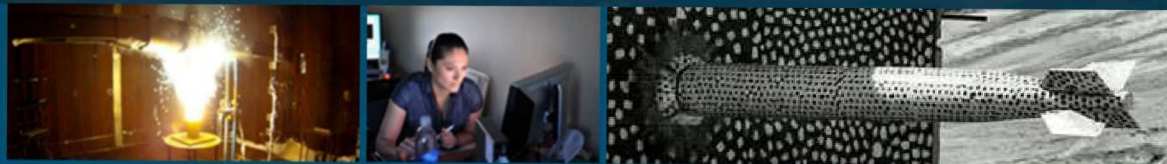




# Multi-site assessment of extreme weather impacts on PV plant performance and reliability



*PRESENTED BY*

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PV Reliability Workshop

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SAND XXX



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- 3 PV plants can be exposed to disruptions due to weather events such as hurricanes and hail storms



(BMR Energy 2017)



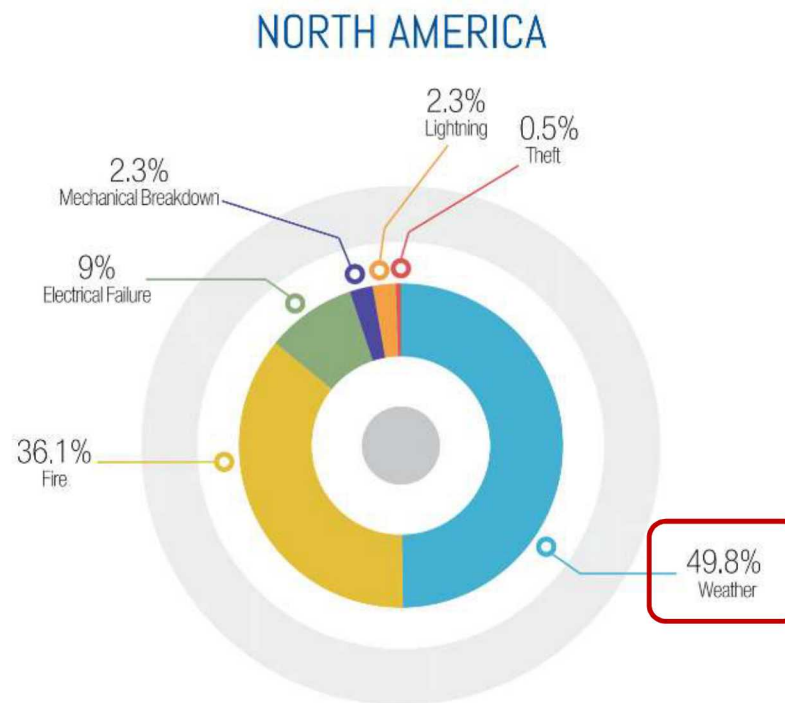
SBS News (2018)



# There is an increasing prevalence of weather impacts to PV



## ROOT CAUSES OF SOLAR PV CLAIMS



(GCube 2016)

## Study Objectives



- Analysis of site-level performance and weather data to identify trends
- Identification of performance variabilities across sites, climates, and event types

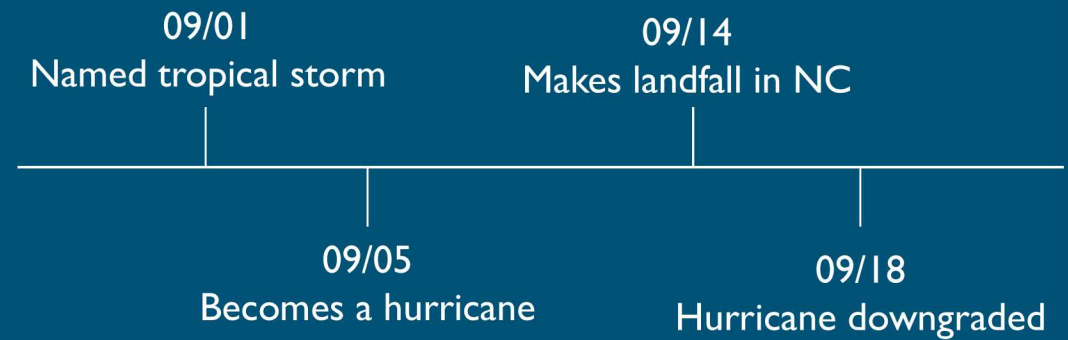
## 6 Multiple tropical storms affected the Carolinas in Fall 2018



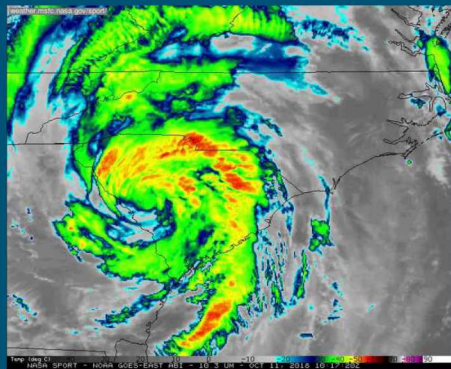
### ➤ Hurricane Florence



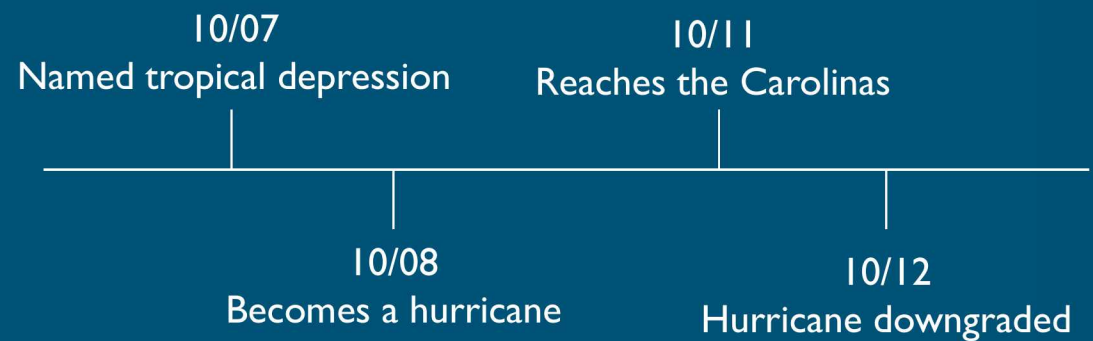
NOAA (2018)



### ➤ Hurricane Michael



NASA (2018)



# Multiple datasets are combined to link performance, weather and O&M records



## Industry Data

### Site Characteristics

- DC Size
- Climate zone
- Latitude
- Longitude
- Asset clipping limit

### Measured data

- Date
- Irradiance
- Energy delivered
- Output power
- Expected energy

### O&M Logs

- Failure details
- Event duration

## Site Metrics

### Yield Loss

- Final system yield
- Reference yield

### Performance metrics

- Performance ratio
- Energy performance index

## Climate Data

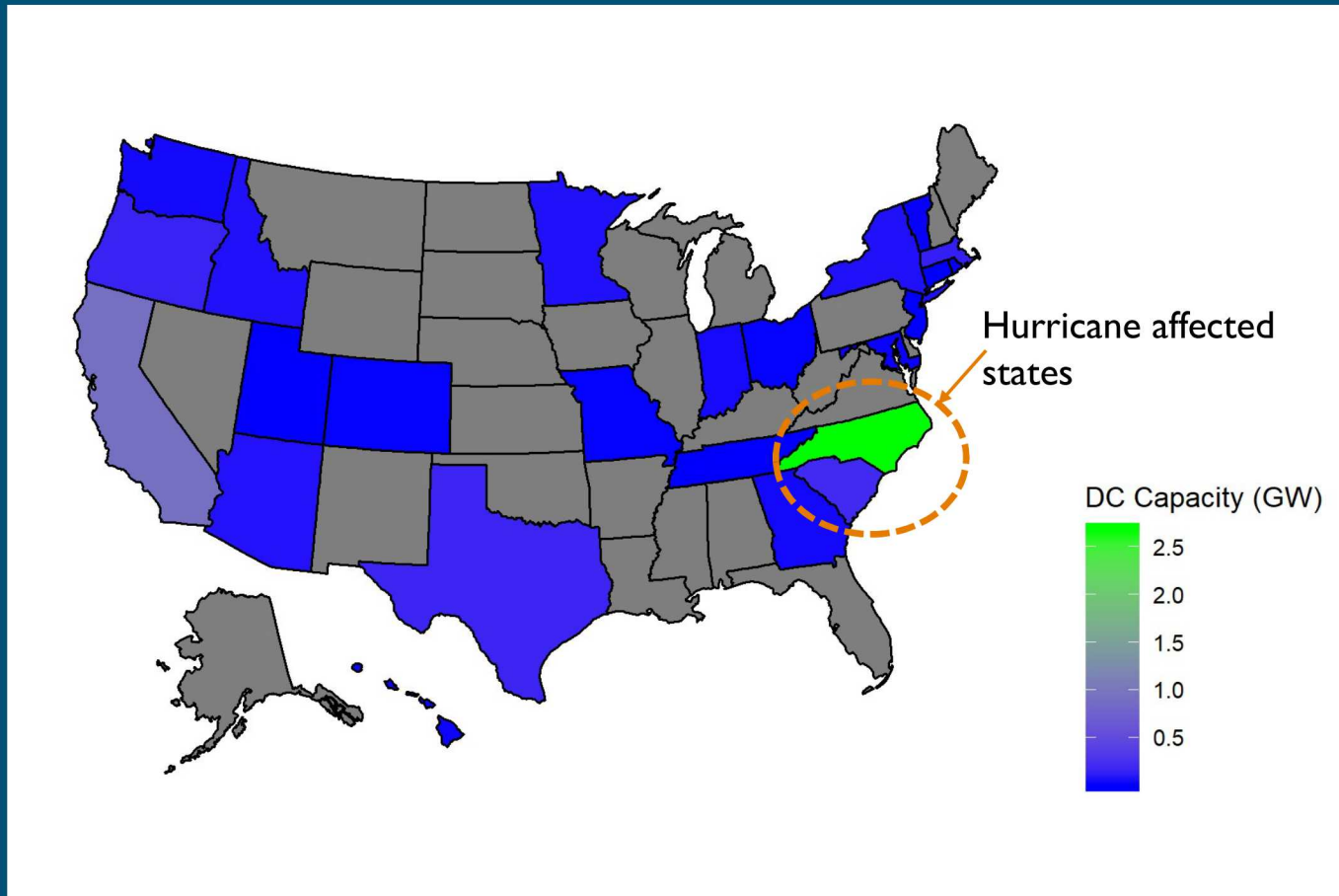
### GHCN Weather Stations

- Precipitation
- Snow

### PRISM

- Maximum temperature
- Minimum temperature

# Performance data in the Carolinas can be paired with PVROM data for the period 2018-2019

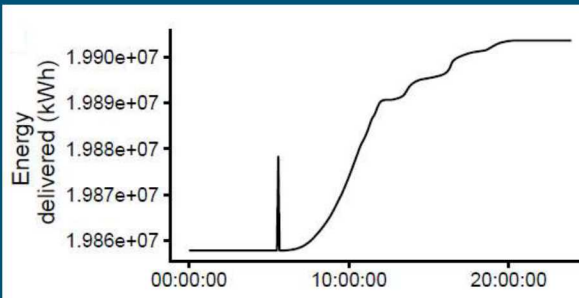
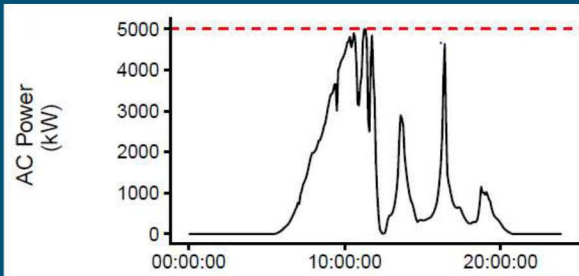
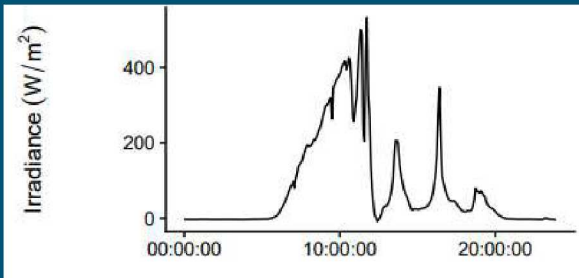




## 9 Data processing of site-level raw data

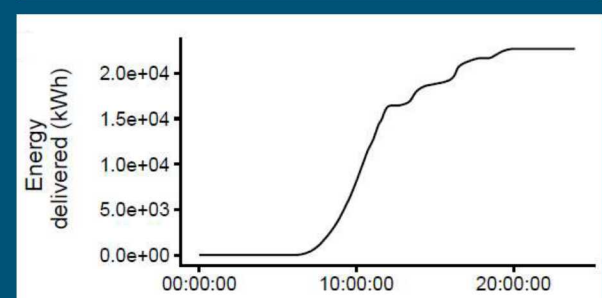
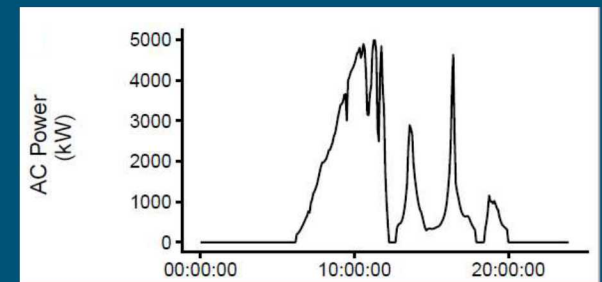
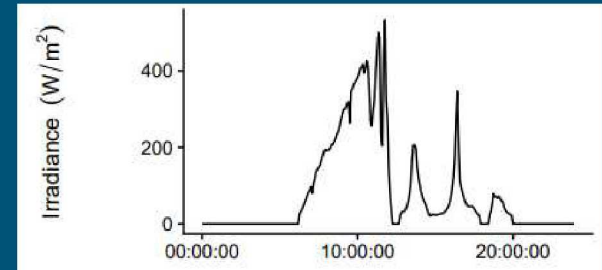


Raw Data



Removed negative values

Clean Data



Entries with negative irradiance have AC power = 0



Removed errant spikes in cumulative energy delivered to grid

## Multiple site metrics are evaluated at the daily time scale



### Yield losses

- Final system yield

$$Y_f = \frac{E_{out}}{P_0}$$

- Reference yield

$$Y_r = \frac{H_i}{G_{i,ref}}$$

### Performance metrics

- Performance ratio

$$PR = \frac{Y_f}{Y_r}$$

- Energy performance index

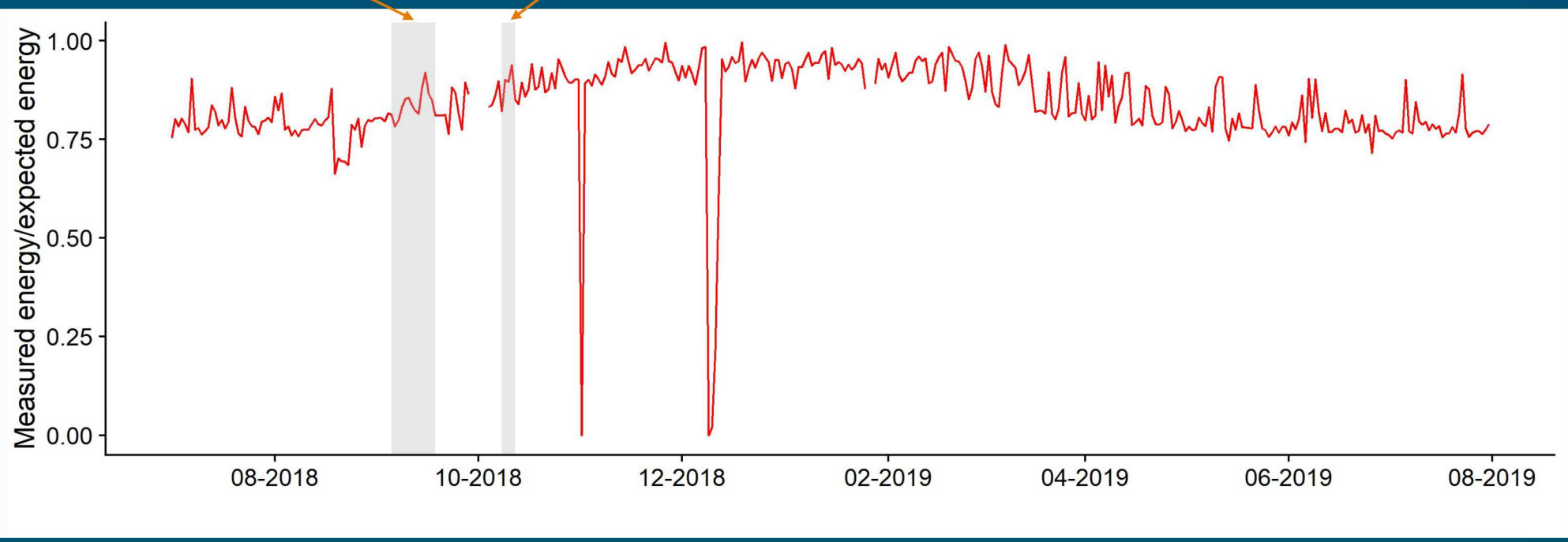
$$EPI = \frac{\text{Measured energy}}{\text{Expected energy}}$$

# Sample daily performance for a North Carolina site with the hurricanes indicated

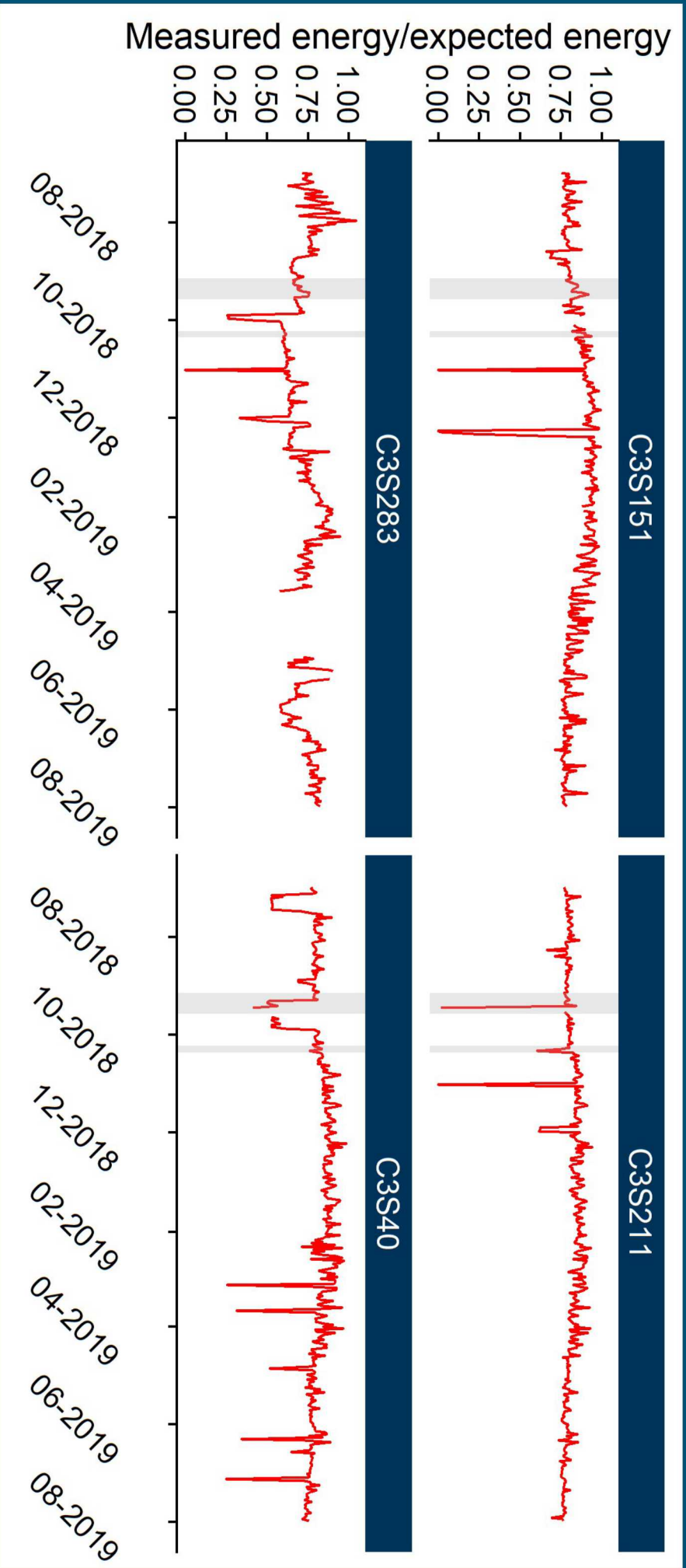


Hurricane Florence

Hurricane Michael



## 12 Site-level differences in performance response to hurricanes



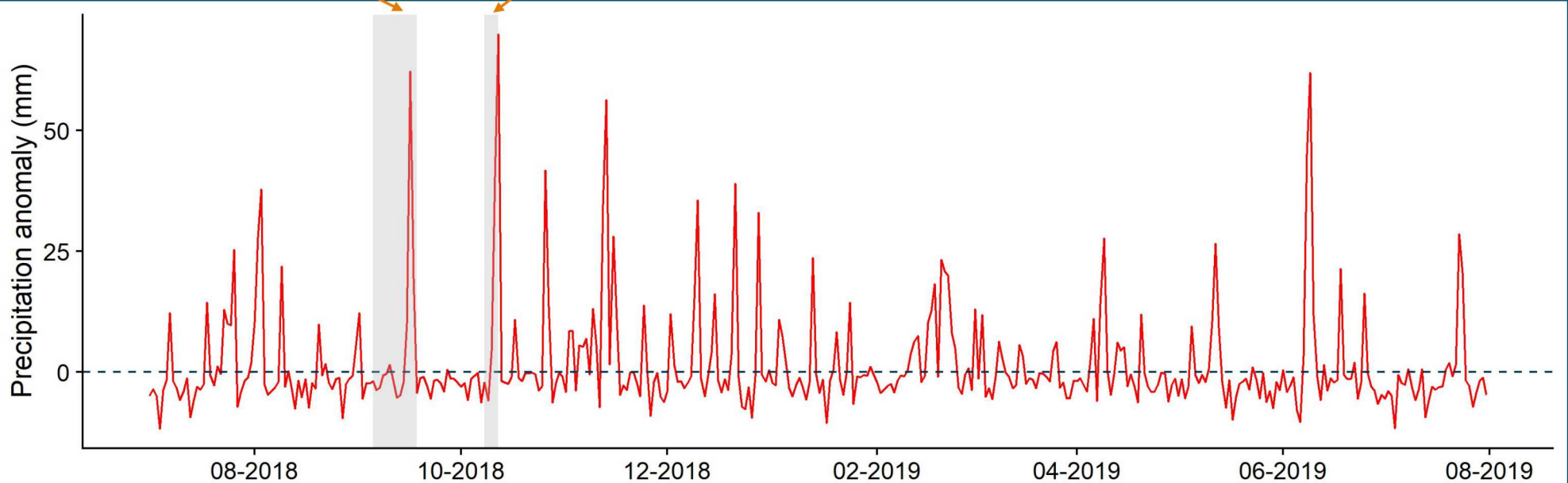


## Precipitation anomalies developed by comparing daily precipitation data to its 30-year historical mean

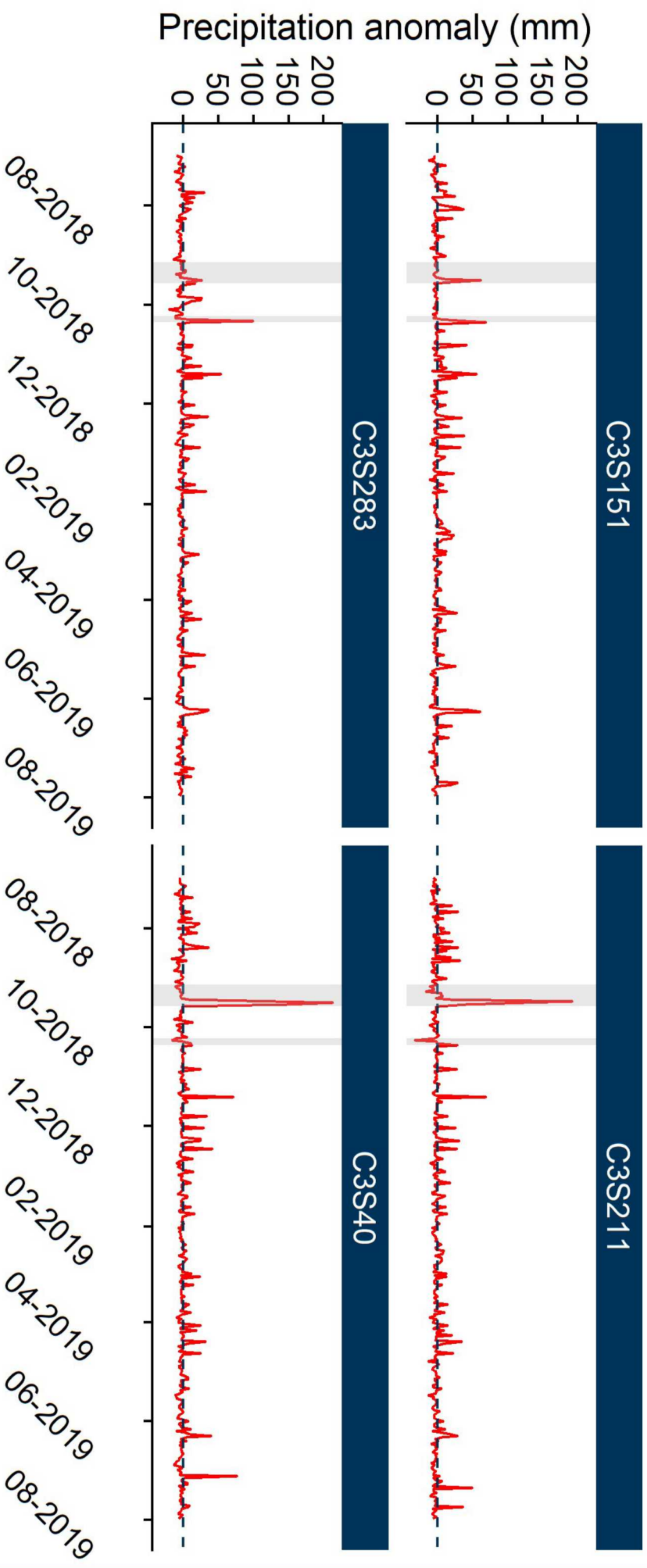


Hurricane Florence

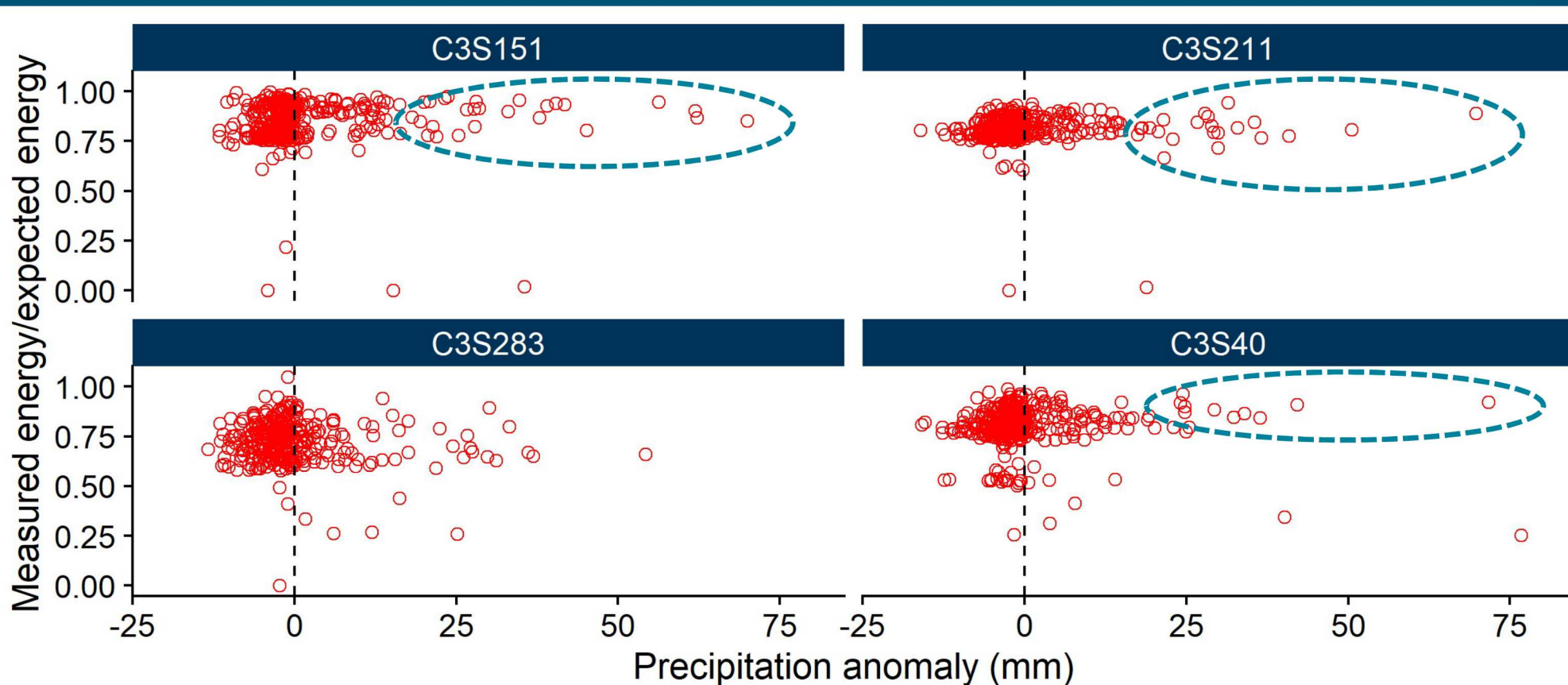
Hurricane Michael



## Site-level differences in exposure to precipitation anomalies during hurricane events



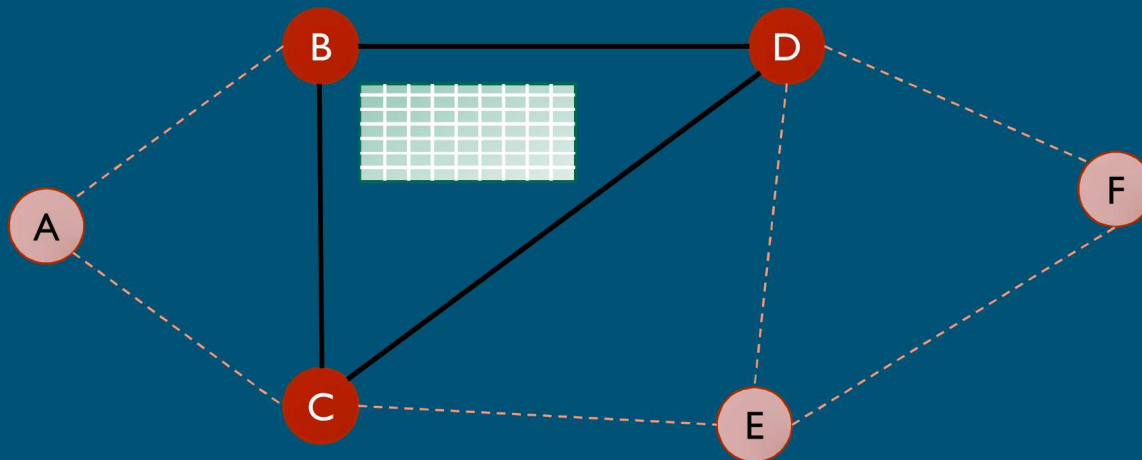
# Multi-site comparison of precipitation anomalies with daily site performance suggest presence of other confounding factors



## Ongoing work



- Continue analysis of performance data for remainder of sites
- Integrate remaining O&M records with weather and performance data
- Refine processing of site-specific climate data







BMR Energy (2017). St. Croix damage [Digital image]. Retrieved from <https://www.solarreviews.com/news/branson-bmr-energy-rebuild-hurricane-damaged-solar-farm-081018/>

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NASA (2018). Tropical Storm Michael moves into North Carolina [Digital image]. Retrieved from <https://www.flickr.com/photos/gsfcr/43438210310>

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Thank you for your time!

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