



Hartford Steam Boiler

The Blackout Risk Model™ has been built upon the 150-year foundation of HSB's technical knowledge and leadership in specialty insurance related to the failure of critical infrastructure. HSB is part of Munich Re.

# Blackout Forecast Model for Hurricane Hazards – Wind and Surge

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AER is a Verisk Analytics business



# Overview

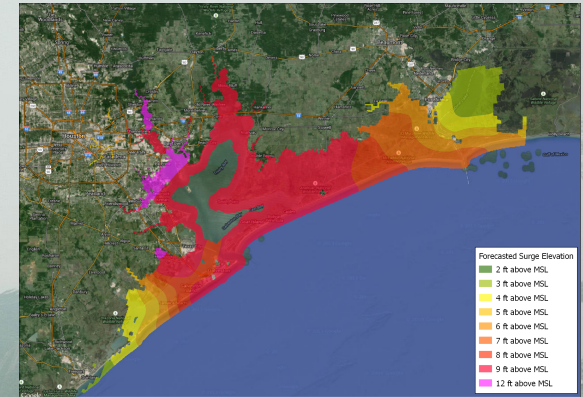
- Power outages are a major disruption caused by hurricanes, causing direct losses, slowing recovery, and shuttering businesses
- 8.5 million customers without power during Hurricane/Post-Tropical Cyclone Sandy (US Energy Information Administration)
- Blackouts caused by several perils in a hurricane: direct effect of wind on lines, falling trees/branches onto lines, and surge flooding of coastal substations

# Modeling Goals

- Real-time Forecasts
  - Immediate lead-up to storm
  - Planning, mitigation, loss estimation
- Stochastic Event Sets
  - Scope potential extreme losses
  - Quantify recurrence period of risk
  - Validation with historical claims data
- Quantifying Insured Losses
  - Spoilage of Contents (Food, Medical Items, etc.)
  - Business Interruption
  - Electronic Equipment Breakdown

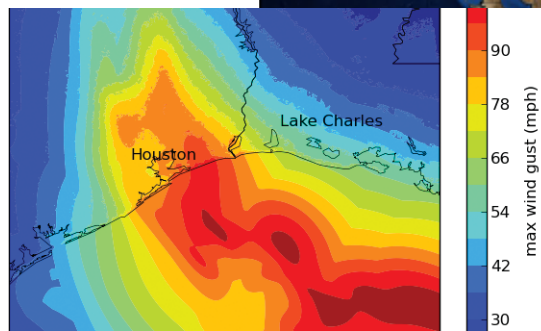
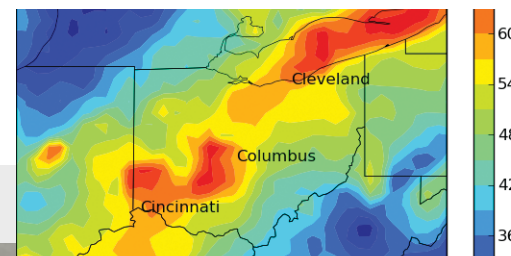
# Perils Causing Blackout

- **Wind**
  - Strength and duration
- **Storm Surge**
  - Flooding of low-lying infrastructure
- **Downed Trees/Limbs**
  - Regionally and locally varying effects

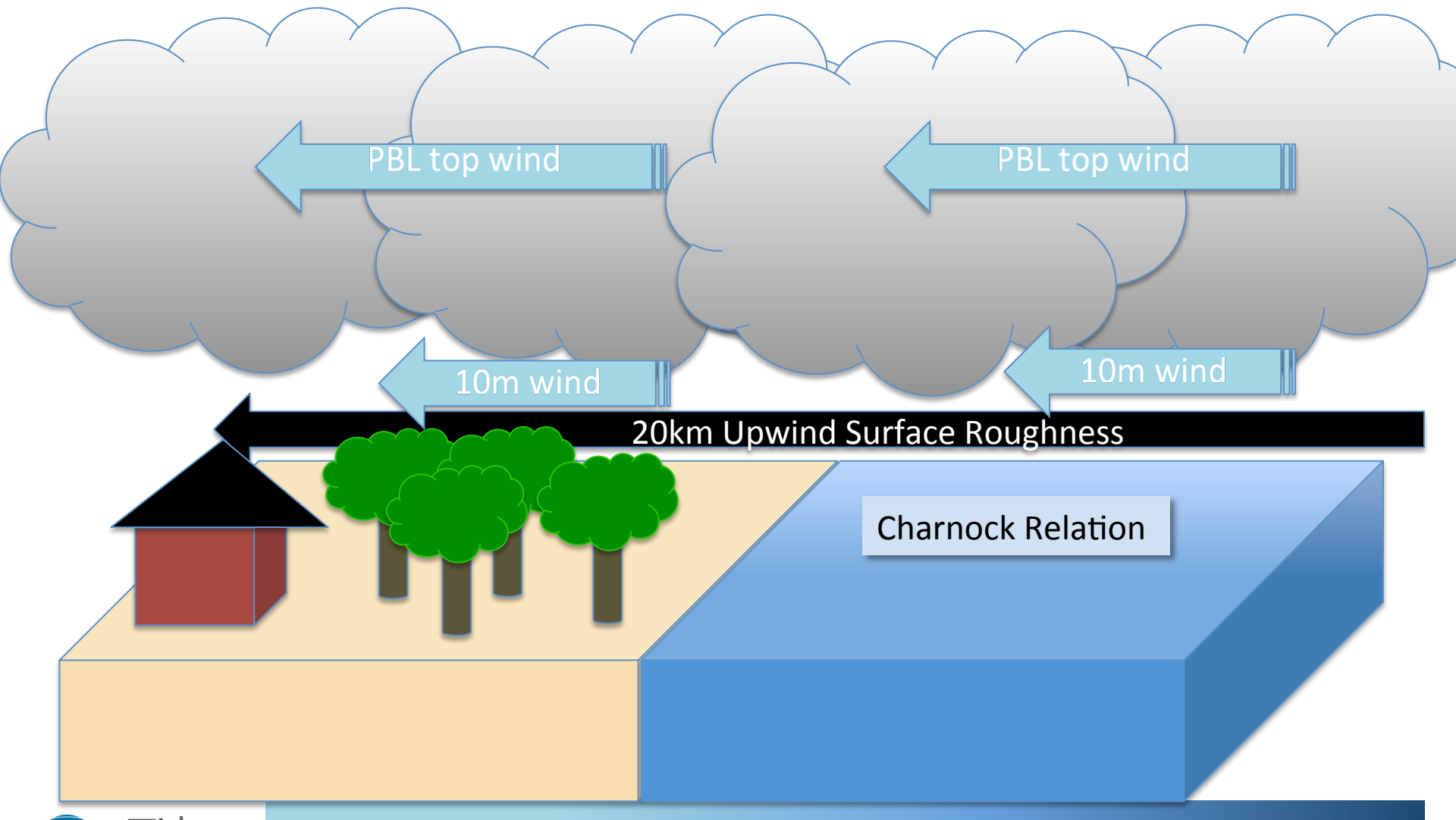


# Wind from Respond Hurricane

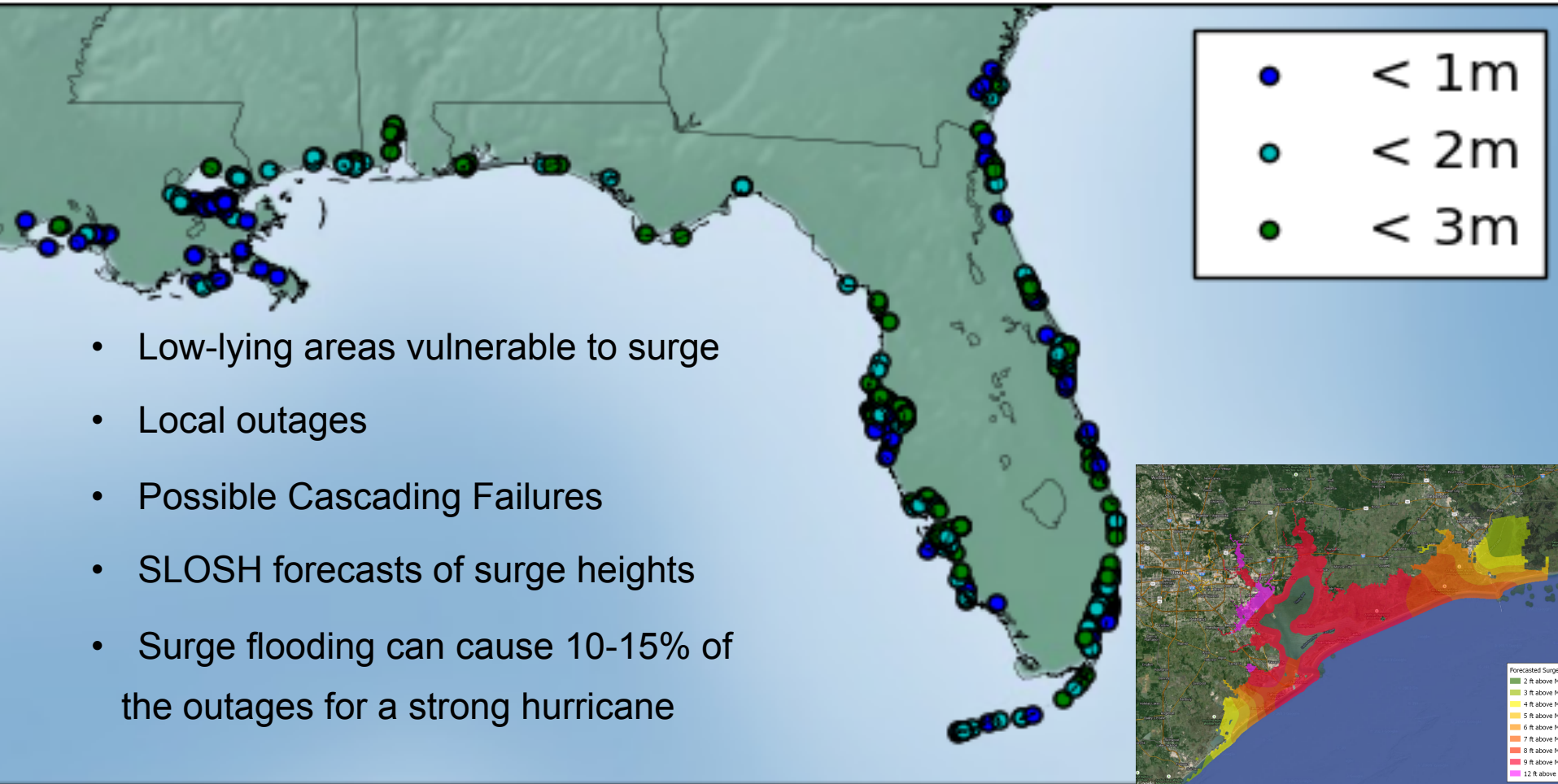
- 1km downscaled winds from HWRF
- Surface roughness at grid cell location and upwind
- Captures details of extratropical transition, unusual radius of maximum winds, hybrid storms due to full physical modeling



# Hurricane Wind Downscaling

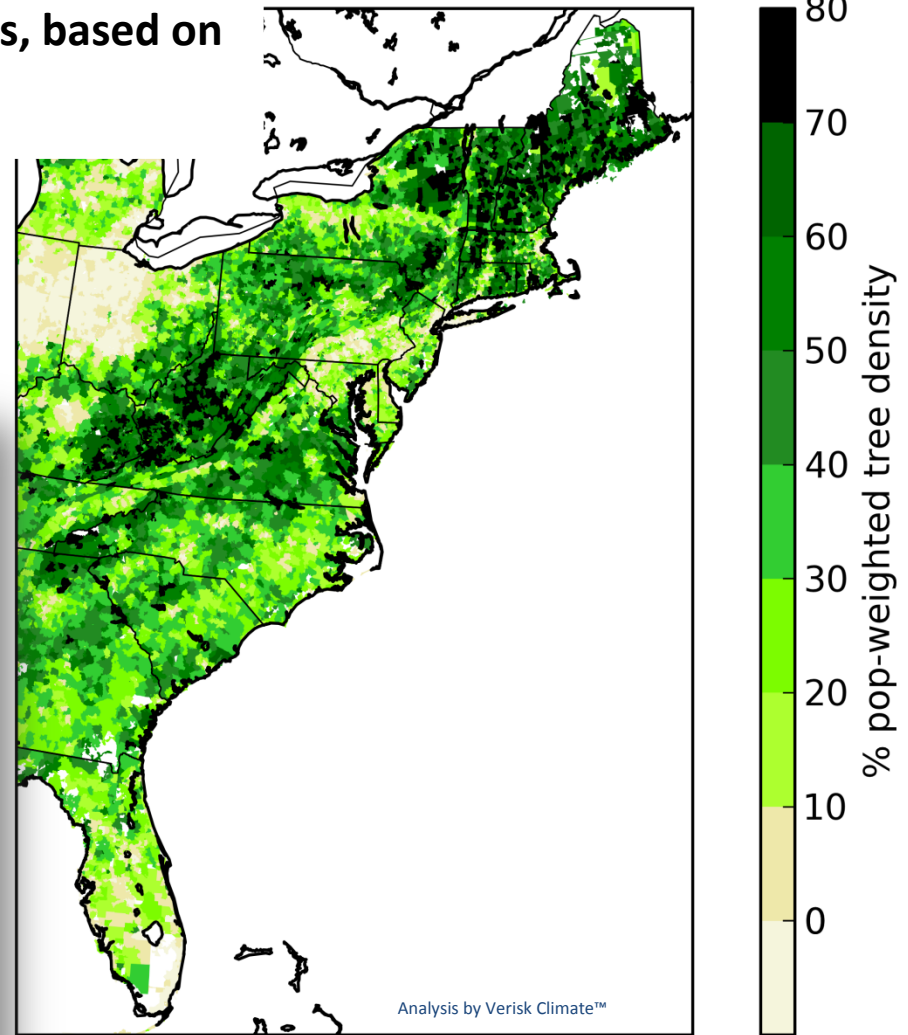
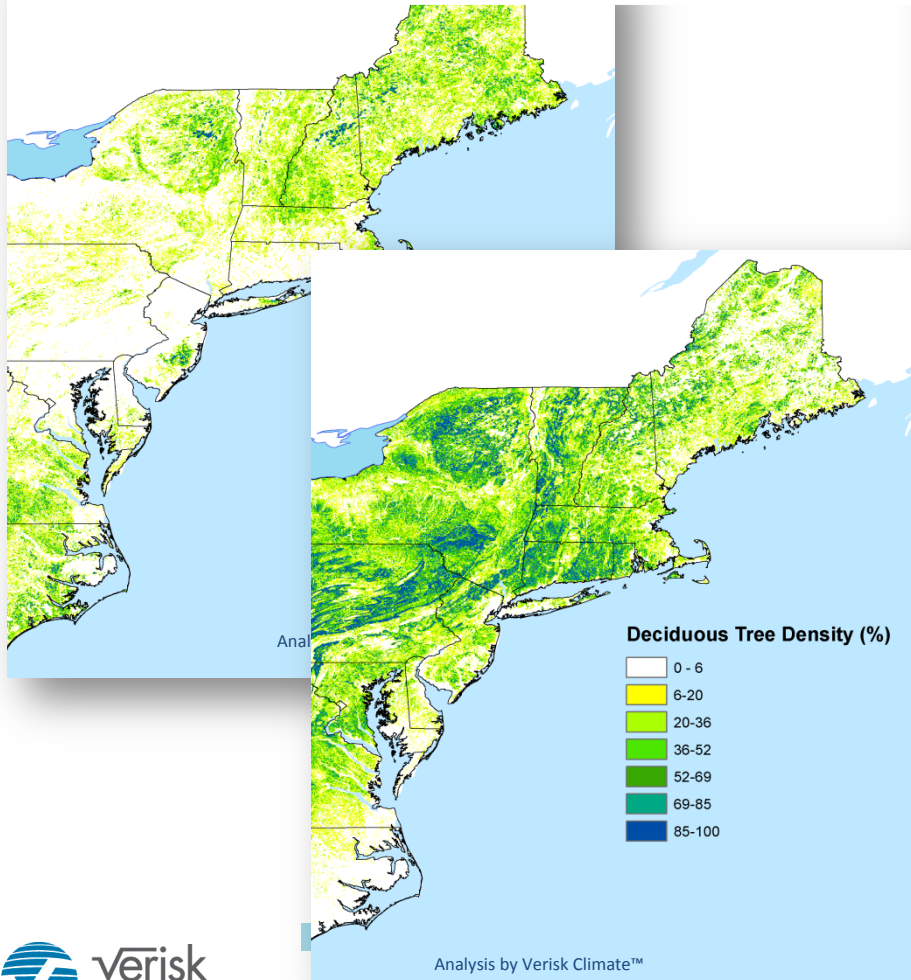


# Storm Surge Flooding of Electrical Infrastructure



# Tree Cover

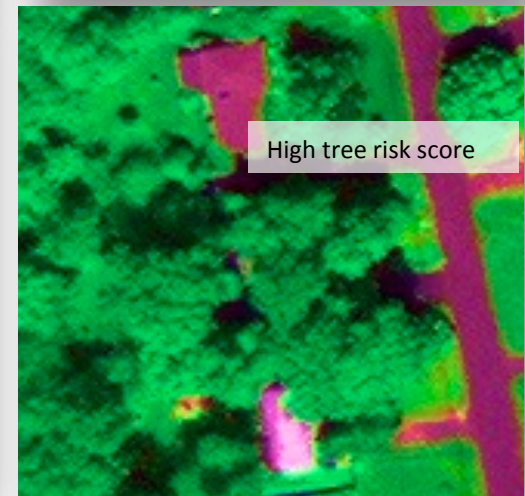
Analysis of the Location and Type of Trees, based on Assessment of Detailed Satellite Imagery



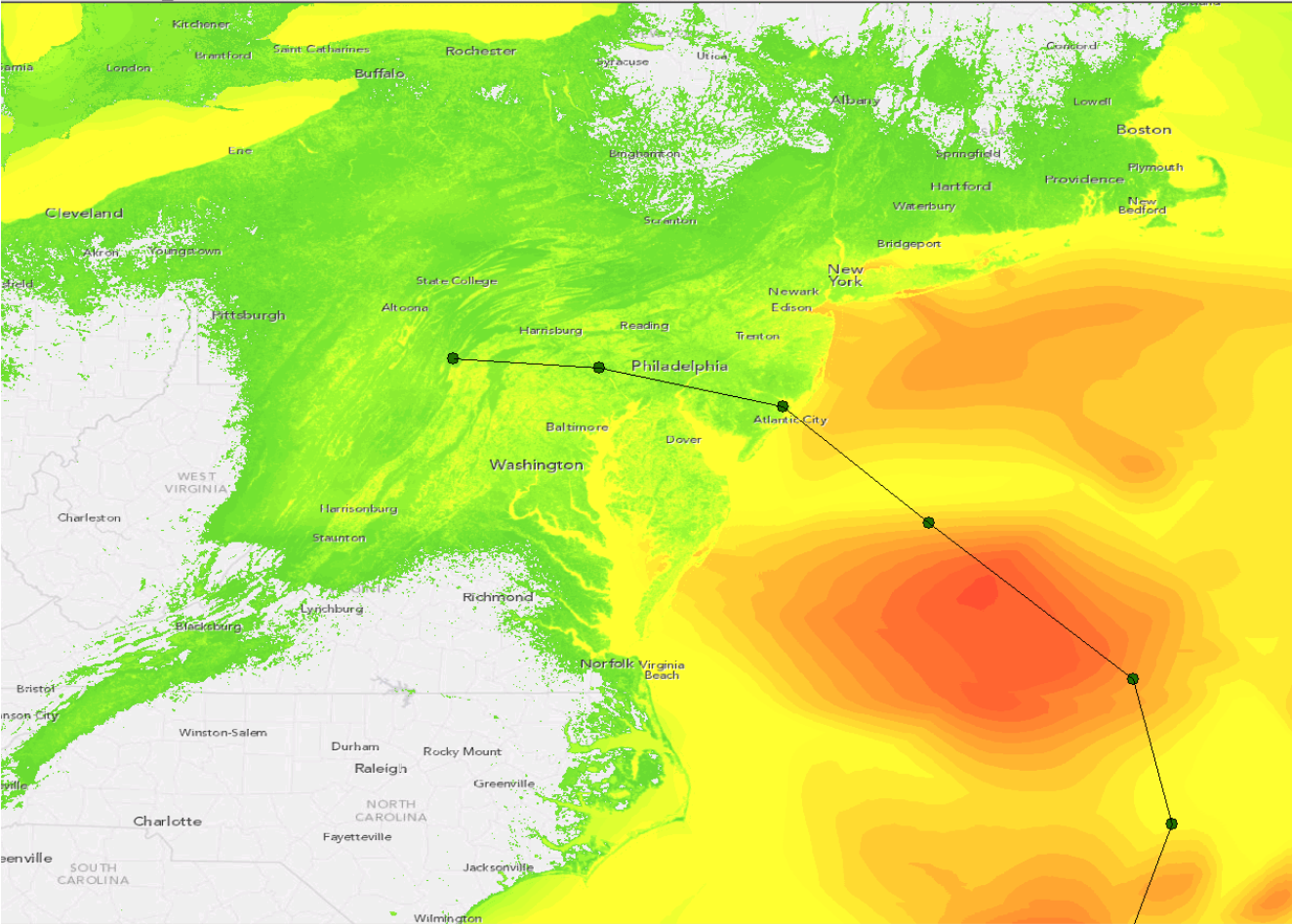


# Illustration of Parcel-Scale Tree Cover Analysis

*Based on analysis of multichannel visible and infrared imagery*



# Sandy Wind Swath



# Sandy Blackout

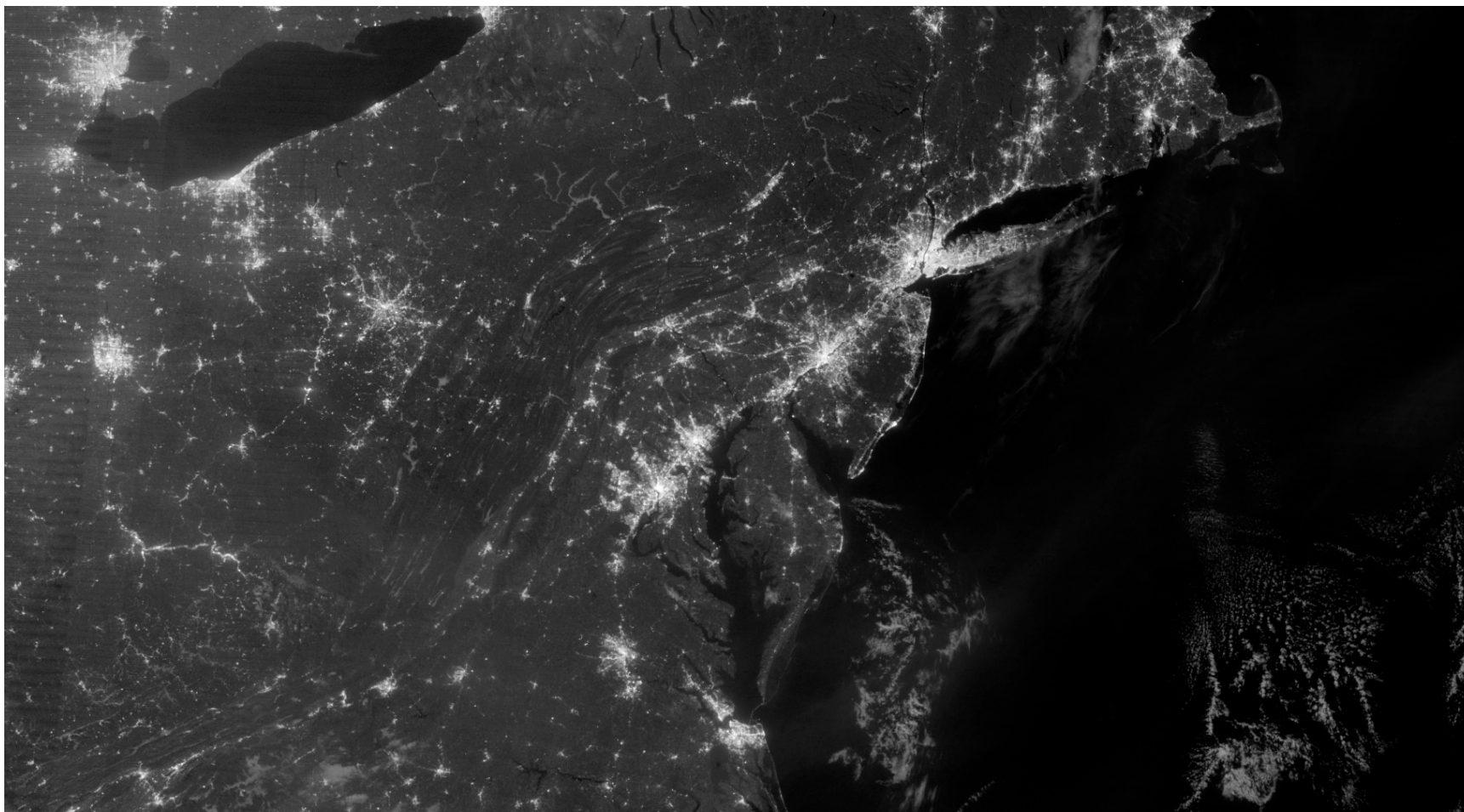


Image Credit: NASA Earth Observatory

# Sandy Blackout

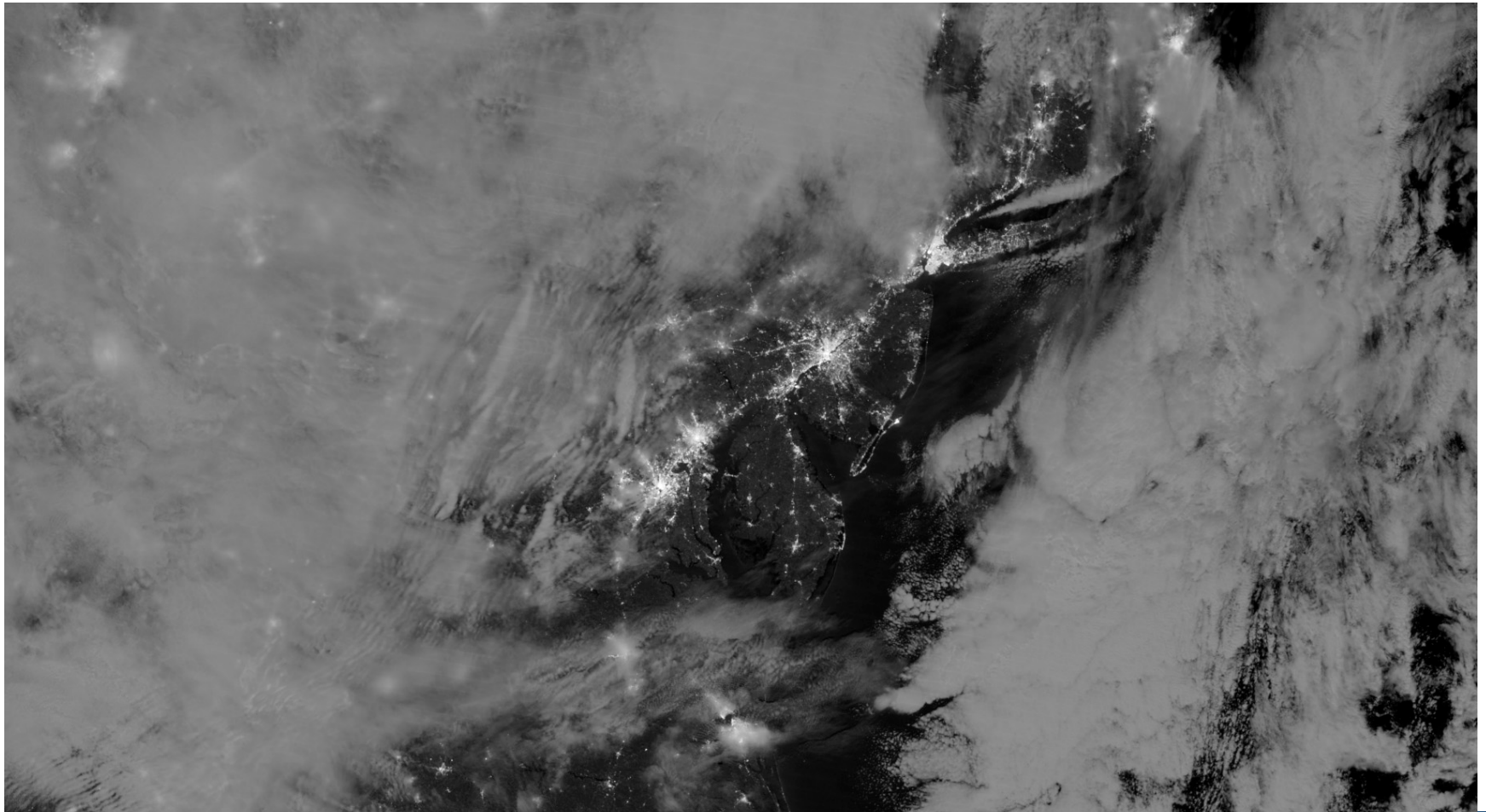
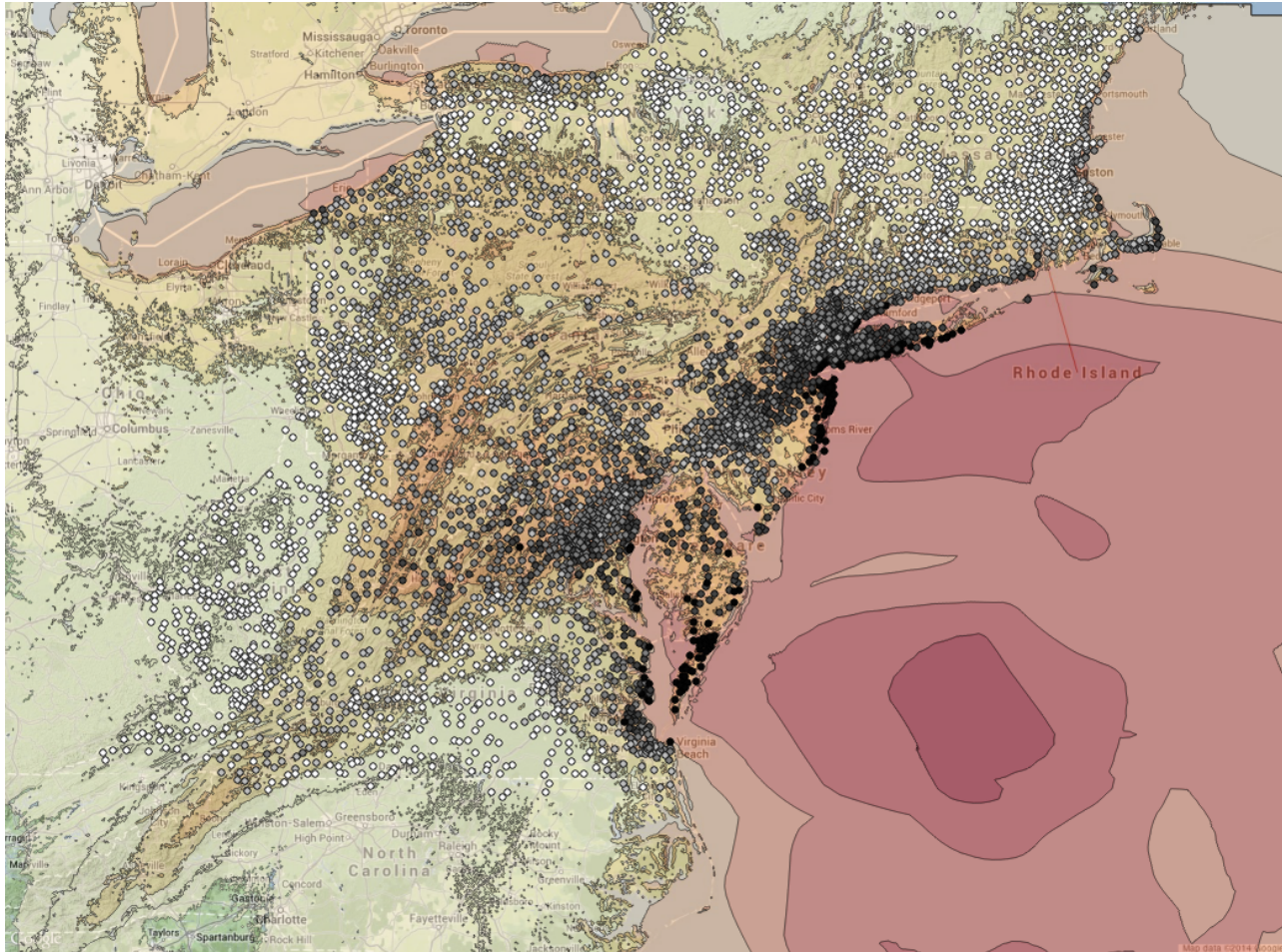


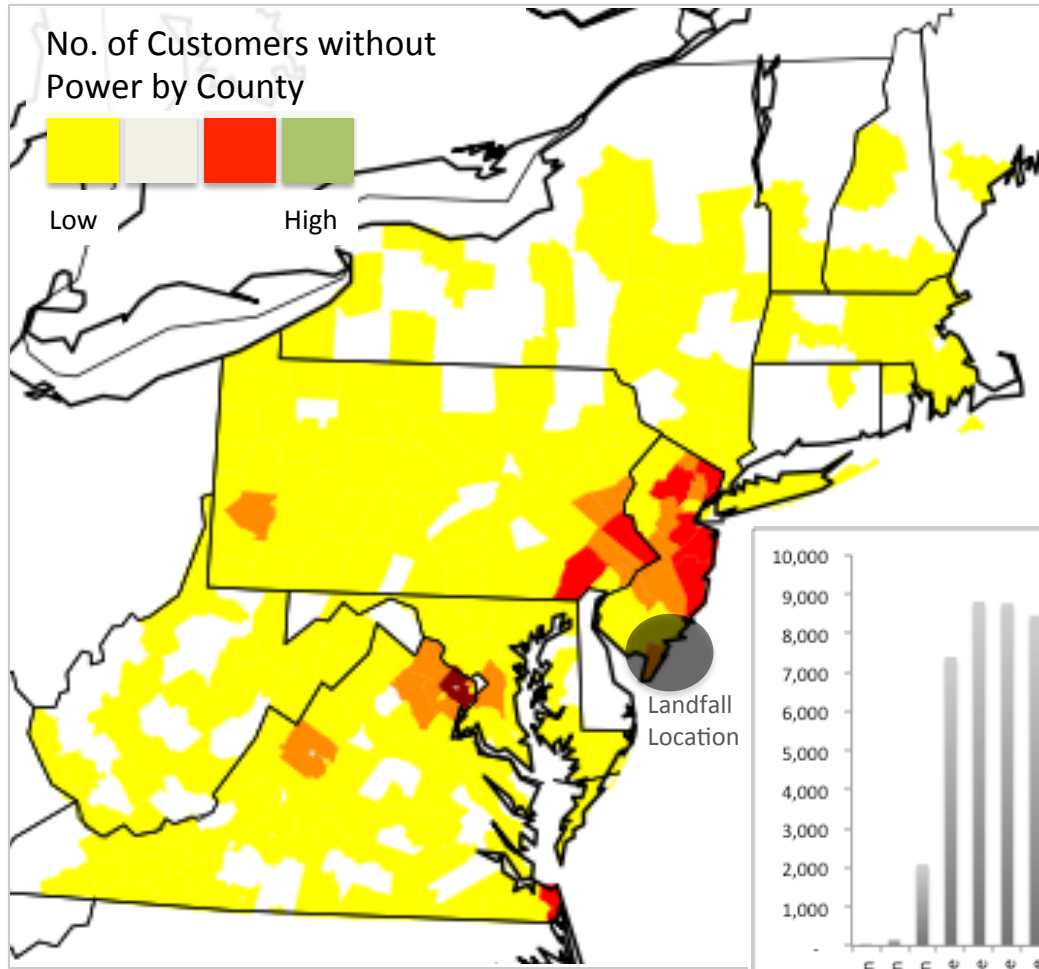
Image Credit: NASA Earth Observatory

# Peak outage by ZIP Code for Sandy



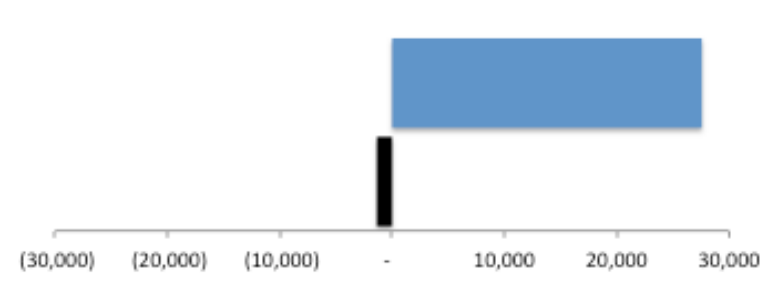
Verisk Climate Respond™ – Post Event Footprint

# Blackout Risk Model™ Simulated Power Outage from Superstorm Sandy Over a 9-Day Period

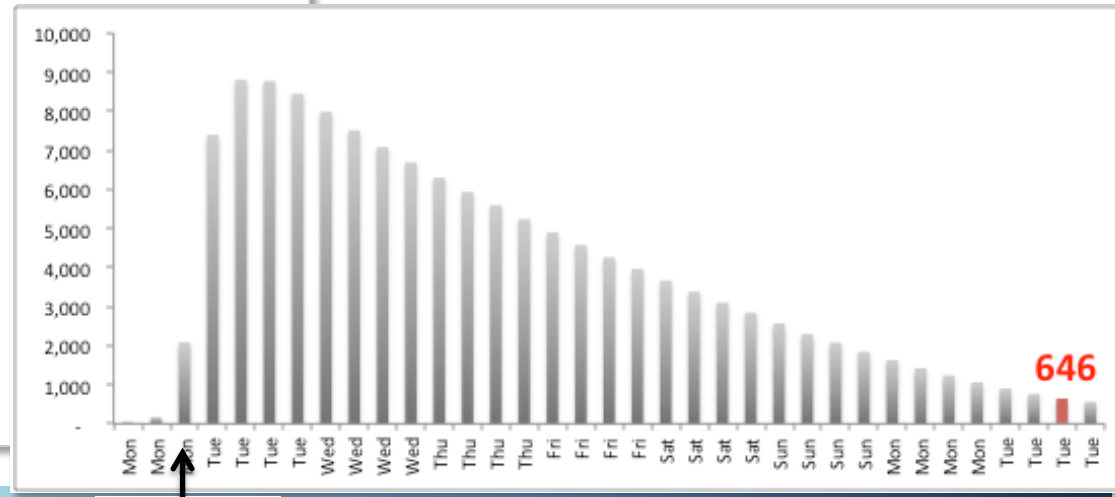


No. of Active Grid Failures

Cumulative No. of Repairs



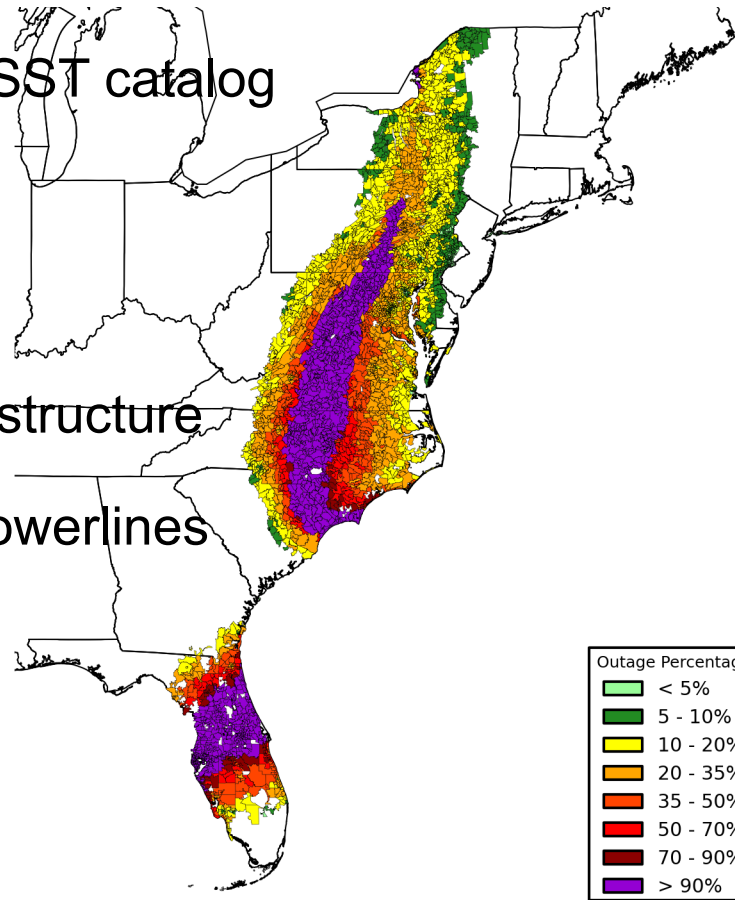
No. of Customers without Power (000s)



Landfall Time

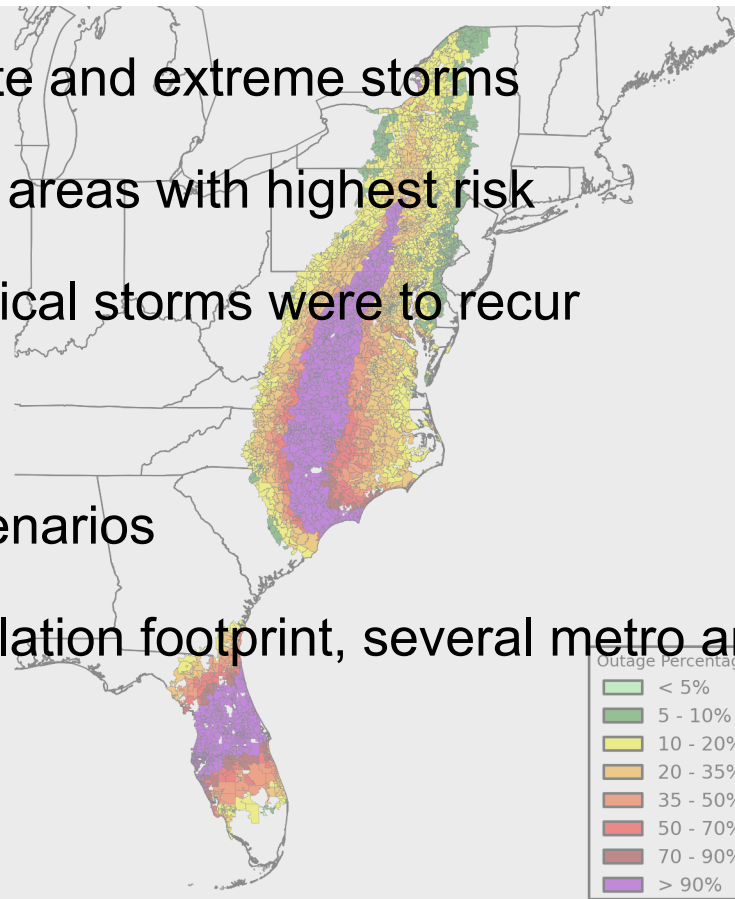
# Stochastic Storms

- Based on 100K storm warm SST catalog
- Parameterized wind profile
- Wind and surge hazard
- Surge flooding of power infrastructure
- Wind damage to trees and powerlines



# Stochastic Storms

- Recurrence curve of moderate and extreme storms
- Identification of geographical areas with highest risk
- Estimates of outages if historical storms were to recur
  - 1938, Camille, Donna
- Exploration of worst-case scenarios
  - Strong landfall, large population footprint, several metro areas





# Questions

## Contact Info

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