



# Tools and Resources Currently in Place and in Development to Help Planning Adaptation to Sea Level Rise in South Florida

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Sea Level Hotspots from Florida to Maine  
Drivers, Impacts, and Adaptation  
April 23 -25, 2019 | Norfolk, Virginia

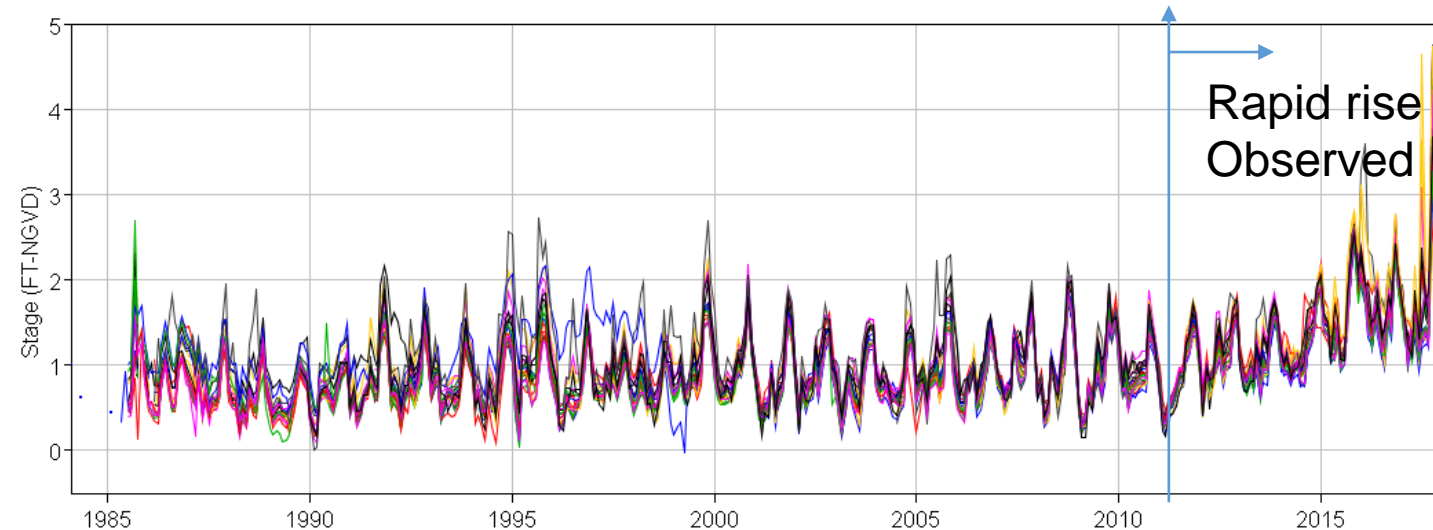


*South Florida : Low topography, High groundwater table,  
Sandy soils and porous limestones, One of the most complex  
water management systems in the world*

# Outline

- Why tools are needed?
- Current tools
  - Design water levels
  - Compound Flooding
  - Adaptive pathways
- Future plans for tool development

# Coastal Discharge Structures in South Florida



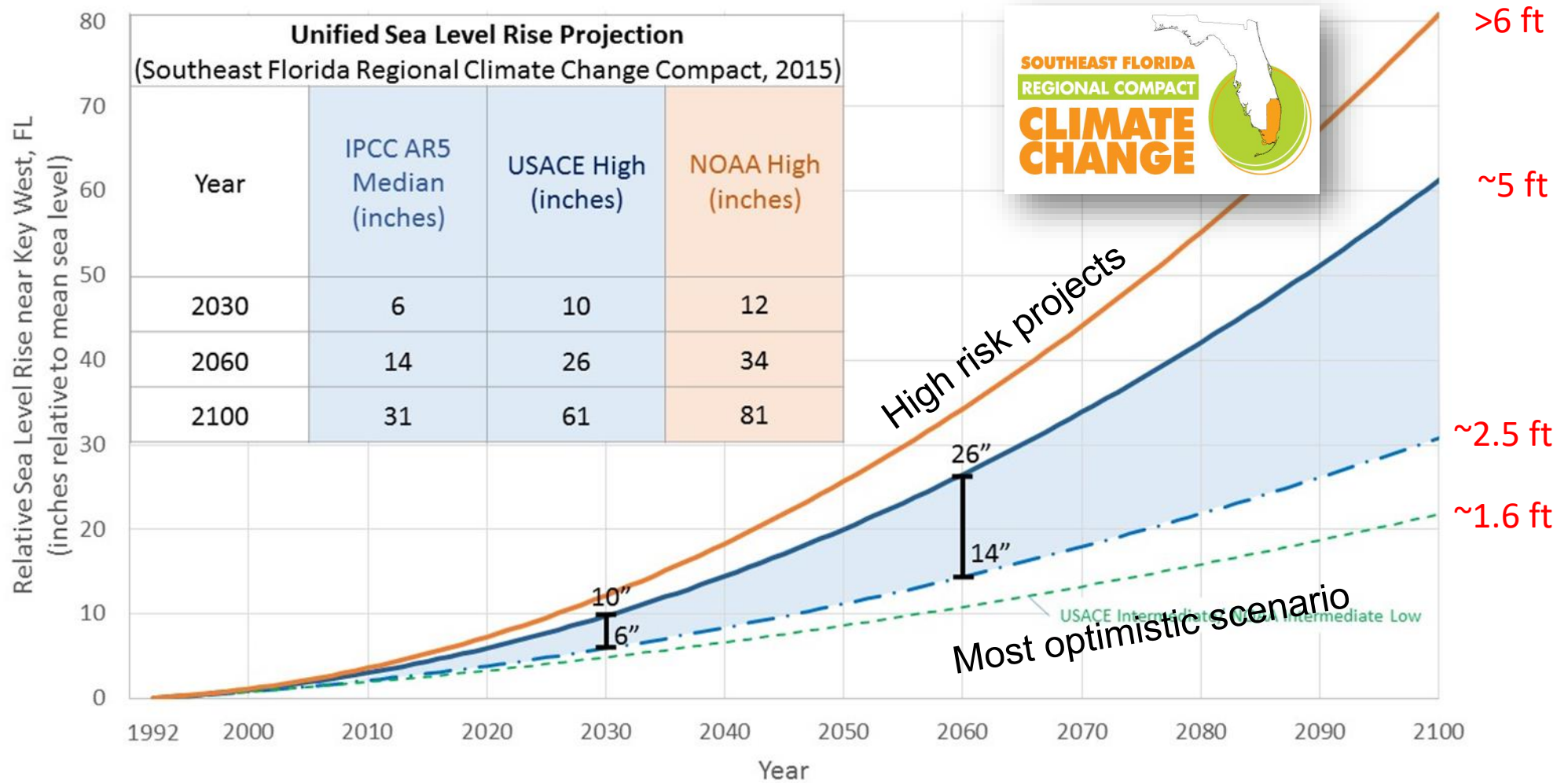
— S21\_T DBHYDRO-06598 STAGE  
 — S20F\_T DBHYDRO-06570 STAGE  
 — S37A\_T DBHYDRO-06649 STAGE  
 — S22\_T DBHYDRO-06606 STAGE  
 — S155\_T DBHYDRO-06773 STAGE  
 — S28\_T DBHYDRO-06626 STAGE  
 — S20G\_T DBHYDRO-06590 STAGE  
 — S123\_T DBHYDRO-06768 STAGE  
 — S33\_T DBHYDRO-15679 STAGE  
 — S40\_T DBHYDRO-06665 STAGE  
 — G93\_T DBHYDRO-SH501 STAGE  
 — S26\_T DBHYDRO-06618 STAGE  
 — S29\_T DBHYDRO-06630 STAGE  
 — G54\_T DBHYDRO-15967 STAGE

**What happened after 2012?**

- Florida Current?
- Ocean Warming?
- ENSO, NAO?

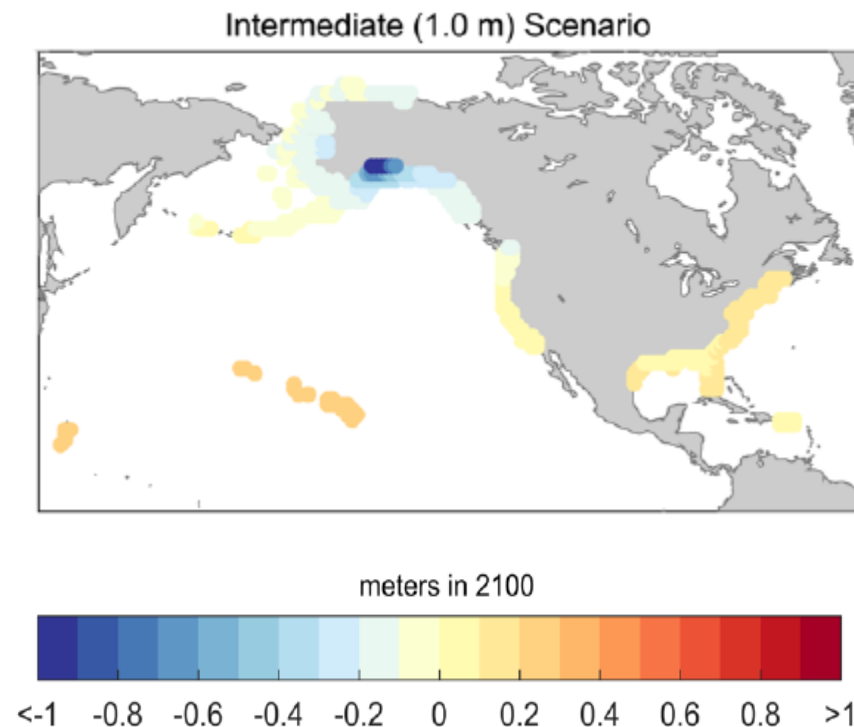


# Unified Sea Level Projections



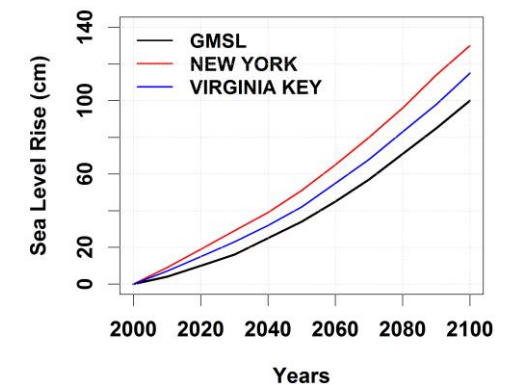
# Regional Sea Level Projections

- Both Hall et al. (DoD 2016) and Sweet et al. (NOAA 2017) accounted for all components



Florida

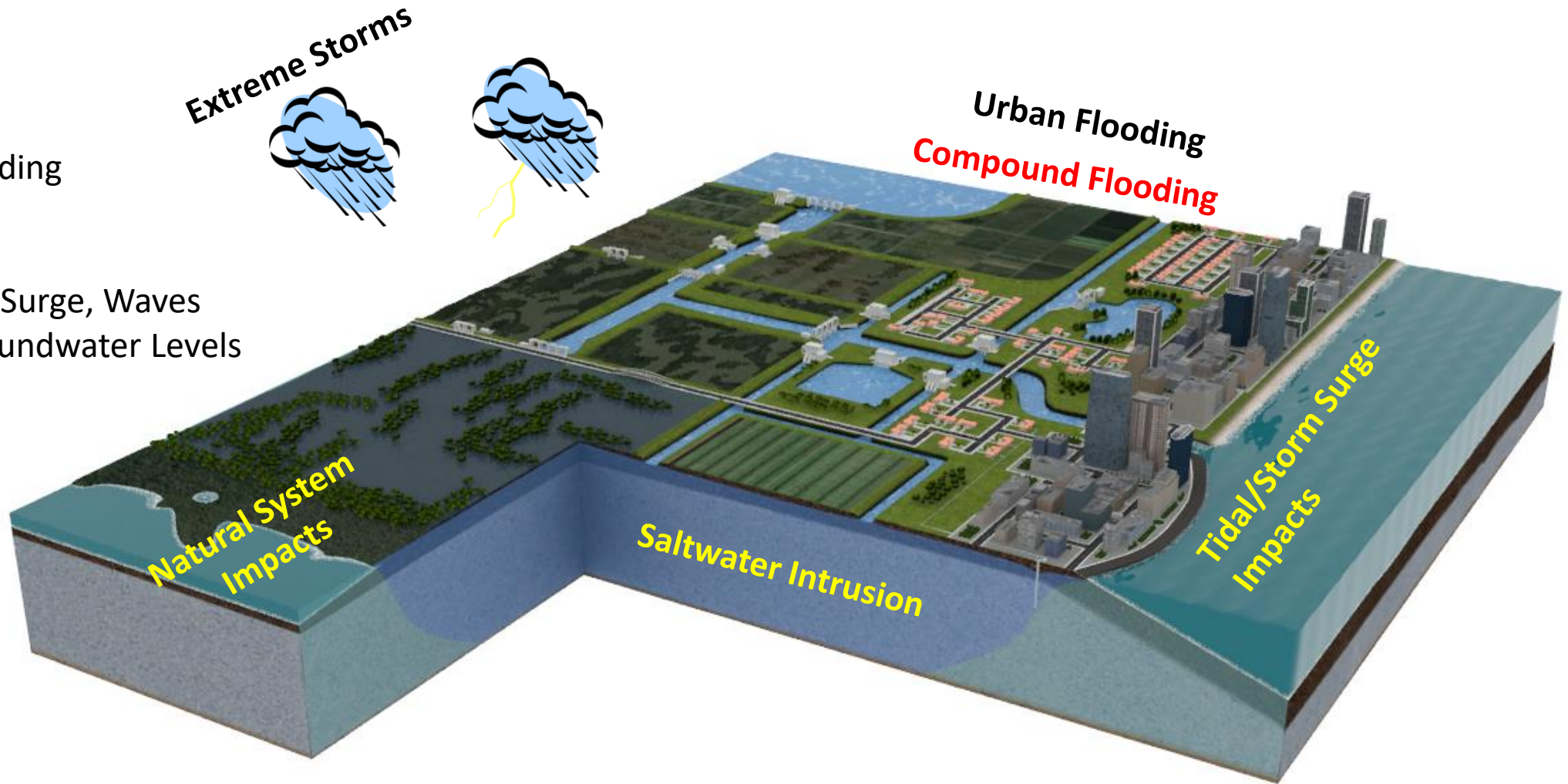
Regional  
Sea Level  
Curves



# South Florida Case

Compound Flooding  
Caused by

- Rainfall
- Tides, Storm Surge, Waves
- Elevated Groundwater Levels





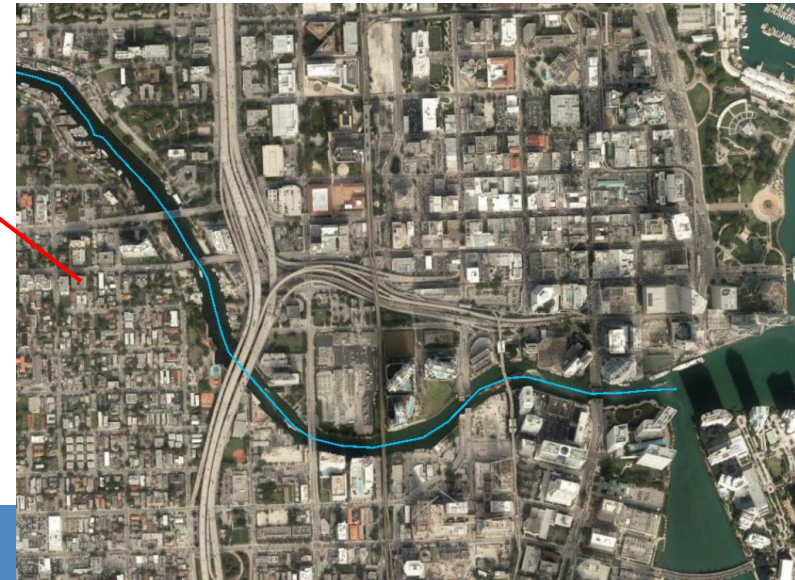
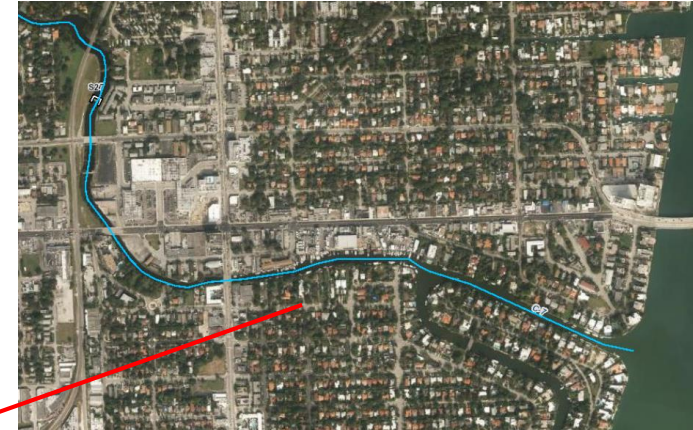
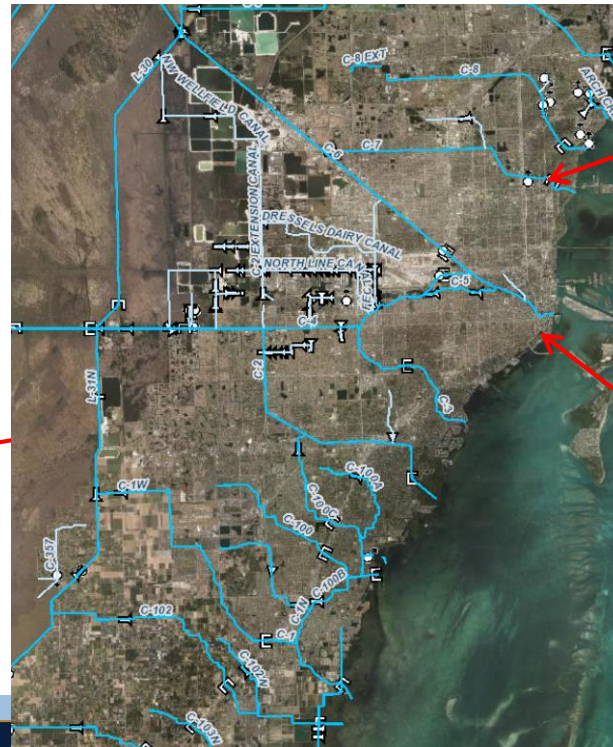
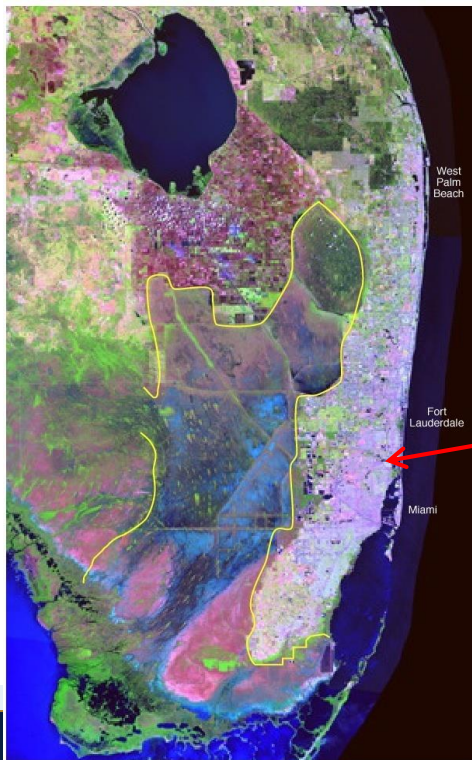
# Regional Coastal Water Control Structures

The main image is an aerial map of the New Orleans area, showing the Mississippi River Gulf Outlet (MRGO) and various water control structures. The map is overlaid with a network of yellow and blue lines, representing the water control system. Four red dots are placed on the map, with lines connecting them to a larger map in the top right corner. In the bottom left corner, there is a graph titled "S26-T OBS STAGE" showing a time series of water levels from 1995 to 2010. The graph has a red line for the observed stage and a blue line for the predicted stage. The predicted stage is generally higher than the observed stage, especially during the 2005-2006 period. In the bottom right corner, there is a photograph of a water control structure, showing a concrete wall with a gate and a walkway.



# Level of Service Program for Flood Protection

S. Florida: Low topography, High groundwater table, sandy soils and porous limestones, complex water management systems.





# Information Needs for Adaptation

- Projections of Total Water Levels for various Return Periods and Sea Level Rise Scenarios
- How to deal with Nonstationarity in designs
- Compound Flooding. How do we estimate joint probabilities (Rainfall, Total Water Level, Groundwater)
- Dealing with uncertainty in Adaptation Planning

# Tools

## Current:

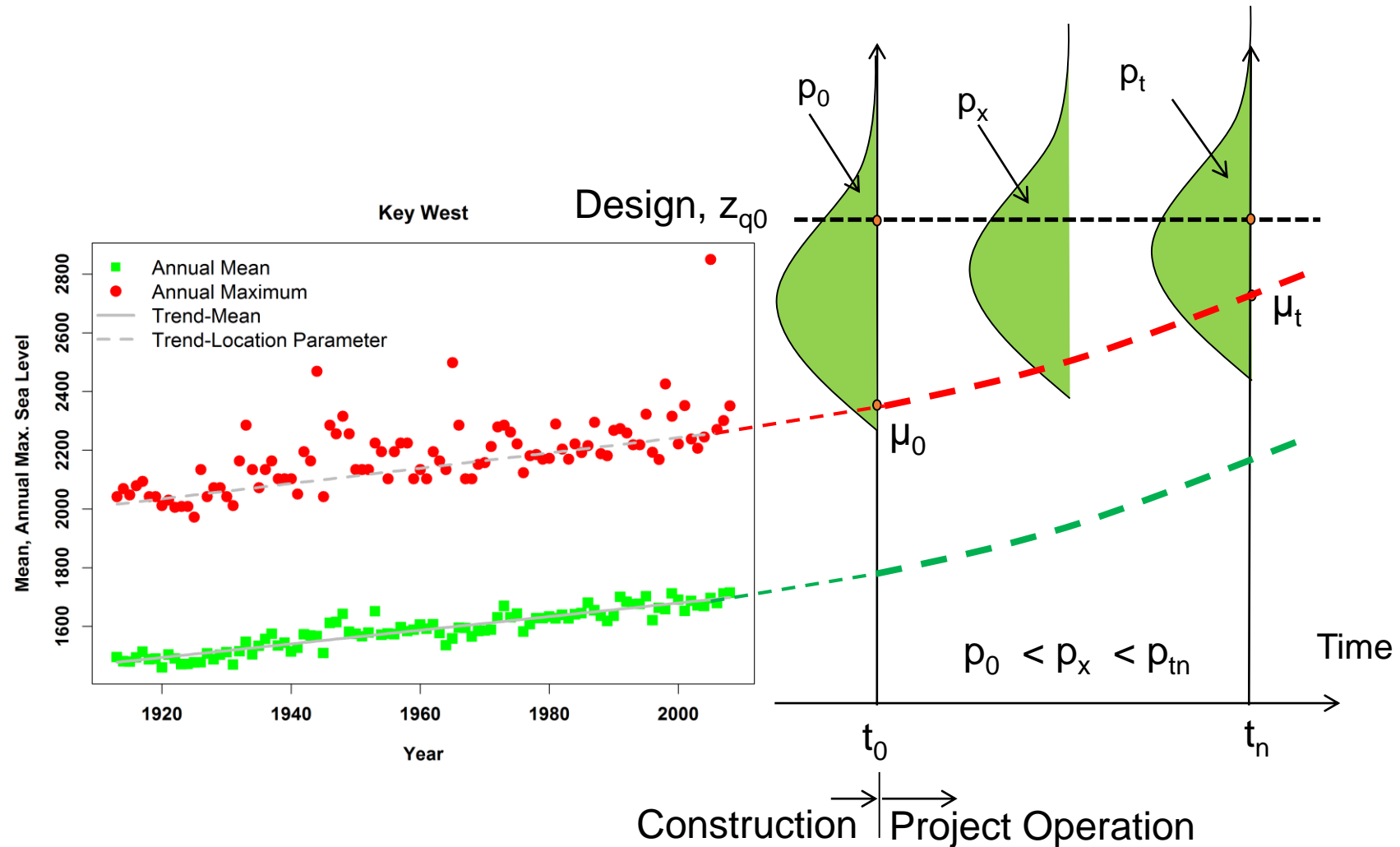
- New paradigm for return period and risk under nonstationarity
- Empirical Simulation Techniques for Design Water Levels
- Assessment of Compound Flooding
  - Copulas
  - Generation of Synthetic Events
- Deep Uncertainty Methods

## Future

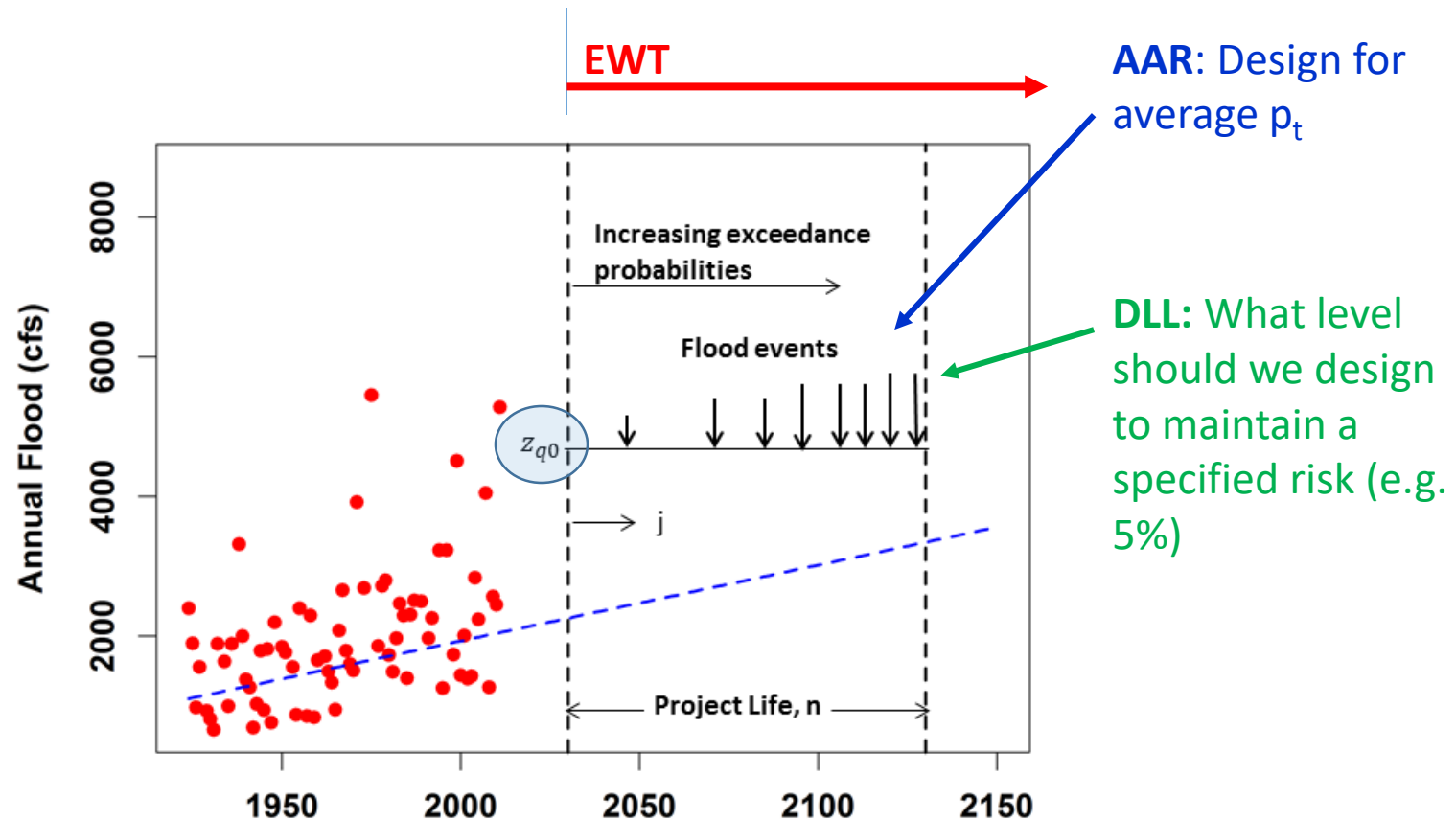
- Hybrid Statistical and Dynamical Modeling Approach (TESLA)



# Designing for Sea Level Rise



# Hydrologic Design considering Nonstationarity



ENE: What level should we design for if we can tolerate, say  $m$  events over the life



# Design Criteria

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- ☐ Expected Waiting Time (EWT)
- ☐ Expected Number of Events (ENE)
- ☐ Design Life Level (DLL) – Risk Based

# “Return Period” Under Nonstationary

- Return Period is defined as the “expected time for the first exceedance (waiting time)”

$$T = E[X] = \sum_{x=1}^{\infty} x f(x) = \sum_{x=1}^{\infty} x p_x \prod_{t=1}^{x-1} (1 - p_t)$$

- Coley (2013) provides a nice simplification:

$$T = E[X] = 1 + \sum_{x=1}^{\infty} \prod_{t=1}^x (1 - p_t)$$

Note: Since  $p_t$  is a function  $Z_{q_0}$  (initial design or  $p_0$ ), this can also be used to find  $Z_{q_0}$  for a given  $T$



# Risk and Reliability (Nonstationary)

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## □ Risk

$$R = \sum_{x=1}^n f(x) = \sum_{x=1}^n p_x \prod_{t=1}^{x-1} (1 - p_t) = 1 - \prod_{t=1}^n (1 - p_t)$$

## □ Reliability:

$$R_\ell = \prod_{t=1}^n (1 - p_t)$$

# Example Models: Block Maxima

- For GEV:

$$p_t = 1 - \exp \left\{ - \left[ 1 + \xi \left( \frac{z_{q_0} - \mu(t)}{\sigma(t)} \right) \right]^{-1/\xi} \right\}$$

$$\mu(t) = \beta_0 + \beta_1 t; \sigma(t) = \sigma; \xi(t) = \xi$$

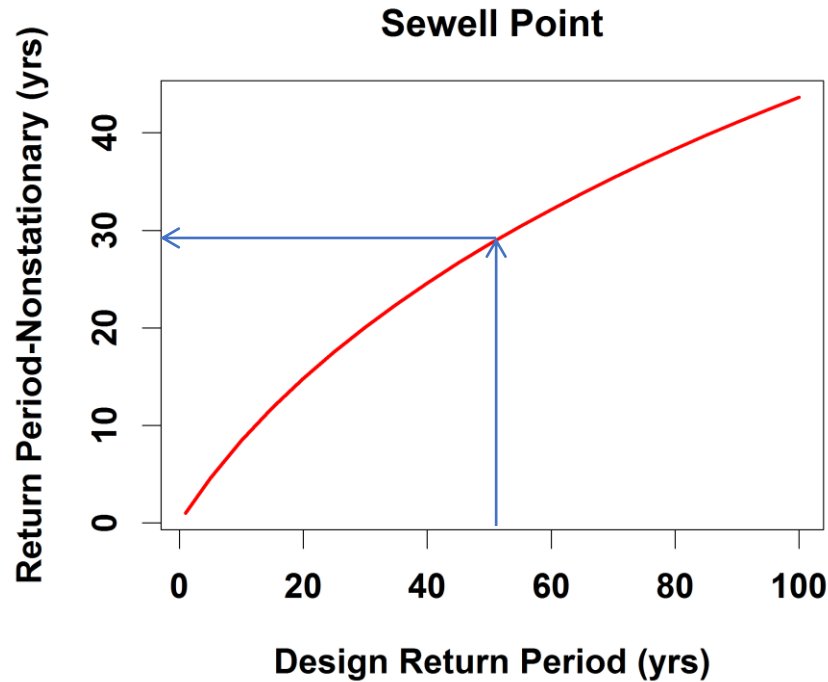
$$\mu(t) = \beta_0 + \beta_1 t + \beta_2 t^2; \sigma(t) = \sigma; \xi(t) = \xi$$

$$\mu(t) = \beta_0 + \beta_1 NINO3(t); \sigma(t) = \sigma; \xi(t) = \xi$$

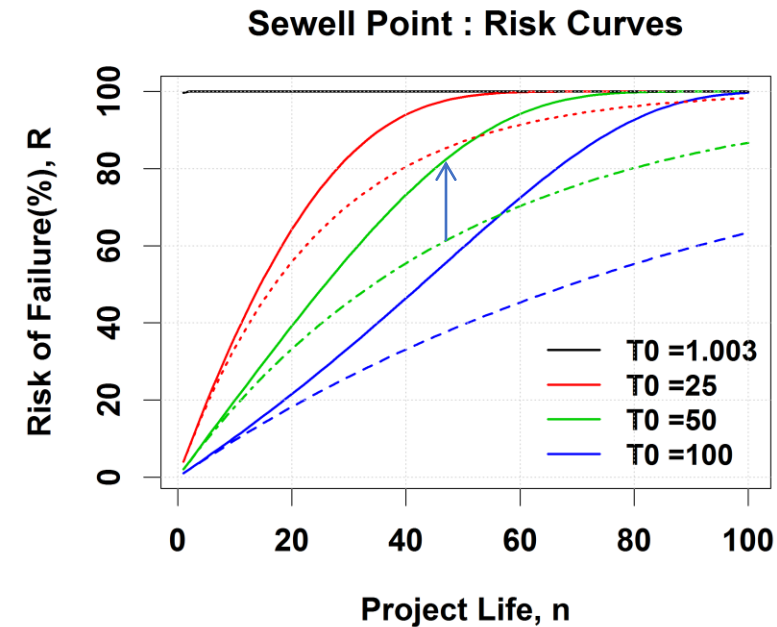
$$\mu(t) = \beta_0 + \beta_1 \cdot MSL(t); \sigma(t) = \sigma; \xi(t) = \xi$$



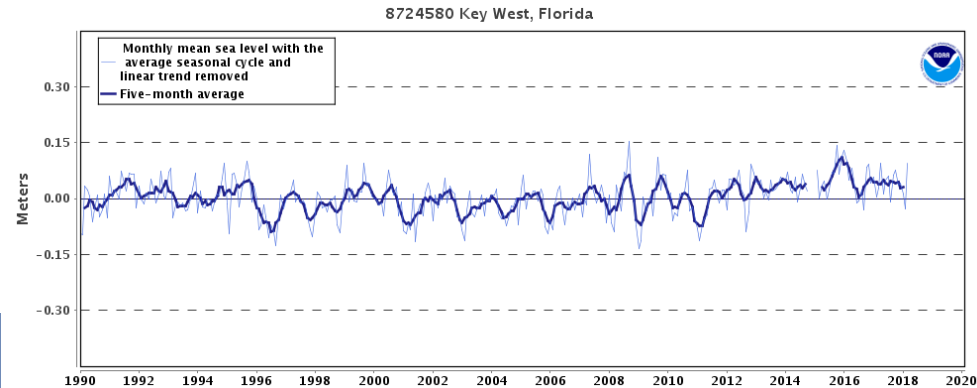
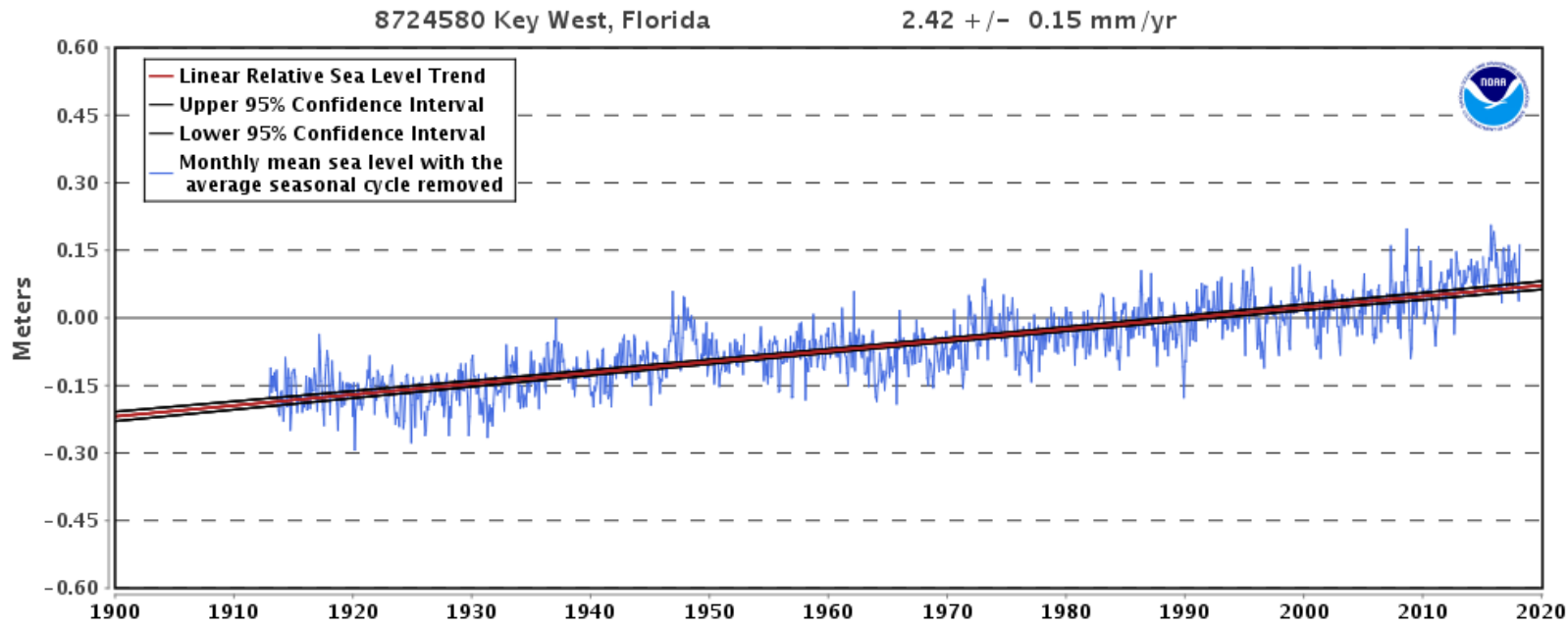
# Return Period (EWT) and Risk Curves for Sewell Point, VA



\* USACE Intermediate Scenario

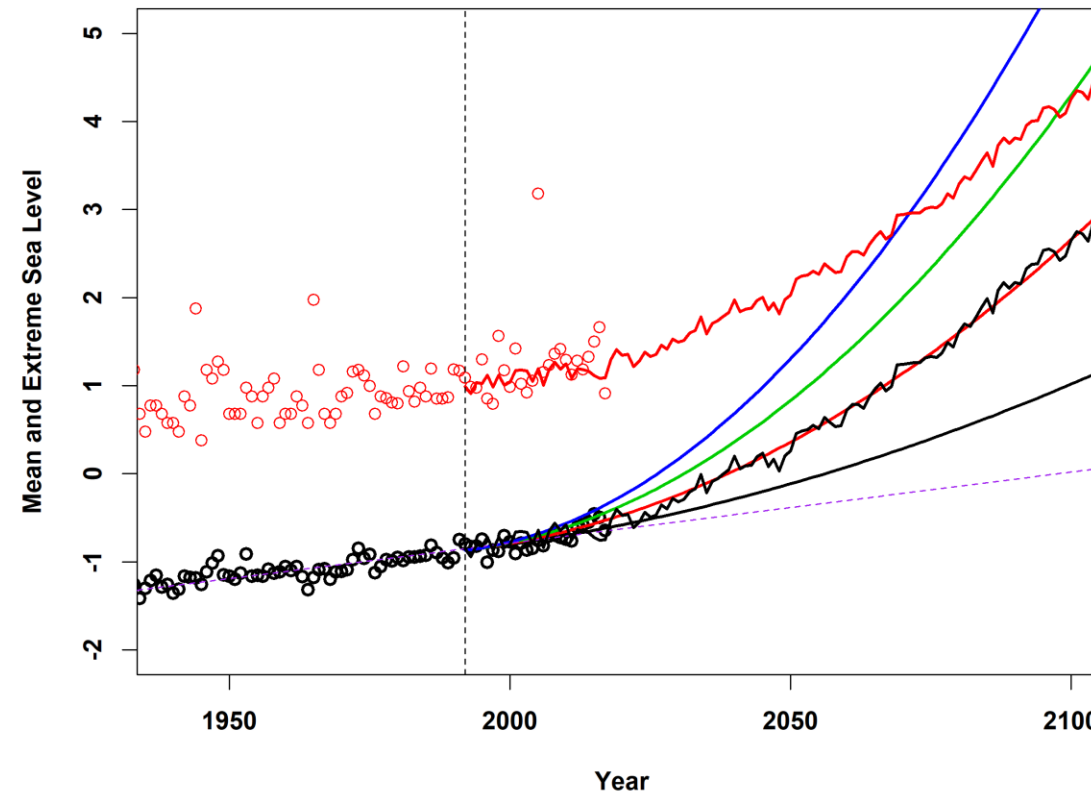


# Key West Florida: Systematic Trend & Natural Variability

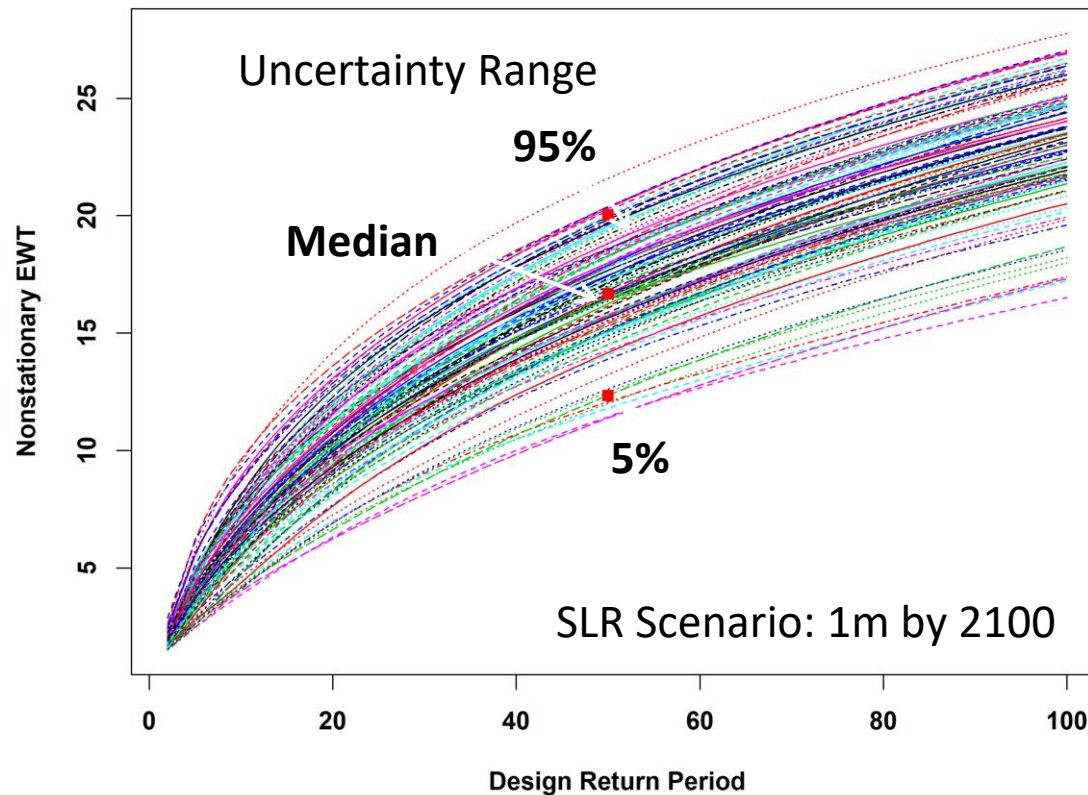




# Monte Carlo Simulation of Systematic and Natural Variability



# Probability Distribution of Expected Waiting Time



# **Empirical Simulation Technique: Monte Carlo Joint Probability Method**

- **Preparation of boundary conditions at Tidal Structure**
- **Short records (~30 years). LOS Project requires tailwater elevation (return levels) for return periods, 2,5,10,25,50, and 100 years under various SLR scenarios**
- **Traditional EV techniques are not appropriate due to short records**
- **EST method develop by Goring et al (2011)**

**Estimation of Extreme Sea Levels in a Tide-Dominated  
Environment Using Short Data Records**

D. G. Goring<sup>1</sup>; S. A. Stephens<sup>2</sup>; R. G. Bell<sup>3</sup>; and C. P. Pearson<sup>4</sup>



# MCJP Method

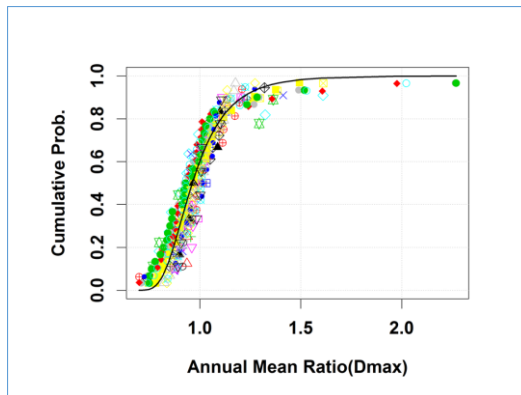
- **Decomposition of the observed water levels into constituent components:**
  - **Astronomical tide and its residual (Utide, Cordiga 2011)-> NTR**
  - **Storm Surge & Sea Level Variation (both mean and inter-annual)**
    - **Wavelet Decomposition (lower frequency band to extract mean sea level variation)**
    - **Residual subject to a second level of wavelet decomposition to extract Storm Surge Component**
    - **Remainder assigned to tidal residuals**
    - **$NR = MSLA + SS + TR$**

# MJCP Method (Cont.)

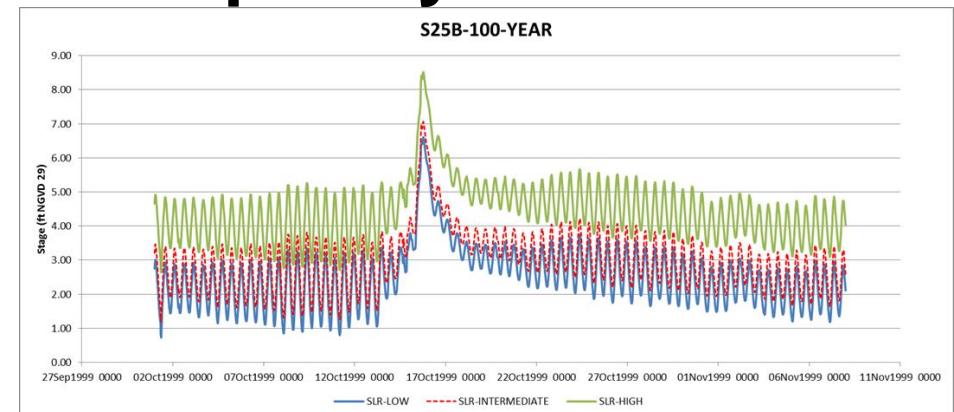
## Monte Carlo Simulation

- Simulate Tides, MSLA, SS, and TR in a Monte Carlo Framework
- 15,000 to 20,000 years of 706 per year (tidal peaks)
- Larger extremes simulated by replace one storm surge value with a value drawn from a regional frequency distribution

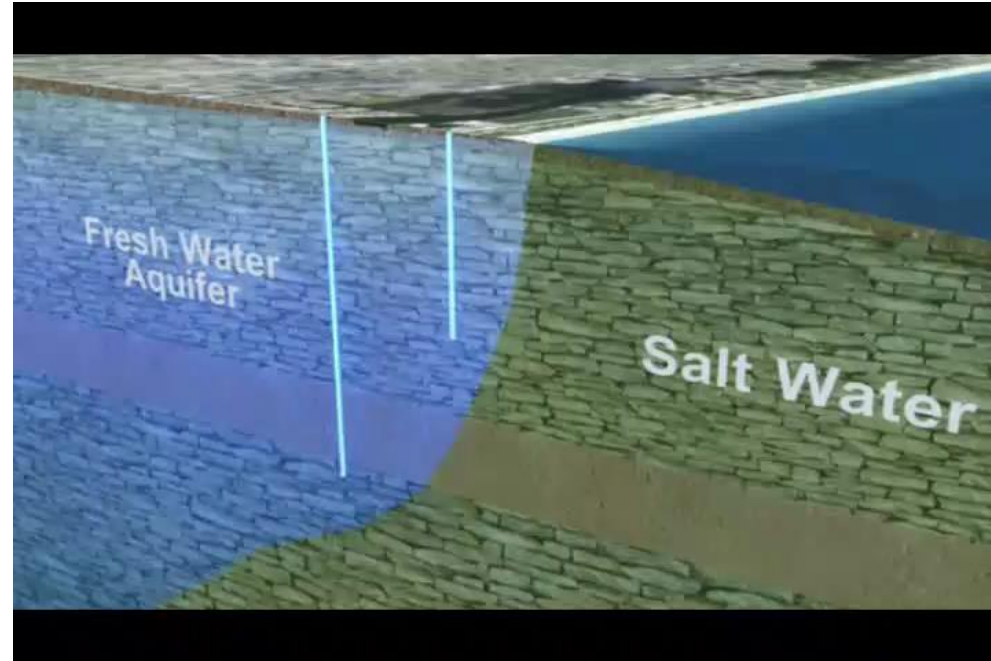
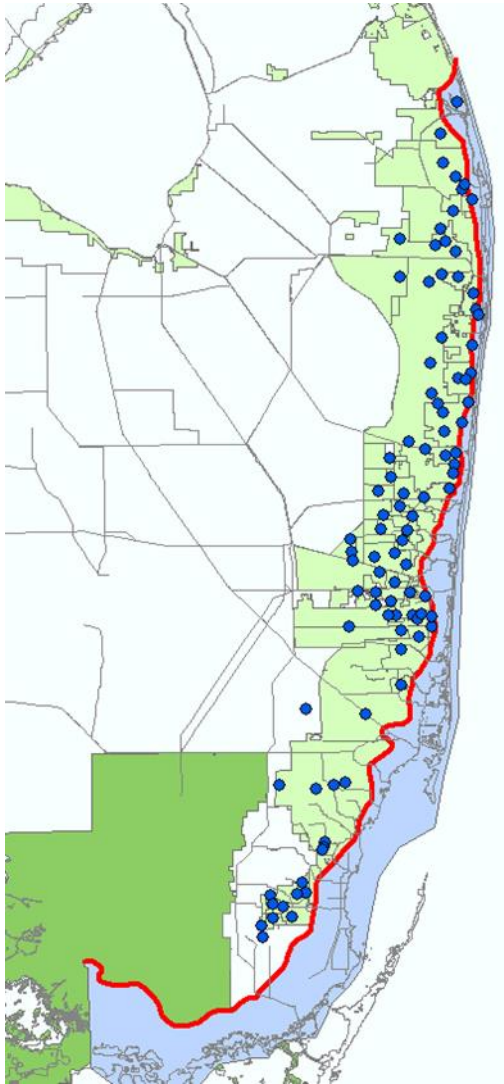
Regional  
Frequency  
Curve



Final  
Product

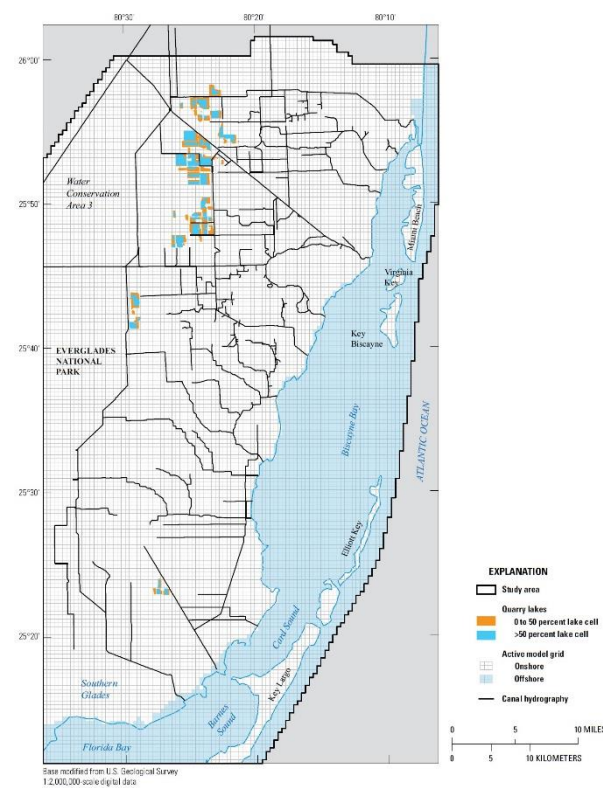
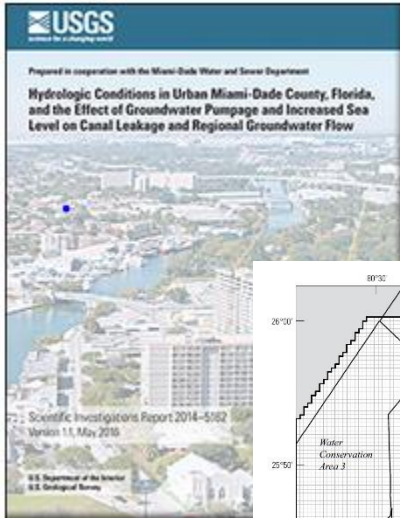


# Sea Level Rise & Saltwater Intrusion





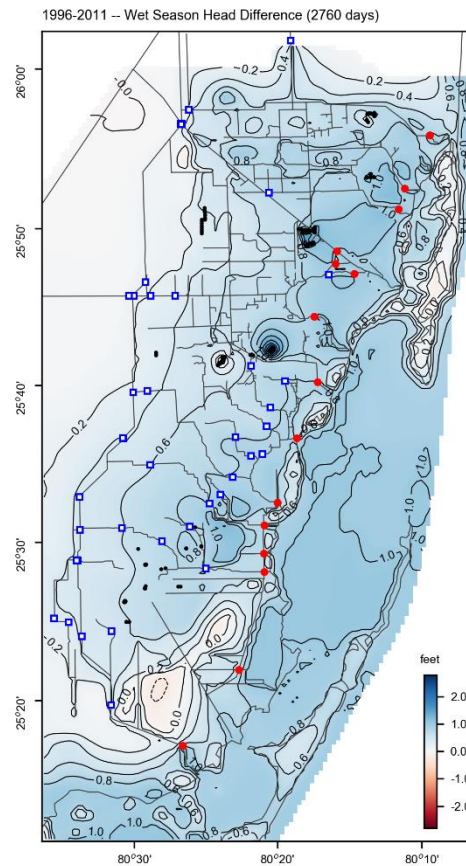
# Groundwater Modeling



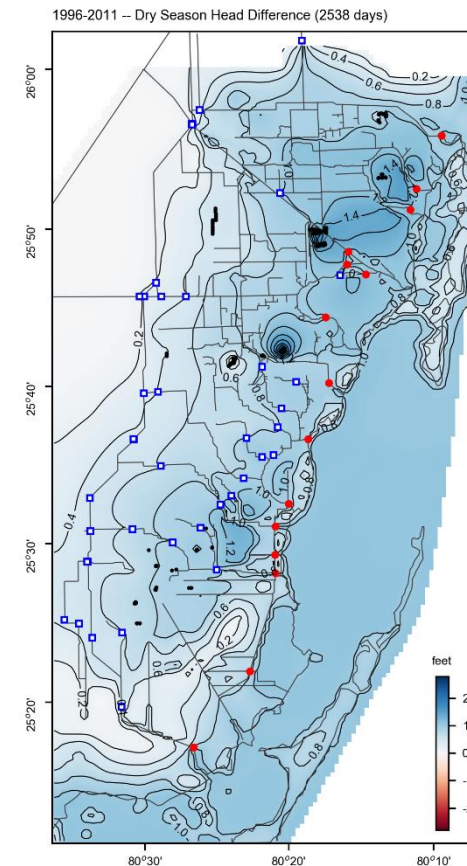
- Developed by USGS for Miami Dade Water and Sewer Department (WASD)
- Most comprehensive ground water model with surface water routing capabilities
- Many of the processes need to be partially or fully re-worked to simulate the distant future (2060-2069)

# Preliminary Look at Results (increase in Water Table Elevation)

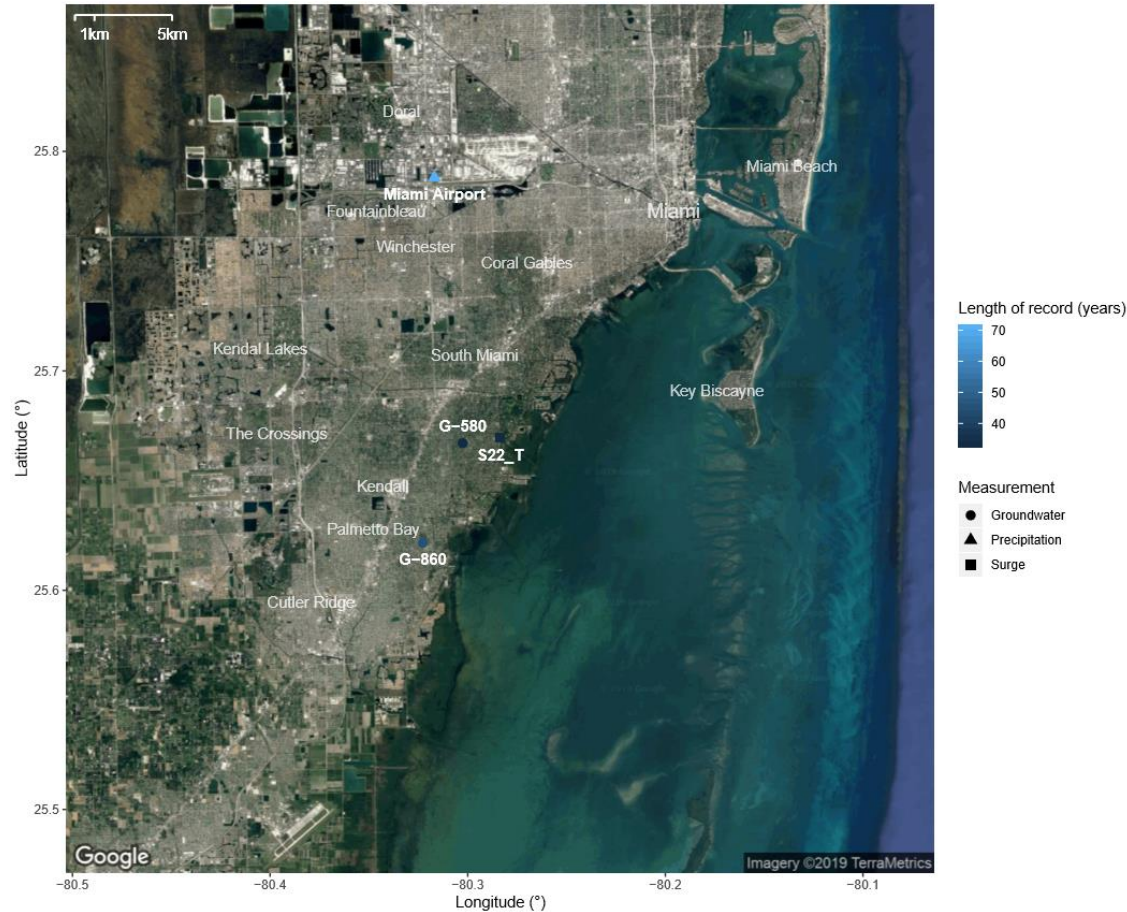
## Wet Season



## Dry Season



# Compound Flooding: Copula Approach (UCF funded by SFWMD)



## Rainfall:

Rain gauge at Miami Airport

## Surge:

Pumping station S22\_T

## Groundwater:

Well G-580 (& G-860)

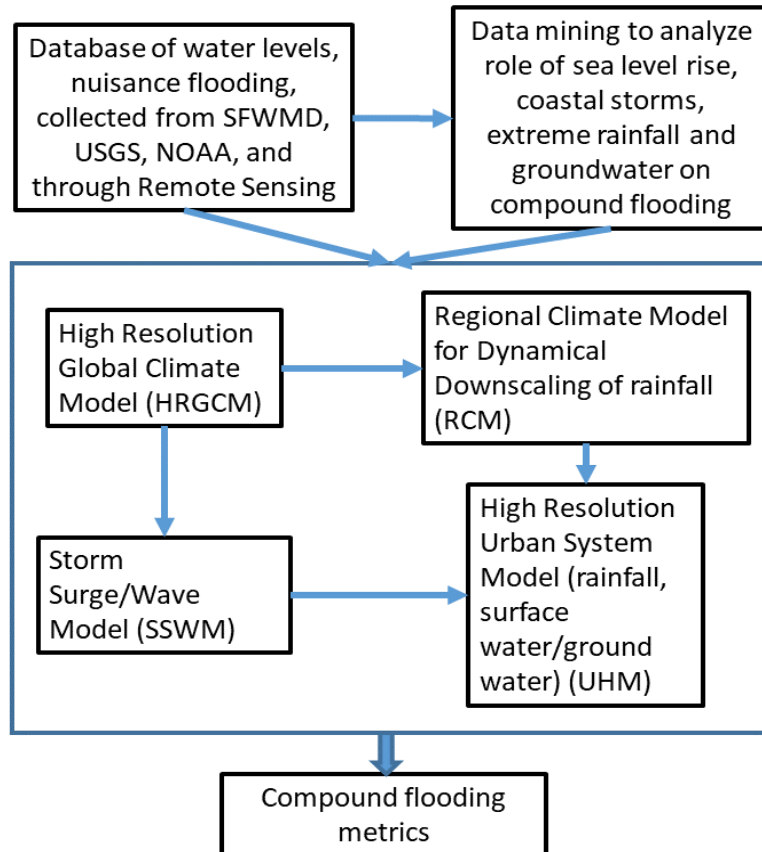
## Dependence structure

- Independent
- Trivariate Gaussian copula
- Vine copula
- Heffernan and Tawn (2004) model



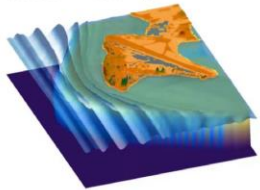
# Synthetic Events of Compound Flooding

□ **Compound Flooding** Hazards due to Sea Level Rise, Coastal Storms, and Extreme Rainfall



# Time-Varying Emulator for Short- and Long-Term Analysis of Coastal Flooding

Defining time-dependent hydraulic boundary conditions for the analysis of the climate variability of extremes of coastal flooding



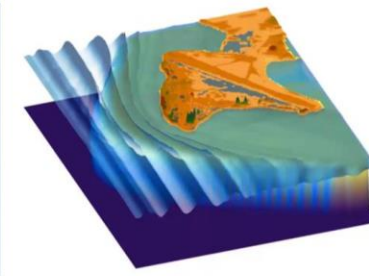
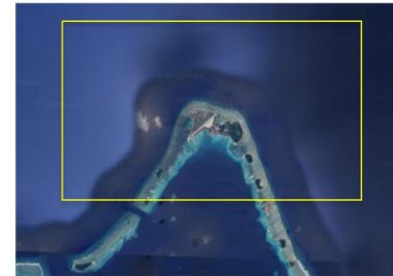
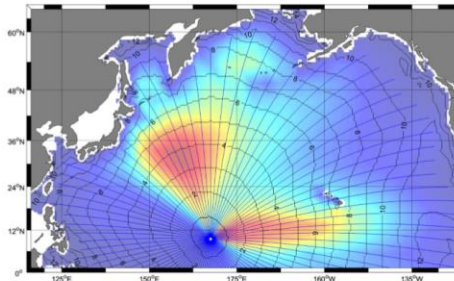
Fernando J. Mendez<sup>1</sup>, D. Anderson<sup>2</sup>, P. Ruggiero<sup>2</sup>, A. Rueda<sup>1</sup>, J. A.A. Antolinez<sup>1</sup>, L. Cagigal<sup>1</sup>, C. Storlazzi<sup>2</sup>, P. Barnard<sup>1</sup>

<sup>1</sup>Universidad de Cantabria, Spain  
<sup>2</sup>Oregon State University, Corvallis, OR, USA.

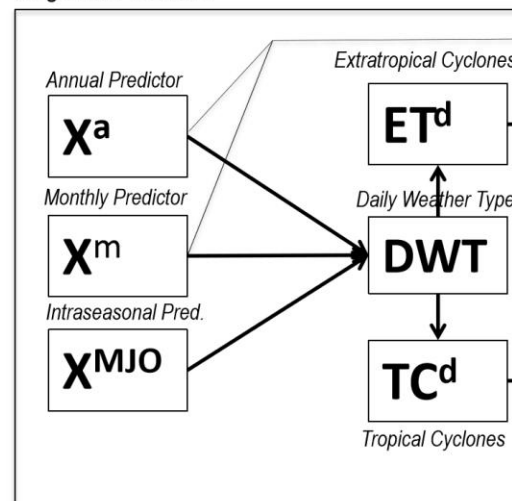


## Methodological Framework of TESLAFlood(\*)

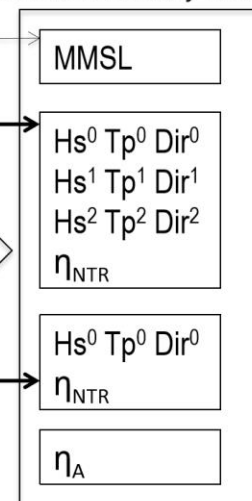
(\*) Time-varying Emulator for Short- and Long-term Analysis of coastal flooding



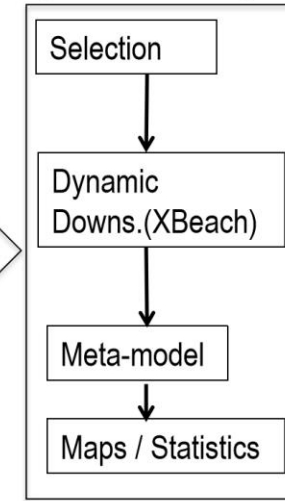
### Regional Predictor



### Hydraulic Boundary Cond.



### Hybrid Downscaling



### Developers:

#### Oregon State University

- Peter Ruggiero
- Dylan Anderson (PhD research)
  - Graduating soon)

#### University of Cantabria

- Fernando J. Mendez
- Ana Rueda
- Laura Cagigal

#### USGS

- Curt Storlazzi

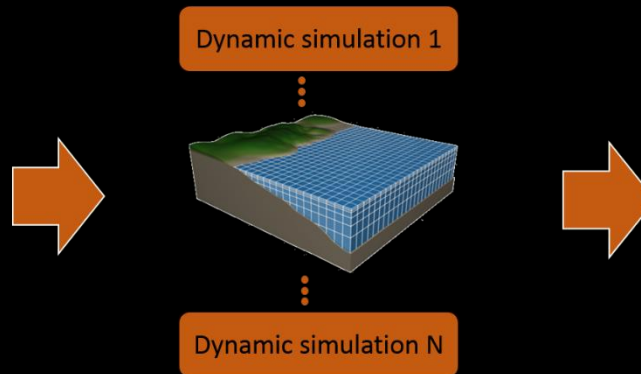
# Making a model of a model (surrogate, meta-model, emulator)

Inputs encompassing  
variability of total dataset

Case	dim1	dim2	dim3	...	dim21
#1	SLP <sub>1</sub>	Hs <sub>1</sub>	Tp <sub>1</sub>		M2 <sub>1</sub>
#2	SLP <sub>2</sub>	Hs <sub>2</sub>	Tp <sub>2</sub>		M2 <sub>2</sub>
#3	SLP <sub>3</sub>	Hs <sub>3</sub>	Tp <sub>3</sub>		M2 <sub>3</sub>
...					
#N	SLP <sub>N</sub>	Hs <sub>N</sub>	Tp <sub>N</sub>		M2 <sub>N</sub>

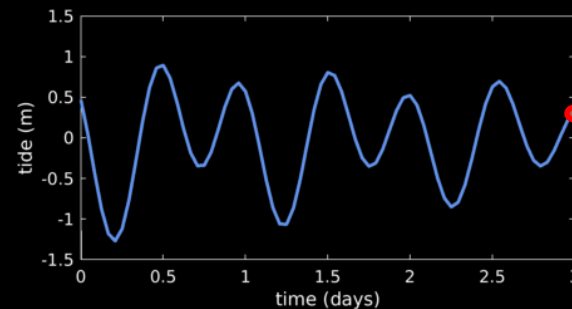
- MDA (Camus et al. 2011),
- Latin Hypercube (Parker et al. in review)

Develop a library of  
dynamic simulations

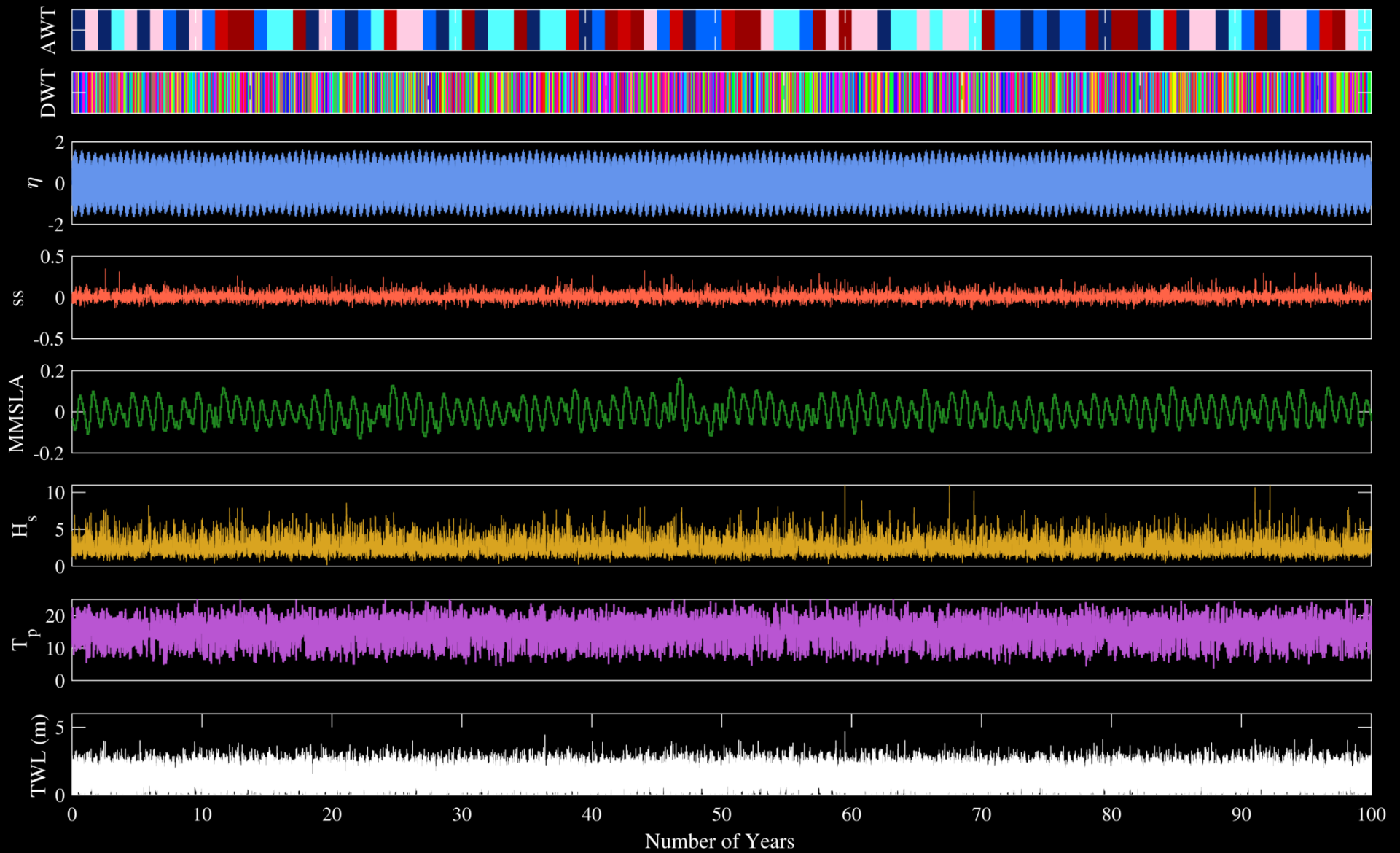


Surrogate model (interp.  
model of the model)

... “machine learning” ...  
Gaussian Process Reg.  
Neural Networks  
Radial Basis Functions  
Design Trees  
etc. etc.

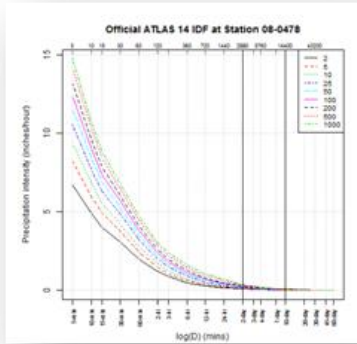


# San Diego Synthetic Record

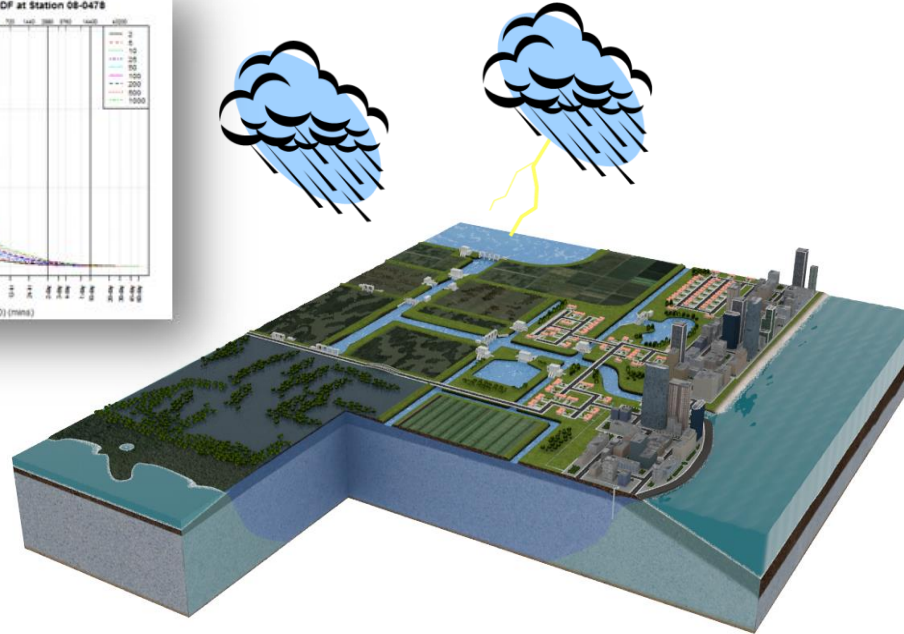




# Uncertainties in the Nonstationary Environment



Rainfall  
Extremes:  
IDF Curves



Future  
Storminess?

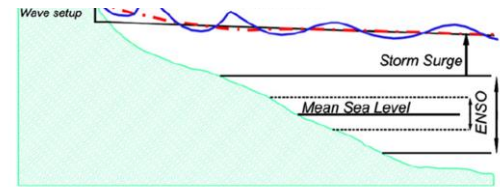
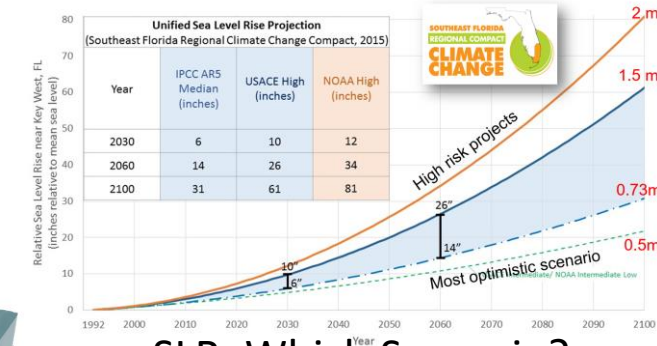
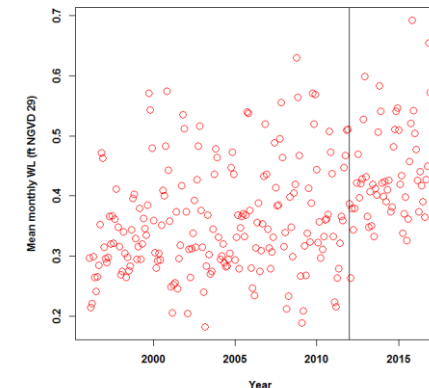


Fig. 2. Diagram illustrating the contributions to sea level due to tides, storm surge and wind-generated waves.



SLR: Which Scenario?



Gulf Stream  
Episodic?

# Dynamic Adaptive Policy Pathways (DAPP)

**Decisions are made over time in dynamic interaction with the system and cannot be considered independently.**

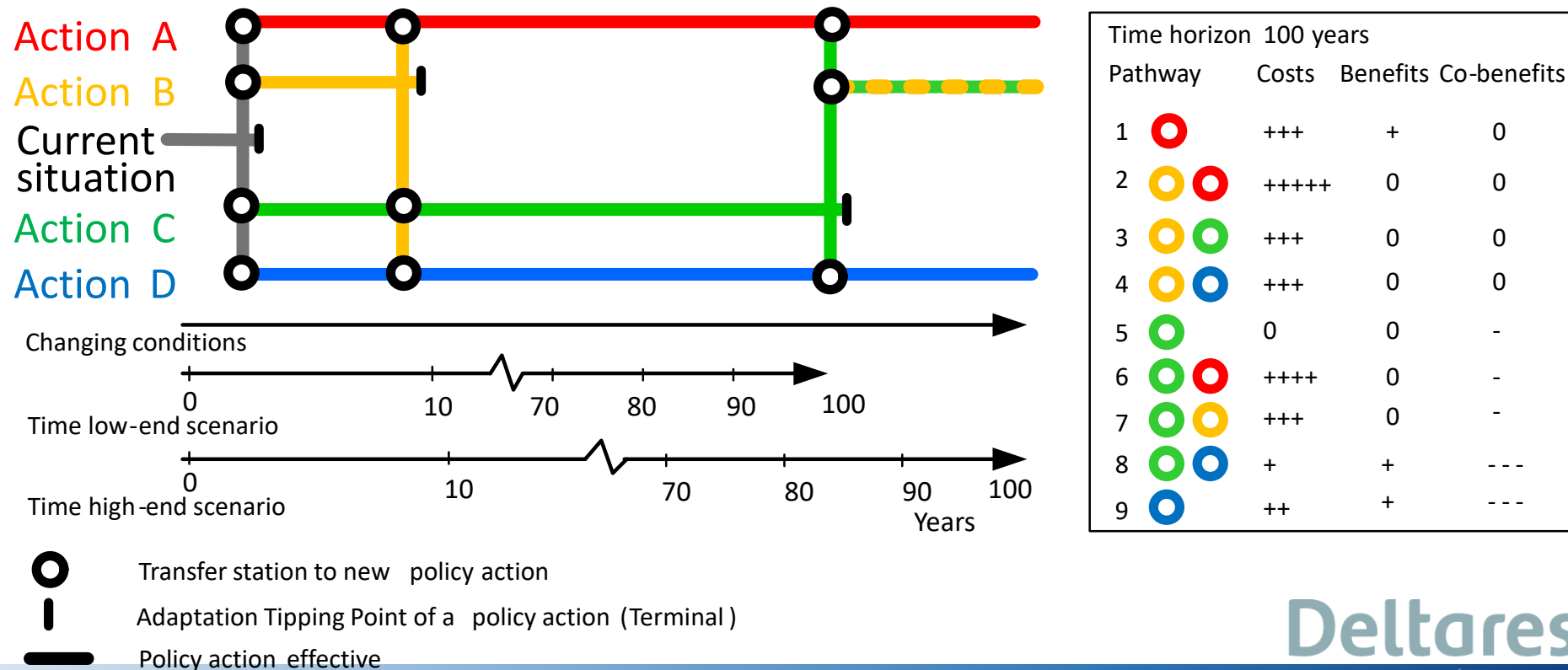
- An approach that explicitly includes decision making over time and sequences of decisions (pathways) under uncertainty.
- Supports planners to design a dynamic adaptive plans: short-term actions, long-term options, adaptation signals.

**“Different roads leading to Rome”**



# Adaptation Pathways

Adaptation pathways maps show **different possible sequences of decisions** to achieve objectives. A scorecard helps to evaluate the pathways and decisions.

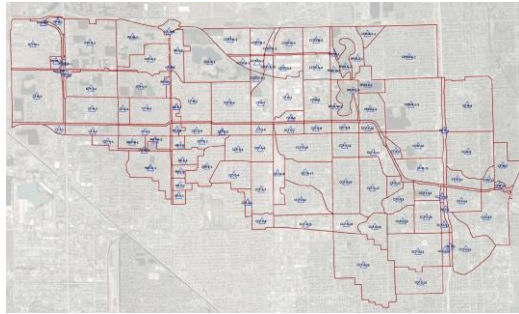


Deltares

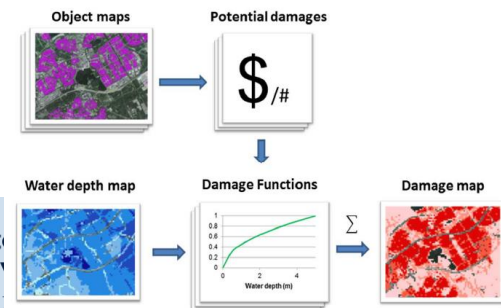
# Flood Risk Management in Miami-Dade County (with Deltares)

Hydrologic Drivers:  
Rainfall; Storm Surge  
Sea Level Rise

Hydrodynamic Model  
XPSWMM



Delft-FIAT damage model

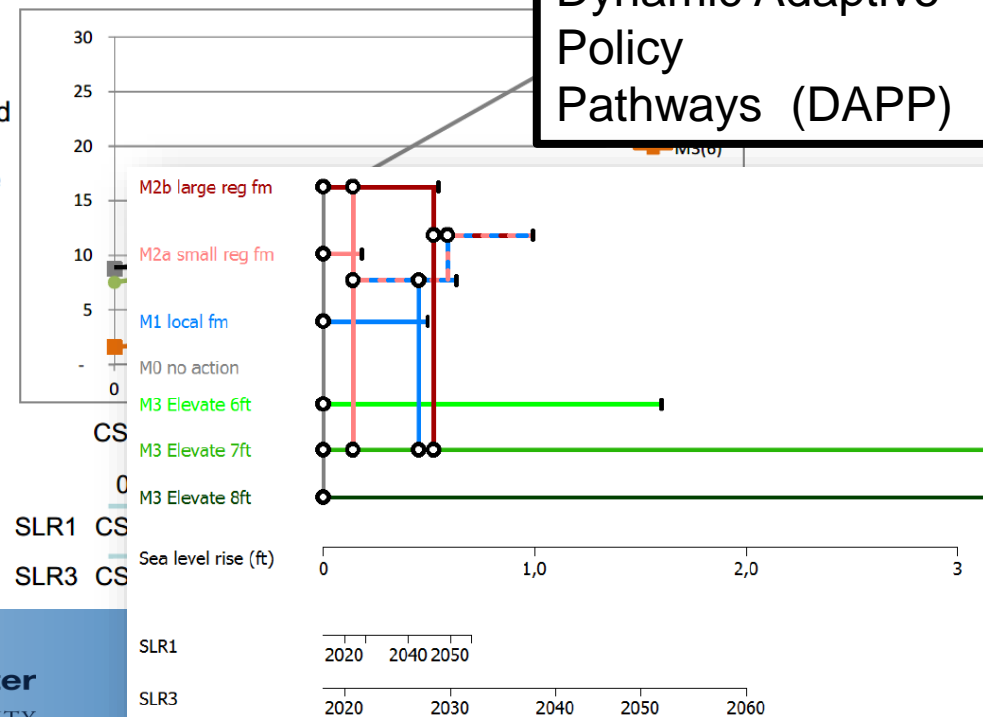


Adaptation Options:

- M1: Local Flood Mitigation (flood walls, pumps)
- M2: Regional Flood Mitigation (Forward pumping at outlet)
- M3: Land-use mitigation (elevate buildings, roads)

Dynamic Adaptive Policy Pathways (DAPP)

Expected Annual Damage (k\$)





# Questions?



# KEY Research papers

## Revisiting the Concepts of Return Period and Risk for Nonstationary Hydrologic Extreme Events

Jose D. Salas, M.ASCE<sup>1</sup>; and Jayantha Obeysekera, M.ASCE<sup>2</sup>



## Quantifying the Uncertainty of Design Floods under Nonstationary Conditions

Jayantha Obeysekera, M.ASCE<sup>1</sup>; and Jose D. Salas, M.ASCE<sup>2</sup>

J. Hydrol. Eng. 2014.19:1438-1446.

## Frequency of Recurrent Extremes under Nonstationarity

Jayantha Obeysekera, M.ASCE<sup>1</sup>; and Jose D. Salas, M.ASCE<sup>2</sup>

(paper published online: J. Hydrologic Engineering)

## Techniques for assessing water infrastructure for nonstationary extreme events: a review

J.D. Salas<sup>a</sup>, J. Obeysekera<sup>b</sup>, and R.M. Vogel<sup>c</sup> (Hydrological Sciences Journal)