

Day-ahead market coupling in an agent-based electricity market model

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A satellite view of the Earth from space, showing the curvature of the planet and the blue atmosphere. The view is centered on Europe and Africa.

Knowledge for Tomorrow

Motivation

- Long record of energy system models (ESM) (Gilliland, 1975)
- Growing complexity leading to new challenges to modelers (Pfenninger et al., 2014)
- Challenging to account for highest GHG reduction targets in current ESM (Pye et al., 2021)

- Agent-based modelling (ABM) is a promising approach:
 - incorporating the actors' perspective (e.g. Nitsch et al., 2021)
 - representation of heterogenous actors (e.g. Kraan et al., 2018)
 - real-world examples relatively cheap in terms of computational cost (e.g. Hansen et al., 2019)

- Therefore, we apply the ABM AMIRIS to simulate electricity markets
- Our main research interest:
 - integration of renewable energies & flexibility options in electricity systems
 - analysis of market effects caused by policy and remuneration schemes



Project VERMEER

Security of supply in Germany and Central Europe during extreme-weather events

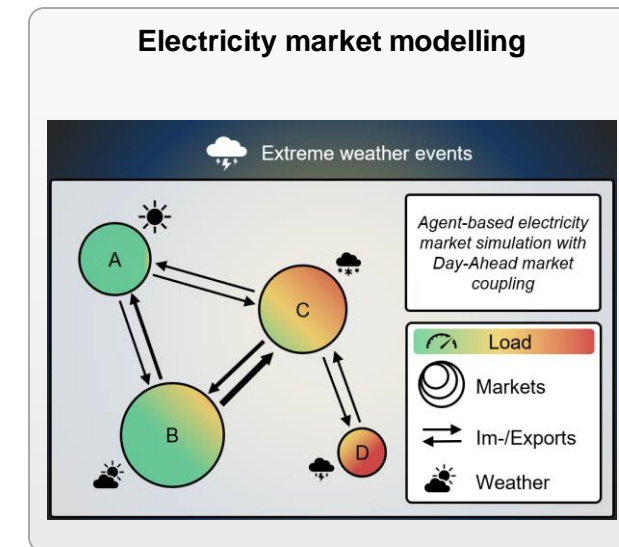
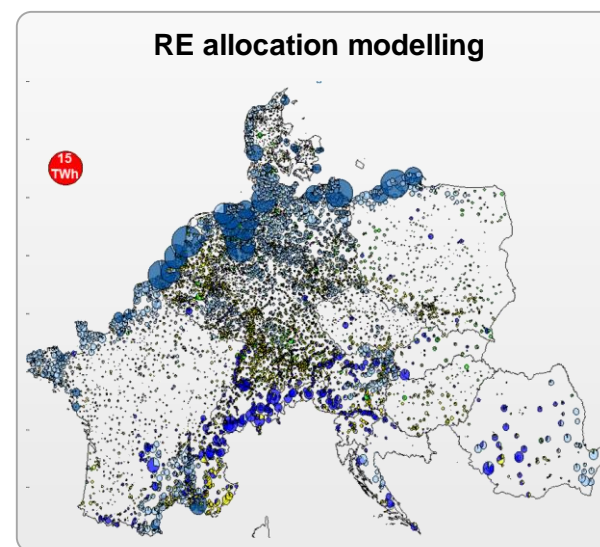
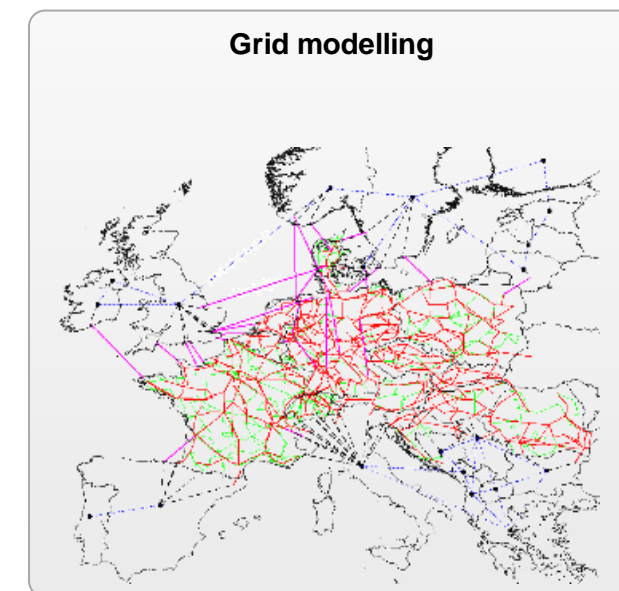
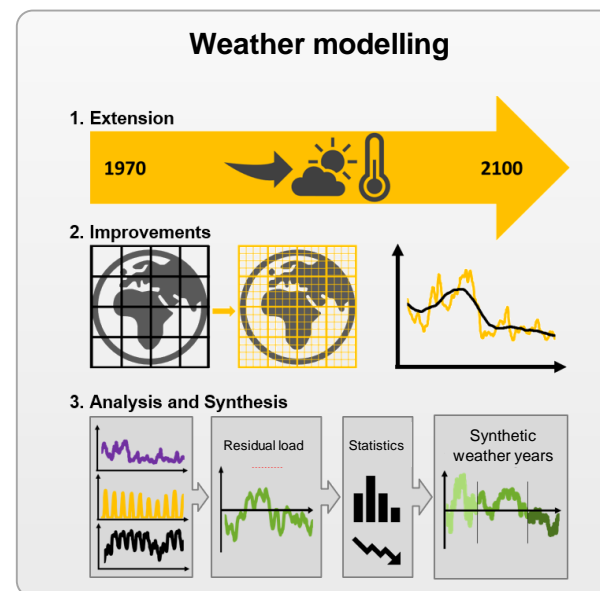
Investigation of flexibility of cross-border electricity trading during extreme-weather events considering dynamic Net Transfer Capacities (NTC)

Funded by BMWi (03EI1010A)

Project partners:

KIT Karlsruhe (<https://www.iip.kit.edu>)

DLR Stuttgart (<https://www.dlr.de/ve>)



AMIRIS

Agent-based Market model for the Investigation of Renewable and Integrated energy Systems

Model

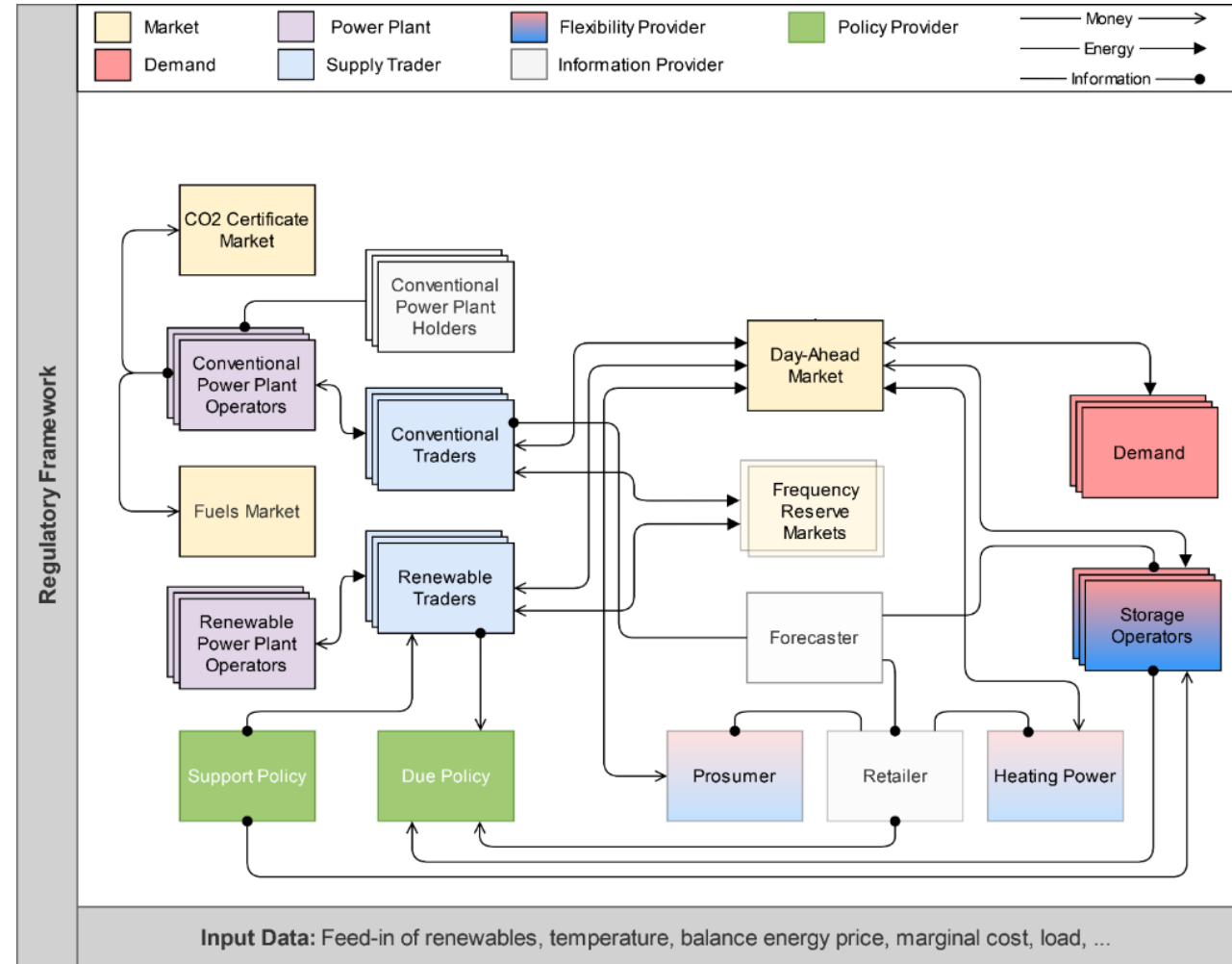
- Electricity market simulation
- To be **Open Source** in Q4/2021

Agents

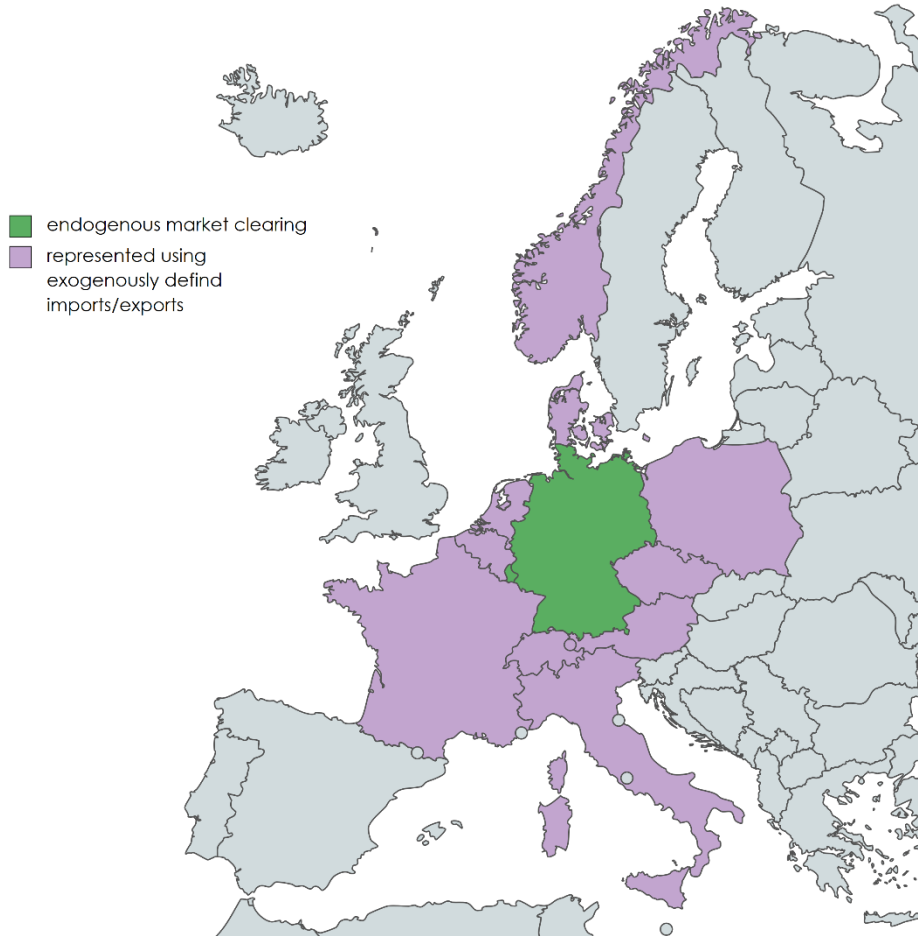
- Conventional Plants
- Renewable Plants
- Traders
- Flexibilities
- Markets
- Policy
- Forecasting

Calculates

- Electricity prices
- Plant dispatch
- Market values
- Emissions
- System costs



Geographic scope of AMIRIS



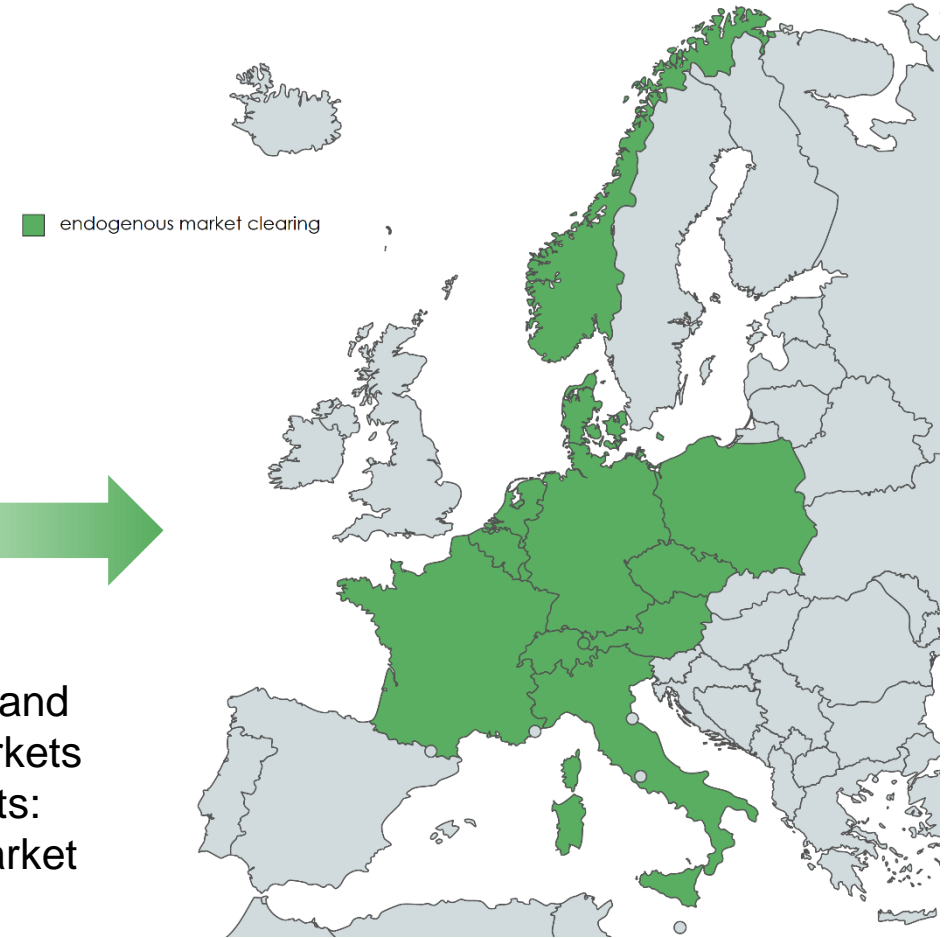
Currently:

- German market model
- Imports & exports: predetermined timeseries



Goal:

- Modell German and neighboring markets
- Imports & exports: Modelled via market coupling



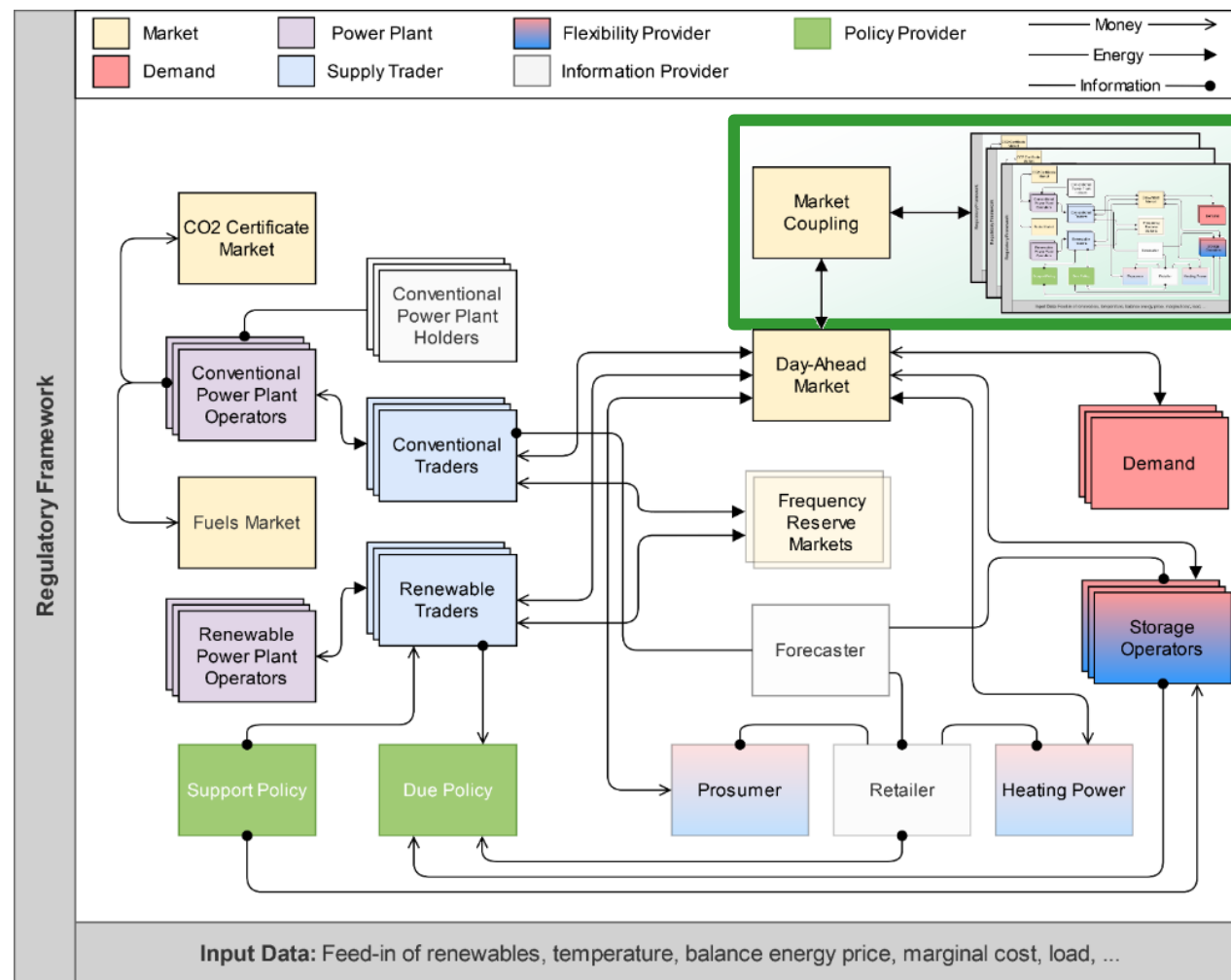
Coupling markets in AMIRIS

Concept

- Introducing a new agent type *MarketCoupling*
- Participating day-ahead markets are connected to the *MarketCoupling* agent

Procedure

1. Day-ahead market agent collects bids & asks of its associated traders
2. Information together with Net Transfer Capacities (NTC) is sent to *MarketCoupling* agent
3. Market coupling is carried out ensuring NTCs are met
4. Updated (coupled) price is sent back to traders via their local day-ahead market agents

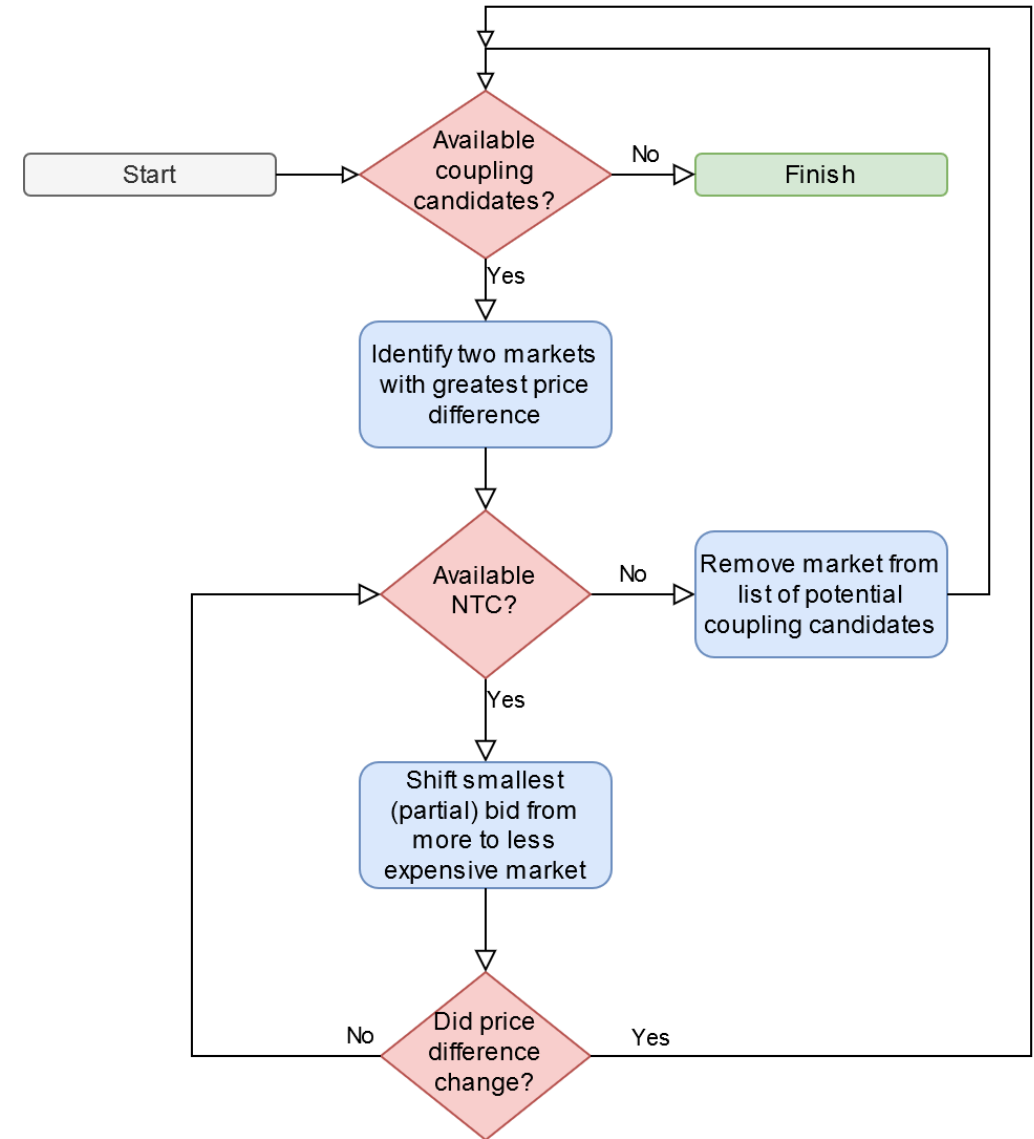


Detailed description of market coupling

- Identify potential candidates consisting of two markets
- Finding best candidates for coupling
- Decreasing price difference by smallest possible shift of demand from one market to other
- Re-evaluation of best candidates for coupling

- Termination when price differences cannot be minimized anymore, e.g.:
 - a) price differences are zero, or
 - b) all NTC are used

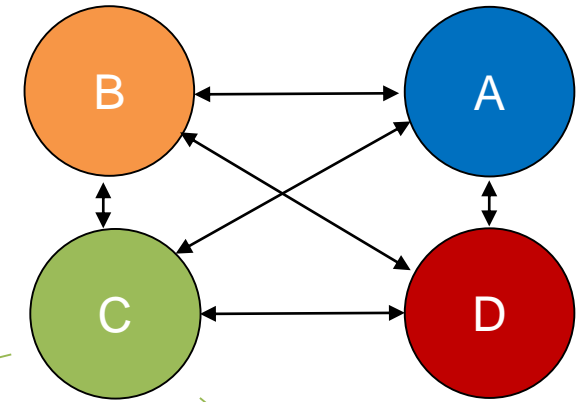
- Solution considered as global optimum



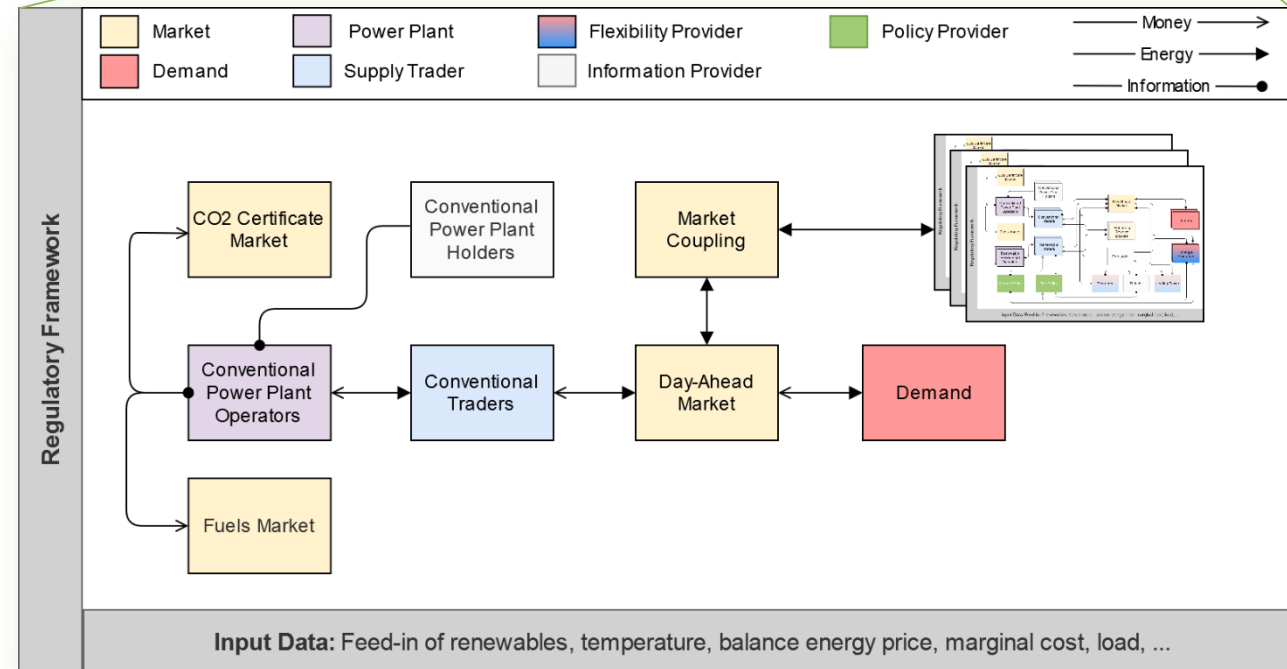
Case study

- Demonstration of implementation using 3 and 4 markets
- Different levels of NTCs (up to unlimited capacity)
- Investigation of:
 - electricity prices
 - awarded power
- Weekly plots of hourly resolution

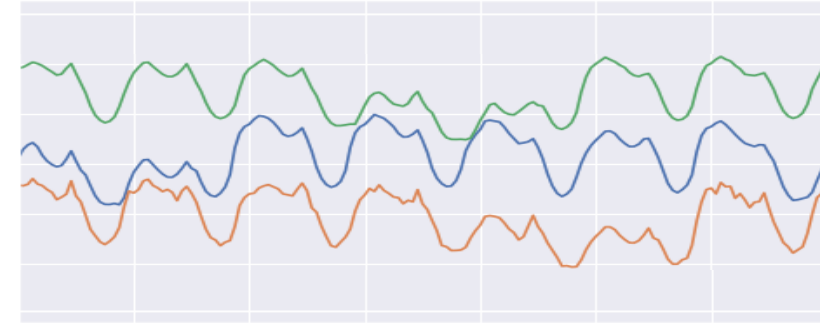
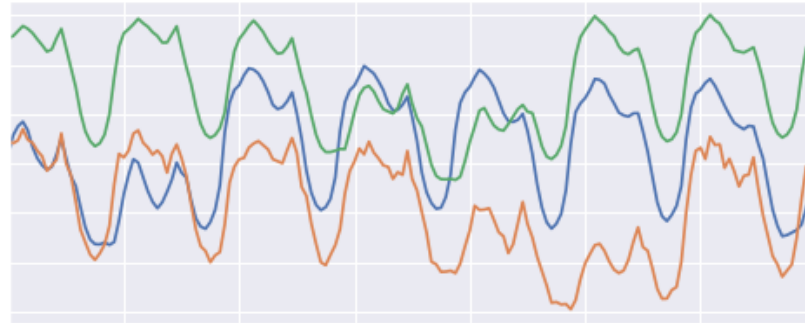
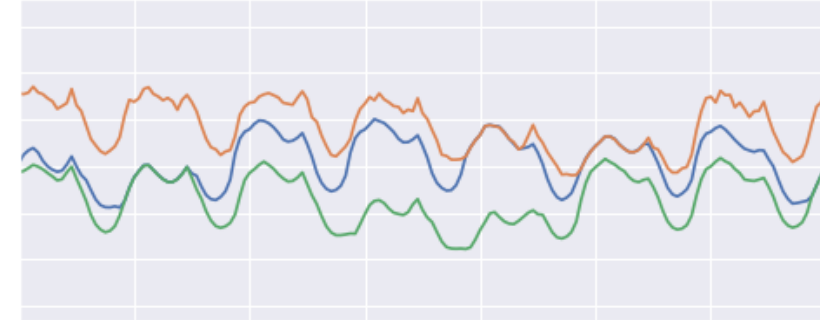
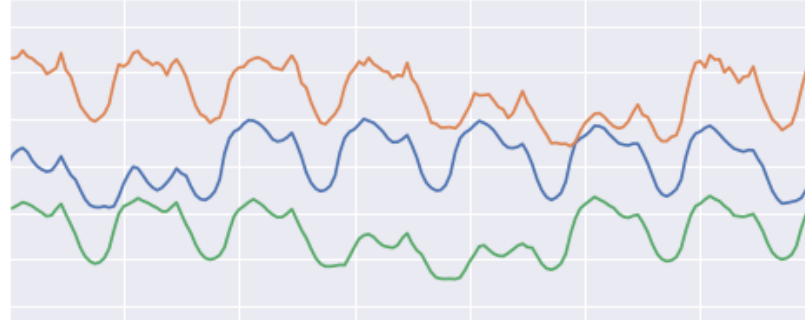
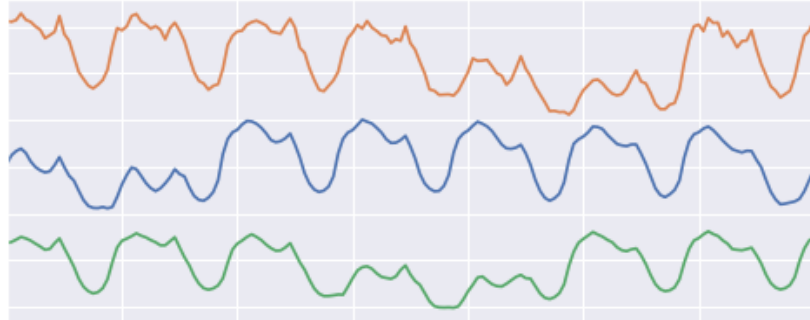
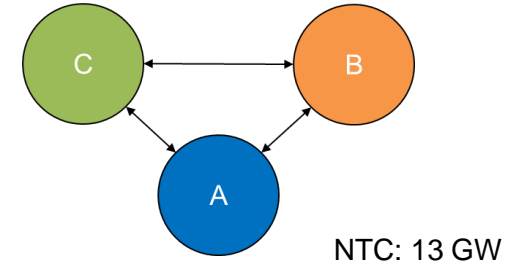
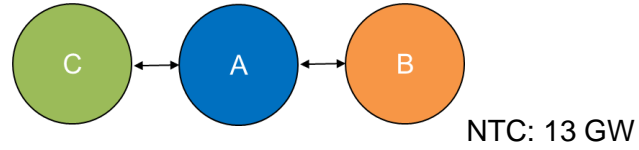
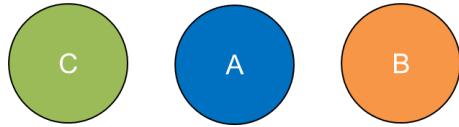
Example of four fully connected markets



AMIRIS simulation with reduced number of agents



Results: Case study of three markets



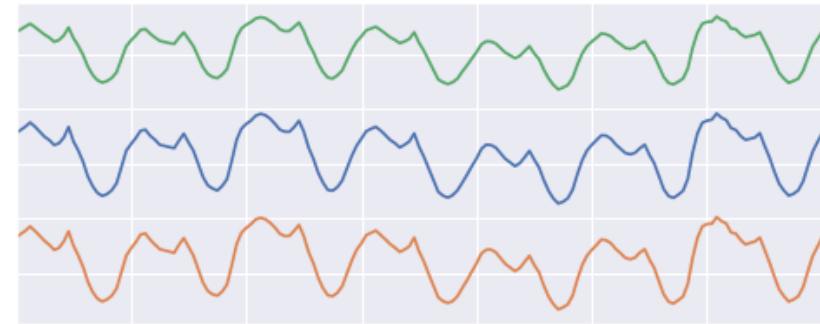
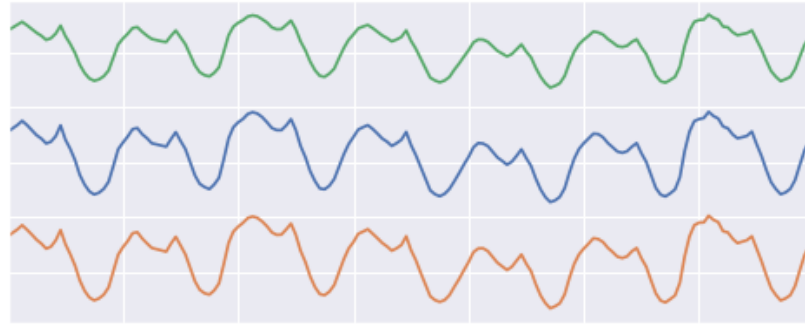
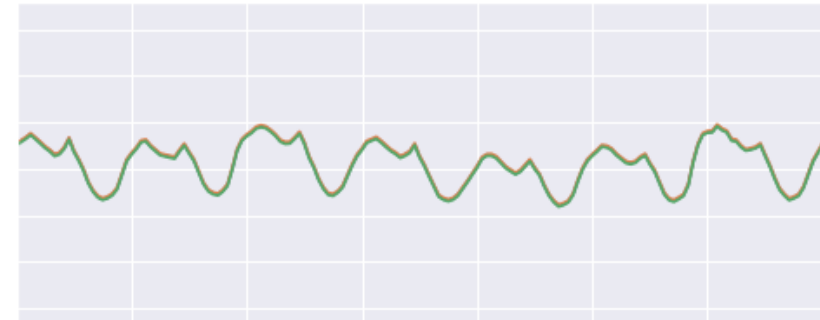
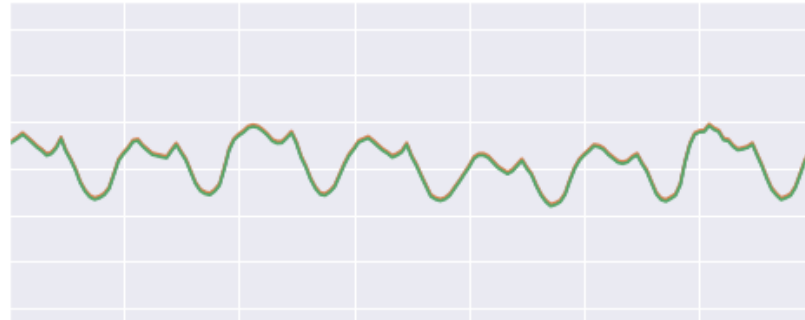
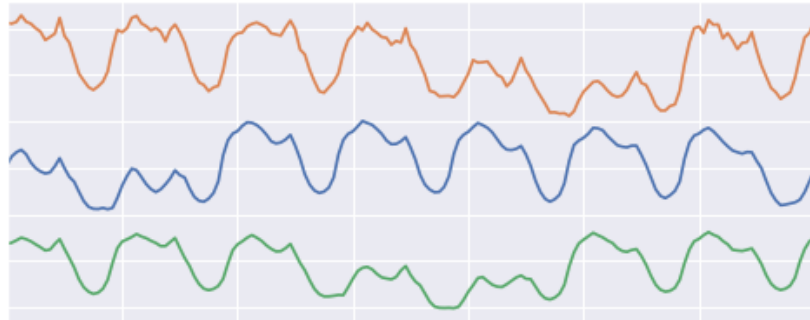
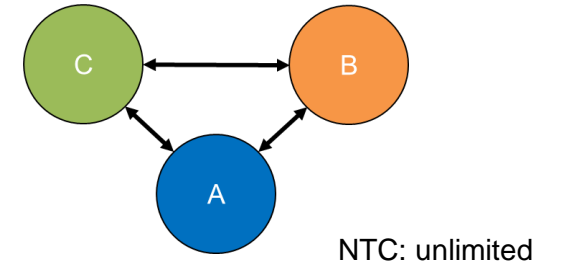
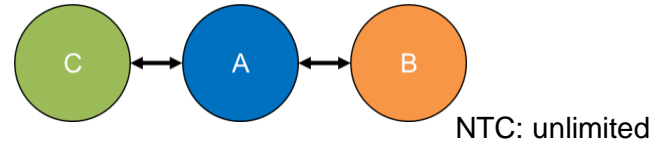
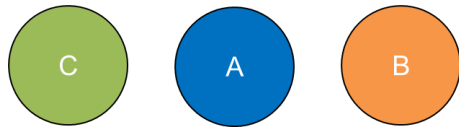
1 week at hourly resolution

1 week at hourly resolution

1 week at hourly resolution



Results: Case study of three markets – unlimited NTC



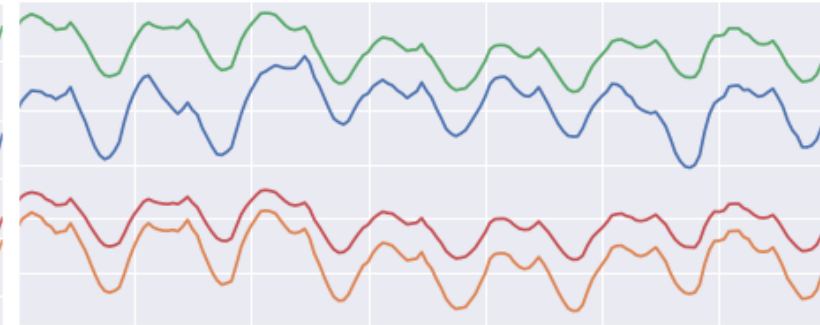
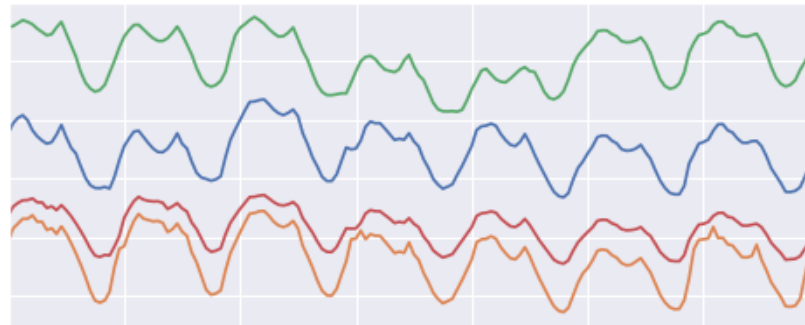
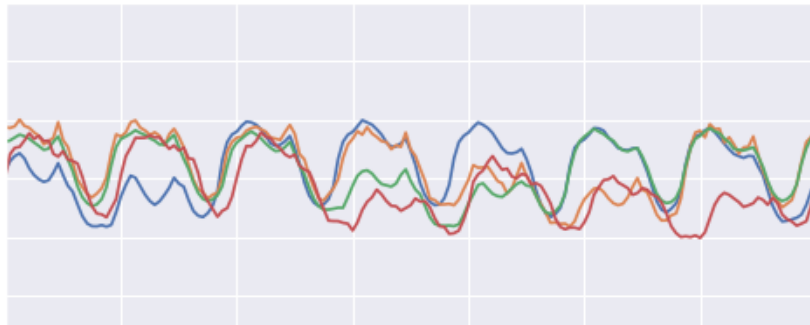
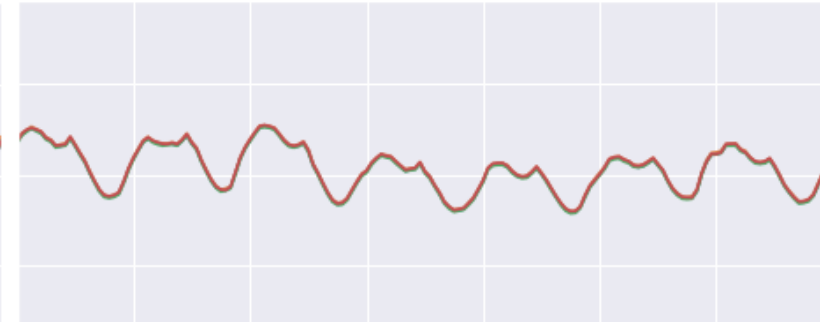
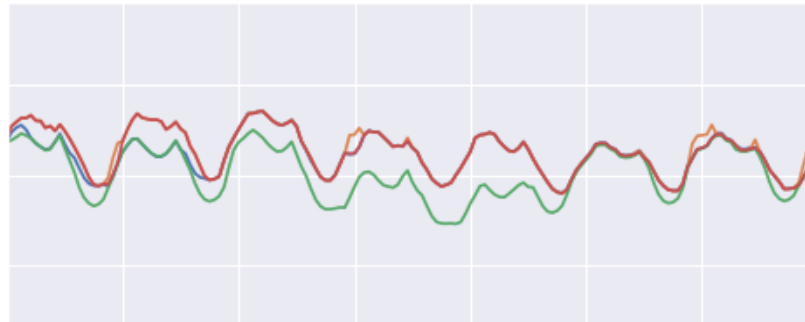
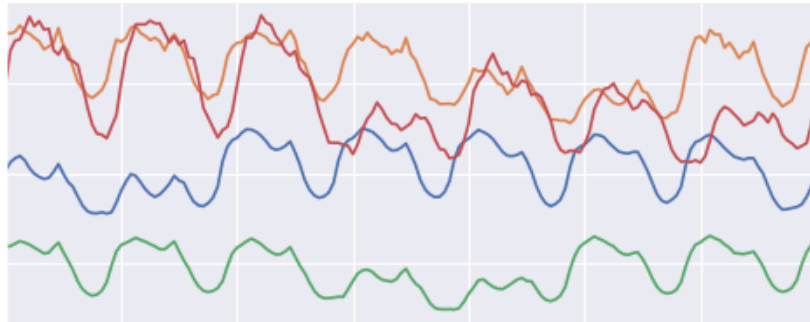
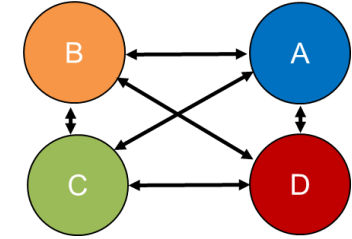
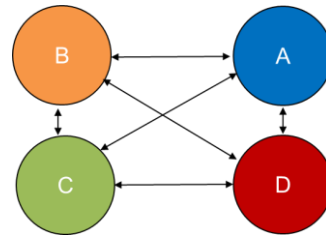
1 week at hourly resolution

1 week at hourly resolution

1 week at hourly resolution



Results: Case study of four markets



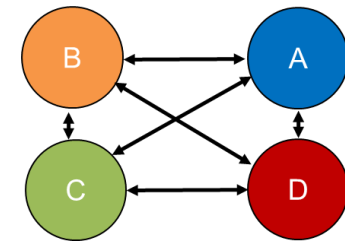
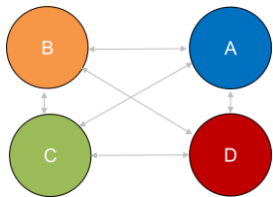
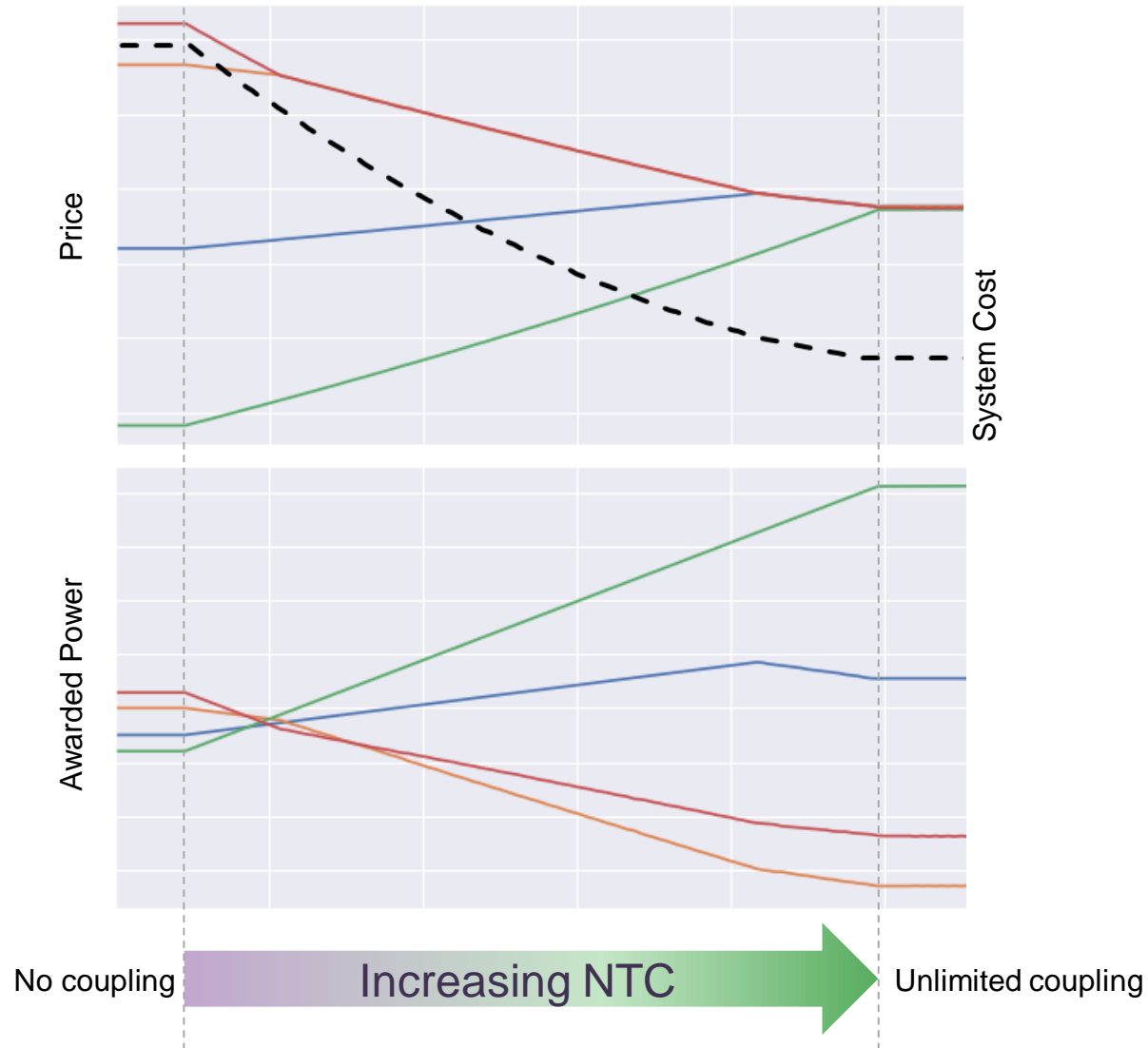
1 week at hourly resolution

1 week at hourly resolution

1 week at hourly resolution



Results: From zero to unlimited NTC



Conclusion

- Investigation of electricity markets using AMIRIS
- Introduction of *MarketCoupling* agent in AMIRIS allowing to extend geographic scope
- Implementation of Java based, incremental, and dynamic solving algorithm minimizing price differences
- Accounting for hourly Net Transfer Capacities as constraints to optimization
- Case study shows promising results, finding global optimum reliably

Discussion & Outlook

- Heuristic-based algorithm
- Consideration of domain specific properties (e.g. price steps due to merit order, minimum shift size)
- Full-scale deployment in real-world electricity market scenarios
- Further performance improvements of algorithm



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