



# Benefit Cost Analysis – Puerto Rico Transmission Grid

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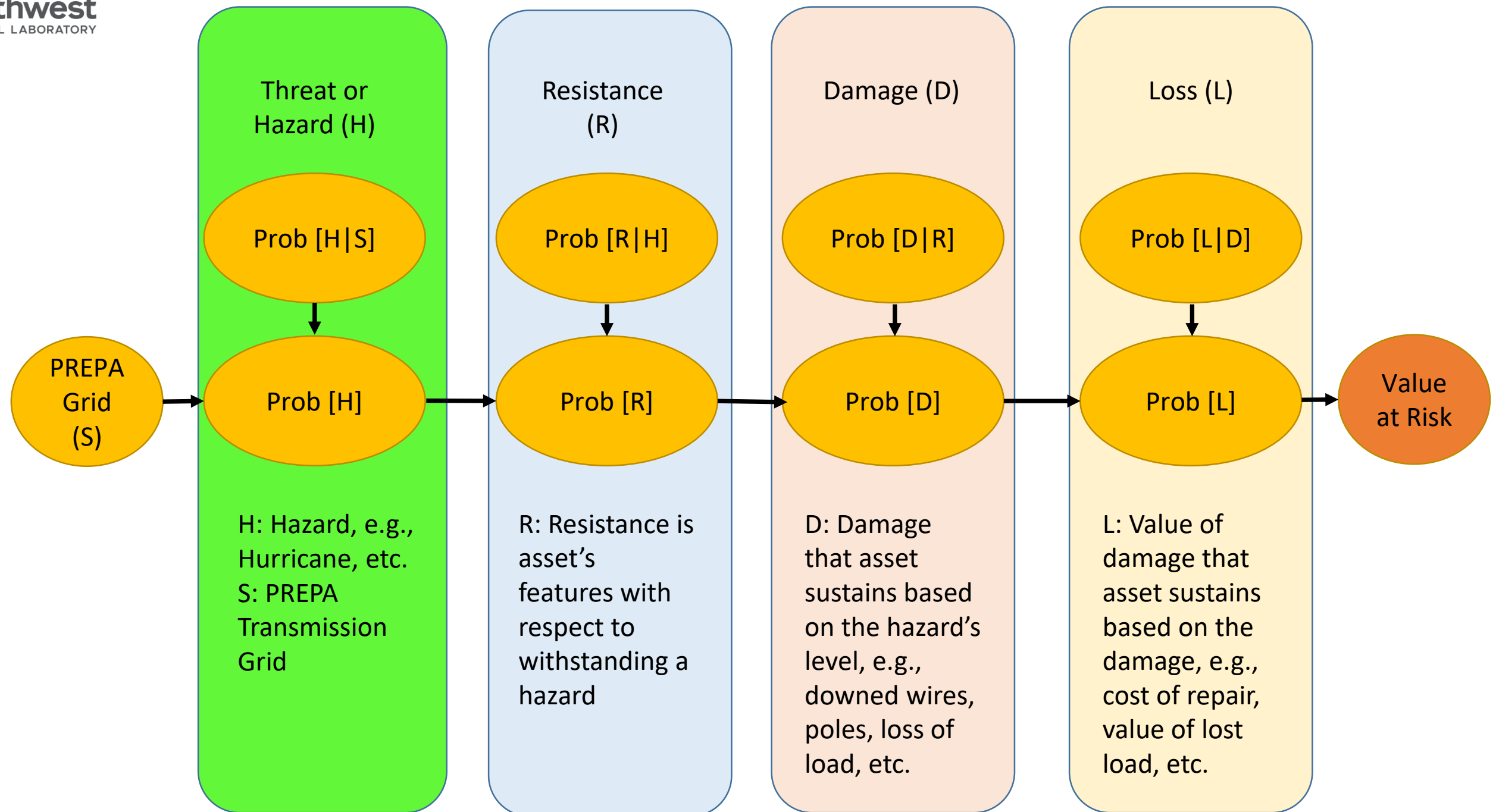


# Approach to Valuing Resilience

- Standard approach to calculating the Value-at-Risk
  - Probability of hazards
    - Natural hazards
    - Man-made hazards
    - Threats, such as terrorist attacks
  - Infrastructure characteristics or resistance
  - Probabilities of failure, given asset characteristics
  - Infrastructure value
    - Assets damaged
    - Value of lost load
    - Human injuries and death
    - Etc.
- Approach can handle any hazard or threat, provided that data exist



# Methodology



# Puerto Rico Analysis Overview

- Benefit Cost Analysis using Probability and Fragility Function methodology to determine improvements to transmission grid
- Evaluated the baseline and compared with the three alternatives below
- Three example alternatives evaluated:
  - Implementing Vegetation, Guy Wire, and Anchor Management (VGWAM)
  - VGWAM plus strategic undergrounding
  - VGWAM plus complete 115 kV minigrid system
- Conducted lifecycle analysis of implementing the alternatives
  - Probabilities of hazard's annual occurrence by category
- Methodology implemented in an Excel model with *Monte Carlo* simulation
  - Probabilistic implementation based on 167 years of data on hurricane occurrence
  - Atmospheric scientist suggested using past history, despite potential for future increases
    - Implemented approach such that both increasing frequency and intensity can be or not be implemented, depending on decision maker input

# Puerto Rico Example

- Collected data on damages from hurricanes by Category
  - Physical damages for most hurricanes since Hugo
    - Do earlier hurricane damages reflect current grid conditions?
- Used ANL's HEADOUT model to get initial outages
  - HEADOUT only provides how much of the grid loses electricity and doesn't reflect lost load time
    - Only have total outage minutes for Maria, which we estimated

# Model Assumptions

- Puerto Rico Electric Power Authority (PREPA) and Puerto Rico Losses for Hurricane Maria
  - Lost load – 2.6 GWh
  - Average retail price - \$0.24/kWh
  - Lost revenue – \$618 Million
  - Transmission O&M/mile - ~\$40K/mile
- Ran a *Monte Carlo* analysis based on historical probability of each category of hurricane to hit Puerto Rico
  - Assumed probability of number of occurrences during a single year
  - Then calculated the probability of the category for each occurrence that year

# Most Likely Results

Color	Legend
	Best for category
	Weight for each category
	Scoring section
	Best alternative

Alternative	Net Present Value (\$Mil.)	NPV Savings (\$Mil.)	Benefit Cost Ratio	PV of Costs (\$Mil.)	Capital Cost (\$Mil.)	Annual O&M Cost (\$Mil.)	NPV		Average MWh Lost	Average MWh Savings	Weighted by Criteria
							Capital / Annual O&M (\$Mil.)	Savings / Annual Cost (\$Mil.)			
Baseline	37,508					102			88,302		
Alternative 1	23,621	13,886	23	597	146	36	4	384	52,981	35,321	
Alternative 2	18,477	19,030	9	2,074	1,697	38	45	500	36,836	51,466	
Alternative 3	11,483	26,025	9	2,742	2,412	38	63	684	18,147	70,155	
<b>Weights</b>		10%	20%			10%	15%	30%		15%	
Alternative 1		0.53	1.00			1.00	0.06	0.56		0.50	0.61
Alternative 2		0.73	0.39			0.95	0.70	0.73		0.73	0.61
Alternative 3		1.00	0.41			0.95	1.00	1.00		1.00	1.31

- Highlighted boxes indicate best of each criteria
- Values were normalized within each criteria
- Values then weighted and totaled to obtain best alternative

# Conclusions

- Developed a methodology that allows analysis of resilience alternatives for the Puerto Rico Electric Power Authority (PREPA) grid
- Provides a basis to justify resilience investments for PREPA
- Range analysis should be applied to understand the strength/weakness of the associated results
- If all of the current assumptions are correct:
  - The minigrid provides the best outcome, given the current weighting of the decision criteria
  - Important to emphasize that the minigrid results may not be accurate if vegetation, guy wire, and anchor management isn't fully implemented
  - Combining underground transmission with VGWAM made undergrounding feasible
    - In addition, the undergrounding with distributed generation allowed for a larger proportion of the total load to continue operating
- Worst case outcomes still provided feasible results





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**Thank you**



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