



Machine Learning for Building Energy Prediction: A Case Study of an Office Building

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Machine Learning in Energy Sector

Advantages

- Computationally efficient
- No need for a physical model
- Wide range of applications

Applications in Energy

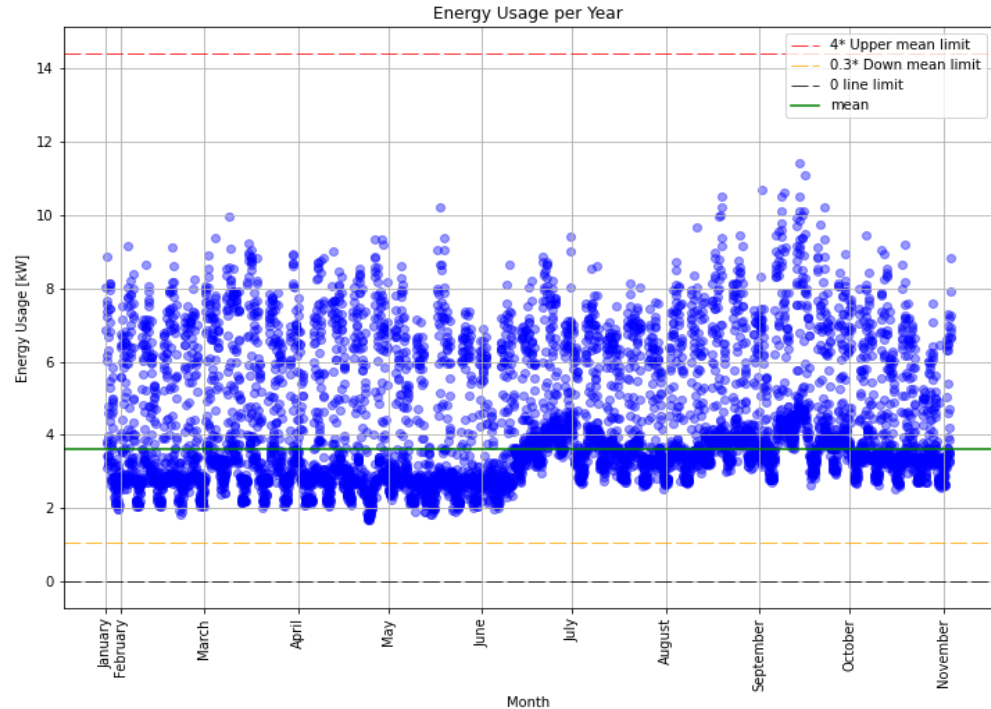
- Demand side response
- Predictive maintenance
- Grid Management





The Dataset

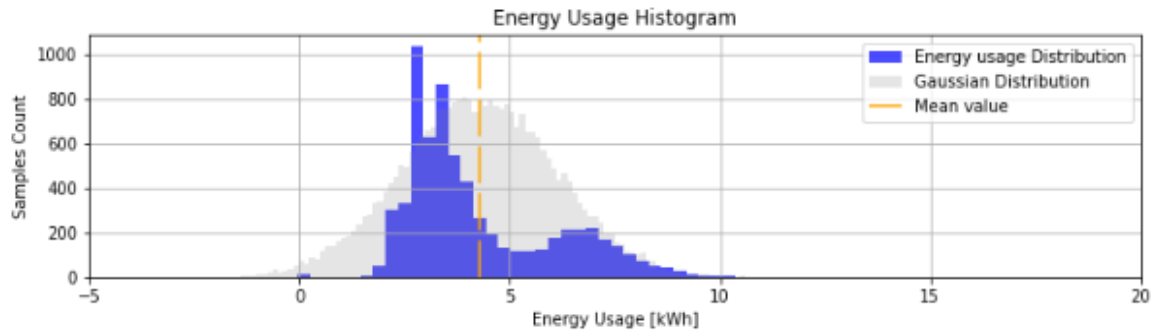
- **Data:** Energy Demand (kW)
- **Source:** Office building at TU Graz
- **Timeframe:** January – November



Data Preprocessing

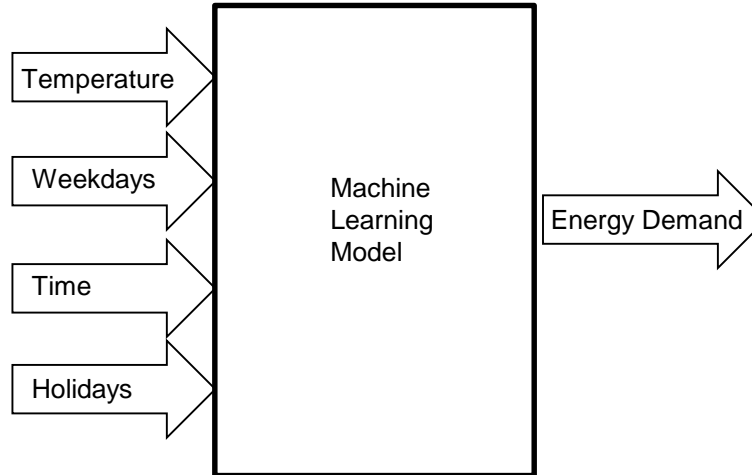
Outlier Detection: Rule- based method

- Negatives values
- Zero values
- Illogical values





Features Construction and Selection



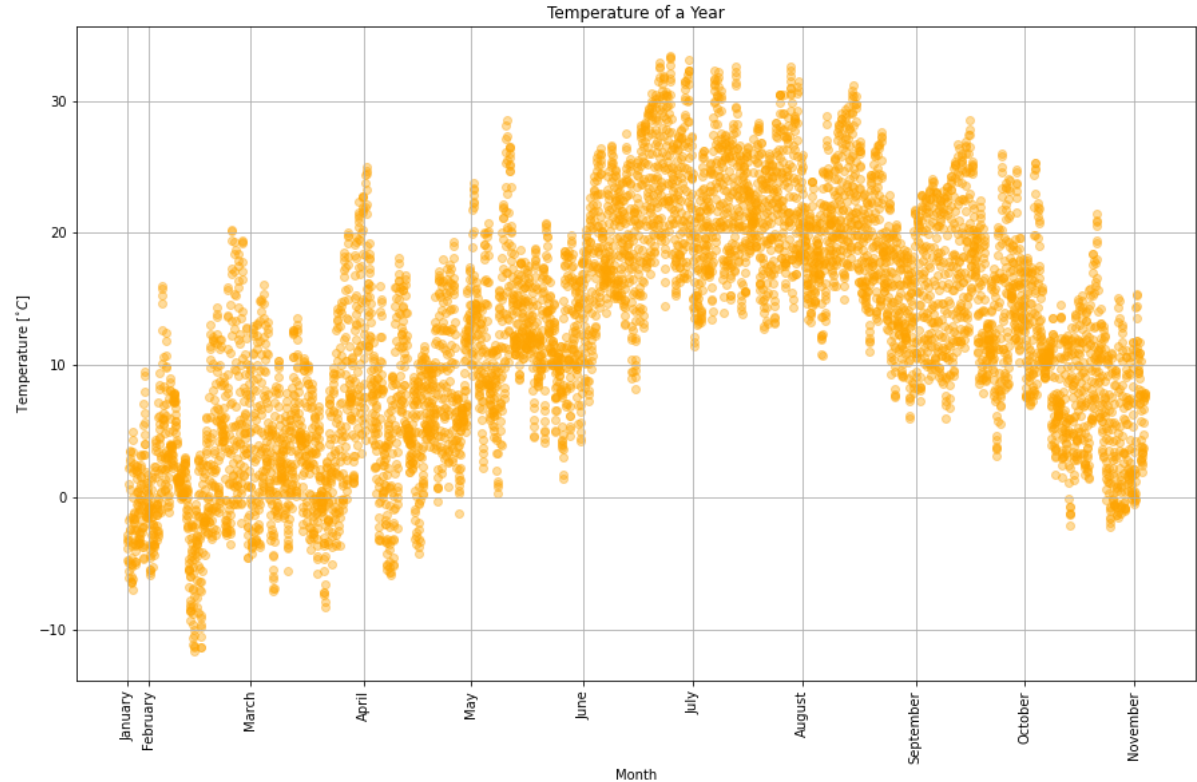


Features Construction and Selection - Timestamp matching

Linear interpolation

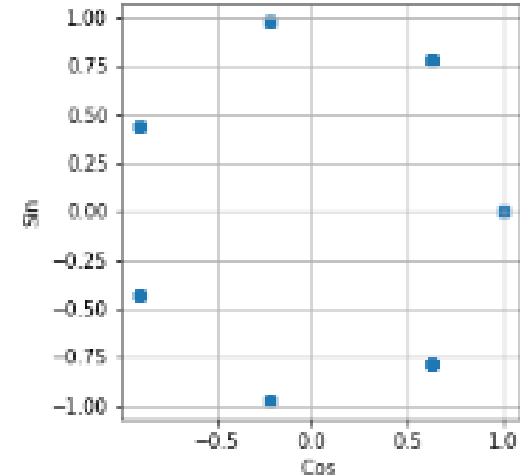


Fill missing values -
Timestamp matching





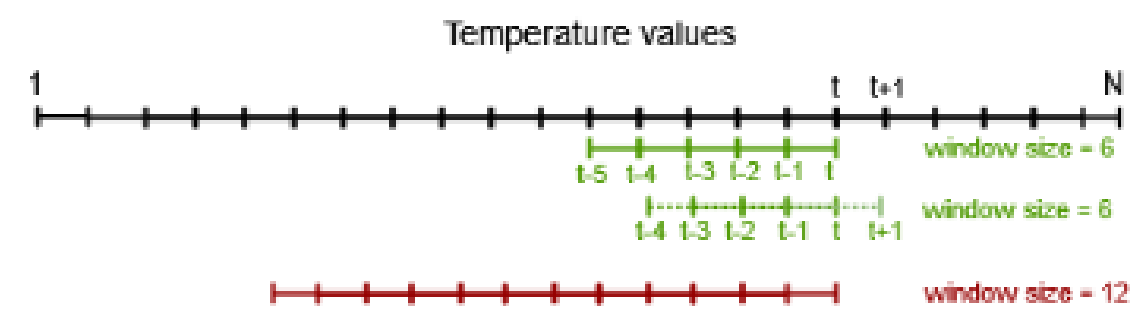
Features Construction and Selection - Cyclical variables





Features Construction and Selection – Rolling Windows

Rolling windows method



Training and validation

GRID SEARCH
 Hyperparameters

| Model | Parameters |
|---------------------------|---|
| Linear Regression | Default |
| Decision Tree Regression | criterion = mean-square-error (mse) |
| | minimum number of splits (min_num_of_split) = 60 |
| Support Vector Regression | gamma = 0.01 |
| Multi-Layer Perceptron | hidden_layer_sizes = (400,20) |
| | activation function = Tanh |
| | alpha = 0.001 |
| | learning rate = constant value with the initial equals to 0.001 |

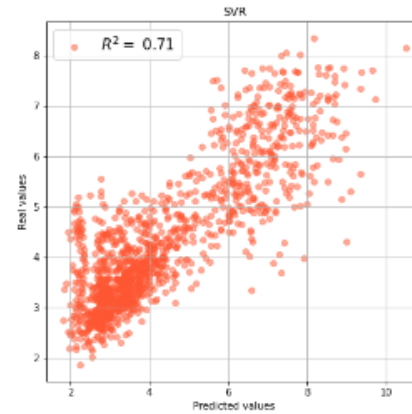
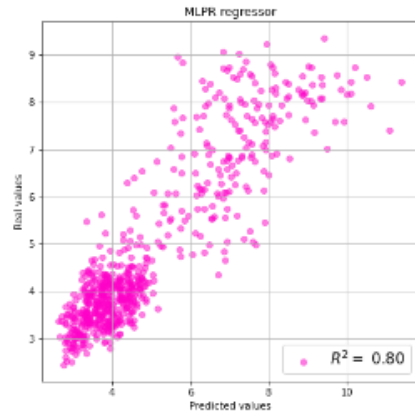
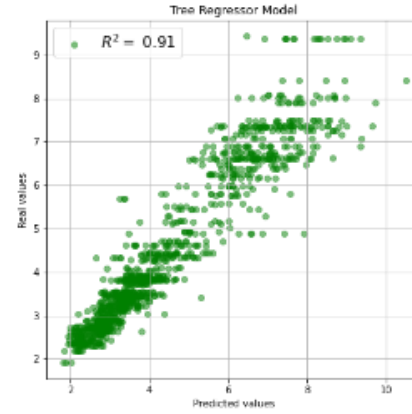
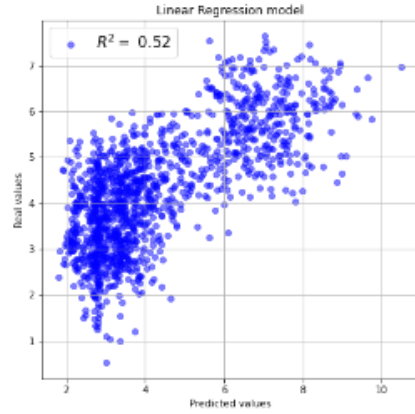


Results

| Model | Linear Regression | | | Decision Tree | | | SVR | | | MLP | | |
|-------|-------------------|---------|----------|---------------|---------|----------|---------|---------|----------|---------|---------|----------|
| | 0 Steps | 6 Steps | 12 Steps | 0 Steps | 6 Steps | 12 Steps | 0 Steps | 6 Steps | 12 Steps | 0 Steps | 6 Steps | 12 Steps |
| R2 | 0.30 | 0.48 | 0.52 | 0.91 | 0.91 | 0.91 | 0.72 | 0.64 | 0.62 | 0.78 | 0.80 | 0.80 |
| RMSE | 1.51 | 1.32 | 1.25 | 0.55 | 0.56 | 0.55 | 0.96 | 1.10 | 1.12 | 0.83 | 0.80 | 0.73 |
| MAE | 1.19 | 1.05 | 1.00 | 0.36 | 0.38 | 0.37 | 0.68 | 0.76 | 0.73 | 0.58 | 0.55 | 0.57 |



Results



Results





Conclusion

