



### / Outlier

In statistics, an outlier is a data point that differs significantly from other observations. An outlier may be due to variability in the measurement or it may indicate experimental error; the latter are sometimes excluded from the data set.

<u>Wikipedia</u>

# Detecting Outliers

/ Detecting Outliers (very rare values) are also important. The outliers must be removed from the data so that they do not spoil the models.

- Manual method of Outlier detection: Make a plot
  - Numerical outilers: Make a plot for showing the distribution
    - Univariate: Plot the distribution (boxplot, stripplot)
    - Bivariate: Make a scatter plot
    - Multivariate: Plot a dimensionality reduction method (TSNE, UMAP)
  - Categorical outliers: my\_var.value\_counts().plot.pie() , bar(), barh()
- Advanced methods of Outlier detection:
  - Robust covariance
  - One Class SVM
  - Isolation Forest
  - Local Outlier Factor

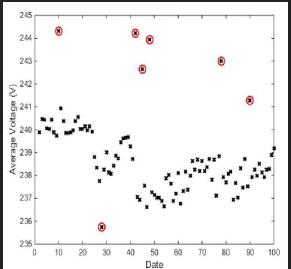


#### Detecting Outliers: Manual Methods

/ An image is worth a thousand words. You can think about each point individually and make a decision.

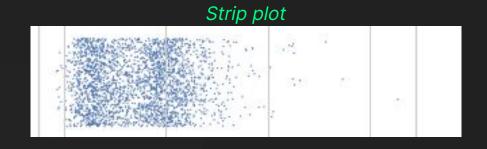
Outliers

Scatter plot
Usually the variable versus Time





0

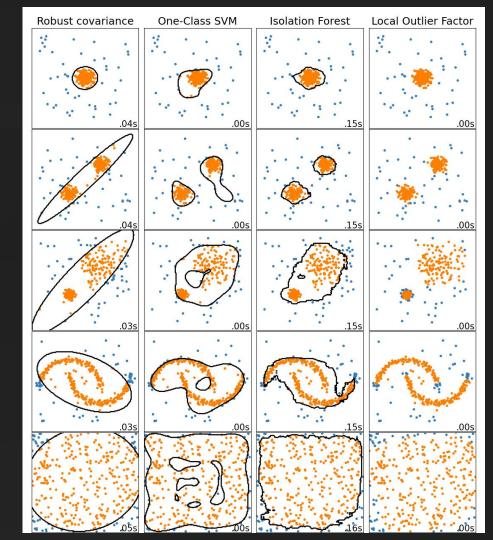




# Detecting Outliers: Advanced Methods

(not recommen<u>ded)</u>

- Robust covariance:
  - sklearn.covariance.EllipticEnvelope
- One Class SVM
  - sklearn.svm.OneClassSVM
- Isolation Forest:
  - sklearn.ensemble.lsolationForest
- Local Outlier Factor:
  - sklearn.neighbors.LocalOutlierFactor



# Typographical errors (Typos)

/ At data entry is common to introduce errors. This errors are called typos. Detect them and correct them is very important.

- Someone born in  $2200 \rightarrow Probably was born in 2020$
- Someone born in Sapin → Probably was born in Spain

/ <u>fuzzywuzzy</u> is a package to find similar strings that usually are typos and errors when the data was written.

# Handling Outliers

/ Once they have been detected, we have to handling them. Common Handling Outliers methods are:

- Remove them: Usually the best option (if the value is strange)
- Correct them: Best option if outlier is a "typo"
  - The max limit
  - The mean
  - Etc.
  - Other imputation method like missing imputation
- Oversample the outlier (make copies of the row)
  - You can introduce a noise for the ML model to not overfit.
    - np.random.normal(age, scale=5.0, size=1000)



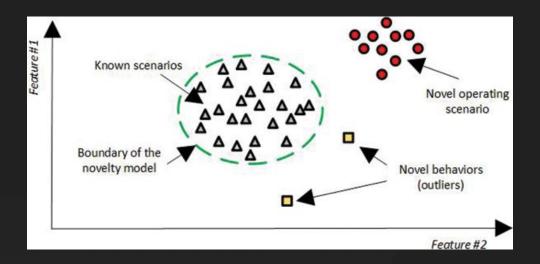
#### Outlier in dataset VS Outlier in the future

#### Outlier detection

The training data contains outliers which we are interested in detecting them.

#### Novelty detection

The training data does not contains outliers and we are interested in detecting whether a <u>new</u> observation is an outlier.





/ Q&A

What are your doubts?

