



# DOE/OE Transmission Reliability Program

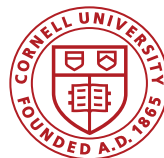
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## Management of Risk and Uncertainty through Optimized Co-operation of Transmission Systems and Microgrids with Responsive Loads

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Washington, DC



# Presentation Overview

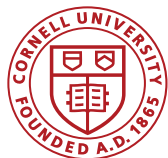
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Project Objective

Progress Update: Phases II & III

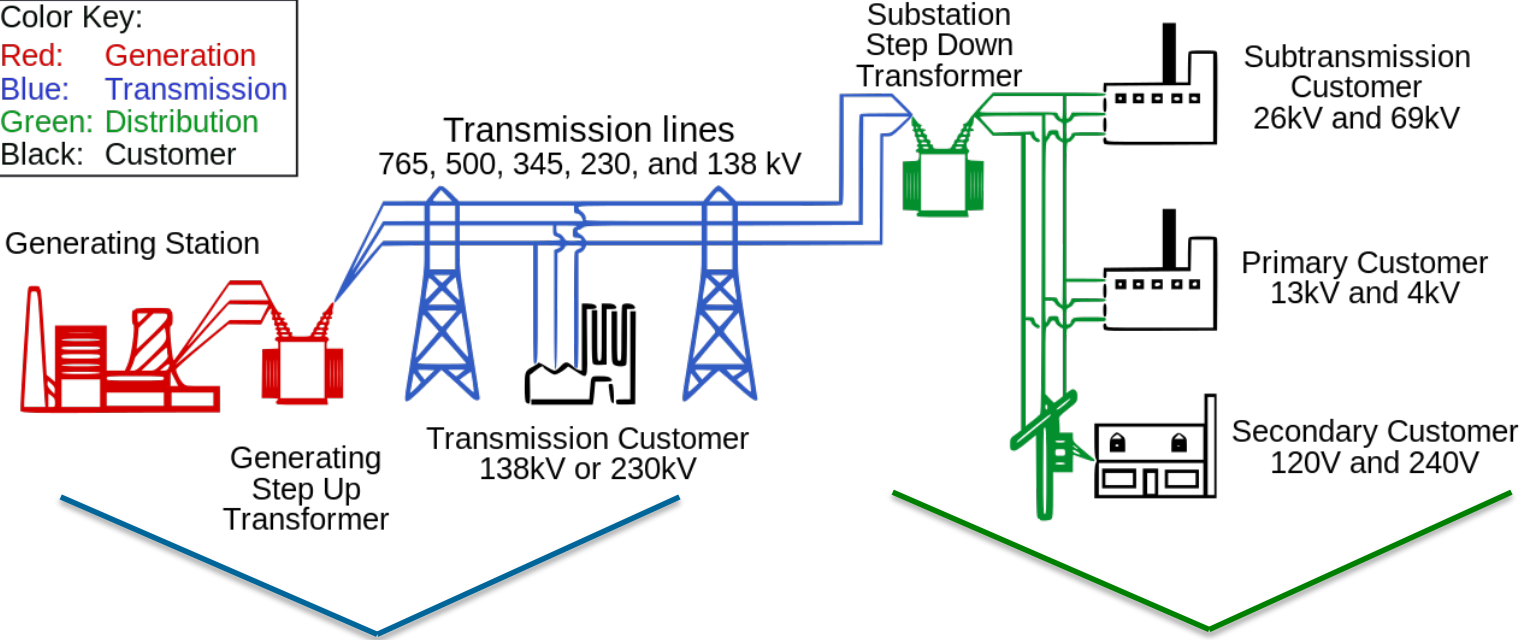
Summary of deliverables

Looking Forward: Phases III and IV



# Project Overview

Color Key:  
Red: Generation  
Blue: Transmission  
Green: Distribution  
Black: Customer



Utility scale renewables  
create uncertainty

Responsive loads, and  
distributed resources

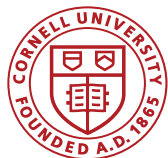


# Project Objective

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*Development of a comprehensive co-optimization framework that incorporates the generation and transmission system with the distribution system and microgrids to include responsive loads, distributed generation, and storage.*

The approach to this objective is structured across four key phases.



# Project Phases

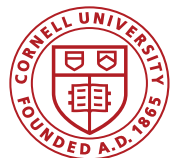
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Phase I:  
Characterizing  
uncertainty in  
renewables

Phase II:  
Modeling demand  
side resources,  
interactive effects

Phase III:  
Modeling system  
interactions

Phase IV: Co-  
optimization  
framework



# Timeline

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Timeline for the project was delineated in the updated PMP (Deliverable 1), summarized as follows:

2016	2017				2018				2019		
Q4	Q1	Q2	Q3	Q4	Q1	Q2	Q3	Q4	Q1	Q2	Q3



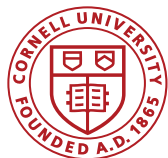
Phase I

Phase II

Phase III

Go/No GO  
Decision Point

Phase IV



# Phase I: Characterizing Uncertainty

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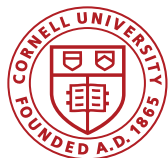
Seek to identify best methods for representing *multiple correlated wind farms*

Main contribution: review of multi-area wind modeling methods with the comprehensive comparison

## Comparison:

- ✓ Ability of generated scenarios to replicate statistical properties of the historical data;
- ✓ Quality (stability) of the solutions obtained for an economic dispatch problem.

Lead: Cornell, with Anderson & Zéphyr



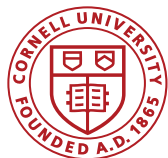
# Phase II:

## Demand Side Resources and Microgrids

Phase II focuses on the development of various categories of demand-side resources, addressing

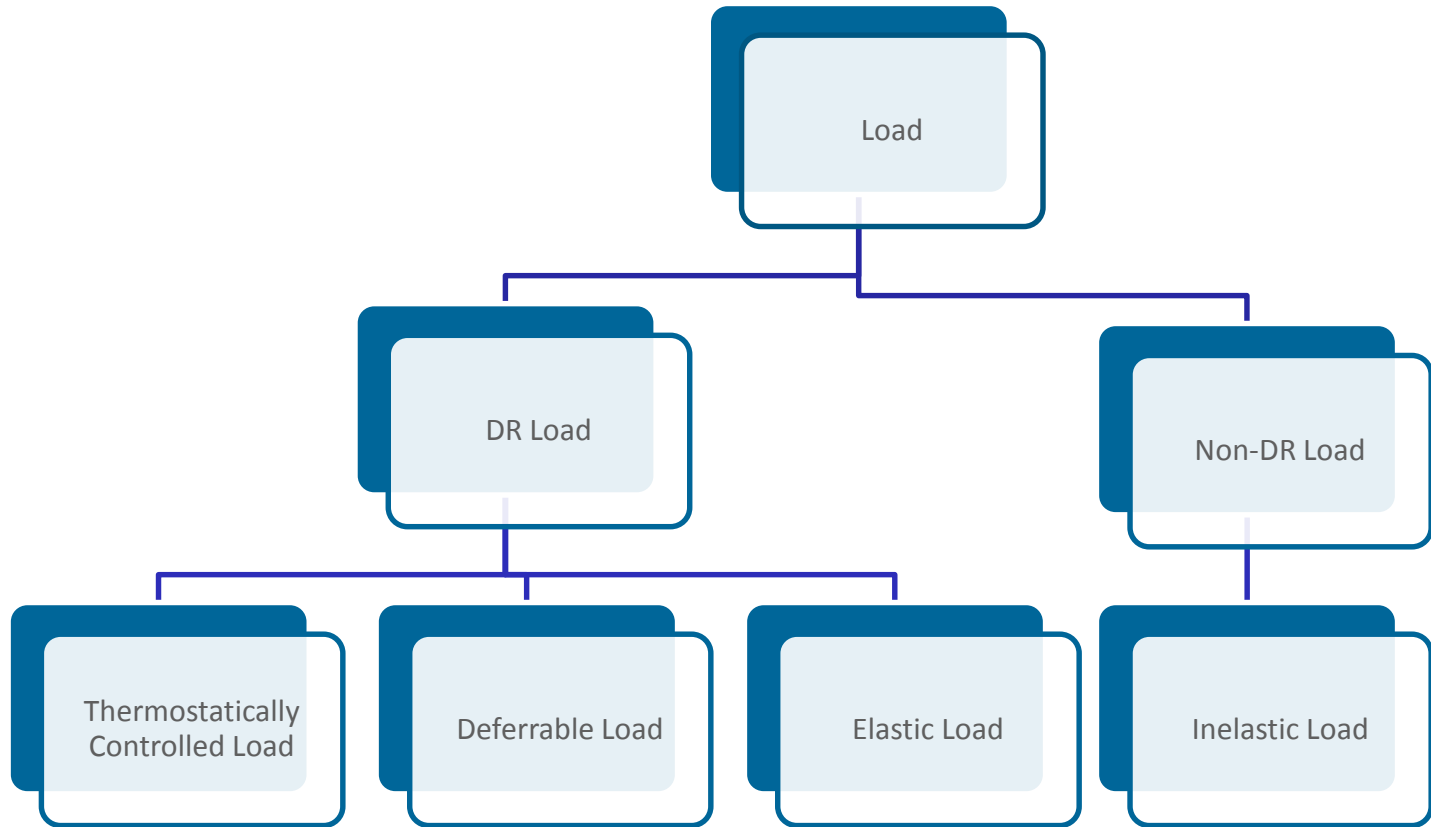
- ✓ modeling existing DR programs,
- ✓ integration in energy management system of microgrids, and
- ✓ validation and testing to assess performance from various perspectives.

Lead: Smith College, Cardell  
with support from Cornell

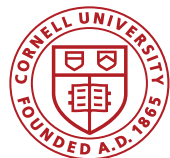




# Demand Response (DR)



Incorporating these various resources requires a “look-ahead”, flexible decision structure



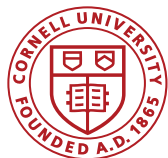
# Modeling Demand Response

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System model incorporates:

- microgrid with renewables, storage and DR
- combined DR programs for specific load classes
- stochastic rolling horizon with forecasts
- analysis of performance of various DR classes

This framework illustrates that various classes of demand response add value to the energy management strategy

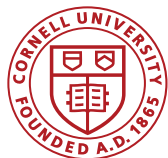


# Progress to date:

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- Representing specific load types and response characteristics
- Developed stochastic rolling horizon model for microgrid with DR, storage and renewables
- Empirical analysis of DR capabilities by class

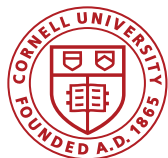
Liu, J., Zéphyr, L., & Anderson, C.L. Stochastic Optimal Dispatch for Microgrids with Load-differentiated Demand Response. Applied Energy, Special Issue on Microgrids (under review)



# Microgrid Design

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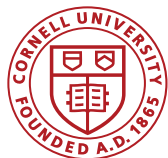
- Undergraduate honors projects at Smith College
- Protecting privacy of data flows between consumers in the microgrid and grid operators
- Implement concepts of
  - Block chain cypher and elliptical curve cryptography
  - To be submitted to HICSS-52
- Design and simulate use of an environmental economic dispatch for microgrids
  - Optimize technology mix within a microgrid for both CO<sub>2</sub> and cost using a genetic algorithm
  - Submitted to NAPS, May 2018



# Demand Response (ongoing)

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- Team of three undergraduate students developing comprehensive list of demand response programs
  - In the US
  - In Europe
- Program characteristics, including goals, participation, costs/prices, location, results
- Ongoing updates for demand response modeling in NETL project



# Phase III: System Co-optimization

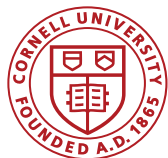
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Impact of interaction schemes on transmission and distribution/micro-grid systems:

Development of candidate co-optimization models to

- study the interactive effect of micro-grid and transmission system behaviors
- assess the importance of microgrid location in conjunction with co-operation strategies

Co-Lead by PI Team, Cornell & Smith College

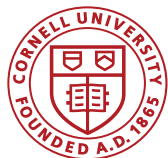


# Progress to date:

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- ✓ Development of bi-level optimization formulation
- ✓ Application of bi-level optimization in two cases:
  - i. Transmission-Microgrid Co-optimization
  - ii. Transmission-Distribution Co-optimization

*Overview of Phase III progress and preliminary results follow:*

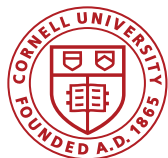


# Transmission-Microgrid Co-optimization

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Key questions:

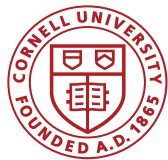
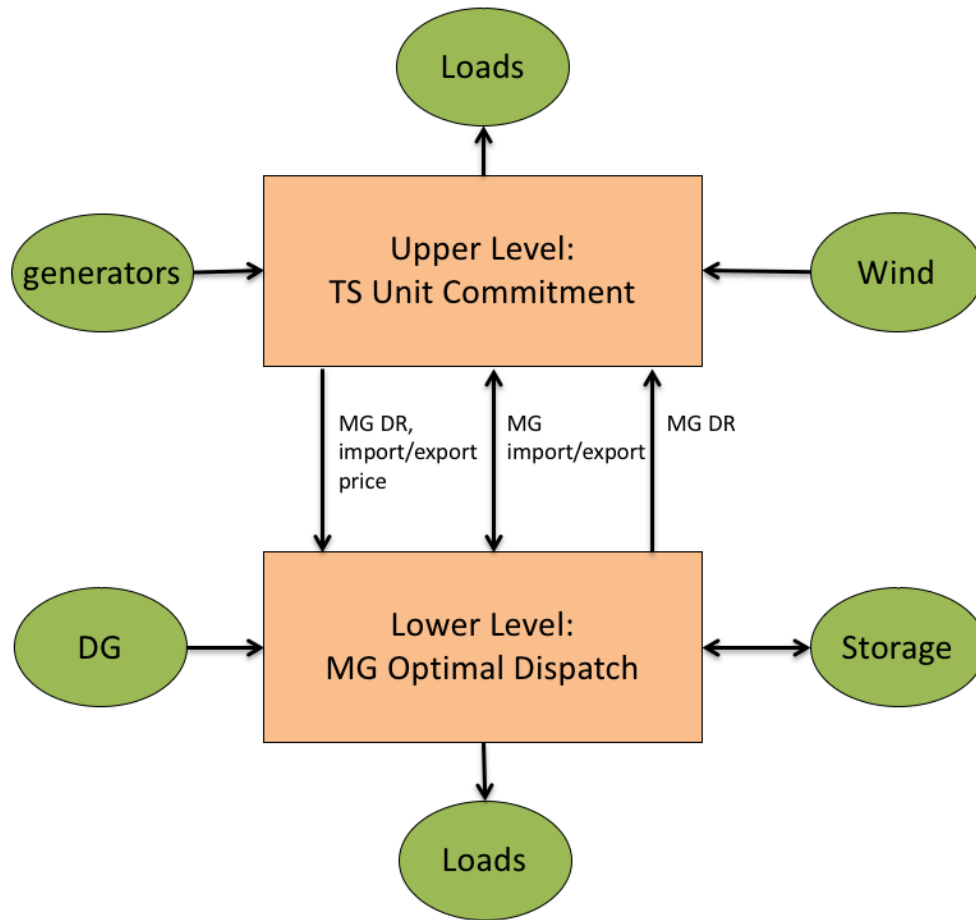
- Is co-optimization feasible and scalable?
- Will TS-MG co-optimization provide benefits to renewable integration?
- How will this operational strategy affect operating costs on the co-optimized systems?





# Bi-Level Approach

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# Bi-Level Approach: General Formulation

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$$\min_{x \in X, y \in Y} F(x, y)$$

$$\text{st: } G_i(x, y) \leq 0, \text{ for } i \in \{1, 2, \dots, I\}$$

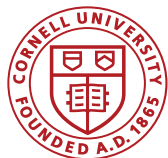
$$H_k(x, y) = 0, \text{ for } k \in \{1, 2, \dots, K\}$$

$$y \in \underset{y \in Y}{\operatorname{argmin}} \{f(x, y) : g_j(x, y) \leq 0, \text{ for } j \in \{1, 2, \dots, J\}\},$$

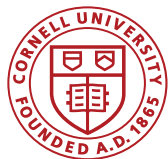
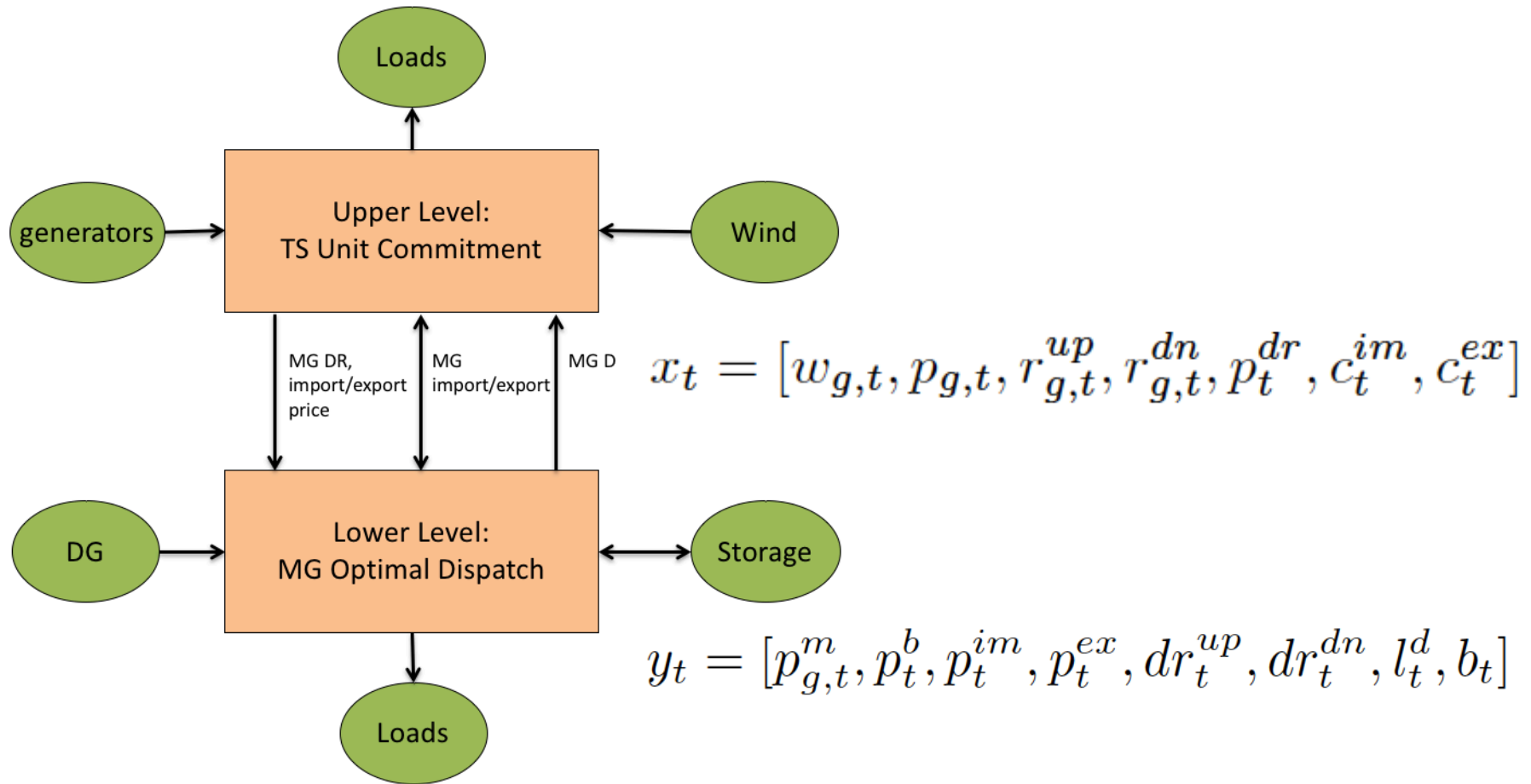
$$h_m(x, y) = 0, \text{ for } m \in \{1, 2, \dots, M\}$$

Upper Level Problem

Lower Level Problem



# Bi-Level Approach

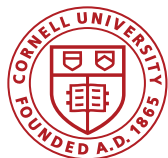




# Bi-Level Approach

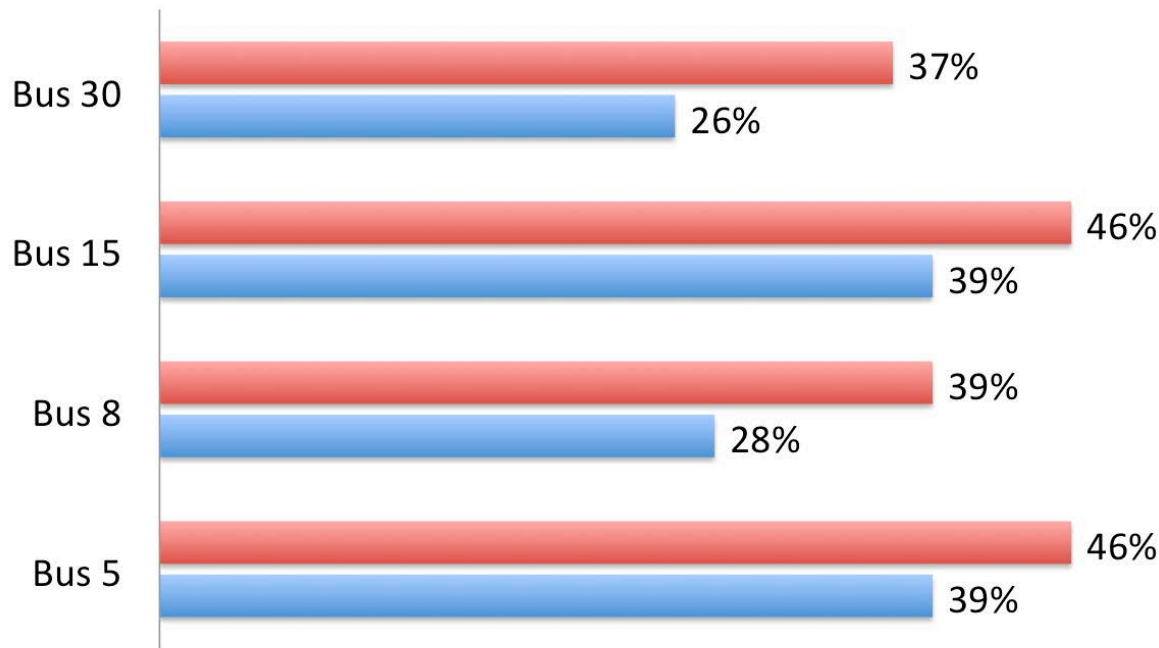
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- Reformulate into a single level optimization problem by KKT conditions and Strong Duality
- Robust optimization is used to incorporate wind uncertainty
- Single transmission-microgrid co-optimization, preliminary results explore the impact on wind penetration and operational costs



# Preliminary Results: Wind Penetration

■ With MG ■ Without MG

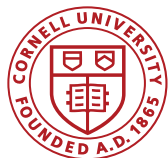


Wind Penetration

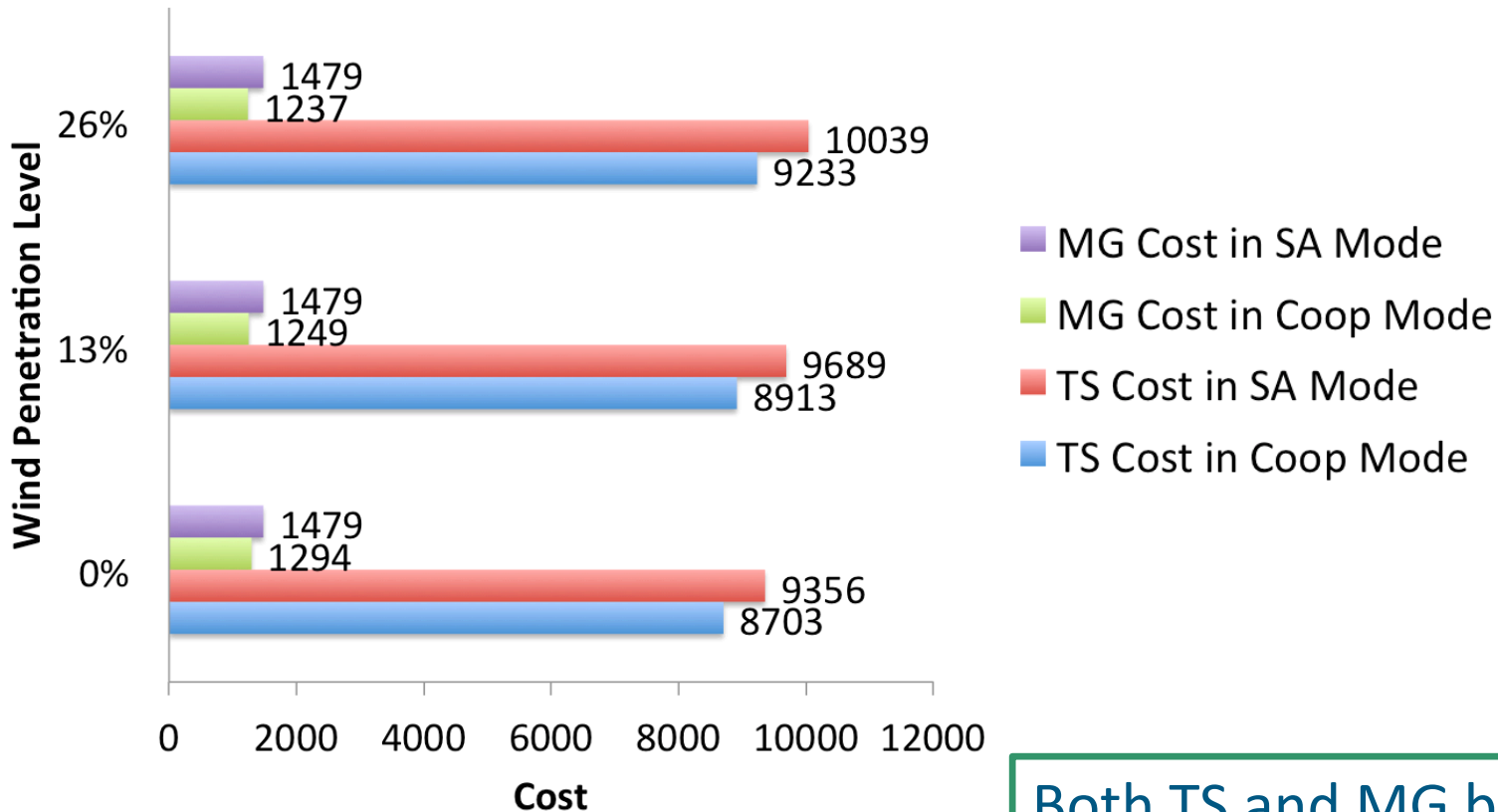
Comparison of impact at various nodes:

- ✓ 25 MW MG, with 50% deferrable load
- ✓ Overall positive effect on wind penetration
- ✓ Differences across nodes

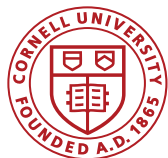
[nodes 5,15] limited by reserves  
[nodes 8,30] limited by transmission



# Preliminary Results – Costs



Both TS and MG benefit from co-optimization!

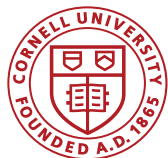


# Summary

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- microgrid demand response can boost maximum wind penetration in the larger system
- both systems benefit from cost reductions when operated co-operatively
- Cost reductions are result of demand response, increased wind penetration, and energy exchange

*Other preliminary results explore the impact of MG size, deferrable load levels, MG and wind farm locations*

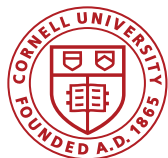


# Microgrid versus Distribution System

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Microgrid	Distribution System
<100 MW	100s to 1000s MW
Able to import/export	Only import
Bidirectional power flow	Radial power flow

TS-DS co-optimization does not provide the same flexibility as TS-MG systems, but could provide benefits.

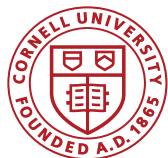
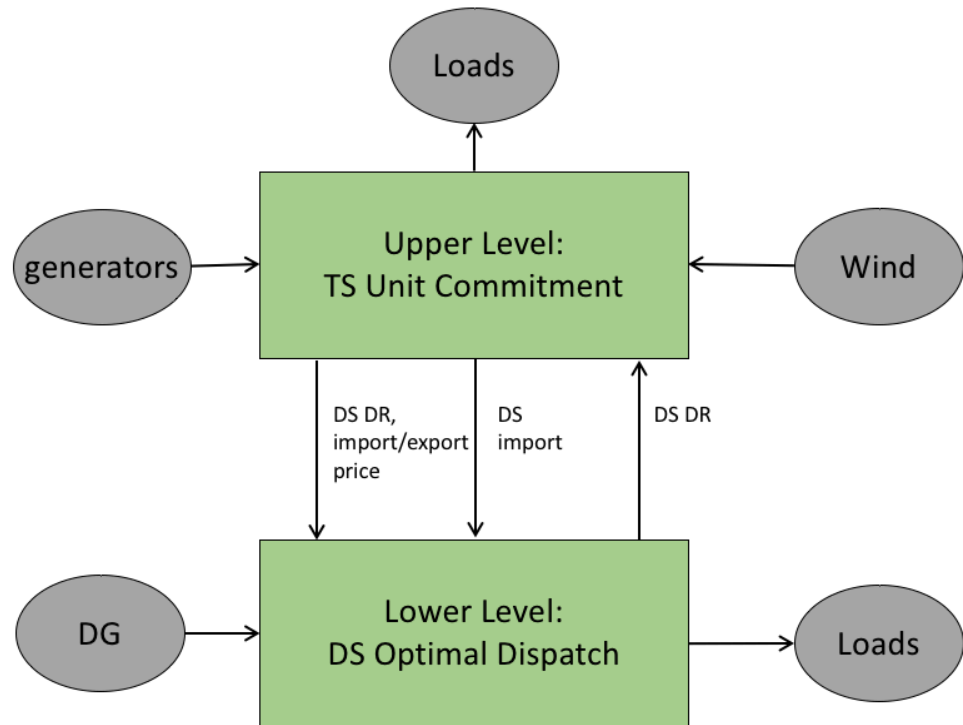




# Transmission-Distribution Co-optimization

## Key questions:

- Will TS-DS co-optimization enable higher renewable penetration?
- Do the systems operating costs benefit?



# Preliminary Results

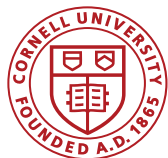
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## Increasing Deferrable Load to Facilitate Wind

<b>DL Level</b>	<b>WP</b>	<b>TS Cost</b>	<b>DS Cost</b>
25%	30%	8568	2720
50%	31%	8771	1660
75%	33%	9110	180

## Increasing Demand Response to Facilitate Wind

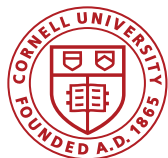
<b>DR Level</b>	<b>WP</b>	<b>TS Cost</b>	<b>DS Cost</b>
15%	30%	8795	1706
30%	31%	8821	1660
45%	33%	8862	1644



# Preliminary Results (Summary)

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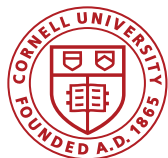
- Increasing deferrable loads in the distribution system enables (slightly) higher wind penetration, but
- ISO cost increases due to increased reserve requirements
- Demand response in distribution increases wind penetration and lowers cost
- Distribution benefits from co-optimization in either scenario



# Deliverables for 2017/18

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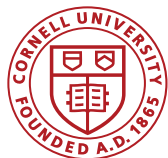
- ✓ **Data Collection Task 3:** Sufficient data is collected to develop and validate models (Yes, but ongoing through project)
- ✓ **Publication Year 2:** Technical Publication Submitted illustrating DR/Microgrid Model with test case (Complete, under review with Applied Energy)
- ✓ **Completion of Phase I & II:** results disseminated (Complete, papers under review, connecting with industry to solicit feedback)



# Deliverables for 2017/18

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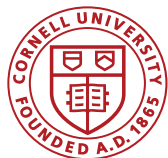
- ✓ **Milestone 3:** website updated with models, publications and collected data (on track for 10/30/18 as scheduled)
- ✓ **Presentation Year 2:** Presentation at technical conference detailing bi-level optimization results (on track, in preparation for HICSS submission, due 06/15/18)



# Accepted Publications/Presentations

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- Anderson, C.L. *Research Needs for Co-optimization of Multi-level Integrated Electricity Systems*. Closing Plenary Panelist. Utilities Variable Integration Group Spring Technical Meeting. March 13-15, 2018. Tuscon, AZ.
- Aravinthan, V., Anderson, C.L., Cardell, J.B., and Jewell, W. (2017) *Investigating Optimal Model Coordination for Integrated Transmission and Distribution Systems*. Power Engineering Research Center (PSERC) Industrial Advisory Board Meeting, Phoenix AZ. December 3, 2017.
- Anderson, C.L. *Incorporating Wind and Distributed Storage into Stochastic Economic Dispatch Solutions*. Power Engineering Research Center (PSERC) Webinar. November 21, 2017.



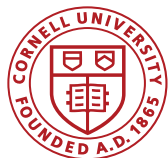
# Looking Forward:

## Phase IV Validation and Scaling

### Key focus of 2018/19:

1. Selection of most promising candidate from Phase III for the stochastic unit commitment (SUC) problem
2. Integration of SUC and ED components into co-optimization framework
3. Numerical case studies and scalability testing

Lead: Cornell, with support  
from Smith College



# Looking Forward: Industry Feedback and Input

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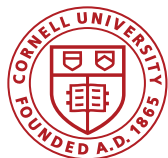
## Key focus of 2018/19:

Another key focus of this year is soliciting input from industry stakeholders.

We have shared our approach and preliminary results with industry stakeholders including:

- ✓ California ISO
- ✓ ISO New England
- ✓ New York ISO
- ✓ GE
- ✓ ABB

Next step, follow up for specific feedback from each.





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# Questions?

