

# CHARACTERIZATION OF SPATIAL VARIATION IN HURRICANE SURGE

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JEN IRISH, DON RESIO, TAYLOR ASHER, YI LIU

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## OUTLINE

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- Motivation & background
- Study area & storm simulations
- Spatial decomposition
- Surge estimation with reduced storm sets
- Conclusions

### HURRICANE IRMA (2017) NAPLES, FL

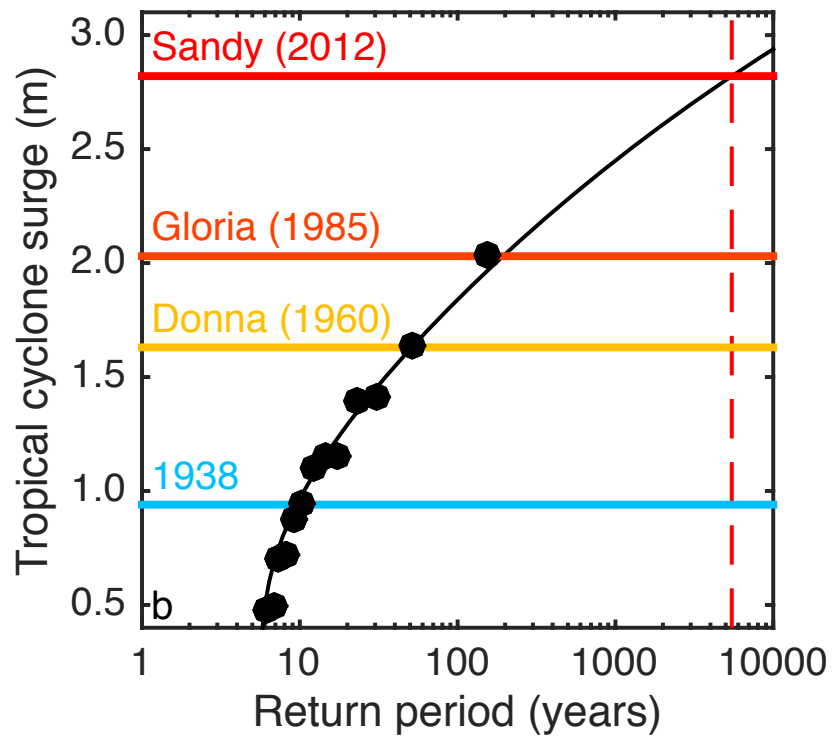


## Characterization of Spatial Variation in Hurricane Surge

# MOTIVATION & BACKGROUND: PROBABILISTIC SURGE HAZARD ASSESSMENT

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### HISTORICAL STORM METHOD

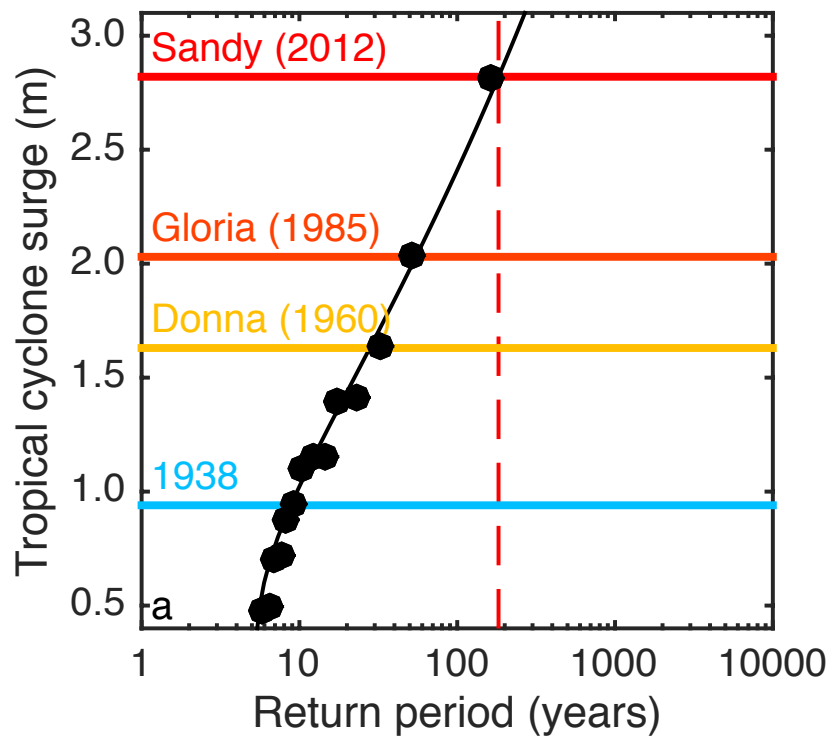


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### HISTORICAL STORM METHOD



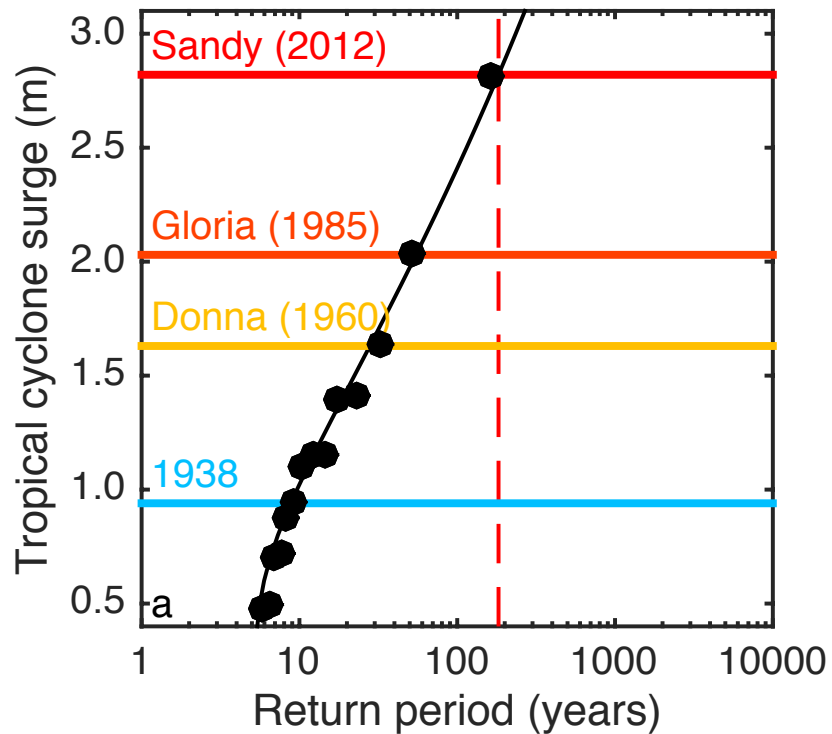
**100-yr surge increases 33%**



# Characterization of Spatial Variation in Hurricane Surge

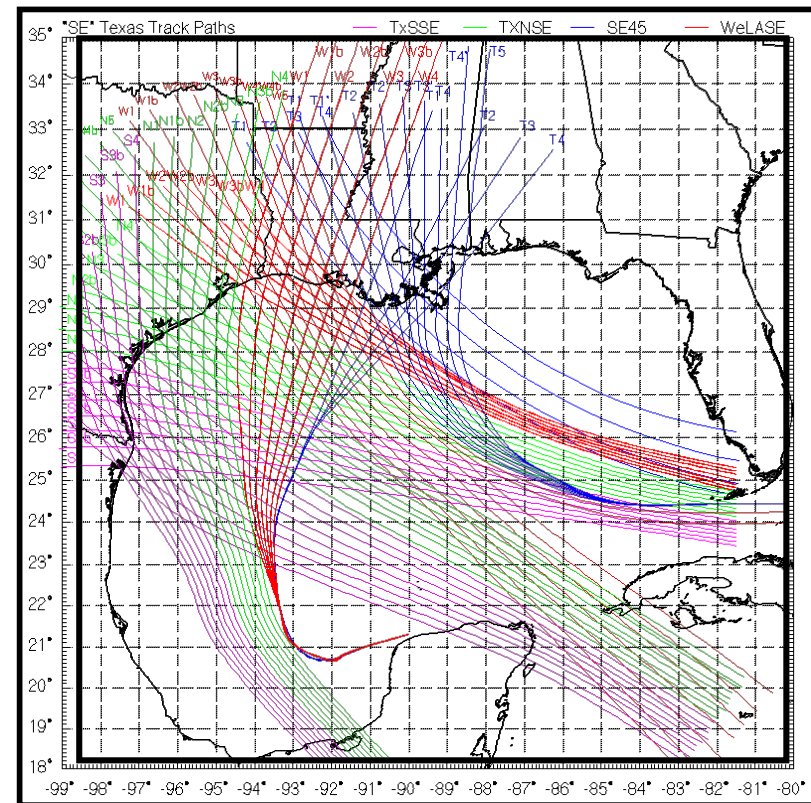
## MOTIVATION & BACKGROUND: PROBABILISTIC SURGE HAZARD ASSESSMENT

### HISTORICAL STORM METHOD



**100-yr surge increases 33%**

### JOINT PROBABILITY METHOD (JPM)



## MOTIVATION & BACKGROUND: JPM WITH OPTIMAL SAMPLING (JPM-OS)

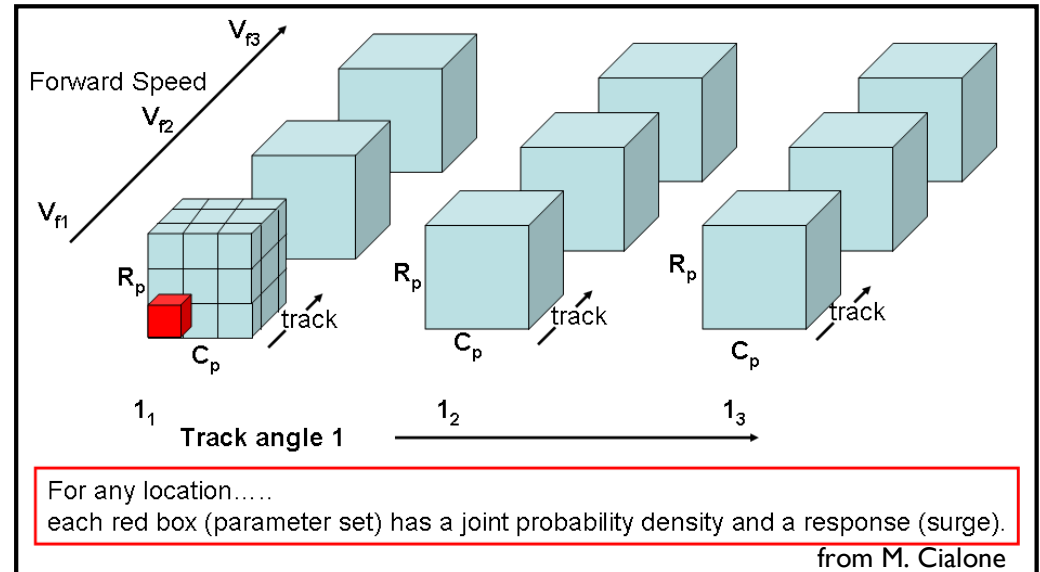
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### BAYESIAN QUADRATURE

- Assigns probability masses to discrete storm simulations

### SURGE RESPONSE FUNCTIONS

- Physics-based functions developed from discrete storm simulations
- Probability density assigned over the continuum of storm possibilities



# Characterization of Spatial Variation in Hurricane Surge

## MOTIVATION & BACKGROUND: JPM-OS

### CURRENT PRACTICE: SURGE RESPONSE FUNCTIONS

$$\eta' = \frac{\rho g \eta}{\Delta p}$$

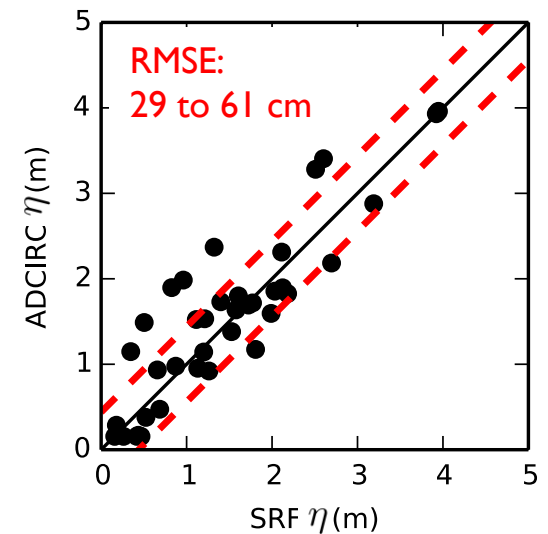
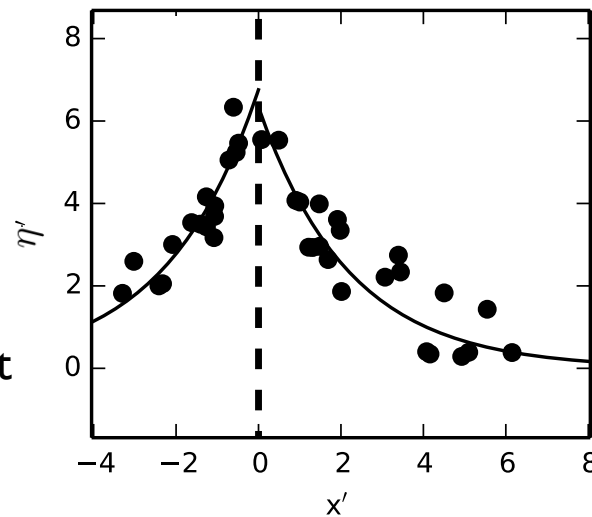
$$x' = \frac{x_{loc} - x}{R} - \lambda$$

$\eta$  is peak surge

$\Delta p$  is central pressure deficit

$x$  is landfall location

$R$  is storm radius

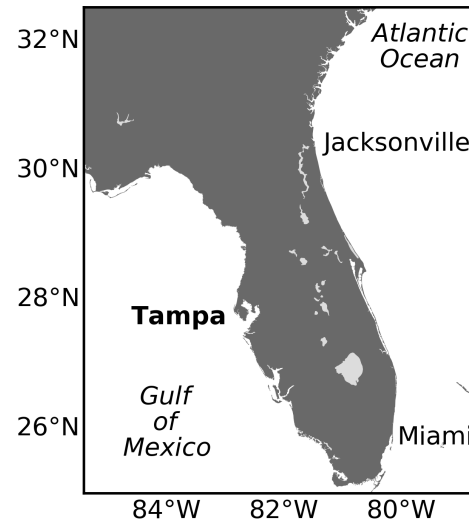


- SRFs at discrete geographic locations
- **Need approach for describing spatial variation**

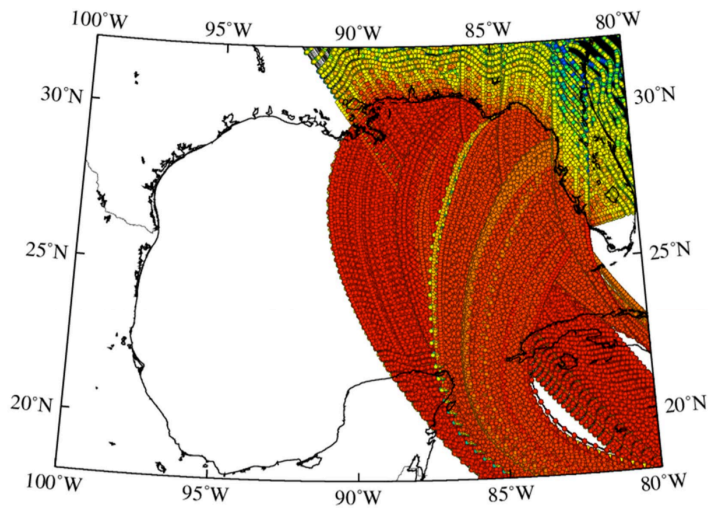
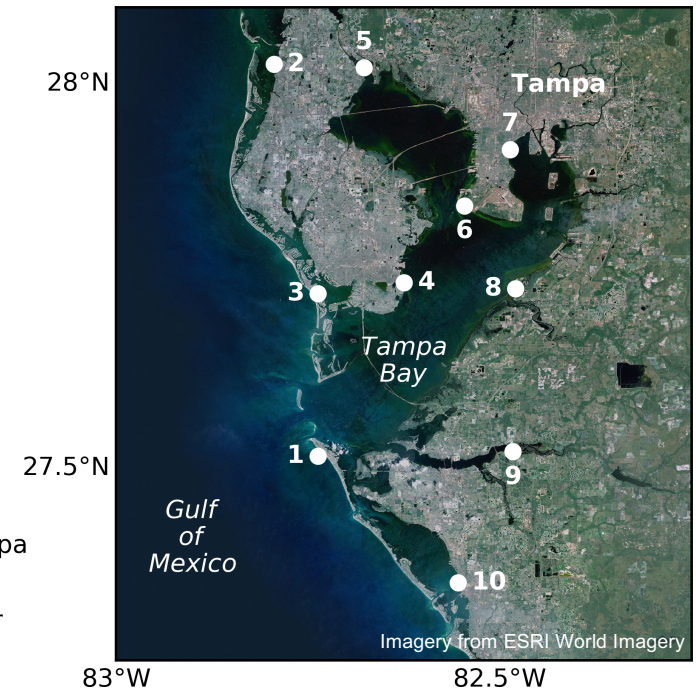
# Characterization of Spatial Variation in Hurricane Surge

## STUDY AREA & STORM SIMULATIONS

- FEMA's West Florida study
- ADCIRC coarse mesh
- 19406 storms
- 55 locations



- |                   |                |
|-------------------|----------------|
| 1: Anna Maria     | 6: South Tampa |
| 2: Clearwater     | 7: Tampa       |
| 3: St. Pete Beach | 8: Ruskin      |
| 4: St. Petersburg | 9: Fort Hamer  |
| 5: Oldsmar        | 10: Sarasota   |

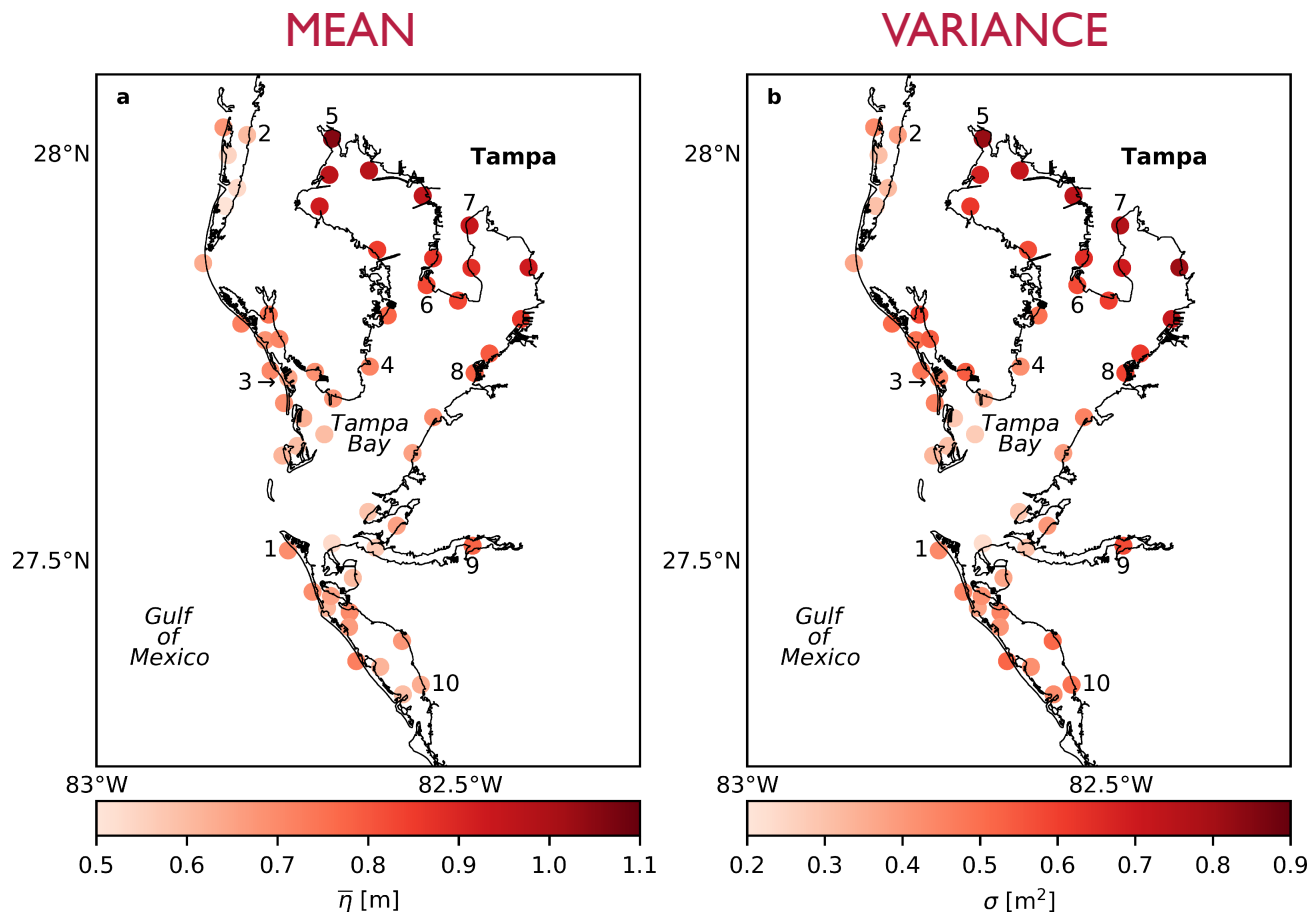


From RAMPP 2016



# Characterization of Spatial Variation in Hurricane Surge

## SPATIAL DECOMPOSITION: EMPIRICAL ORTHOGONAL FUNCTIONS (EOF)



$$\eta_{ij} = \sum_k^K e_{ik} w_{jk} + \bar{\eta}_i$$

$$\epsilon^2 = \epsilon_{sim}^2 + \epsilon_{EOF}^2$$

$\eta$  is peak surge

$e$  is eigenfunction component

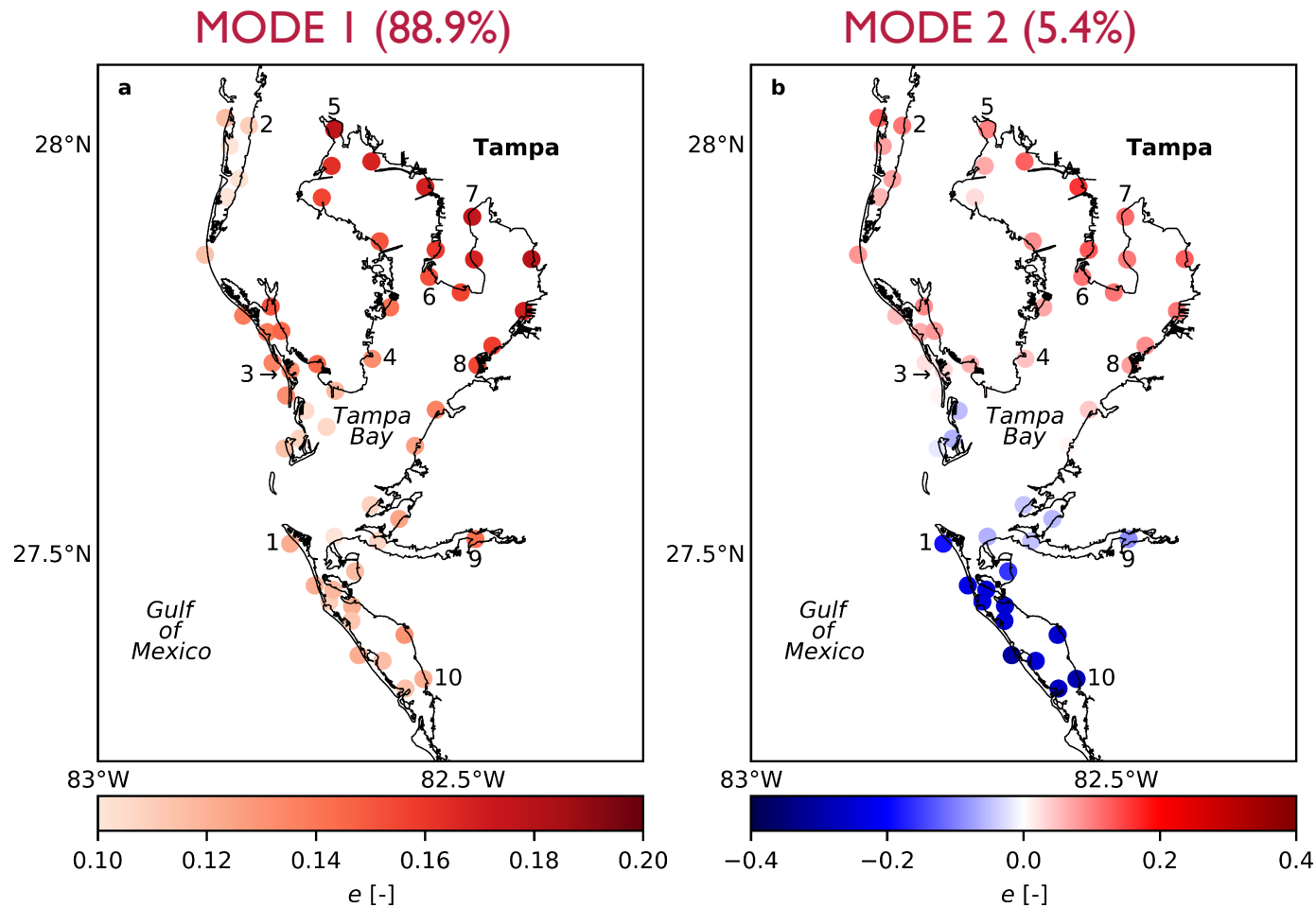
$w$  is eigenfunction weight

$\bar{\eta}$  is mean peak surge

$\epsilon$  is model uncertainty

# Characterization of Spatial Variation in Hurricane Surge

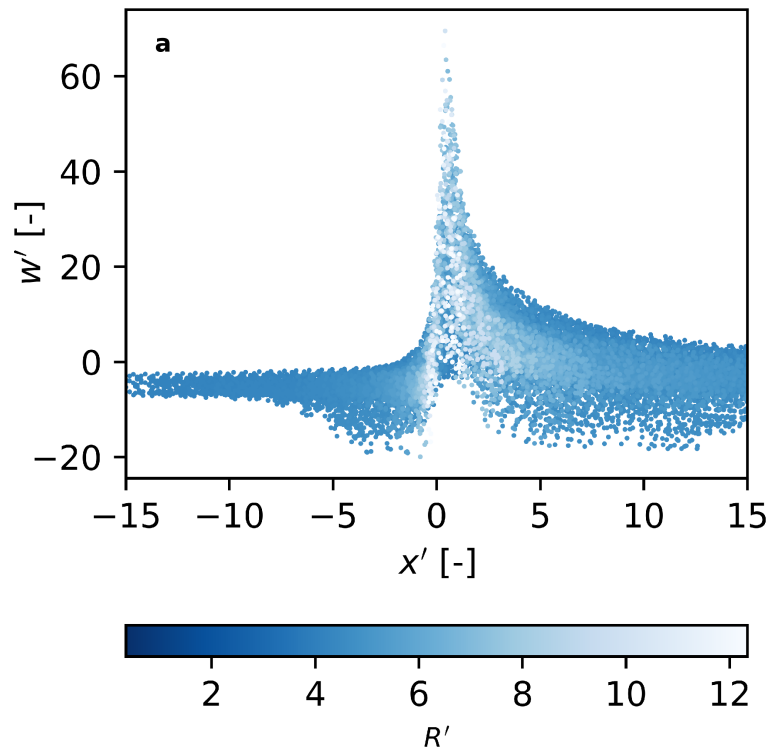
## SPATIAL DECOMPOSITION: EIGENFUNCTION COMPONENTS



Preliminary work

## SPATIAL DECOMPOSITION: EIGENFUNCTION WEIGHTS

MODE I (88.9%)



$$w' = \frac{\rho g (w - \alpha)}{\Delta p} \left[ \text{sign}(V_{fref} - V_f) \right]^\beta + \kappa \left( \frac{V_f}{V_{fref}} \right)$$

$$x' = \frac{x_{ref} - x}{R} \left( \frac{R}{R_{ref}} \right)^\nu$$

$\Delta p$  is central pressure deficit

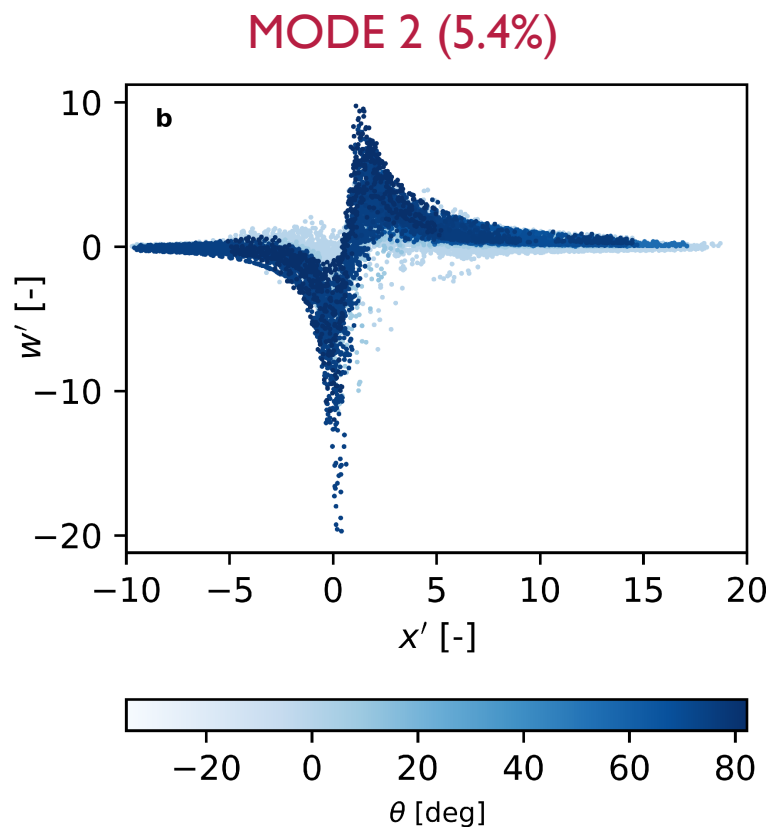
$V_f$  is forward speed

$x$  is landfall location

$R$  is storm radius

$\theta$  is heading

## SPATIAL DECOMPOSITION: EIGENFUNCTION WEIGHTS



$$w' = \frac{\rho g(w - \alpha)}{\Delta p} \left[ \text{sign}(V_{fref} - V_f) \right]^\beta + \kappa \left( \frac{V_f}{V_{fref}} \right)$$

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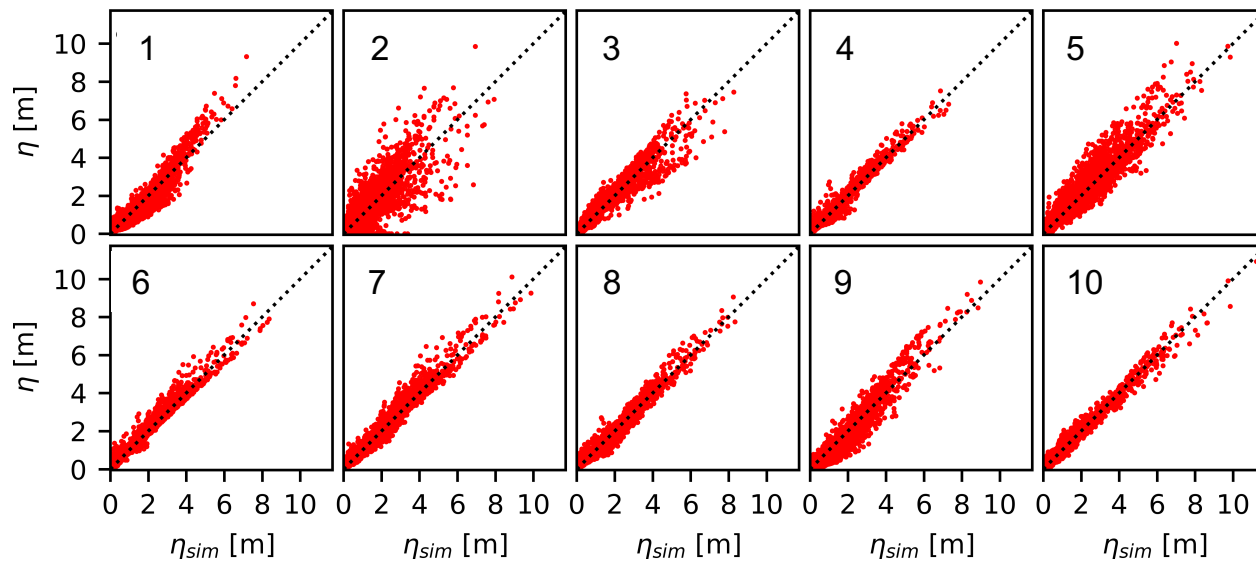
$\theta$  is heading

# Characterization of Spatial Variation in Hurricane Surge

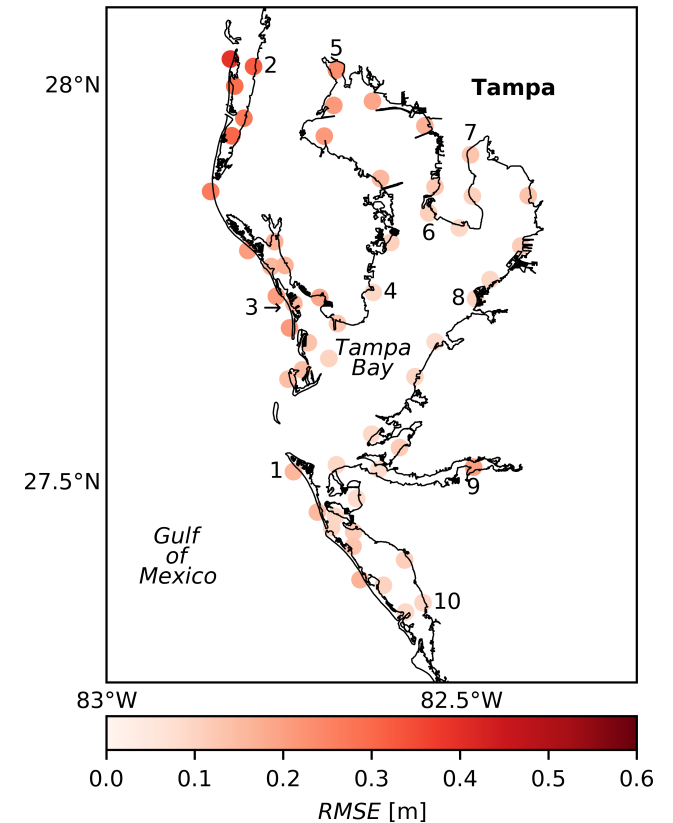
## SPATIAL DECOMPOSITION: SURGE PREDICTION

### ERROR STATISTICS

- Mean error: 0.00 m at all locations
- Root-mean square error (RMSE): 0.08 to 0.40 m



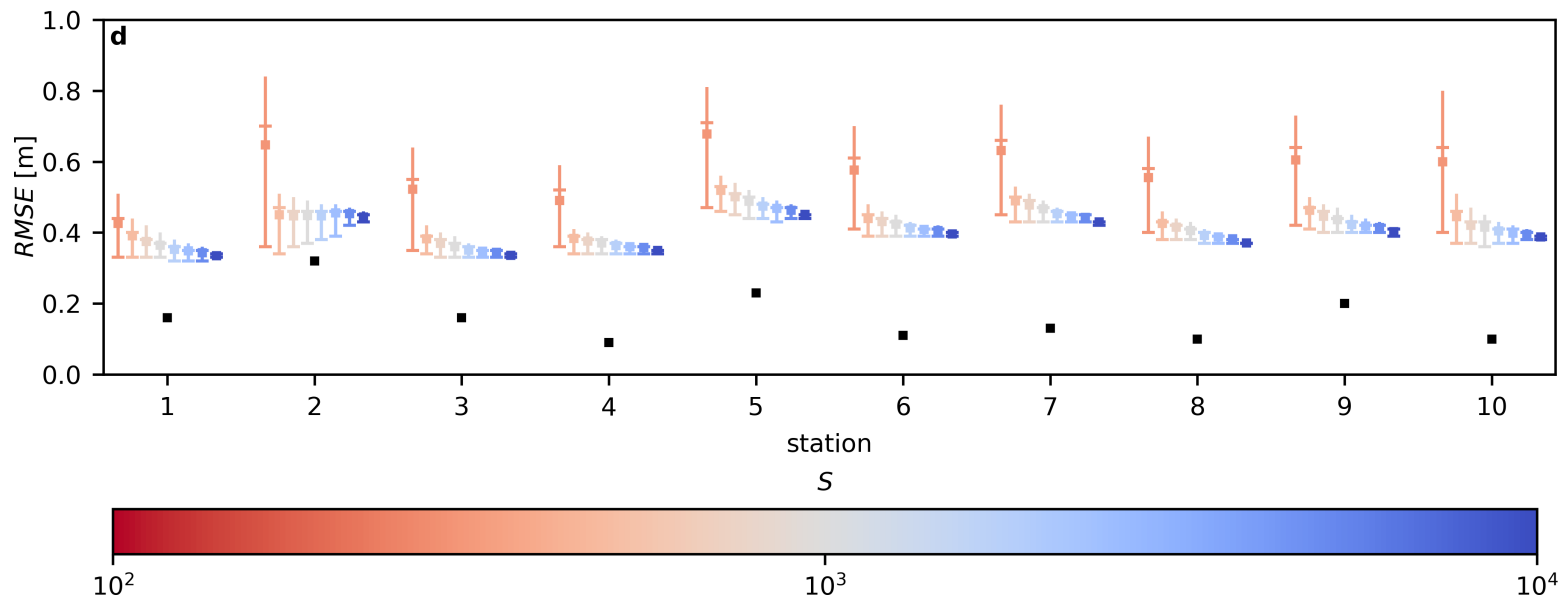
Using 4 modes (97.4% of variance)



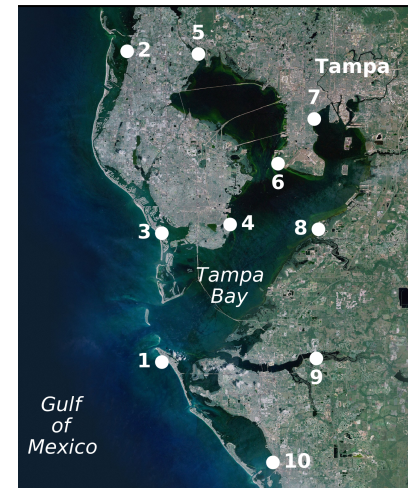
# SURGE ESTIMATION WITH REDUCED STORM SETS

## ERROR STATISTICS

- Mean error: -0.07 to 0.07 m when  $S = 300$  storms
- RMSE: 0.27 to 0.54 m when  $S = 750$  storms



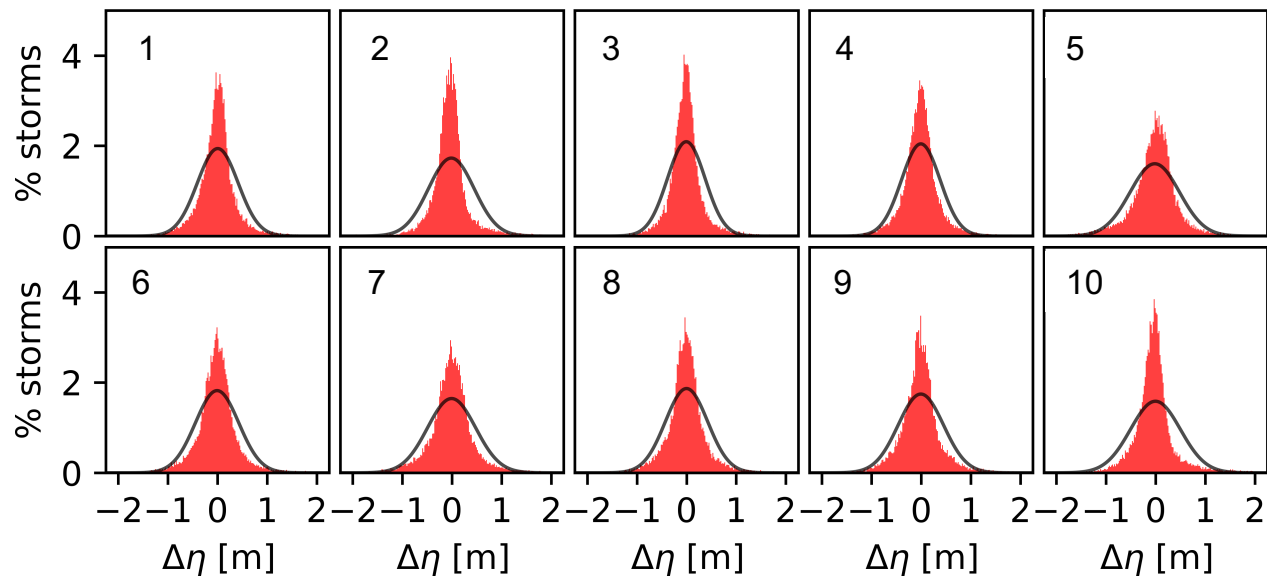
$S = 300$  to 10000 storms, using 4 modes (97.4% of variance)



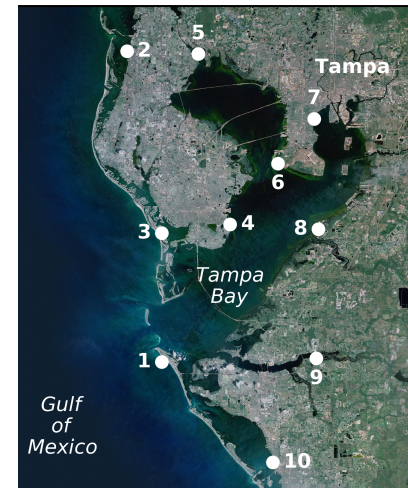
# SURGE ESTIMATION WITH REDUCED STORM SETS

## ERROR STATISTICS

- Mean error: -0.07 to 0.07 m when  $S = 300$  storms
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$S = 750$  storms, using 4 modes (97.4% of variance)



## CONCLUSIONS

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- Eigenfunctions capture over 90% of variance in first two modes
- Eigenfunctions capture spatial variation:
  - Mode 1: Amplification of ocean surge wave as it propagates inland in response to topographic features
  - Higher-order modes: Local effects, e.g., local wind setup/setdown
- Eigenfunction weights depend on storm track parameters:
  - Mode 1: Leading order ocean surge scaling with landfall location, central pressure deficit, and storm radius
  - Higher-order modes: Local effects, e.g., influence of wind-field orientation (heading) on wind setup/setdown



## CONCLUSIONS

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- Randomly selected, reduced storm sets sufficient to determine eigenfunctions
- Error introduced adds no more than 20% to model uncertainty
- Error may be assumed to be normally distributed

# Characterization of Spatial Variation in Hurricane Surge

## QUESTIONS?

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