

How do statewide measures impact statewide air pollution?

Climate-DEchangers
(Wes, Dylan, Dalton)



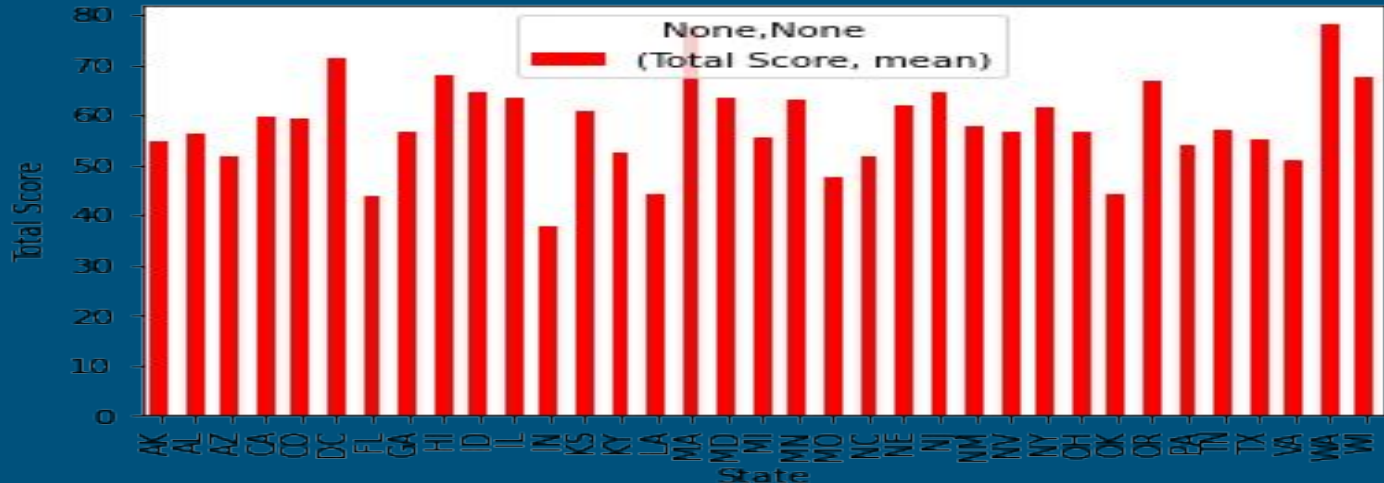
Motivation/Introduction

- Current forest fires have motivated us to find data about our air quality.
- Variables are complexed so we decided to focus on policy related measures.
- How do these policies affect the air pollution in their state?



Public Transportation

- Transportation score is based on:
- Public transit resources
- Safety and reliability
- Accessibility and convenience



Public Transportation

```
[17]: file = 'Resources/public_transportation.csv'
raw_df = pd.read_csv(file)
next_raw_df = raw_df.sort_values(by=['Overall'])
next_raw_df
```

```
[17]:
```

| | Overall | City | Total Score | Accessibility | Safety | Resources |
|-----|---------|--------------------|-------------|---------------|--------|-----------|
| 93 | 1 | Seattle, WA | 77.97 | 7 | 6 | 3 |
| 98 | 2 | Boston, MA | 77.84 | 2 | 34 | 10 |
| 99 | 3 | San Francisco, CA | 75.21 | 1 | 27 | 80 |
| 97 | 4 | Washington, DC | 71.23 | 3 | 48 | 52 |
| 54 | 5 | Madison, WI | 71.06 | 46 | 1 | 4 |
| ... | ... | ... | ... | ... | ... | ... |
| 72 | 96 | New Orleans, LA | 42.43 | 28 | 92 | 100 |
| 47 | 97 | Charlotte, NC | 40.67 | 53 | 95 | 88 |
| 33 | 98 | Tampa, FL | 24.69 | 67 | 98 | 91 |
| 27 | 99 | St. Petersburg, FL | 24.03 | 73 | 98 | 91 |
| 13 | 100 | Indianapolis, IN | 21.13 | 87 | 100 | 39 |

100 rows × 6 columns

Subsidies

- Very large csv comprising of each state what subsidies were offered on each of the 64 Electric car types.

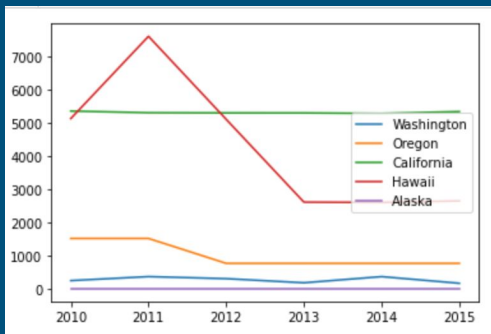
| | state | statecode | year | time | makemodel | evtype | vehiclepurchaseincentive_dummy | vehiclepurchaseincentive_amount | homechargersubsidy_dummy |
|------|----------|-----------|------|--------|--------------|--------|--------------------------------|---------------------------------|--------------------------|
| 1920 | Colorado | CO | 2010 | 2010h1 | Bmw Active E | bev | 0 | 0.0 | 1 |
| 1921 | Colorado | CO | 2010 | 2010h1 | Bmw I3 | bev | 0 | 0.0 | 1 |
| 1922 | Colorado | CO | 2010 | 2010h1 | Bmw I3REx | phev | 0 | 0.0 | 1 |
| 1923 | Colorado | CO | 2010 | 2010h1 | Bmw I8 | phev | 0 | 0.0 | 1 |
| 1924 | Colorado | CO | 2010 | 2010h1 | Bmw X5 | phev | 0 | 0.0 | 1 |
| ... | ... | ... | ... | ... | ... | ... | ... | ... | ... |

- Found the average amount of subsidy given total by state by year

Out[4]:

| | subsidies excluding hov | year | subsidies | state |
|---|-------------------------|------|-----------|------------|
| 0 | 2062.5 | 2010 | 5359.634 | California |
| 0 | 2062.5 | 2011 | 5310.283 | California |
| 0 | 2062.5 | 2012 | 5304.900 | California |
| 0 | 2062.5 | 2013 | 5303.941 | California |
| 0 | 2062.5 | 2014 | 5287.633 | California |
| 0 | 2062.5 | 2015 | 5344.072 | California |

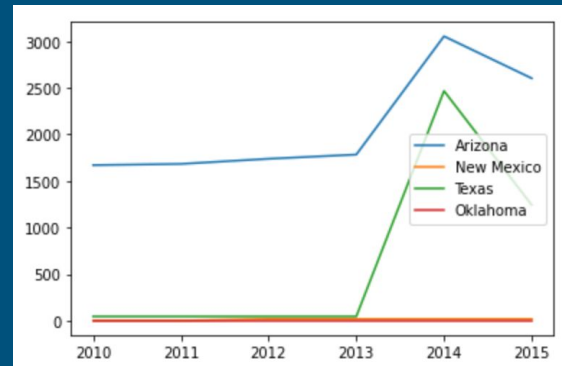
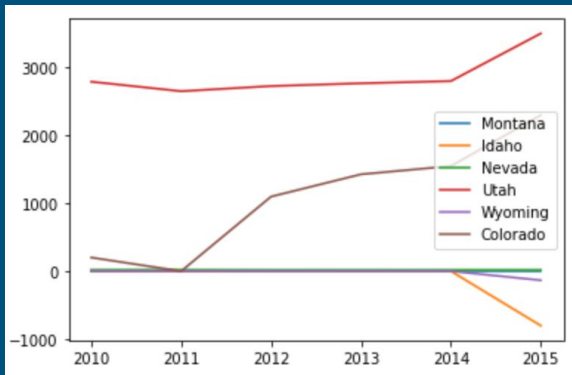
Subsidy graphs



Pacific

```
def state_graph(state_list):  
    for state in state_list:  
        state_df = useful_df.loc[useful_df['state'] == state]  
        plt.plot(state_df['year'], state_df['subsidies'])  
        plt.legend(state_list, loc='right')
```

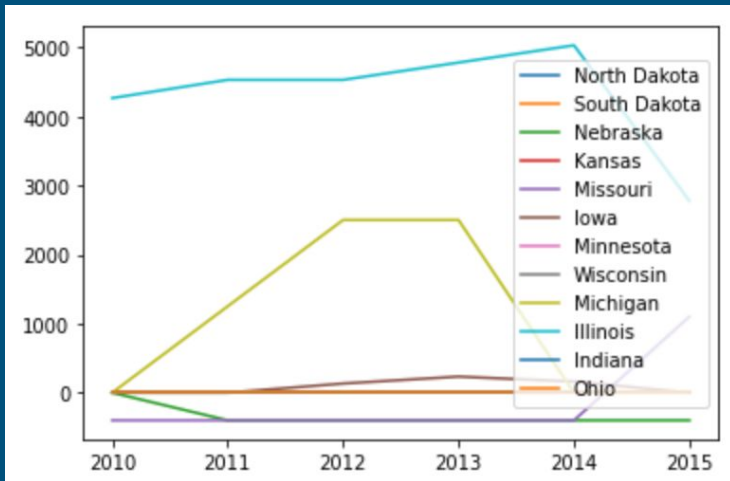
Rocky Mountains



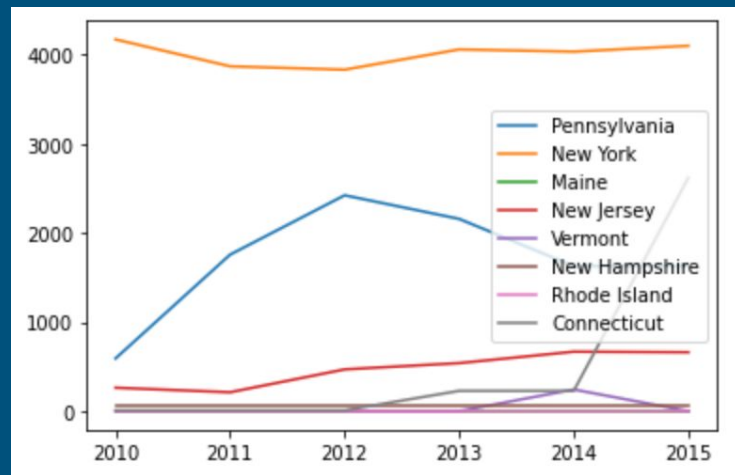
Southwest

More graphs!

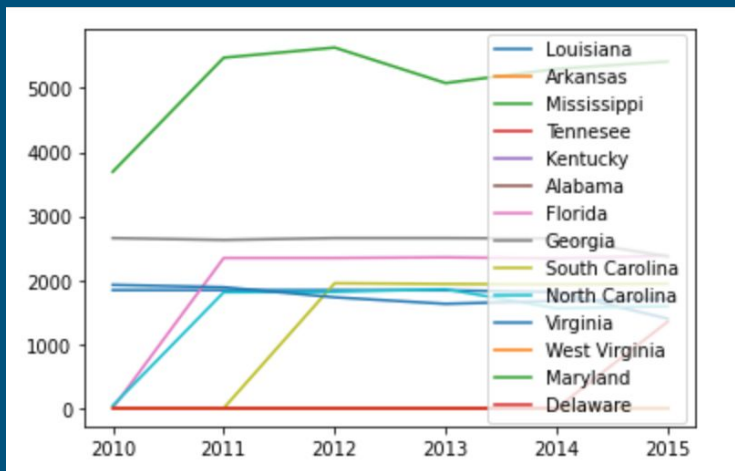
Southeast



Northeast



Midwest



Air quality

| | State | Year | NO2 Mean | O3 Mean | SO2 Mean | CO Mean | Pollution Index |
|---|---------|------|-----------|-----------|----------|------------|-----------------|
| 2 | Alabama | 2013 | 12.065635 | 12.098839 | 0.750311 | 211.006887 | 235.921672 |
| 3 | Alabama | 2014 | 9.411746 | 24.660149 | 1.186517 | 205.921470 | 241.179882 |
| 4 | Alabama | 2015 | 9.078580 | 23.999967 | 1.009429 | 221.026680 | 255.114656 |
| 5 | Alabama | 2016 | 9.524873 | 28.347745 | 0.835118 | 209.514138 | 248.221873 |
| 6 | Alaska | 2014 | 11.658510 | 10.306575 | 5.951531 | 455.443869 | 483.360485 |

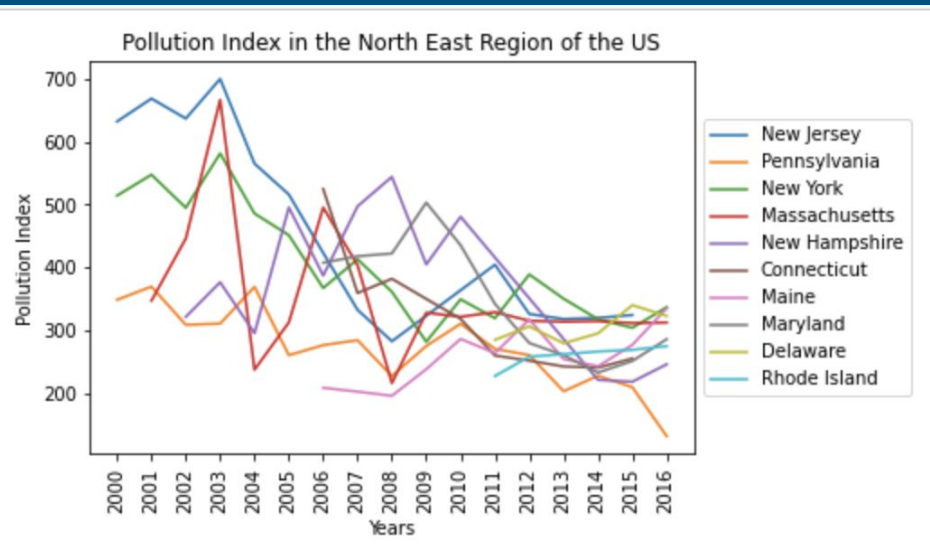
Air quality

```
#Northeast
```

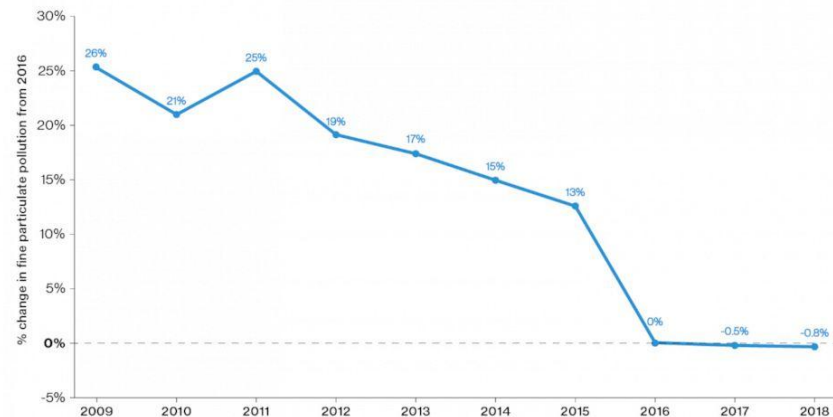
```
north_east = new_df.loc[((new_df["State"] == "Maine")) | ((new_df["State"]=="Massachusetts")) |  
                        ((new_df["State"] == "Rhode Island")) | ((new_df["State"] == "Connecticut")) |  
                        ((new_df["State"] == "New Hampshire")) | ((new_df["State"] == "Vermont")) |  
                        ((new_df["State"] == "New York")) | ((new_df["State"] == "Pennsylvania")) |  
                        ((new_df["State"] == "New Jersey")) | ((new_df["State"] == "Delaware")) |  
                        ((new_df["State"] == "Maryland"))]
```

```
north_east = north_east.sort_values("Year").reset_index(drop=True)  
ne = sns.lineplot(data=north_east, x="Year", y="Pollution Index", hue="State")  
plt.xlabel("Years")  
plt.ylabel("Pollution Index")  
plt.title(" Air Pollution in the Northeast Region of the US")  
ax.yaxis.set_major_locator(ticker.MultipleLocator(5))  
ax.yaxis.set_major_formatter(ticker.ScalarFormatter())  
plt.xticks(rotation = 'vertical')  
plt.legend(loc='center left', bbox_to_anchor=(1.0, 0.5))  
plt.show()
```

Air quality

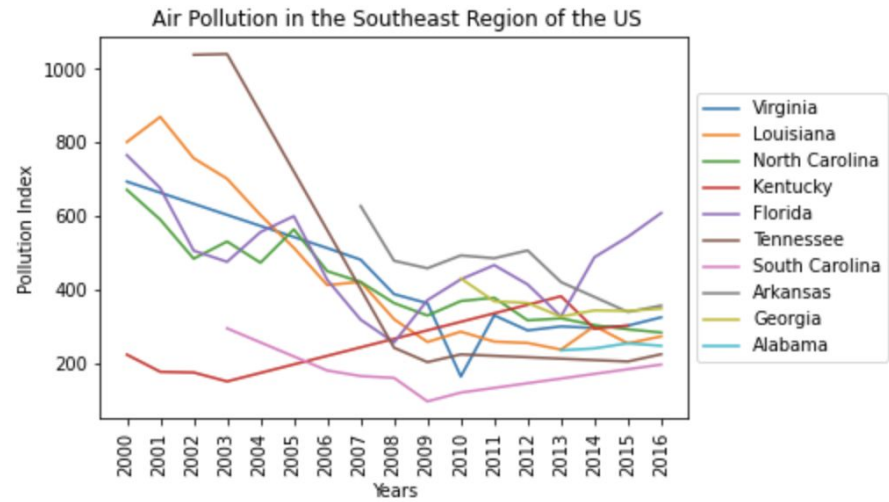
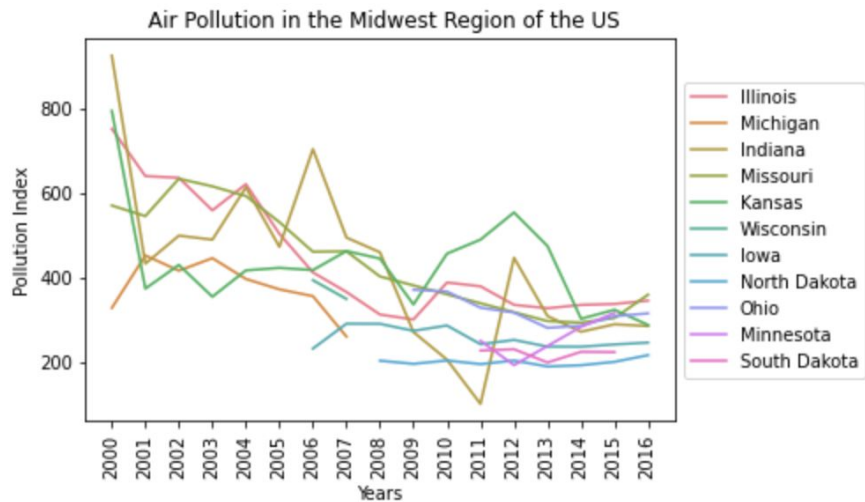


AIR POLLUTION IN THE UNITED STATES - NORTHEAST

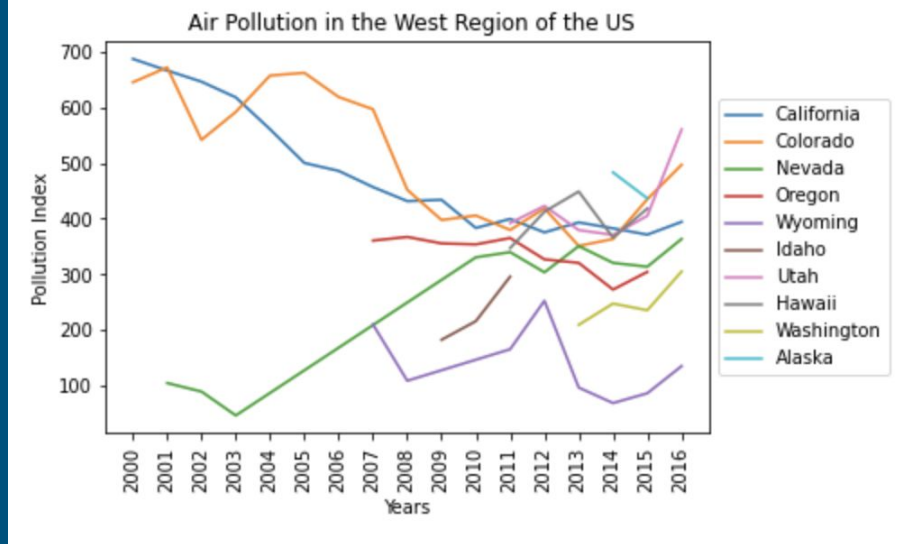
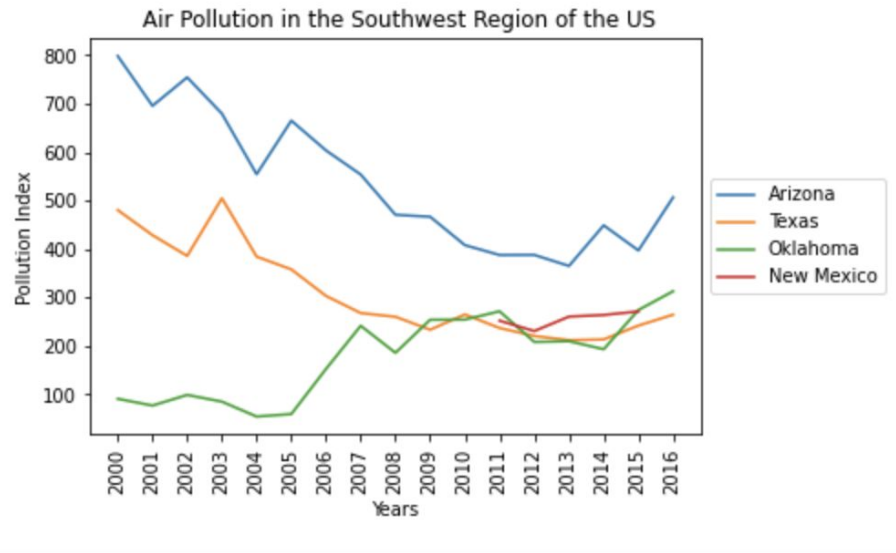


SOURCE: NATIONAL BUREAU OF ECONOMIC RESEARCH

Air quality



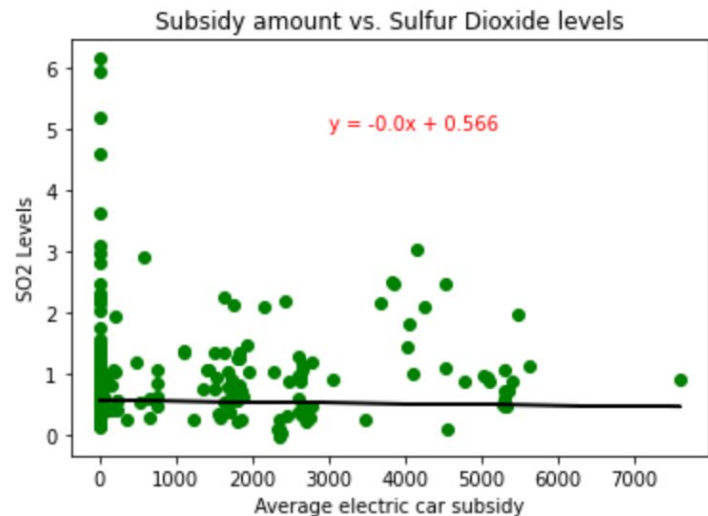
Air quality



Putting them together

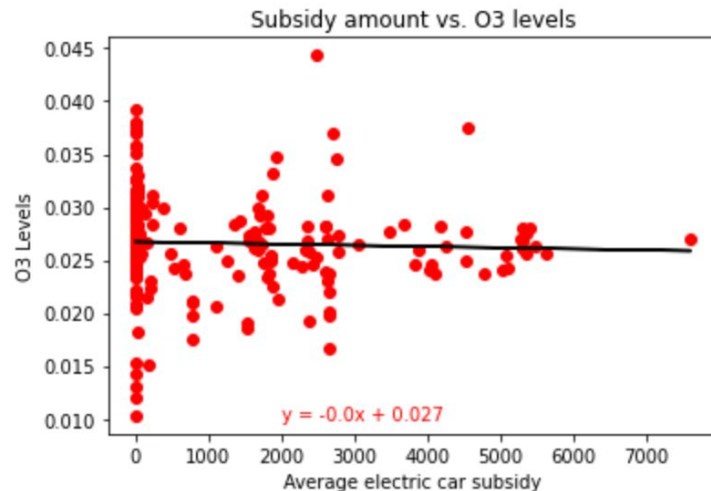
Subsidies!

R-Value: -0.02428867381001295

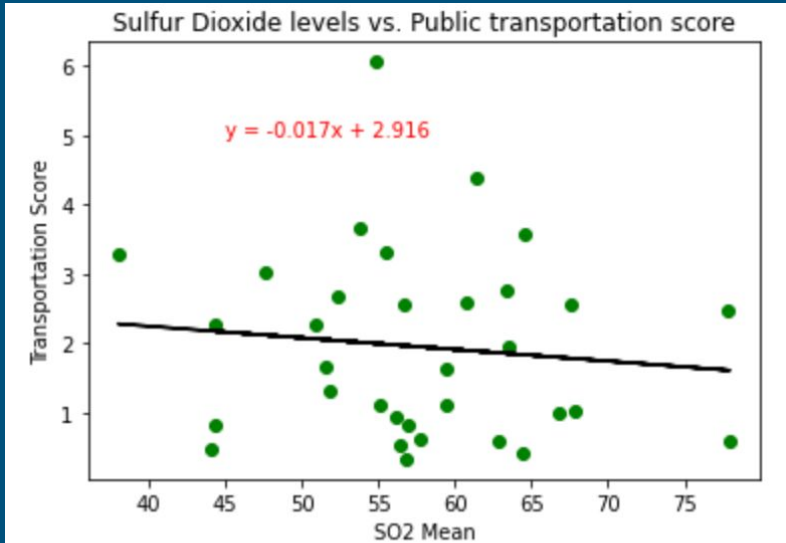


R-Value: -0.04041105300347709

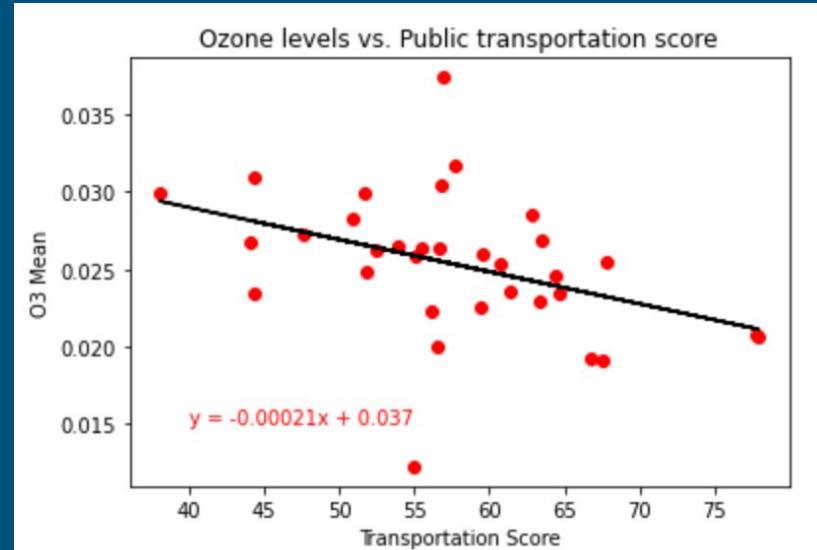
Slope: $-1.1323061372474311e-07$



Transportation scores



R-Value: -0.11092648809339511



R-Value: -0.4031468048697786

Conclusion

- Could not find a clear relationship between our selected measures and air pollution
- We need to look at more variables such as wildfires, factories, etc.
- A lot of our data varied which could lead to inconsistent results
- We still need to run a hypothesis test for the last 2 graphs in order to understand if subsidies and public transportation has a significant effect on air pollution

Data Sources

Subsidies:

<https://www.sciencedirect.com/science/article/pii/S2352340919300071?via%3Dihub>

Air Quality:

<https://www.kaggle.com/sogun3/uspollution>

Public Transportation:

<https://wallethub.com/edu/cities-with-the-best-worst-public-transportation/65028>