



Groundwater Quality and Economic Growth: An Analysis

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Introduction

Background

- India's economic growth has placed immense pressure on its natural resources such as groundwater
- Groundwater is highly susceptible to contamination
- Understanding the impact of economic growth on groundwater quality is essential for sustainable growth

Our project:

- Explores the relationship between the concentration of groundwater indicator sulfate and economic growth
- Carried out using regression analysis on varying subsets of data

Data and Economic tests

Summary Statistics					
	Year	Ginivalue	SDP_NORM	Sulfate	State
Count	9713	9531	9681	5496	9713
Unique	—	—	—	—	30
Top	—	—	—	—	Uttar Pradesh
Frequency	—	—	—	—	1397
Mean	2008.96	0.2693	362246.6	98.16	—
Std	5.47	0.0571	302153.8	125.94	—
Min	2000	0.16	1247.87	0	—
25%	2004	0.23	148760	24.21	—
50%	2009	0.26	282371	52.96	—
75%	2014	0.31	488554.2	122.16	—
95%	2018	0.37	949184	346.65	—
Max	2018	0.48	1728578	1815	—

Data:

- Mismatch in some names
- Null values (4217 in sulfate)
- Outliers (120)
- Preprocessed the data and ran regression both with and without outliers

Economic tests:

- F test and p-value
- R- square
- Regression coefficients

Simple Regression Results

Table 1: OLS Regression Results

Variable	Coefficient	Std Error	t	P > t
const	9.572e+01	2.693e+00	35.539	<2e-16
SDP_NORM	6.182e-06	5.236e-06	1.181	0.238

1. **MSE:** 15876.3553237917
2. **R-squared:** 0.0002541
3. **Adj. R-squared:** 7.18e-05
4. **F-statistic:** 1.394
5. **No. Observations:** 5485
6. **Df Residuals:** 5483
7. **P-Value:** 0.2378

- p-value of $0.238 > 0.05$ indicates that the model **with outliers** does not have significance at the 95% significance level
- Small R-square (0.0002) indicates that only 0.2% of variation is explained by the model
- Better results are obtained by pre-processing the data

Simple Regression Results

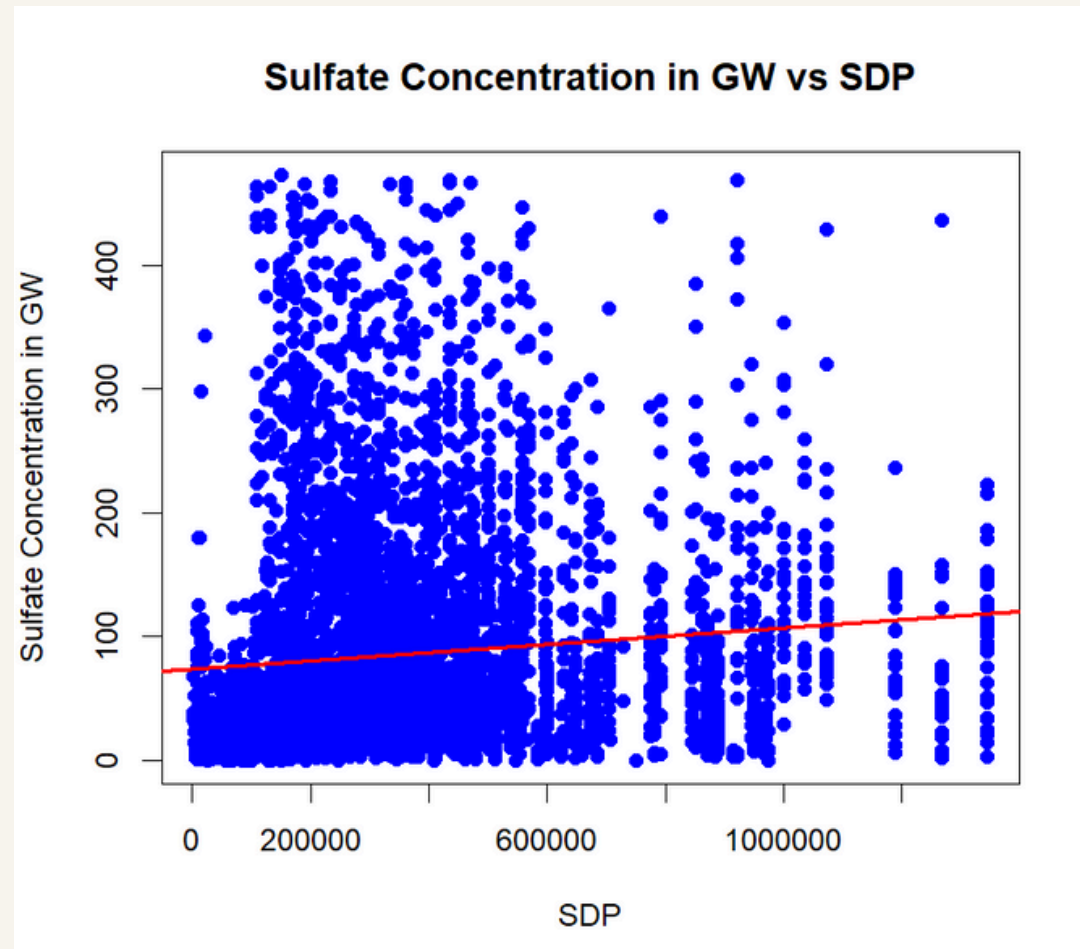
Table 2: OLS Regression Results

Variable	Coefficient	Std Error	t	P > t
const	$7.377e + 01$	$2.180e+00$	33.844	$< 2e - 16$
SDP_NORM	$3.333e - 05$	$4.743e - 06$	7.028	$2.38e-12$

1. **MSE:** 8421.66829947241
2. **R-squared:** 0.009586
3. **Adj. R-squared:** 0.009392
4. **F-statistic:** 49.39
5. **No. Observations:** 5105
6. **Df Residuals:** 5103
7. **P-Value:** $2.375e-12$

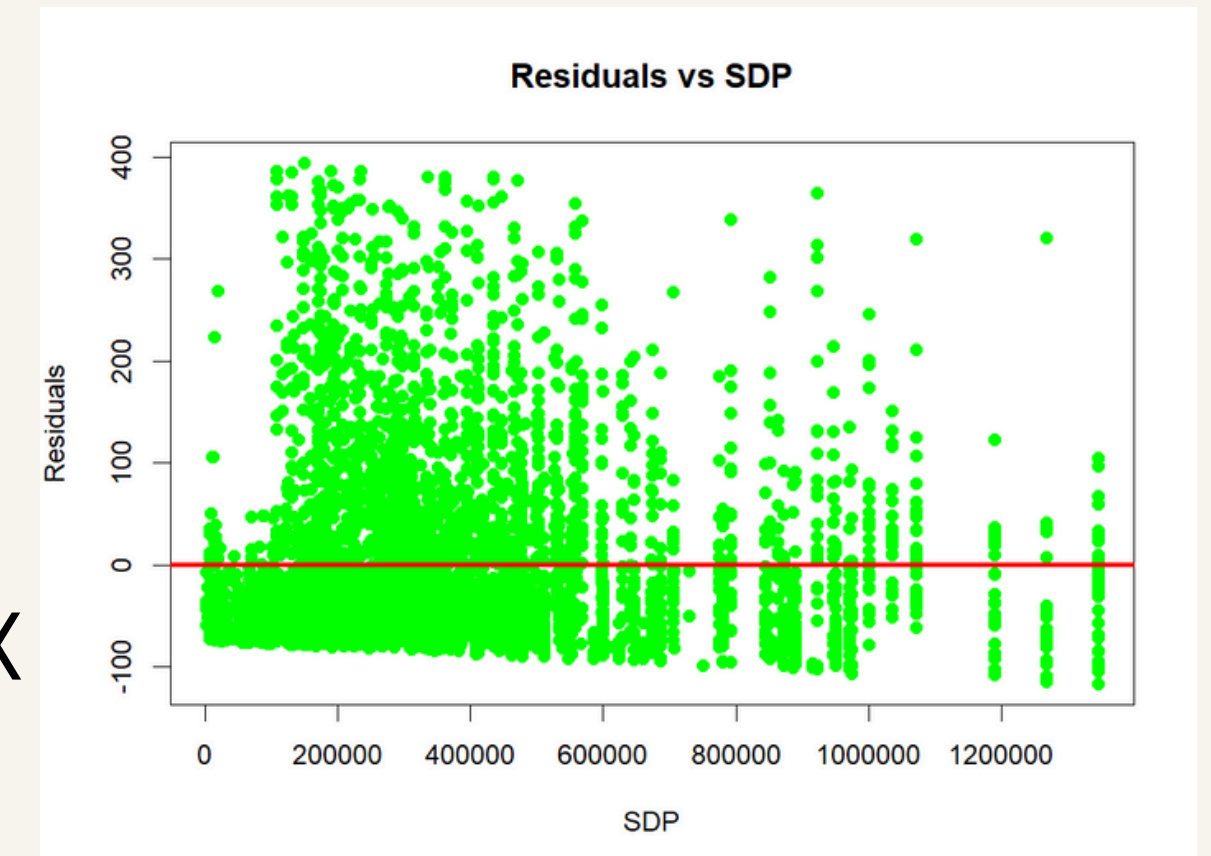
- Positive coefficients indicate a positive association with the groundwater quality indicator
- Small p-value associated with the F- test post-processing of data indicates a high significance of the model
- R- square of 0.009 indicates that only 0.9% of the variance can be explained using this model

Residuals

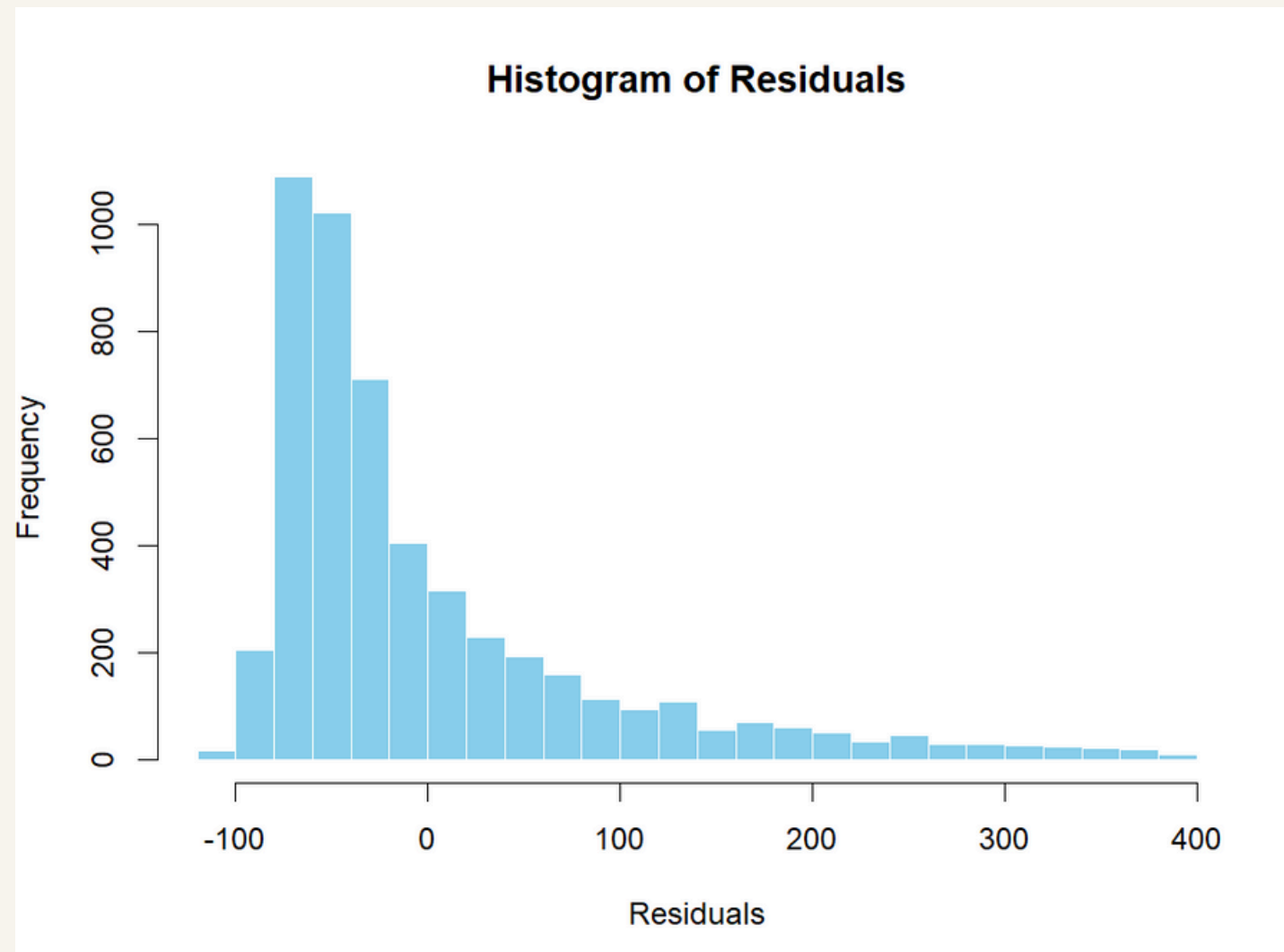


- Red line: regression line
- Points are distributed about the regression line
- A clear linear relationship is not observable, which indicates that a linear model might not be the best fit

- Red line: line at $y=0$
- Points are randomly distributed about the line
- No clear trend, which indicates that the model is adequate at capturing the relationship between X and Y



Residuals



- sum of residuals:
-9.75548530846027e-11
- the sum is an extremely small value, approaching 0, thus verifying the key assumption that $\sum \hat{u}_i = 0$.

Kuznet Curve and Outliers

$$GWQ = \beta_0 + \beta_1(SDP) + \beta_2(SDP^2) + \beta_3(SDP^3) + \beta_4(GINI) + u$$

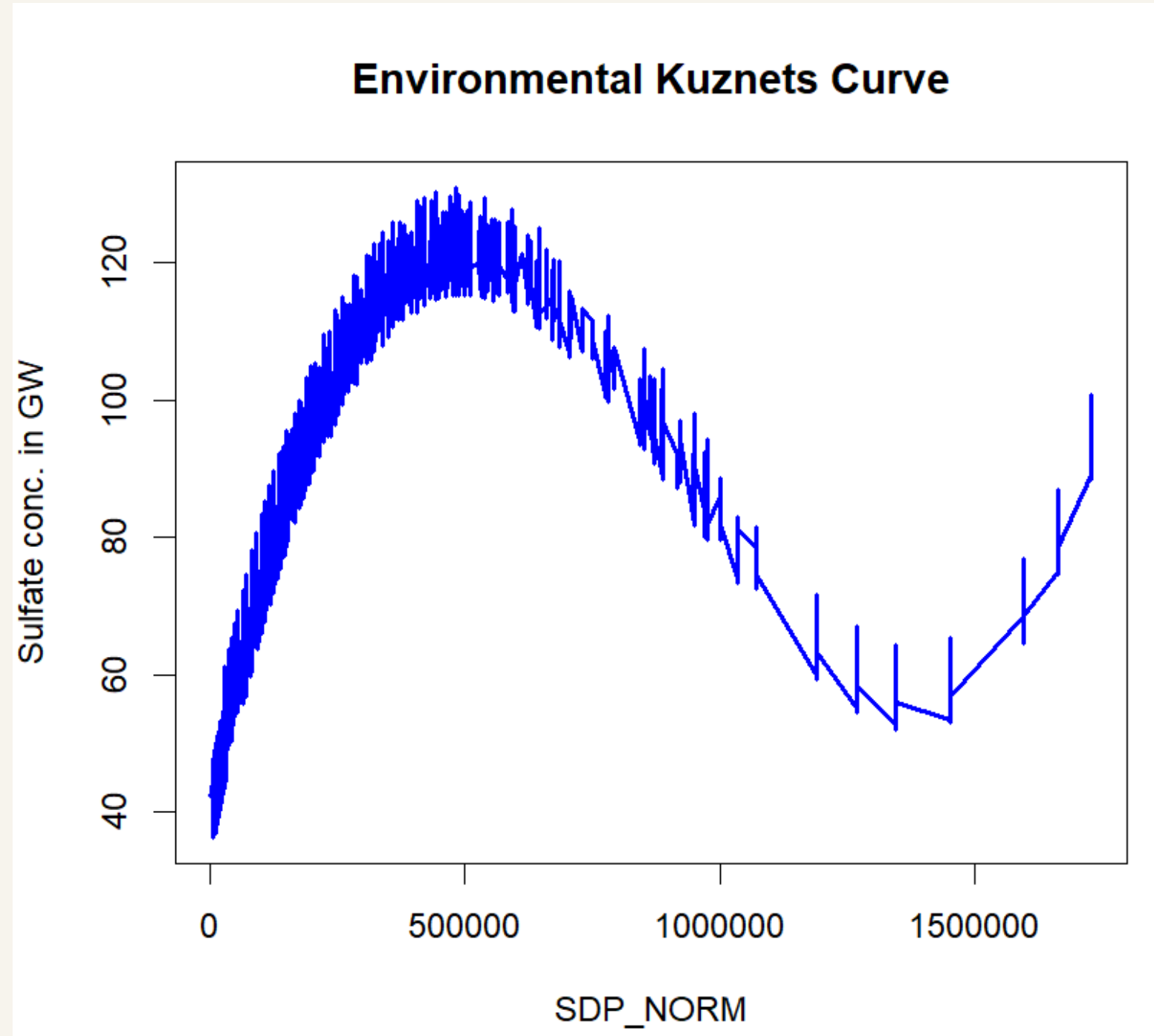
Table 4: Kuznets Curve Regression Results

Variable	Estimate	Std. Error	t value	P > t
(Intercept)	1.741e + 00	7.464e + 00	0.233	0.81558
SDP_NORM	4.217e - 04	3.136e - 05	13.448	2e - 16
ginivalue	7.288e + 01	2.283e + 01	3.193	0.00142
SDP_sq	-6.510e - 10	6.170e - 11	-10.550	2e - 16
SDP_cube	2.862e - 16	3.406e - 17	8.403	2e - 16

1. **MSE:** 8091.5022825187
2. **R-squared:** 0.04841
3. **Adj. R-squared:** 0.04767
4. **F-statistic:** 64.87
5. **No. Observations:** 5105
6. **Df Residuals:** 5100
7. **P-Value:** < 2.2e-16

- Outliers= 121
- Influential Observations = 126
- p-value: < 2.2e-16 shows the significance of the model
- Positive coeff. of SDP, SDP_cube and Gini show positive association with the sulfate conc. in GW
- Negative coeff of SDP_sq shows its inversely related to sulfate conc. in GW
- P-values of coefficients show their significance

Kuznets Curve



- N shaped EKC curve due to trends in coefficients

Year-wise and Region-wise Results

Region	R-squared	F-statistic	p-value
North	0.09104	32.78	2.2e-16
South	0.05609	13.41	1.264e-10
Northeast	0.1133	12.17	2.558e-09
Central	0.03136	11.26	5.431e-09
West	0.02061	4.297	0.001905
East	0.0581	6.399	5.274e-05

- Small p values for all regions indicate that the model is significant for all regions
- Significance varies from region to region, lowest for West and highest for North

- Relation between economic growth and sulfate conc. in GW varies with year
- Magnitude of coefficient indicates the amount of change
- Sign indicates the direction and nature of the relationship

Year	SDP_NORM	Gini	SDP_sq	SDP_cube
2000	1.099e-03	-7.231e+01	-5.398e-09	6.517e-15
2003	-7.890e-02	-2.533e+02	6.515e-07	-1.371e-12
2007	8.656e-04	1.020e+02	-1.741e-09	9.744e-16
2010	3.810e-04	-2.958e+01	2.245e-10	-9.317e-16
2014	4.191e-04	3.999e+01	-3.744e-10	8.914e-17
2017	2.799e-04	1.942e+01	-1.481e-10	2.194e-18

Limitations

- **Data Limitations:** the analysis relies on the data sources, which may have limitations in terms of accuracy, completeness and consistency.
- Factors like **regulations, government policies, institutions** also have an affect on the GWQ which we have not considered.
- GWQ is measured by the presence of various minerals in water but we are just analyzing the trend of the presence of a single salt (i.e. Sulfate) in ground water of different districts in India.

References

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