

# Statistical Analysis of Extreme Storm Tides

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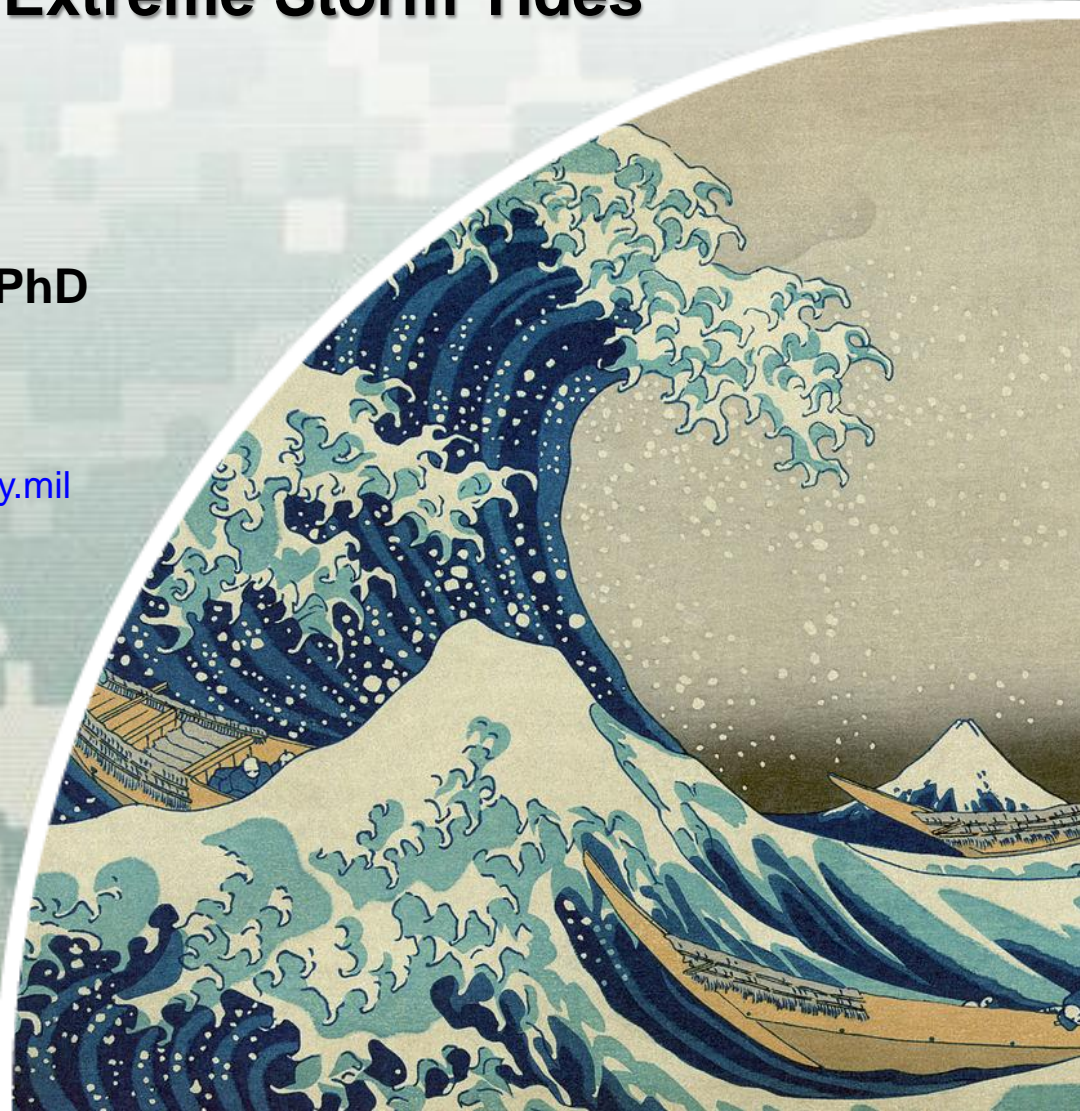
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US Army Corps of Engineers



# Statistical Analysis of Extreme Storm Tides

## **Phase I:** Extremal Analysis of Storm Tide and Sea Level Change

- Low-fidelity approach (Initial assessment)
  - ▶ StormSim software system – extremal analysis and Monte Carlo simulation
  - ▶ NOAA verified historical water level measurements (QA/QC, high-water marks)
  - ▶ 23 NOAA gage locations
  - ▶ 6 USACE/NOAA sea level change (SLC) scenarios
  - ▶ Develop storm response benchmark for Phase II validation

## **Phase II:** Joint Probability Analysis of Tropical & Extratropical Storms

- High-fidelity approach
  - ▶ Joint Probability Method (JPM) – Bayesian Quadrature Optimal Sampling
  - ▶ StormSim – JPA of storm forcing parameters and storm response
  - ▶ CSTORM-MS – modeling of storm suite
  - ▶ Sea level change and astronomical tide scenarios incorporated in the analysis



# Statistical Analysis of Extreme Storm Tides

## **Phase I:** Extremal Analysis of Storm Tide and Sea Level Change

### *Limitations of low-fidelity approach*

- Response-based statistics
  - ▶ Analysis limited to gage measurements, high-water marks
  - ▶ Limited to historical occurrences (e.g., sparse hurricane landfalls, tracks)
  - ▶ Does not incorporate insight from storm-forcing probabilities
- Mixed storm populations
  - ▶ Extratropical and tropical storms, and hurricanes considered as single population
  - ▶ Hurricane population is statistically underrepresented
- Short record lengths, data gaps, and missing storms



# Statistical Analysis of Extreme Storm Tides

**StormSim** is an extremal statistical analysis and storm simulation software system.

**Integrated framework** of Matlab<sup>®</sup> routines

Has been utilized in several recent studies, including:

- **USACE Districts and FEMA coastal risk analysis,**
- **R&D applications,**
- **coastal planning and engineering, and**
- **emergency management.**



# Statistical Analysis of Extreme Storm Tides

## StormSim – Summary of Capabilities

- Joint probability analysis (JPA) of extratropical and tropical storms / hurricanes.
- Historical data censoring and pre-processing
  - ▶ HURDAT2, NOAA-NOS gages, NDBC buoys, others
- Extremal analysis (marginal / conditional distributions)
- Monte Carlo simulation and Bootstrap methods
- Time-dependant, life-cycle analysis
- Simulation of water level and wave climate
  - ▶ Sea level change (SLC)



# Statistical Analysis of Extreme Storm Tides

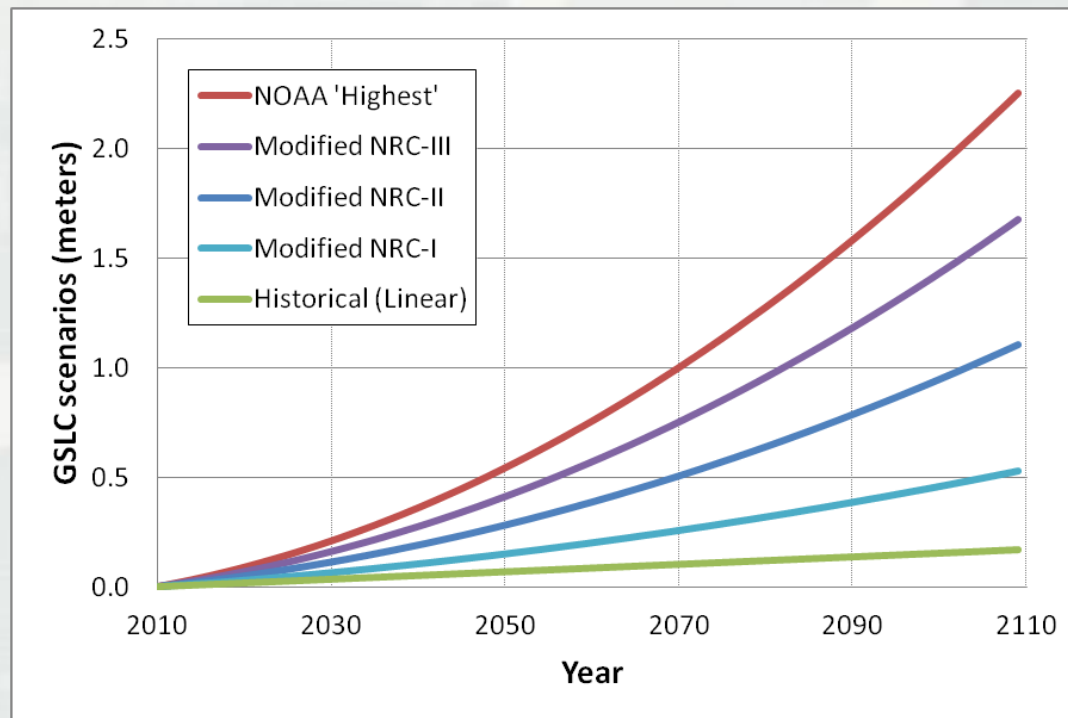
## NOAA-NOS Water Level Gages (total: 23)

<u>Region I</u>	<u>Region II</u>	<u>Region III</u>
1. Eastport, ME	10. Montauk Point Light, NY	16. Lewes, DE
2. Bar Harbor, ME	11. Kings Point, NY	17. Cambridge, MD
3. Portland, ME	12. The Battery, NY	18. Baltimore, MD
4. Boston, MA	13. Sandy Hook, NJ	19. Annapolis, MD
5. Woods Hole, MA	14. Atlantic City, NJ	20. Solomon Island, MD
6. Nantucket Island, MA	15. Cape May, NJ	21. Washington, DC
7. Newport, RI		22. Sewells Point, VA
8. Providence, RI		23. Chesapeake Bay Bridge Tunnel, VA
9. New London, CT		



# Statistical Analysis of Extreme Storm Tides

## USACE/NOAA Sea Level Change Scenarios



References: USACE 2011: Sea Level Change Considerations for Civil Works Programs

NOAA 2012: Global Sea Level Rise Scenarios for the United States National Climate Assessment



# Statistical Analysis of Extreme Storm Tides

## Phase I: General Methodology

- Extremal analysis of measured water levels
  - ▶ Hourly and monthly maximum data (Data gap filling)
  - ▶ Generalized Pareto distribution (GPD)
    - Maximum likelihood fitting method (MLM)
  - ▶ Bootstrapping – compute mean, confidence limits
- Monte Carlo Life-Cycle Simulation (Double-Loop)
  - ▶ Inner loop
    - 100-year life-cycle simulation
    - Storm tide = astronomical tide + storm surge + SLC scenario
  - ▶ Outer loop
    - 10,000 simulations of inner loop



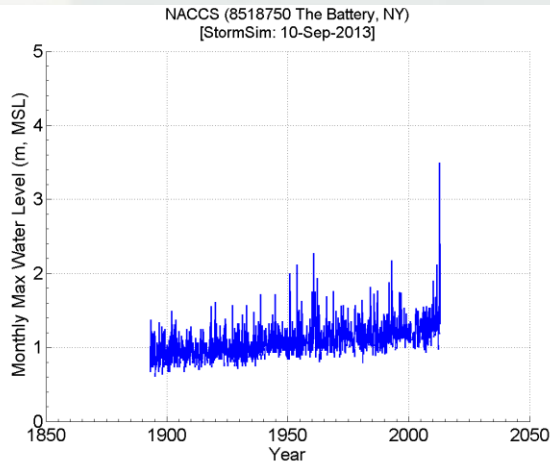


# Statistical Analysis of Extreme Storm Tides

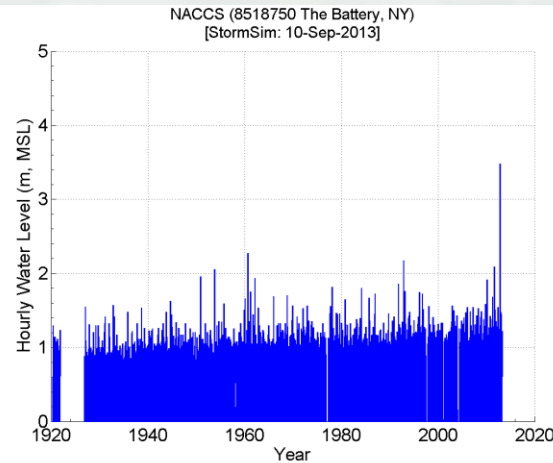
## Phase I: General Methodology

- Extremal analysis of measured water levels
  - ▶ Maximize the use of available data – No extreme storms missing

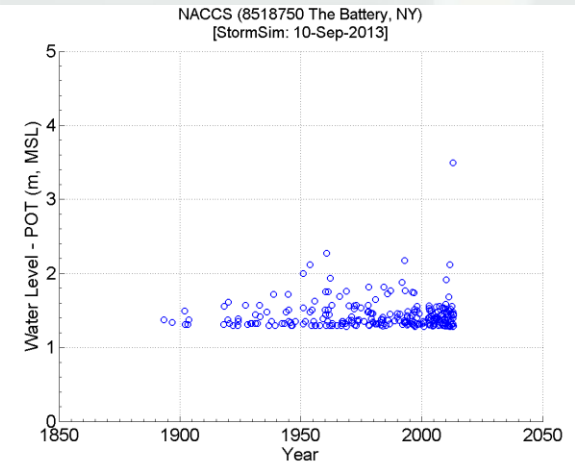
### Monthly Max



### Hourly Data



### Merged POT Data

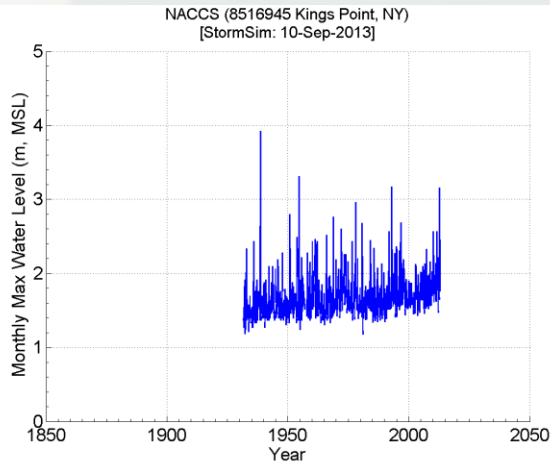


# Statistical Analysis of Extreme Storm Tides

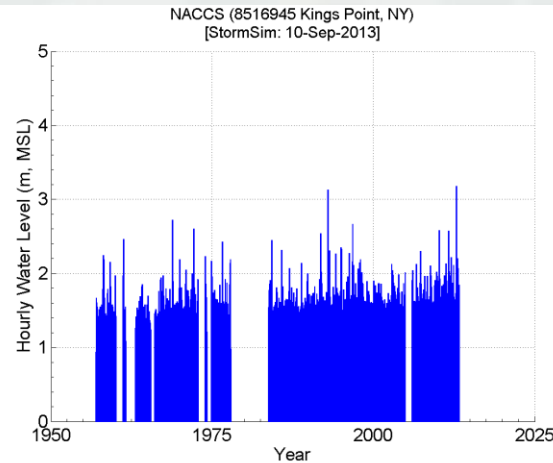
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- Extremal analysis of measured water levels
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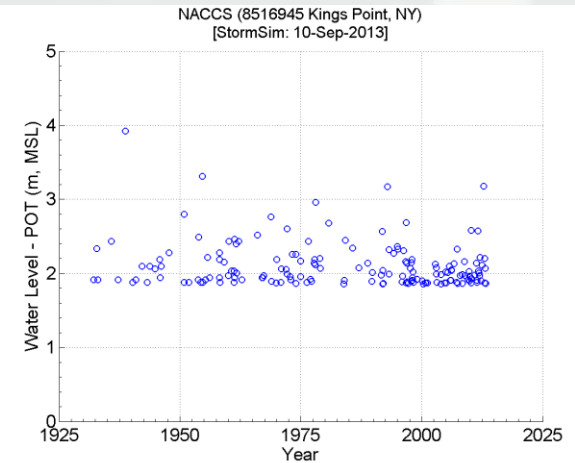
### Monthly Max



### Hourly Data



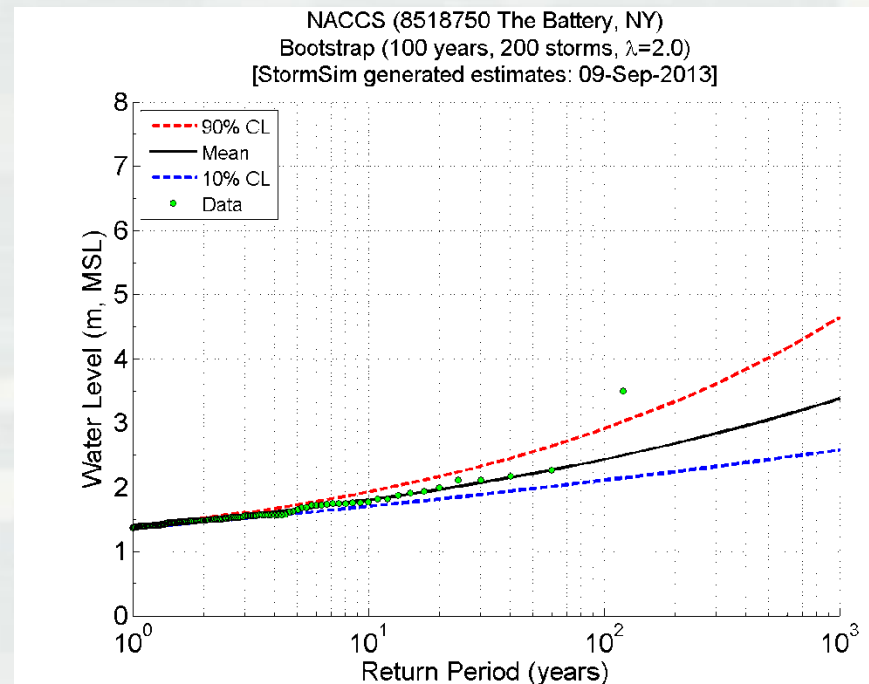
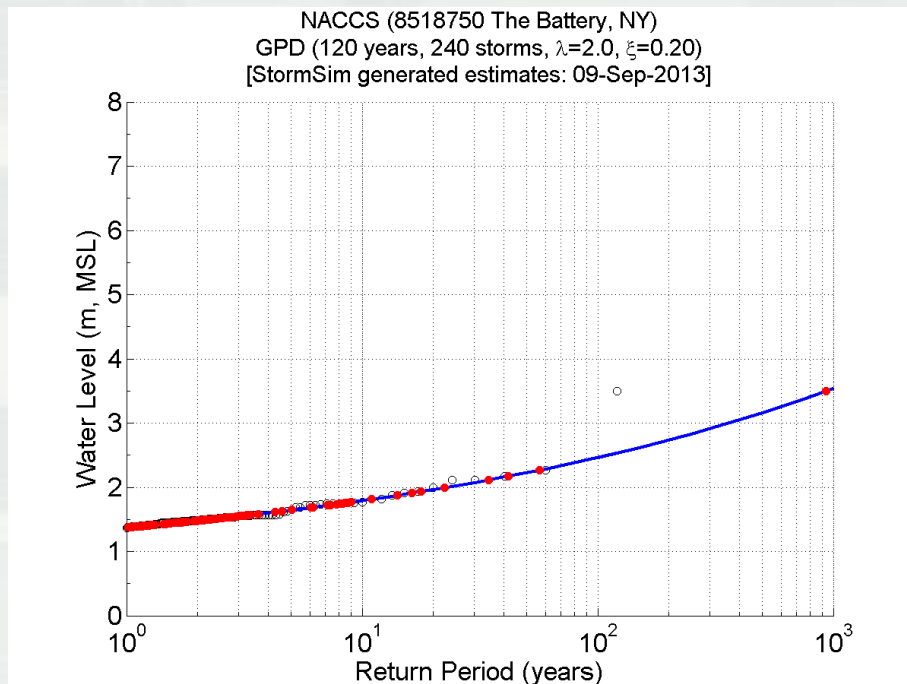
### Merged POT Data



# Statistical Analysis of Extreme Storm Tides

## Phase I: General Methodology

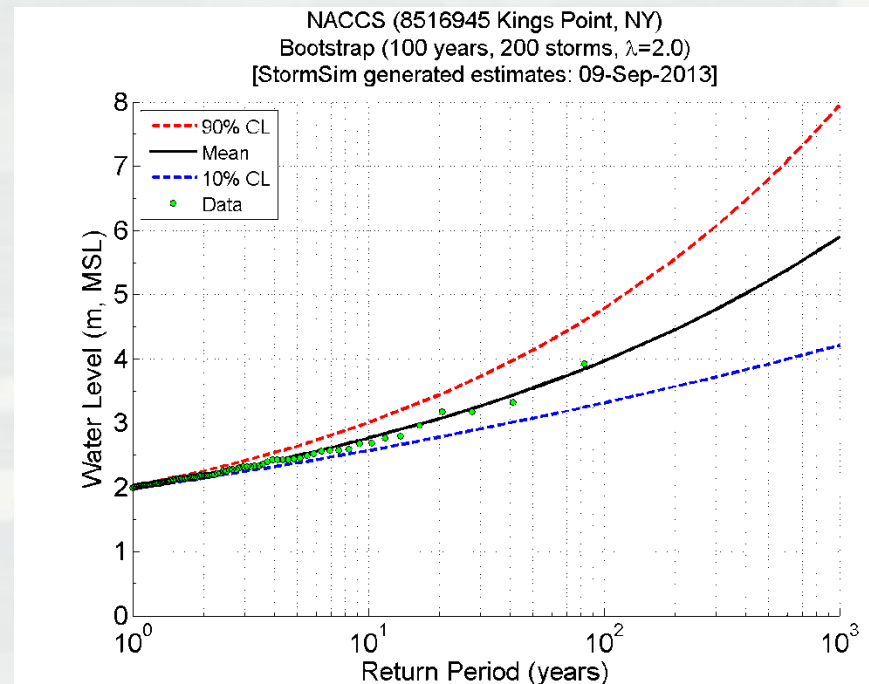
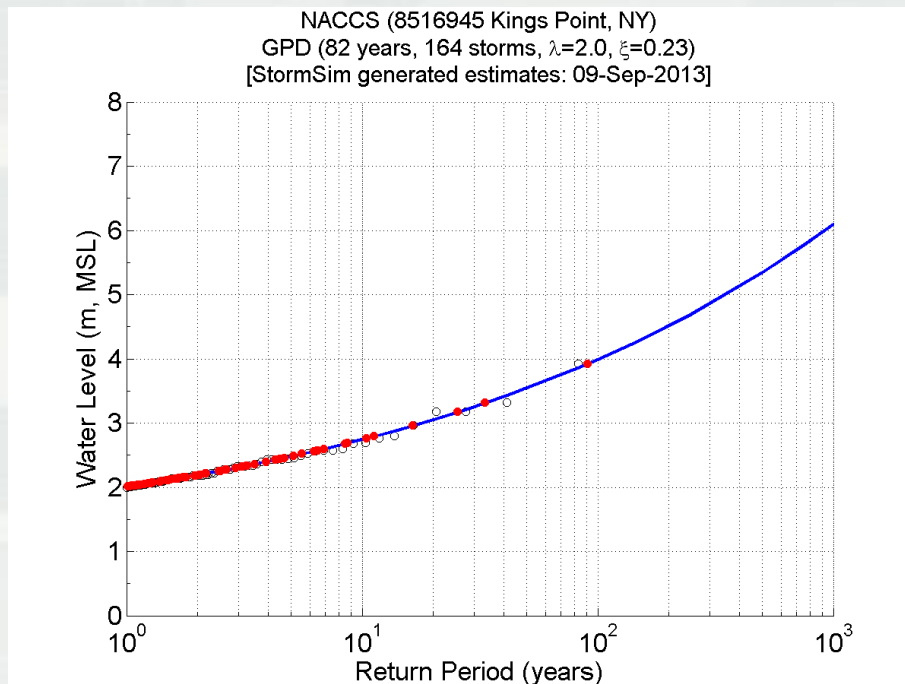
- Extremal analysis of measured water levels
  - Generalized Pareto Distribution – Bootstrapping/MCS



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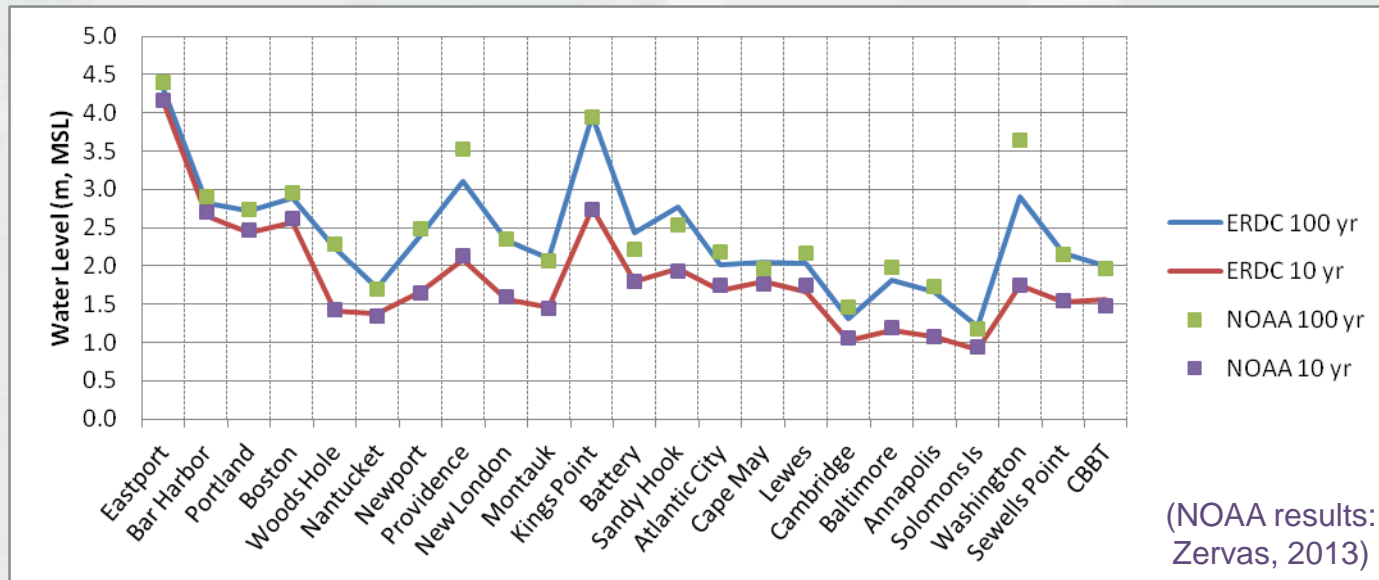
## Phase I: General Methodology

- Extremal analysis of measured water levels
  - Generalized Pareto Distribution – Bootstrapping/MCS



# Validation of Extremal Analysis Results

## ERDC GPD-MC vs. NOAA GEV results



### RP = 10 yr

- ▶ Differences for all 23 gages < 0.10 m; RSMD = 0.04 m

### RP = 100 yr

- ▶ Differences for 21 of 23 gages < 0.25 m; RMSD = 0.11 m
- ▶ Exceptions: Providence, RI = 0.42 m; Washington, DC = 0.75 m



# Statistical Analysis of Extreme Storm Tides

## Phase I: General Methodology

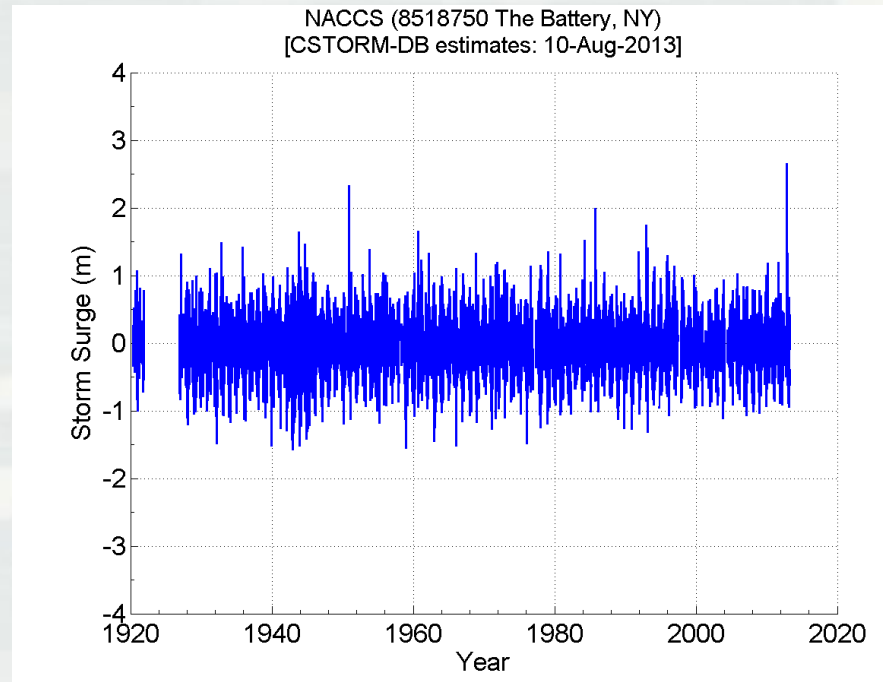
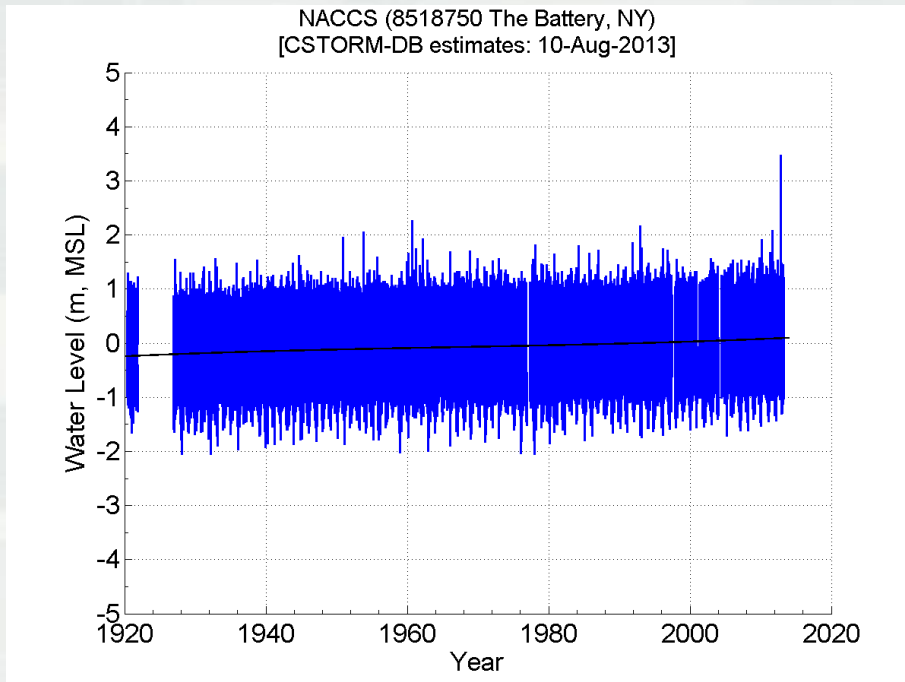
- Monte Carlo Life-Cycle Simulation
  - ▶ Uses only hourly WL, decomposed into:
    - Storm surge/residuals
    - Astronomical tide
    - Sea level change
  - ▶ Inner loop (1<sup>st</sup>) = 100-year life-cycle
    - $WL = \text{random surge} + \text{random tide} + \text{RSLC}(t)$
    - $\text{RSLC}(t) = (\text{LSLC}_{\text{gage}} - \text{GSLC}_{\text{mean}}) + \text{GSLC}(t)_{\text{scenario}}$
    - Five SLC scenarios
  - ▶ Outer loop (2<sup>nd</sup>) = 10,000 simulations of the 1<sup>st</sup> loop



# Statistical Analysis of Extreme Storm Tides

## Phase I: General Methodology

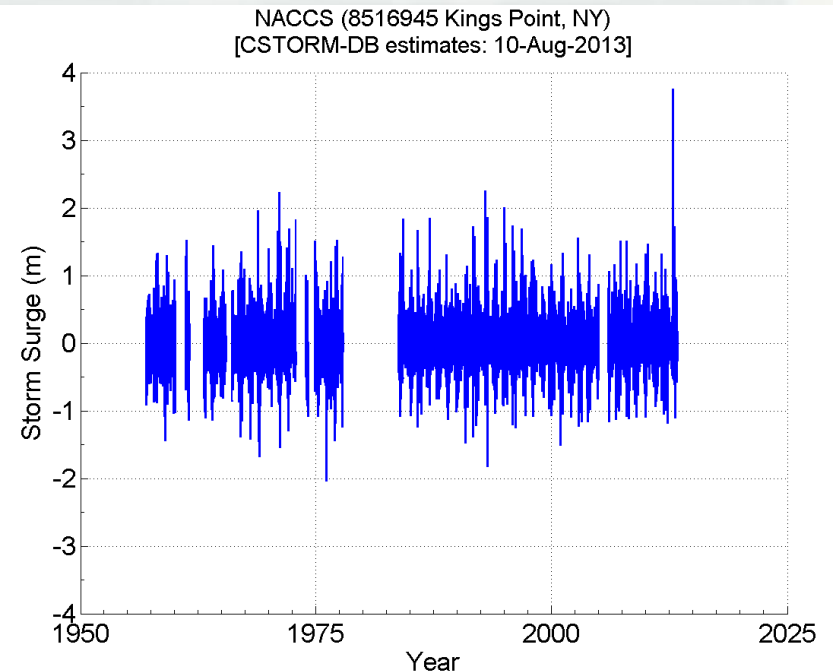
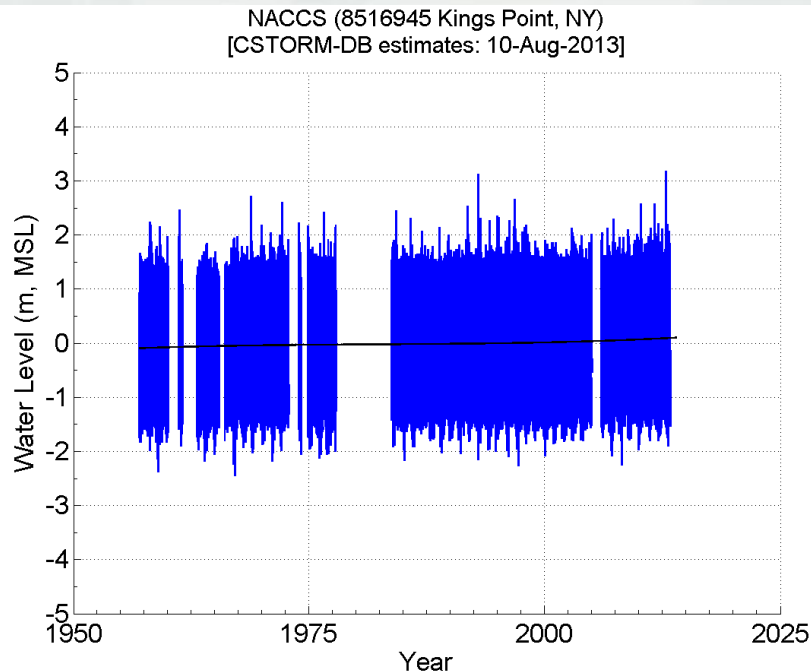
- Monte Carlo Life-Cycle Simulation
  - ▶ Storm Surge/Residuals = Measured WL (detrended) – Predicted WL



# Statistical Analysis of Extreme Storm Tides

## Phase I: General Methodology

- Monte Carlo Life-Cycle Simulation
  - ▶ Storm Surge/Residuals = Measured WL (detrended) – Predicted WL

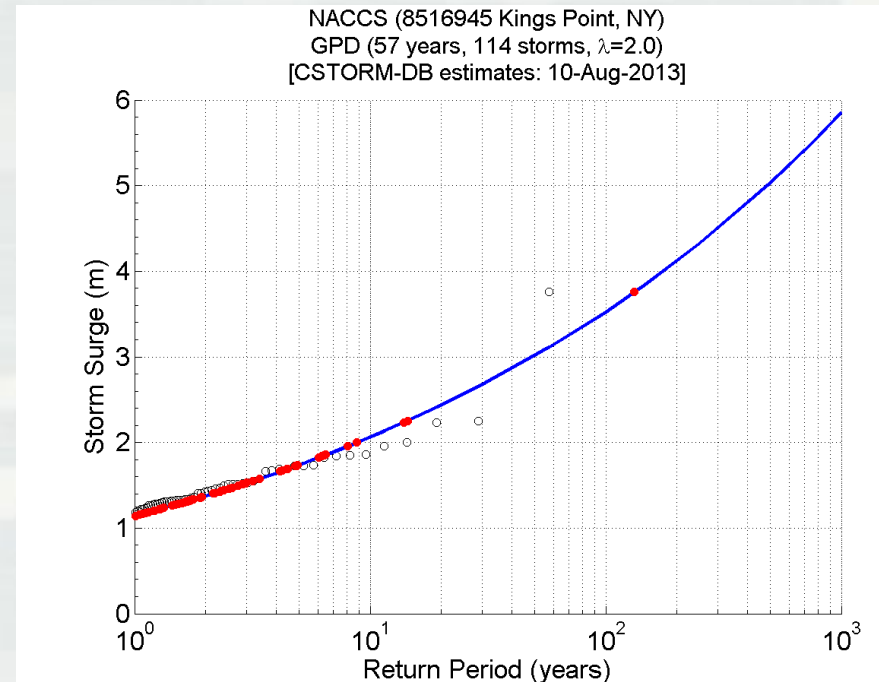
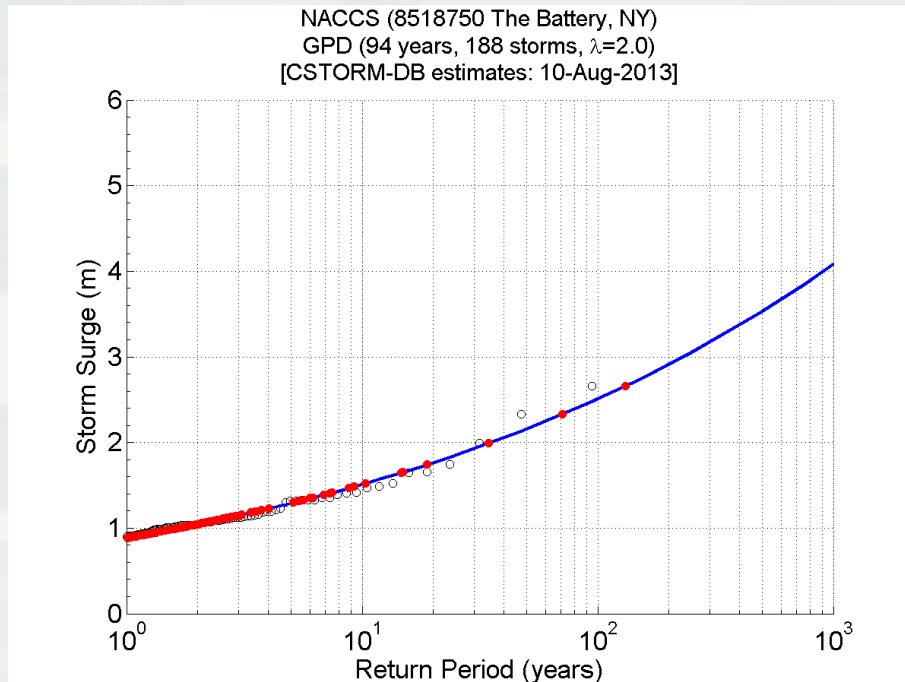




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## Phase I: General Methodology

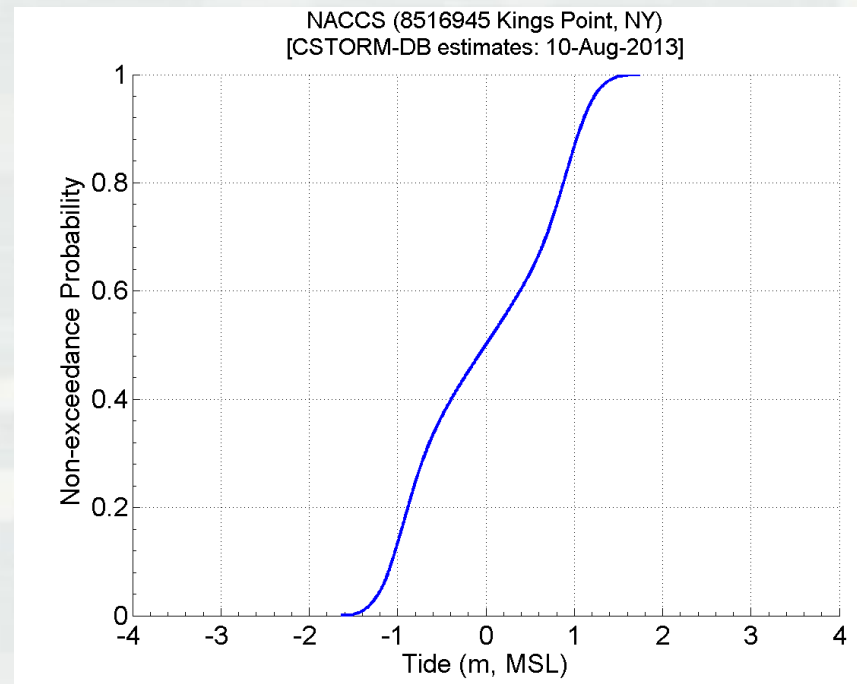
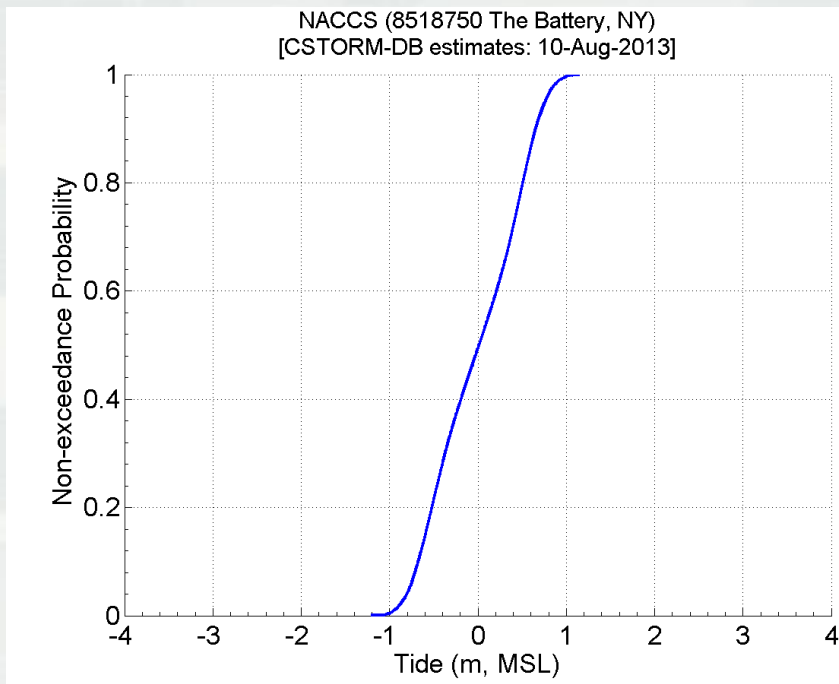
- Monte Carlo Life-Cycle Simulation
  - ▶ Storm Surge – GPD



# Statistical Analysis of Extreme Storm Tides

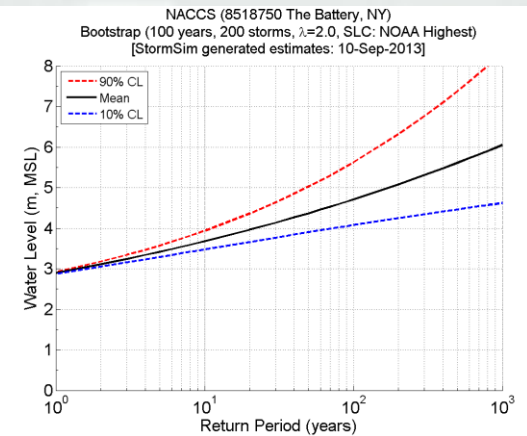
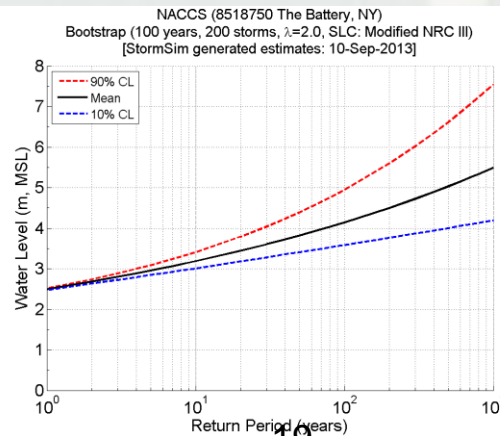
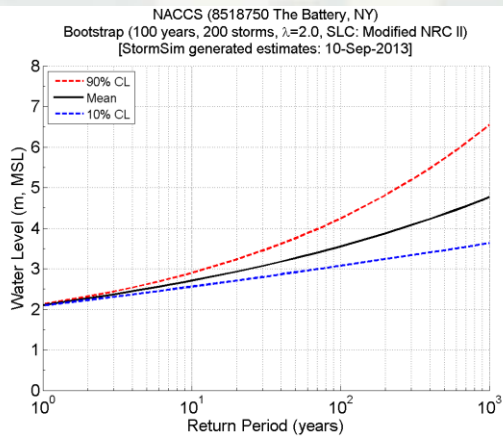
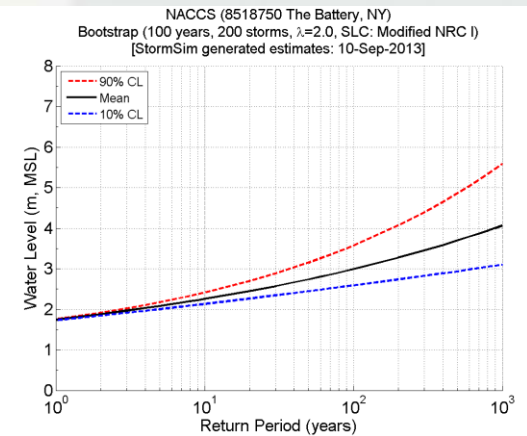
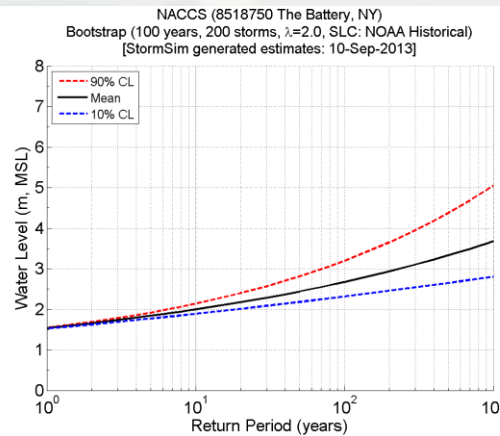
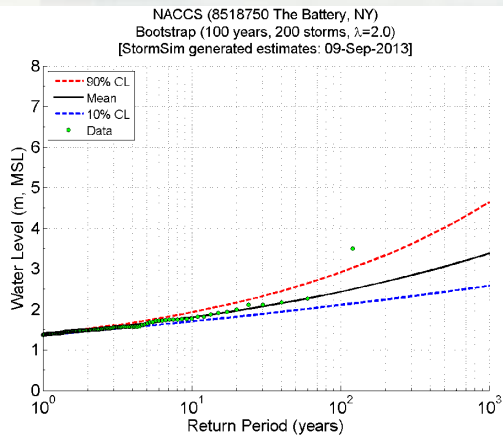
## Phase I: General Methodology

- Monte Carlo Life-Cycle Simulation
  - ▶ Astronomical Tide – Empirical CDF



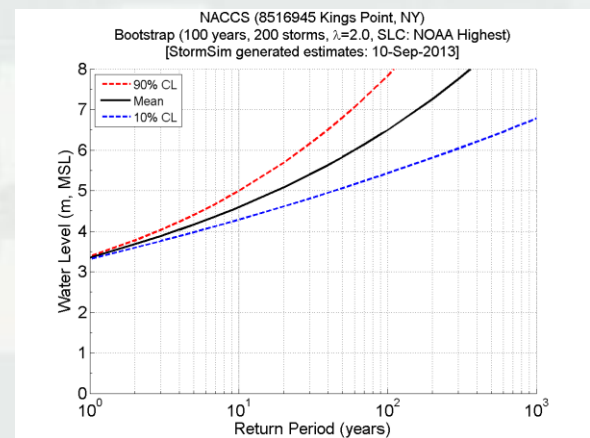
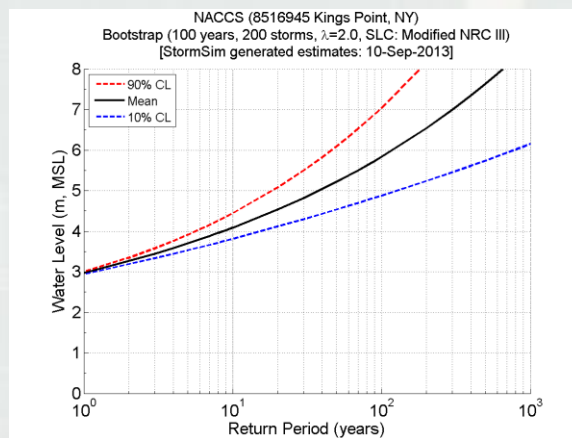
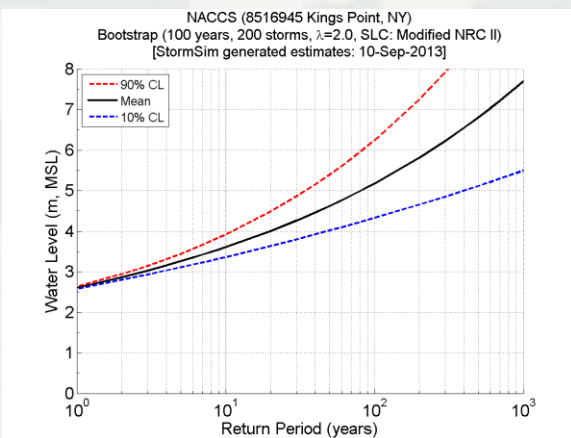
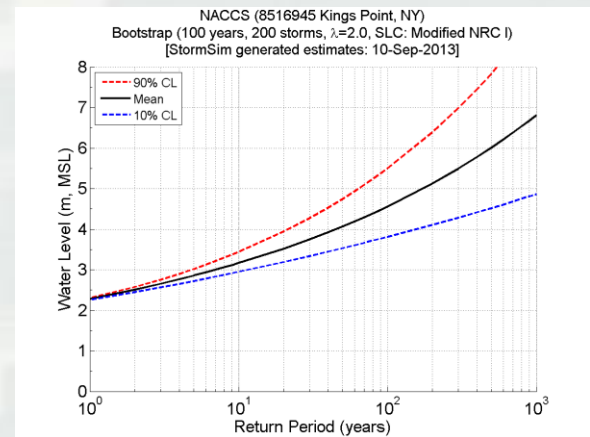
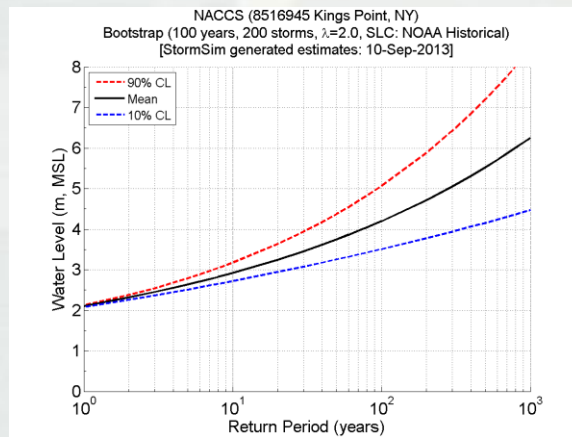
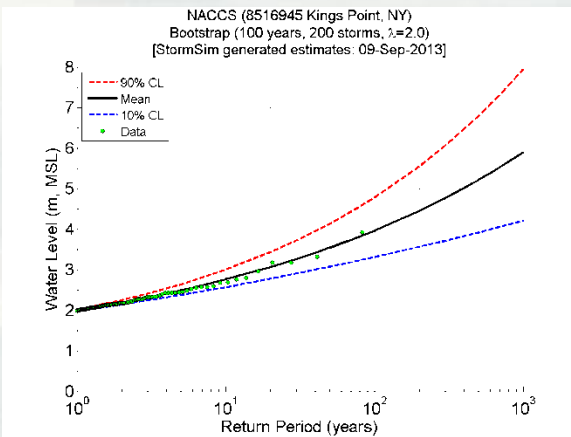
# Statistical Analysis of Extreme Storm Tides

## Monte Carlo Life-Cycle Simulation



# Statistical Analysis of Extreme Storm Tides

## Monte Carlo Life-Cycle Simulation



# Statistical Analysis of Extreme Storm Tides

## Path Forward

### ■ Phase I

- ▶ Technical Report - final draft

### ■ Phase II

#### ▶ Extratropical storms

- Storm selection process
- Composite Storm Set (CSS) methodology [Nadal-Caraballo et al. 2012]

#### ▶ Hurricanes

- Marginal distribution of storm forcing parameters
- Joint probability analysis
- Definition of synthetic storm suite



# Thank you...

