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Online Appendix: How should we measure environmental policy stringency? A new approach

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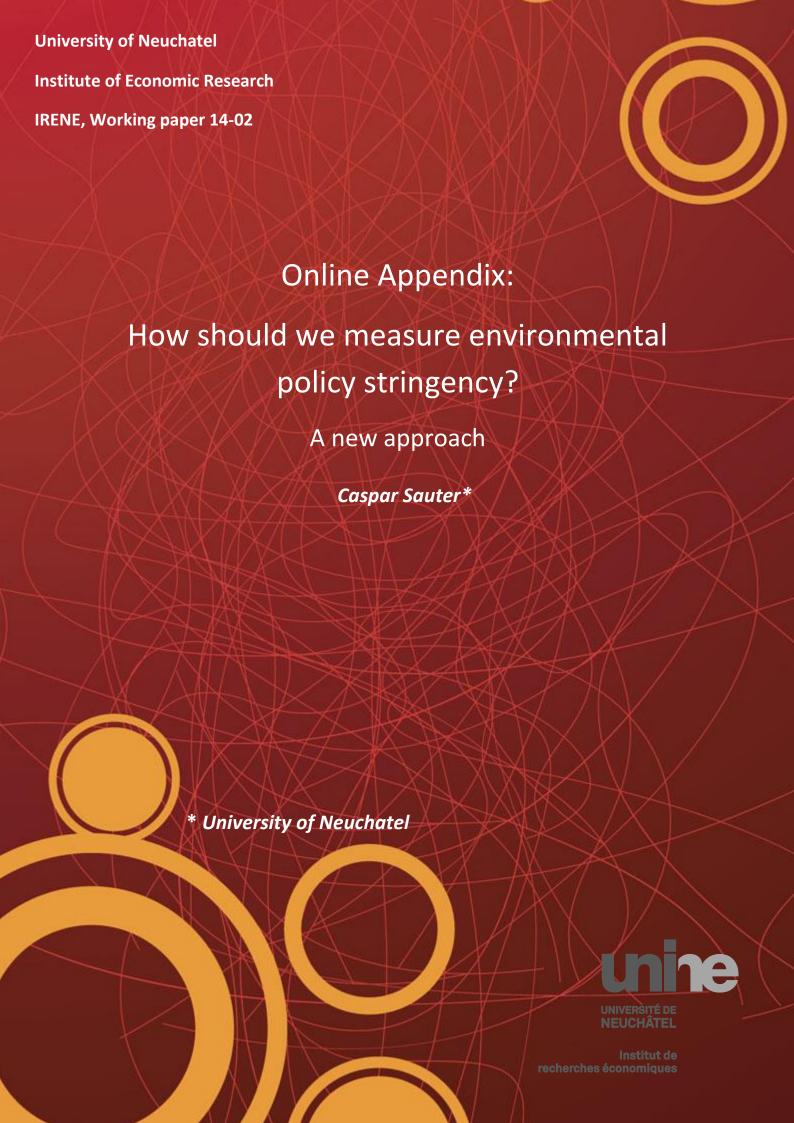
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# Online Appendix:

How should we measure environmental policy stringency?

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#### Abstract

This is the online appendix to the paper "How should we measure environmental policy stringency? A new approach" (Sauter, 2014). The main paper outlines the general methodology proposed to construct environmental policy indexes and proposes a first implementation of a  $CO_2$  input index and a  $CO_2$  performance index. This online appendix reports the results of the implementation of a  $SO_2$  input index, a  $SO_2$  performance index, a  $CH_4$  input index, a  $CH_4$  performance index as well as the broad GHG input index. All of those indexes have been constructed using the methodology outlined in the main paper.

Keywords: Greenhouse gas emissions, environmental regulation, environmental policy stringency, policy stringency index,  $CO_2$  emissions

# 1. $SO_2$ indexes

All the indexes have been constructed using the methodology outlined in the main paper at the example of a  $CO_2$  policy. In case of  $SO_2$  two important comments have to be made:

- 1) For the construction of the narrow  $SO_2$  input index, a total of 240  $SO_2$  policies have been identified using ECOLEX. Out of those 240 policies, 14 are only applied on a sub-national level.
- 2) For the construction of the  $SO_2$  performance indicator I used the same approach as in the  $CO_2$  case described in the main paper. The database used doesn't report sulphur dioxide but sulphur oxide  $(SO_X)$ , hence the constructed performance index has to be interpreted as a  $SO_X$  performance index. The variables used to construct the sectoral performance indicator and the mean of the pca weights used to construct it are summarized in Table (1):

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<sup>&</sup>lt;sup>☆</sup>JEL classification: Q50, Q53, Q58, C18

Table 1: Sectoral  $SO_X$  performance sub-indicators

Indicator	Description	Mean weight	Dimension
$\frac{\text{sectoral } SO_X \text{ emissions } 1}{\text{sectoral } SO_X \text{ emissions } 2}$	Sectoral $SO_X$ per sectoral GDP	0.443	~~
$\frac{\text{sectoral } SO_X \text{ emissions}}{\text{sectoral work force}}$ 2	Sectoral $SO_X$ per sectoral workforce	0.411	$SO_X$ intensity
$EE_t$	$SO_X$ efficiency score (profit function)	0.545	
$EE_t^*$	$SO_X$ efficiency score (revenue function)	0.551	$SO_2$ efficiency

### 1.1. $SO_2$ results

To obtain an overview, Figure (1) displays the evolution of the narrow  $SO_2$  input index and the  $SO_X$  performance index by country. Note that due to the different data-sources, not all indexes are available for all countries.

To empirically assess whether the constructed indexes measure what they are supposed to I pursue the same strategy as in the main paper. First I compare the input (performance) index to existing input (performance) indexes and second I compare the input index to the performance index and verify that the expected relation holds. Table (2) reports the pairwise correlations of the country-means<sup>3</sup> of the indexes.

The first set of benchmark indexes are the two input indexes measuring Air Policy Stringency constructed by (Knill et al, 2012). Both air policy indexes show a strongly positive and highly significant correlation with the narrow  $SO_2$  input index. The higher  $SO_2$  input policy stringency the higher air policy input stringency, a result which has been expected. As a second benchmark the WEF survey index<sup>4</sup> is used (Browne et al, 2012). I expect that the opinion of the survey respondents on environmental policy stringency should be positively correlated with the  $SO_2$  input index. This is the case, the correlation is positive and significant. Looking at the performance index, we observe again a positive and significant correlation with the EPI, the overall environmental performance index of Yale. As a second benchmark for the performance index the lead content of gasoline index has been taken. Here we observe a negative and significant correlation. Indicating that a better  $SO_X$  performance is paralleled by a lower lead content in gasoline concentration, a result which has been expected.

Looking at the relationship between input and performance index, the strong and highly significant correlation are in accordance with our expectations: a higher  $SO_2$  input stringency goes hand in hand with a higher  $SO_X$  performance. Figure (2) plots the mean value of the two indexes by country, including a linear fit and the corresponding

<sup>&</sup>lt;sup>1</sup>Note that this variable has been re-scaled. Each observed value is subtracted from the observed maximum (max) of the variable, then the minimum (min) of the variable is subtracted: (max-observation)-min. With this transformation higher values now indicate a better performance.

<sup>&</sup>lt;sup>2</sup>See: footnote 1.

<sup>&</sup>lt;sup>3</sup>I use country means and not each observation available to avoid that the pairwise correlations capture trends. In the single observation case (not displayed) the correlations are stronger and more significant but the same overall tendencies hold.

 $<sup>^4</sup>$ Even if the WEF survey index is not an input index, I use this index as a benchmark due to it's wide usage in the literature.

confidence interval for the mean value of the performance index given the different input index values. One can observe a clear tendency: the higher the mean value of the  $SO_2$  input index, the higher the mean  $SO_X$  performance by country. Figure (3) shows the difference between the last and the first year of the performance index on the y-axis and of the input index on the x-axis. Again a simple linear fit and the corresponding confidence interval is displayed. The result goes in the expected direction and is even stronger than in the  $CO_2$  case displayed in the main paper.

As in the  $CO_2$  case discussed in the main paper, results seem to indicate that the indexes measure what they are supposed to.

Table 2: Pairwise correlations of the means of the variables

	Narrow SO2 II	Air Policy II 1	Air Policy II 2	WEF	SOX PI	EPI	lead
Narrow SO2 II	1						
Air Policy II 1	.691**	1					
Air Policy II 2	.661**	.905***	1				
WEF	.411**	139	.0466	1			
SOX PI	.605***	.108	.274	.478**	1		
EPI	.298*	.144	.273	.660***	.419**	1	
lead	320	0938	235	544***	530**	553***	1

<sup>\*</sup> p < 0.05, \*\* p < 0.01, \*\*\* p < 0.001

Note: II stands for Input Index, PI for Performance Index. The Narrow  $SO_2$  Input Index and the  $SO_2$  Performance Index have been constructed by the above outlined methodology. The Air Policy Input Index 1 and 2 are taken from Knill et al (2012). The WEF survey index is taken from Browne et al (2012). The Environmental Performance Index (EPI) is taken from Emerson et al (2012) and the lead content of gasoline (Lead) index is taken from Grether et al (2012).

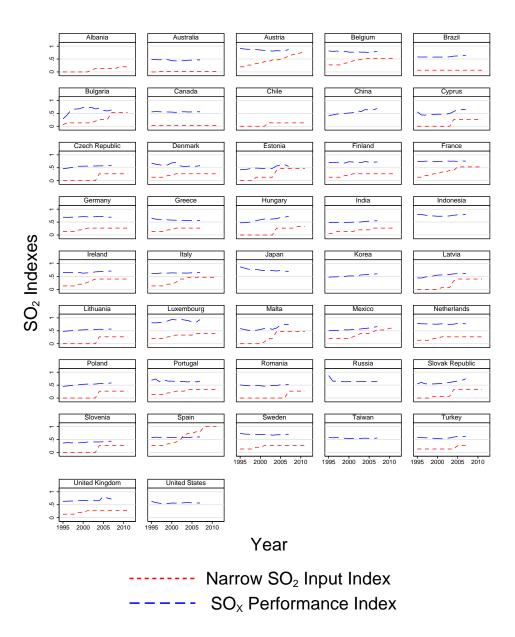


Figure 1: The  $SO_2$  input indexes and the  $SO_X$  performance index by country

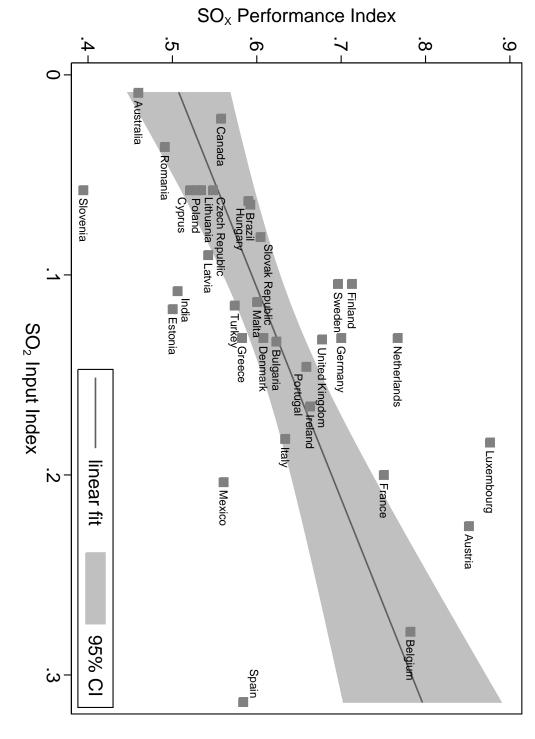
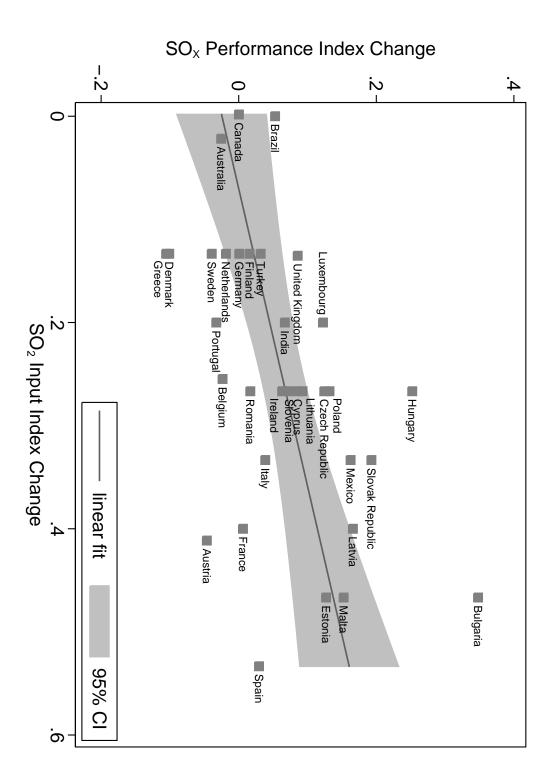


Figure 2: Mean of the narrow  $SO_2$  input index and the  $SO_X$  performance index by country



### 2. $CH_4$ Indexes

All the indexes have been constructed using the methodology outlined in the main paper at the example of a  $CO_2$  policy. In case of  $CH_4$  two important comments have to be made:

- 1) For the construction of the  $CH_4$  input index, a total of only 53  $CH_4$  policies have been identified using ECOLEX. Out of those 53 policies, 6 are applied on a subnational level. This really limited number of  $CH_4$  policies and therefore the small variation in the  $CH_4$  input index limit the use of the narrow methane input index considerably.
- 2) For the construction of the  $CH_4$  performance indicator I used the same approach as in the  $CO_2$  case described in the main paper. The variables used to construct the sectoral performance indicator and the weights used to construct it are summarized in Table (3):

Indicator Description Mean weight Dimension sectoral  $CH_4$  emissions Sectoral  $CH_4$  per sectoral GDP 0.453 $\frac{\text{sectoral GDP}}{\text{sectoral } CH_4 \text{ emissions}}$  $CH_4$  intensity Sectoral  $CH_4$  per sectoral workforce 0.449 sectoral work force  $\overline{E}E_t$  $CH_4$  efficiency score (profit function) 0.529  $CH_4$  efficiency  $CH_4$  efficiency score (revenue function)  $EE_t^*$ 0.538

**Table 3:** Sectoral  $CH_4$  performance sub-indicators

# 2.1. $CH_4$ results

Figure 4 displays the evolution of the  $CH_4$  input and performance indicator by country. Given the absence of a lot of methane specific laws the input index displays a very limited variability over time and space.

Table 5 displays the pairwise correlation of the means of the variables. The narrow  $CH_4$  index is positively and significantly correlated with the Air Policy indexes of Knill et al (2012). There is no significant correlation between the  $CH_4$  input indicator and the WEF index. The small number of explicit  $CH_4$  laws seems to limit the input indicator approach considerably. Looking at the performance indicator, there is a positive and significant correlation between the  $CH_4$  performance indicator and the EPI of Yale. And a negative and significant correlation between the performance index and the lead content of gasoline. Both results indicate that the performance index is measuring what he is supposed to.

<sup>&</sup>lt;sup>5</sup>Note that this variable has been re-scaled. Each observed value is subtracted from the observed maximum (max) of the variable, then the minimum (min) of the variable is subtracted: (max-observation)-min. With this transformation higher values now indicate a better performance.

<sup>&</sup>lt;sup>6</sup>See: footnote 5.

For the sake of completeness I included Figure 5 and 6 despite the fact that comparisons between the performance and input index make only limited sense given the small numbers of explicit  $CH_4$  laws. The correlation between the two is positive but not significant and Figure 5 displays a relationship which goes in the expected direction. Figure 6 however displays a result which is not in accordance with the expectation.

Overall, the  $CH_4$  performance indicator seem to work as intended. However, the small number of explicit  $CH_4$  laws clearly exemplifies one of the limits of the proposed input index approach.

Table 4: Pairwise correlations of the means of the variables

-	Narrow CH4 II	Air Policy II 1	Air Policy II 2	WEF	CH4 PI	EPI	lead
Narrow CH4 II	1						
Air Policy II 1	.710**	1					
Air Policy II 2	.769**	.905***	1				
WEF	.0778	139	.0466	1			
CH4 PI	.255	00817	.139	.430**	1		
EPI	.0264	.144	.273	.660***	.409*	1	
lead	161	0938	235	544***	355*	553***	1

<sup>\*</sup> p < 0.05, \*\* p < 0.01, \*\*\* p < 0.001

Note: II stands for Input Index, PI for Performance Index. The Narrow  $CH_4$  Input Index, the Broad GHG Input Index and the  $CH_4$  Performance Index have been constructed by the above outlined methodology. The Air Policy Input Index 1 and 2 are taken from Knill et al (2012). The WEF survey index is taken from Browne et al (2012). The Environmental Performance Index (EPI) is taken from Emerson et al (2012) and the lead content of gasoline (Lead) index is taken from Grether et al (2012).

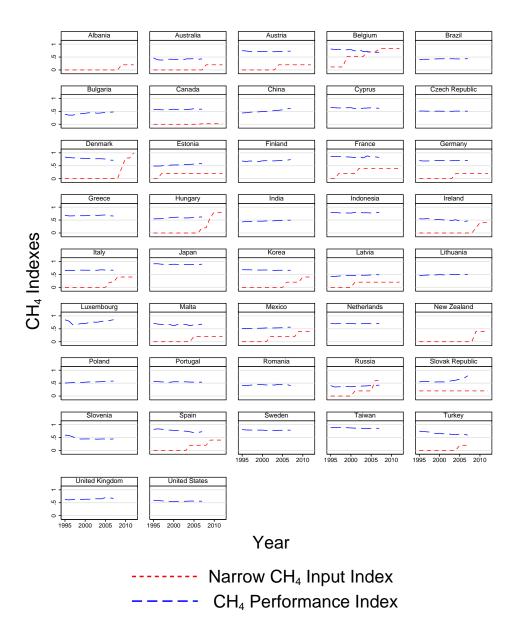
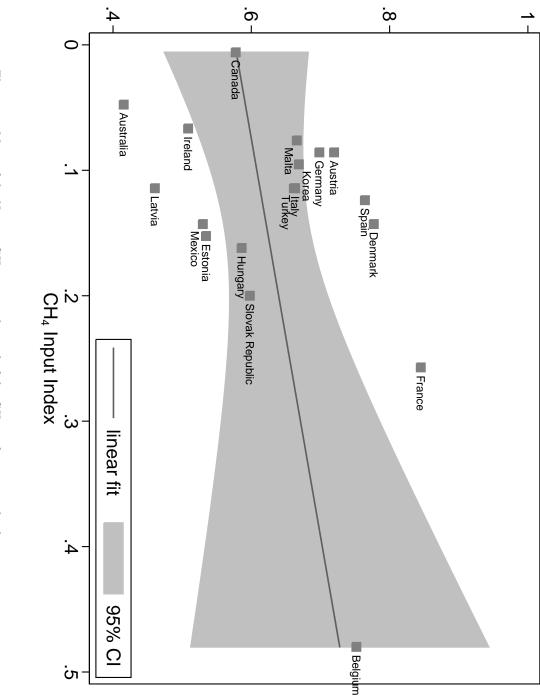


Figure 4: The  $CH_4$  input indexes and the  $CH_4$  performance index by country



CH<sub>4</sub> Performance Index

Figure 5: Mean of the Narrow  $CH_4$  input index and of the  $CH_4$  performance index by country

CH<sub>4</sub> Performance Index Change .2 0 Denmark ■ Slovak Republic Ireland Australia 'n Estonia
Hungary
Latvia
Mexico ■ Spain Austria Korea Malta Turkey Italy Germany CH<sub>4</sub> Input Index Change France linear fit . ი Russia Belgium 95% CI . დ

Figure 6: Change of the Narrow  $CH_4$  input index and of the  $CH_4$  performance index from the first to the last year in the sample

### 3. Broad GHG input index

The methodology and the data used to construct the broad GHG input index, as well as its conceptual advantages and disadvantages compared to gas specific input indexes are discussed in detail in the main paper. The following outlines the results of the empirical assessment of the broad input index.

The same strategy as for all the other indexes is followed. First the broad GHG input index is compared to other input indexes as well as to the WEF survey index. Second the relationship between the broad GHG input index and a general performance index (the Yale EPI) is tested.

**Table 5:** Pairwise correlations of the means of the variables

	Broad GHG II	Broad GHG II, tax	Air Policy II 1	Air Policy II 2	WEF	EPI	Lead
Broad GHG II	1						
Broad GHG II, tax	.880***	1					
Air Policy II 1	.166	.274	1				
Air Policy II 2	.231	.414	.905***	1			
WEF	.484***	.329*	139	.0466	1		
EPI	.493***	.416**	.144	.273	.660***	1	
lead	490**	448**	0938	235	544***	553***	1

\* p < 0.05, \*\* p < 0.01, \*\*\* p < 0.001

 $\overline{\text{Note:}}$  II stands for Input Index. The Broad GHG Input Index and the broad GHG Input Index, tax have been constructed by the above outlined methodology. The Air Policy Input Index 1 and 2 are taken from Knill et al (2012). The WEF survey index is taken from Browne et al (2012). The Environmental Performance Index (EPI) is taken from Emerson et al (2012) and the lead content of gasoline (Lead) index is taken from Grether et al (2012).

As shown in Table 5, the broad GHG input index is positively but not significantly correlated to the two air policy input indexes of Knill et al (2012). The lack of significance might be explained by an only partly overlapping sample. The GHG input index is on the other hand positively and highly significantly correlated to the WEF survey index, a result which has been expected. Moreover, comparing the overall broad GHG input index to the version of it where only tax laws have been retained shows also not surprisingly – a highly positive and significant correlation. It seems that overall the broad GHG input index is measuring what he is supposed to.

Comparing the GHG input index to two general performance indexes yields the expected results, there is a highly positive and significant correlation with the environmental performance index of Yale and a negative and highly significant correlation with the lead content of gasoline index. Those findings are supported by the results displayed in Figure 7 and Figure 8. As a next step, a general GHG performance index - constructed using the same methodology as for the gas specific ones - should be implemented to further strengthen the results.

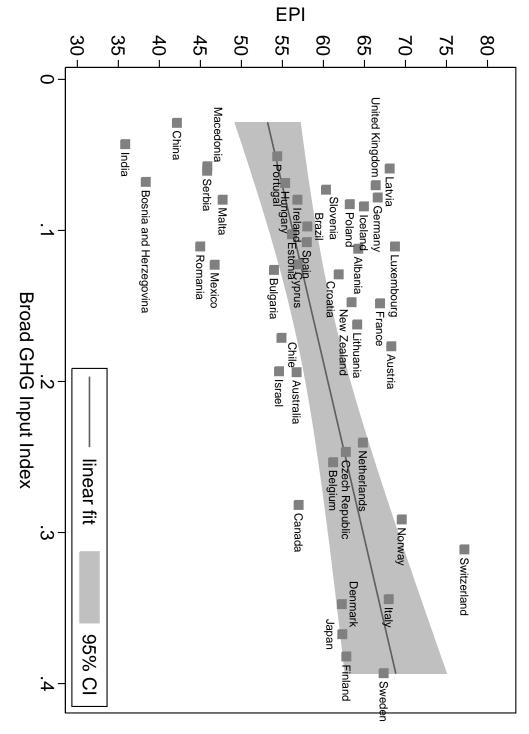


Figure 7: Mean of the Broad GHG input index and of the EPI

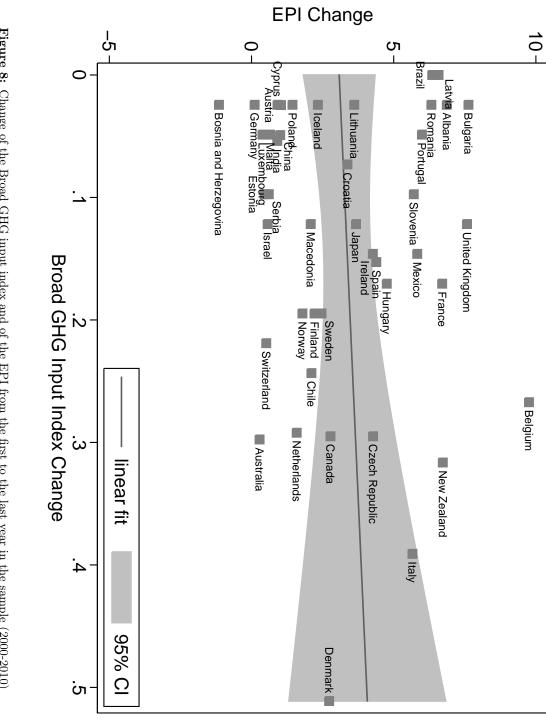


Figure 8: Change of the Broad GHG input index and of the EPI from the first to the last year in the sample (2000-2010)

# 4. References

- Browne C, Geiger T, Gutknecht T (2012) The executive opinion survey: The voice of the business community. In: The Global Competitivenens Report 20122013, World Economic Forum, pp 69–78
- Emerson J, Hsu A, Levy M, de Sherbinin A, Mara V, Esty D, Jaiteh M (2012) Environmental performance index and pilot trend environmental performance index. Tech. rep., Yale Center for Environmental Law and Policy
- Grether JM, Mathys N, de Melo JP (2012) Unraveling the worldwide pollution haven effect. Journal of Internatinal Trade and Development, Taylor and Francis Journals 21(1):131–162
- Knill C, Schulze K, Tosun J (2012) Regulatory policy outputs and impacts: Exploring a complex relationship. Regulation & Governance 6(4):427–444
- Sauter C (2014) How should we measure environmental policy stringency ? a new approach. IRENE Working Paper Series 14.1