



# The RenewElec Project - Exploring Challenges and Opportunities for Integrating Variable and Intermittent Renewable Resources.

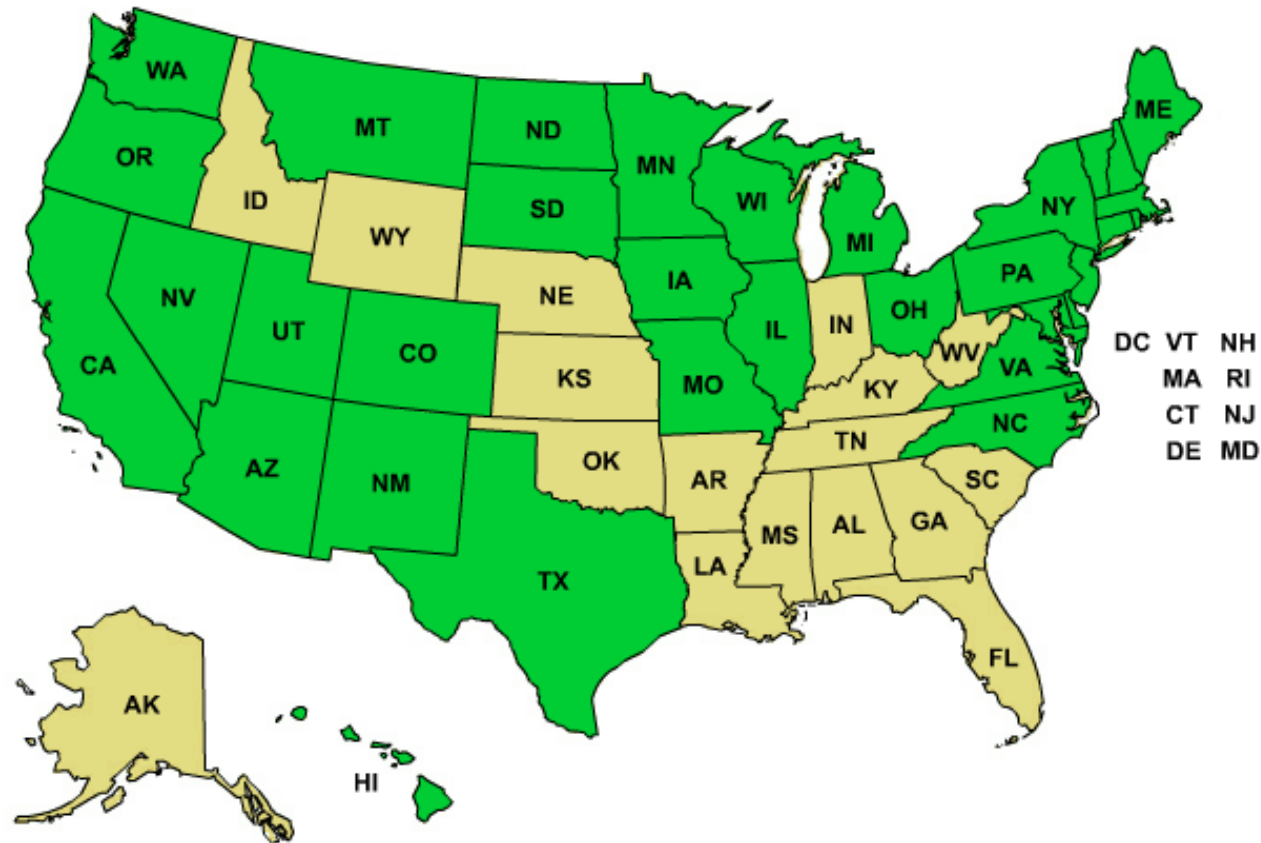
Presented by Paulina Jaramillo, Executive Director

Eighth Annual Carnegie Mellon Conference On The Electricity Industry – March 13, 2012





# 33 States Currently Have RPS





- Proponents of renewables argue that large amounts of variable and intermittent power can be easily accommodated in the present power system.
- Others argue that even levels as low as 10% of generation by variable and intermittent power can cause serious disruptions to power system operation.



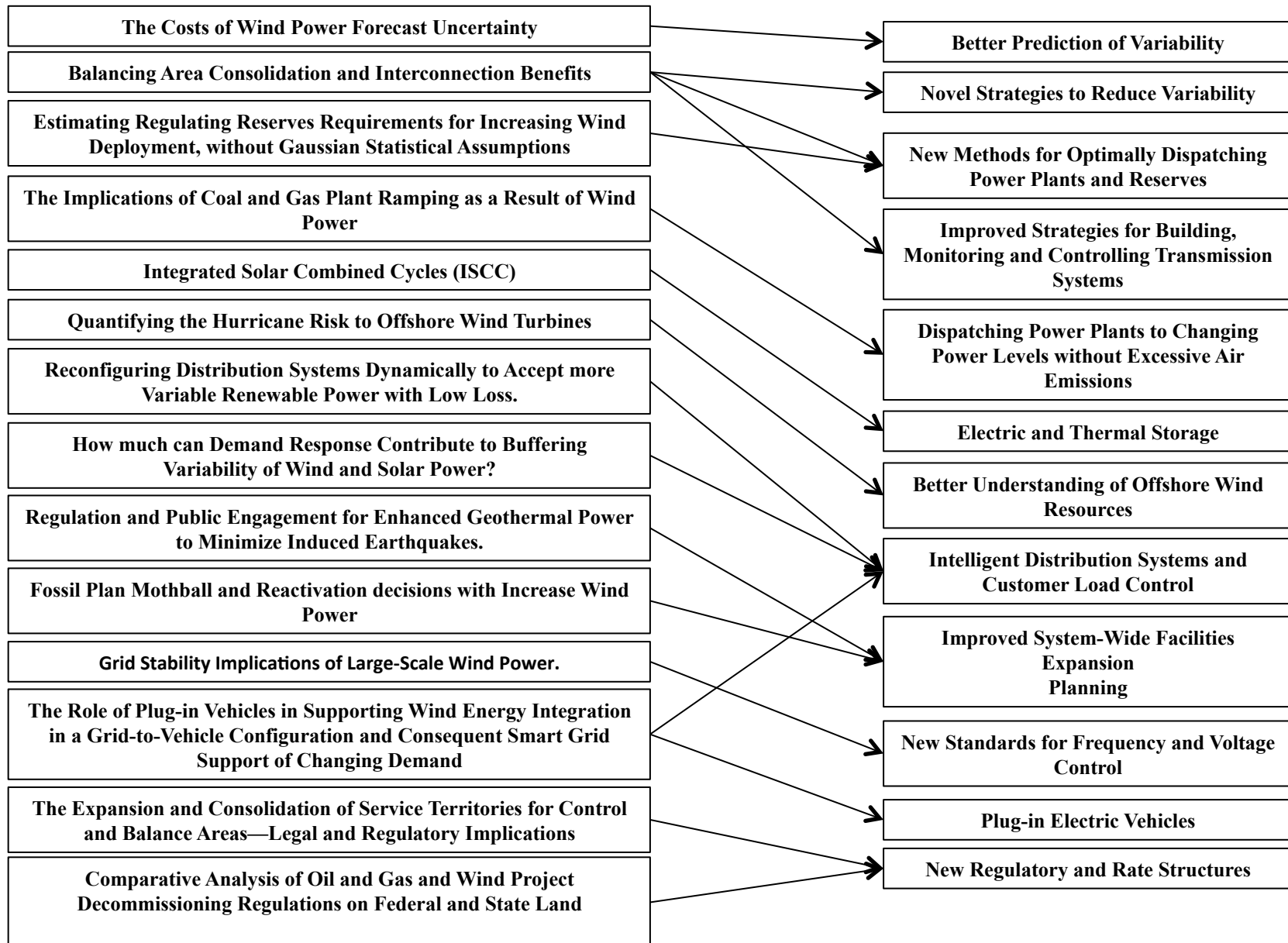
# At the RenewElec project,

We believe a *much-expanded* role for variable and intermittent renewables is possible but only if we adopt a systems approach that considers and anticipates the many changes in power system design and operation that may be needed, while doing so at an affordable price, and with acceptable levels of security and reliability.



## Ongoing Research and Stochastic Simulation Models

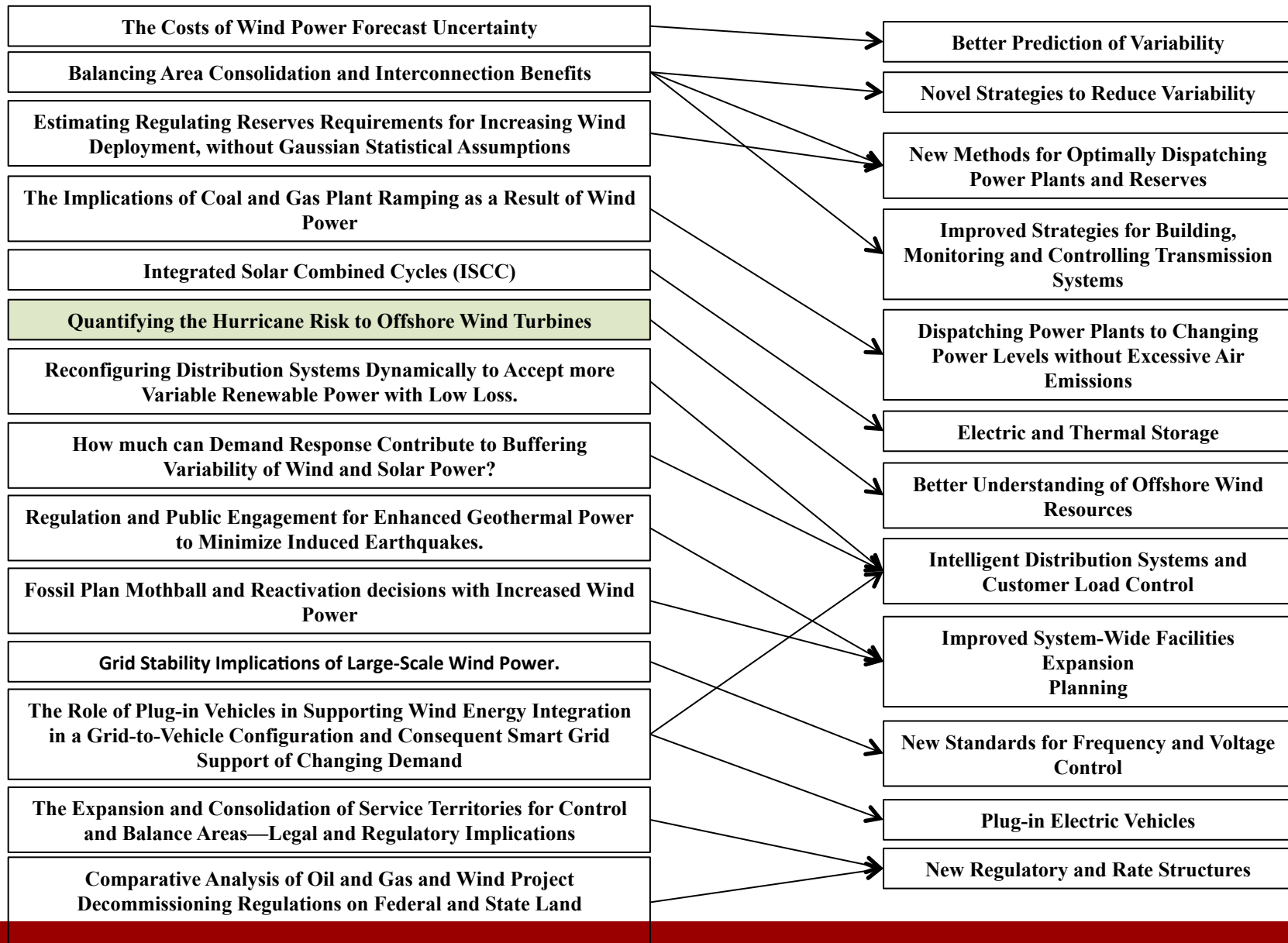
## RenewElec Project Building Blocks





## Ongoing Research and Stochastic Simulation Models

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# Quantifying the Hurricane Risk to Offshore Wind Turbines

## Quantifying the hurricane risk to offshore wind turbines

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Edited by William C. Clark, Harvard University, Cambridge, MA, and approved January 10, 2012 (received for review July 13, 2011)

The U.S. Department of Energy has estimated that if the United States is to generate 20% of its electricity from wind, over 50 GW will be required from shallow offshore turbines. Hurricanes are a potential risk to these turbines. Turbine tower buckling has been observed in typhoons, but no offshore wind turbines have yet been built in the United States. We present a probabilistic model to estimate the number of turbines that would be destroyed by hurricanes in an offshore wind farm. We apply this model to estimate the risk to offshore wind farms in four representative locations in the Atlantic and Gulf Coastal waters of the United States. In the most vulnerable areas now being actively considered by developers, nearly half the turbines in a farm are likely to be destroyed in a 20-year period. Reasonable mitigation measures—increasing the design reference wind load, ensuring that the nacelle can be turned into rapidly changing winds, and building most wind plants in the areas with lower risk—can greatly enhance the probability that offshore wind can help to meet the United States' electricity needs.

probabilistic analysis | wind energy | phase-type distribution | tropical cyclone

As a result of state renewable portfolio standards and federal tax incentives, there is growing interest and investment in renewable sources of electricity in the United States. Wind is the renewable resource with the largest installed capacity growth in the last 5 y, with U.S. wind power capacity increasing from 8.7 GW in 2005 to 39.1 GW in 2010 (1). All of this development has occurred onshore. U.S. offshore wind resources may also prove to be a significant contribution to increasing the supply of renewable, low-carbon electricity. The National Renewable Energy Laboratory (NREL) estimates that offshore wind resources can be as high as four times the U.S. electricity generating capacity in 2010 (2). Although this estimate does not take into account siting, stakeholder, and regulatory constraints, it indicates that U.S. offshore wind resources are significant. Though no offshore wind projects have been developed in the United States, there are 20 offshore wind projects in the planning process (with an estimated capacity of 2 GW) (2). The U.S. Department of Energy's 2008 report, *20% Wind by 2030* (3) envisions 54 GW of shallow offshore wind capacity to optimize delivered generation and transmission costs.

U.S. offshore resources are geographically distributed through the Atlantic, Pacific, and Great Lake coasts. The most accessible shallow resources are located in the Atlantic and Gulf Coasts. Resources at depths shallower than 60 m in the Atlantic coast, from Georgia to Maine, are estimated to be 920 GW; the estimate for these resources in the Gulf coast is 460 GW (2).

Offshore wind turbines in these areas will be at risk from Atlantic hurricanes. Between 1949 and 2006, 93 hurricanes struck the U.S. mainland according to the HURDAT (Hurricane Database) database of the National Hurricane Center (4). In this 58-y period, only 15 y did not incur insured hurricane-related losses (5). The Texas region was affected by 35 hurricane events, while the southeast region (including the coasts of Florida, where no offshore resources have been estimated (2)) had 32 events.

Hurricane risks are quite variable, both geographically and temporally. Pelletier, et al. (6) note pronounced differences in the total hurricane damages (normalized to 2005) occurring each decade. Previous research has shown strong associations between North Atlantic hurricane activity and atmosphere-ocean variability on different time scales, including the multidecadal (7, 8). Atlantic hurricane data show that hurricane seasons with very high activity levels occur with some regularity; for instance, since 1950, there have been 25 y with three or more intense hurricanes (Saffir-Simpson Category 3 or higher). There were two 2-y periods with 13 intense hurricanes: 1950–1951 and 2004–2005. 2004 and 2005 hurricanes were particularly damaging to the Florida and Gulf Coast regions (six hurricanes made landfall in those areas in 2004 and seven the following year).

These hurricanes resulted in critical damages to energy infrastructure. Hurricane Katrina (2005), for example, was reported to have damaged 21 oil and gas producing platforms and completely destroyed 44 (9). Numerous drilling rigs and hydrocarbon pipelines were also damaged. Similarly, hurricanes have damaged power systems. Liu, et al. (10) reported that in 2003 Dominion Power had over 58,000 instances of the activation of safety devices in the electrical system to isolate damages as a result of Hurricane Isabel. Although no offshore wind turbines have been built in the United States, there is no reason to believe that this infrastructure would be exempt from hurricane damages.

In order to successfully develop sustainable offshore resources, the risk from hurricanes to offshore wind turbines should be analyzed and understood. Here we present a probabilistic model to estimate the number of turbines that would be destroyed by hurricanes in an offshore wind farm. We apply this model to estimate the risk to offshore wind farms in four representative locations in the Atlantic and Gulf Coastal waters of the United States: Galveston County, TX; Dare County, NC; Atlantic County, NJ; and Dukes County, MA. Leases have been signed for wind farms off the coasts of Galveston (11) and Dukes County (12); projects off the coasts of New Jersey and North Carolina have been proposed (12).

### Results

**Wind Farm Risk from a Single Hurricane.** Wind turbines are vulnerable to hurricanes because the maximum wind speeds in those storms can exceed the design limits of wind turbines. Failure modes can include loss of blades and buckling of the supporting tower. In 2003, a wind farm of seven turbines in Okinawa, Japan was destroyed by typhoon Maemi (13) and several turbines in China were damaged by typhoon Dujuan (14). Here we consider only tower buckling, because blades are relatively easy to replace

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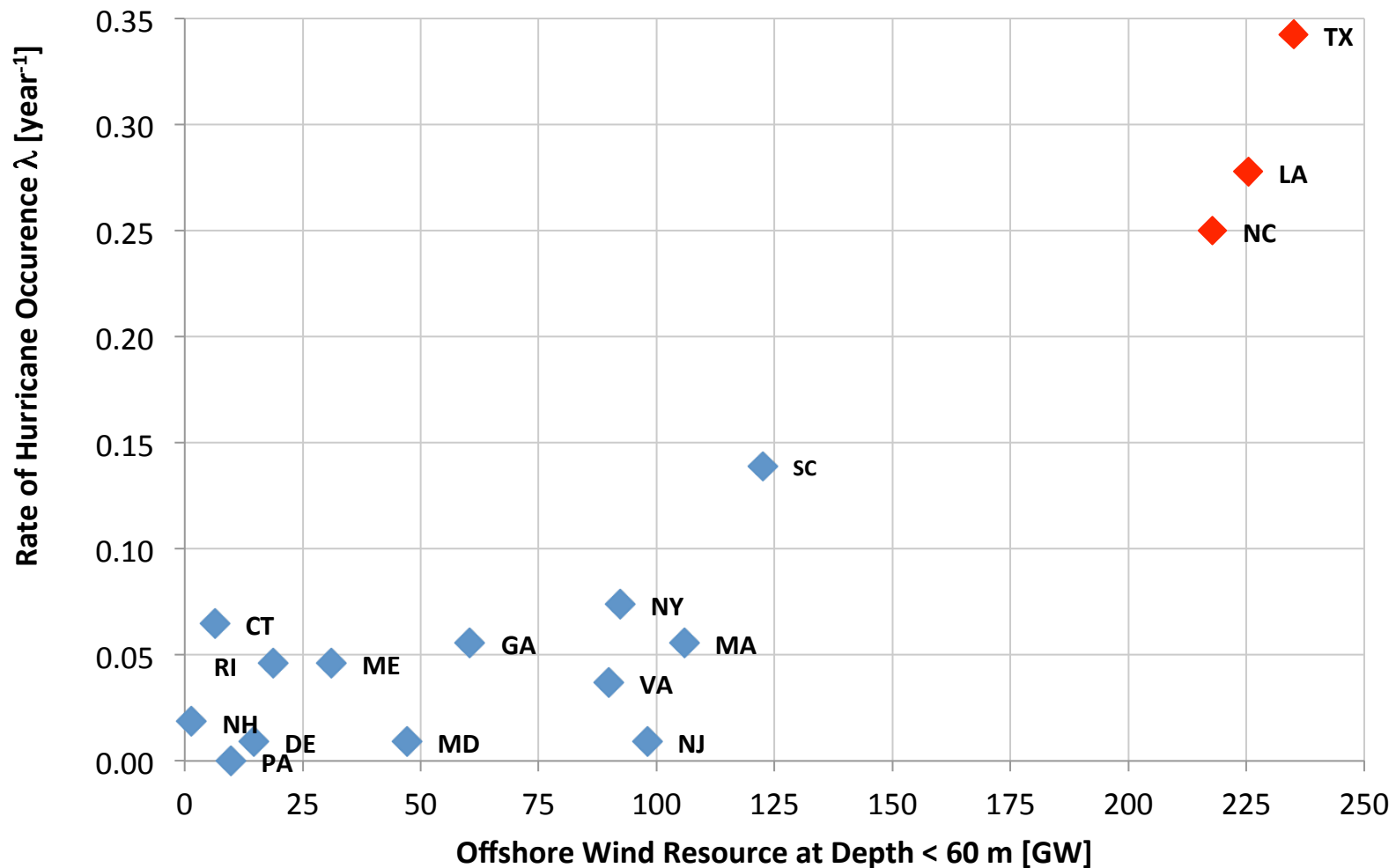
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# Offshore Wind Potential in Atlantic and Gulf Coasts







# Wind Turbines are Vulnerable to Hurricanes

Typhoon Maemi, Okinawa, 2003



(a) WT No. 3



(b) WT No. 4



(c) WT No. 5



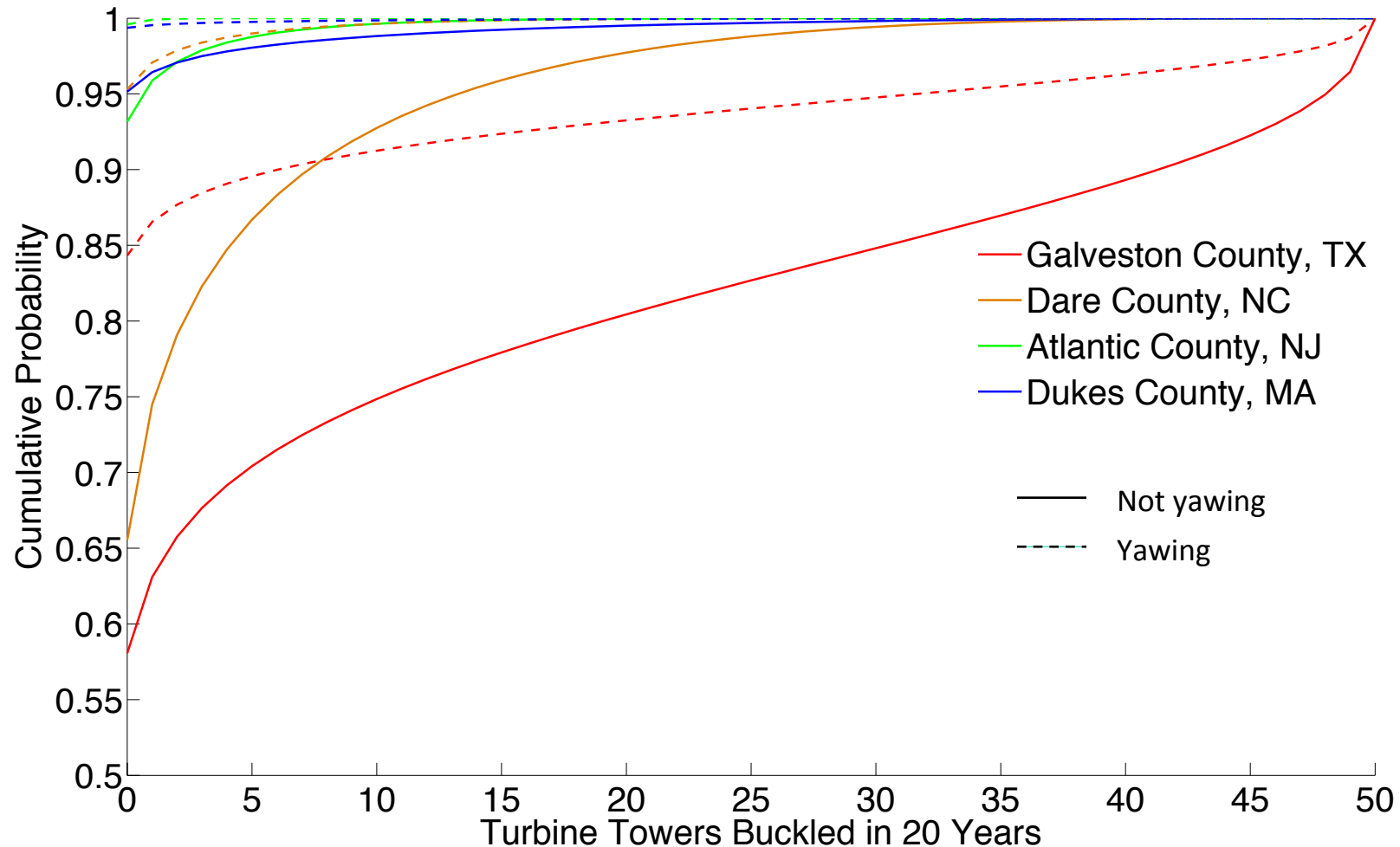
(d) WT No. 6  
Takahara, et al (2004)





# Turbines Destroyed in 20 Years

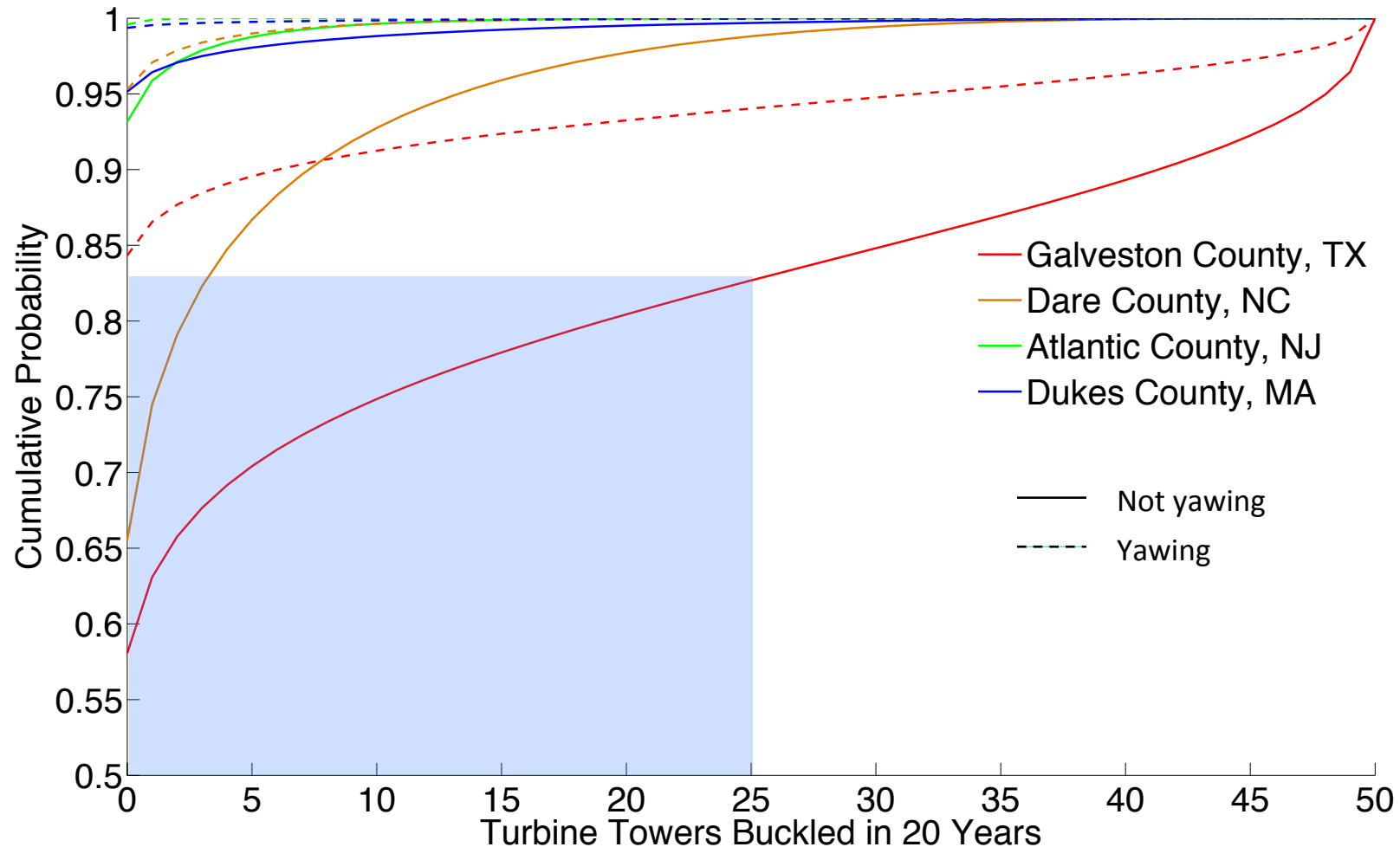
50-turbine wind farm





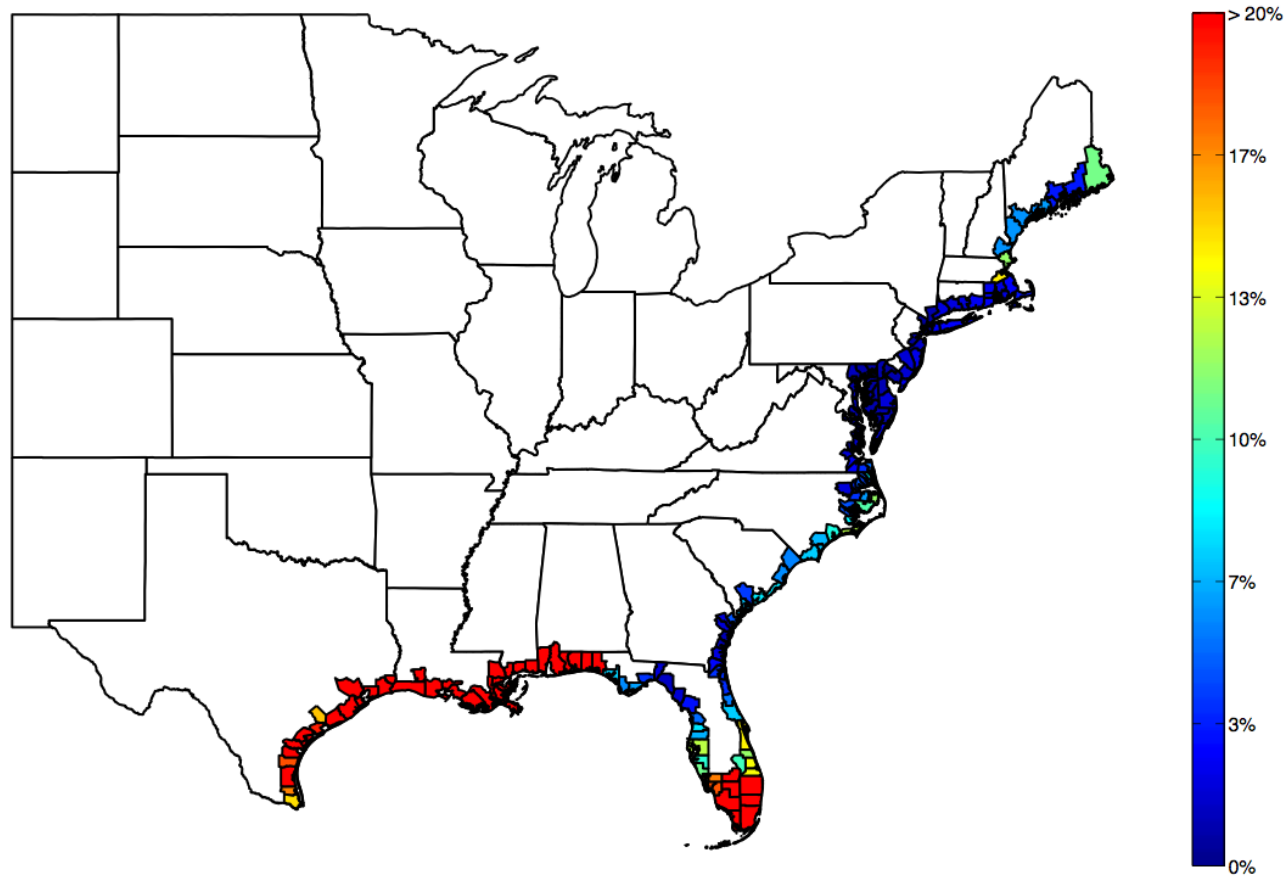
# Turbines Destroyed in 20 Years

50-turbine wind farm





# Probability That At Least 10% Of Turbines In A Wind Farm Will Be Destroyed By Hurricanes In 20 Years - No Yaw Scenario





# Engineering Changes Can Reduce Risk

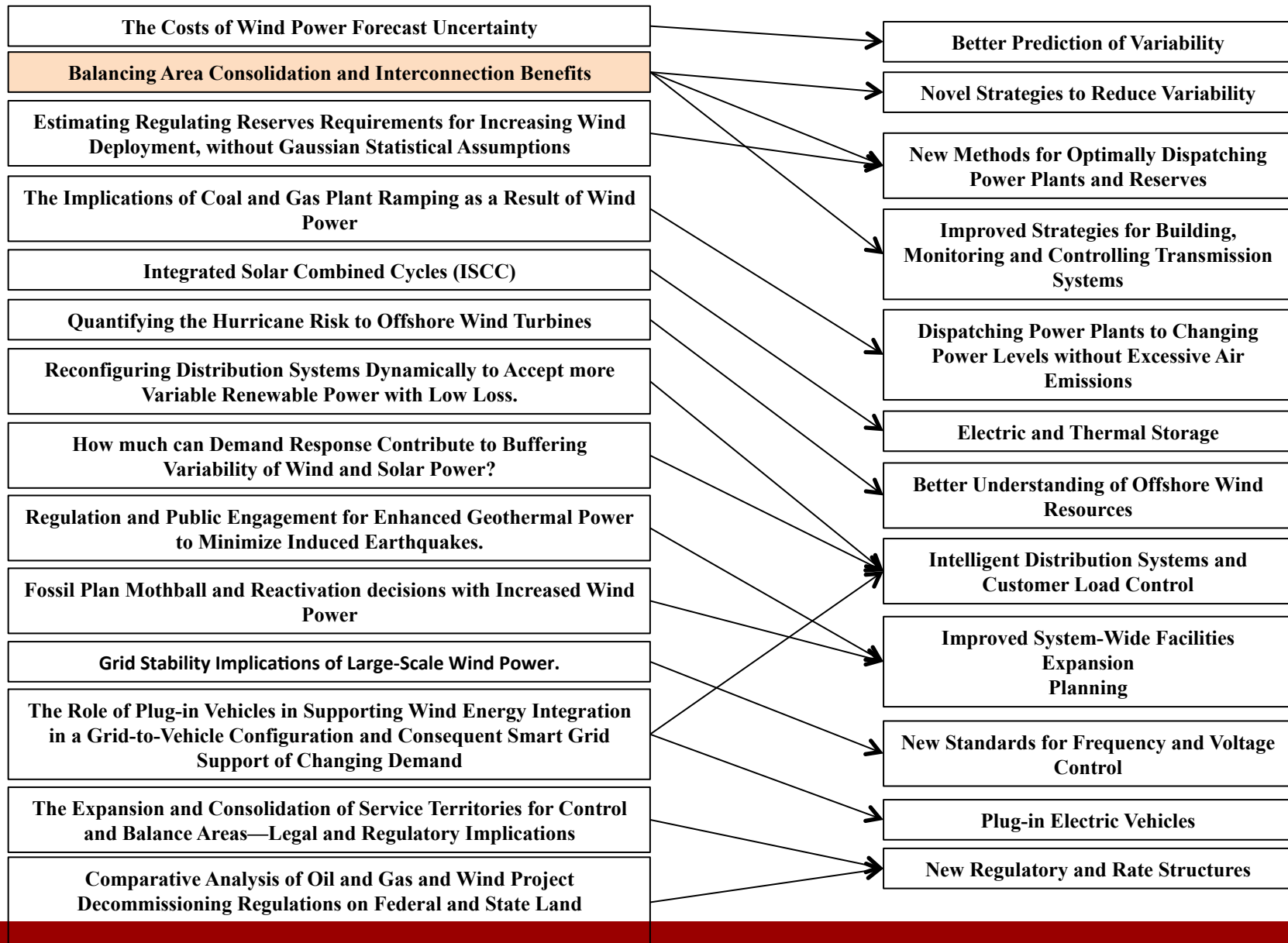
- Backup power for yaw system
  - Survival depends on active system
  - Wind vane must survive
  - Turbine must yaw quickly
- Stronger towers and blades
  - More steel in tower
  - More fiberglass in blades
  - 20 – 30% cost increase





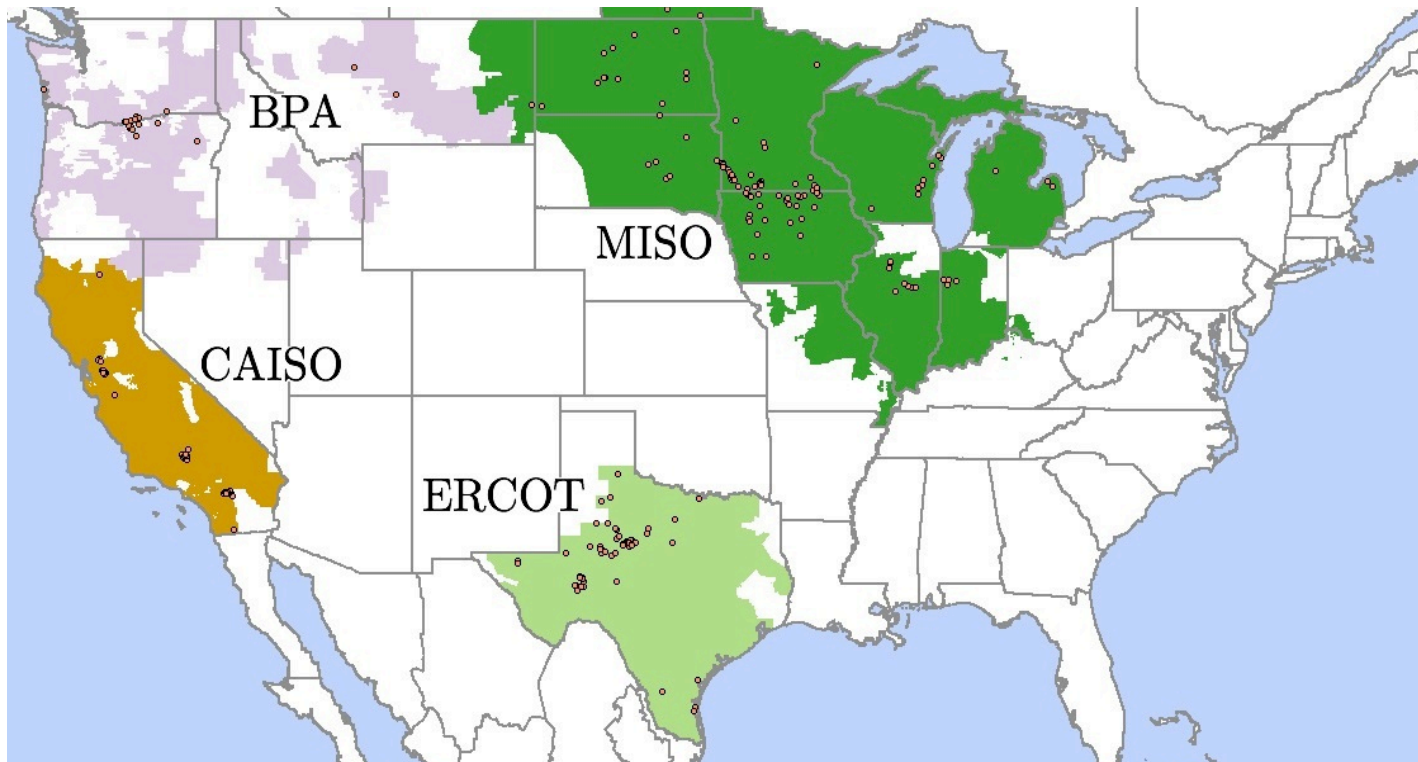
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# The Effect Of Long-distance Interconnection On Wind Power Variability

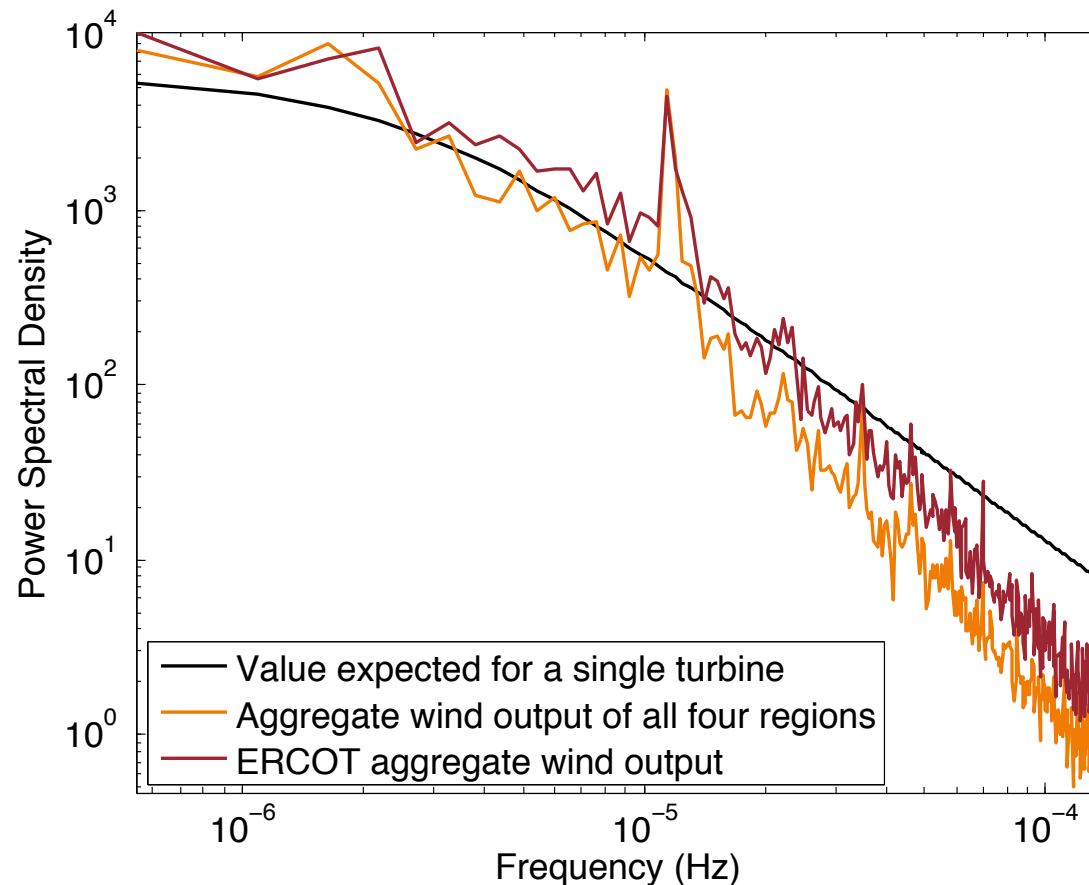


Emily Fertig, Warren Katzenstein, Jay Apt, Paulina Jaramillo





Connecting wind plants within a region reduces high-frequency fluctuations compared to a single wind plant.



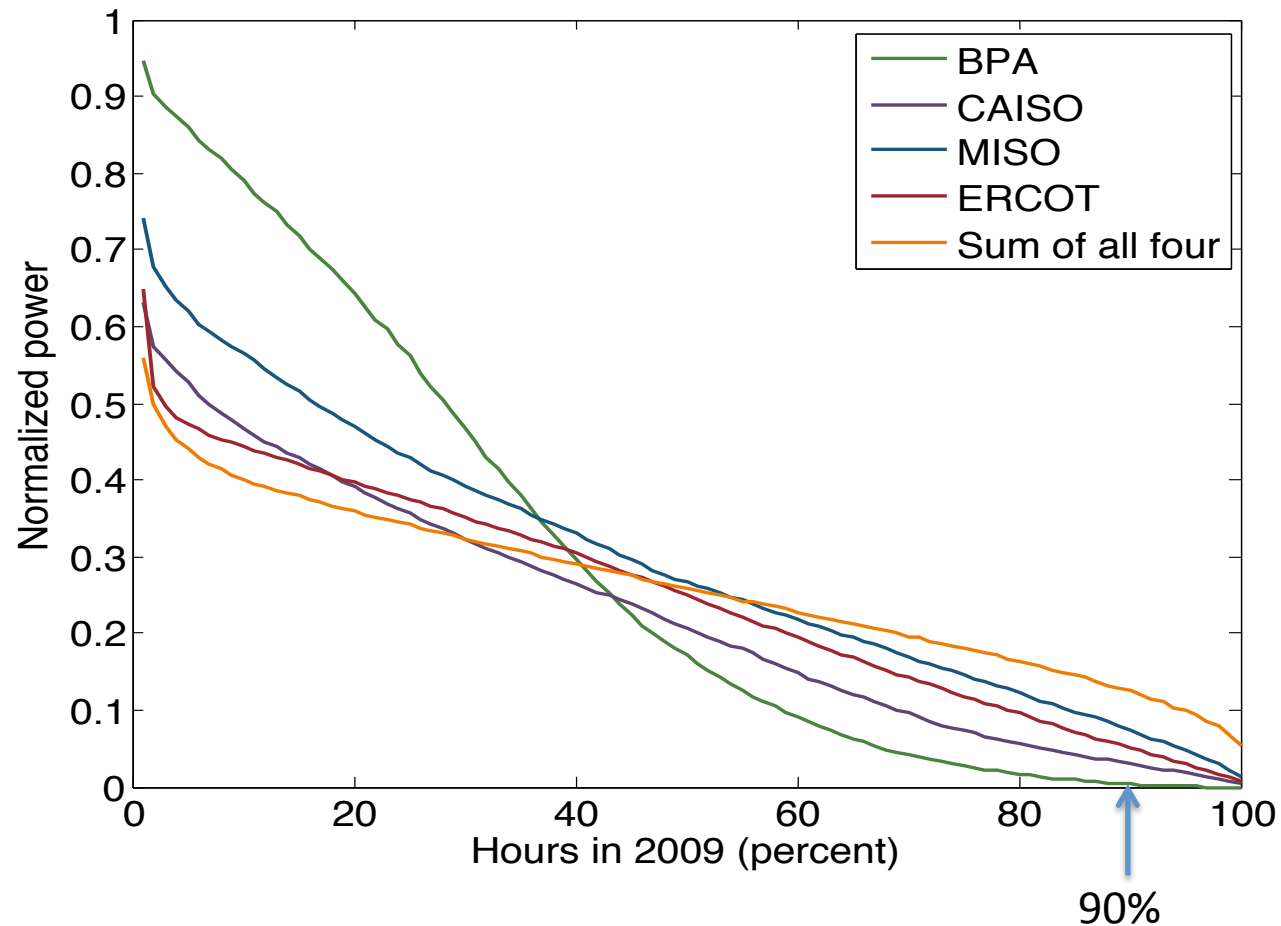
This reduces the need for quick-ramping resources such as batteries and peaker gas plants. Connecting all four regions provides negligible additional benefit compared with a single region (note log scale).







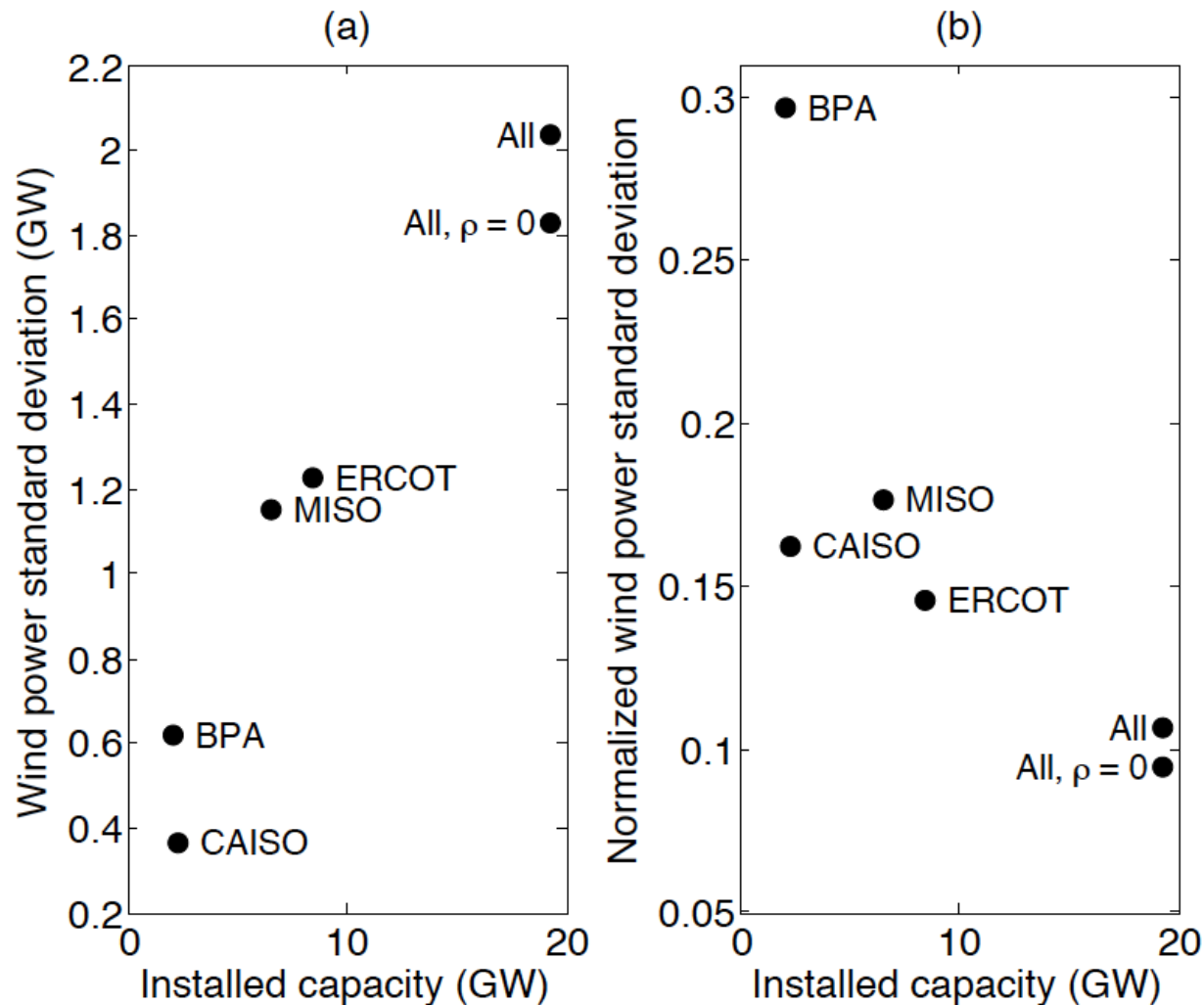
## Interconnection substantially increases the percentage of firm wind capacity



12% of aggregate wind capacity of all four regions is available 90% of the time; only 1% to 6% of wind capacity of a single region is available 90% of the time



Interconnection also reduces the per-unit standard deviation



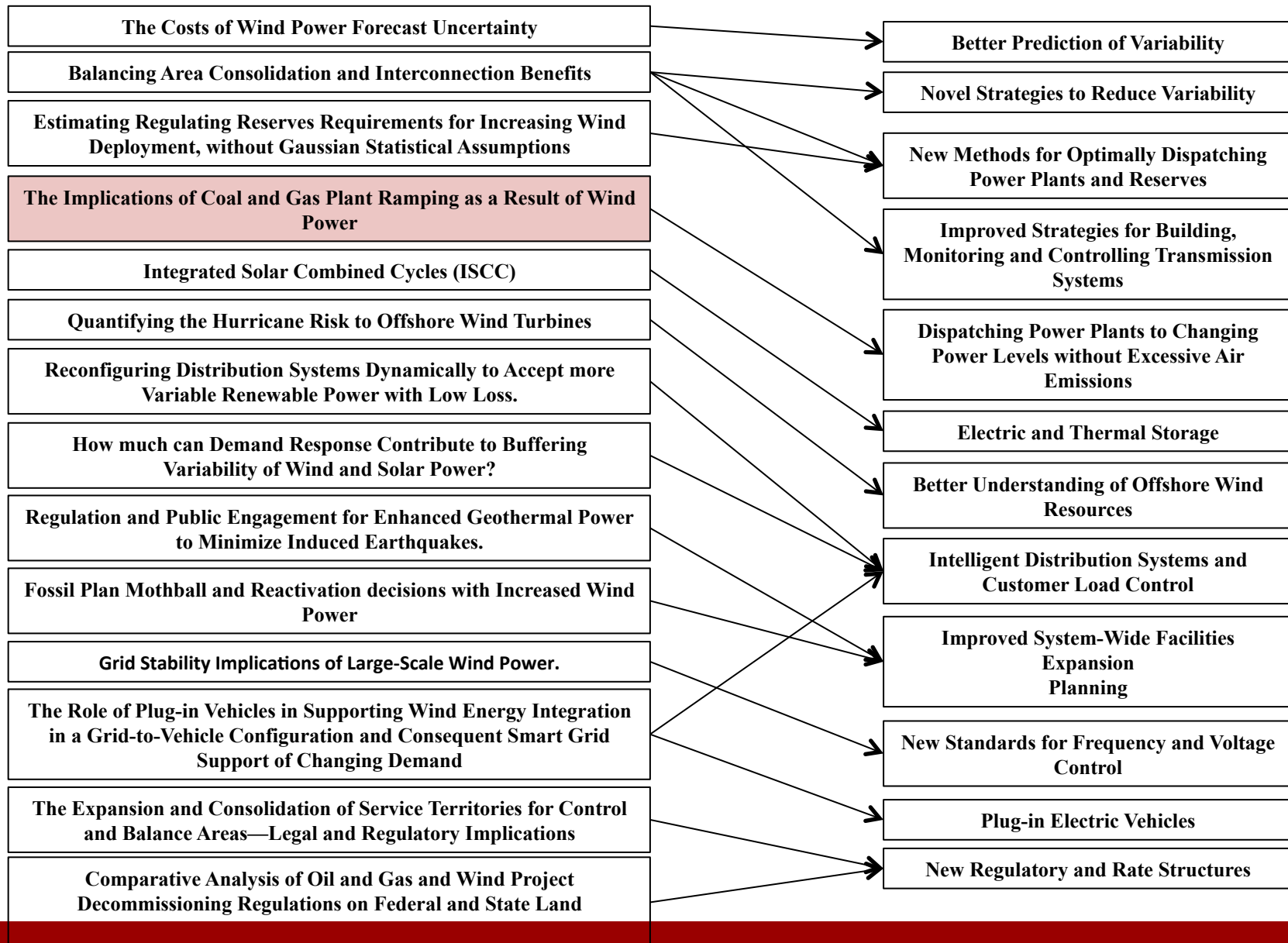
Next Step:  
Benefit-  
Cost  
Analysis





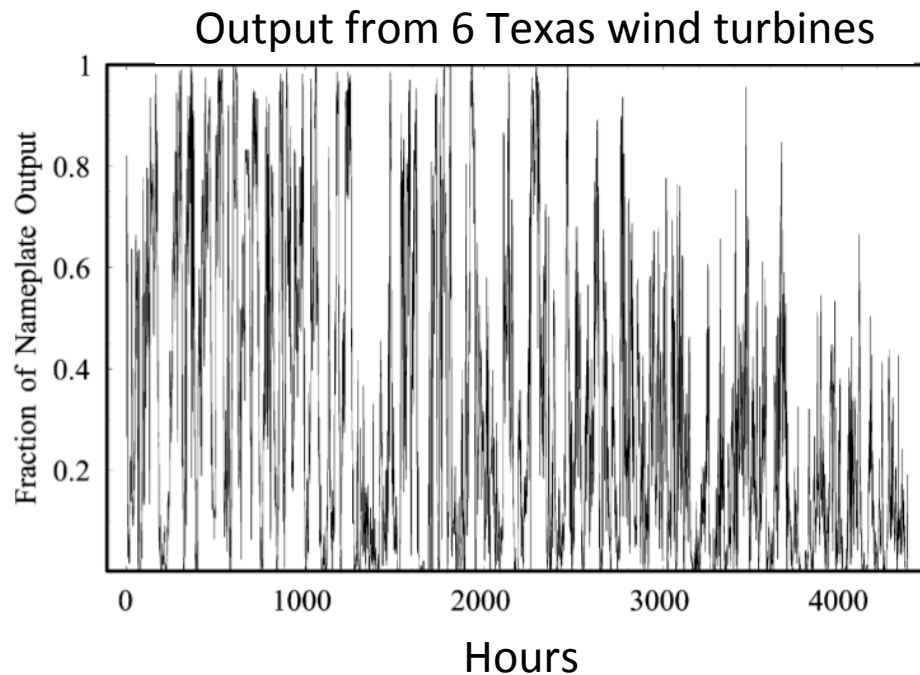
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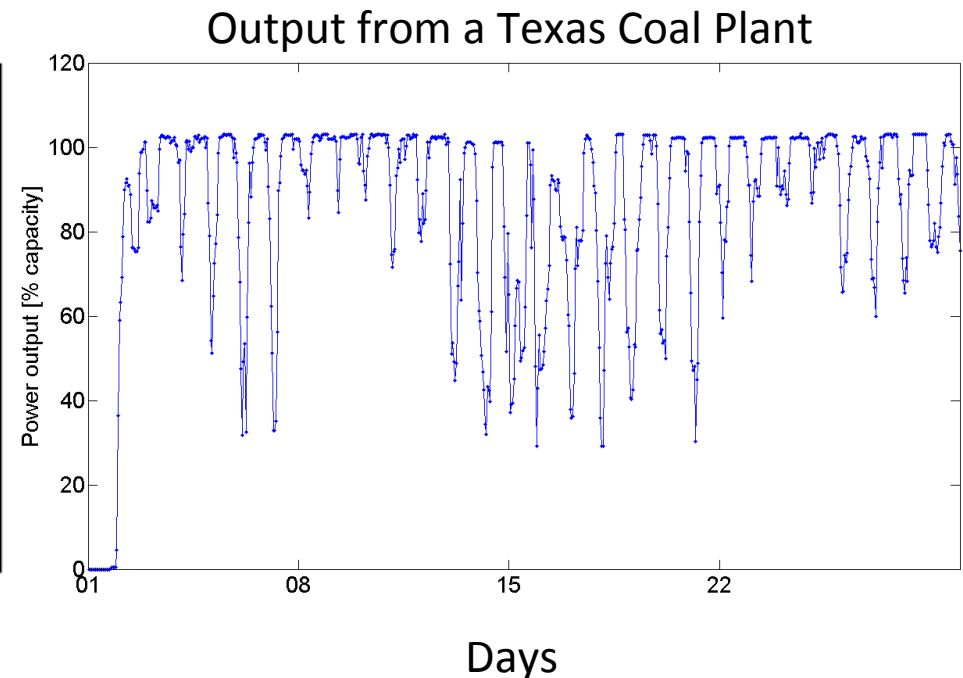




# Impacts of Large Scale Penetration of Wind on the Operations of Coal Power Plants



Source: (J Apt 2007)



Source: CEMS 2008

David Luke Oates, Paulina Jaramillo



# Model Overview

“What are the capacities of each unit and demand for electricity?”

“How much power does each unit produce every hour?”

“How much CO<sub>2</sub> and NO<sub>x</sub> are produced?”

System  
Data

- Unit capacity, etc.
- Hourly Demand
- Hourly Wind

UCED  
Model

- Optimization Model
- Determine Schedule

Emissions  
Model

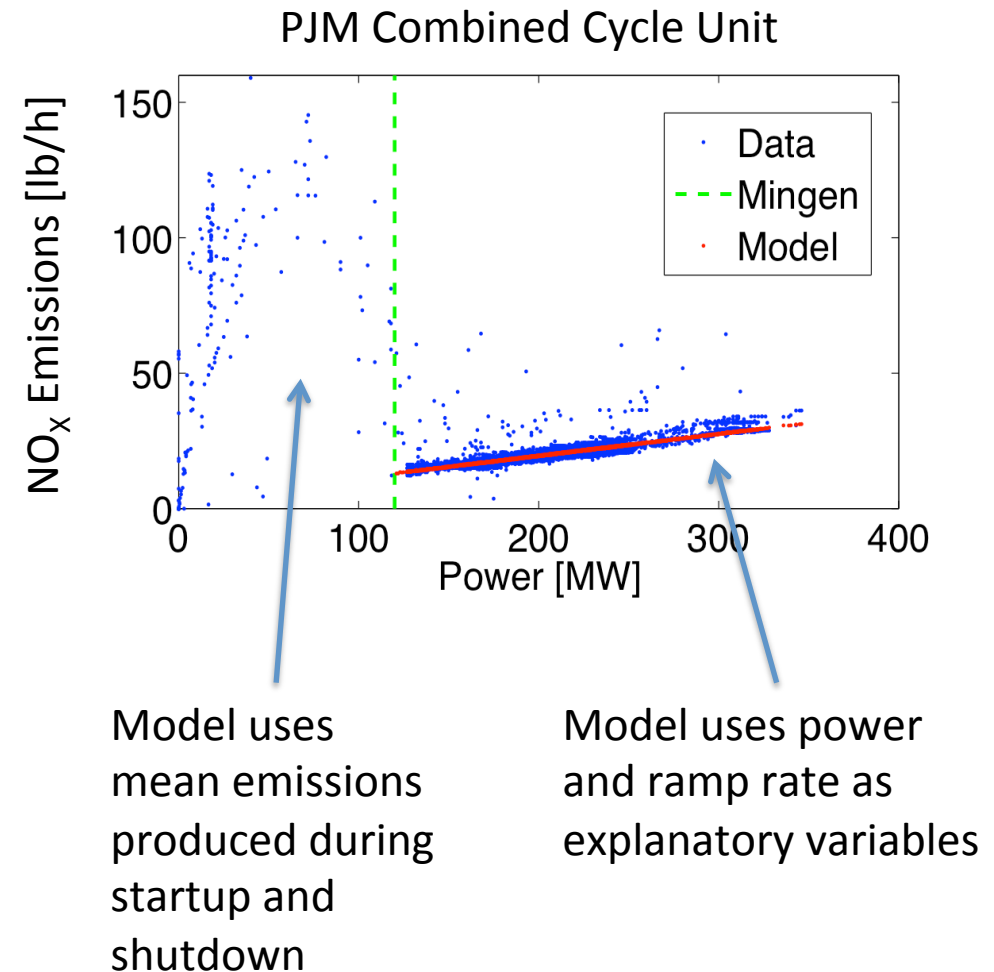
- Many Regression Models
- Determine emissions





# Emissions models capture changes in emissions rates during cycling

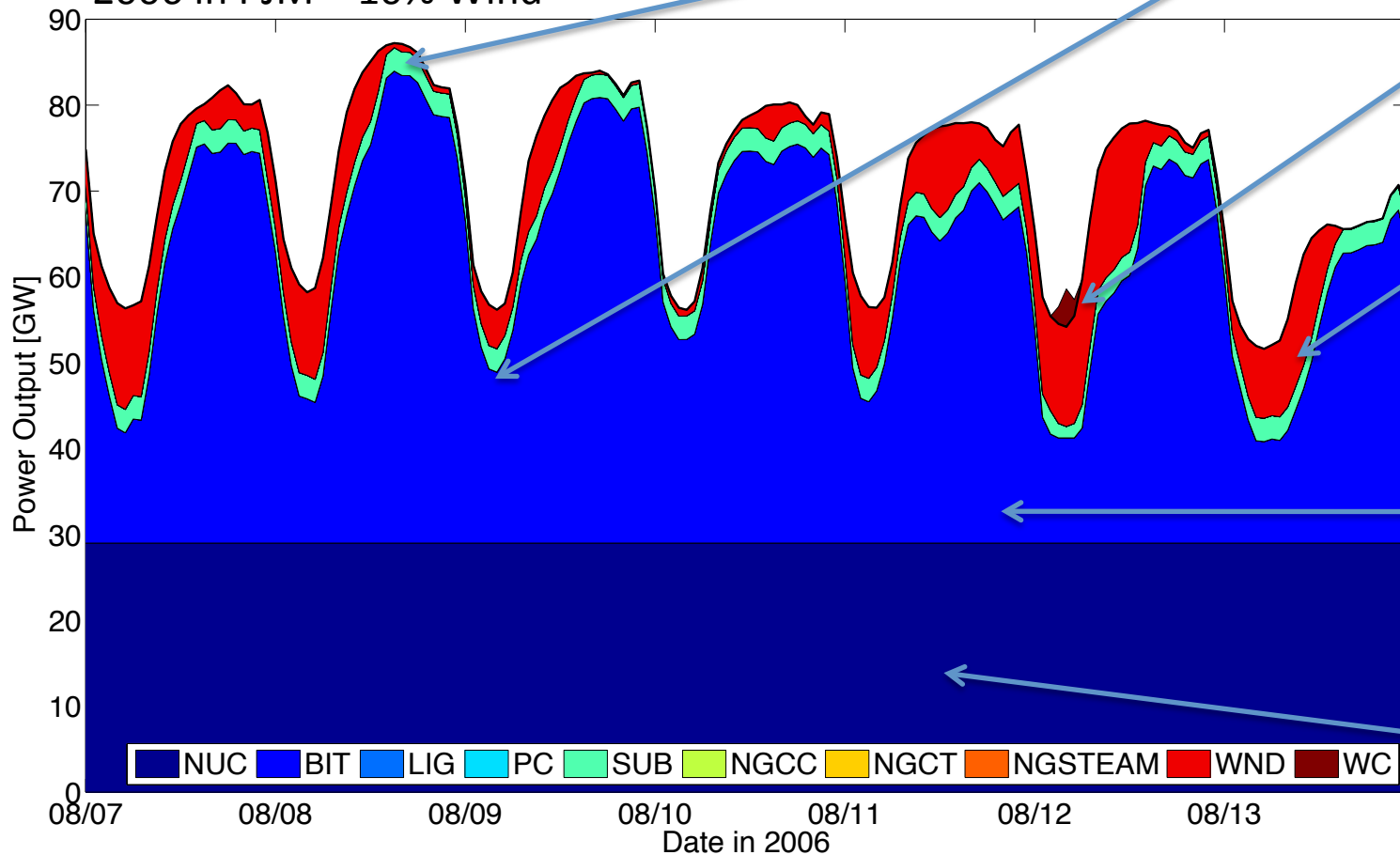
- Regressions models using CEMS data
- Emissions rates vary with power level and ramp-rate
- Capture emissions arising from cycling





# Sample Model Output at 10% Wind

Energy Use Plot for Aug.  
2006 in PJM – 10% Wind



Substantial coal  
cycling

Wind  
curtailment

Effective wind  
penetration  
7.3%

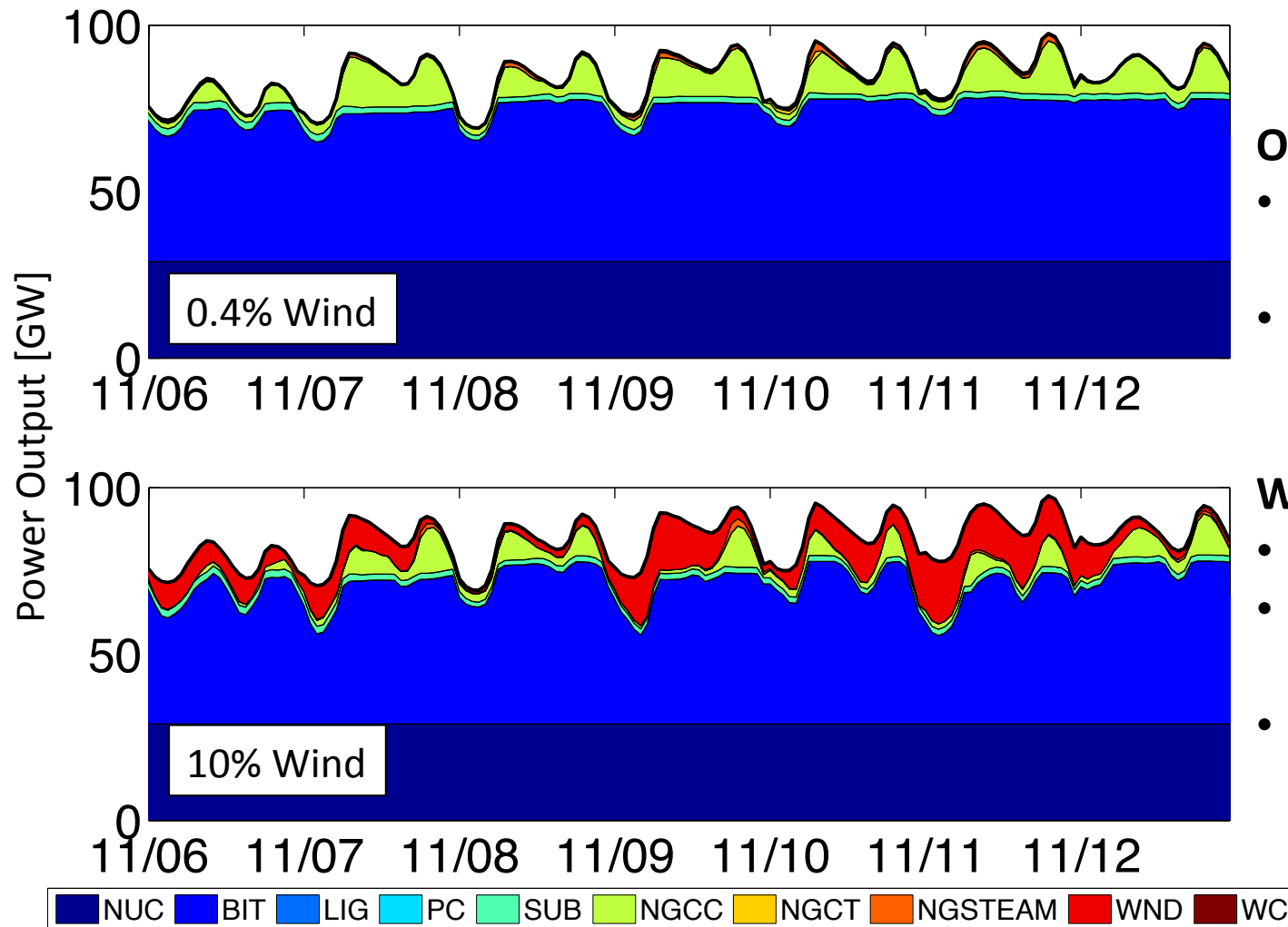
PJM uses a great  
deal of  
Bituminous coal

Nuclear is  
baseloaded





## Transition from 0.4% to 10% wind



### Observations

- Increase in Coal Cycling
- Wind offsets gas and coal

### Work is ongoing to:

- Refine UCDM
- Refine Emissions Model
- Develop Scenarios







Thank you for your attention

Questions?

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