



Robustness measure for power grids with respect to cascading failures

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Outline

- ❖ Dynamics on complex networks
- ❖ Robustness of complex networks
 - **Cascading failures in power grids**
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Dynamics on complex networks

- **Good dynamics**

- Spread of information
- Data traffic in the Internet
- Power flow in power grids

- **Bad dynamics**

- Spread of rumors
- Spread of viruses
- Cascading failures in power grids



Robustness of complex networks

- How robust a complex network is to resist unwanted dynamics
- **Case studies**
 - Viral Conductance: Robustness of networks with respect to spread of viruses
 - **Robustness measure for power grids with respect to cascading failures**



Disturbing events in power grids

- Many types of triggers can disturb the normal functionality of the electric grid
 - Dips (voltage sags, voltage drop)
 - Brief voltage increases (swells)
 - Transient events
 - Instability of the frequency of generated voltage with large deviation
 - Synchronization of the generators
 - Weather storms and lightening may lead to shutting down some substations and damaging power transmission lines.
 - Human errors



Categories of events by NERC

- **Transmission System Standards: Normal and Emergency Conditions**
 - Category A: No Contingencies
 - Category B: Event resulting in the loss of a single element
 - Category C: Event(s) resulting in the loss of two or more (multiple) elements
 - Category D: Extreme event resulting in two or more (multiple) elements removed or Cascading out of service

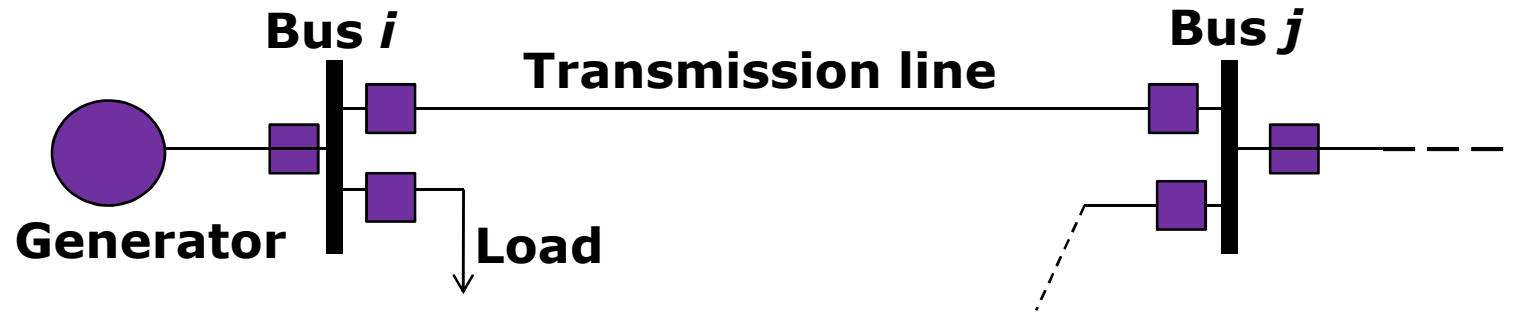


Contribution and motivation

- **The main question:**
 - ***How robust is the electric power grid topology to resist cascading failures ?***
- **Contribution:**
 - Proposing a new metric η to quantify the robustness of the electric power grids
 - Utilizing the power flow model and the electric parameters in assessing the robustness of the grid
 - Outlining the role of the link survival probability and the depth of the cascading failure



Single phase circuit diagram



The power flow between bus i and bus j

$$P_{ij} = \frac{|V_i| |V_j|}{Z_{ij}} \sin(\delta_{ij})$$

V_i : Voltage at bus i

Z_{ij} : Impedance of transmission line between bus i and bus j

δ_{ij} : Voltage angle difference between bus i and bus j



DC power flow model

- Neglect the line resistance

$$Z = R + jX \quad R \ll X$$

- Approximate the voltage angle function

$$\sin(\delta) \approx \delta$$

- **Stability condition:** $\delta_{ij} \leq 30^\circ$
- Flat voltage profile with value $1p.u.$
 - **Normal operation:** $0.95p.u. \leq V \leq 1.05p.u.$
- Power flow on link (i,j)

$$P_{i,j} = \frac{\delta_{i,j}}{x_{i,j}}$$

$$P = [b] \delta$$



Definition of robustness metric η

$$\eta = \frac{1}{L} \sum_{i=1}^L P_i r_i$$

L is total number of links

$P_i = \text{Prob}(\text{survival of link } i)$

$r_i = \text{Average cascading rank of link } i$

The higher is the value of η , the higher is the robustness of the grid



Computational algorithm for η

- **Probability of link survival P_i**
 - Intentionally, remove one link $j \neq i$ (transmission line)
 1. Rank=0, $x_j=0$ ($x_j=1$ if link i fails due to the removal of j)
 2. Compute the power flow on every link
 3. Consider failed and remove the overloaded links
 4. Rank=Rank+1
 5. Repeat the evaluation in step 2 of the power flow until the cascade stops
 6. Compute the size of cascading failures K_j
 7. $x_j=x_j+1$ if link i belongs to K_j
 - Repeat the same procedure for every link $j \neq i$

$$P_i = 1 - \frac{\sum_{j=1}^L x_j}{\sum_{j=1}^L K_j}$$



Computational algorithm for η

- **Depth of cascading failure and link rank:**
 - Link rank: The cascading stage at which link i fails due to the removal of link j

$$r_{i|j \text{ removed}}$$

- Average rank of link i

$$r_i = \frac{1}{L-1} \sum_{j \in L, j \neq i} r_{i|j \text{ removed}}$$

- Weak links frequently fail at the early stage of cascading failure



Four possible cases

Robustness measure:

$$\eta = \frac{1}{L} \sum_{i=1}^L P_i r_i$$

- 1) The probability of survival is high and the average rank is also high.
- 2) The probability of survival is high but the average rank is low.
- 3) The probability of survival is low but the average rank is high.
- 4) The probability of survival is low and the average rank is also low.



Power grid topologies and data

- **Real topologies**
 - IEEE 247 bus test system with 355 links
 - IEEE 118 bus test system with 179 links
 - WSCC 179 bus equivalent system with 222 links
- **Synthetic topologies**
 - Number of available power grid topologies are very limited
 - Generate synthetic power grids having the same number of nodes, the same number of links, and the same maximum node degree.

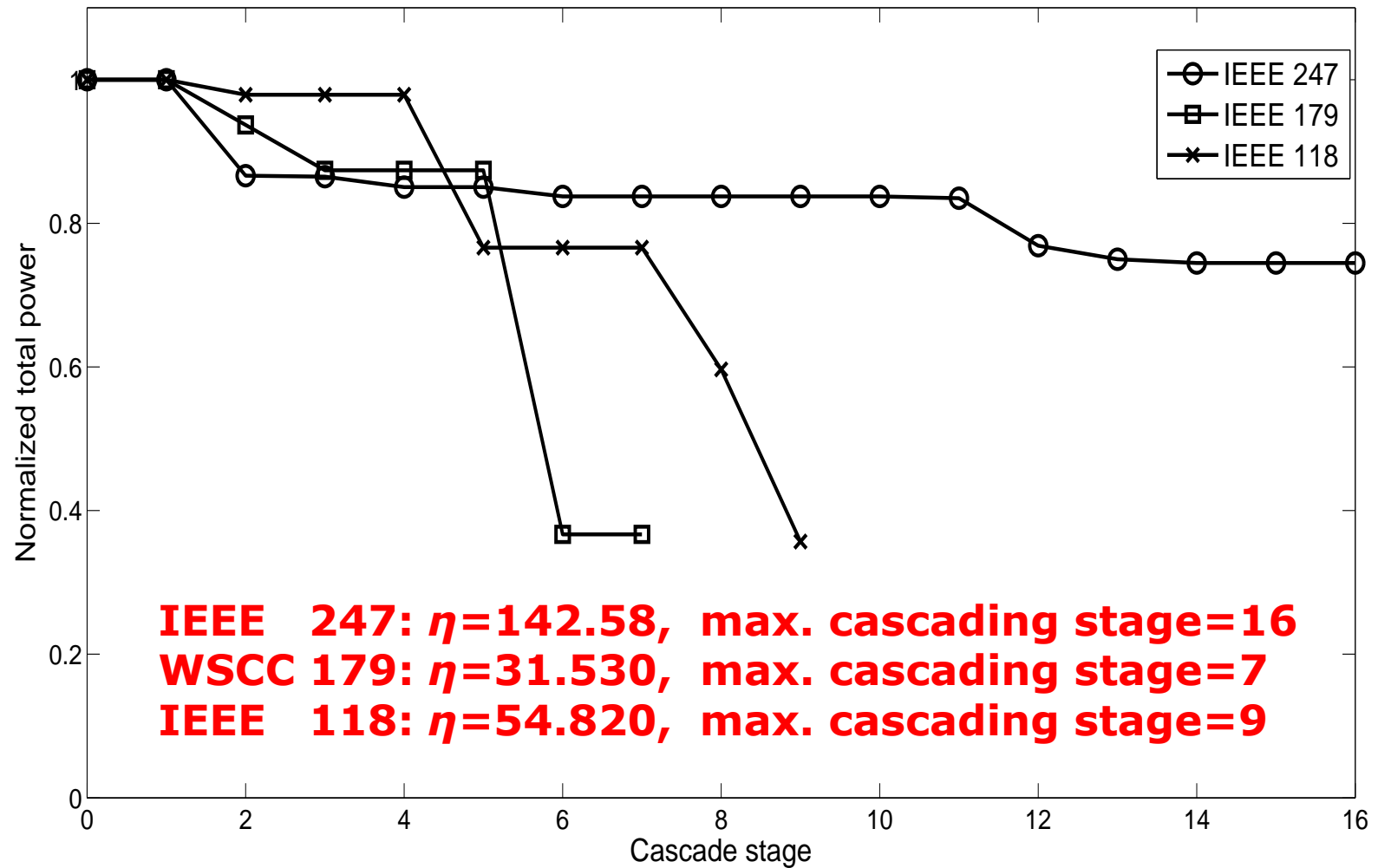


Numerical results

Network	η	Max. cascade stage
IEEE 247		
Real network	142.58	16
Synthetic network 1	160.03	21
Synthetic network 2	133.66	23
WSCC 179		
Real network	31.53	7
Synthetic network 1	114.71	15
Synthetic network 2	71.16	12
IEEE 118		
Real network	54.82	9
Synthetic network 1	75.42	11
Synthetic network 2	132.98	16



Numerical results





Conclusions and future work

- **Conclusions**

- Proposing a new robustness measure
- Utilizing the power flow model
- Outlining the role of survival probability and the depth of failure

- **Future work**

- Applying the new metric to different types of grids
- Analyzing the impact of a single failed link on the size of the cascading
- Proposing islanding as mitigation strategies for cascading failures

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Questions





Thank You!