

Identification and Visualization of Correlation Structures in Large-Scale Power Quality Data

Max Domagk, Jan Meyer, Marco Lindner



Motivation

Current developments

- Increase in renewables and new technologies (e.g. HVDC) → more power electronics
- Potential impact on PQ levels (e.g. harmonics) → extended PQ monitoring campaigns
- Large amounts of data (often only compliance assessment) → underutilized potential

Correlation Analysis

- Identification of systematic and recurring correlations
- Analysis of dependencies and propagation
- Open challenge: multivariate data (sites, parameters, phases) exceeds manual analysis



Motivation

State of the art

- Mostly pairwise relationships, few sites and PQ parameters
- Manual selection and interpretation

Gap

- No automated, scalable analysis for full measurement campaigns

This paper

- Automated analysis and visualization of correlation structures
- Daily Spearman coefficients, aggregated across phases, parameters and sites
- Distance-based visualization (clustering and 2D projection)



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Measurement Data

Dataset

- German transmission system
- 85 measurement sites (110-380 kV)
- 10-min values acc. to IEC 61000-4-30
- 20 voltage and current parameters
 - RMS,
 - THD/THC,
 - harmonics (order 3–15, odd),
 - flicker,
 - Unbalance

→ 58 parameter-phase combinations

Correlations

- Between parameters:

$$140,505 = 1,653 \text{ pairs per site} \times 85 \text{ sites}$$

- Between sites:

$$207,060 = 3,570 \text{ pairs per parameter} \times 58$$

→ 347,565 correlations in total



Methodology

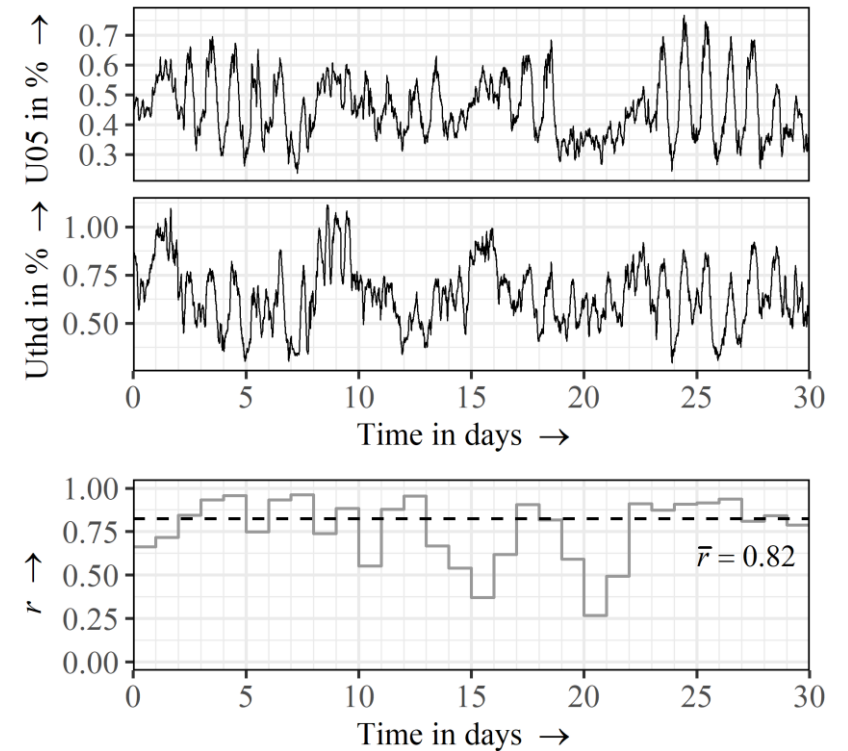
- Hundreds of thousands correlations → interpretable structures

Calculation of daily
correlation coefficients

Averaging of coefficients

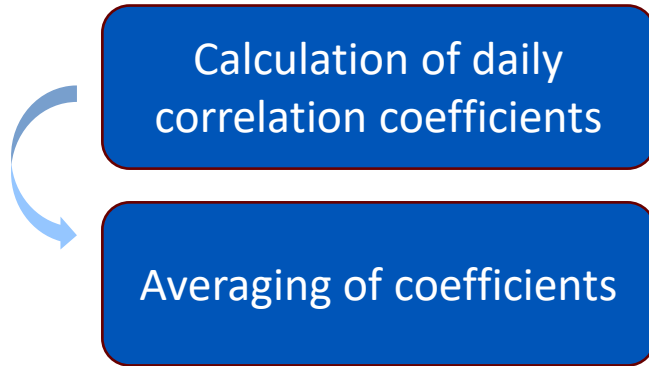
- Daily Spearman coefficients
- Per site and parameter pair
- Averaging over all days/phases
- Fisher-z transformation

Parameter pair of one site



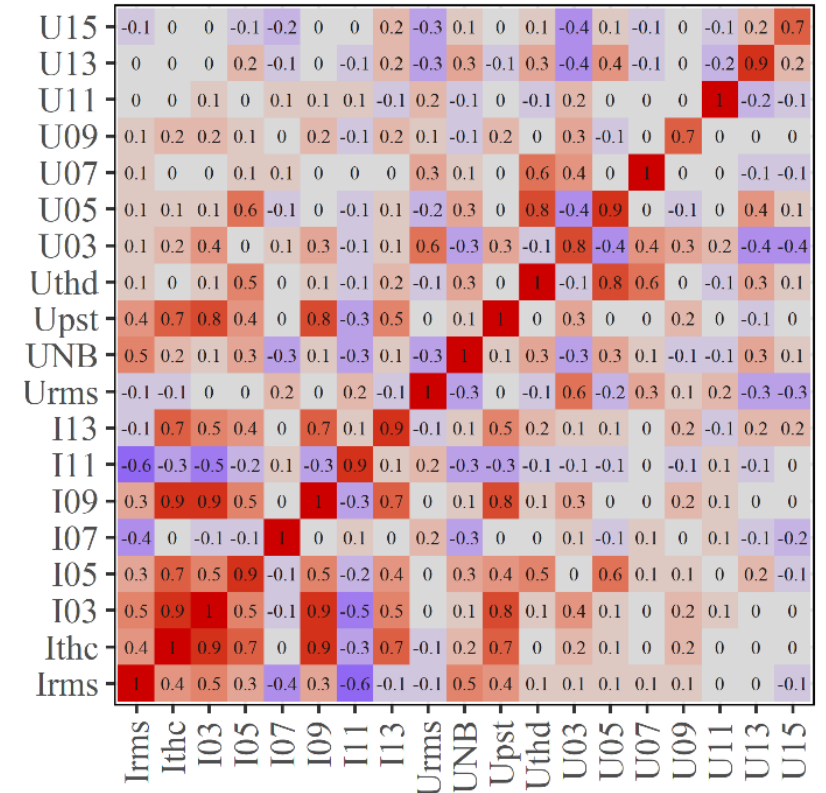
Methodology

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- Daily Spearman coefficients
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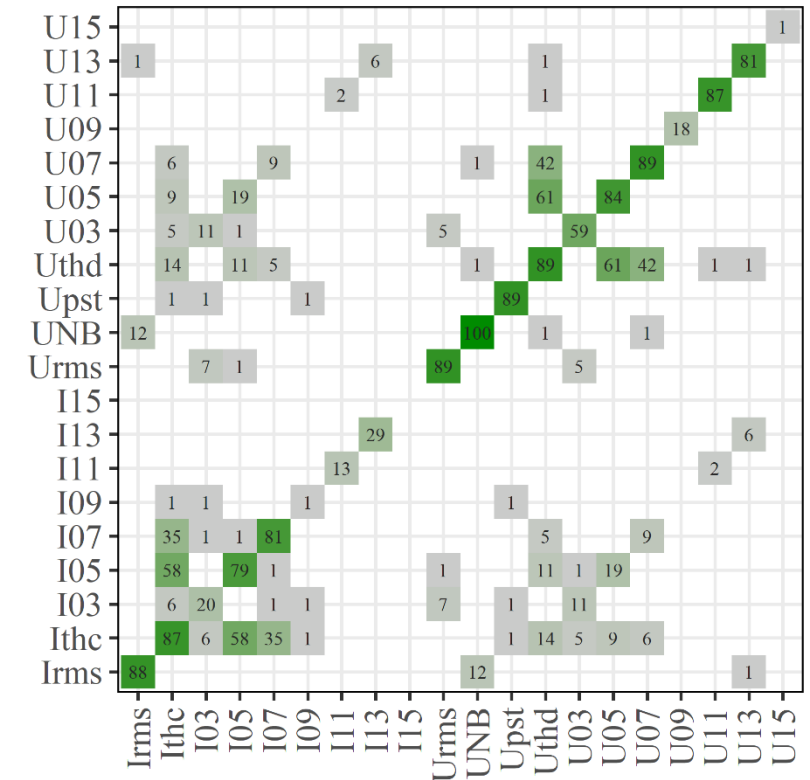
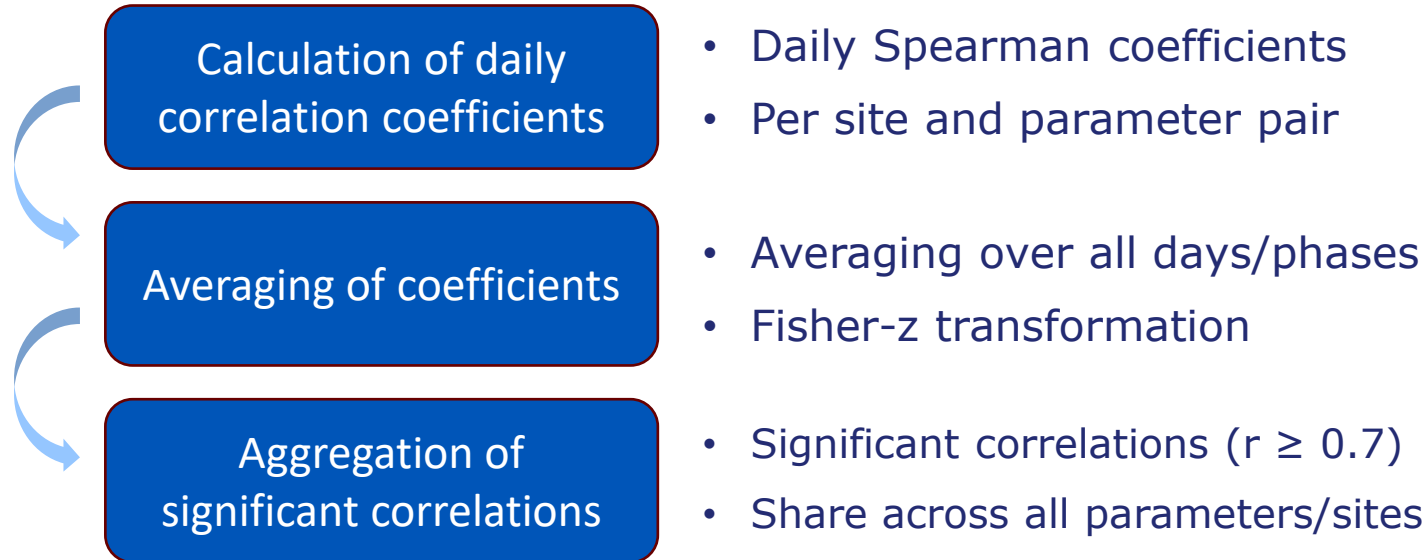
Parameters of one site



Methodology

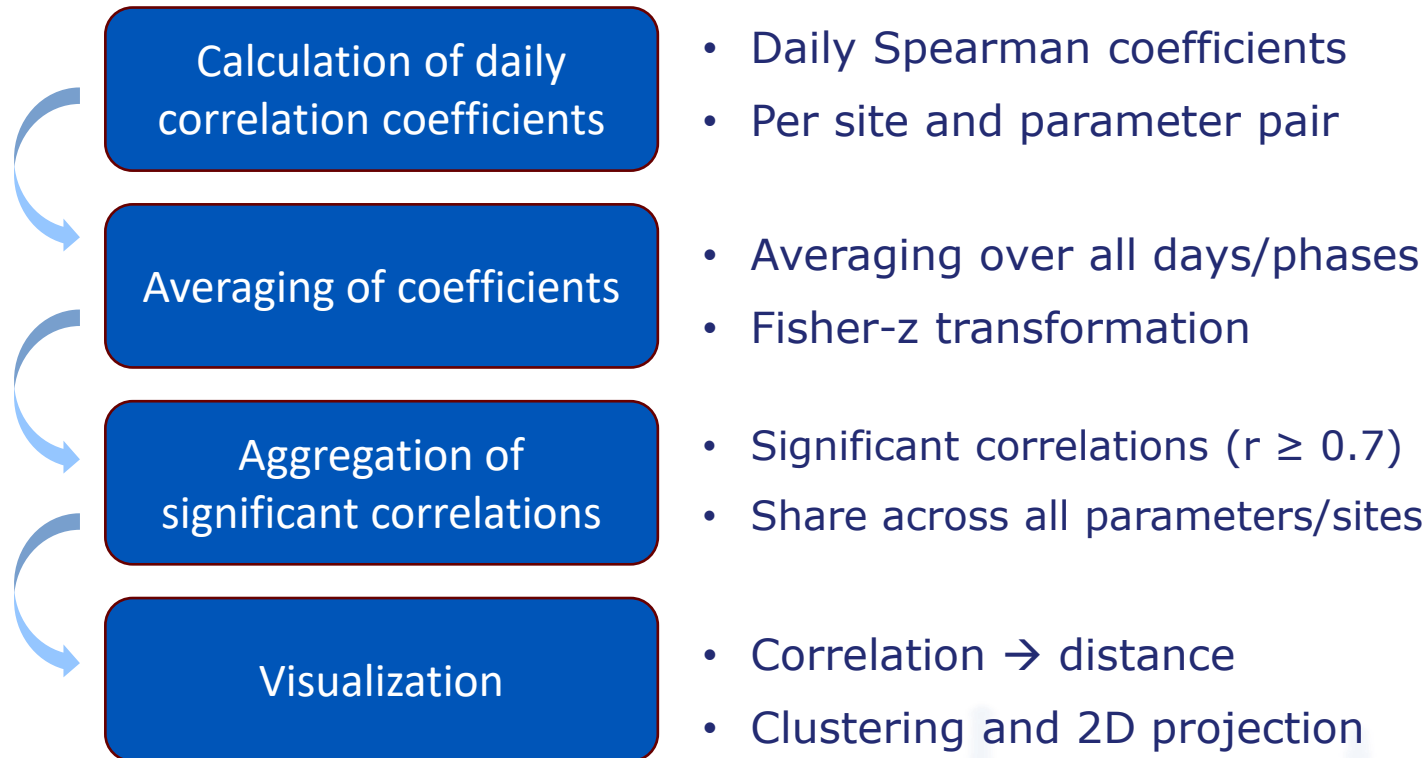
- Hundreds of thousands correlations → interpretable structures

Share of sites with significant correlations

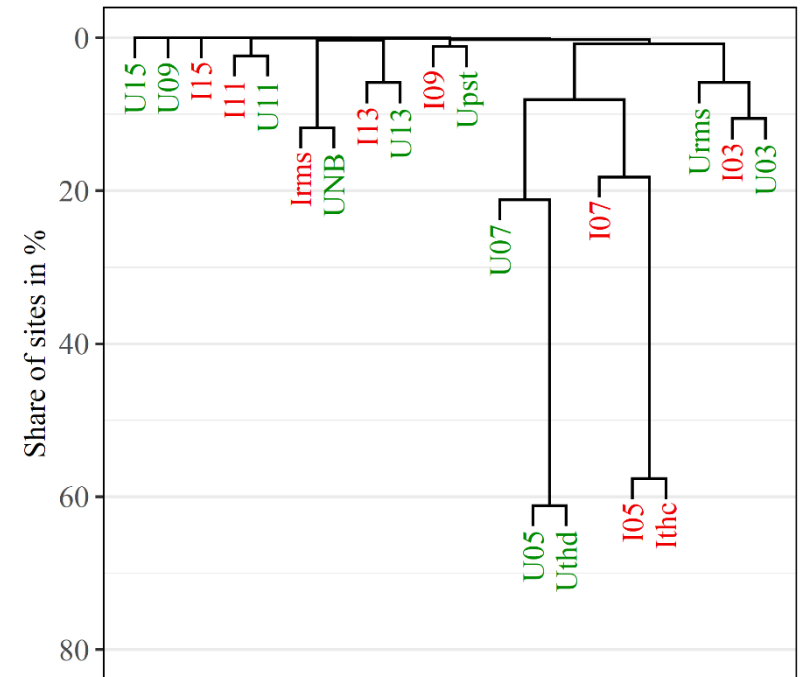


Methodology

- Hundreds of thousands correlations → interpretable structures

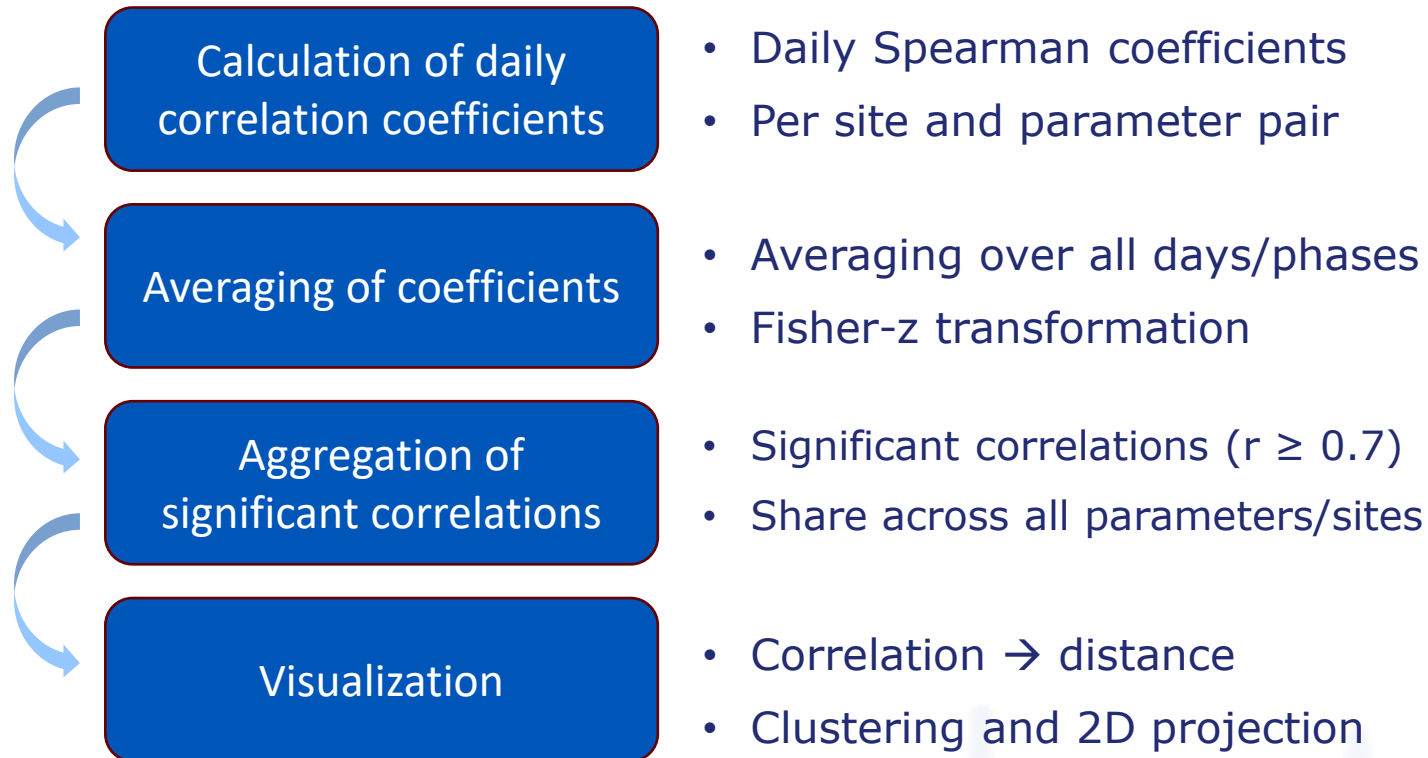


Dendrogram of hierarchical clustering

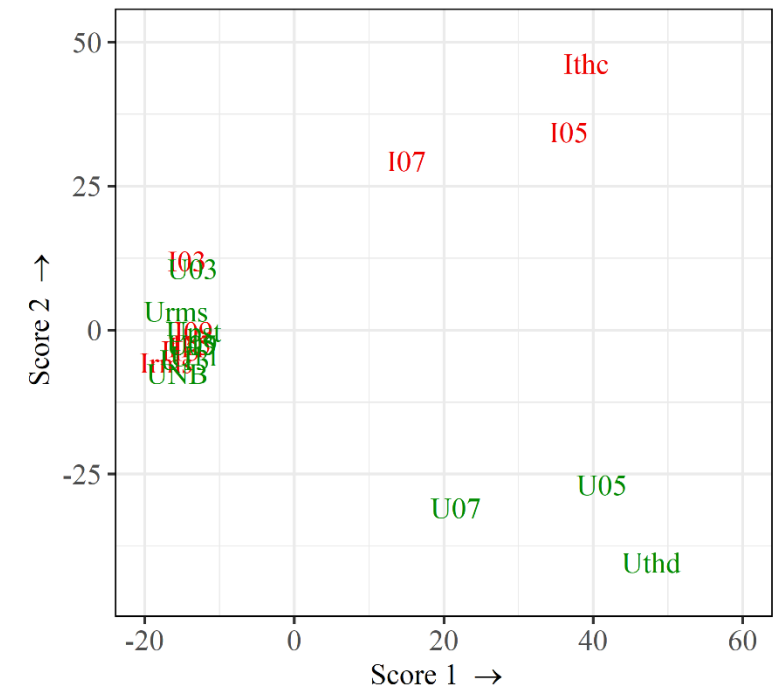


Methodology

- Hundreds of thousands correlations $\rightarrow$ interpretable structures

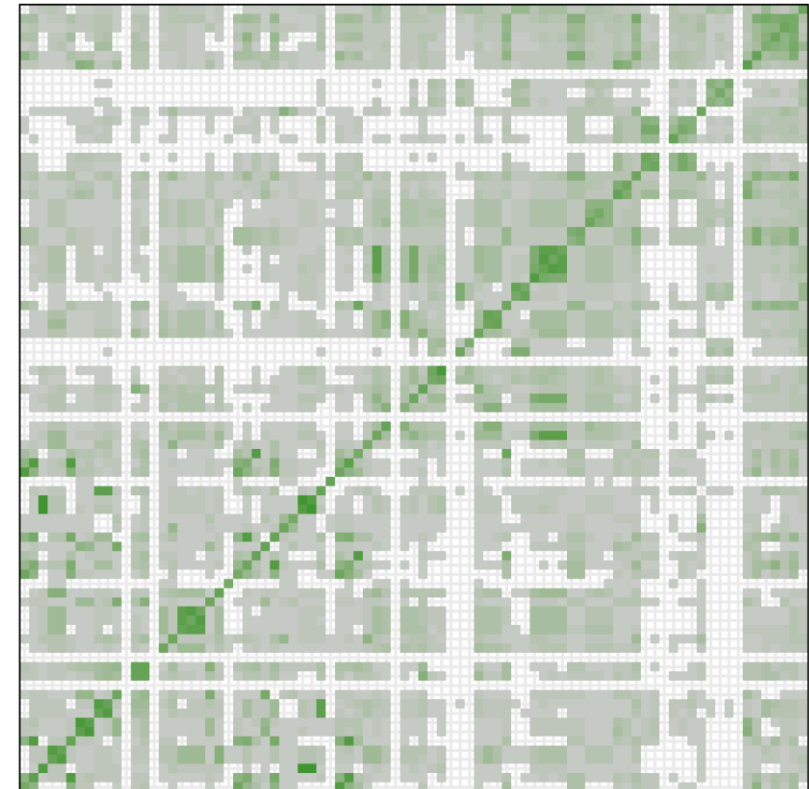


2D projection via multidimensional scaling



Results – Correlations between sites

- Aggregation matrix for 85 sites:
too large for direct interpretation



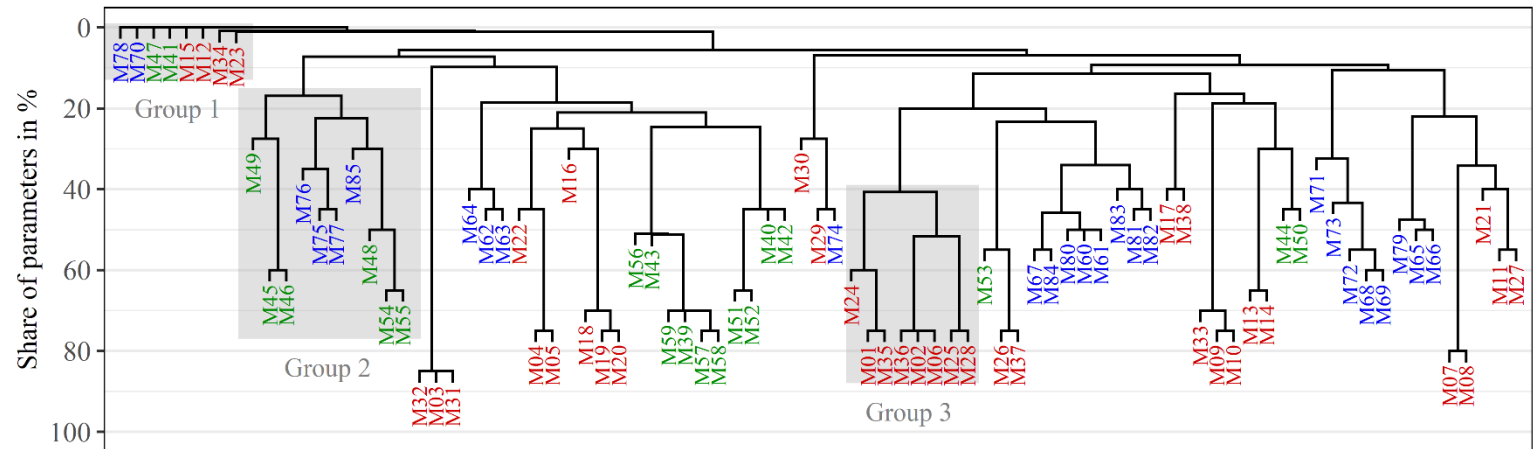
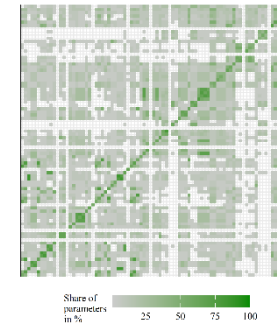
Share of
parameters
in %

25 50 75 100



Results – Correlations between sites

- Aggregation matrix for 85 sites:
too large for direct interpretation
- Visualizations make the
correlation structure interpretable
- Three exemplary groups:
 - **Group 1:**
no or very few correlations
with other sites
 - **Group 2:**
220/380 kV, 20–60 % of
parameters correlated
 - **Group 3:**
110 kV, 40–75 %
correlated, weak links to
other groups

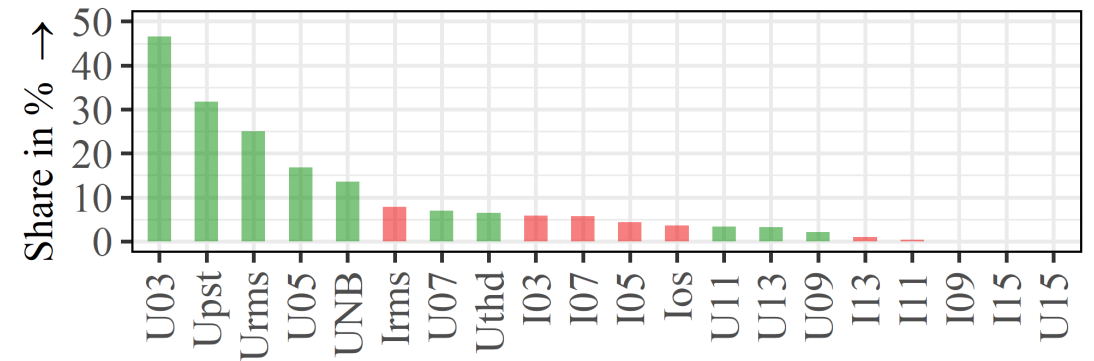


110 kV, 220 kV, 380 kV



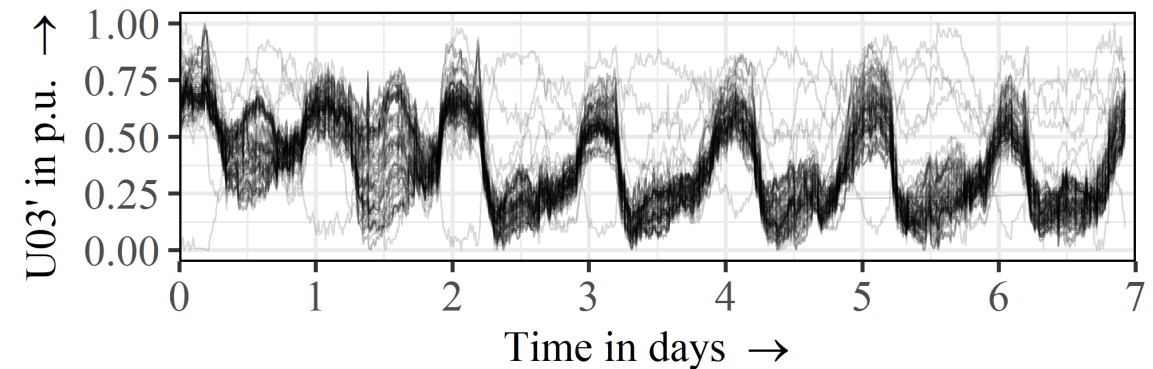
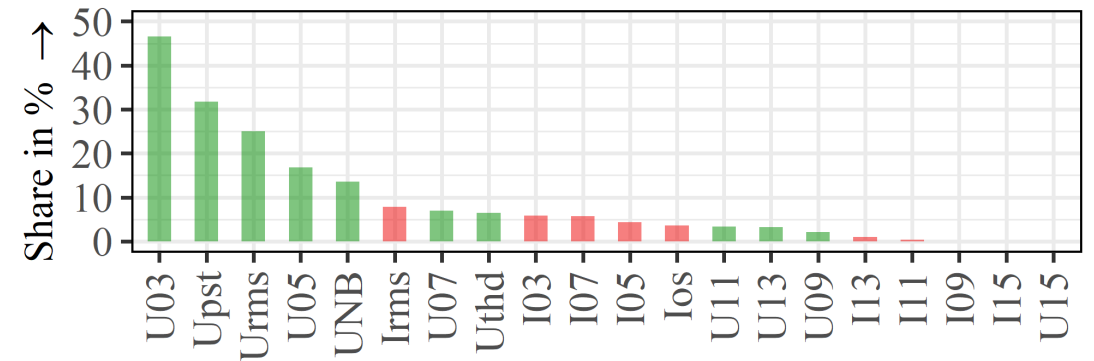
Results – Correlations between sites

- Most sites correlate for only 1-2 parameters
- Highest shares: U03 (47 %) and Upst (33 %)
→ propagation across large parts of the network
- Higher-order harmonics remain local



Results – Correlations between sites

- Most sites correlate for only 1-2 parameters
- Highest shares: U03 (47 %) and Upst (33 %) → propagation across large parts of the network
- Higher-order harmonics remain local
- Time series of U03 across all 85 sites confirm the temporal similarity



Conclusion

Findings

- Averaging and aggregation make hundreds of thousands of correlations interpretable
- Clustering and 2D projections reveal correlation structures
- Flicker and 3rd voltage harmonic tend to correlate network-wide, higher-orders remain local
- Methodology scales to full measurement campaigns (85 sites, 20 parameters)

Outlook

- Correlation-based time segmentation → temporal changes and operational regimes



Thank you for your attention!



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