



# CIS 422/522 PROJECT 1

## TIME SERIES CONCEPTS

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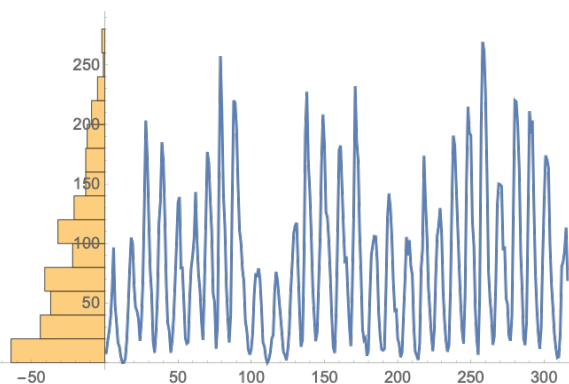
[jflore10@uoregon.edu](mailto:jflore10@uoregon.edu)

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## TIME SERIES CONCEPTS

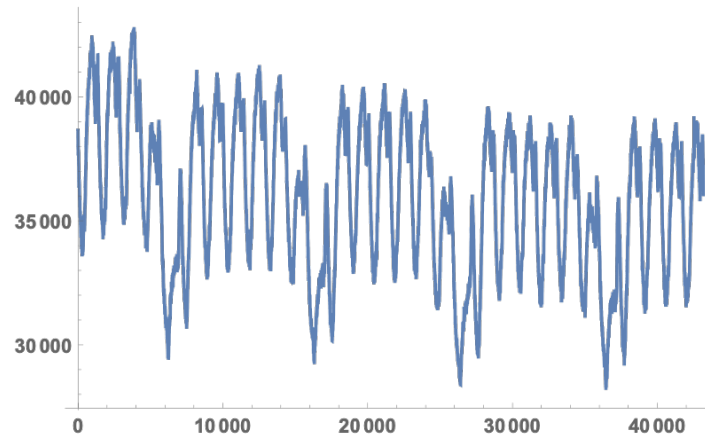
- Time Series
- Preprocessing
- Forecasting Models
- Forecasting
- TS2DB



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## TIME SERIES

$(x_t) t \in [1, T]$



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## Time Series Forecasting

### Time Series Forecasting Methods

- Qualitative
  - Subjective
  - No data available (new products)
  - Experts Opinion
- Quantitative
  - Use historical data
  - Mathematical/Statistical Model
  - Models behavior patterns
  - Projects those patterns to the future



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# Time Series Forecasting

## Quantitative Methods

- Regression
- Smoothing
- ARIMA
- Artificial Intelligence



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# Preprocessing

- Statistical Analysis
- Noise
- Outliers
- Missing Data
- Autocorrelation
- Chaos

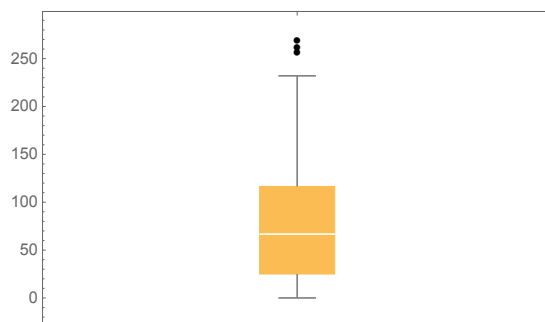


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## Statistical Analysis

5-number summary  
 {0.,24.9,66.7,116.3,269.3}

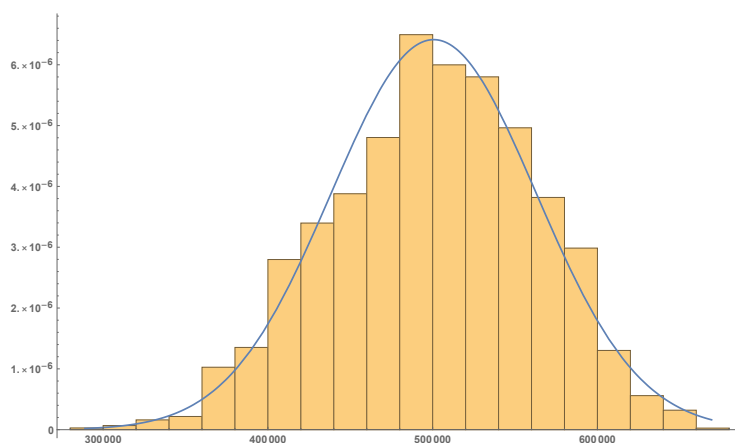
Mean = 79.5032  
 SD = 62.0572



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## Statistical Analysis

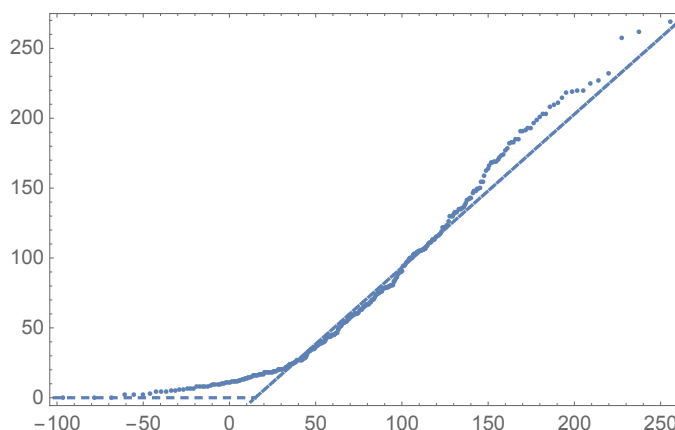


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## Statistical Analysis

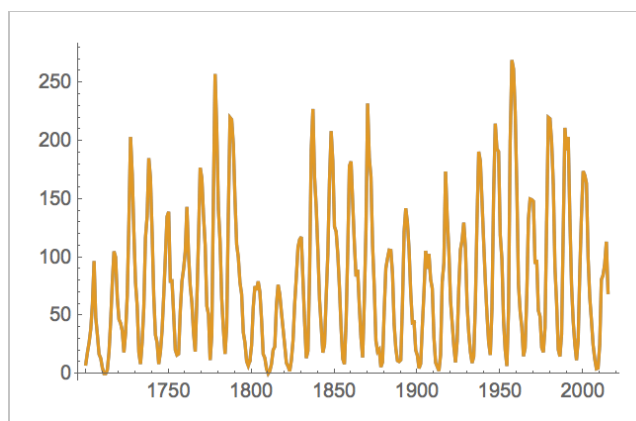
The null hypothesis that the data is distributed according to the  $\text{NormalDistribution}[79.5032, 62.0572]$  is rejected at the 5% level, based on the Cramér-von Mises test.



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## Noise Removal

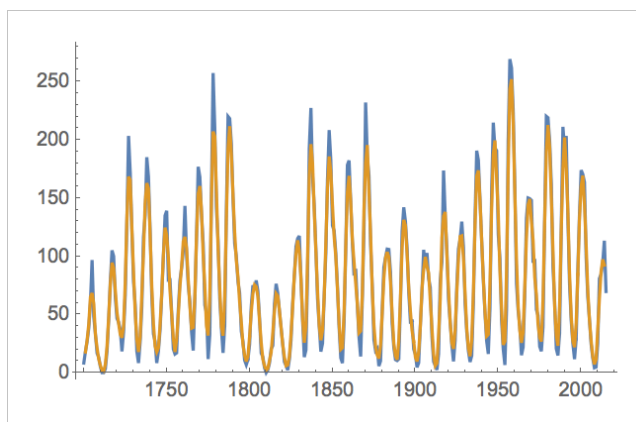
- Moving average
- Moving medians



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## Noise Removal

- Moving average
- Moving medians

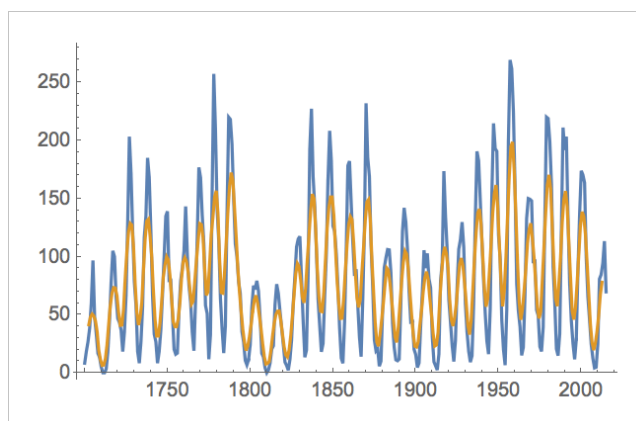


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## Noise Removal

- Moving average
- Moving medians

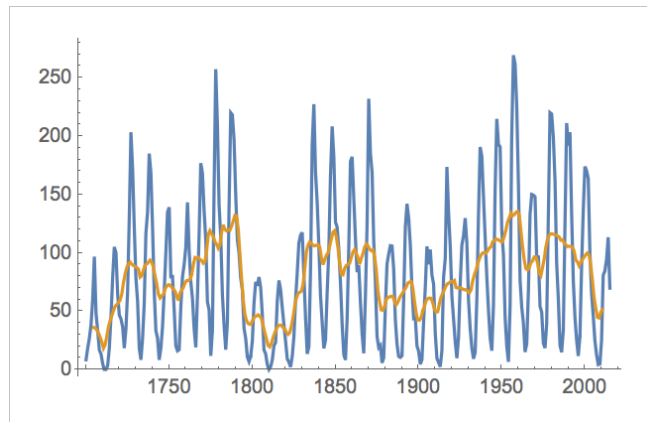


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## Noise Removal

- Moving average
- Moving medians

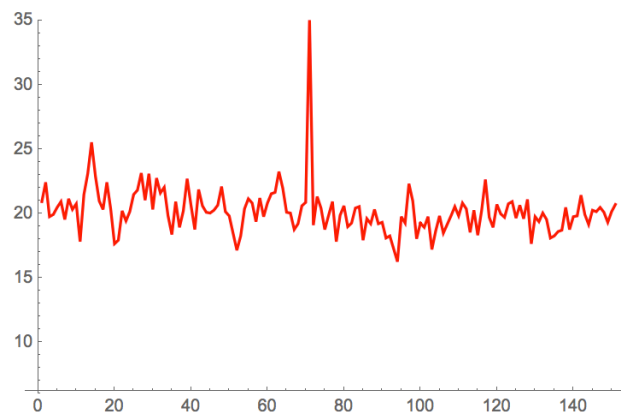


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## Outliers

- Context sensitive
- Air Temperature TS
- Synthetic Outlier

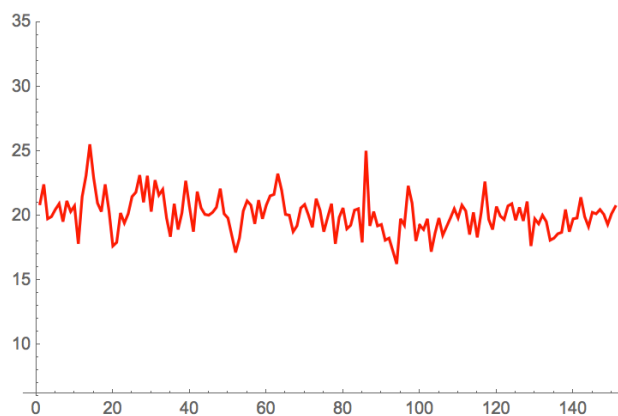


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## Outliers

- Synthetic outlier
- Can you spot it?

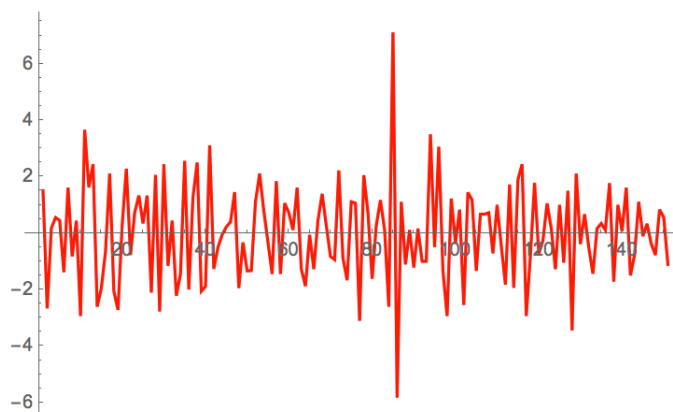


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## Outliers

- Difference  $T_i - T_{i-1}$



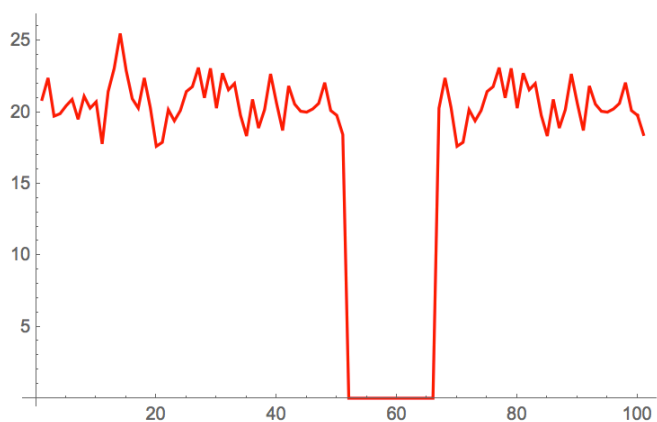
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## Missing Data

- Blackout
- Transmission failure
- Sick day

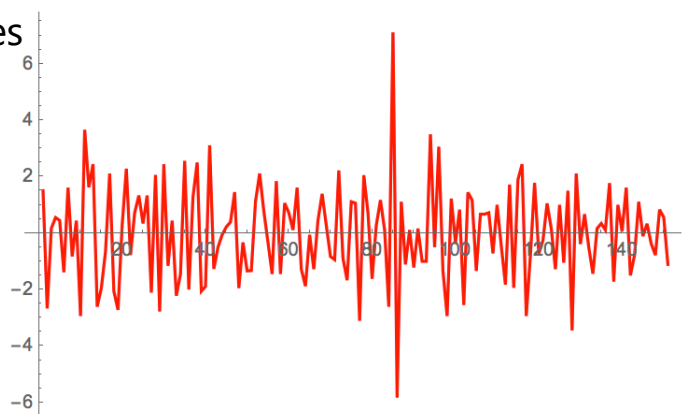


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## Differencing

- Difference also eliminates trend
- Discrete derivative



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## Other Transformations

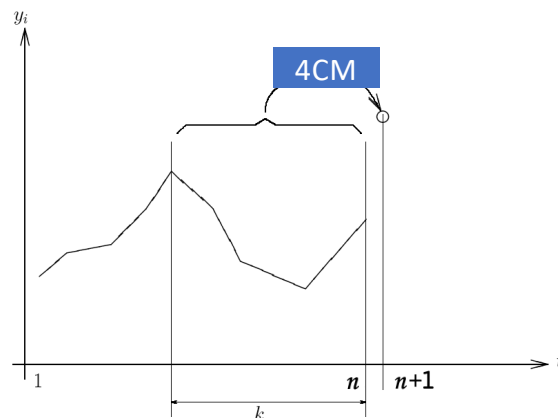
- Scaling/Normalization •  $y = (x - \min) / (\max - \min)$
- Standardization •  $y = (x - \mu) / \sigma$
- Logarithm •  $\text{Log}(x)$
- Cubic Root •  $\sqrt[3]{x}$

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## Forecasting Models

- Based on the TS history
- Determine the value at the next time instant

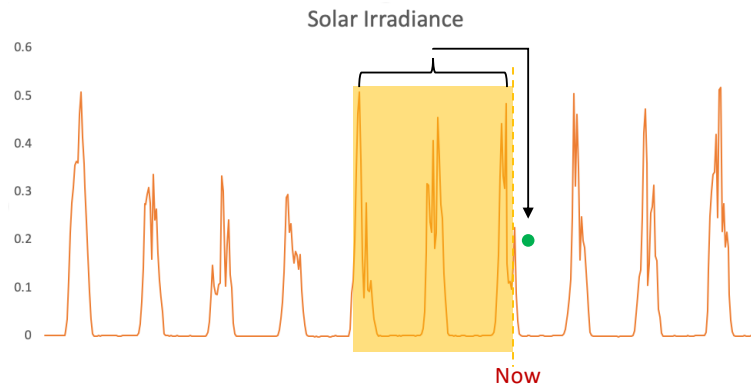


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## TS Forecasting

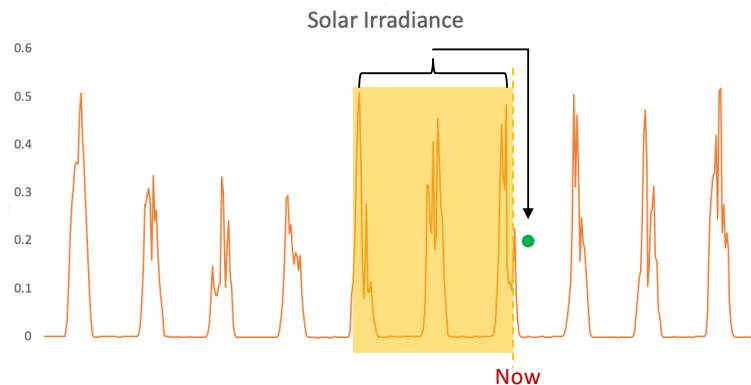
- Based on TS history
- Determine  $y_{n+1}$



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## TS Forecasting

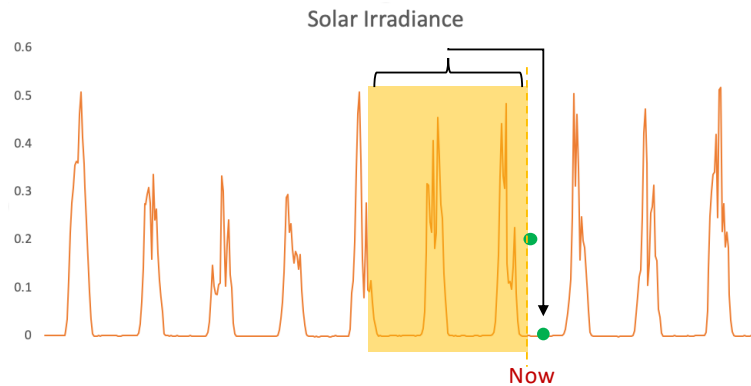
- **OSA** – One Step Ahead Forecasting
- Determine  $\langle y_{n+1}, y_{n+2}, \dots, y_{n+k} \rangle$
- One at a time



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## TS Forecasting

- **OSA** – One Step Ahead Forecasting
- Determine  $\langle y_{n+1}, y_{n+2}, \dots, y_{n+k} \rangle$
- One at a time

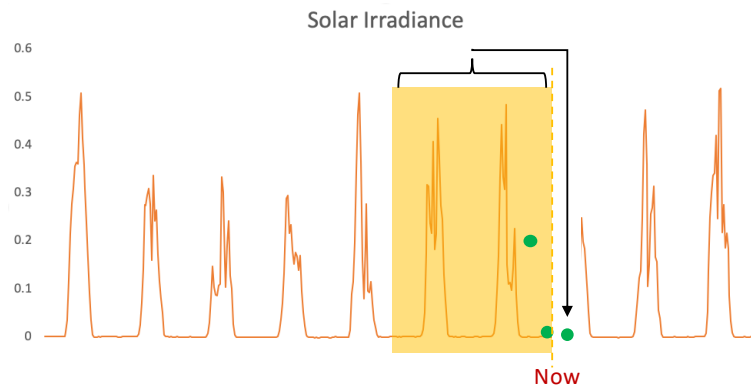


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## TS Forecasting

- **OSA** – One Step Ahead Forecasting
- Determine  $\langle y_{n+1}, y_{n+2}, \dots, y_{n+k} \rangle$
- One at a time

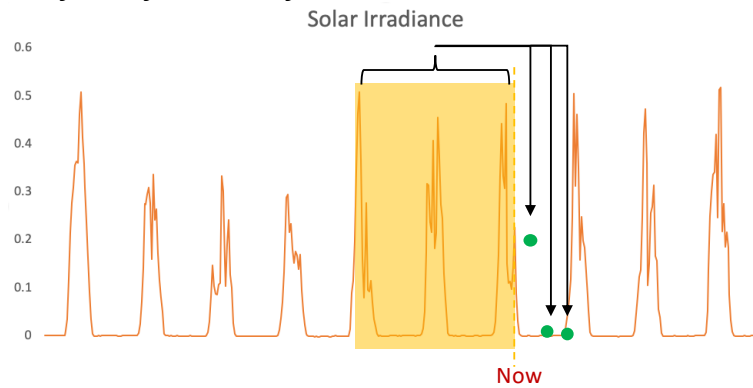


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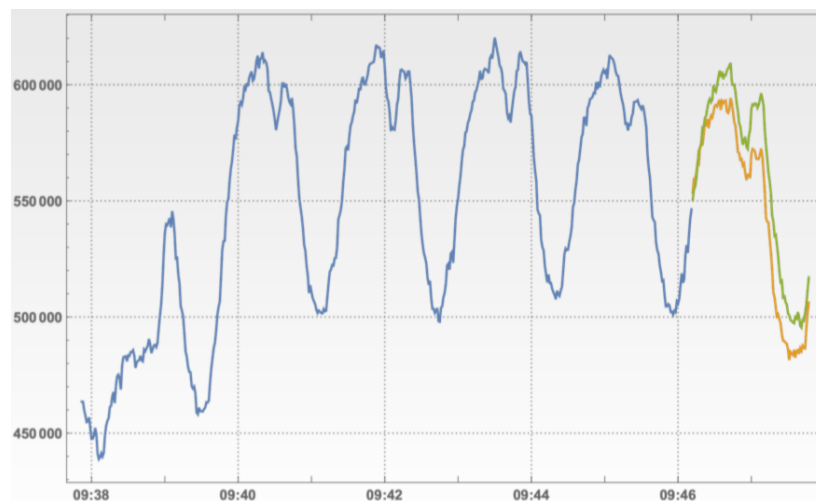
## TS Forecasting

- **MSS** – Multiple Step Simultaneous
- Determine  $\langle y_{n+1}, y_{n+2}, \dots, y_{n+k} \rangle$
- Simultaneously



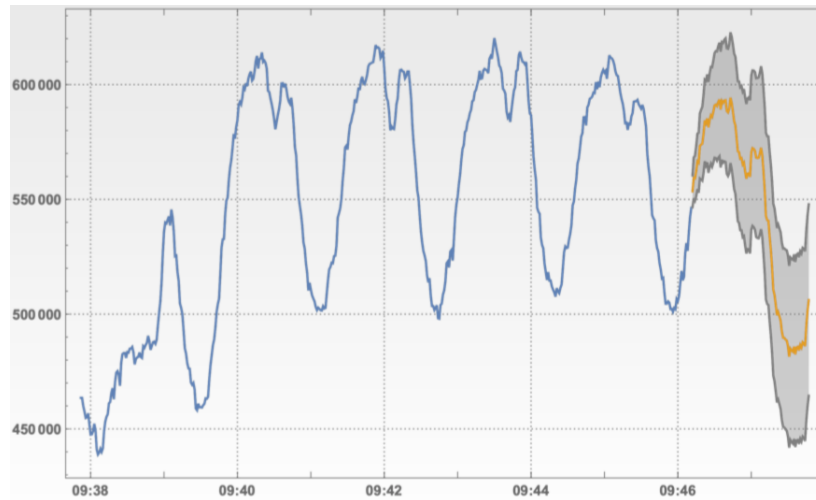
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## Point Forecasting



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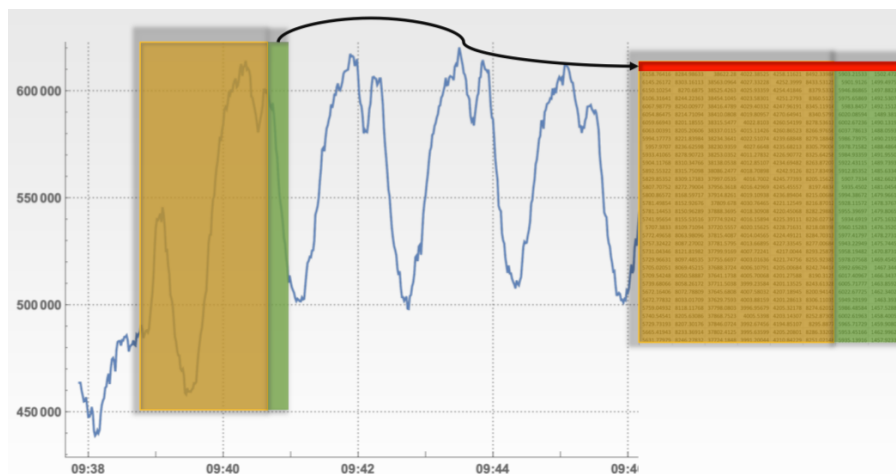
# Interval Forecasting



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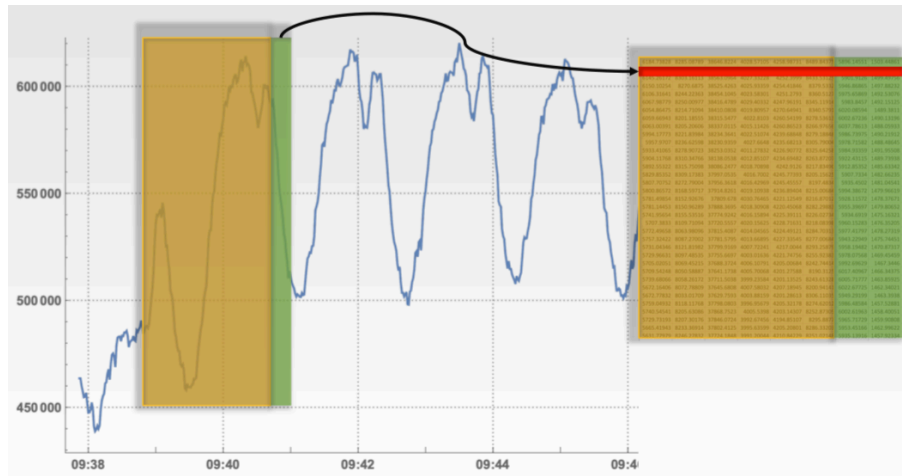
# TS to DB



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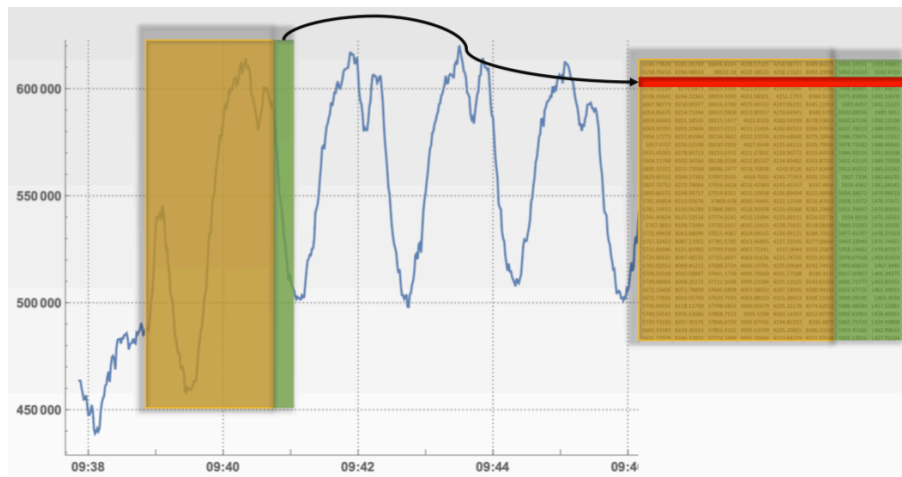
# TS to DB



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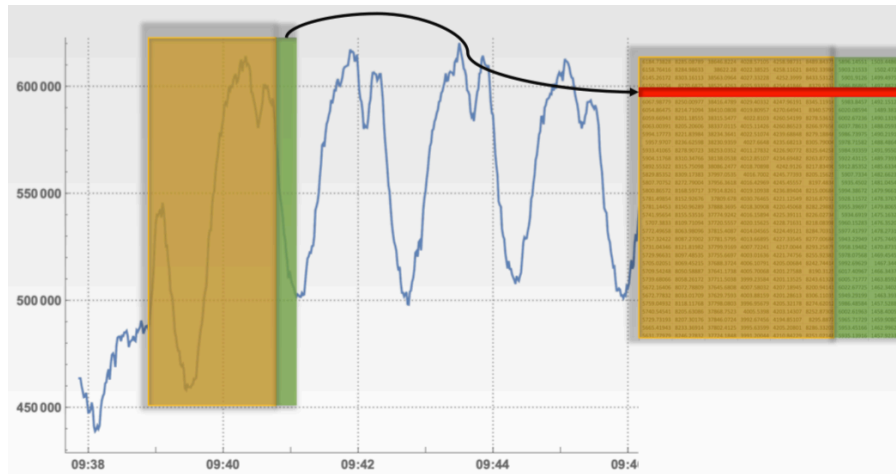
# TS to DB



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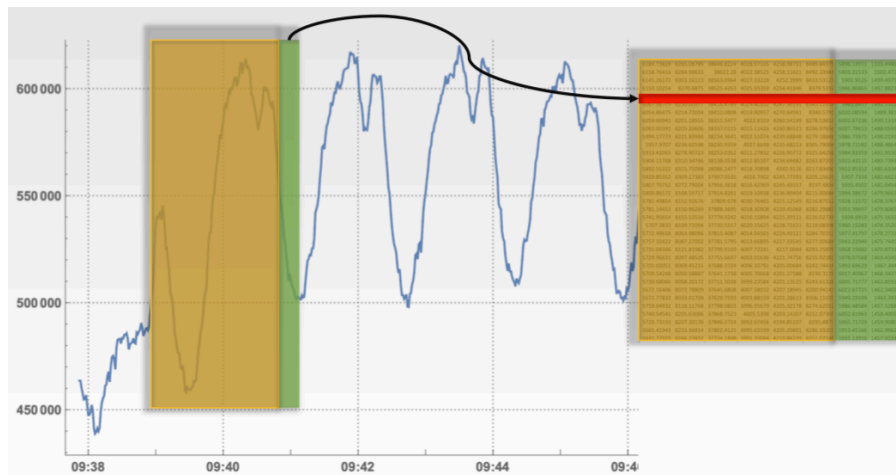
# TS to DB



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# TS to DB

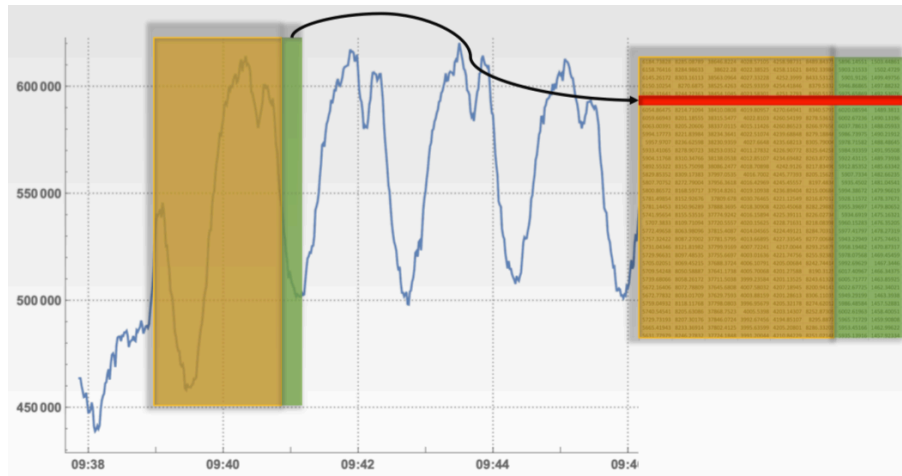


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## TS to DB



O

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## TS to DB



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## TS to DB

- Design Matrix
- Maps Forecasting to Regression
- Eliminates time (sequentiality)
- Shuffle records
- Be careful when splitting Training and Test sets

$f: X \rightarrow Y$

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## Error

$$\text{MSE} = \frac{1}{n} \sum_{i=1}^n (Y_i - \hat{Y}_i)^2$$

$$\text{MAPE} = \frac{1}{n} \sum_{t=1}^n \left| \frac{A_t - F_t}{A_t} \right|$$

$$\text{SMAPE} = \frac{100\%}{n} \sum_{t=1}^n \frac{|F_t - A_t|}{|A_t| + |F_t|}$$

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