

## Time Series Forecasting

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#### Outline

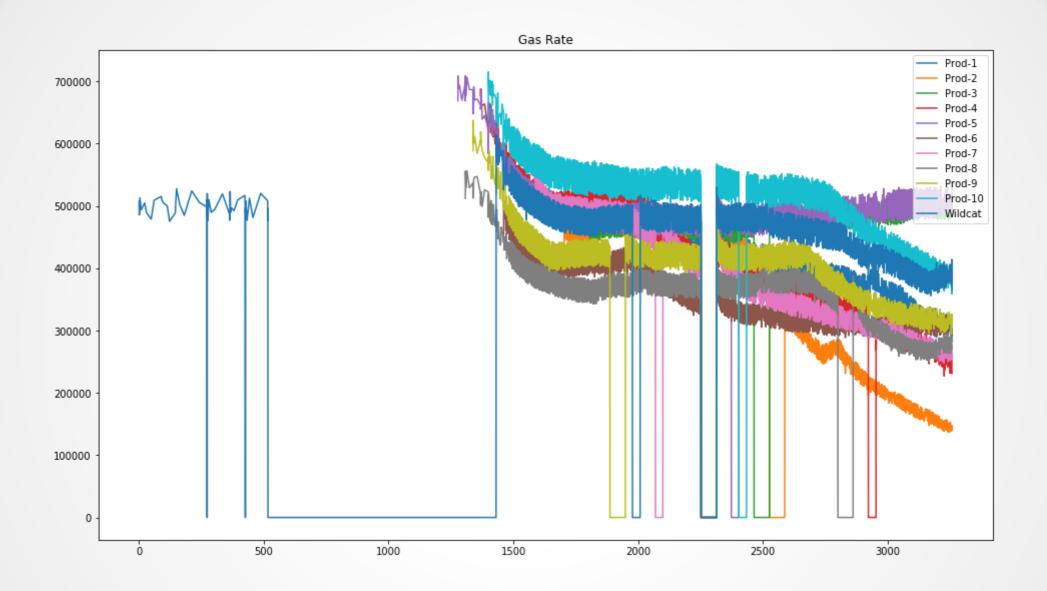
Definition: time series

Classical analysis

**HPC** Forecasting

Examples

#### Time Series



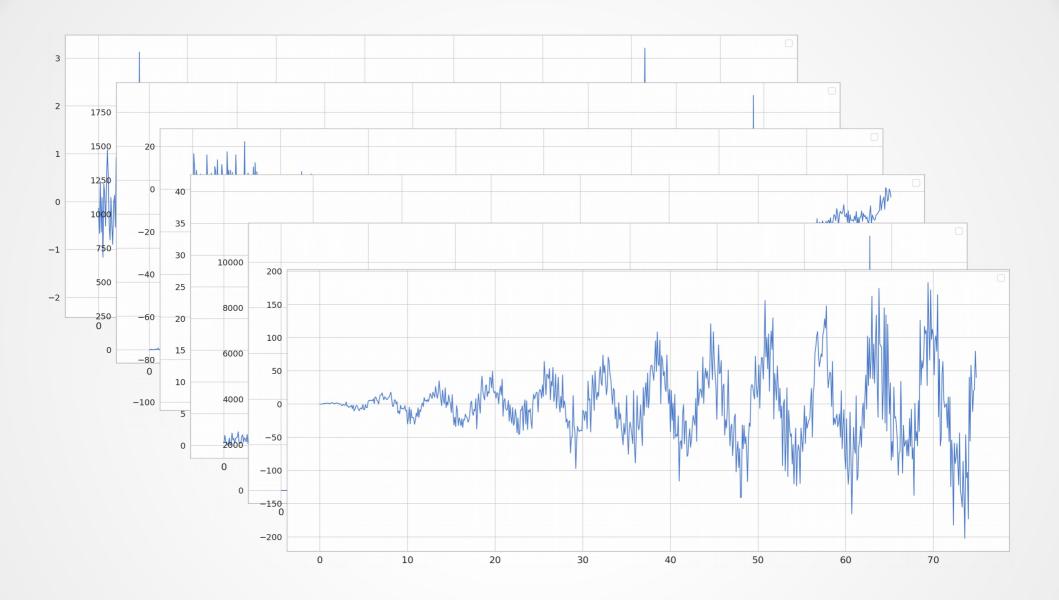
#### Time Series

Definition: F(t)

#### Applications:

Statistics, signal processing, pattern recognition, econometrics, weather forecasting, earthquake prediction, electromedicine, control engineering, astronomy, communications, Oil & Gas...

#### Time series



## Classical Analysis

Regression techinques

Linear prediction

Curve Fitting

Exponential smoothing

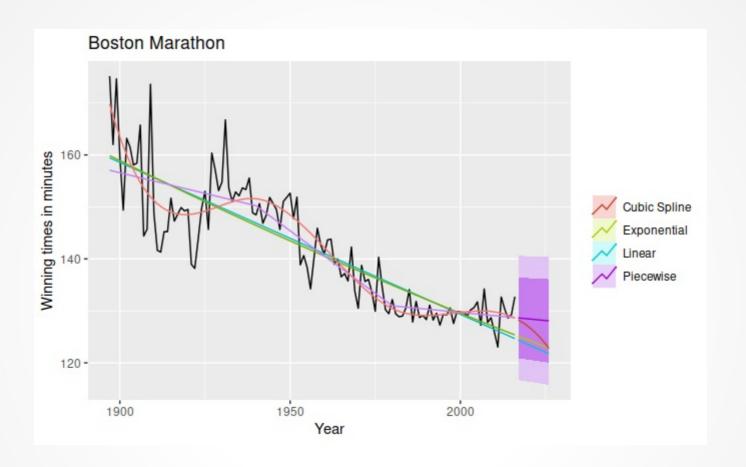
Auto-correlation

Spectral analysis

Function approximation

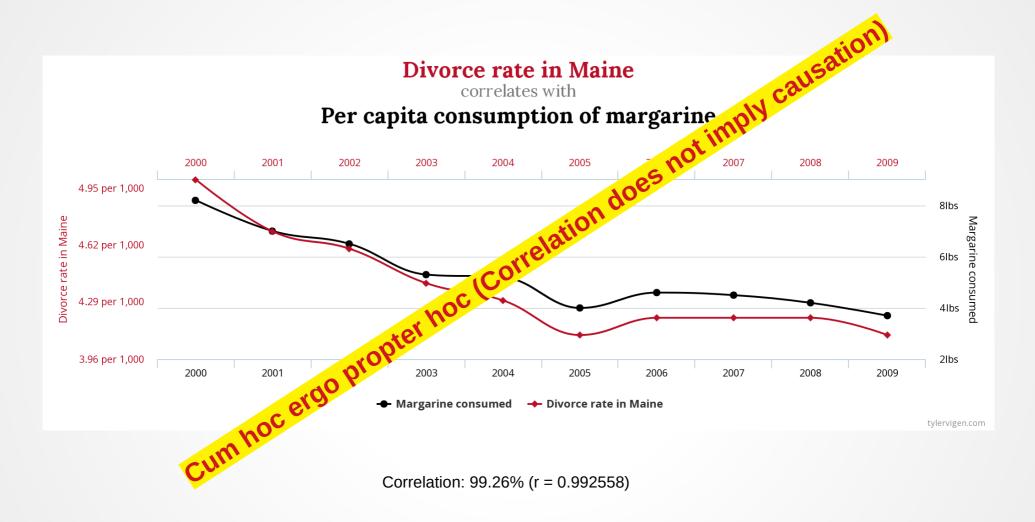
Interpolation

## Classical Analysis



Source: https://otexts.com/fpp2/nonlinear-regression.html

## WARNING!, STOP!, DANGER!



Source:http://www.tylervigen.com/spurious-correlations

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#### **HPC** Forecasting

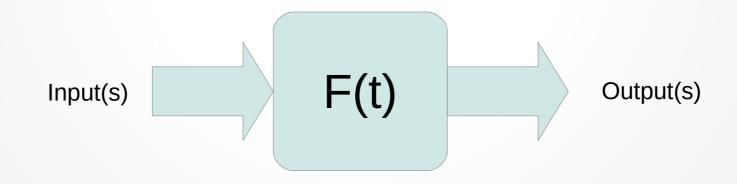
Long term forecasting

Time resolution

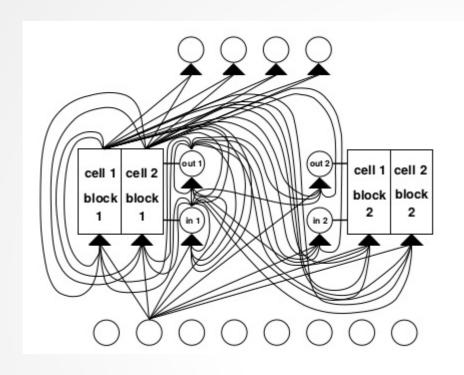
Several Inputs/outputs

Artificial Intelligence + HPC

Recurrent Neural Networks



## Long Short-Term Memory (LSTM)

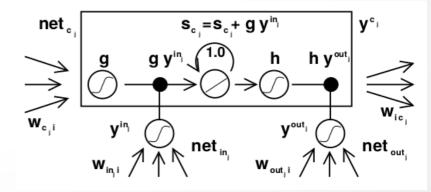


output

hidden

input

Source: Hochreiter, S. and Schmidhuber, J. LONG SHORT-TERM MEMORY, 1997



### Examples

$$f(t) = \sin(t) + \text{noise}(t)$$

Air Quality, source:

https://towardsdatascience.com/time-seriesanalysis-on-multivariate-data-in-tensorflow-2f0591088502

#### Steps

Collecting historical dataset

Data engineering (Pre-processing)

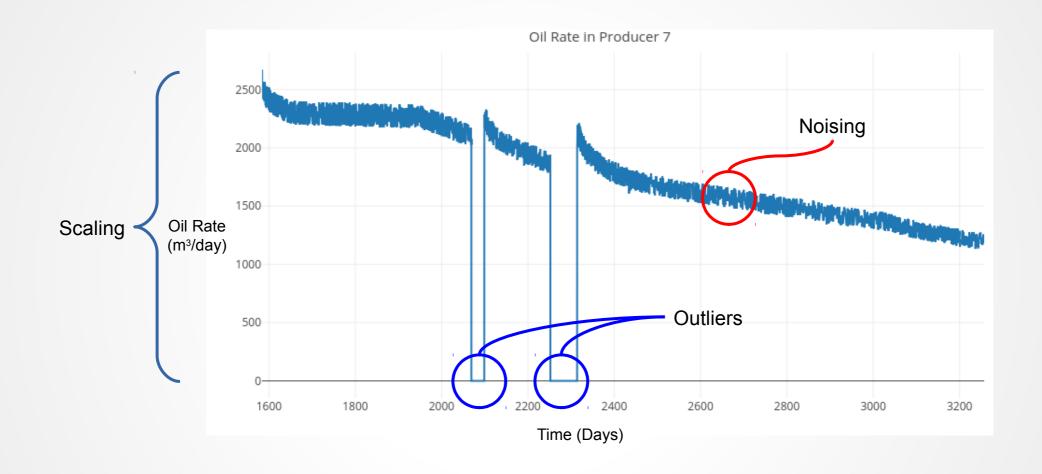
Data augmentation (interpolation, smoothing...)

Model Design (CNN, RNN, LSTM, GRU...)

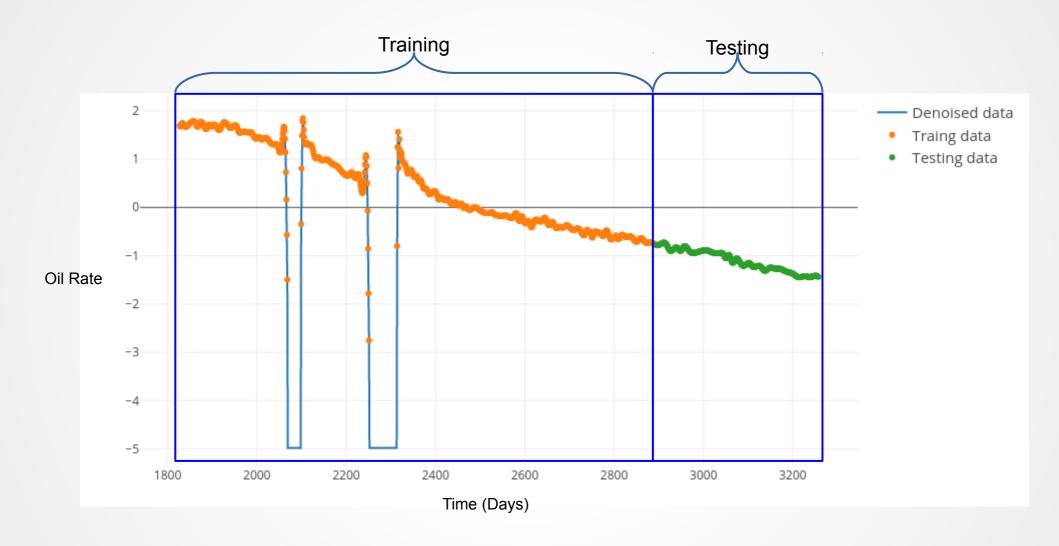
Training (GPU libraries – Keras, Pytorch...)

Testing

# Data Pre-processing

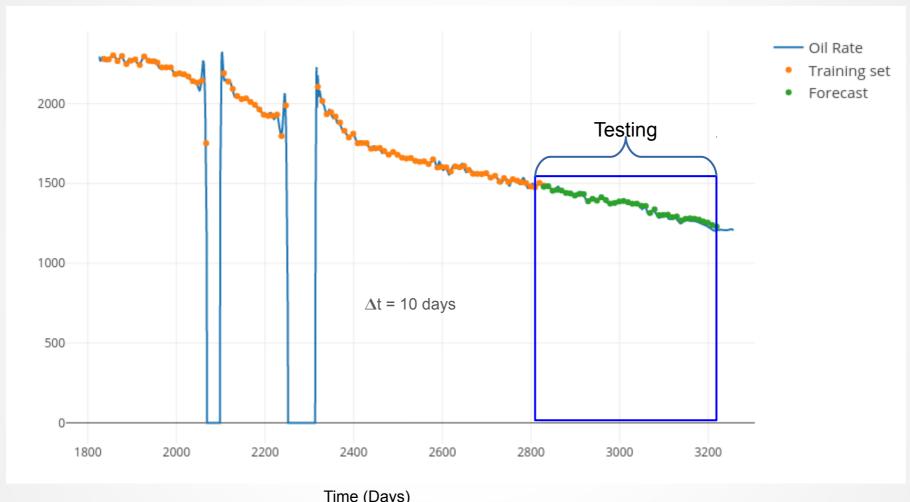


# Data Pre-processing

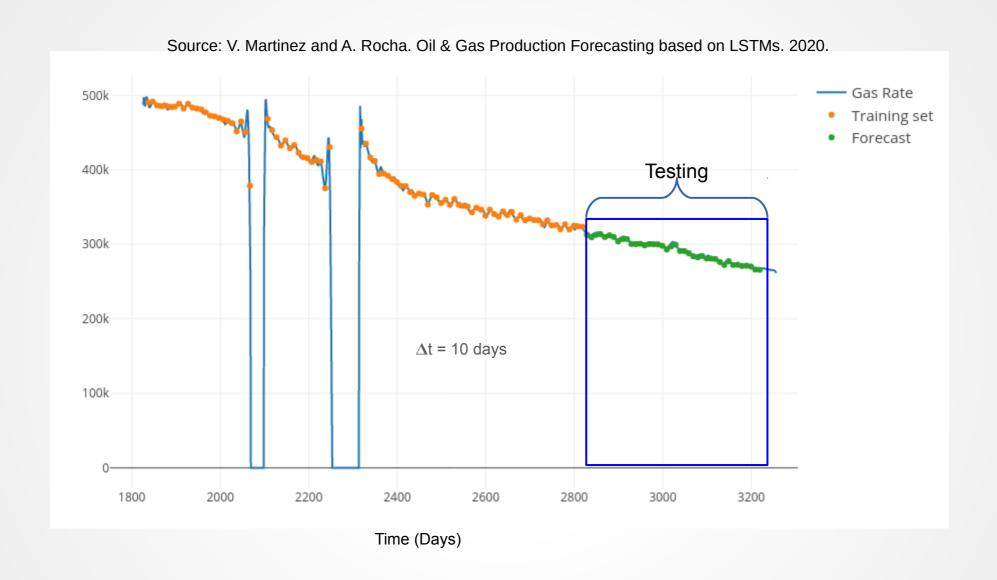


# Example: Oil Forecasting

Source: V. Martinez and A. Rocha. Oil & Gas Production Forecasting based on LSTMs. 2020.

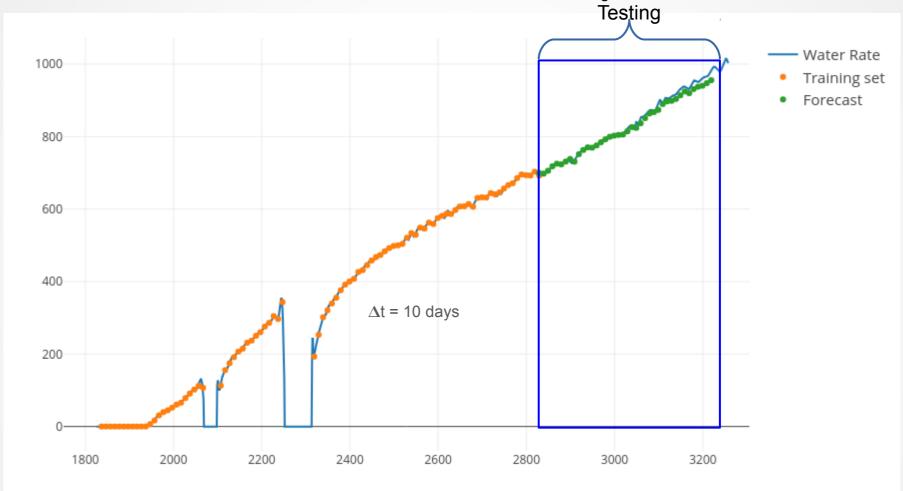


## Example: Gas Forecasting



## Example: Water Forecasting





#### Thanks!







