

# Vulnerability Analysis of Distribution Networks under Renewable Disruptions

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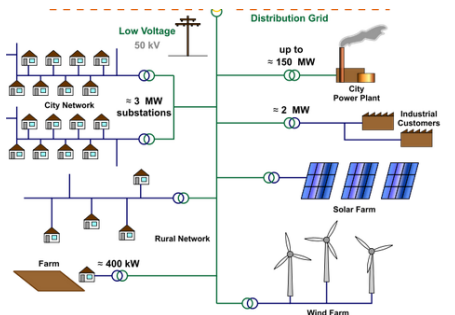
**Massachusetts  
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# Electricity distribution network vulnerabilities

## Motivation

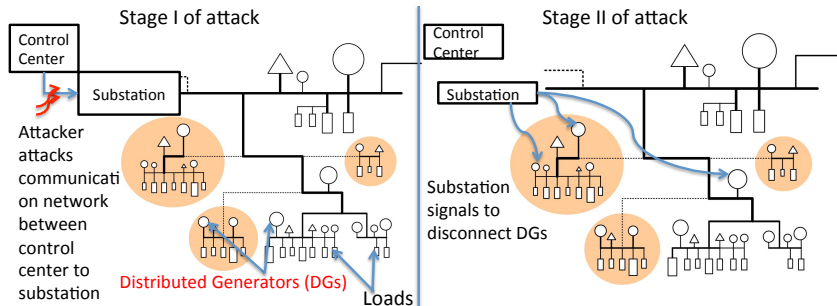
- IT systems manage distributed generators (DGs) & other operations
- Security risks introduce new vulnerabilities in distribution networks



## Our focus

- 1 Worst case attacks: Denial-of-service (DoS) or manipulation of DGs
- 2 Secure network control: using reactive power control and load shaping

# Attacker-defender interaction



## Questions:

- Which DGs are most critical?
- How should defender respond?

*Acknowledgement: Discussion with Bruno Prestat and Pascal Sitbon (EPRI) and Dr. Alexandra von Meier (UC Berkeley)*

# Network interdiction

Perfect information attacker (leader)-defender (follower) game:

- **Attacker choices:** compromise DGs
- **Defender choices:** control available DGs to provide reactive power (VAR) control and/or manipulate available loads

## Problem 1

Find attacker's interdiction plan and defender control strategy when

- Attacker chooses DG interdiction plan to maximize sum of line loss and load shedding, and
- Defender responds by providing VAR control and manipulates loads, while maintaining ratings of protection equipment.

$$\max_{\delta} \quad \min_u \quad \sum_{(i,j) \in \mathcal{E}} r_{ij} l_{ij} + \sum_{i \in \mathcal{N}_0} (1 - \gamma_i) C_i$$

s.t. powerflow, DG, ratings, resource constraints

$$u := (P, Q, p^g, p^c, q^g, q^c, \nu, l, \gamma), \gamma \in [0, 1]^n, \delta \in \{0, 1\}^n.$$

## A related problem

### Problem 2

Find attacker's interdiction plan and defender control strategy when

- Attacker chooses DG interdiction plan to cause loss of voltage regulation, and
- Defender responds by providing VAR control. (Load and ratings constraints may or may not be satisfied.)

$$\min_{\delta} \quad \max_u \quad \min_{i \in \mathcal{N}_0} \nu_i$$

s.t. powerflow, DG, resource constraints

$$u := (P, Q, p^g, q^g, \nu)$$

$$\delta \in \{0, 1\}^n$$

## Case of fixed defender choices

Aforementioned bilevel-problems are hard!

- Outer problem: integer-valued attack variables
- Inner problem: nonlinear in control variables

For fixed defender choices:

$$\text{Problem 1': } \max_{\delta} \sum_{(i,j) \in \mathcal{E}} r_{ij} \ell_{ij} + \sum_{i \in \mathcal{N}_0} (1 - \gamma_i) C_i$$

s.t. powerflow, dg, ratings, resource constraints

$$\text{Problem 2': } \min_{\delta} \min_{i \in \mathcal{N}_0} \nu_i$$

s.t. powerflow, dg, resource constraints

We use structural results for Problems 1' and 2' to compute interdiction plans for the case with defender response (Problems 1 and 2).

# Main result: Optimal interdiction plan

- Let  $\nu_i^{old}/\nu_i^{new}$  be  $|V_i|^2$  before/after the attack
- $\Delta(\nu_i) = \nu_i^{old} - \nu_i^{new}$

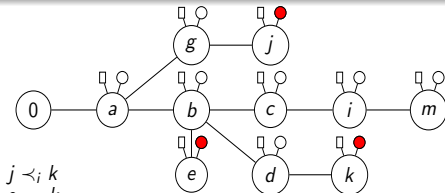
## Theorem

For a tree network, given nodes  $i$  (pivot),  $j, k \in \mathcal{N}_0$ :

- If DGs at  $j, k$  are homogenous and  $j$  is before  $k$  w.r.t.  $i$ , then DG disruption at  $k$  will have larger effect on  $\nu_i$  at  $i$ ;
- If DGs at  $j, k$  are homogenous and  $j$  is at the same level as  $k$  w.r.t.  $i$ , then DG disruptions at  $j$  and  $k$  will have the same effect on  $\nu_i$  at  $i$ ;

$$\Delta_j(\nu_i) < \Delta_k(\nu_i)$$

$$\Delta_e(\nu_i) \approx \Delta_k(\nu_i)$$



$j \prec_i k$   
 $e =_i k$   
 $b \prec k$

### Algorithms

- Optimality properties of proposed algorithm;
- Re-formulation as Mixed-Integer Second-Order Cone Program;
- Evaluation on benchmark distribution feeder networks.

### Validation

Mapping of the optimal attack plans to cyber-attacks and co-simulation.

# Thank You