

Decentralized Intelligent Multi-party Competitive Aggregation Framework for Electricity Prosumers

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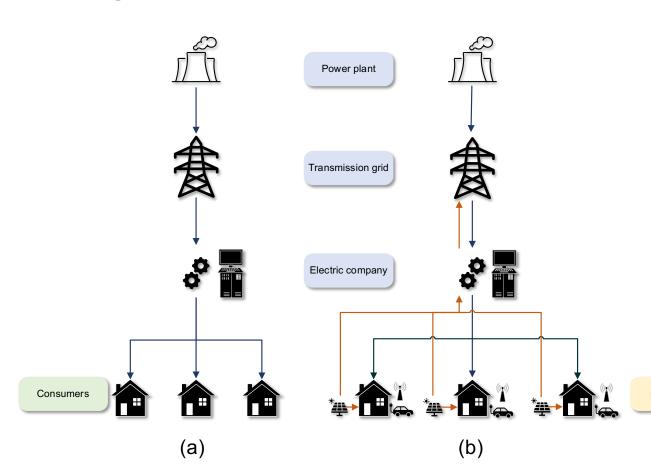


The one-liner

We designed a privacy-preserving market where multiple aggregators and prosumers reach a unique equilibrium, solved decentrally with linear convergent graph-consensus ADMM.



Why this matters



- Distributed energy resources broke the conventional playbook
- Consumers have become prosumers: actively producing, consuming, and trading energy
- This creates additional complexity for gird management

Prosumers



Research question

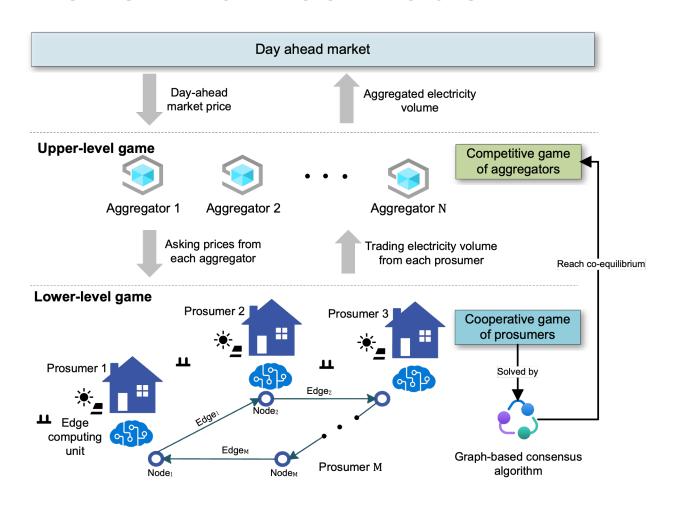
- Prosumers would like to trade excess electricity, but...
- Electricity market have entry requirement -> aggregator

- Existing literature builds on single aggregator structure, but what if...?
- There are multiple aggregators in a local market?

How can we efficiently manage the market competition between many prosumers and multiple aggregators in this new, decentralised landscape?



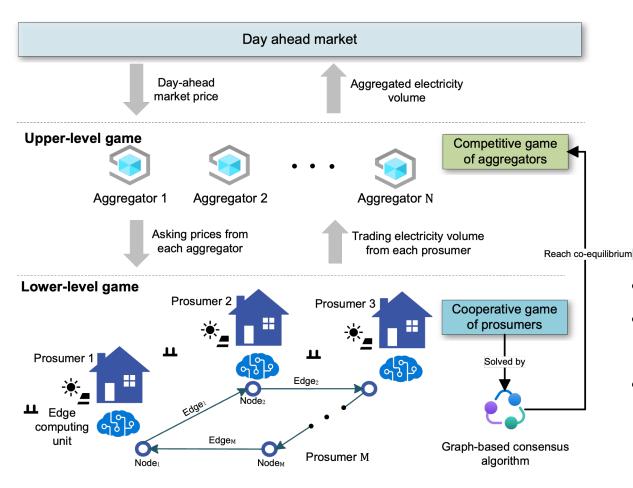
Bi-level market model



- Market as a game: Multi-leader-multifollower game
- Multi-party competition of aggregators
- Decentralised architecture



Bi-level market model



 Key challenge on existence and uniqueness of game solution

Proved through

- Lipschitz gradient continuity
- Tyler expansion of payoff function
- Variational inequality

To solve the equilibrium

 Modified alternating direction method of multipliers

$$\min f(x) + g(z)$$
s.t. $Ax + Bz = c$

$$F_i(x) \le 0 \ i = 1, 2, ..., p$$

$$G_i(z) \le 0 \ i = 1, 2, ..., q$$

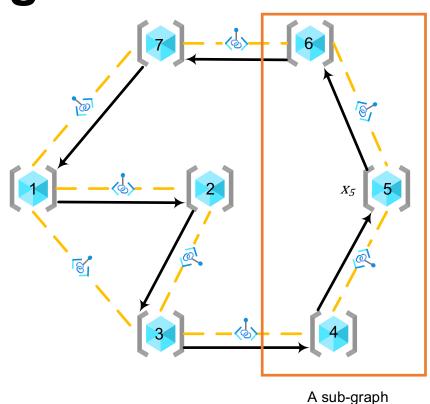
- Augmented Lagrangian functions
- Lyapunov function equivalent

$$V^{k} = \frac{1}{\rho} \|\mu_{x}^{*} - \mu_{x}^{k}\|^{2} + \frac{1}{\rho} \|\mu_{z}^{*} - \mu_{z}^{k}\|^{2} + \frac{1}{\rho} \|\lambda^{*} - \lambda^{k}\|^{2} + \rho \|Bz^{k+1} - Bz\|^{2},$$

Strictly decreasing



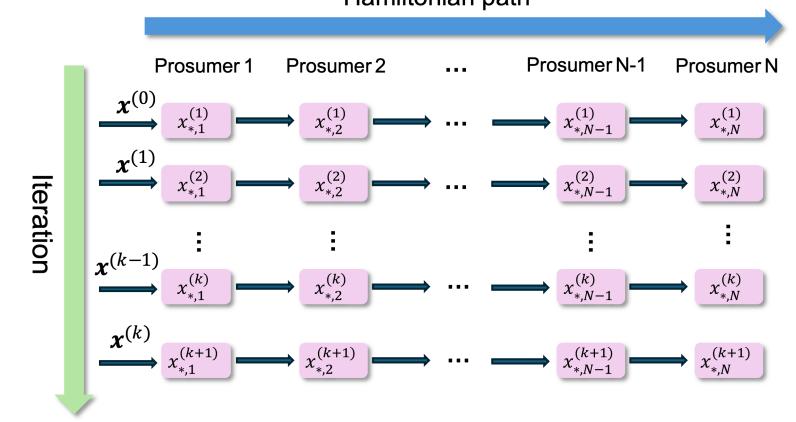
Graph-based consensus algorithm



- Each agent only communicate with its direct neighbours
- The communication forms a sub-graph that will update the decision matrix
- Hamiltonian path the shortest path to iterate entire graph



Graph-based consensus algorithm Hamiltonian path





Theoretical guarantee

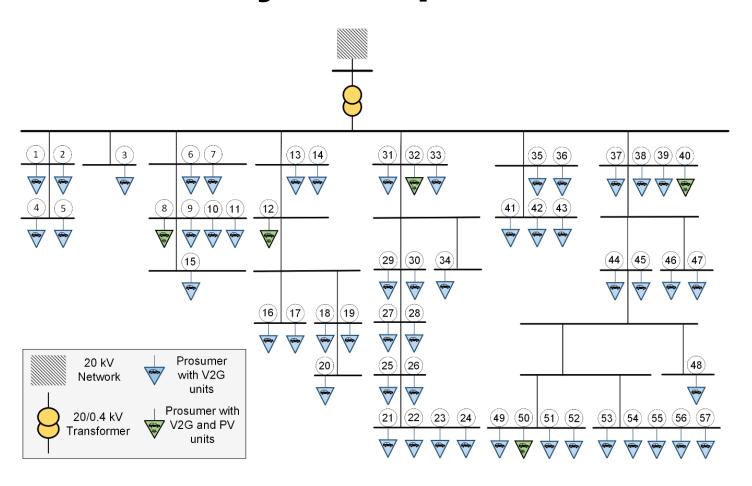
✓ Unique Market Equilibrium: We proved that there is one single, unique solution that the market will converge to, ensuring predictability and stability.

√ Convergence Guarantee: The algorithm is mathematically proven to always reach a stable solution.

√ Linear Convergence Rate: It finds this solution quickly and efficiently.



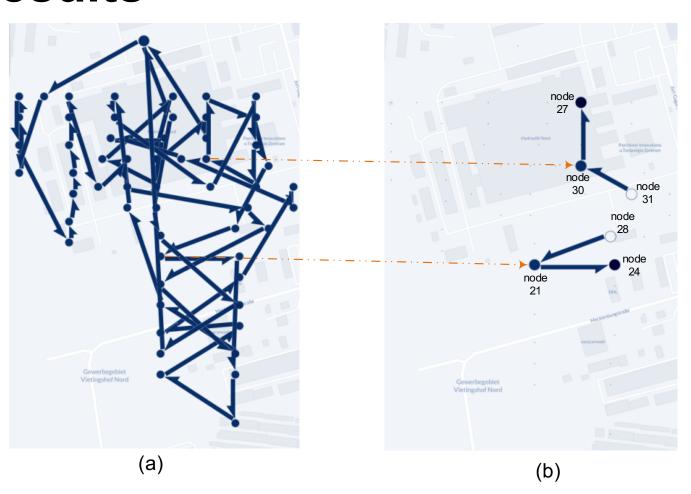
Case study set up



- EU distribution grid dataset
- V2G from EV batteries



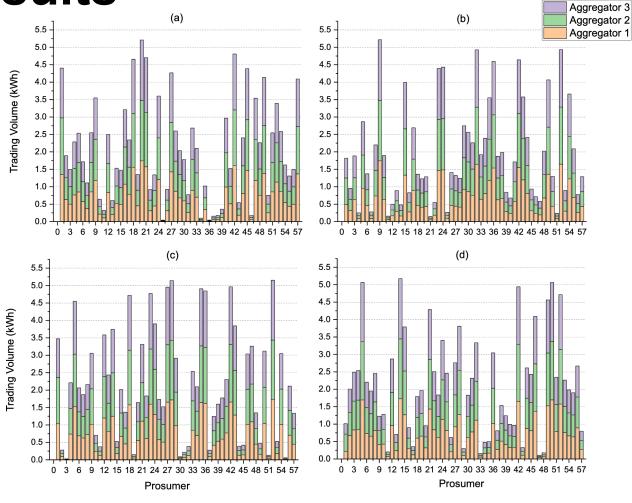
Results



- Front-end web
- Information flow in the network graph



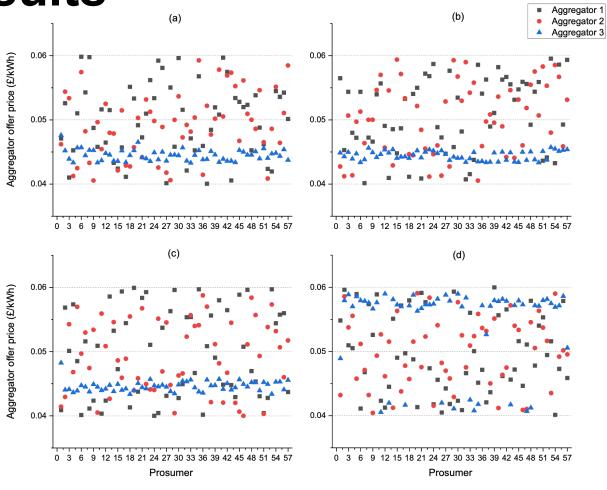
Results



- Aggregated volume of prosumers – results of lower level game
- Volume variation



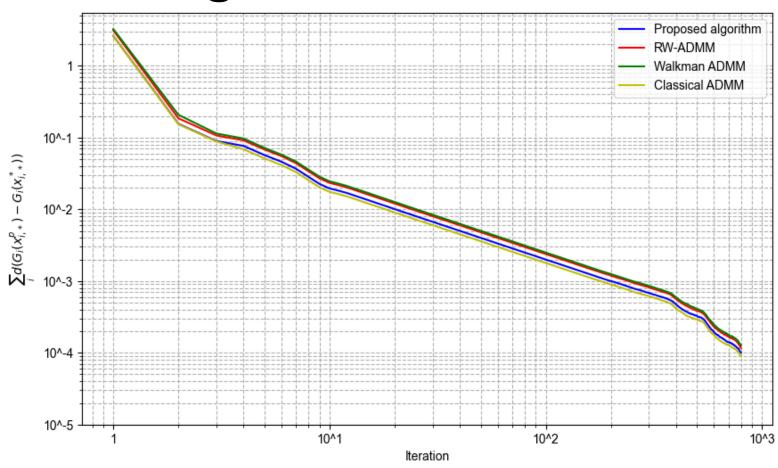
Results



- Upper-level game results
- Profits made for aggregators



Benchmarking





Conclusion

- We proposed a decentralised multi-part competitive framework for aggregator – prosumer market
- Developed a graph-based consensus algorithm with linear convergence rate
- Validates the proposed framework and algorithm with EU distribution grid dataset



Thank you