

Greenhouse Gas Emission Comparisons with ANOVA

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2018-11-24

This report contains an inferential analysis regarding the Greenhouse Gas Emissions from 10 countries between 1990 and 2015. The analysis aims to find if there is a difference of greenhouse gas emissions (kt) across these countries in the past 25 years. An ANOVA was performed to determine whether there is any significant difference in GHG Emissions when observed, multiple comparisons on countries were performed. The data is obtained from the Greenhouse Gas Inventory Data of the United Nations Framework Convention on Climate Change.

Our hypothesis are as follows:

H_0 : There is no difference between the amount of Greenhouse Gas Emissions between the 10 nations from 1990 to 2015.

H_A : There is a difference between the amount of Greenhouse Gas Emissions between the 10 nations from 1990 to 2015.

Analysis on National Emissions

25 years of collected data shows emissions for each of the nine nations, these figures seem to display different patterns, with a group of nations having very similar emission volumes (Figure 1). The aim of this analysis is to find out whether there is a significant difference in greenhouse gas emissions among all the nations. Greenhouse gas emission and countries were analyzed by a one-way ANOVA, the significance level was set at $P < 0.05$, and pairwise comparisons between the multiple nation's were evaluated.

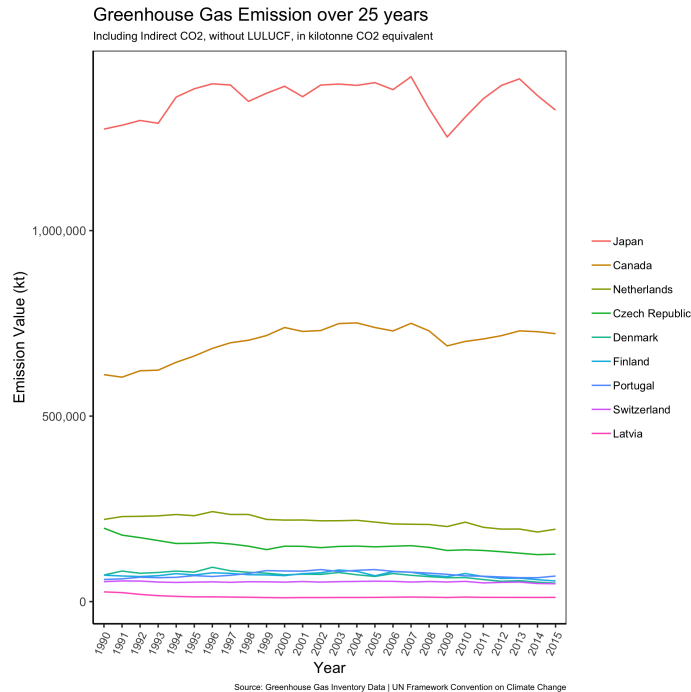


Figure 1: Initial Exploratory analysis of the data shows there looks to be a difference in emissions for some nations, but not all.

Statistical Summary of ANOVA:

Table 1: ANOVA test output

term	df	sumsq	meansq	statistic	p.value
Country	9	5.73925E+14	6.37695E+13	4536.75	<.001
Residuals	250	3.51405E+12	1.406E+10	NA	NA

The one-way ANOVA indicates that the greenhouse emission of the nine nations are significantly different from each other ($p\text{-value} < 0.05$). Additionally, pairwise comparisons were conducted to determine which nations are significantly different from each other (Figure 2).

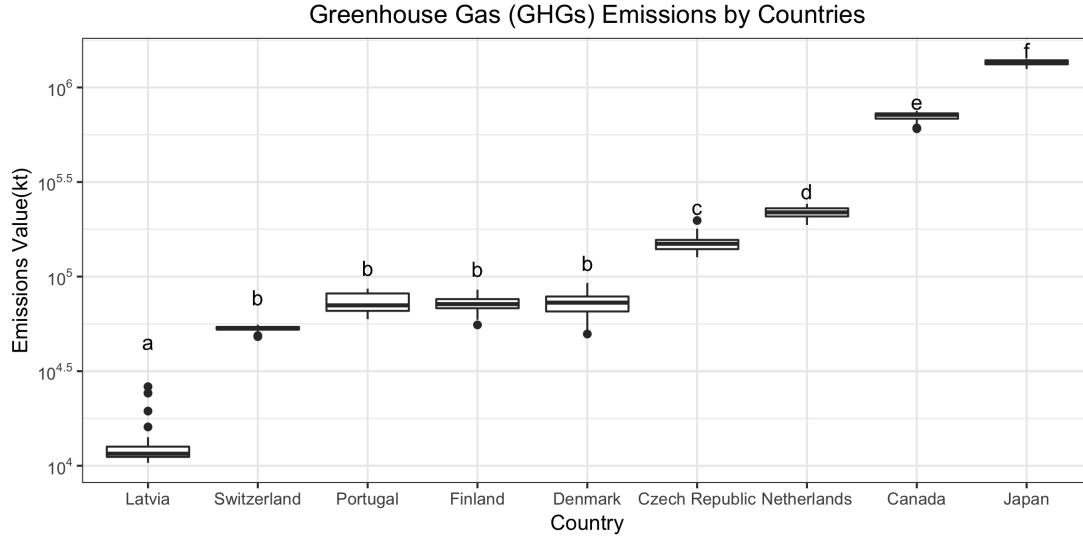


Figure 2: Greenhouse Gas Emission (kt) of nine different countries in the past 25 years. Different letters indicate significant differences between the groups (pairwise comparison, $p < 0.05$).

Interpretation of Findings:

Latvia demonstrated the least GHG emissions of all the countries, as research shows their government had established policies regarding renewable energy that resulted in 29.6 % of energy consumptions in 2009 to be renewable (Roos et al., 2012). Canada and Japan displayed significantly higher emission in the past 25 years. It is noted that Canada's greenhouse gas emission is originating from farming-related activities and oil production which requires a large amount of fossil-energy (Jarzen et al., 1998). Japan's high emission is due to the nation's reliance on natural gas and coal to generate electricity (Itawa, 2017).

Critics, limitations, and assumptions on analysis:

1. European Union data was removed as countries are not identified in the data and were aggregated, skewing the data presented.
2. If compositions of the EU nations included in this data source, we would be able to split the EU emission into countries or further apply normalization to smooth out differences.
3. In future analysis we should try our best to keep all the original data in our analysis. We could do some sort of transformation to scale data to be on same plane.
4. Future analysis can shed light on GHG Emission over the years and which countries are statistically improving or not improving on the reduction on GHG Emission using time-series analysis.

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