

Hierarchical Summary Forecasting

Christoph Bergmeir

University of Granada, Spain

<https://www.cbergmeir.com>

Hierarchical forecasting

- In hierarchical forecasting, we usually assume that we can aggregate the actual, past data within a hierarchy.
- The problem then comes when we forecast, as the forecasts do not necessarily add up.
- However, in practice it is often not that simple.

Motivating example

- Let's assume we have a peak demand energy tariff, where we pay according to our maximum consumption over a 30-minute window, per month
- Let's assume we want to forecast this series 18 months out.
- Should we use the 30-minutely time series for forecasting, or the time series of monthly maxima? Do we want to forecast a 30-minutely time series 18 months out?

Motivating example (2)

- What happens if this is one household and we now want to build the usual hierarchy across households, regions, etc.
- The historical series of monthly peaks will not add up in a meaningful way across households.
- We can solve the problem by going back to the original 30-minute granularity, to get all monthly series on all levels. Still the monthly series will not add up.
- How to forecast? How to reconcile?
- What if we do not have the high-frequent data or it doesn't even exist?

More problems from the energy sector

- Disclaimer: I don't consider myself an expert in this...
- Wind turbines work internally with 22Hz, but their SCADA systems oftentimes historize only 1-second data. Min, max, mean per second.
- Energy markets work on 4-second or 1-second granularity presumably also already aggregated over time in some way.
- The assumption is that over, e.g., 4 seconds or 1 second, the power (or frequency, voltage (?)) will be constant (or smooth) over this short time window.
- If the value is constant, minimum, maximum, mean, median, are all the same, and everything adds up correctly.

Problems in other sectors

- This is not a problem limited to the energy sector, in capacity planning and supply chain similar problems exist.
- Often, the series are not only daily minima and maxima, but quantiles (e.g., 0.05, 0.95), which makes the problem even more difficult.

Way forward

We have some initial ideas how to tackle parts of the problem, but I would be very happy to discuss with anybody interested

Thank You

<https://www.cbergmeir.com>

bergmeir@ugr.es