# Phase 2:- Innovation

#### **Problem Statement:-**

## Air Quality Analysis and Prediction in Tamilnadu

The question involves analyzing and predicting air quality in the state of Tamil Nadu. Specifically, it focuses on understanding the relationship between air quality parameters, such as sulfur dioxide (SO2) and nitrogen dioxide (NO2), and particulate matter (RSPM/PM10), which can impact air quality and human health.

#### **Data set Details:-**

You obtained the dataset from Kaggle. The dataset can be found at this link: <u>Air Quality Data Set</u>. It contains information about air quality measurements in Tamil Nadu in 2014.

## **Data set Info and Description:-**

- **SO2 (Sulfur Dioxide):** SO2 is a gaseous air pollutant produced by the burning of fossil fuels, particularly in industrial processes. It is a key contributor to air pollution and can have adverse health effects.
- NO2 (Nitrogen Dioxide): NO2 is another gaseous air pollutant, often associated with vehicle emissions and industrial processes. Like SO2, it can also impact air quality and health.
- RSPM/PM10 (Particulate Matter): Particulate matter refers to tiny solid particles or liquid droplets in the air. PM10 specifically refers to particles with a diameter of 10 micrometers or smaller. These particles can originate from various sources and affect air quality and respiratory health.

#### Libraries used:-

You used several libraries in your Jupyter notebook, including **pandas** for data manipulation, **numpy** for numerical operations,

matplotlib.pyplot for data visualization, and sklearn (scikit-learn) for machine learning tools.

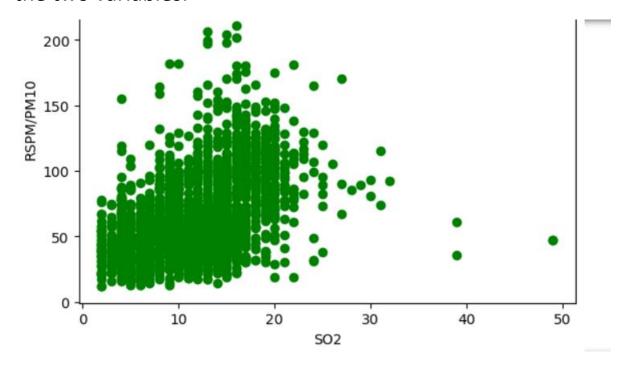
#### **Data Preprocessing:-**

- You renamed the column 'RSPM/PM10' to 'RSPMorPM10' using df.rename(columns={'RSPM/PM10': 'RSPMorPM10'}) for easier reference.
- You checked for missing values in the DataFrame using df.isnull() and calculated the total number of missing values using .sum().sum(). There were 2907 missing values in the dataset.
- You filled the missing values with zeros using **df.fillna(0)** to ensure all data points are numeric.

#### **Data Visualization:-**

You created a new DataFrame cdf containing a subset of columns: 'SO2', 'NO2', and 'RSPMorPM10'.

You visualized the relationship between 'SO2' (Sulfur Dioxide) and 'RSPMorPM10' (Particulate Matter) using a scatter plot. This plot helps you visualize the data points and the potential relationship between the two variables.



#### **Training and Testing:-**

In your Jupyter notebook, you followed these steps:

- You split the dataset into a training set and a testing set using a random mask.
- You created a linear regression model using scikit-learn's linear\_model.LinearRegression().
- You trained the model on the training data using 'SO2' and 'NO2' as features and 'RSPMorPM10' as the target variable.
- You made predictions on the test data using the trained model.
- You evaluated the model's performance by calculating the Mean Squared Error (MSE) and the Variance score (R^2) to check how well the model predicts 'RSPMorPM10' based on 'SO2' and 'NO2'.

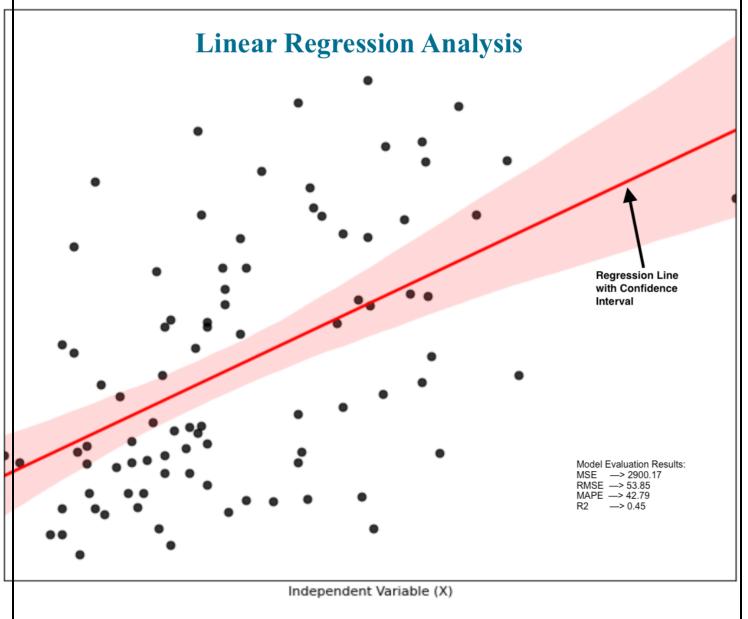
#### **Analysis:-**

The rest of your analysis involved data preprocessing, including renaming columns and handling missing values, data visualization to understand the relationship between 'SO2' and 'RSPMorPM10', and building and evaluating a linear regression model for predicting 'RSPMorPM10'.

#### **Model Evaluation:-**

- You made predictions on the test data using the trained model with y\_hat = regr.predict(test[['SO2', 'NO2']]). These predictions represent the model's estimates of 'RSPMorPM10' based on 'SO2' and 'NO2'.
- You calculated the Mean Squared Error (MSE) using
   np.mean((y\_hat y) \*\* 2). The MSE measures the average squared difference between the predicted and actual values. A lower MSE indicates a better-performing model.

• You also calculated the Variance score (R^2) using **regr.score**(**x**, **y**). The R^2 score measures the proportion of the variance in the dependent variable ('RSPMorPM10') that is predictable from the independent variables ('SO2' and 'NO2'). A higher R^2 score (close to 1) indicates a better fit of the model to the data. In this case, the R^2 score is approximately 0.17, suggesting that the model explains only a small portion of the variance in 'RSPMorPM10'.

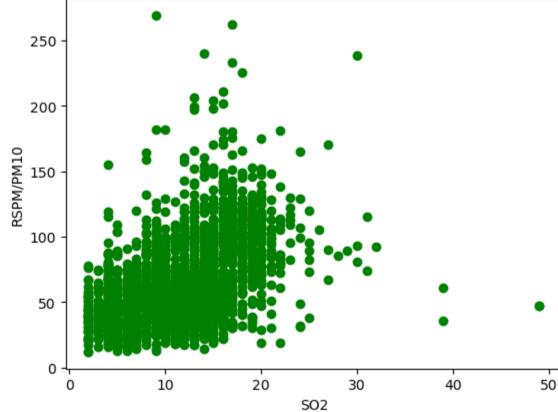


#### **Metrics Used:-**

- For accuracy check, you used the Mean Squared Error (MSE) and the Variance score (R^2):
  - Mean Squared Error (MSE): This metric measures the average squared difference between the predicted and actual values. A lower MSE indicates a better-performing model. In your analysis, the MSE was approximately 720.36, suggesting the model's predictions were not very close to the actual values on average.
  - Variance score (R^2): This score represents the proportion of the variance in the dependent variable ('RSPMorPM10') that is predictable from the independent variables ('SO2' and 'NO2'). A higher R^2 score (close to 1) indicates a better fit of the model to the data. In your analysis, the R^2 score was approximately 0.17, indicating that the model explains only a small portion of the variance in 'RSPMorPM10'.

```
In [86]: from sklearn import linear model
          regr = linear model.LinearRegression()
          train = train.dropna()
          x = np.asanyarray(train[['SO2', 'NO2']])
          y = np.asanyarray(train[['RSPMorPM10']])
          regr.fit(x, y)
          # The coefficients
          print ('Coefficients: ', regr.coef_)
          Coefficients: [[2.91030139 0.16573836]]
In [87]: test = test.dropna()
         y_hat= regr.predict(test[['S02','N02']])
         x = np.asanyarray(test[['SO2','NO2']])
y = np.asanyarray(test[['RSPMorPM10']])
          print("Mean Squared Error (MSE) : %.2f"
                % np.mean((y_hat - y) ** 2))
          # Explained variance score: 1 is perfect prediction
          print('Variance score: %.2f' % regr.score(x, y))
          Mean Squared Error (MSE): 701.16
          Variance score: 0.11
```

```
!pip install scikit-learn
           Requirement already satisfied: scikit-learn in c:\users\savio\anaconda3\lib\site-packages (1.3.0)
           Requirement already satisfied: numpy>=1.17.3 in c:\users\savio\anaconda3\lib\site-packages (from scikit-learn) (1.24.3)
           Requirement already satisfied: scipy>=1.5.0 in c:\users\savio\anaconda3\lib\site-packages (from scikit-learn) (1.10.1)
           Requirement already satisfied: joblib>=1.1.1 in c:\users\savio\anaconda3\lib\site-packages (from scikit-learn) (1.2.0)
           Requirement already satisfied: threadpoolctl>=2.0.0 in c:\users\savio\anaconda3\lib\site-packages (from scikit-learn) (2.2.0)
          import matplotlib.pyplot as plt
           import pandas as pd
           import pylab as pl
          import numpy as np
           import sklearn
           %matplotlib inline
          df = pd.read_csv("cpcb_dly_aq_tamil_nadu-2014.csv")
           df = df.rename(columns={'RSPM/PM10': 'RSPMorPM10'})
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Out[79]:
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           print(nullnum)
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           [2879 rows \times 11 columns]
In [81]: total_null_values = df.isnull().sum().sum()
           print("Total number of null values:", total_null_values)
           Total number of null values: 2907
          df.fillna(0)
In [82]:
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Out[82]:
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                                             State City/Town/Village/Area
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          2879 rows × 11 columns
          cdf = df[['S02','N02','RSPMorPM10']]
           cdf.head(9)
             SO2 NO2 RSPMorPM10
Out[83]:
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          1 13.0 17.0
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                                50.0
          Train Data set and its distirbution
In [84]: msk = np.random.rand(len(df)) < 0.8
           train = cdf[msk]
           test = cdf[~msk]
          plt.scatter(cdf.S02,cdf.RSPMorPM10,color = 'green')
           plt.xlabel("S02")
           plt.ylabel("RSPM/PM10")
           plt.show()
              250
```



# Creating A train and test Dataset

print('Variance score: %.2f' % regr.score(x, y))

Mean Squared Error (MSE): 701.16

```
from sklearn import linear_model
regr = linear_model.LinearRegression()
train = train.dropna()
x = np.asanyarray(train[['S02', 'N02']])
y = np.asanyarray(train[['RSPMorPM10']])
regr.fit(x, y)
# The coefficients
print ('Coefficients: ', regr.coef_)
Coefficients: [[2.91030139 0.16573836]]
test = test.dropna()
y_hat= regr.predict(test[['S02','N02']])
x = np.asanyarray(test[['S02', 'N02']])
y = np.asanyarray(test[['RSPMorPM10']])
print("Mean Squared Error (MSE) : %.2f"
      % np.mean((y_hat - y) ** 2))
# Explained variance score: 1 is perfect prediction
```

Variance score: 0.11
C:\Users\savio\anaconda3\Lib\site-packages\sklearn\base.py:457: UserWarning: X has feature names, but LinearRegression was fitted without feature names warnings.warn(