1995 | CO ₂ | Panel regression Gamma and Weibull distributions for better approximations. | CO ₂ emissions and GDP per capita | Inverted U shape (EKC confirmed). | GDP to pollution |
| Coondoo and Dinda (2002) | 100 countries | 1950-1992 | CO ₂ | Granger's causality test. | CO ₂ emissions and GDP per capita | Linear relationship | Developed countries: emissions cause GDP, Developing countries: bi-directional causation. |
| Niu et al. (2011) | 7 Asian countries and Australia | 1960-2003 | CO ₂ | Panel regression | Different energy consumption sectors used in order to find which one contributes to EKC relationship. GDP per capita and CO ₂ emissions. | Long-term relationship exists, but opposite results for developed and developing countries. | Causality from energy consumption to pollution. |
| Iwata et al. (2011) | 31 countries | 1960-2003 | CO ₂ | Panel regression (pooled mean group) | Nuclear energy consumption added into analysis | Linear positive relationship | GDP to pollution |

CO₂ - carbon dioxide.

Table 4. Results from research on environmental Kuznets curve, recent research

| Authors | Observed units | Period | Emissions | Econometric methodology | Variables used in the study | EKC hypothesis | Causality |
|----------------------------------|---------------------------------|--------------------------------------|--|---|---|--|---|
| Song et al. (2008) | 29 Chinese provinces | 1985-2005 | Waste gas | Panel cointegration | Waste gas, waste water solid waste pollution and GDP per capita | There exists long-run cointegrating relationship; inverse U shape for all pollutants (EKC confirmed) | GDP to pollution |
| Piłatowska and Włodarczyk (2017) | 10 CEE countries | 1995-2012 | CO ₂ | Threshold ECM model, momentum ECM model | Energy consumption and trend added in analysis | Inverted U shape for some countries | No short-term causal relationships for Estonia, Romania and Slovenia. GDP to pollution in long run for Romania and Estonia. Bidirectional long run causality for Estonia and Slovenia |
| Akbostanci et al. (2009) | Turkey and 58 Turkish provinces | 1968-2003 (provinces data 1992-2001) | CO ₂ , SO ₂ and PM10 | Regression and panel regression | Examination both of time series and panel data. Variables expressed per capita. | Cubic relationship for SO ₂ and PM10, no EKC for CO ₂ | GDP to pollution |
| Liddle (2015) | 84 cities over world | 1995 | CO, NO _x , VHC | Cross section regression | GDP per capita, pollutants; urban density and fuel prices included as well | Inverted U shape (EKC confirmed) | GDP to pollution |

CO₂ - carbon dioxide, CO - carbon monoxide, SO₂ - sulphur dioxide, NO_x - nitrogen oxide emission, VHC - volatile hydrocarbons, SO_x - sulphur oxide, ECM - Error correction model.

Table 5. Results from research on environmental Kuznets curve, Croatia included

| Authors | Observed units | Period | Emissions | Econometric methodology | Variables used in the study | EKC hypothesis | Causality |
|-------------------------|--|---------------|-----------------|-----------------------------|--|---|---|
| Mor and Jindal (2012) | 39 countries, Croatia included | 1997-2008 | CO ₂ | Panel data regression | Variables expressed per capita | U shape and opposite N shape for majority countries, Croatia as well | GDP to pollution |
| Kasman and Duman (2015) | New EU members and candidate countries | 1992-2010 | CO ₂ | Panel data regression | GDP, pollution, openness of a country, urbanization | Inverted U-shape | Unidirectional casualty from energy, openness and urbanization to emissions in short and long term. |
| Jošić et al. (2016) | Croatia, aggregate data | 1990-2013 | CO ₂ | Johansen cointegration test | Trade openness, population density. Variables expressed per capita. | Positive linear relationship in short term. No cointegration was found. | GDP to pollution, only short term. |
| Ahmad et al. (2017) | Croatia, aggregate data | 1992Q1-2011Q1 | CO ₂ | ARDL VECM DOLS | GDP | Inverted U-shape | Bidirectional in short run; GDP to CO ₂ in long run |
| Allard et al. (2017) | 74 countries, Croatia included | 1994-2012 | CO ₂ | Quantile panel regression | GDP, renewable energy consumption, technological development, trade, and institutional quality | N shaped curve | GDP to pollution |

CO₂ - carbon dioxide, ARDL - Autoregressive Distributed Lag, VECM - Vector error correction model, DOLS - dynamic ordinary least squares

of the researcher or the statistical characteristics of the model.

(Double) random effects model assumes the following:

$$y_{it} = \alpha + \sum_{k=1}^K \beta_k x_{itk} + \lambda_t + e_i + \varepsilon_{it}, \quad i \in \{1, 2, \dots, N\}, t \in \{1, 2, \dots, T\}, \quad (4)$$

where observed units are collected randomly and each random effects could change for each unit (e_i) or time (λ_t). Again, one can assume only unit or time random effects. Assumptions of the model are the following ones:

$$\begin{aligned} e_i &\sim i.i.d. (0, \sigma_e^2), \quad \varepsilon_{it} \sim i.i.d. (0, \sigma_\varepsilon^2), \\ \text{cov}(e_i, x_{itk}) &= 0, \quad k \in \{1, 2, \dots, K\}, t \in \{1, 2, \dots, T\}, \\ \text{cov}(e_i, \varepsilon_{it}) &= 0, \quad t \in \{1, 2, \dots, T\}. \end{aligned} \quad (5)$$

In order to choose an adequate model, F -test is used to compare fixed effects model to the pooled regression, by assuming that in model (3) the values of unit constants are as follows:

$$\begin{aligned} H_0: \alpha_1 &= \alpha_2 = \dots = \alpha_N = \alpha \\ H_1: \exists \alpha_i &\neq \alpha, i \in \{1, 2, \dots, N\}, \end{aligned} \quad (6)$$

or assuming the time constants in hypotheses:

$$\begin{aligned} H_0: \lambda_1 &= \lambda_2 = \dots = \lambda_T = \lambda \\ H_1: \exists \lambda_t &\neq \lambda, t \in \{1, 2, \dots, T\}, \end{aligned} \quad (7)$$

or a test combining both unit and time in-variation.

Hausman test is used in order to compare estimations of fixed and random effects models:

$$\begin{aligned} H_0: \text{cov}(e_i, x_{itk}) &= 0 \quad \forall k \\ H_1: \exists x_{itk} : \text{cov}(e_i, x_{itk}) &\neq 0, \quad k \in \{1, 2, \dots, K\}, \end{aligned} \quad (8)$$

where it is tested if correlation between individual effects and independent variables exist. If this correlation exists, the fixed effect estimator is the only one consistent. If the correlation is not significant, than both estimators are consistent and both fixed and random effects model can be used. Finally, a Granger test can be conducted to test for causality between the variables in a model. Namely, previous literature often tests if there exists causality from the pollution variables to the GDP variable. Thus, this research opted to provide a simple test in which the following regression is estimated:

$$y_{i,t} = \alpha_i + \sum_{k=1}^K \gamma_{ik} y_{i,t-k} + \sum_{k=1}^K \beta_{ik} x_{i,t-k} + \varepsilon_{i,t}, \quad (9)$$

where the test can be conducted as the original Granger test for time series data, where $H_0: \beta_{i1} = \dots = \beta_{ik} = 0 \quad \forall i$ (no causality for all countries in the panel). The other test is Dumitrescu-Hurlin (2012) test where causality can be for some countries and for some not (the alternative hypothesis distinguishes betas between some countries having zero values and some not). Since this research deals with a small number of time series data aspect in the panel, the lag length (K) will be chosen to be 1 and 2. More details on panel data models can be seen in Maddala (2001), Verbeek (2002), Wooldridge (2002), Arellano (2003), Greene (2003) or Brooks (2008). The results of the empirical analysis for Croatia are given in the next section.

RESULTS AND DISCUSSION

For the purpose of empirically evaluating EKC relationship in Croatia, yearly data on Gross Domestic Product (GDP), population and surface area for 21 counties was collected from the Croatian Bureau of Statistics (2018). Pressure variable was calculated for each county in each year as the ratio of surface area and population. Data on pollution in each county was collected from the Croatian Agency for the Environment and Nature (2018) for the following available pollutants: carbon monoxide (CO), carbon dioxide (CO₂), nitrogen dioxide (NO₂), particulate matter (PM₁₀) and sulphur dioxide (SO₂). All of the pollutants are measured as total kg emissions per year. Data is available only on a yearly basis for the period from 2008 until 2016. In that way, for each variable 9 yearly observations are obtained. Every variable was transformed by dividing it with population number, as previous literature uses per capita variables. Pollutant and GDP variables are the basic ones in the EKC relationship. Other variables could be added in the analysis as control variables. In this study pressure is added as a control variable due to its availability for every county. The pressure variable is justified based upon Malthusian theory of population, in which environmental degradation is amplified due to greater pressure (see Grossman and Kruger, 1991; Akbostanci et al., 2009; Jošić et al., 2016); and some of the counties

in Croatia face great pressure over the summer months due to great inflow of tourists. This leads to risks of environment degradation and lowering the attractiveness of a destination (for more details see Alkier Radnić, 2003). Moreover, Kružić (2004) lists some of the problems in Croatian tourist destinations regarding the pressure on environment, such as irresponsible disposal of waste, bad planning of municipal waste infrastructure, etc.

All of the variables were logarithmed in order to reduce the variance of data. Original series are shown in Tables 6, 7, 8 and 9 where descriptive statistics is calculated for the overall average and for every county as well,

with full names of counties. On average, the pollution has been slowly decreasing over the examined period for all pollutants. Graphical representations of values of pollutants over the years are shown on Figures 1-6, where this is more visible. The greatest air pollutant in Croatia is, as expected, CO₂. Emissions of SO₂ and NO₂ are below the ceilings put in Gothenburg Protocol and NEC Directive, ever since 2015. SO₂ emissions decreased due to sulphur recovery plants installed within the refineries (last one in 2008). Croatian Agency for Environment and Nature (2017) states that NO₂ and PM₁₀ emissions have declined over the years after the crisis in 2007/2008 and this was

Table 6. Mean values of every variable in the analysis

| | PM ₁₀ | NO ₂ | SO ₂ | CO ₂ | CO | Population | GDP |
|---------------|------------------|-----------------|-----------------|-----------------|----------|------------|-----------|
| Total average | 123650 | 12366296 | 1498433 | 465747751 | 1455451 | 204770 | 15952740 |
| BJEL-BIL | 331986 | 19319053 | 80215 | 136003593 | 19978936 | 118841 | 6502721 |
| BRO-POS | 209374 | 33092 | 54333 | 31445193 | 60335 | 160292 | 7104572 |
| DUB-NER | 706 | 981880 | 282671 | 11443302 | 2169 | 123952 | 9284146 |
| ZAGREB | 79636 | 1689533 | 2455480 | 1298980888 | 269868 | 794510 | 109549947 |
| ISTAR | 291620 | 226873924 | 4509560 | 2422750345 | 1867069 | 210238 | 20454571 |
| KARLO | 55961 | 74728 | 308296 | 57752851 | 43901 | 127062 | 7559094 |
| KOP-KRI | 13067 | 147512 | 71135 | 524044414 | 157014 | 115592 | 8104255 |
| KRA-ZAG | 108295 | 442883 | 276016 | 143374850 | 35706 | 132324 | 6585868 |
| LIC-SENJ | 20137 | 43205 | 32693 | 74734940 | 438737 | 49195 | 3208717 |
| MEDJ | 25325 | 12246 | 2151901 | 23711733 | 11266 | 114695 | 7293909 |
| OSJ-BAR | 213044 | 1753816 | 1853115 | 877493927 | 2204081 | 305424 | 19120476 |
| POZ-SLA | 19900 | 62873 | 17025 | 26017576 | 148454 | 77342 | 3745602 |
| PRIM-GOR | 158248 | 2070839 | 6090119 | 1093402784 | 326557 | 297047 | 28230606 |
| SIS-MOS | 567841 | 3353751 | 3421256 | 1428976496 | 1732110 | 167256 | 10302603 |
| SPL-DALM | 84036 | 1815570 | 406027 | 1035676801 | 2061155 | 463441 | 27937151 |
| SIB-KNIN | 28566 | 73624 | 124386 | 75728467 | 117076 | 108601 | 6448061 |
| VARAZ | 81169 | 281175 | 8829183 | 154167543 | 291226 | 175798 | 11366855 |
| VIR-PODR | 79750 | 72514 | 9346 | 65700814 | 448679 | 83971 | 4094982 |
| VUK-SRI | 87284 | 182994 | 71641 | 118576619 | 193580 | 181375 | 8426091 |
| ZADAR | 97255 | 73525 | 150041 | 26582055 | 13015 | 172285 | 10789211 |
| ZGB | 43446 | 333477 | 272653 | 154137574 | 163533 | 320937 | 18898111 |

BJE-BIL denotes Bjelovar-Bilogora county, BRO-POS Brod-Posavina county, DUB-NER Dubrovnik-Neretva county, ZAGREB Zagreb City, ISTAR Istria county, KARLO Karlovac county, KOP-KRI Koprivnica-Križevci county, KRA-ZAG Krapina-Zagorje county, LIC-SENJ Lika-Senj county, MEDJ Medimurje county, OSJ-BAR Osijek-Baranja county, POZ-SLA Pozega-Slavonia county, PRIM-GOR Kvarner county, SIS-MOS Sisak-Moslavina county, SPL-DALM Split-Dalmatia county, SIB-DALM Split-Dalmatia county, SIB-KNIN Sibenik-Knin county, VARAZ – Varazdin county, VIR-PODR Virovitica-Podravina county, VUK-SRI Vukovar-Srijem county, ZADAR – Zadar county and ZGB Zagreb County.

still ongoing in 2015. The agency also states that the main reason why CO emissions have declined due to increase of vehicles with catalytic converters after the war in early 1990s. Greater values of PM₁₀ and NO emissions can be found for Sisak-Moslavina county, followed by Bjelovar-Bilogora and Brod-Posavina county. This is mainly due to industry sources (Ina refinery and thermal power plant in Sisak-Moslavina county), home fireplaces and road traffic in Bjelovar-Bilogora county (mainly PM₁₀ and NO emissions, Physical planning department of Bjelovar-Bilogora county, 2015). NO₂ emissions were high in Istria county, due to it being urban and industrial environment

(Physical planning department of Istria county, 2017).

Finally, to include comments on the descriptive statistics before the estimation, scatter plots have been observed between GDP per capita and all pollutants per capita on Figures 7-11. Moreover, the differenced variables on their respective scatter plots have been observed on Figures 12-16. Initial insights into Figures show that somewhat relationship could be found in data in levels. However, in differences, there seems to be no relationship between the income and pollution in the observed period.

Table 7. Standard deviations of every variable in the analysis

| | PM ₁₀ | NO ₂ | SO ₂ | CO ₂ | CO | Population | GDP |
|---------------|------------------|-----------------|-----------------|-----------------|----------|------------|----------|
| Total average | 229561 | 146521460 | 6120488 | 659176538 | 12795637 | 163588 | 22191106 |
| BJEL-BIL | 696067 | 57346744 | 146979 | 50079468 | 58488932 | 4912 | 416364 |
| BRO-POS | 343528 | 10795 | 43100 | 5205577 | 46050 | 9736 | 361383 |
| DUB-NER | 1071 | 2917953 | 679581 | 2424097 | 601 | 2545 | 236952 |
| GZAGREB | 54038 | 582355 | 1998993 | 379092461 | 133514 | 4787 | 1735321 |
| ISTAR | 202413 | 668182803 | 741034 | 523650013 | 964730 | 3362 | 547974 |
| KARLO | 103242 | 23404 | 271168 | 8742273 | 34341 | 4520 | 415145 |
| KOP-KRI | 19930 | 27433 | 18999 | 154072675 | 111303 | 3269 | 551522 |
| KRA-ZAG | 118399 | 109883 | 139669 | 28402847 | 28615 | 3350 | 505611 |
| LIC-SENJ | 23310 | 28124 | 16023 | 99136689 | 438141 | 1291 | 300658 |
| MEDJ | 16146 | 4365 | 6407283 | 9422041 | 6451 | 2457 | 199512 |
| OSJ-BAR | 62575 | 812775 | 627330 | 69089699 | 524019 | 11206 | 832553 |
| POZ-SLA | 9633 | 49714 | 32029 | 4794664 | 196422 | 3780 | 299386 |
| PRIM-GOR | 71940 | 674190 | 5627118 | 305775852 | 114804 | 5689 | 782532 |
| SIS-MOS | 192607 | 947676 | 2081471 | 223691493 | 2482657 | 5716 | 506422 |
| SPL-DALM | 50414 | 702039 | 352924 | 250922618 | 648587 | 14194 | 991727 |
| SIB-KNIN | 25271 | 25887 | 100522 | 10507007 | 147102 | 4270 | 226243 |
| VARAZ | 48632 | 220239 | 25858777 | 30924377 | 231031 | 3742 | 530126 |
| VIR-PODR | 149367 | 19149 | 5449 | 24557304 | 1028747 | 3117 | 385310 |
| VUK-SRI | 32751 | 165993 | 23993 | 60497970 | 140427 | 12514 | 506952 |
| ZADAR | 264471 | 82500 | 116115 | 5989646 | 13305 | 2553 | 413118 |
| ZGB | 27837 | 208356 | 159085 | 19007765 | 49857 | 5541 | 476934 |

BJE-BIL denotes Bjelovar-Bilogora county, PRO-POS Brod-Posavina county, DUB-NER Dubrovnik-Neretva county, GZAGREB Zagreb City, ISTAR Istria county, KARLO Karlovac county, KOP-KRI Koprivnica-Križevci county, KRA-ZAG Krapina-Zagorje county, LIC-SENJ Lika-Senj county, MEDJ Medimurje county, OSJ-BAR Osijek-Baranja county, POZ-SLA Pozega-Slavonia county, PRIM-GOR Kvarner county, SIS-MOS Sisak-Moslavina county, SPL-DALM Split-Dalmatia county, SIB-DALM Split-Dalmatia county, SIB-KNIN Sibenik-Knin county, VARAZ – Varazdin county, VIR-PODR Virovitica-Podravina county, VUK-SRI Vukovar-Srijem county, ZADAR – Zadar county and ZGB Zagreb County.

Table 8. Minimum values of every variable in the analysis

| | PM ₁₀ | NO ₂ | SO ₂ | CO ₂ | CO | Population | GDP |
|---------------|------------------|-----------------|-----------------|-----------------|---------|------------|-----------|
| Total average | 21 | 3133 | 347 | 7044081 | 1302 | 46888 | 2898250 |
| BJEL-BIL | 32774 | 90961 | 3497 | 79358443 | 176732 | 111867 | 6050257 |
| BRO-POS | 265 | 14811 | 4099 | 23329476 | 8055 | 148373 | 6647578 |
| DUB-NER | 21 | 3133 | 15379 | 7044081 | 1302 | 121970 | 8984927 |
| GZAGREB | 22477 | 886977 | 258029 | 816255243 | 77074 | 788095 | 105965457 |
| ISTAR | 131164 | 2502263 | 3665034 | 1187985164 | 556320 | 207719 | 19796781 |
| KARLO | 4793 | 46735 | 24586 | 39833505 | 10031 | 120321 | 7136575 |
| KOP-KRI | 2419 | 112592 | 32774 | 266890390 | 35185 | 110976 | 7419887 |
| KRA-ZAG | 26100 | 257726 | 165405 | 112783456 | 7018 | 127748 | 6002298 |
| LIC-SENJ | 3858 | 19257 | 16196 | 22706547 | 72745 | 46888 | 2898250 |
| MEDJ | 2334 | 6011 | 2066 | 11461476 | 3757 | 112089 | 6929738 |
| OSJ-BAR | 150567 | 1010668 | 1253502 | 756569834 | 1843205 | 290412 | 18303414 |
| POZ-SLA | 7894 | 27789 | 347 | 19667440 | 16213 | 71920 | 3332090 |
| PRIM-GOR | 95763 | 1249557 | 1683041 | 855948236 | 178884 | 289479 | 27075161 |
| SIS-MOS | 302136 | 2095334 | 1384281 | 1137286498 | 321903 | 157204 | 9256966 |
| SPL-DALM | 29142 | 941049 | 58901 | 601455860 | 1239321 | 452035 | 26930960 |
| SIB-KNIN | 11445 | 39226 | 5047 | 57079126 | 12605 | 103021 | 5990728 |
| VARAZ | 30885 | 115003 | 77960 | 107822661 | 93841 | 170563 | 10714145 |
| VIR-PODR | 16548 | 50022 | 1437 | 25972460 | 71065 | 79111 | 3540223 |
| VUK-SRI | 38839 | 60621 | 39722 | 52860481 | 67849 | 165799 | 7783581 |
| ZADAR | 4098 | 28849 | 22497 | 16999835 | 2324 | 169581 | 10459335 |
| ZGB | 22363 | 130447 | 116730 | 124758060 | 92193 | 314549 | 17912055 |

BJE-BIL denotes Bjelovar-Bilogora county, BRO-POS Brod-Posavina county, DUB-NER Dubrovnik-Neretva county, GZAGREB Zagreb City, ISTAR Istria county, KARLO Karlovac county, KOP-KRI Koprivnica-Križevci county, KRA-ZAG Krapina-Zagorje county, LIC-SENJ Lika-Senj county, MEDJ Medimurje county, OSJ-BAR Osijek-Baranja county, POZ-SLA Pozega-Slavonia county, PRIM-GOR Kvarner county, SIS-MOS Sisak-Moslavina county, SPL-DALM Split-Dalmatia county, SIB-DALM Split-Dalmatia county, SIB-KNIN Sibenik-Knin county, VARAZ – Varazdin county, VIR-PODR Virovitica-Podravina county, VUK-SRI Vukovar-Srijem county, ZADAR – Zadar county and ZGB Zagreb County.

Table 9. Maximum values of every variable in the analysis

| | PM ₁₀ | NO ₂ | SO ₂ | CO ₂ | CO | Population | GDP |
|---------------|------------------|-----------------|-----------------|-----------------|-----------|------------|-----------|
| Total average | 2179081 | 2008693818 | 77785387 | 2844986688 | 175947214 | 802338 | 111165176 |
| BJEL-BIL | 2179081 | 172243467 | 426363 | 236885167 | 175947214 | 125652 | 7027915 |
| BRO-POS | 875174 | 45347 | 99002 | 38567968 | 135816 | 173628 | 7675255 |
| DUB-NER | 3526 | 8763082 | 2075183 | 14717187 | 3258 | 127746 | 9749291 |
| GZAGREB | 170937 | 2635170 | 5976693 | 1739774338 | 470420 | 802338 | 111165176 |
| ISTAR | 810350 | 2008693818 | 5535291 | 2844986688 | 3136771 | 214991 | 21597655 |
| KARLO | 326595 | 111552 | 823811 | 70170262 | 105811 | 133405 | 8238099 |
| KOP-KRI | 65225 | 197934 | 91220 | 718402621 | 393758 | 120106 | 9065541 |
| KRA-ZAG | 413492 | 583615 | 519027 | 186036489 | 84238 | 137001 | 7404671 |
| LIC-SENJ | 77762 | 100042 | 52262 | 335769791 | 1457132 | 50697 | 3623700 |
| MEDJ | 50193 | 18708 | 19237958 | 35855112 | 20301 | 117923 | 7539679 |
| OSJ-BAR | 331633 | 3092019 | 3149391 | 960750773 | 3554254 | 320617 | 20697689 |
| POZ-SLA | 42055 | 182651 | 87152 | 36277300 | 659049 | 82548 | 4214728 |
| PRIM-GOR | 333240 | 3195694 | 19890969 | 1877106998 | 463202 | 304750 | 29117950 |
| SIS-MOS | 821079 | 4650478 | 7910594 | 1886381912 | 8198338 | 174301 | 11035161 |
| SPL-DALM | 178955 | 3148007 | 996666 | 1454844871 | 2818817 | 482604 | 29770842 |
| SIB-KNIN | 88176 | 124599 | 309546 | 93430993 | 443690 | 114283 | 6779187 |
| VARAZ | 201810 | 721614 | 77785387 | 194626942 | 820932 | 180781 | 12224766 |
| VIR-PODR | 472977 | 100648 | 15768 | 104223361 | 3190810 | 88299 | 4655478 |
| VUK-SRI | 132712 | 564420 | 109529 | 262728870 | 432814 | 198289 | 9243619 |
| ZADAR | 802439 | 288515 | 316848 | 36116030 | 39201 | 176316 | 11785750 |
| ZGB | 110584 | 750031 | 492519 | 178208889 | 229610 | 329253 | 19458139 |

BJE-BIL denotes Bjelovar-Bilogora county, BRO-POS Brod-Posavina county, DUB-NER Dubrovnik-Neretva county, GZAGREB Zagreb City, ISTAR Istria county, KARLO Karlovac county, KOP-KRI Koprivnica-Križevci county, KRA-ZAG Krapina-Zagorje county, LIC-SENJ Lika-Senj county, MEDJ Medimurje county, OSJ-BAR Osijek-Baranja county, POZ-SLA Pozega-Slavonia county, PRIM-GOR Kvarner county, SIS-MOS Sisak-Moslavina county, SPL-DALM Split-Dalmatia county, SIB-DALM Split-Dalmatia county, SIB-KNIN Sibenik-Knin county, VARAZ – Varazdin county, VIR-PODR Virovitica-Podravina county, VUK-SRI Vukovar-Srijem county, ZADAR – Zadar county and ZGB Zagreb County.

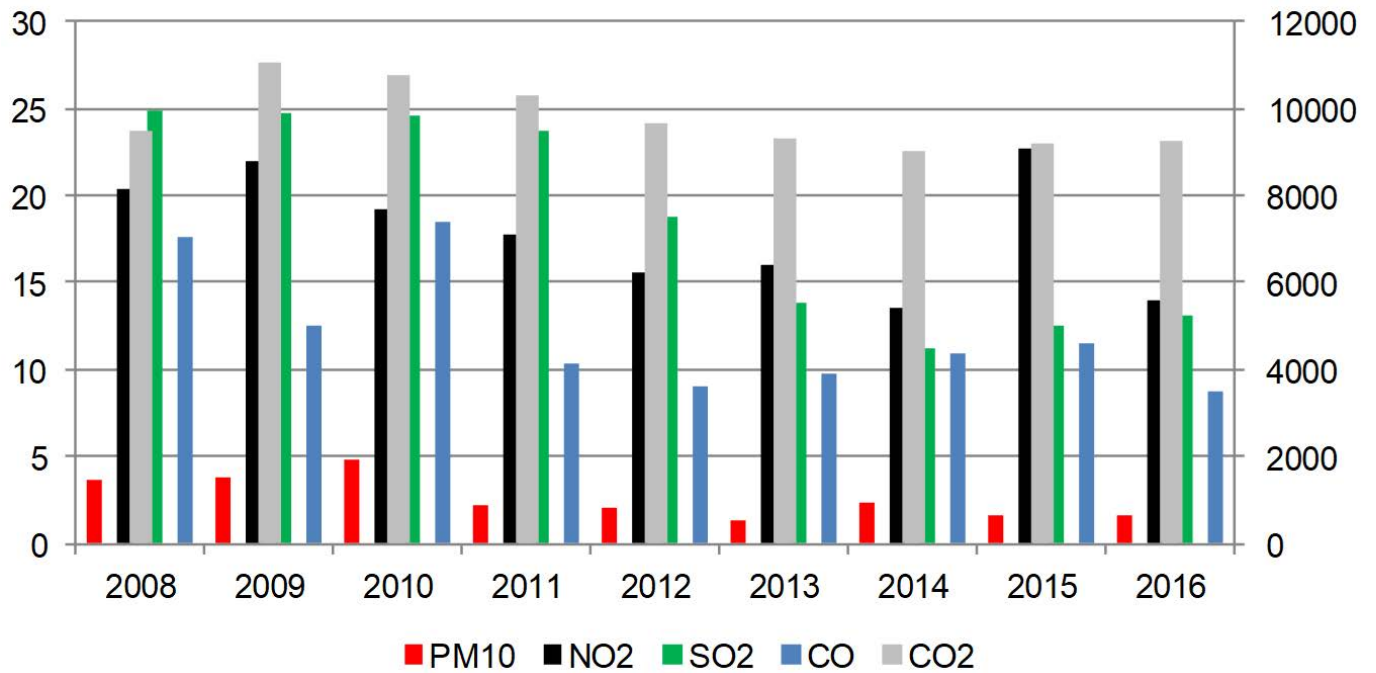


Figure 1. Average emissions of PM₁₀, NO₂, SO₂, CO and CO₂ in Croatia, in tonnes (Left axis refers to PM₁₀, NO₂, SO₂ and CO, right axis refers to CO₂. Source: author's calculation.)

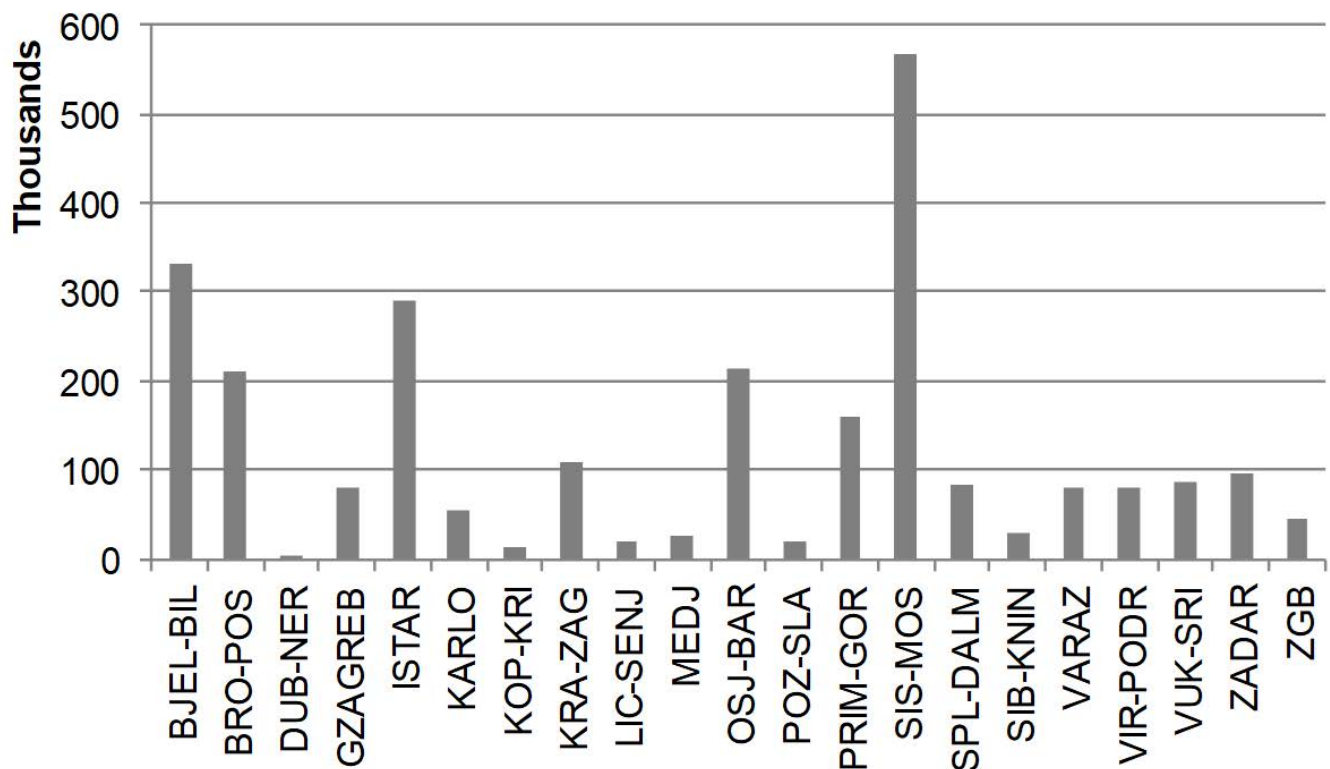


Figure 2. Average emissions of PM₁₀ in thousands of kg in every county, period 2008-2016 (Source: author's calculation.)

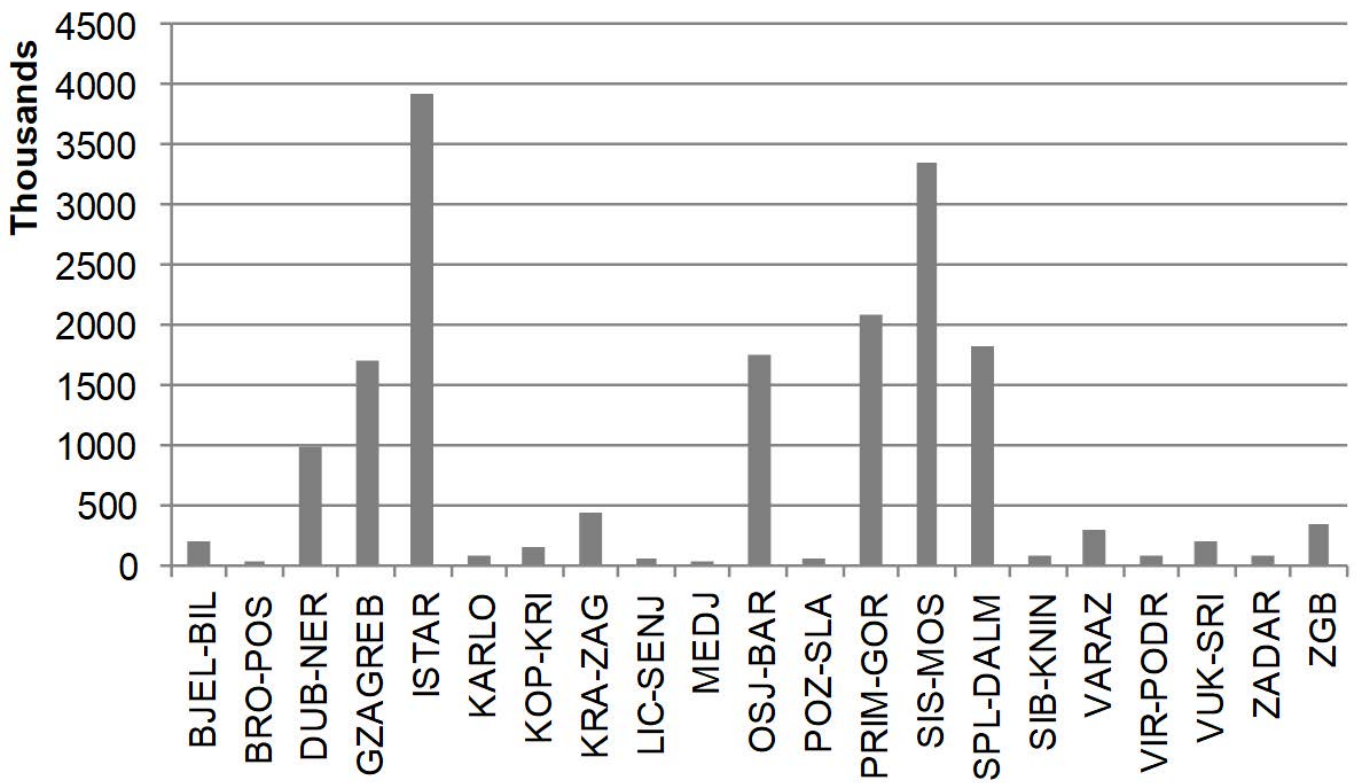


Figure 3. Average emissions of NO₂ in thousands of kg in every county, period 2008-2016 (Source: author's calculation.)

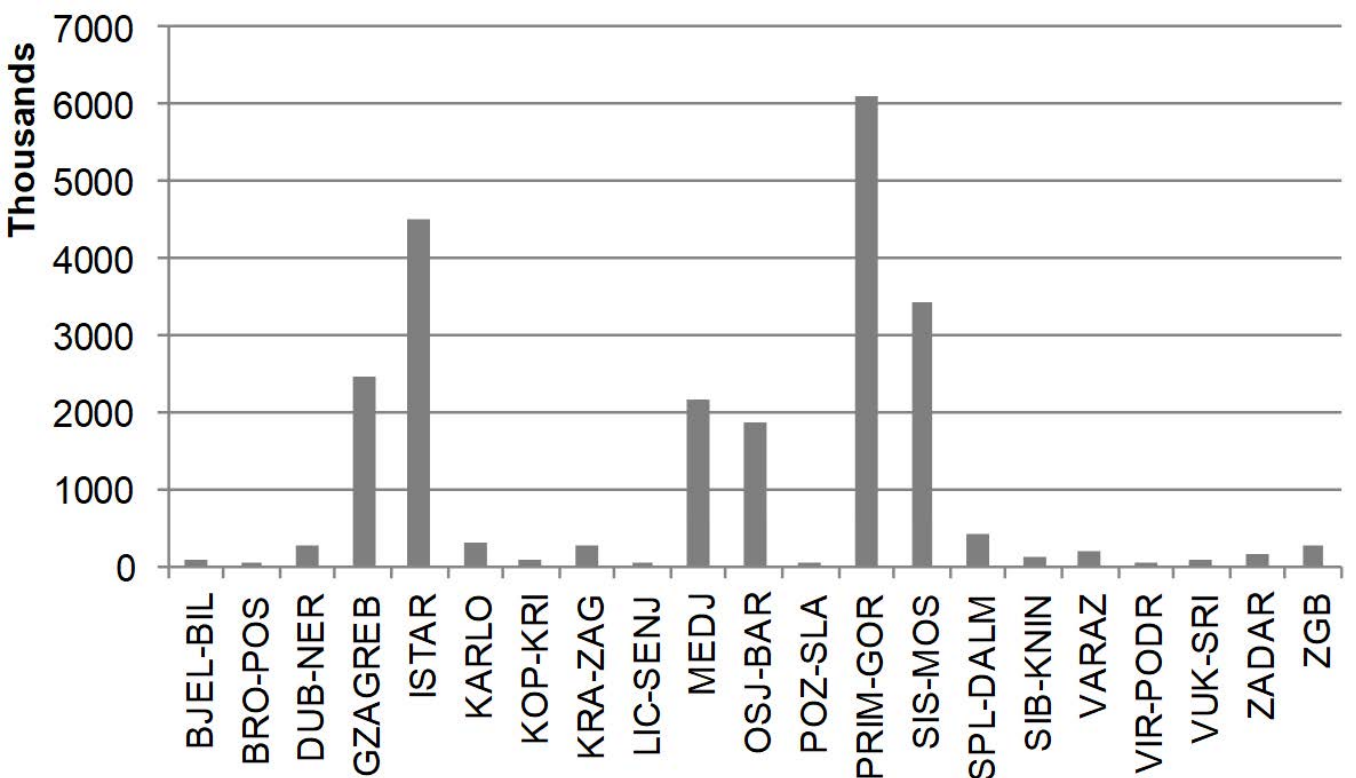


Figure 4. Average emissions of SO₂ in thousands of kg in every county, period 2008-2016 (Source: author's calculation.)

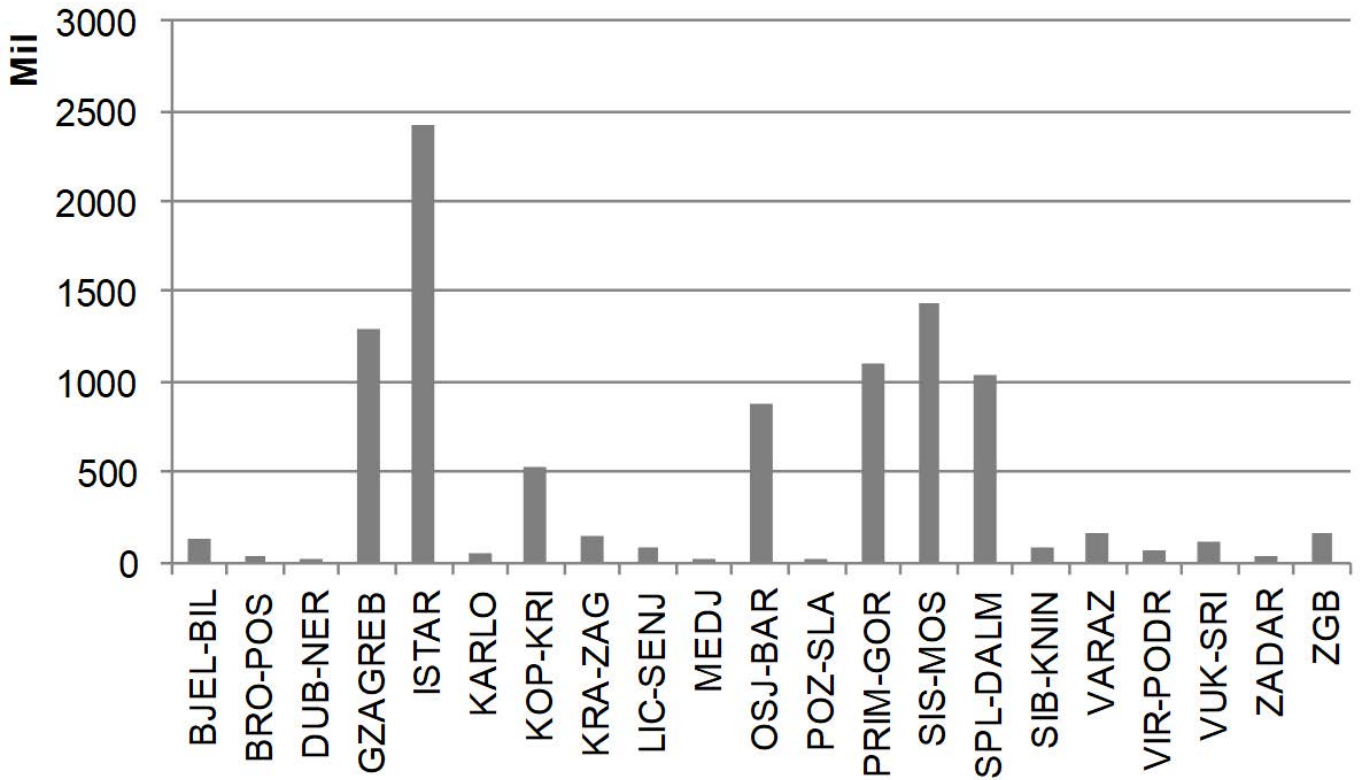


Figure 5. Average emissions of CO₂ in thousands of kg in every county, period 2008-2016 (Source: author's calculation.)

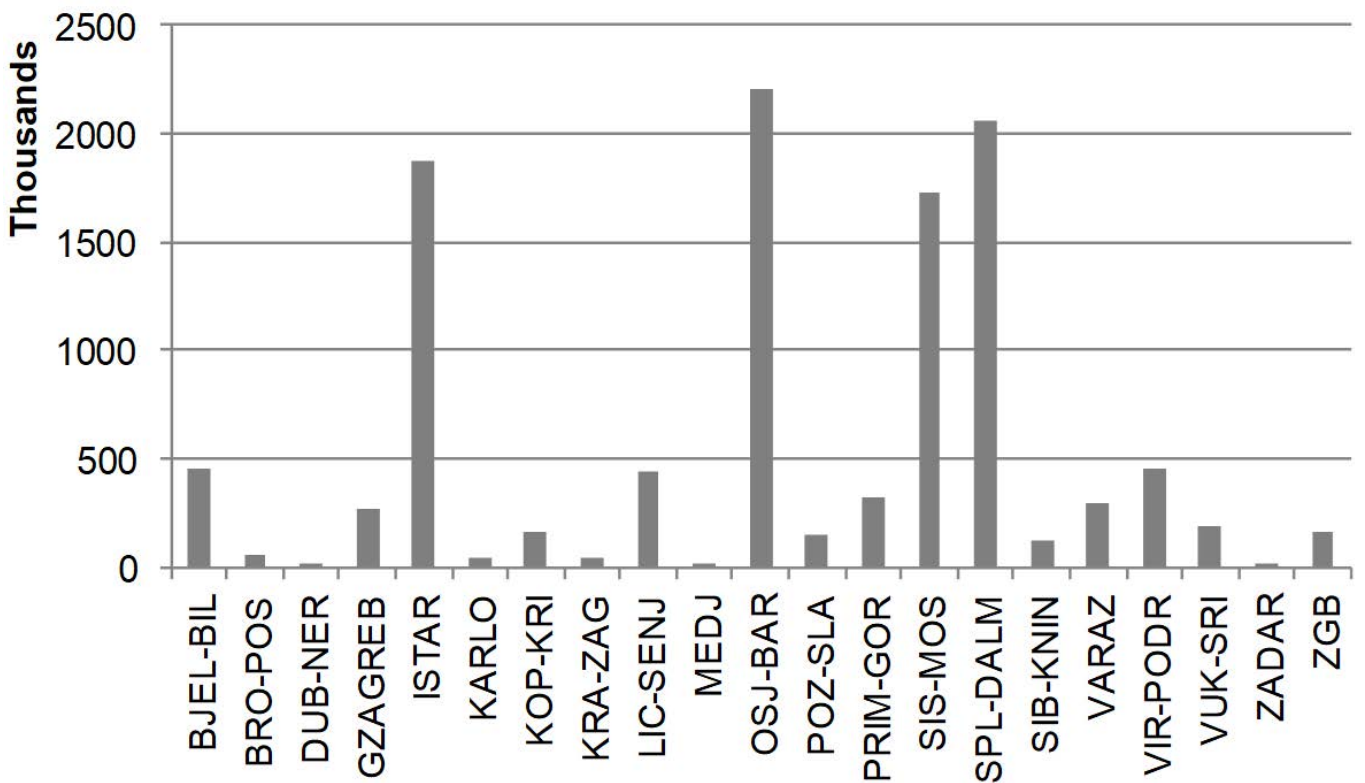


Figure 6. Average emissions of CO in thousands of kg in every county, period 2008-2016 (Source: author's calculation.)

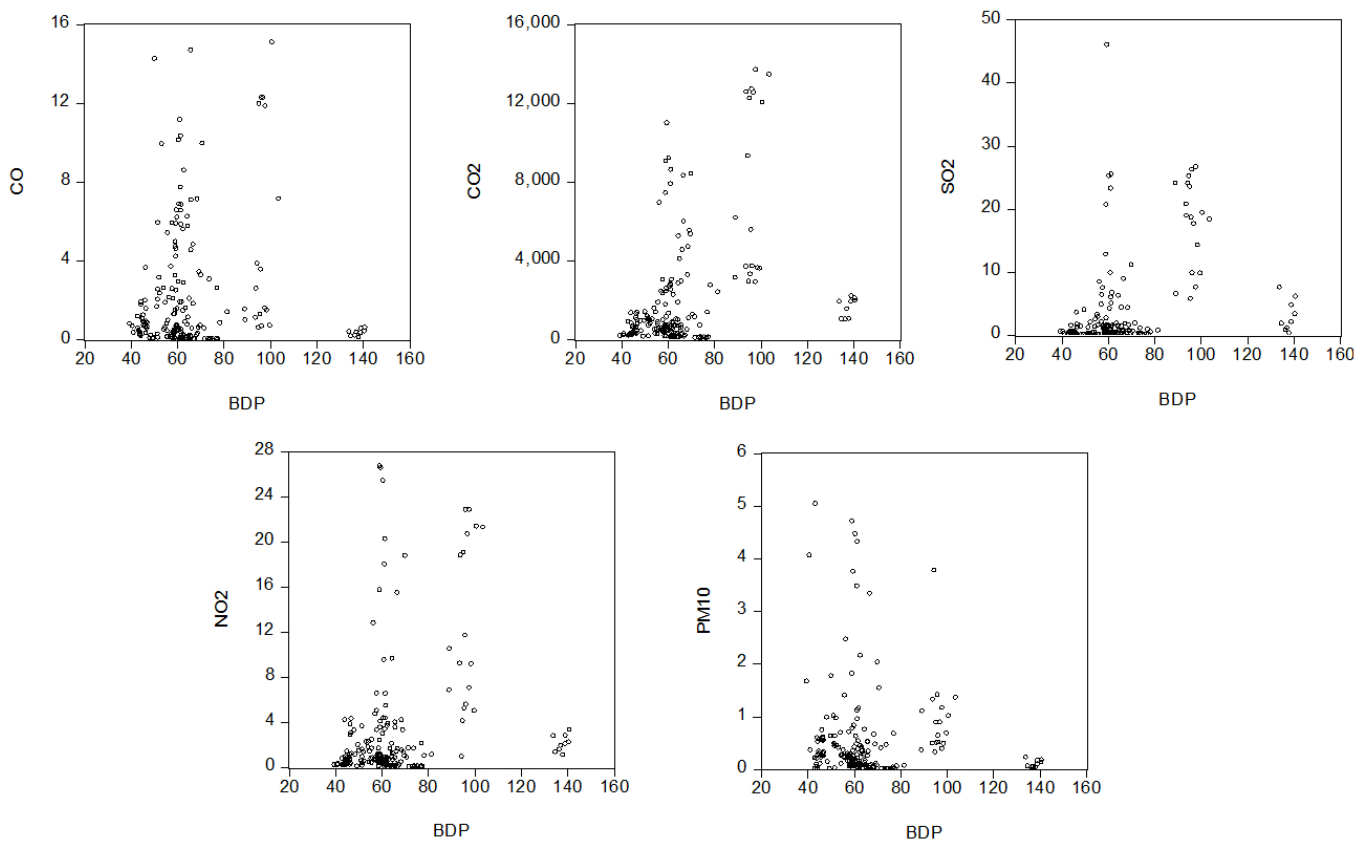


Figure 7-11. Scatter plots for pollutants in levels, in kg per capita versus GDP per capita, panel data (Source: author's calculation.)

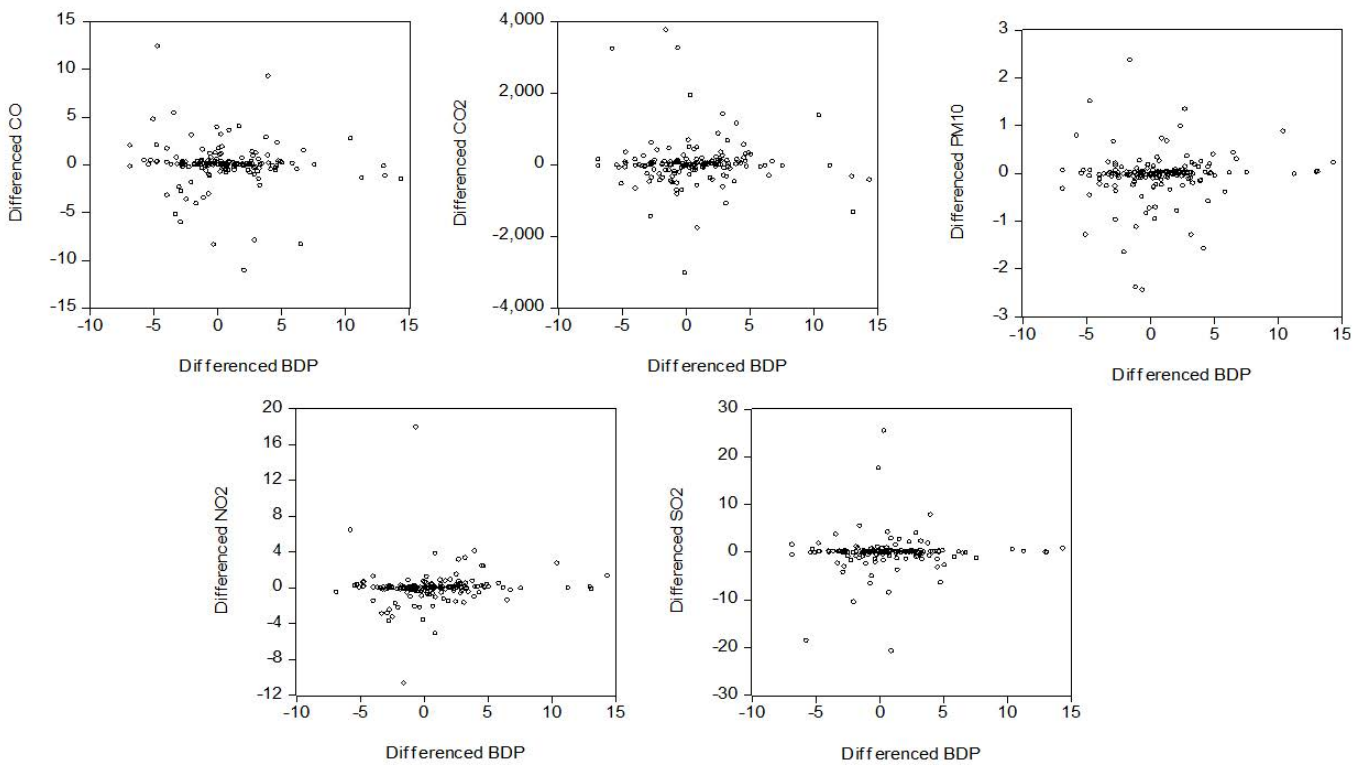


Figure 12-16. Scatter plots for pollutants in differences, in kg per capita versus GDP per capita, panel data (Source: author's calculation.)

Before estimating different specifications of the EKC relationship, unit root tests have been performed for every variable. Unit root tests assume non-stationarity in the null hypothesis. The alternative hypothesis differs depending upon the test. Some tests assume that every observed unit has its own unit root value, while others assume the same value of the unit root parameter; some tests are asymptotically dependent on N and/or T (see Verbeek, 2002 for detailed discussion). Since this research is dealing with small number of observed units (N) and small number of time periods (T), tests which assume $N/T \rightarrow 0$ such as LLC are preferable compared to others (see Hlouskova and Wagner, 2006 for detailed comparison). Detailed results are shown in Tables 10 and 11, where it can be seen that all of the variables seem to be stationary.

Next, the following forms of the EKC relationship are observed:

$$POL_{it} = \alpha_i + \lambda_t + \beta_1 GDP_{it} + \beta_2 GDP_{it}^2 + \beta_4 PR_{it} + \varepsilon_{it}, \quad (10)$$

$$POL_{it} = \alpha_i + \lambda_t + \beta_1 GDP_{it} + \beta_2 GDP_{it}^2 + \beta_3 GDP_{it}^3 + \beta_4 PR_{it} + \varepsilon_{it}, \quad (11)$$

and

$$POL_{it} = \alpha_i + \lambda_t + \beta_1 GDP_{it} + \beta_4 PR_{it} + \delta D_{it} + \varepsilon_{it}, \quad (12)$$

where POL_{it} denotes pollutant per capita for county i in year t , GDP_{it} is GDP per capita of county i in year t and PR_{it} is pressure as previous defined, for county i in year t . If value of β_1 is found positive in any of the observed models, there exists a positive relationship between economic development in Croatia and the pollution. However, an EKC curve exists if the value of β_2 is negative (inverted U-curve). Finally, if the value of β_3 is different from zero, a cubic relationship exists, which is interpreted as changes of the U-shaped relationship between development and pollution. The fixed effects model was estimated for each pollutant for (9), (10) and (11) and F and Chi-square test were performed in order to compare fixed effects models to the pooled regression.

The results (test values) are shown in Table 12, where it can be seen that fixed effects are suitable for all pollutants in each model except for period effects for models where CO and PM_{10} are the pollutants.

Table 10. Unit root tests, constant and trend included in level equation, constant in first difference equation

| Variable | GDP | Pressure | CO | CO ₂ | NO ₂ | PM ₁₀ | SO ₂ |
|----------------------------|-----------|-----------|-----------|-----------------|-----------------|------------------|-----------------|
| Level, constant and trend | | | | | | | |
| LLC | -12.8*** | -7.49*** | -12.25*** | -8.31*** | -20.98*** | -9.58*** | -10.32*** |
| Breitung | 3.22 | -2.46*** | -0.4 | 0.94 | 0.79 | 2.31 | -1.36* |
| IPS | -1.32*** | 0.37 | -1.55* | -0.48 | -1.36* | -0.52 | -0.85 |
| ADF | 77.67*** | 33.35 | 82.79*** | 59.32** | 72.39** | 61.76** | 63.39** |
| PP | 95.78*** | 30.7 | 141.01*** | 91.74*** | 85.09*** | 82.97*** | 83.98*** |
| First difference, constant | | | | | | | |
| LLC | -13.97*** | -12.66*** | -20.33*** | -14.47*** | -12.946*** | -17.46*** | -15.07*** |
| IPS | -5.4*** | -4.15*** | -8.77*** | -6.63*** | -5.672*** | -5.83*** | -5.92*** |
| ADF | 115.73*** | 96.76*** | 162.11*** | 127.1*** | 119.264*** | 120.45*** | 123.65*** |
| PP | 122.36*** | 137.74*** | 217.77*** | 145.68*** | 163.51*** | 167.31*** | 152.82*** |

*, ** and *** denote statistical significance on 10%, 5% and 1%. LLC - Levin-Lin-Chu (2002) unit root test, Breitung - Breitung (2000) unit root test, IPS - Im-Pesaran-Shin (2003), ADF and PP denote Fisher-type tests using ADF and PP tests (Maddala and Wu (1999), Choi (2001)). This table provides results of unit root testing for level series with included constant and trend in the test equation (upper panel) and for series in first differences with included only constant in test equation. Optimal lag was chosen based upon Schwartz information criteria (as being the strictest one).

Table 11. Unit root tests, constant included in level equation, no deterministic variable included in first difference equation

| Variable | GDP | Pressure | CO | CO ₂ | NO ₂ | PM ₁₀ | SO ₂ |
|------------------------|-----------|-----------|-----------|-----------------|-----------------|------------------|-----------------|
| Level, constant | | | | | | | |
| LLC | 0.76 | 0.85 | -4.43*** | -6.75*** | -2.04** | -8.96*** | -3.35*** |
| IPS | 1.44 | 4.03 | -1.86** | -1.7 | -1.17 | -3.31*** | -0.44 |
| ADF | 28.81 | 8.76 | 72.07*** | 69.79** | 59.76** | 83.49*** | 49.11 |
| PP | 23.51 | 5.74 | 88.58*** | 83.67*** | 63.20** | 99.89*** | 50.66 |
| First difference, none | | | | | | | |
| LCC | -12.93*** | -5.37*** | -20.36*** | -12.93*** | -19.67*** | -18.64*** | -14.73*** |
| ADF | 183.93*** | 101.45*** | 253.25*** | 191.27*** | 205.87*** | 210.14*** | 207.38*** |
| PP | 173.19*** | 98.27*** | 269.8*** | 209*** | 228.22*** | 230.09*** | 214.8*** |

*, ** and *** denote statistical significance on 10%, 5% and 1%. LLC - Levin-Lin-Chu (2002) unit root test, Breitung - Breitung (2000) unit root test, IPS - Im-Pesaran-Shin (2003), ADF and PP denote Fisher-type tests using ADF and PP tests (Maddala and Wu (1999), Choi (2001)). This table provides results of unit root testing for level series with included constant in the test equation (upper panel) and for series in first differences with no deterministic variables included in test equation. Optimal lag was chosen based upon Schwartz information criteria (as being the strictest one).

Table 12. Results of comparison of fixed effects model to the pooled regression for models (9), (10) and (11)

| Test/pollutant | | CO | CO ₂ | NO ₂ | PM ₁₀ | SO ₂ |
|-------------------------------------|------------|-----------|-----------------|-----------------|------------------|-----------------|
| | Model (9) | 40.48*** | 143.47*** | 70.48*** | 17.83*** | 29.91*** |
| Cross-section F | Model (10) | 40.65*** | 141.86*** | 70.83*** | 17.89*** | 29.63*** |
| | Model (11) | 40.39*** | 140.64*** | 70.19*** | 18.48*** | 28.54*** |
| | Model (9) | 342.53*** | 558.1*** | 433.69*** | 223.17*** | 295.94*** |
| Cross-section Chi-square | Model (10) | 344.19*** | 557.21*** | 435.61*** | 224.44*** | 295.44*** |
| | Model (11) | 344.18*** | 556.81*** | 435.16*** | 229.58*** | 290.85*** |
| | Model (9) | 1.01 | 2.51** | 1.94* | 0.58 | 2.55** |
| Period F | Model (10) | 1.44 | 2.49** | 2.31** | 0.99** | 2.65*** |
| | Model (11) | 1.4 | 2.33** | 2.26** | 1.18 | 2.6** |
| | Model (9) | 9.46 | 22.65*** | 17.69** | 5.46 | 22.96*** |
| Period Chi-square | Model (10) | 13.1* | 22.6*** | 21.02*** | 9.29 | 23.95*** |
| | Model (11) | 13.14 | 21.37*** | 20.71*** | 11.12 | 23.62*** |
| | Model (9) | 30.09*** | 106.24*** | 51.90*** | 14.18*** | 23.95*** |
| Cross-section and period F | Model (10) | 29.89*** | 104.46*** | 51.83*** | 14.18*** | 23.92*** |
| | Model (11) | 29.69*** | 103.52*** | 51.37*** | 14.63*** | 23.09*** |
| | Model (9) | 348.84*** | 564.56*** | 438.89*** | 237.51*** | 313.18*** |
| Cross-section and period Chi-square | Model (10) | 348.77*** | 562.66*** | 439.74*** | 238.33*** | 313.97*** |
| | Model (11) | 348.74*** | 562.19*** | 439.3*** | 243.49*** | 309.56*** |

*, ** and *** denote statistical significance on 10%, 5% and 1%.

Next, selected fixed effects models are compared to random effects models via Hausman test given in (8). Test values are given in table 12. It can be seen that the cross section fixed effects model is appropriate for: model (9) for all pollutants, and models (10) and (11) for all pollutants except CO; and no random effects were found in period specification of the model. Thus, the majority of the estimated models will be with the assumption of fixed effects because the estimators will be consistent. This is in line with previously stated facts of social and economic differences between the counties (industry, tourism, population growth/decline, etc.), which this approach controls for (individual heterogeneity). The cross-section fixed effects capture counties' individual characteristics which could contribute to differences between them, such as being the capital city of the country or relying heavily on tourism as income generator; or when individual county carried out greater projects regarding the pollution reduction and/or waste management. Time fixed effect when included, could differentiate between periods after the crisis of 2007-2008 and the recovery in years later, which could have affected the dependent variable, i.e. pollution could have been smaller in the crisis year due to decline of industry and manufacturing or decline of automobile purchases which lowered the total air pollution.

Based upon the results from tables 12 and 13, appropriate models have been estimated for every pollutant. Detailed results are given in Table 14. There are several conclusions which can be drawn by observing the results. First of all, in model (9), the variable GDP per capita is significant for all variables except SO₂. This means that to some extent there exists a relationship between economic development and level of pollution in Croatia. However, the value of $\hat{\beta}_1$ is positive for all pollutants with exception of CO, which means that increase in GDP per capital leads to increase of the pollution. This is in line with results in Jošić et al. (2016). The negative coefficient for CO pollutant model (9) could be a result of stopping the production of aluminium, pulp and paper in Croatia after the crisis in 2008. Thus, although the income per capita has slightly increased in the observed period, the CO emissions dropped and in that way a negative relationship exists between those two variables. By adding the quadratic term of income per capita (model 10), it is only significant for pollutants NO₂ and PM₁₀. This is in line with Mor and Jindal (2012). The positive values are in accordance with the research of Jošić et al. (2016). Finally, model (11) has significant variables only for PM₁₀. This means that a cubic relationship could exist between development and pollution in this case. With the positive and negative values of betas corresponding to income

Table 13. Results of Hausman test for models (9), (10) and (11)

| Test/pollutant | | CO | CO ₂ | NO ₂ | PM ₁₀ | SO ₂ |
|---------------------------------|------------|--------|-----------------|-----------------|------------------|-----------------|
| Cross-section random | Model (9) | 6.51** | 0 | 12.59*** | 35.85*** | 27.89*** |
| | Model (10) | 2.66 | 0 | 0 | 36.05*** | 693.32*** |
| | Model (11) | 2.57 | 0 | 0 | 33.54*** | 0 |
| Period random | Model (9) | - | 0 | 0 | - | 0 |
| | Model (10) | - | 0 | 0 | - | 0 |
| | Model (11) | - | 0 | 0 | - | 0 |
| Cross-section and period random | Model (9) | - | 0 | 6.52** | - | 6.98** |
| | Model (10) | - | 0 | 0 | - | 11.67*** |
| | Model (11) | - | 0 | 0 | - | 0 |

*, ** and *** denote statistical significance on 10%, 5% and 1%. Zero values denote that no random effects were found.

and its transformations, there seems that a U-shaped curve exists up to a certain point of income per capita and afterwards an EKC (inverted U-shaped) curve is present for this pollutant. This is the so-called opposite N shape, and it is in line with Mor and Jindal (2012).

However, the results should be taken with some caution, due to small sample (regarding both N and T), due to unit root tests being valid asymptotically. Thus, all of the variables were differenced in order to dispose of any non-stationarity which could not have been detected in unit root testing. Next, models in Table 14 were re-estimated with differenced data and the results are shown in Table 15. It can be seen that now even more variables become insignificant. Only results for model (10) confirm that SO_2 could have the inverted U shape (EKC hypothesis) or the

cubic relationship (model 11). These results are in line with Piątowska and Włodarczyk (2017), where no short-term relationship is found for similar CEE countries, such as Estonia, Romania and Slovenia.

Moreover, since Croatia has joined EU in 2013, an additional model will be observed by adding a binary variable equal to unit value for years 2013-2016. The best model chosen for each pollutant in table 14 will be extended with the mentioned binary variable in order to explore effects of EU legislation which Croatia had to implement into its existing laws and the implementation of the 7th Environment Action Programme (EAP) of European Commission. Therefore, models (9), (10) and (11) will be extended as:

Table 14. Results of estimation of models (9), (10) and (11) for all pollutants

| Estimations | CO | CO ₂ | NO ₂ | PM ₁₀ | SO ₂ |
|-----------------|---------|-----------------|-----------------|------------------|-----------------|
| Model (9) | | | | | |
| $\hat{\alpha}$ | 2.29 | 4.82 | -5.43 | -32.67*** | 0.62 |
| $\hat{\beta}_1$ | -1.67* | 1.13* | 2.9*** | 2.97** | 2.65 |
| $\hat{\beta}_4$ | 0.3 | -2.06 | 0.13 | 14.06*** | -2.91 |
| \bar{R}^2 | 0.86 | 0.96 | 0.91 | 0.72 | 0.84 |
| Model (10) | | | | | |
| $\hat{\alpha}$ | 28.53* | 7.64 | 20.72 | 25.21 | 20.33 |
| $\hat{\beta}_1$ | -30.96* | -1.79 | -24.24* | -61.65*** | -17.82 |
| $\hat{\beta}_2$ | 0.04 | -2.19 | -1.11 | 13.47*** | -3.85 |
| $\hat{\beta}_4$ | 8.29 | 0.83 | 7.7** | 18.3*** | 5.81 |
| \bar{R}^2 | 0.86 | 0.96 | 0.91 | 0.73 | 0.84 |
| Model (11) | | | | | |
| $\hat{\alpha}$ | -49.03 | 21.8 | 43.4 | 387.29* | 34.25 |
| $\hat{\beta}_1$ | 98.92 | 6.79 | -62.14 | -652.90** | -41.08 |
| $\hat{\beta}_2$ | 0.1 | -6.48* | -1.15 | 13.18*** | -3.87 |
| $\hat{\beta}_3$ | -64.18 | -16.63 | 28.84 | 348.22* | 18.78 |
| $\hat{\beta}_4$ | 13.45 | 5.45 | -3.92 | -61.23* | -2.41 |
| \bar{R}^2 | 0.86 | 0.86 | 0.91 | 0.74 | 0.83 |

*, ** and *** denote statistical significance on 10%, 5% and 1%. \bar{R}^2 denotes the adjusted coefficient of determination.

Table 15. Results of estimation of models (9), (10) and (11) for all pollutants, differenced variables

| Estimations | CO | CO ₂ | NO ₂ | PM ₁₀ | SO ₂ |
|-----------------|--------|-----------------|-----------------|------------------|-----------------|
| Model (9) | | | | | |
| $\hat{\alpha}$ | -0.047 | 12.811 | -0.111 | -0.064 | -0.281 |
| $\hat{\beta}_1$ | -0.039 | 1.684 | 0.042 | 0.005 | 0.098 |
| $\hat{\beta}_4$ | -0.029 | -2.525 | -0.016 | 0.001 | 0.039 |
| \bar{R}^2 | 0.043 | 0.015 | 0.074 | 0.118 | 0.045 |
| Model (10) | | | | | |
| $\hat{\alpha}$ | -0.136 | 18.490 | -0.167 | -0.091* | -0.007 |
| $\hat{\beta}_1$ | -0.103 | 5.761 | 0.001 | -0.014 | 0.295* |
| $\hat{\beta}_2$ | 0.011 | -0.684 | 0.007 | 0.003 | -0.033* |
| $\hat{\beta}_4$ | -0.028 | -2.568 | -0.016 | 0.0001 | 0.037 |
| \bar{R}^2 | 0.049 | 0.186 | 0.078 | 0.13 | 0.068 |
| Model (11) | | | | | |
| $\hat{\alpha}$ | -0.377 | -39.711 | -0.375 | -0.12** | 0.443 |
| $\hat{\beta}_1$ | -0.016 | 26.831 | 0.077 | -0.004 | 0.132 |
| $\hat{\beta}_2$ | 0.04* | 6.491 | 0.032* | 0.001 | -0.089** |
| $\hat{\beta}_3$ | -0.003 | -0.696 | -0.002 | -0.0003 | 0.005* |
| $\hat{\beta}_4$ | -0.028 | -2.486 | -0.015 | 0.001 | 0.037 |
| \bar{R}^2 | 0.066 | 0.198 | 0.094 | 0.135 | 0.091 |

*, ** and *** denote statistical significance on 10%, 5% and 1%. \bar{R}^2 denotes the adjusted coefficient of determination.

$$POL_{it} = \alpha_i + \lambda_t + \beta_1 GDP_{it} + \beta_4 PR_{it} + \delta D_{it} + \varepsilon_{it}, \quad (12)$$

$$POL_{it} = \alpha_i + \lambda_t + \beta_1 GDP_{it} + \beta_2 GDP_{it}^2 + \beta_4 PR_{it} + \delta D_{it} + \varepsilon_{it}, \quad (13)$$

and

$$POL_{it} = \alpha_i + \lambda_t + \beta_1 GDP_{it} + \beta_2 GDP_{it}^2 + \beta_3 GDP_{it}^3 + \beta_4 PR_{it} + \delta D_{it} + \varepsilon_{it}, \quad (14)$$

where D_{it} denotes binary variable for county i in time t , equal to 1 for years 2013-2016 and 0 otherwise. Model (12) is estimated for CO, CO₂ and SO₂, model (13) for NO₂ and model (14) for PM₁₀, with the results shown in Table 16. It can be seen that the binary variable is significant

for all pollutants except CO. Its value is negative, which means that the Croatia's accession to EU had a negative impact on pollution, i.e. pollution has diminished in the last several years. The impact was the greatest for the SO₂ pollutant.

Results in Table 16 have been re-estimated with differenced variables as well, with the results shown in Table 17. Now, every variable becomes insignificant in all models for all pollutants. Thus, by observing data in differences, which could be interpreted as short-term analysis, no significant results were found. Moreover, due to having a small number of yearly data available for this study, the results should be observed with caution.

Table 16. Results of estimation of models (12), (13) and (14) for all pollutants

| Estimations | CO | CO ₂ | NO ₂ | PM ₁₀ | SO ₂ |
|-----------------|-------|-----------------|-----------------|------------------|-----------------|
| $\hat{\alpha}$ | 5.9 | 4.56** | 14.74 | 458.65** | 0.77 |
| $\hat{\beta}_1$ | -1.56 | 0.39 | -20.02 | -768.65** | 0.15 |
| $\hat{\beta}_2$ | -1.68 | -1.2 | 0.61 | 8.46*** | -0.57 |
| $\hat{\beta}_3$ | - | - | 6.22* | 410.41** | - |
| $\hat{\beta}_4$ | - | - | - | -72.29** | - |
| $\hat{\delta}$ | -0.09 | -0.07*** | -0.12*** | -0.2** | -0.22*** |
| \bar{R}^2 | 0.86 | 0.96 | 0.91 | 0.75 | 0.83 |

*, ** and *** denote statistical significance on 10%, 5% and 1%.

Table 17. Results of estimation of models (12), (13) and (14) for all pollutants, differenced variables

| Estimations | CO | CO ₂ | NO ₂ | PM ₁₀ | SO ₂ |
|-----------------|--------|-----------------|-----------------|------------------|-----------------|
| $\hat{\alpha}$ | -0.267 | 6.947 | -0.357 | 0.732 | 0.121 |
| $\hat{\beta}_1$ | -0.119 | -13.119 | 0.084 | 0.004 | 0.154 |
| $\hat{\beta}_2$ | 0.008 | 0.725 | 0.023 | 0.005 | -0.013 |
| $\hat{\beta}_3$ | - | - | -0.002 | -0.0003 | - |
| $\hat{\beta}_4$ | - | - | - | -0.006 | 0.036 |
| $\hat{\delta}$ | 0.382 | 17.721 | 0.139 | 0.124 | -0.565 |
| \bar{R}^2 | 0.032 | 0.142 | 0.062 | 0.124 | 0.028 |

*, ** and *** denote statistical significance on 10%, 5% and 1%.

Since some research explains that effects of economic development on pollution decreasing is not instantaneous (see Halkos, 2003 or Taguchi, 2012), Granger test of causality between each pollutant and GDP is observed additionally. This is conducted in order to test for lagged effects of GDP on the pollution. Results are shown in table 18, where it can be seen that at lag 1 (one year) no Granger causality can be confirmed on usual levels of significance. At lag 2, GDP Granger causes NO₂ (at 5% significance level), while pollutants CO₂ and PM₁₀ Granger cause GDP (again, at 5%). This can be interpreted as economic development having impact on NO₂ emissions with a two year lag, which could have been a result of

Petrokemija lowering ammoniac production in 2009, HEP Group (Hrvatska Elektroprivreda) investing over 17 mil Euros into TE Plomin to lower nitrogen oxide emissions in 2014 and similar investments into more sustainable production and development in Croatia. Since Croatia ratified the Kyoto Protocol in 2007, emissions of CO₂ are being lowered every year in order to reach the goal by 2020. It is expected that all pollutants will drop even more due to European Parliament and Council signing the new National Emissions Ceilings (NEC) Directive, which entered into force on 31st December 2016, as well as ratifying the Gothenburg Protocol. By focusing on the Dumitrescu-Hurlin (2012) test, the GDP causes only NO₂

and SO₂ with one year lag apart (10% and 5%). Thus, there is weak evidence of the observed causalities between the GDP and pollution in the observed period.

for any pollutant and GDP. Again, results should be taken with some caution due to small number of time series observations.

If the same analysis is conducted over the differenced data (please see Table 19), no causality could be found

Table 18. Results of Hausman test for models (9), (10) and (11) Granger causality test between pollution and economic development, variables in levels

| Test/pollutant | Lag | CO | CO ₂ | NO ₂ | PM ₁₀ | SO ₂ |
|--------------------------------|-----|-------|-----------------|-----------------|------------------|-----------------|
| Stacked data Granger causality | | | | | | |
| GDP → POL | 1 | 0.002 | 0.228 | 0.474 | 0.078 | 0.192 |
| | 2 | 0.336 | 1.962 | 4.415** | 0.293 | 0.645 |
| POL → GDP | 1 | 0.588 | 1.217 | 0.049 | 0.819 | 0.086 |
| | 2 | 1.451 | 4.007** | 2.153 | 3.823** | 0.108 |
| Dumitrescu-Hurlin (2012) test | | | | | | |
| GDP → POL | 1 | 1.702 | 1.478 | 4.492*** | 2.384 | 3.779** |
| POL → GDP | 1 | 1.563 | 2.218 | 2.111 | 2.027 | 2.589 |

GDP → POL denotes causality test where GDP is cause and pollution is consequence. POL → GDP denotes test where pollution is cause and GDP is consequence. *, ** and *** denote statistical significance on 10%, 5% and 1%. Dumitrescu-Hurlin (2012) test was tested up to only lag 1 due to insufficient number of data for lag 2.

Table 19. Granger causality test between pollution and economic development, variables in differences

| Test/pollutant | Lag | CO | CO ₂ | NO ₂ | PM ₁₀ | SO ₂ |
|--------------------------------|-----|-------|-----------------|-----------------|------------------|-----------------|
| Stacked data Granger causality | | | | | | |
| GDP → POL | 1 | 0.002 | 0.228 | 0.474 | 0.078 | 0.192 |
| | 2 | 0.336 | 1.962 | 4.415** | 0.293 | 0.645 |
| POL → GDP | 1 | 0.588 | 1.217 | 0.049 | 0.819 | 0.086 |
| | 2 | 1.451 | 4.007** | 2.153 | 3.823** | 0.108 |

GDP → POL denotes causality test where GDP is cause and pollution is consequence. POL → GDP denotes test where pollution is cause and GDP is consequence. *, ** and *** denote statistical significance on 10%, 5% and 1%.

CONCLUSIONS

Since the beginning of 1990s, opinions on the relationship between economic development and pollution have been getting more profound. The EKC curve is being tested and modified in order to explore the consequences of economic growth on environment and the sustainable development. Sustainable development, according to the EKC theory, should not present a problem when an economy reaches a certain level of income.

This paper explored several functional forms of the EKC relationship for five different pollutants and economic development in Croatia. Since previous literature on this subject is scarce, basic information for Croatian counties could have been obtained in this study. The results indicate that a weak positive linear relationship exists between the majority of pollutants and income in Croatia by observing data in levels. This is contrary to the EKC theory. However, these conclusions could be a result of the time sample period, which included years in the economic crisis and afterwards. Since the available sample period was relatively short, the results could be also interpreted as the short run dynamics. Other studies which have more available data observe the short and long run dynamics simultaneously. Some other shortfalls of the study were as follows. Only yearly data could have been observed, due to measurement of the pollutants. This limits the results and their interpretations, due to possibility of not finding meaningful relationship due to having a small sample. Future work should extend the existing sample to re-evaluate the results. However, the initial results here are in line with previous research of Croatia regarding the short term, which gives hope to obtaining some relevant information on the EKC relationship. Moreover, only air pollution was observed, again due to availability of data. It would be interesting to observe other forms of pollution (such as water and ground pollution; which are important, especially in tourist-oriented counties).

Several recommendations can be given. A greater volume data is available today on the future plans, actions and the results from many different government agencies

and other bodies. Thus, citizens of a country can get easier informed about the whole process of achieving the sustainable development, not only in tourism sector, but for other sectors of the economy. By being more informed, citizens and non-government institutions could make more pressure on the general and local governments to enhance environmental regulations, plans and actions to achieve the goals. Next, the utilization of European Union funds for sustainable development, tourism and economy should be enhanced. As of now, Croatia utilizes very little percentage of available funds available (European Commission, 2019 states that the spent/carried out sources out of planned were merely 1% in 2015, 3% in the following year, with 9% and 17% in 2017 and 2018). Thus, greater improvement of sustainable development overall, especially for the less developed counties could be obtained via the EU funding. In that way, environmentally friendly industries could be developed in future. Moreover, a lot of problems which were generated in tourism dependent counties in the late 1990s and early 2000s, such as the non-planning of infrastructure when building the accommodation capacities have to be sanitized as well (for details, please see Institute for Tourism in Croatia, 2016 or Škrinjarić, 2018). Finally, taxes on pollution could be one of the answers, in order to make somewhat pressure on major industry pollutants, with subsidies given to environmentally oriented firms.

Future research should expand the time span of data in order to compare the results with this research. Moreover, since tourism plays an important role in Croatia and its GDP, pollution pressures and EKC relationship should be explored in this sector as well.

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