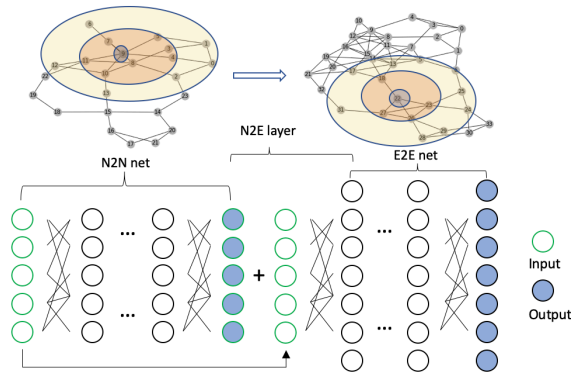


# Learning and Optimization for Smarter Electricity Infrastructure

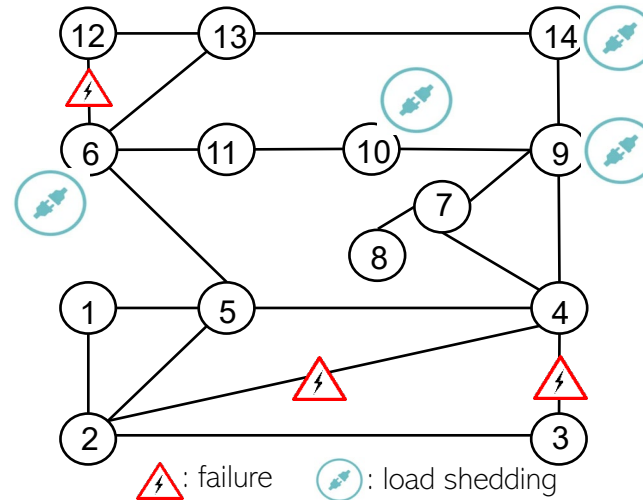
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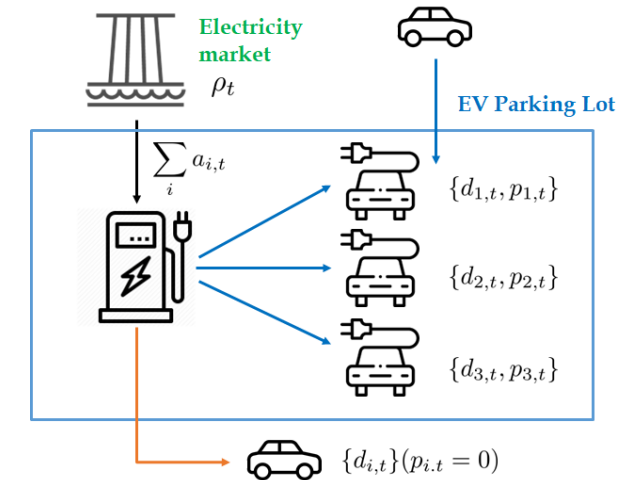
## Topology-aware learning for real-time market:

Simple model for efficiency &  
adaptivity



## Scalable learning for grid emergency responses:

Fast mitigations under limited data

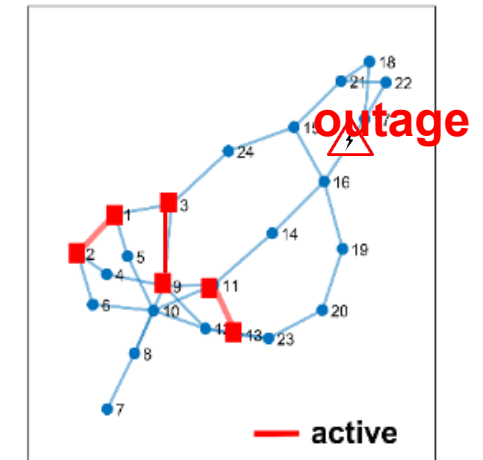
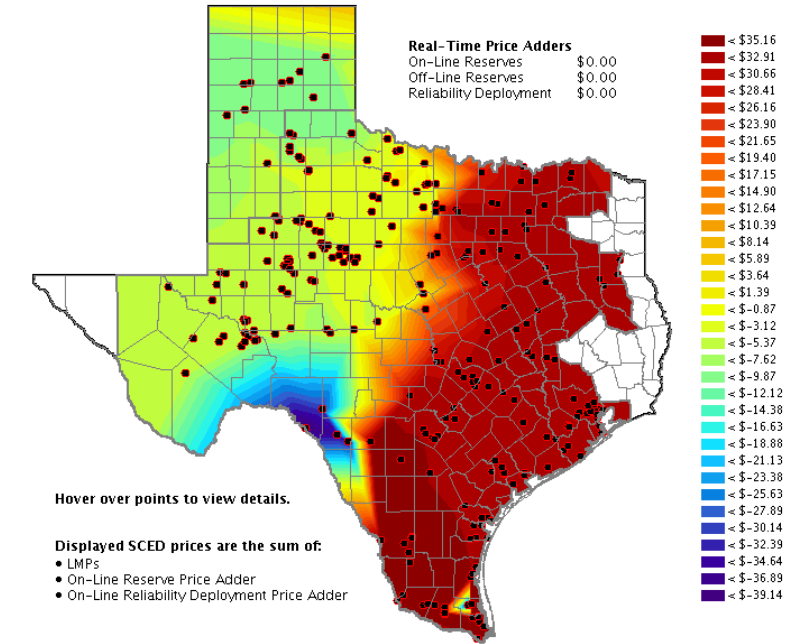


## Integrated infrastructure:

Effective participation in electricity  
market for EV charging station

# Learning Optimal Power Flow

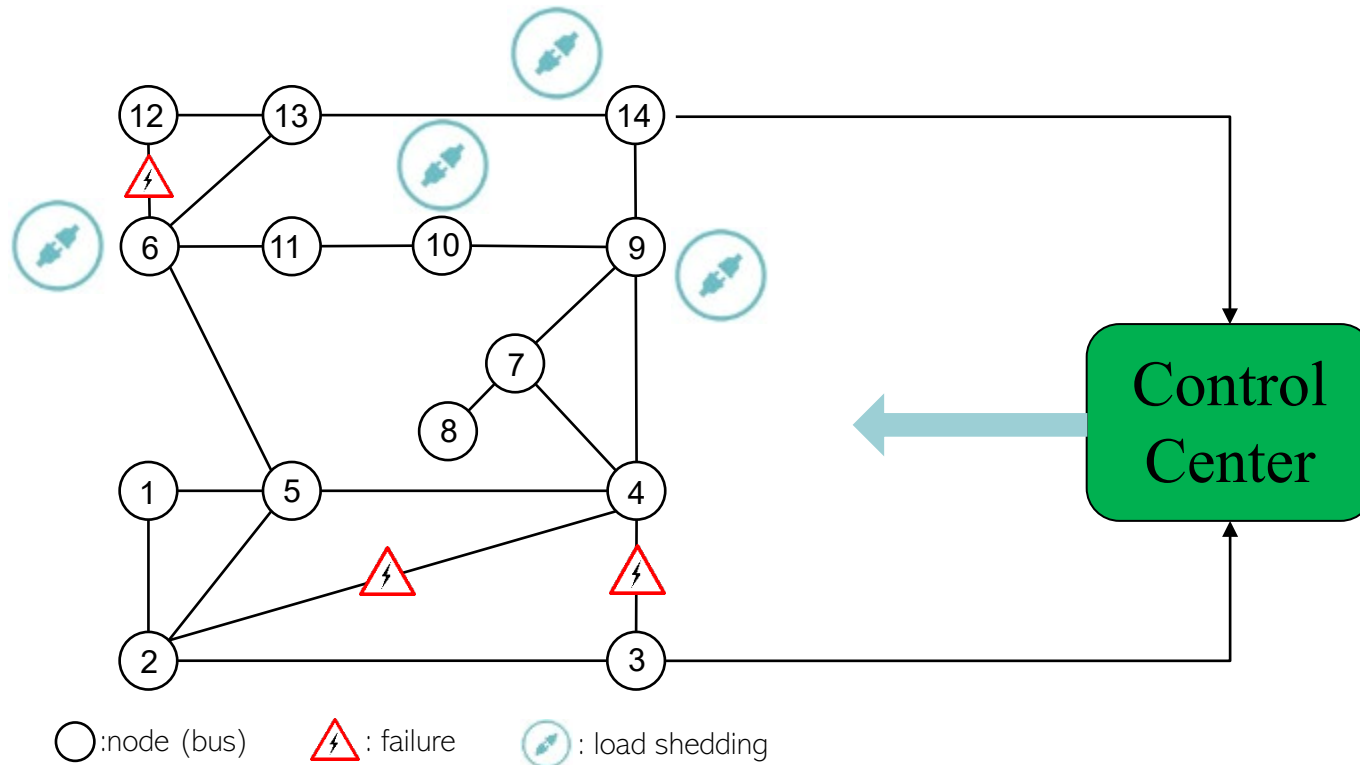
- Graph learning leverages topology dependence (locality) of key OPF outputs
  - Locational marginal price (LMP)
  - Voltage magnitude
- Model simplification:  $N^2$  to  $N$
- ac-OPF feasibility regularization
- Topology adaptivity



S. Liu, C. Wu, and H. Zhu, "Topology-aware Graph Neural Networks for Learning Feasible and Adaptive AC-OPF Solutions", *IEEE Trans. on Power Systems*, (Early Access), 2023. DOI: [10.1109/TPWRS.2022.3230555](https://doi.org/10.1109/TPWRS.2022.3230555)

# Optimal load shedding (OLS)

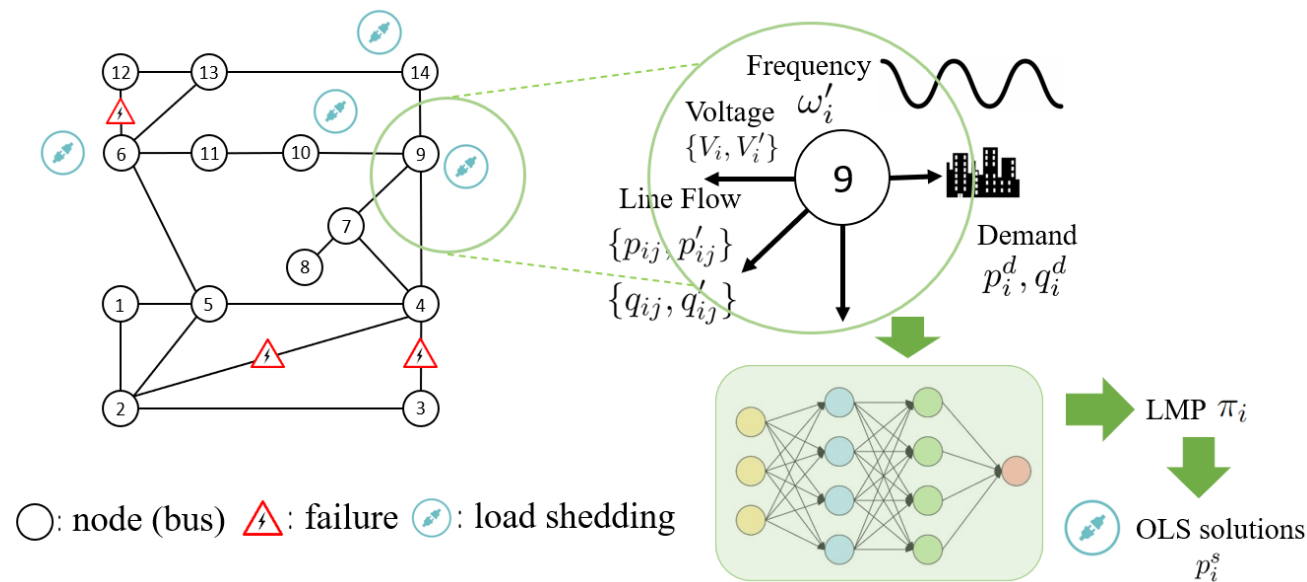
- A special case of ac-OPF: GNN-based prediction possible [Kim et al'19]
- Network-wide info. exchange affected by comm. latency and link failures



- Can ML enable the implementation of emergency actions in a *scalable, decentralized* manner?

# Decentralized OLS policy

- Each load center uses a decision rule that maps from **local data only**



- Local input feature:

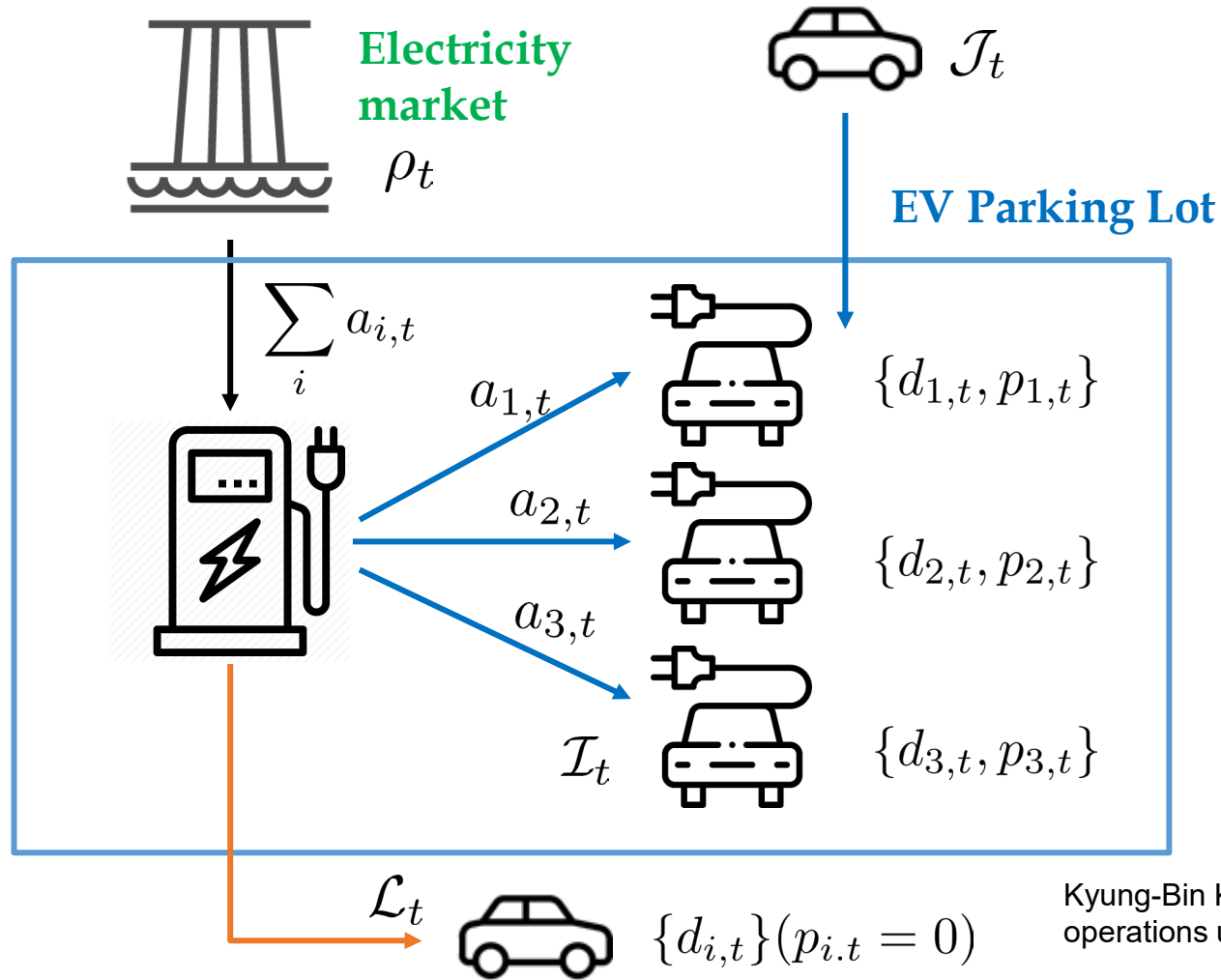
$$\mathbf{x}_i = [p_i^d, q_i^d, V_i', \{p'_{ij}\}, \{q'_{ij}\}, \omega'_i]$$

- Local marginal price (LMP):

$$y_i = \pi_i^*$$

Yuqi Zhou, Jeehyun Park, and Hao Zhu, "Scalable Learning for Optimal Load Shedding Under Power Grid Emergency Operations," *PES General Meeting (PESGM) 2022*. <https://arxiv.org/abs/2111.11980>

# EV charging station (EVCS) problem



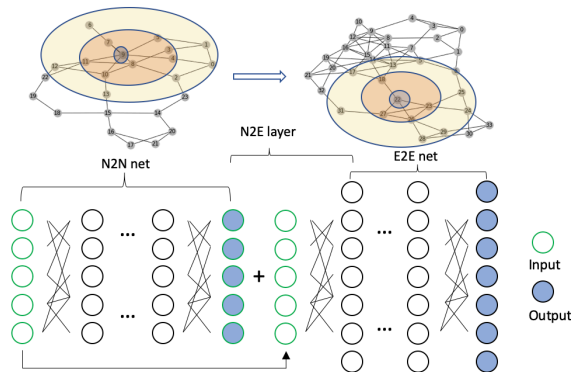
- Randomly arriving EVs with demand and parking time requests
- *Highly complex* problem space due to large, *varying* number of EVs
  - RL policy search becomes difficult
- We developed an efficient, reduced-order representation by using the EV priority measure

Kyung-Bin Kwon and H. Zhu, "Efficient representation for electric vehicle charging station operations using reinforcement learning," HICCS 2022. <https://arxiv.org/abs/2108.03236>

# Learning and Optimization for Smarter Electricity Infrastructure

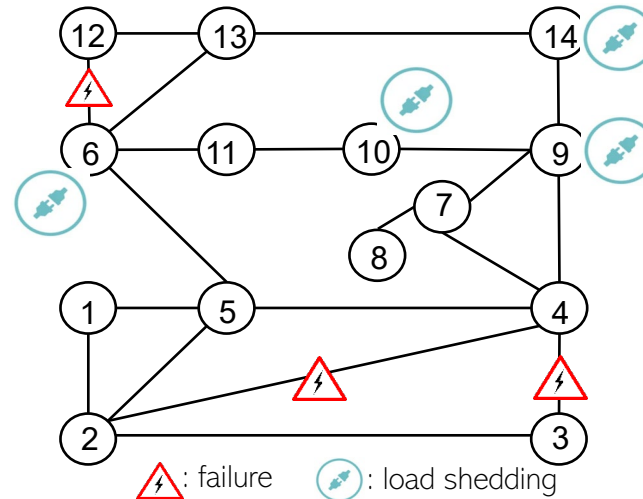
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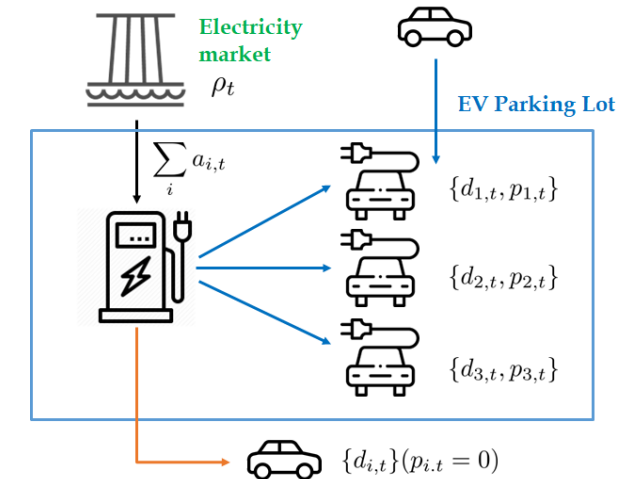
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