

LINEAR REGRESSION ON AIR POLLUTANTS VS CROP PRODUCTION

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STA302



RESEARCH QUESTIONS

1. DO AIR POLLUTANTS AFFECT CROP PRODUCTION?
2. WHICH POLLUTANTS HAVE THE INFLUENCE ON THE CROP YIELD?

Production of crop is associated with **food**, **animal feed**, **fiber**, **fuel** and so on.

=> Learning about the impacts of pollutants is important to protect **food safety**, **public health**, **maintain** and **promote sustainable agriculture**.



LITERATURE REVIEW

1. Review | [Published: 12 September 2022](#)

Crops' response to the emergent air pollutants

[Ram Kumar Shrestha](#), [Dan Shi](#), [Hikmatullah Obaid](#), [Nader Saad Elsayed](#), [Deti Xie](#), [Jiupai Ni](#) & [Chengsheng Ni](#) 

ACTION

Reviewing findings of previous research on the morphological, physiological and biochemical changes in important crops which is exposed to high level of air pollutants.

RESULT


Suggesting that the air pollutants appear to be harmful to crop yields and quality because air pollutants interfere with the photosynthesis process.

DATA AND METHODS

Literature review on major findings of crop's reaction to soil moisture, light, temperature, humidity, rain and interaction with sulfur dioxide, ozone, carbon dioxide, nitrogen oxide.

2. [Published: 18 April 2020](#)

Decoupling the climatic and carbon dioxide emission influence to maize crop production in Pakistan

[Abdul Rehman](#) , [Hengyun Ma](#) & [Ilhan Ozturk](#) 

ACTION

Studying the carbon dioxide's influence on the maize crop in Pakistan from 1988 to 2017.

RESULT

Maize production has positive coefficient with carbon dioxide emission (p value 0.0395).

DATA AND METHODS

ARDL approach and Granger causality test to check the dynamic linkage between carbon dioxide emission, maize crop production, area under maize crop, water availability, rainfall and temperature with the evidence of long-run and short-run.

$$CO_2e_t = f(MCP_t, AMC_t, WA_t, RF_t, TM_t) = \zeta_0 + \zeta_1 MCP_t + \zeta_2 AMC_t + \zeta_3 WA_t + \zeta_4 RF_t + \zeta_5 TM_t + \varepsilon_t$$

GASEOUS AIR POLLUTANTS : A REVIEW ON CURRENT AND FUTURE TRENDS OF EMISSIONS AND IMPACT ON AGRICULTURE

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ACTION

Studying the impact of air pollutants, including nitrogen oxides, sulfur dioxide, ozone, and particulate matter on crops and the overall affect on the economy.

RESULT

Air pollutants cause deleterious effects on physiology and metabolism of plants.

DATA AND METHODS

Literature review on major findings of sulfur dioxide, ozone, carbon dioxide, nitrogen oxide impact on crop growth.

DATASET #1

Sulphur Oxides
Sulphur Oxides
Nitrogen Oxides
Particulates (PM10)
Particulates (PM2.5)
Carbon Monoxide
Non-methane Volatile Organic Compounds

Total man-made emissions
Total Mobile Sources
Road Transport
Other Mobile Sources
Total Stationary Sources
Power stations
Combustion
Industrial combustion
Other combustion
Industrial processes and product use
Agriculture
Waste
Miscellaneous
Total emission intensities
Total emissions per capita
Total emissions per unit of GDP, Kg per 1000 USD
Total emissions, Index 2000 = 100
Total emissions, Index 1990 = 100

20XX

Emissions of air pollutants ⁱ

Customise Export My Queries						
→ Pollutant	Sulphur Oxides					
→ Variable	Total man-made emissions					
Unit	Tonnes, Thousands					
→ Year	1990	1991	1992	1993	1994	
→ Country						
Australia	1 585.19	1 569.96	1 652.02	1 742.30	1 764.29	
Austria	73.64	70.66	54.13	52.75	47.11	
Belgium	363.59	364.71	355.93	330.92	289.27	
Canada	3 010.73	2 793.20	2 670.82	2 582.74	2 371.14	
Chile	
Colombia	
Costa Rica	1.40	1.59	2.05	1.76	2.31	
Czech Republic	1 754.56	1 650.33	1 381.95	1 302.86	1 159.39	
Denmark	178.01	238.68	184.13	149.17	151.44	
Estonia	277.00	250.98	191.63	155.53	150.64	

Show: [Chart](#) [Map](#) [Table](#)

[Fullscreen](#) [Share](#) [Download](#) [My pinboard](#)

Wheat													
Location	2018	2019	2020	2021	2022	2023	2024	2025	2026	2027	2028	2029	2030
Argentina	3.094	2.862	2.567	2.941	2.970	3.008	3.035	3.059	3.090	3.123	3.155	3.188	3.220
Australia	1.692	1.485	2.400	2.021	2.049	2.081	2.108	2.135	2.163	2.193	2.222	2.251	2.280
Brazil	2.660	2.204	2.717	2.527	2.557	2.590	2.618	2.646	2.675	2.706	2.737	2.767	2.796
BRICS	3.715	3.762	3.803	3.755	3.782	3.808	3.834	3.858	3.885	3.911	3.938	3.965	3.991
Canada	3.274	3.384	3.512	3.390	3.492	3.529	3.563	3.597	3.633	3.670	3.707	3.745	3.781
Chile	6.286	6.004	5.980	6.010	6.039	6.077	6.105	6.129	6.160	6.193	6.225	6.258	6.289
China (People's Republic of)	5.417	5.631	5.742	5.597	5.619	5.646	5.665	5.688	5.710	5.733	5.756	5.779	5.801
Colombia	2.200	1.000	1.667	1.600	1.618	1.641	1.666	1.690	1.718	1.744	1.771	1.798	1.824
Egypt	6.296	6.383	6.316	6.466	6.545	6.644	6.747	6.849	6.961	7.071	7.182	7.295	7.406

Perspectives

Wheat, Rice, Maize, Soybean (4/4)

☒ Compare variables

Tonnes/hectare

Countries

Highlighted Countries (0)

Time

yearly quarterly monthly

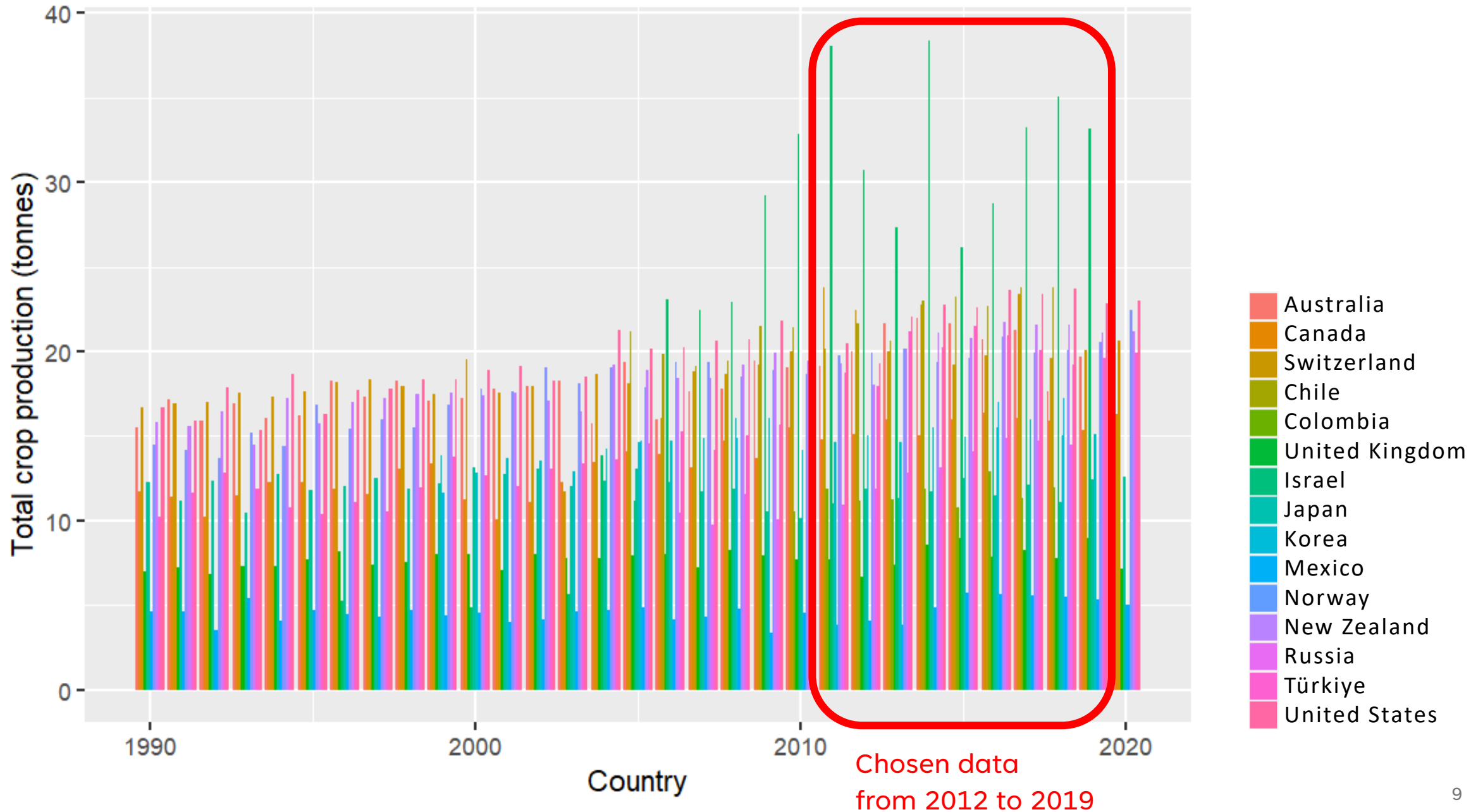
☐ latest data available

8

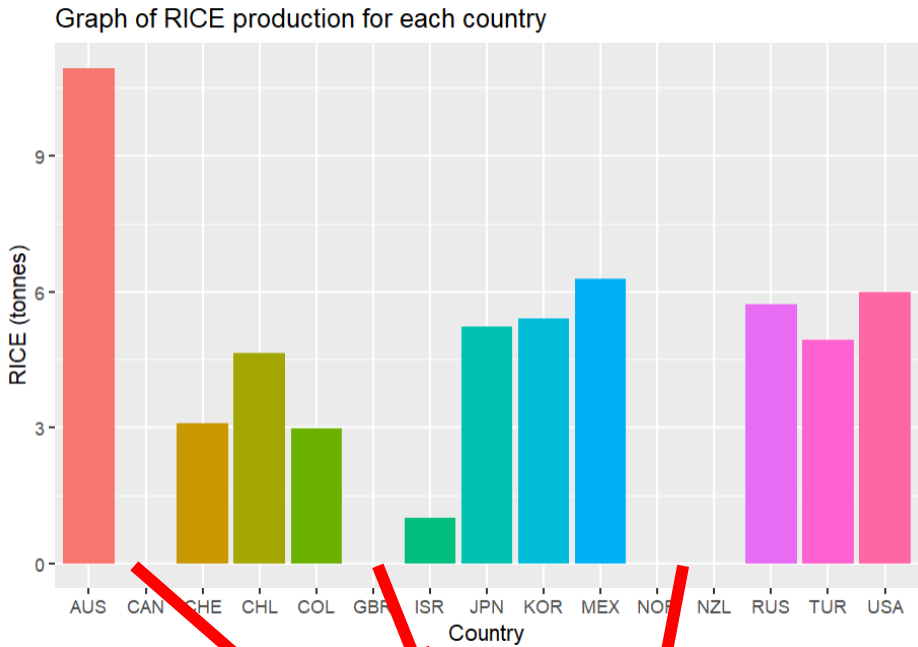
< 2018 – 2030 >

DATASET #2

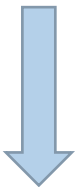
Graph of total crop production for each country



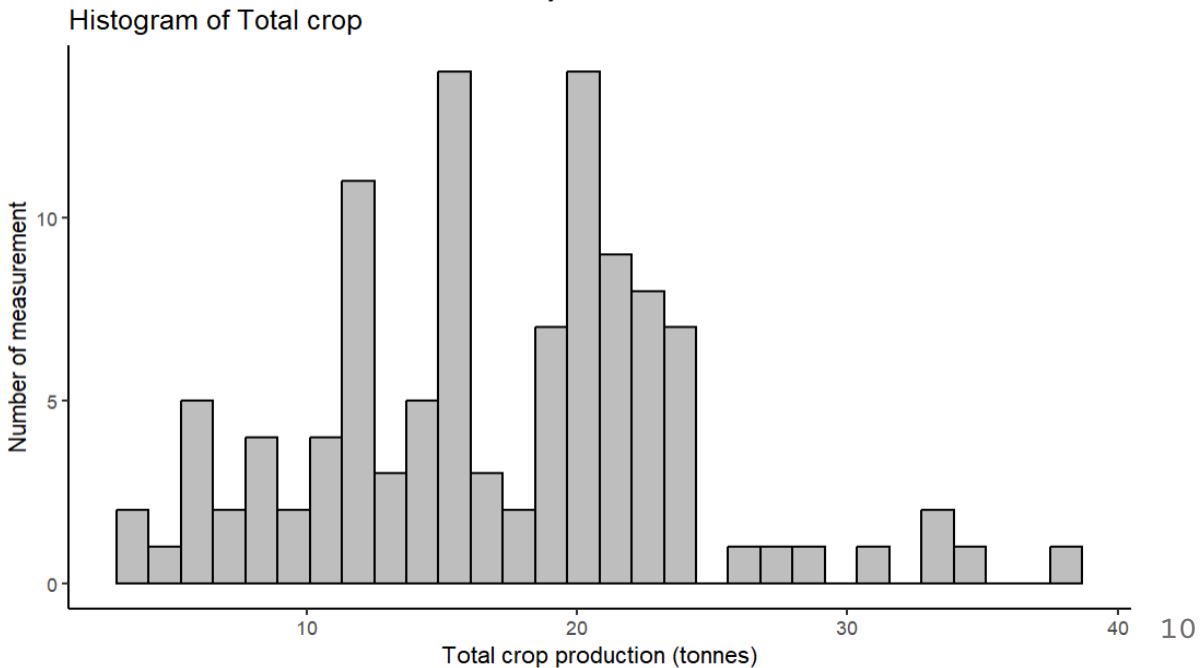
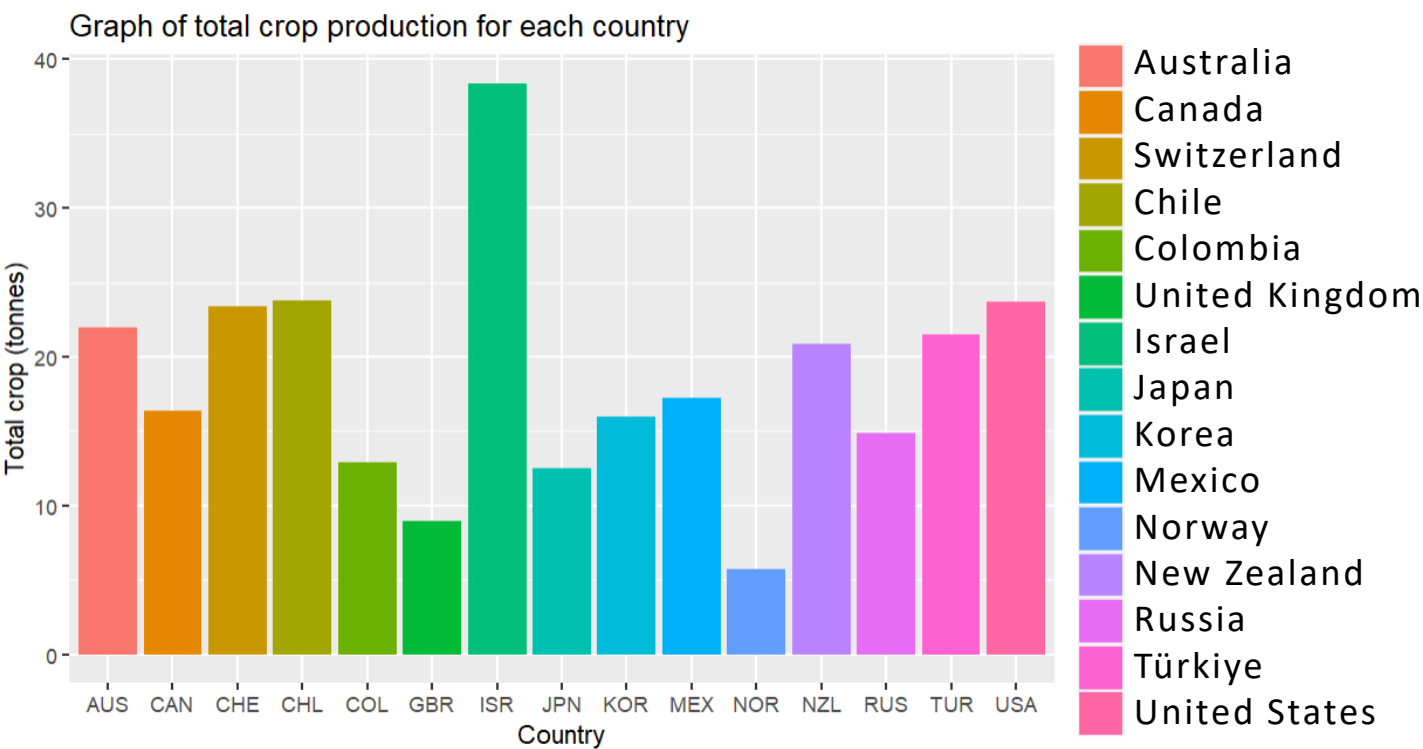
Crop Production Data



Do not have data

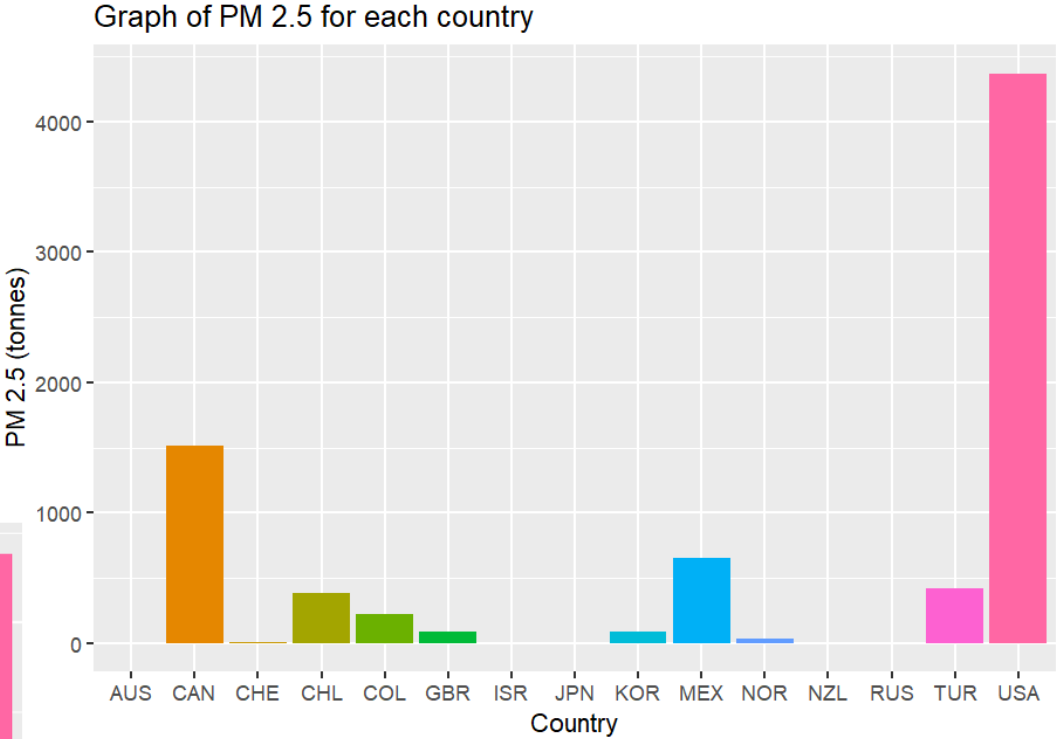
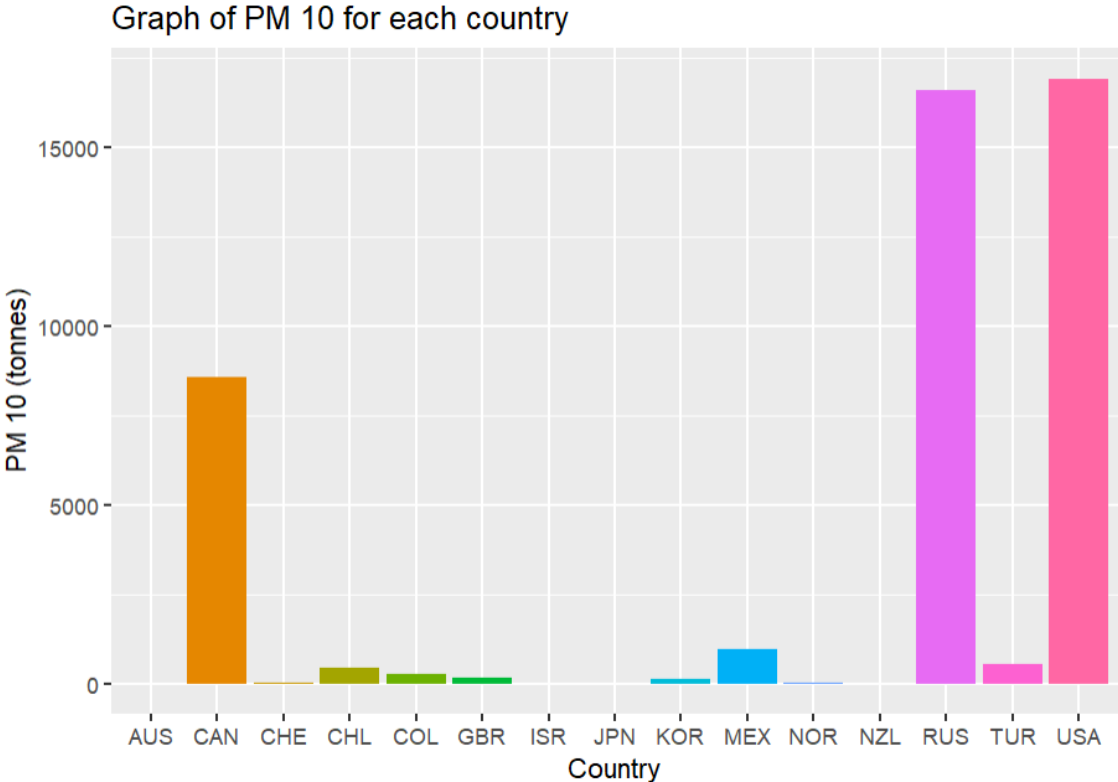


Total production =
WHEAT + RICE + MAIZE + SOYBEAN



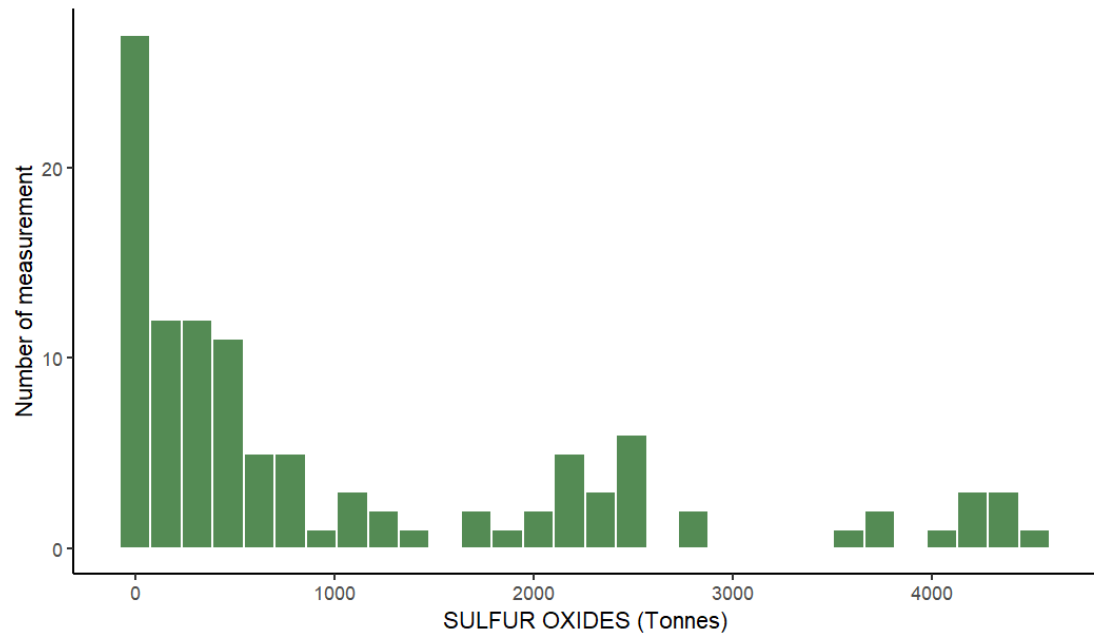
Air Pollutants Data

- Australia
- Canada
- Switzerland
- Chile
- Colombia
- United Kingdom
- Israel
- Japan
- Korea
- Mexico
- Norway
- New Zealand
- Russia
- Türkiye
- United States

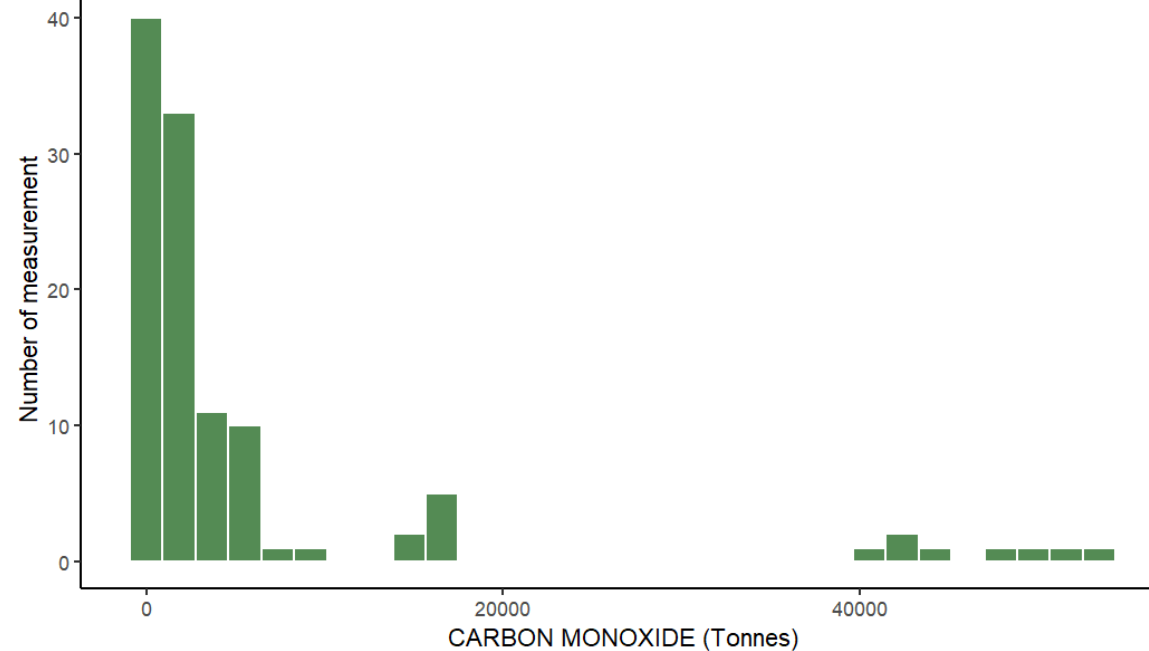


Lack of data on Particulates 10
and Particulates 2.5
-> do not consider

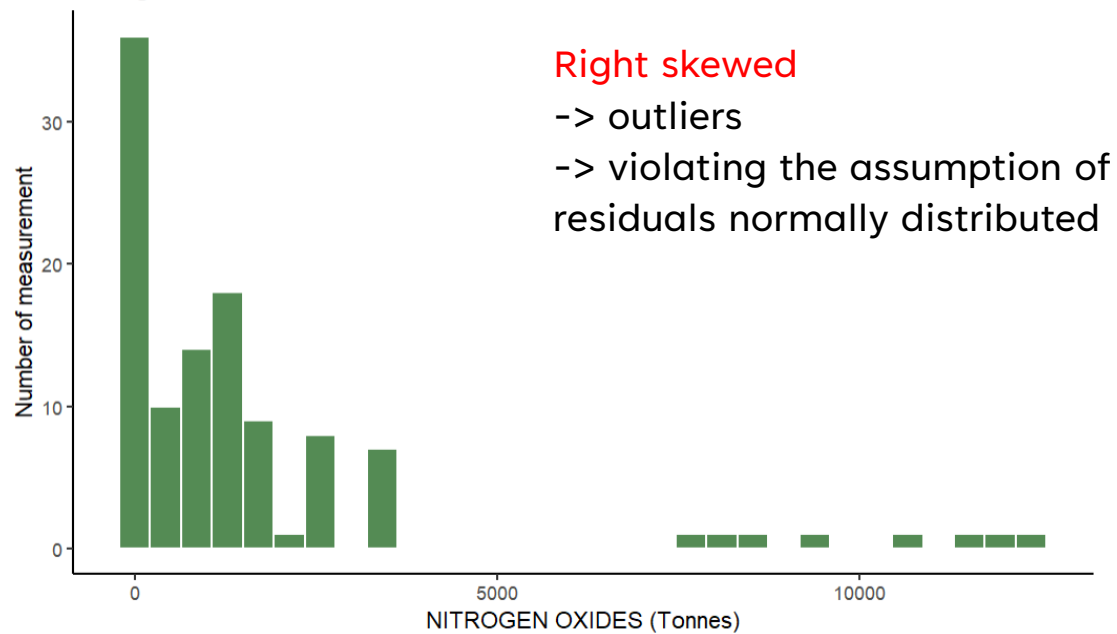
Histogram of SULFUR OXIDES



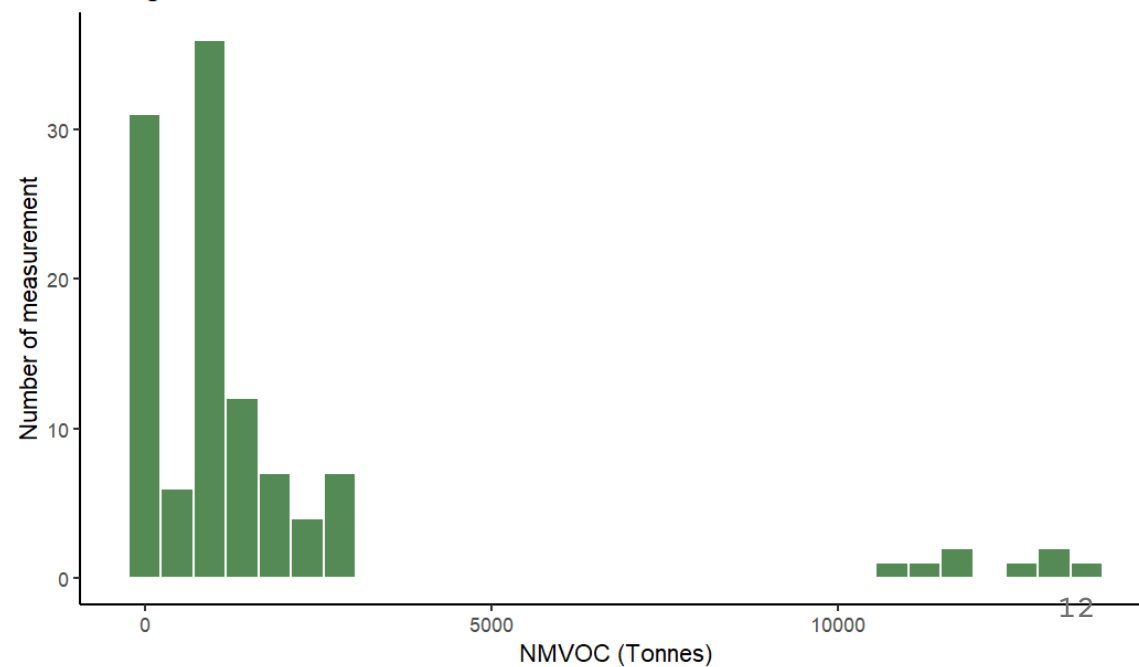
Histogram of CARBON MONOXIDE



Histogram of NITROGEN OXIDES



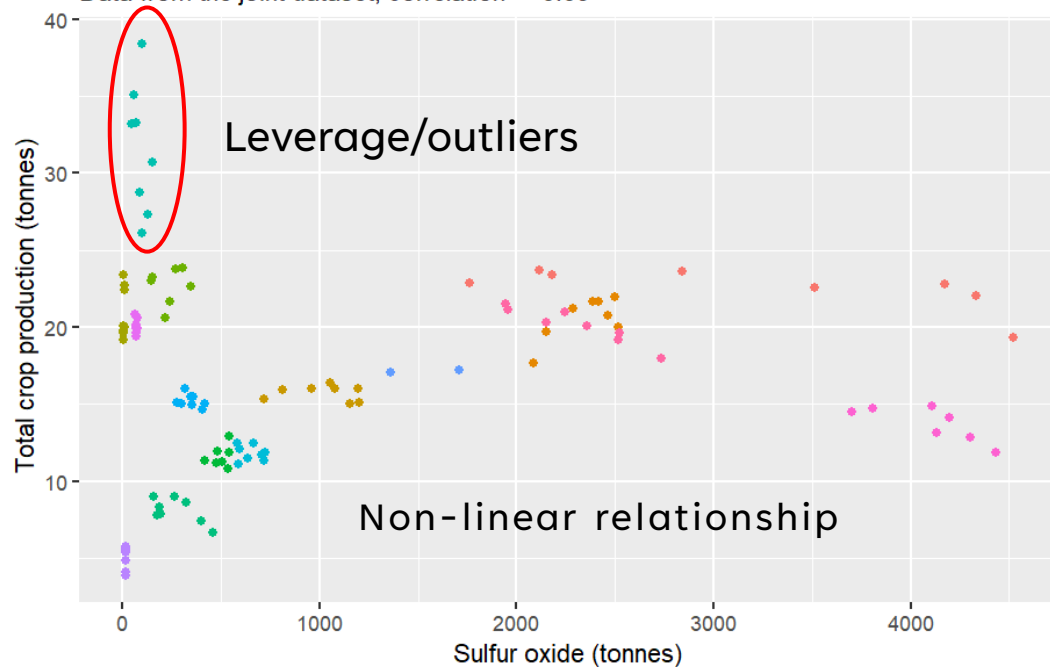
Histogram of NMVOC



CORRELATION

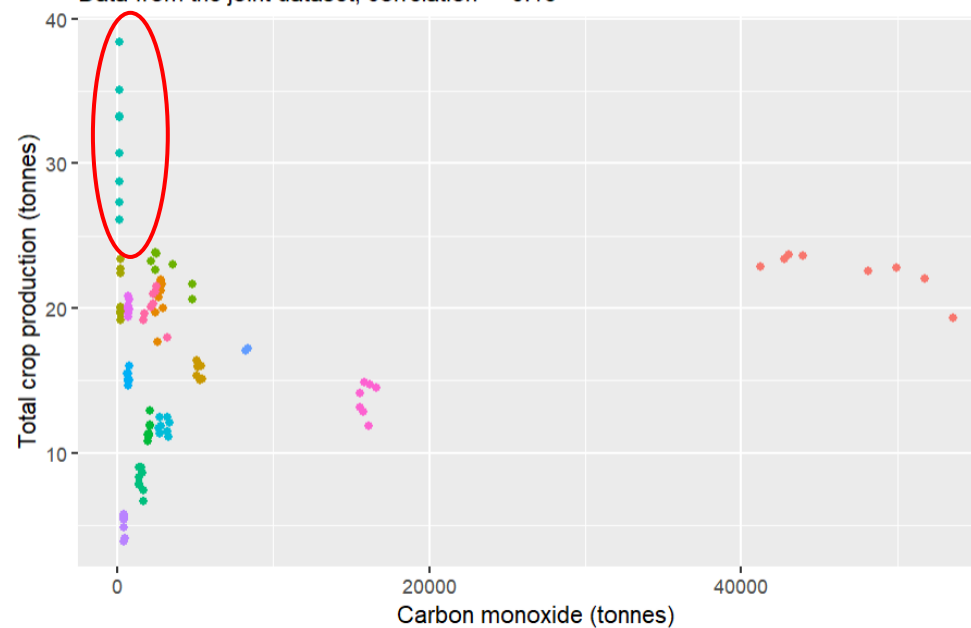
Scatter plot of Sulfur oxide and total crop production

Data from the joint dataset, correlation = 0.09



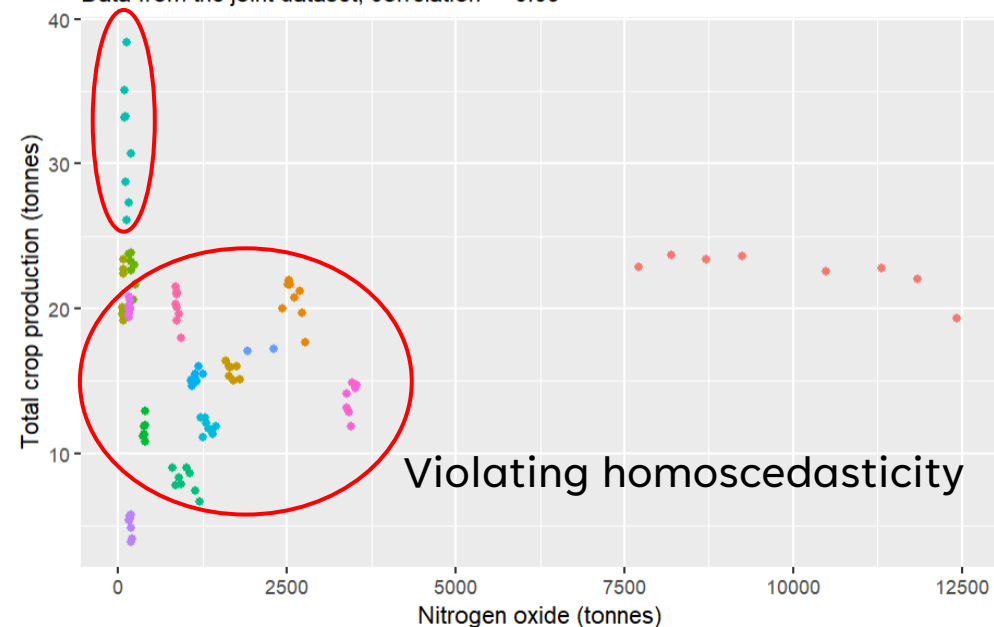
Scatter plot of Carbon monoxide and total crop production

Data from the joint dataset, correlation = 0.16



Scatter plot of Nitrogen oxide and total crop production

Data from the joint dataset, correlation = 0.09



- Australia
- Canada
- Switzerland
- Chile
- Colombia
- United Kingdom
- Israel
- Japan
- Korea
- Mexico
- Norway
- New Zealand
- Russia
- Türkiye
- United States

PERFORMING MLR

Variable:

Xs : the air pollutants (NOX, CO, SOX, NMVOC)

y: total crop production

Residuals:

Min	1Q	Median	3Q	Max
-12.1418	-4.0051	-0.7825	3.8246	22.5749

Large residual

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	16.0388213	0.9797549	16.370	<2e-16 ***
SOX	0.0011450	0.0008785	1.303	0.1953
CO	-0.0003384	0.0003818	-0.886	0.3774
NOX	-0.0024522	0.0013038	-1.881	0.0627 .
NMVOC	0.0034063	0.0016193	2.104	0.0378 *

Large p value

-> multicollinearity

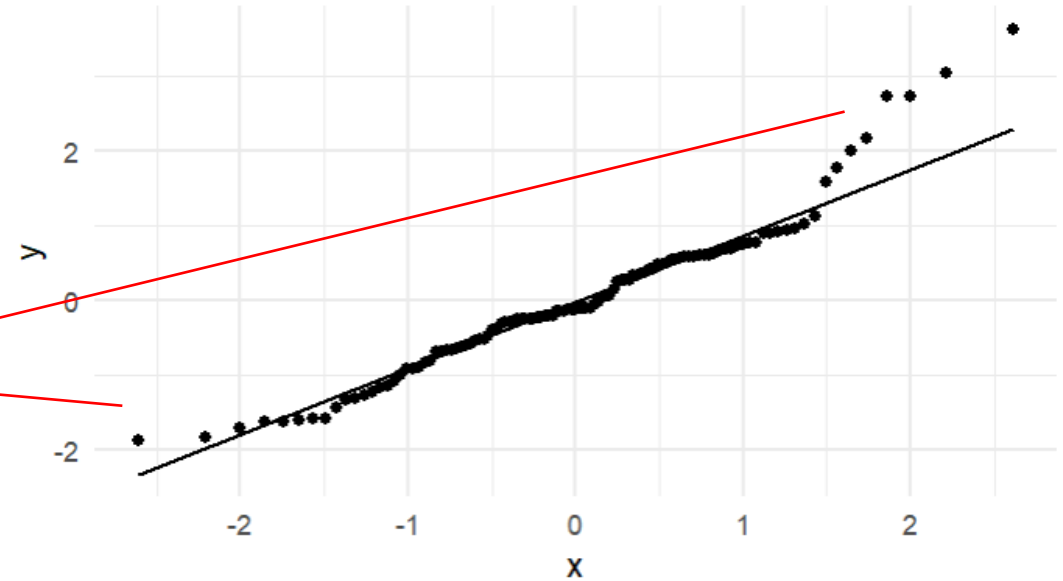
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 6.654 on 106 degrees of freedom

Multiple R-squared: 0.07405, Adjusted R-squared: 0.03911

F-statistic: 2.119 on 4 and 106 DF, p-value: 0.08346

QQ Plot



PLAN:

1. BOX-COX transformation
2. ANCOVA
3. Analyzing the correlation of the predictors
4. Making decisions regarding outliers
5. Adjust decisions on the dataset

THANK YOU

- OECD (2023), "Air and climate: Air emissions by source", *OECD Environment Statistics* (database), <https://doi.org/10.1787/data-00598-en>
- OECD (2023), Crop production (indicator). doi: 10.1787/49a4e677-en
- Shrestha, R.K., Shi, D., Obaid, H. *et al.* (2022). Crops' response to the emergent air pollutants. *Planta* **256**, 80 (2022). <https://doi.org/10.1007/s00425-022-03993-1>
- Rai, R., Agrawal, M., & Agrawal, S. B. (2015). Gaseous air pollutants: A review on current and future trends of emissions and impact on agriculture. *Environmental Science and Pollution Research*.
https://www.researchgate.net/publication/267726469_Gaseous_air_pollutants_a_review_on_current_and_future_trends_of_emissions_and_impact_on_agriculture
- Rehman, A., Ma, H. & Ozturk, I. (2020). Decoupling the climatic and carbon dioxide emission influence to maize crop production in Pakistan. *Air Qual Atmos Health* **13**, 695–707 (2020).<https://doi.org/10.1007/s11869-020-00825-7>