Correlating Weather Patterns with Residential Electricity Consumption



Here you will apply the skills you've learned in data science, statistical analysis, and data management to find the relationship between residential electricity consumption in New Jersey and weather patterns.

You will be using two datasets—one containing monthly electricity sales data and another with corresponding weather conditions (average temperature and precipitation). Your goal will be to explore the relationship between electricity usage and weather conditions by using linear regression to evaluate and predict consumption trends.

Objectives

- Data Cleaning and Preprocessing
- Merging the Datasets
- Exploratory Data Analysis (EDA)
- Building a Predictive Model
- Evaluating and Improving the Model

Part 1: Data Cleaning and Preprocessing

- Load both datasets (residentialElectricity.csv and SM_betweenmonths.csv) into a Jupyter Notebook using Pandas.
- Identify missing values and decide how to handle them (e.g., dropping rows or imputing values).

 Convert dates into the correct datetime format and ensure consistency between the two datasets.

Part 2: Merging the Datasets

- Align the weather data with the electricity data by matching each row with its corresponding period. You will need to use the period field for the electricity dataset and the Date field for the weather dataset.
- Ensure the merged dataset contains columns for all features: electricity consumption, average max temperature, average min temperature, mean temperature, and precipitation.

Part 3: Exploratory Data Analysis (EDA)

- Visualizations: Plot monthly electricity usage against average temperatures and other weather features to observe trends.
- Statistical Summaries: Generate summary statistics of both datasets, such as average sales, temperatures, and precipitation levels.
- Identify any notable trends or seasonal effects in the data.

Part 4: Building a Predictive Model

- Feature Selection: Decide which features from the merged dataset should be used to predict electricity usage (e.g., temperature and precipitation).
- Model Training: Split the data into training and test sets. Train a linear regression model to predict electricity consumption using average mean temperature, precipitation, and other selected features.
- Manual R-squared Calculation: After fitting your model, use the predicted and actual values to manually calculate the R-squared value, demonstrating your understanding of the statistical concepts involved.

Part 5: Evaluating and Improving the Model

- Evaluate the model performance by comparing the R-squared value calculated manually and the one provided by Scikit-Learn.
- Discuss potential improvements to the model. What other features or adjustments could improve predictive power?

