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# A Robust Approach for Active Distribution Network Restoration Based on Scenario Techniques Considering Load and DG Uncertainties

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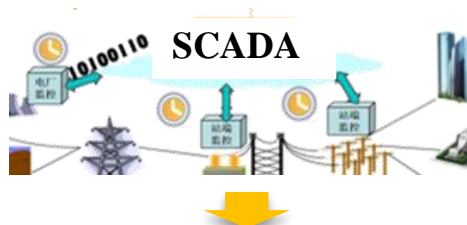
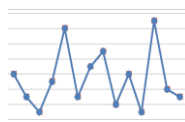
# Background

- **Power Supply Restoration** is one of the most important functions in the operation of active distribution networks (ADNs). Outage power in unfaulted but out-of-service areas can be restored through tuning the status of branch switches.
- It is time-consuming to complete a restoration task, while there exist **uncertainty problems** during this process.

## ➤ 3 Sources of Uncertainty

DG: distributed generation

Fluctuating DG Outputs

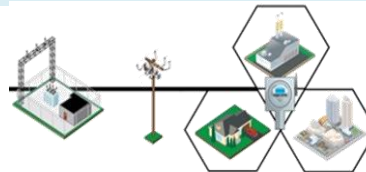


Estimation Errors

Time-varying Loads



ADN Restoration



## ➤ Uncertainty Risks



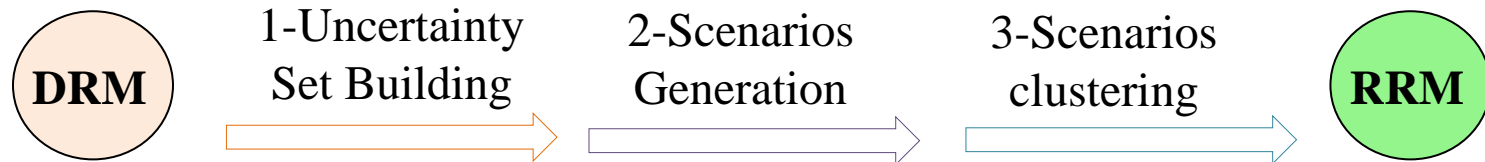
Infeasible restoration schemes.



Longer interruption duration.  
Higher outage cost.  
...

# Method

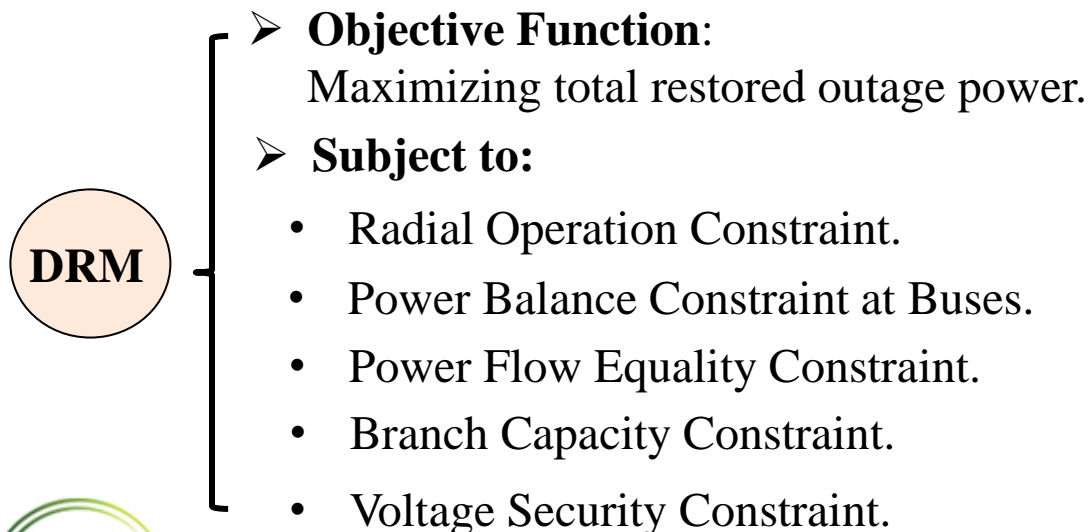
- This paper proposes a **robust ADN restoration approach** based on **scenario techniques**, considering both DG uncertainty and load uncertainty.



DRM: Deterministic Restoration Model.

RRM: Robust Restoration Model.

- ADN restoration problem is modeled using mathematical programming.



## Mixed Integer Linear Programming

$$\begin{array}{l}
 \text{Obj. Max } c^T x \\
 \quad \quad \quad y \\
 \text{s.t. } \begin{cases} Ax \leq b \\ Bx + Cy \leq g \end{cases}
 \end{array}$$

$x$  : power flow variables.  $\{P_{ij}, Q_{ij}, U_i\}$

$y$  : status of each branch.  $y_{ij} \in \{0,1\}$

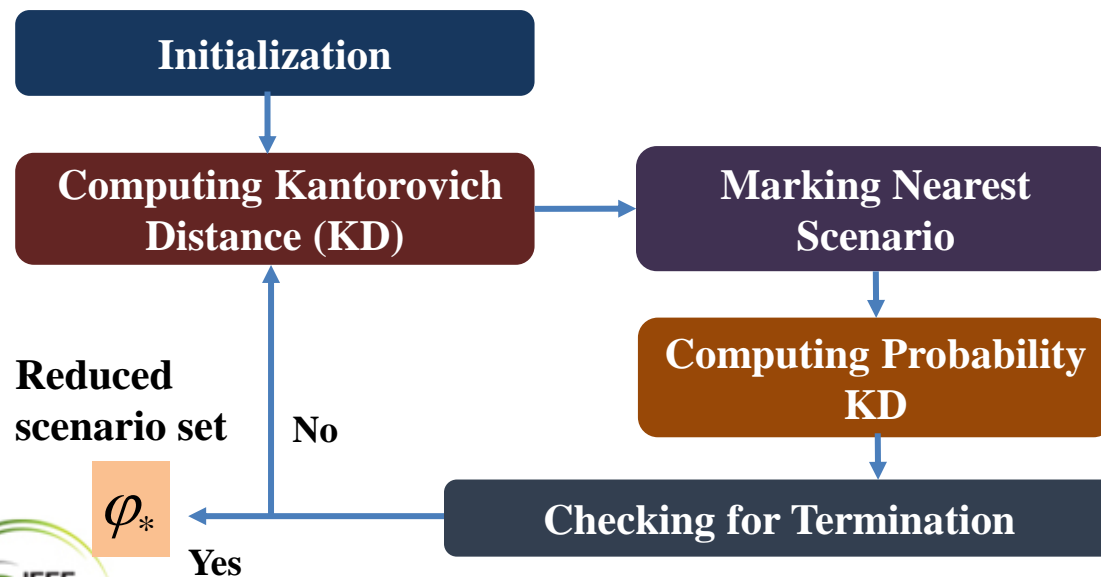
# Method

- According to the profiles of historical data, the **uncertainty sets** of DG outputs and load demands are established as  $\Omega$ , and assumed to follow **normal distributions**.

$$\Omega = \begin{cases} \tilde{P}_{L,i} \in [\underline{P}_{L,i}, \bar{P}_{L,i}], \forall i \in \Psi_{con} \\ \tilde{P}_{G,i}^m \in [\underline{P}_{G,i}^m, \bar{P}_{G,i}^m], \forall i \in \Psi_{DG} \end{cases} \quad \begin{cases} \tilde{P}_{L,i} \square N(P_{L,i}^E, \sigma_{L,i}^2), \forall i \in \Psi_{con} \\ \tilde{P}_{G,i}^m \square N(P_{G,i}^{E,m}, \sigma_{G,i}^{m,2}), \forall i \in \Psi_{DG} \end{cases}$$

- Generating masses of **stochastic scenarios** accordingly to simulate the uncertainty.
- Using the **backward scenario reduction technique** to cluster scenarios in order to alleviating the computation burden.

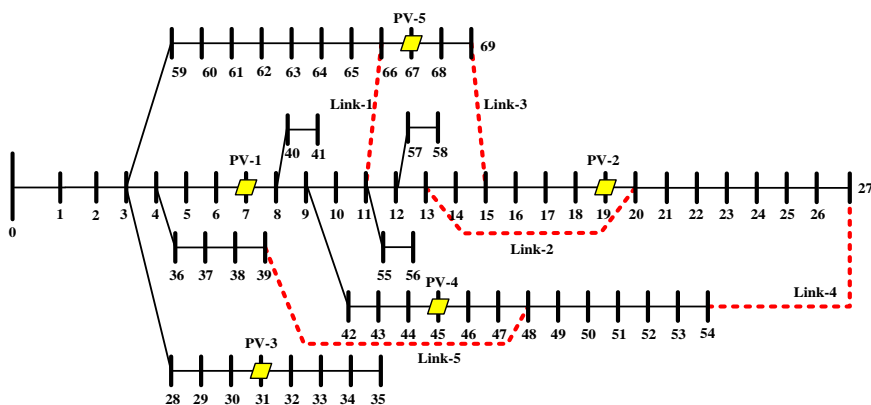
$$\varphi_*^E = \varphi_* \cup \left\{ (\bar{P}_{L,i}, \underline{P}_{G,i}^m), (\underline{P}_{L,i}, \bar{P}_{G,i}^m) \right\}$$



$$\begin{aligned} \text{Obj. Max } & \sum_{s \in \varphi_*} (\text{Pr}_s \cdot \mathbf{c}^T \mathbf{x}_s) \\ \text{s.t. } & \begin{cases} \mathbf{A}\mathbf{x}_s \leq \mathbf{p}_s, \forall s \in \varphi_*^E \\ \mathbf{B}\mathbf{x}_s + \mathbf{C}\mathbf{y} \leq \mathbf{g}_s \end{cases} \end{aligned}$$

# Results

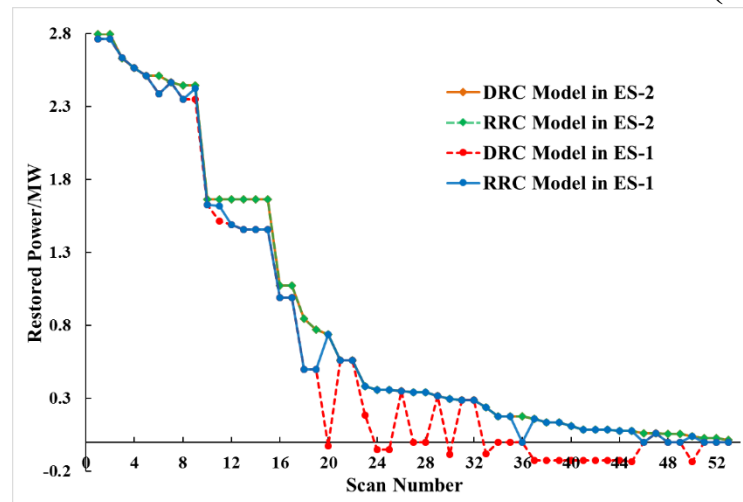
## □ Test System.



Modified PG&E 69-bus distribution system.

- ✓ DRM fails many times and leads to less restored power and higher infeasible ratio.
- ✓ RRM keeps feasible all the times with much better restoration performance.

## □ Case-1 “N-1” Scan in Extreme Scenarios (ES).



## □ Case-2 Monte Carlo Simulation Tests.

Faulty Branch	Method	Infeasible Times	Infeasible Ratio	Expected Restored Power/MW
ln19to20	RRC	0	0	0.1765
	DRC	5	0.25%	0.1747
ln60to61	RRC	0	0	0.1338
	DRC	24	1.2%	0.1314
ln63to64	RRC	0	0	0.0857
	DRC	26	1.3%	0.0842
ln68to69	RRC	0	0	0.0392
	DRC	22	1.1%	0.0385
ln38to39	RRC	0	0	0.3847
	DRC	0	0	0.3836

# Conclusions

- In this paper, a robust ADN restoration method based on the scenario techniques is proposed to deal with the existing uncertainty problems.
- Simulation tests are carried out on a modified PG&E 69-bus system; they verify the robustness and optimality of this proposed robust method, with the comparisons against a deterministic restoration model.
- In our future work, more optimization methods, such as robust optimization, distributionally robust optimization etc, will be investigated to capture the uncertainty factors in ADN planning and operation.