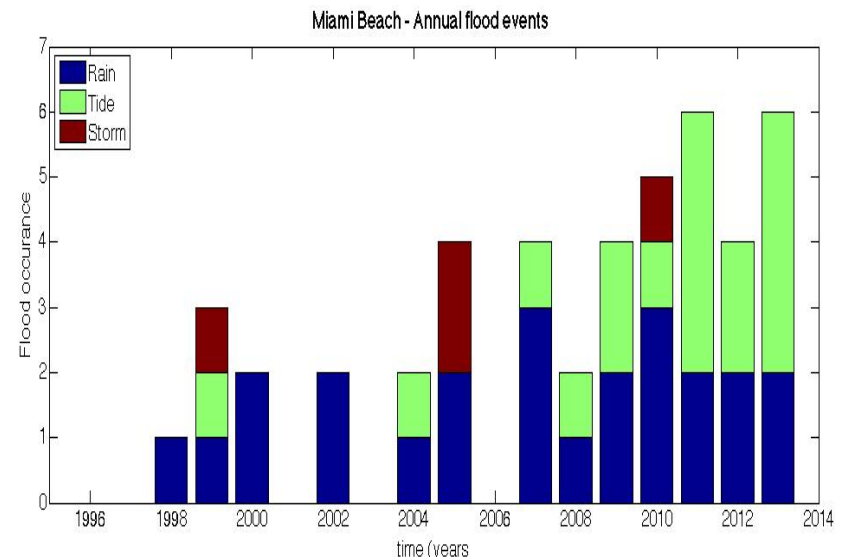


# Increasing flooding frequency in Miami Beach as an indicator for accelerating rates of sea level rise along the US Atlantic shores

Shimon Wdowinski, Ronald Bray, Ben Kirtman  
*University of Miami*



# Venice – Acqua Alta



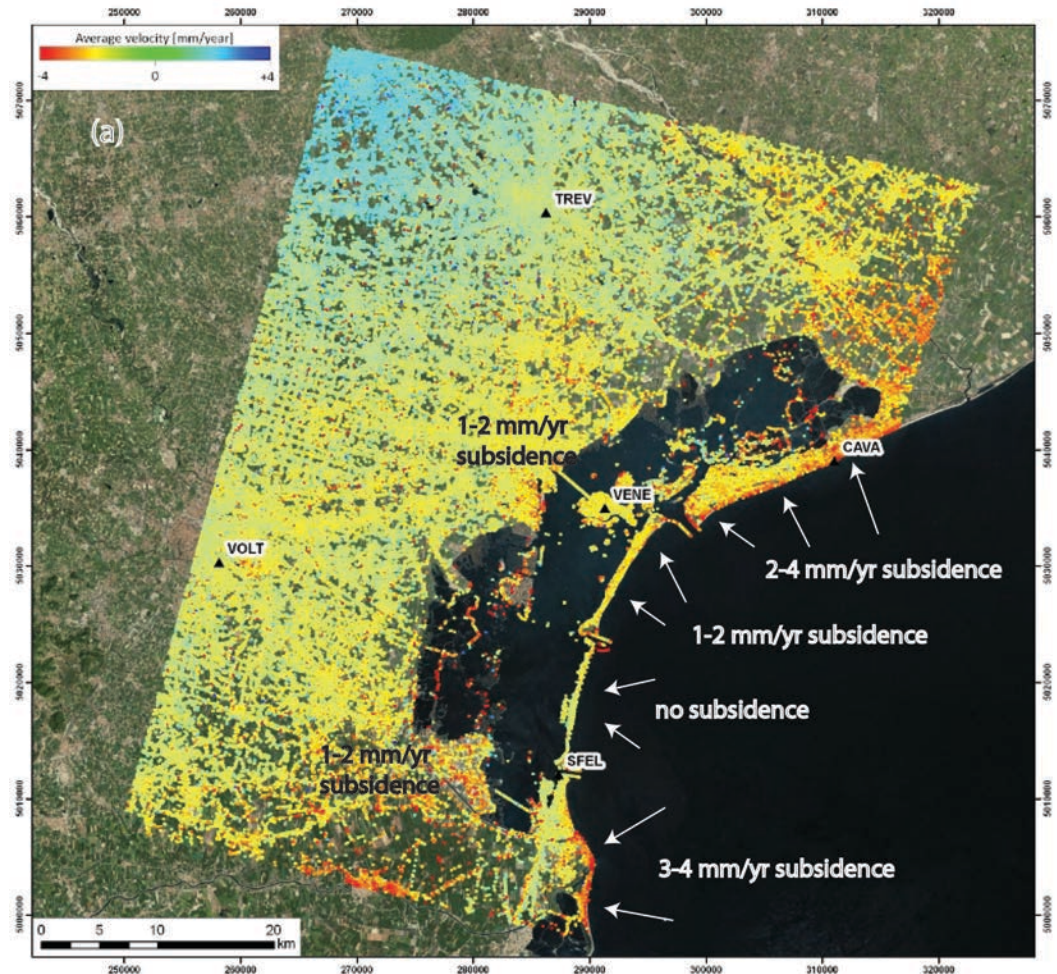
# Venice - subsidence

Recent subsidence of the Venice Lagoon from continuous GPS and interferometric synthetic aperture radar

Bock et al. (2012)

## Conclusion

Relative sea level rise in the city of Venice reflects both the effect of sea level rise and land subsidence.





October, 2015

# Sea Level Rise (SLR) in Urban areas

## How to quantify SLR?

Common method:

**Vertical changes in Mean Sea Level**

For example: In 2050, mean sea level in Miami Beach will be 50, 75, or 100 cm (2, 3, or 4 feet) higher than present.

My suggestion:

**Changes in flooding frequency**

For example: In 2050, Miami Beach will experience 30, 50, or 70 flooding events, compared with 2 events in 2008.



**We can already use flooding frequency to quantify current effect of SLR in Miami Beach.**

# Recurrence Flooding Miami Beach



## Flooding types/causes

- Rain
- Storm surge
- Tide
  - “Sunny Sky flooding”
  - “Lunar Flooding”

# Recurrence Flooding in Miami Beach

# Miami Herald

# Miami Beach

Select your community



Posted on 02.12.14

## Miami Beach to spend up to \$400 million to deal with flooding issues



409



Moses Schwartz calls a tow truck to retrieve his SUV on the 800 block of Alton Road in Miami Beach in October 2013. [Buy Photo](#)  
WALTER MICHOT / MIAMI HERALD STAFF

BY CHRISTINA VEIGA  
CVEIGA@MIAMIHERALD.COM

Miami Beach, which sometimes floods from the bay even on a sunny day, is taking major steps to stay dry, with commissioners voting Wednesday to factor in higher tides and sea levels when planning for city projects.

The move is expected to double to \$400 million the cost of keeping water out of Miami Beach's streets.

The city still isn't entirely sure how it will pay for the costly improvements, but hopes to tap into federal and state funds, grants and possibly borrow money against its utility accounts.

# Presentation content

- Introduction
  - Recurrence flooding in Miami Beach
- Quantifying flooding frequency
  - Data - tide gauge, rain, insurance claim, media reports
  - Cross-reference analysis
  - Results - Increase in flooding frequency
- Tide gauge data analysis
  - Best-fit analysis
  - Ensemble Empirical Mode Decomposition (EEMD)
  - Results – Accelerating rates of Sea Level Rise
- Implications
  - Previous periods of accelerated rates
  - Possible causes
- Summary
- Acknowledgments

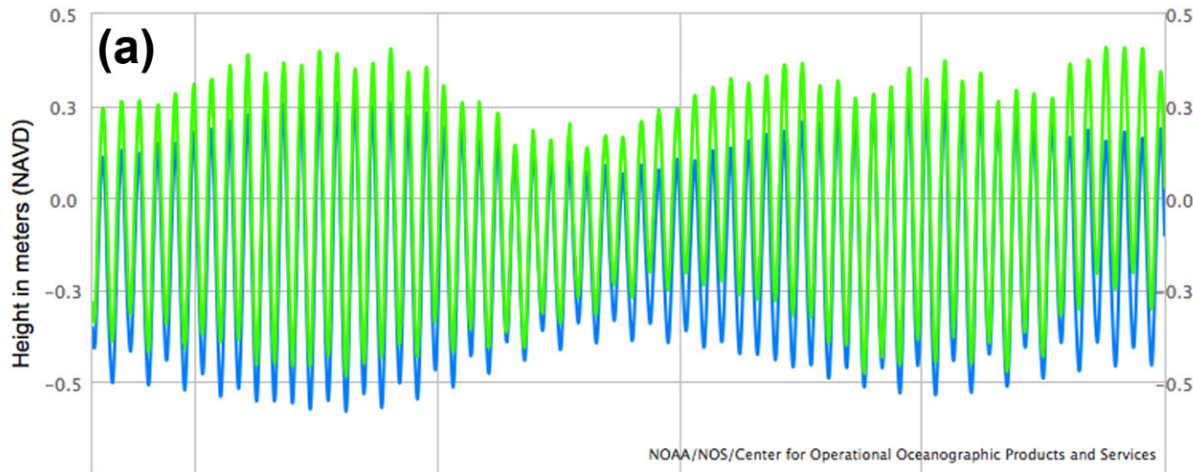


# Data

- Tide gauge (Virginia Key)
- Rain gauge (RG)
- Media reports
- Insurance claims
- Miami Beach documentation

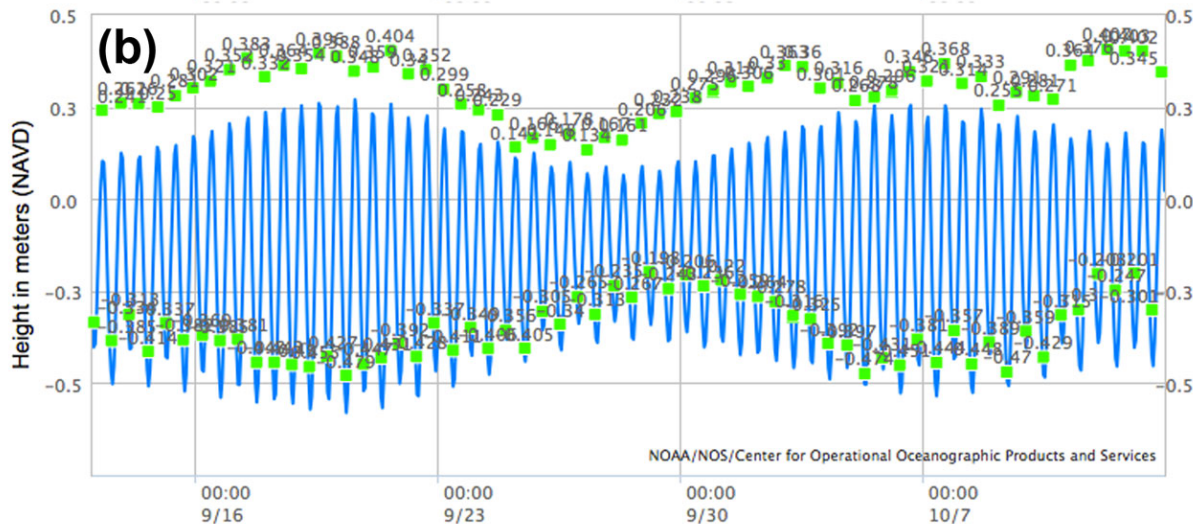


# Virginia Key tide gauge record



**Observed values:**  
Sampling rate  
(6 minutes)

**Datum:** NAVD



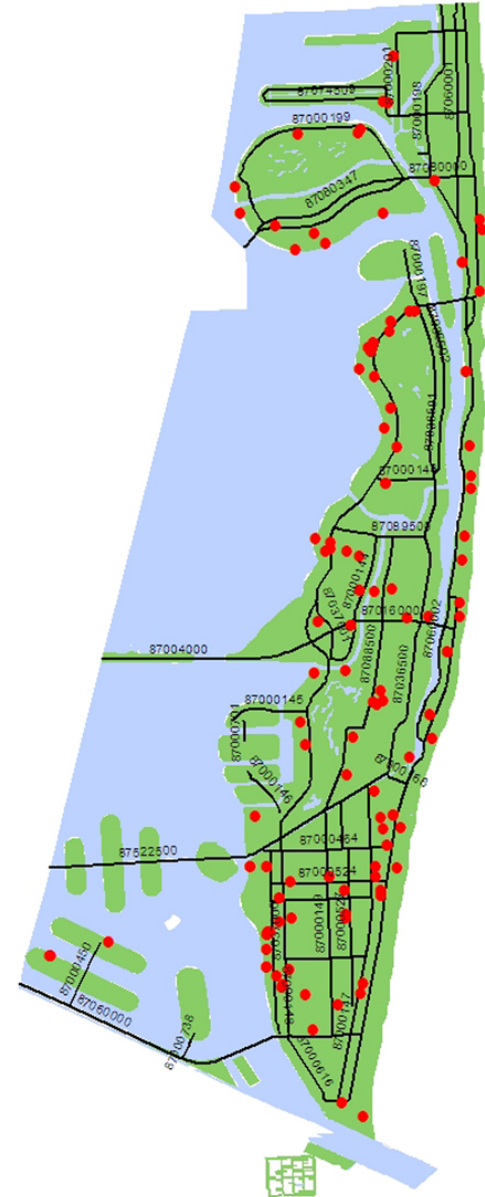
**Observed values:**  
HH – Daily highest  
H – Daily other tide  
LL - Daily lowest  
L – Daily other tide

— Predictions ■ Verified — Preliminary

Observation period: 9/13/2013-10/13/2013

# Insurance claim record

- Insurance companies are required to report FEMA on all flooding claims.
- FEMA shares the flooding claim dataset with counties.
- Miami-Dade County's Public Works and Waste Management office provided us a subset of the dataset containing locations and times of claims. (Other claim details are considered private information.)



# Media reports

## Lunar Flooding on Miami Beach is Loony

by [TONY GARCIA](#) on [SEPTEMBER 17, 2009](#) · [6 COMMENTS](#)

## Why Belle Isle and South Beach flood without rain

Posted on [October 9, 2010](#) | [6 Comments](#)

## Miami Flooding Getting Worse With Sea-Level Rise

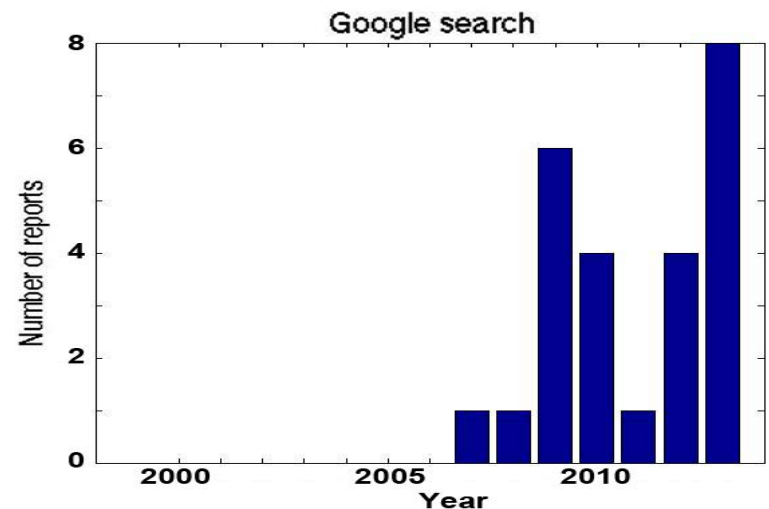
Sun Sentinel | By [KEN KAYE](#)

Posted: 10/17/2013 8:00 am EDT | Updated: 10/18/2013 8:04 am EDT

## High Tide Causes Street Flooding in Portions of Miami Beach, Broward

Flooding affected Alton Road and West Avenue on South Beach and Cordova Road in Broward.

By [Laura Rodriguez](#), [Alexandra Leon](#) and [Adam Berg](#) | [Friday, Oct 18, 2013](#) | Updated 1:15 AM EST



# Other data

- Rain gauge – time series
- Miami Beach documentation
  - Pictures with time and location of flooding events

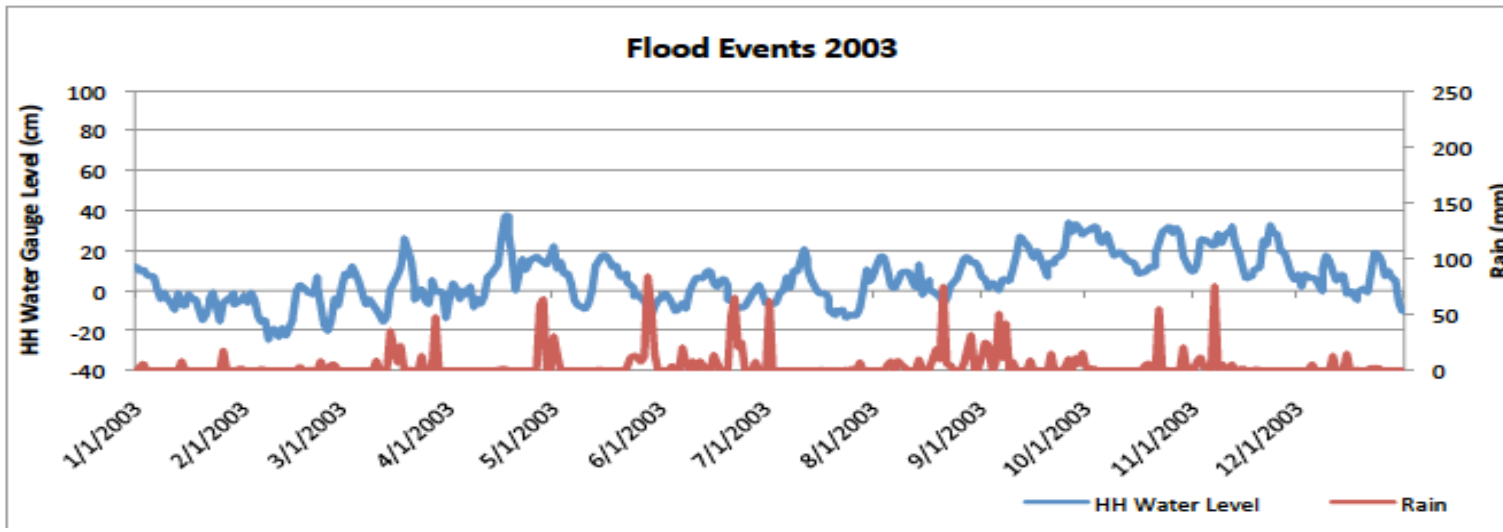


10-11-11 High Tide (Alton & 5)

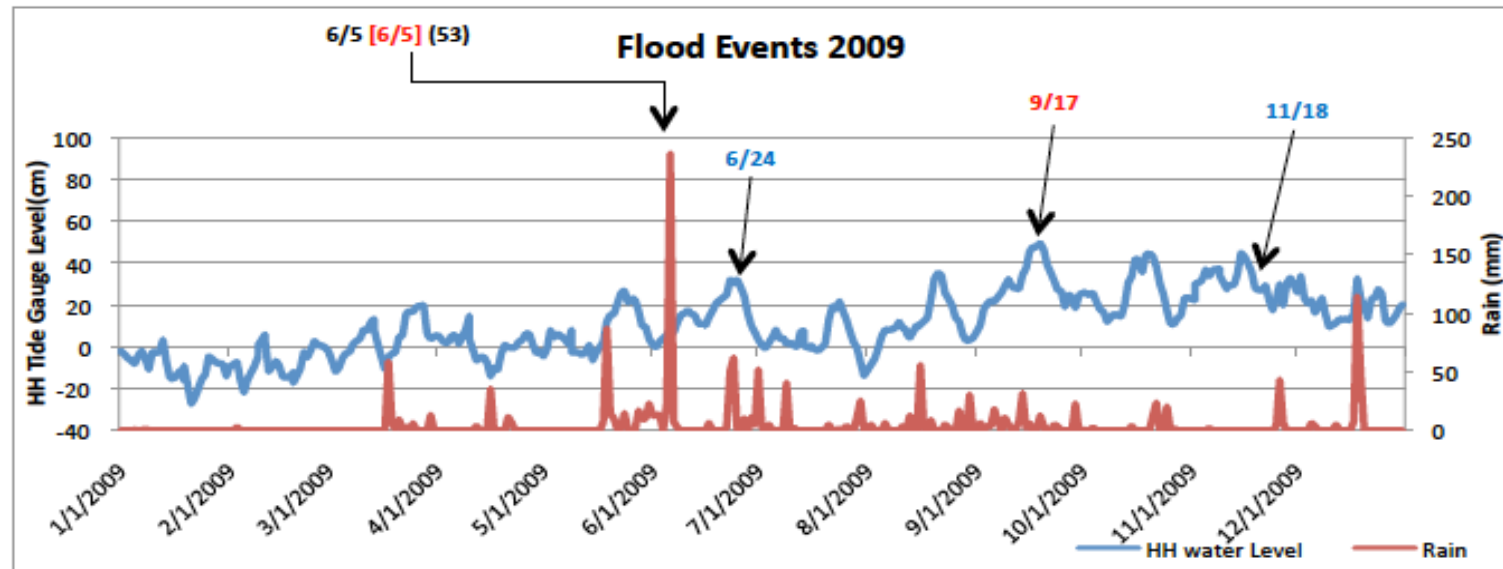


9-26-11 Rainfall (Alton & 9)

# Cross-reference analysis



No  
flooding  
events



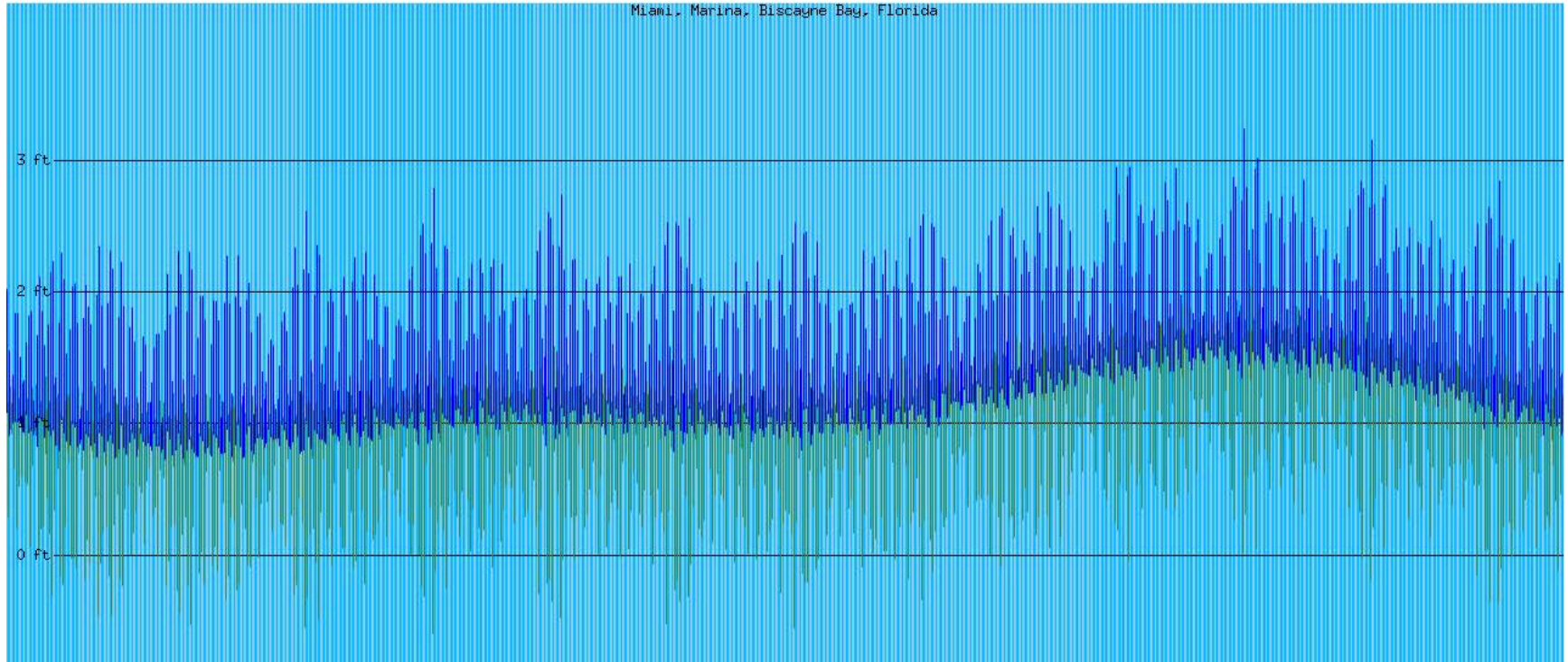
Four  
flooding  
events:  
6/5 – Rain  
6/24 - Rain  
9/17 - Tide  
11/18 - Tide

Black text – Insurance claims    Red text – Media reports    Blue text – Miami Beach documentation

# Predicted astronomical tides

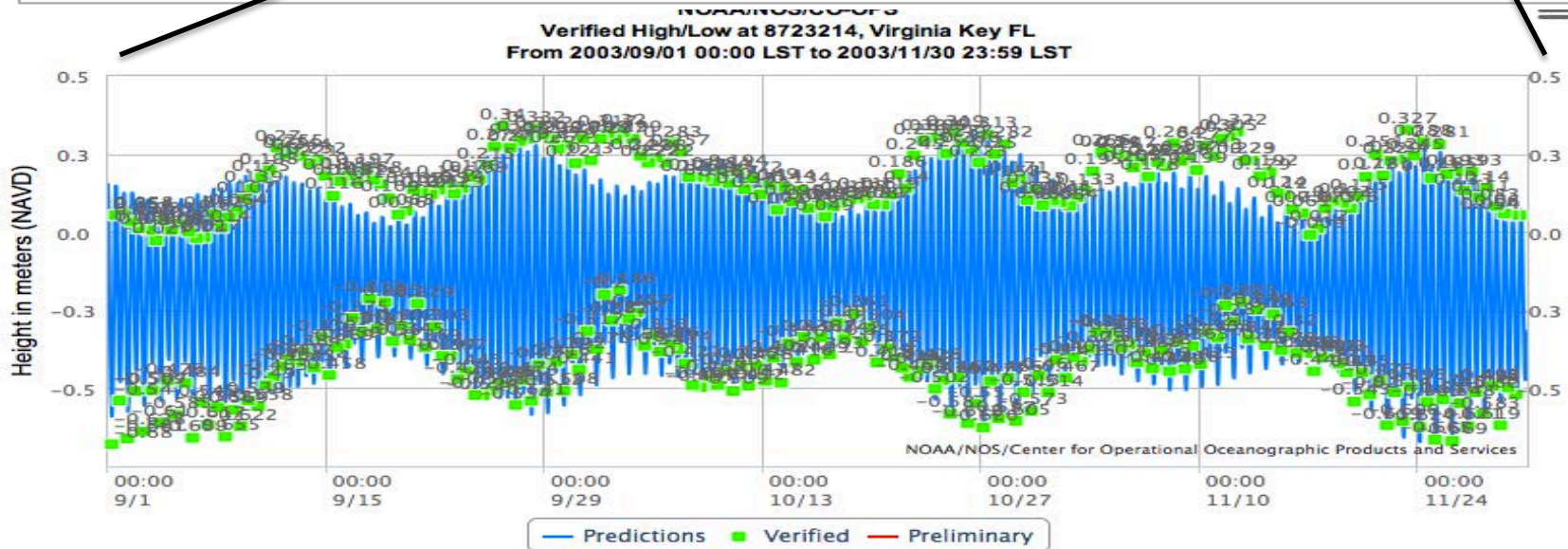
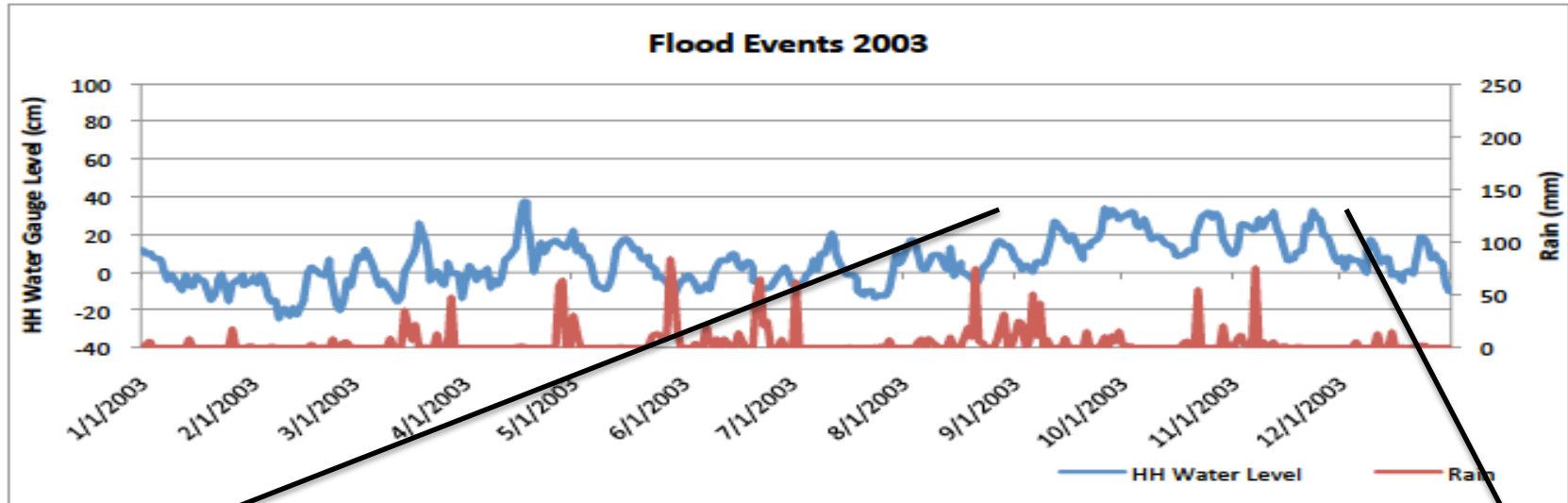
Miami, Marina, Biscayne Bay, Florida

13 January 2012 - 1 January 2013



- High tide level around the fall equinox (September-October)
- Secondary high tide level around the spring equinox (March)

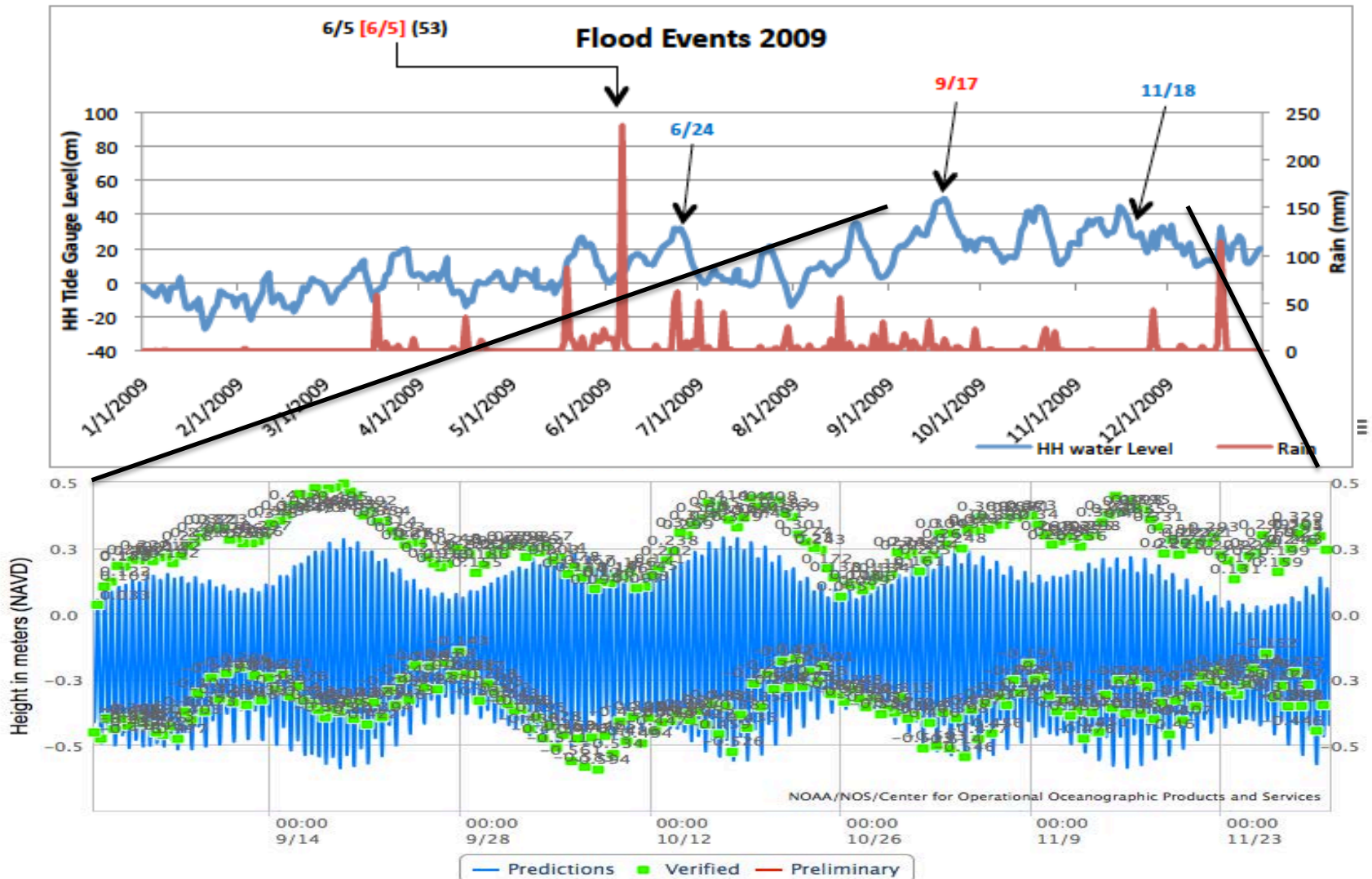
# Virginia Key tide record -2003



- Observed levels are similar to the predicted levels for the months of September - November

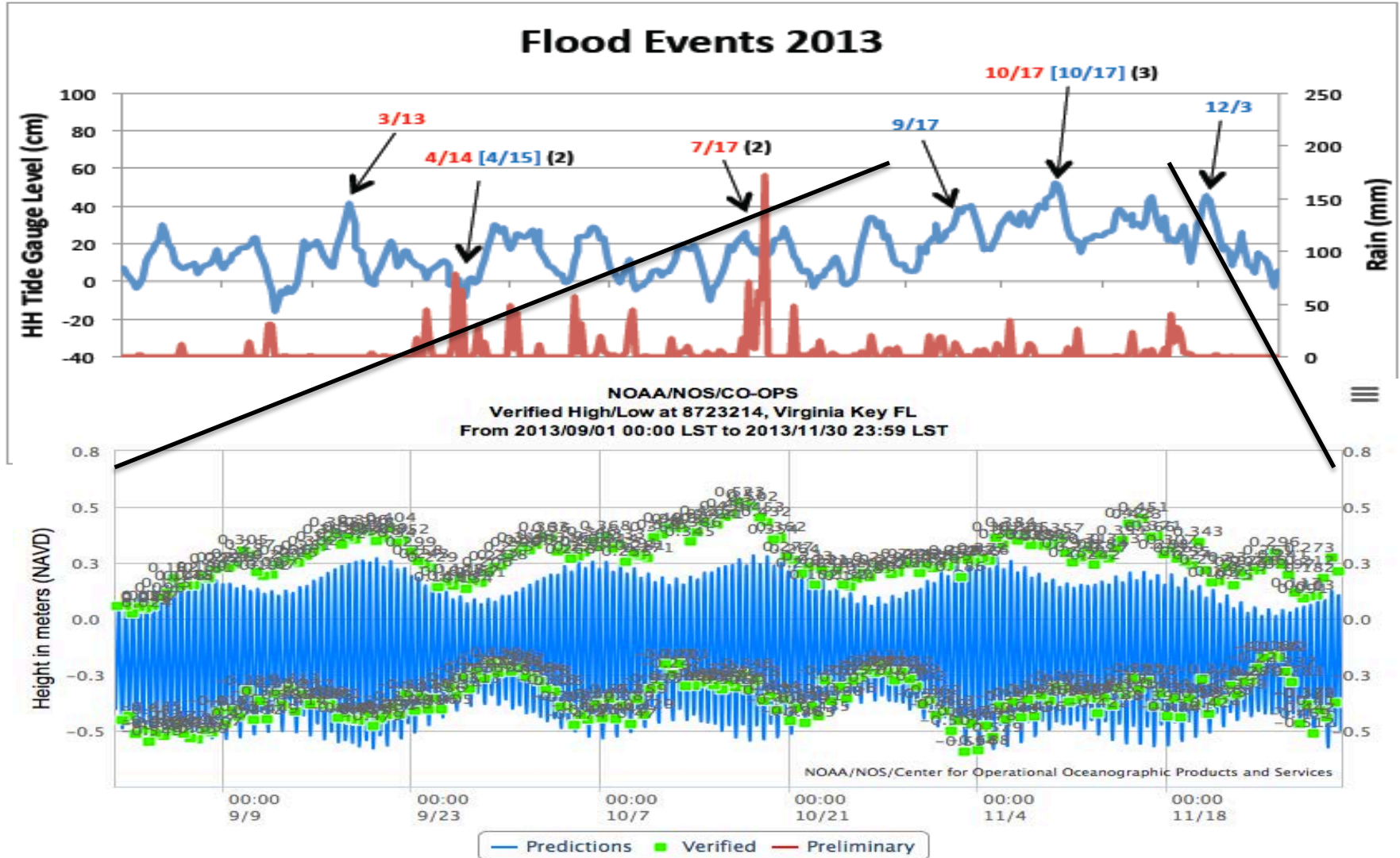


# Virginia Key tide record -2009



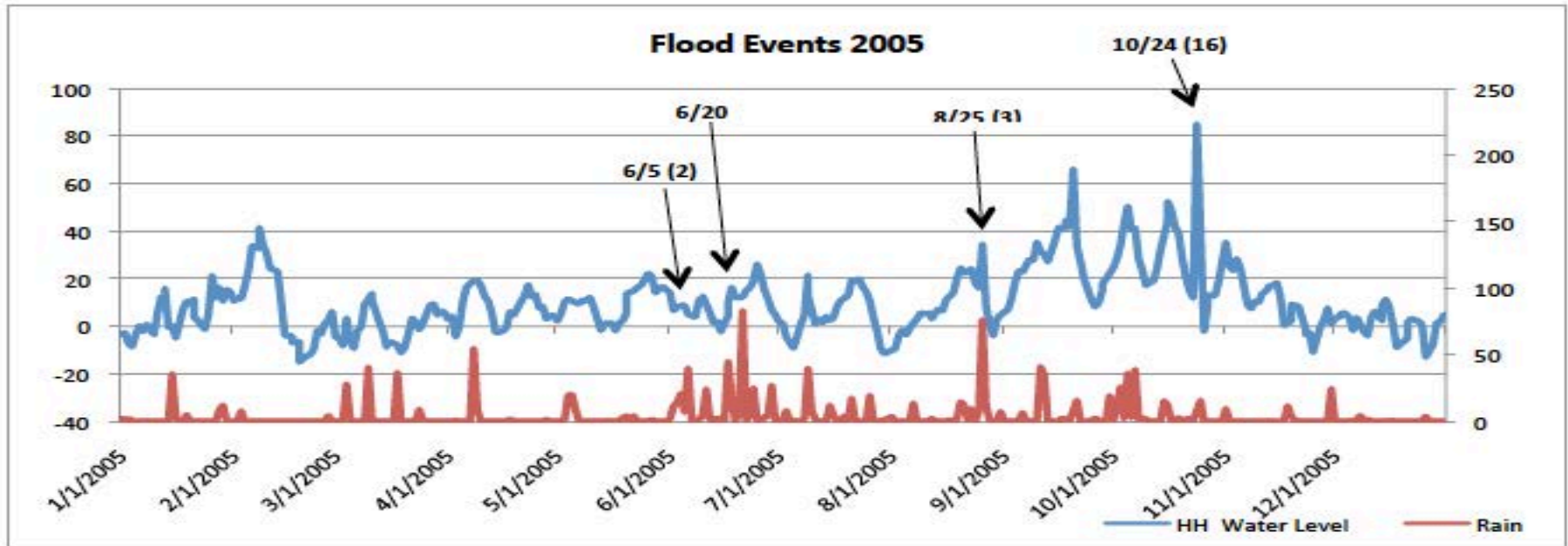
- Observed levels are systematically higher than predicted levels for the months of September - November

# Virginia Key tide record -2013



- Observed levels are systematically higher than predicted levels for the months of September - November

# Virginia Key tide record -2005



Hurricane (surge) induced flood events - multiple claim records

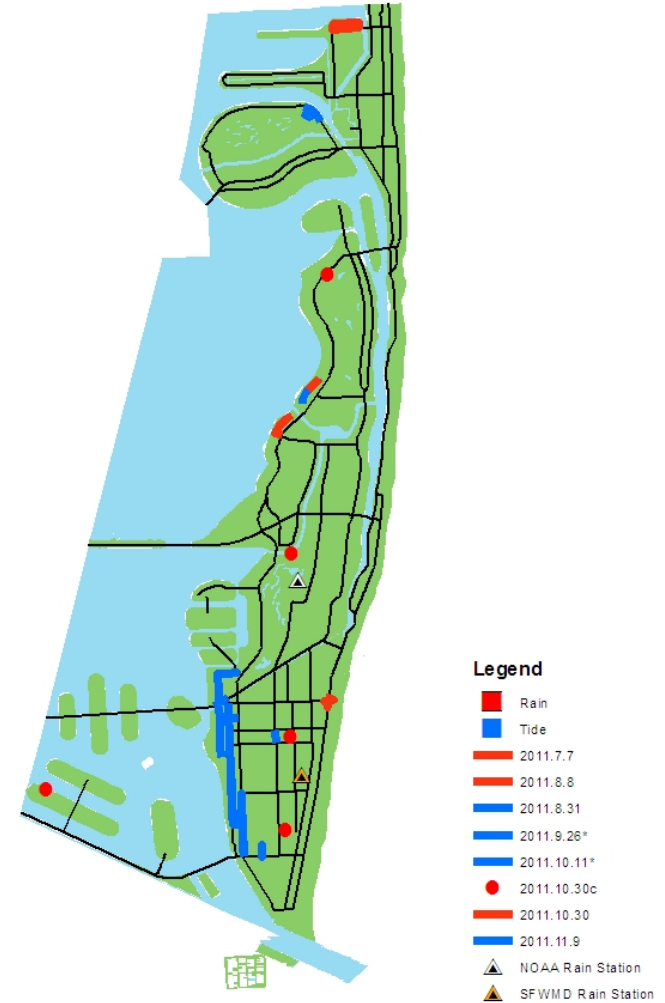
- Katrina – 8/25
- Wilma – 10/24

# Miami Beach flooding

Miami Beach Flood Events 2005

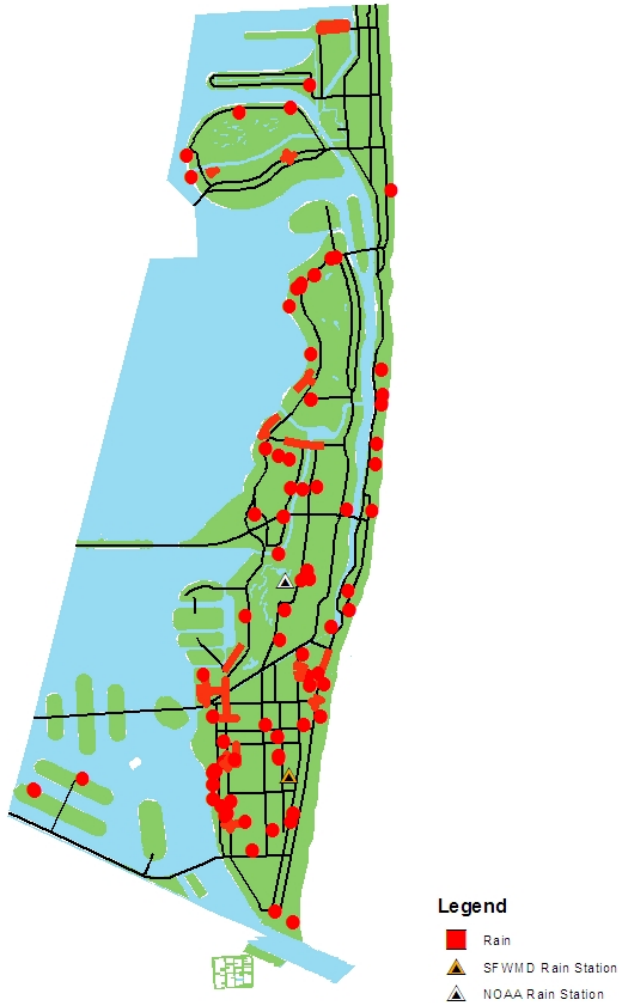


Miami Beach Flood Events 2011

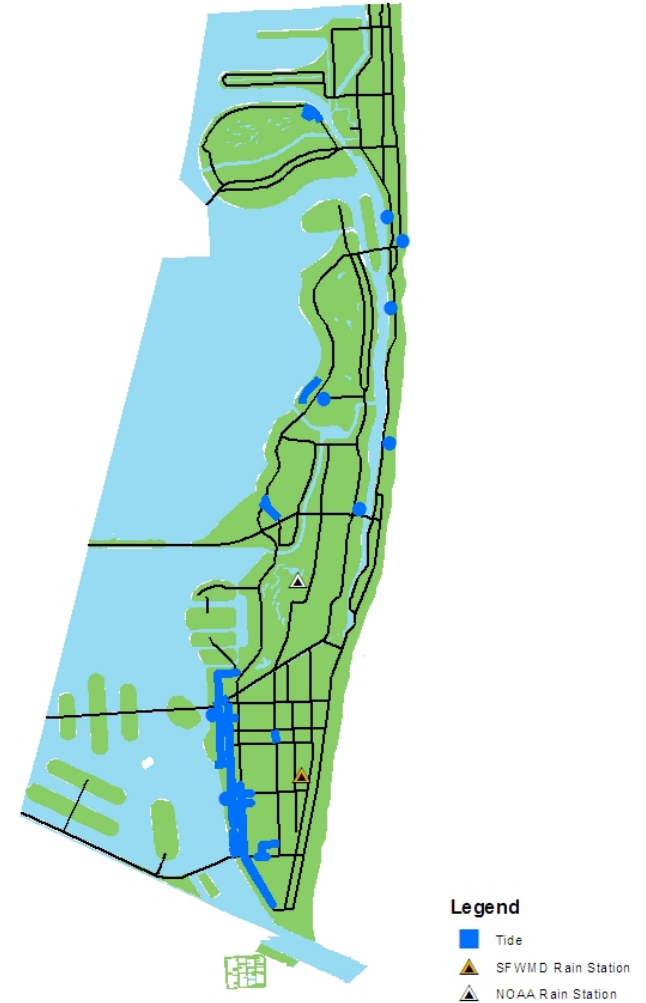


# Miami Beach flooding

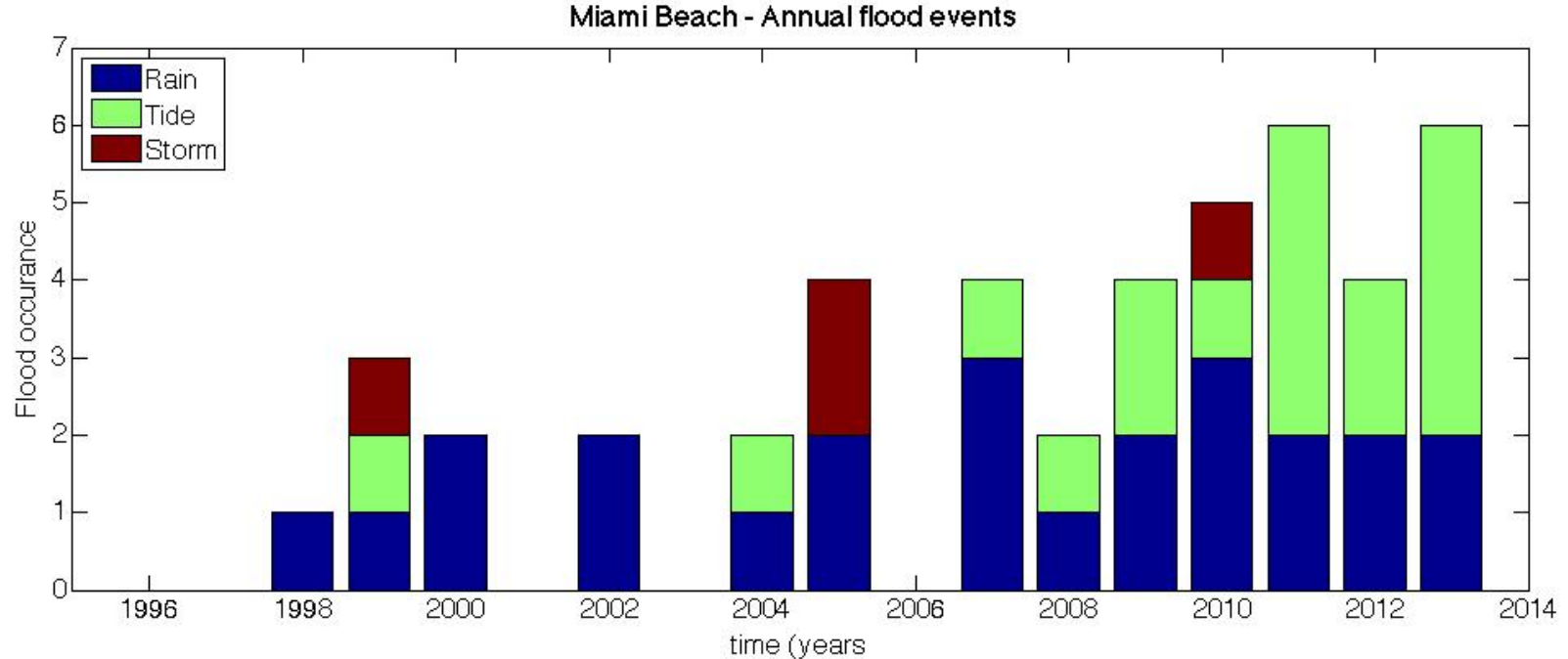
Miami Beach Rain Events 1998 - 2013



Miami Beach Tide Events 1998 - 2013



# Miami Beach flooding frequency



## Flooding frequency

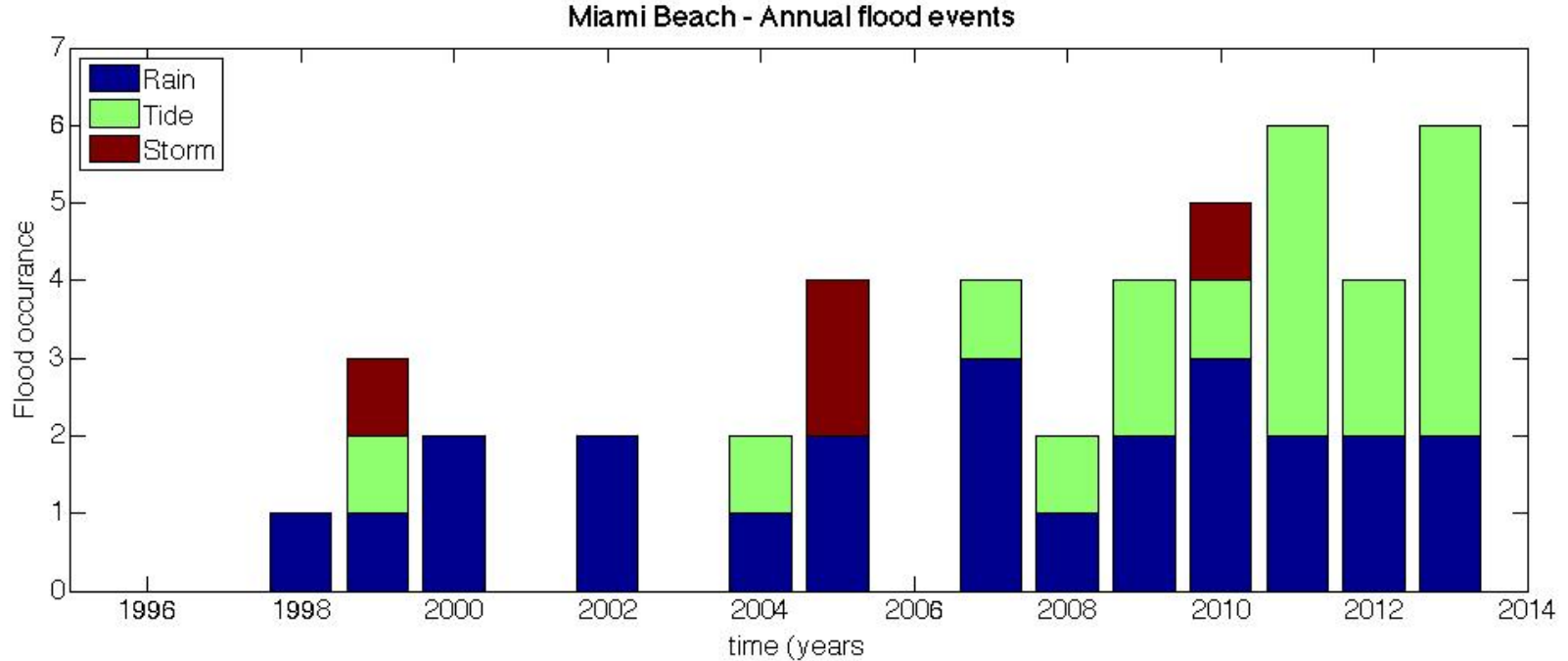
### • Rain induced events

- 1998-2006 – Average of 1 event per year (9 events in 9 years)
- 2007-2013 – Average of 2 events per year (15 events in 7 years)

### • Tide induced events

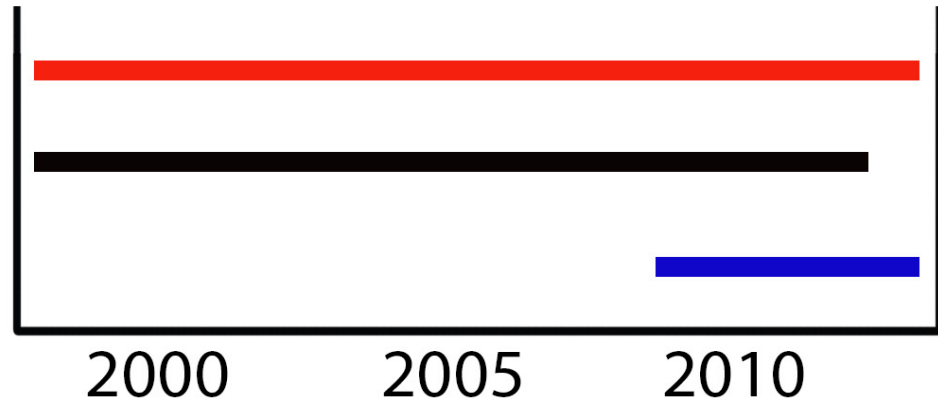
- 1998-2006 – Average of 0.2 events per year (2 events in 9 years)
- 2007-2013 – Average of 2 events per year (15 events in 7 years)

# Miami Beach flooding frequency

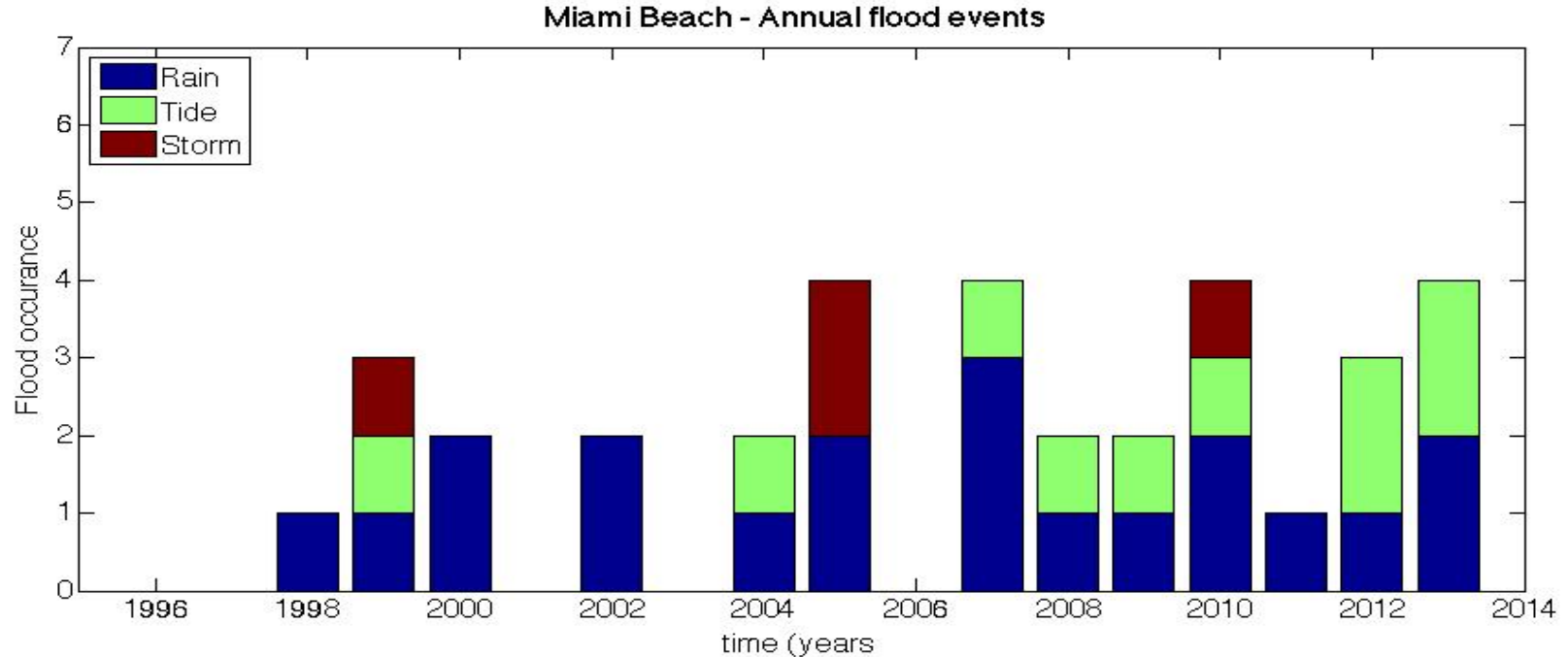


## Possible bias by incomplete data sources

Media reports  
Claims  
Miami Beach  
documentation



# Miami Beach flooding frequency



## Flooding frequency – **without Miami Beach documentation**

### • **Rain induced events**

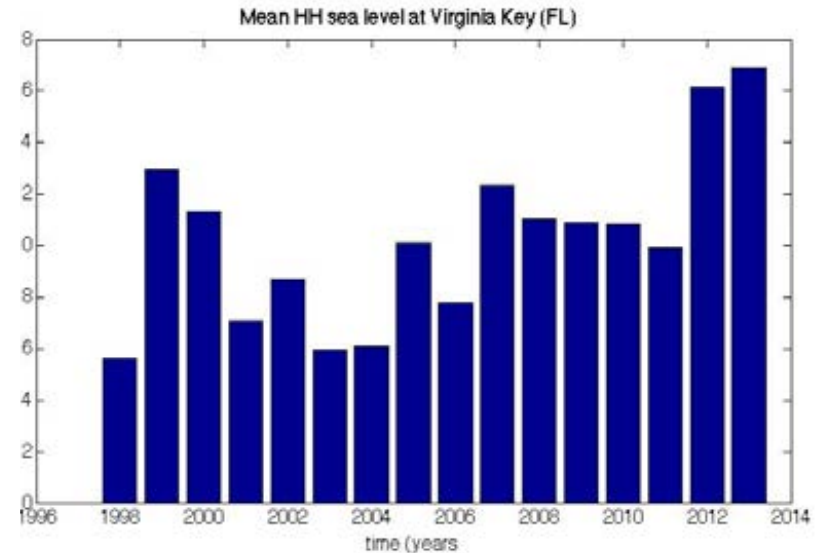
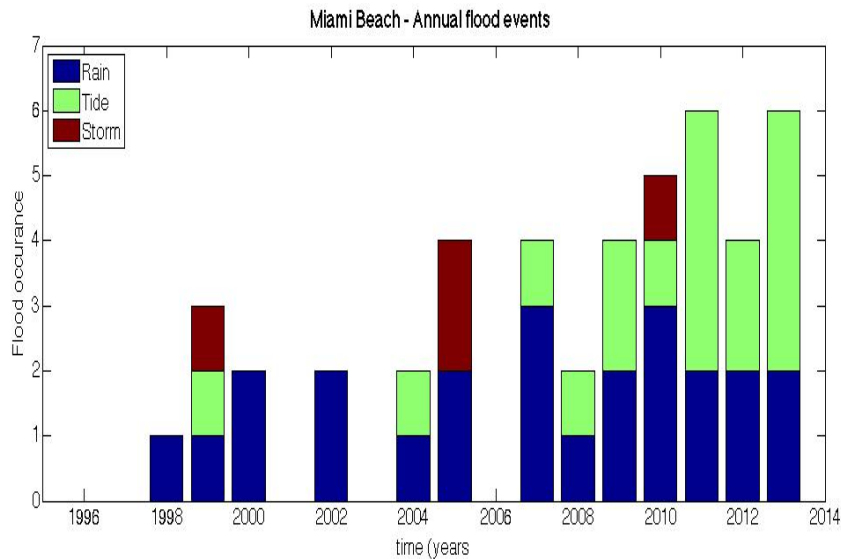
- 1998-2006 – Average of 1 event per year (9 events in 9 years)
- 2007-2013 – Average of 1.5 events per year (11 events in 7 years)

### • **Tide induced events**

- 1998-2006 – Average of 0.2 event per year (2 events in 9 years)
- 2007-2013 – Average of 1 event per year (8 events in 7 years)



# Flooding frequency vs. mean HH level at VK

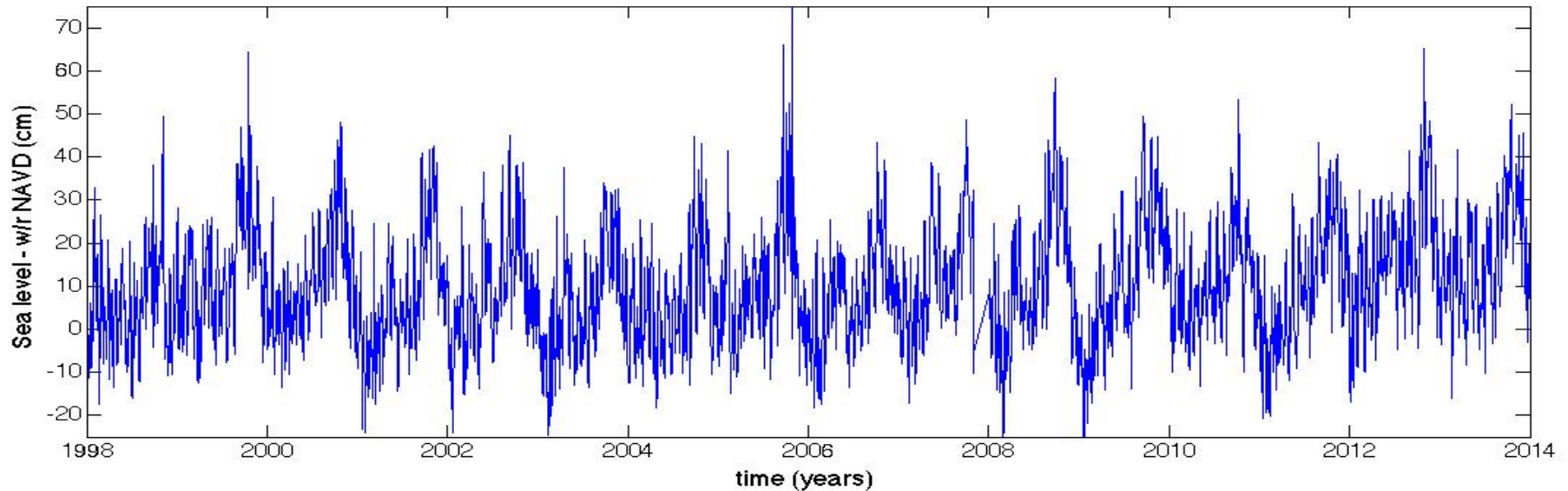


## Flooding frequency – significant increase since 2007

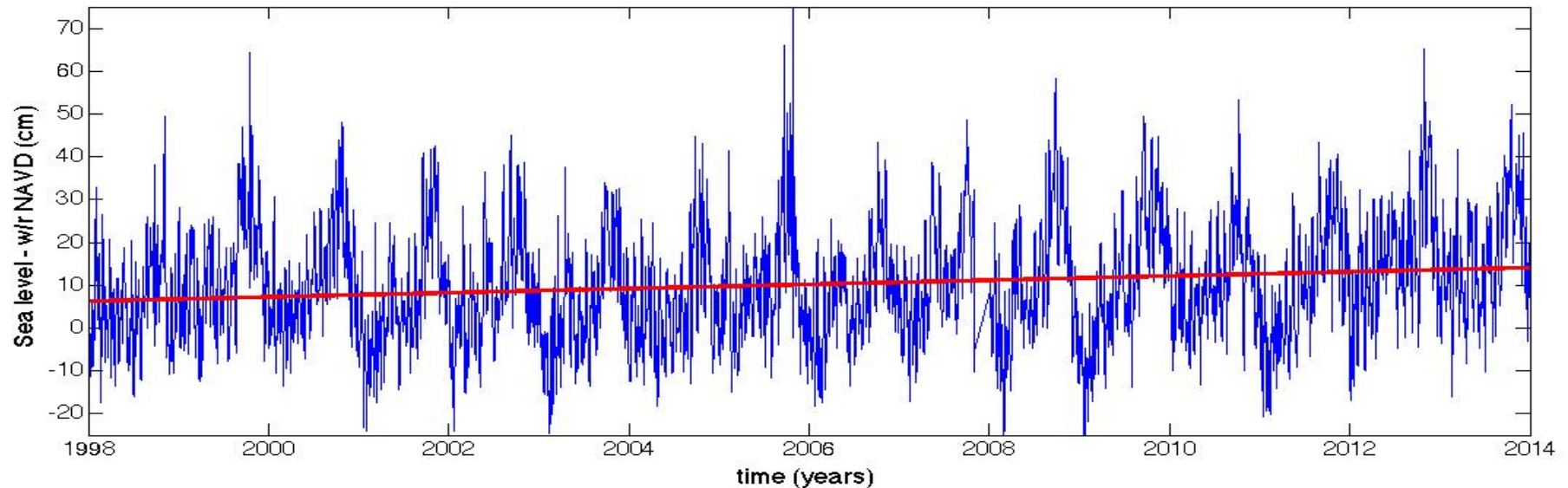
- Rain – Increase from 1 event per year (prior to 2007) to 1.5-2 events per year after 2007
- Tide – Increase from 0.2 event per year (prior to 2007) to 1-2 events per year after 2007
- Increased flooding frequency correlates with higher annual mean HH level at VK

# Virginia Key – daily HH level

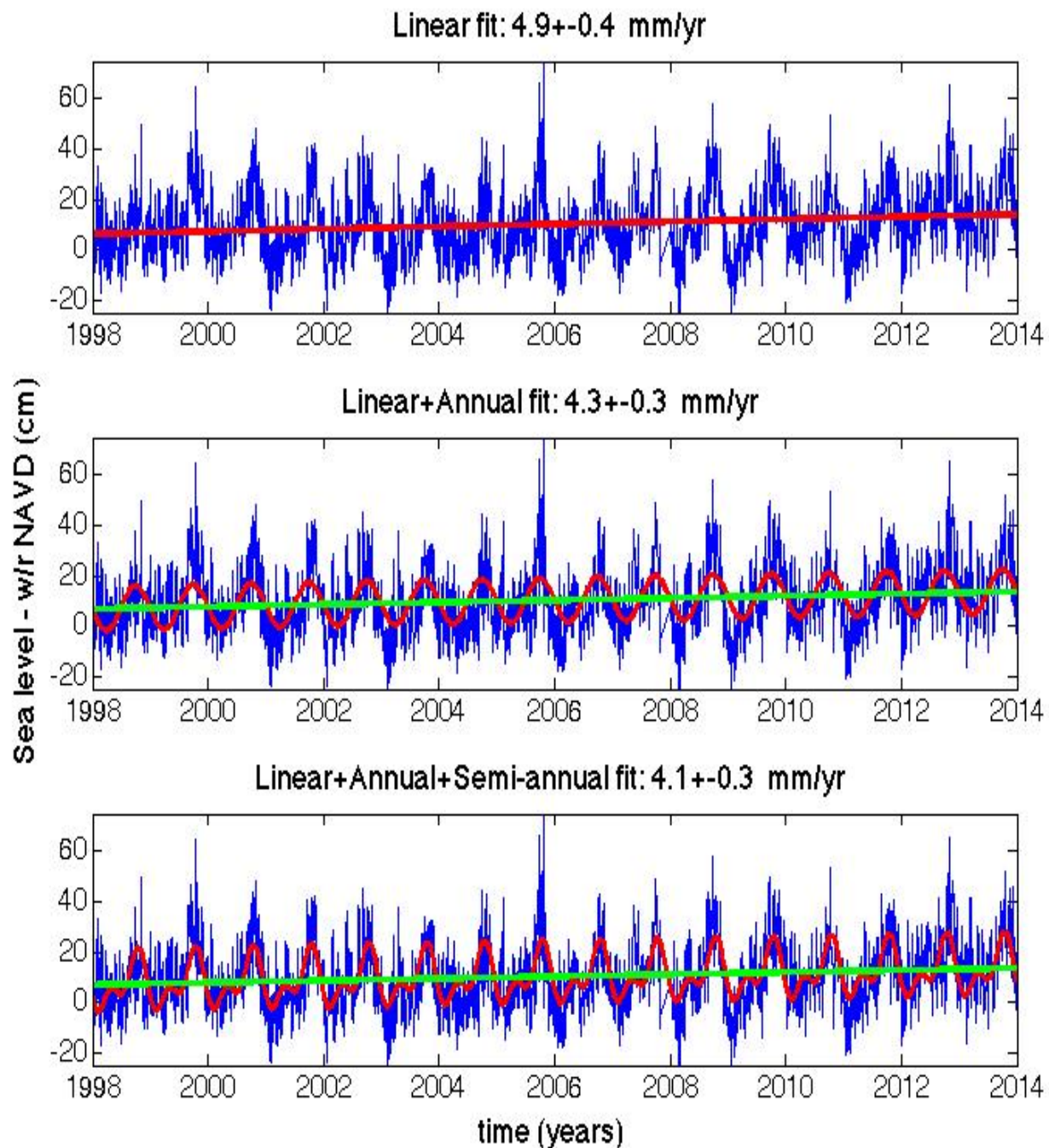
HH sea level at Virginia Key (FL)



Linear fit:  $4.9 \pm 0.4$  mm/yr

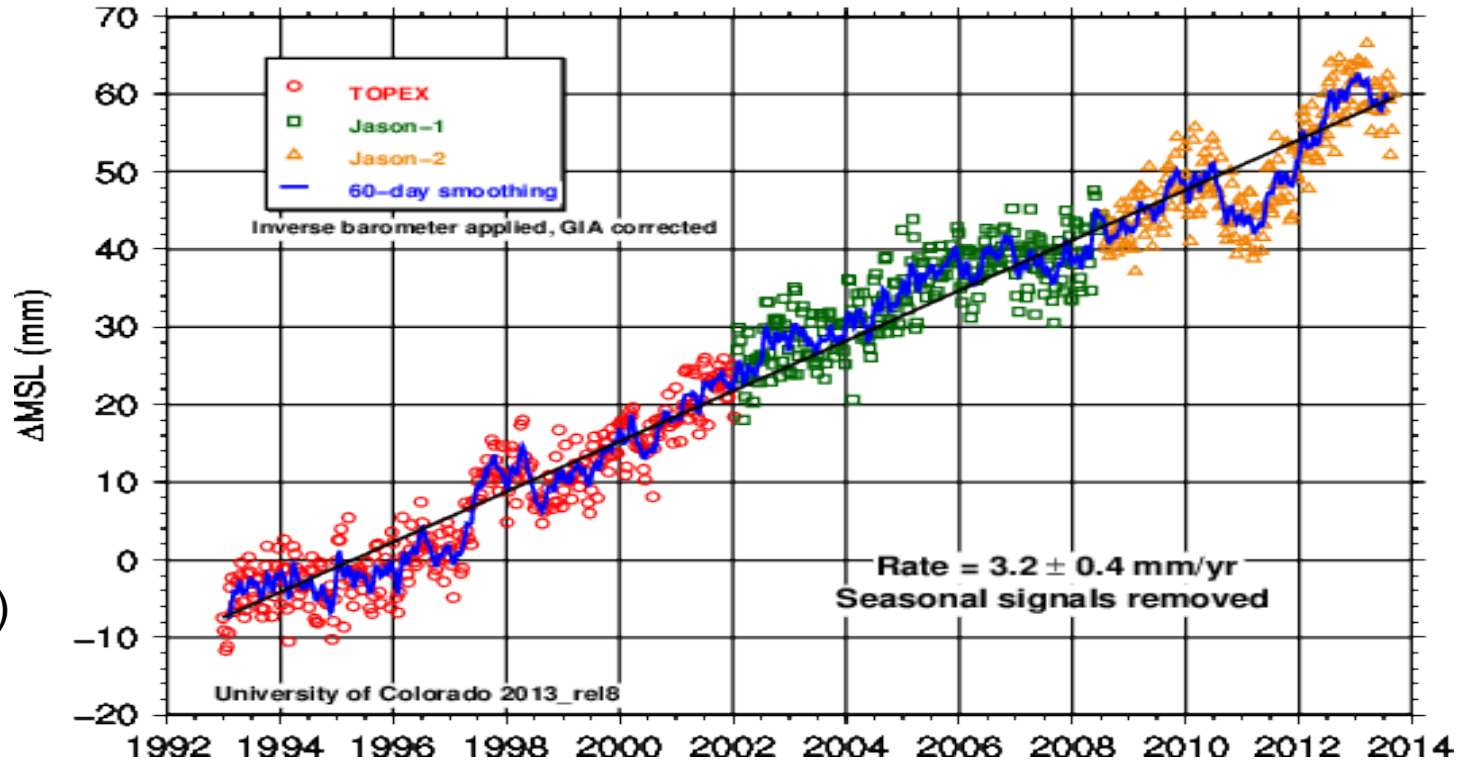


Rate of SLR depends on the fit. It reduces when annual and semi-annual terms are included.



# Globally averaged rate of SLR

Calculated from satellite observations (Radar altimetry)



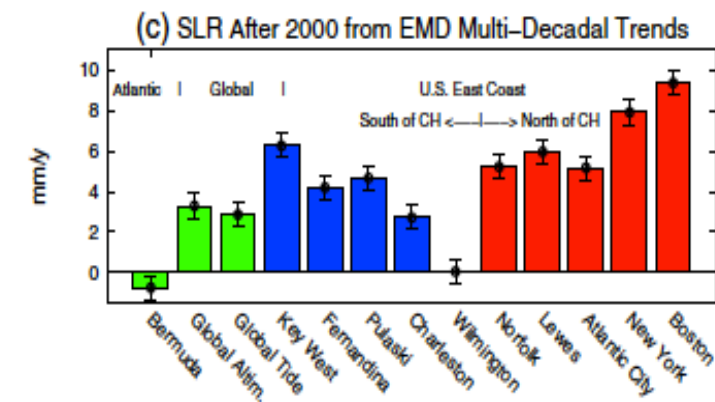
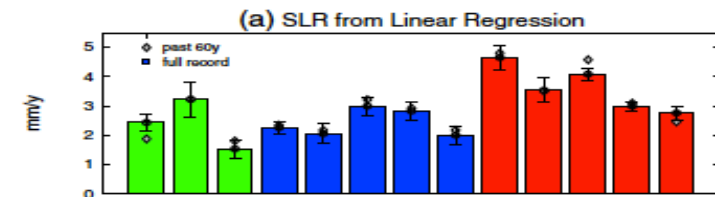
Nerem (2013)

The the rate of SLR at VK  $4.1 \pm 0.3$  to  $4.9 \pm 0.4$  mm/yr is higher than the global average rate of  $3.2 \pm 0.3$  mm/yr.

# Accelerating rates of SLR

**Sea level rise, spatially uneven and temporally unsteady: Why the U.S. East Coast, the global tide gauge record, and the global altimeter data show different trends**

| Station           | Latitude | Longitude | Period    | A<br>mean SLR<br>(mm/y) | B<br>SLR after<br>2000<br>(mm/y) |
|-------------------|----------|-----------|-----------|-------------------------|----------------------------------|
| Boston, MA        | 42.35°N  | 71.05°W   | 1921-2012 | 2.77±0.23               | 9.36±0.6                         |
| New York, NY      | 40.70°N  | 74.01°W   | 1893-2012 | 3.00±0.15               | 7.91±0.6                         |
| Atlantic City, NJ | 39.36°N  | 74.42°W   | 1911-2012 | 4.09±0.20               | 5.17±0.6                         |
| Lewes, DE         | 38.78°N  | 75.12°W   | 1947-2012 | 3.54±0.41               | 5.97±0.6                         |
| Norfolk, VA       | 36.95°N  | 76.33°W   | 1948-2012 | 4.66±0.41               | 5.22±0.6                         |
| Wilmington, NC    | 34.23°N  | 77.95°W   | 1935-2012 | 2.01±0.31               | 0.04±0.6                         |
| Charleston, SC    | 32.78°N  | 79.93°W   | 1935-2012 | 2.83±0.31               | 2.72±0.6                         |
| Ft. Pulaski, GA   | 32.03°N  | 80.90°W   | 1935-2012 | 3.00±0.31               | 4.67±0.6                         |
| Fernandina, FL    | 30.67°N  | 81.47°W   | 1939-2012 | 2.06±0.34               | 4.19±0.6                         |
| Key West, FL      | 24.56°N  | 81.81°W   | 1913-2012 | 2.27±0.21               | 6.26±0.6                         |

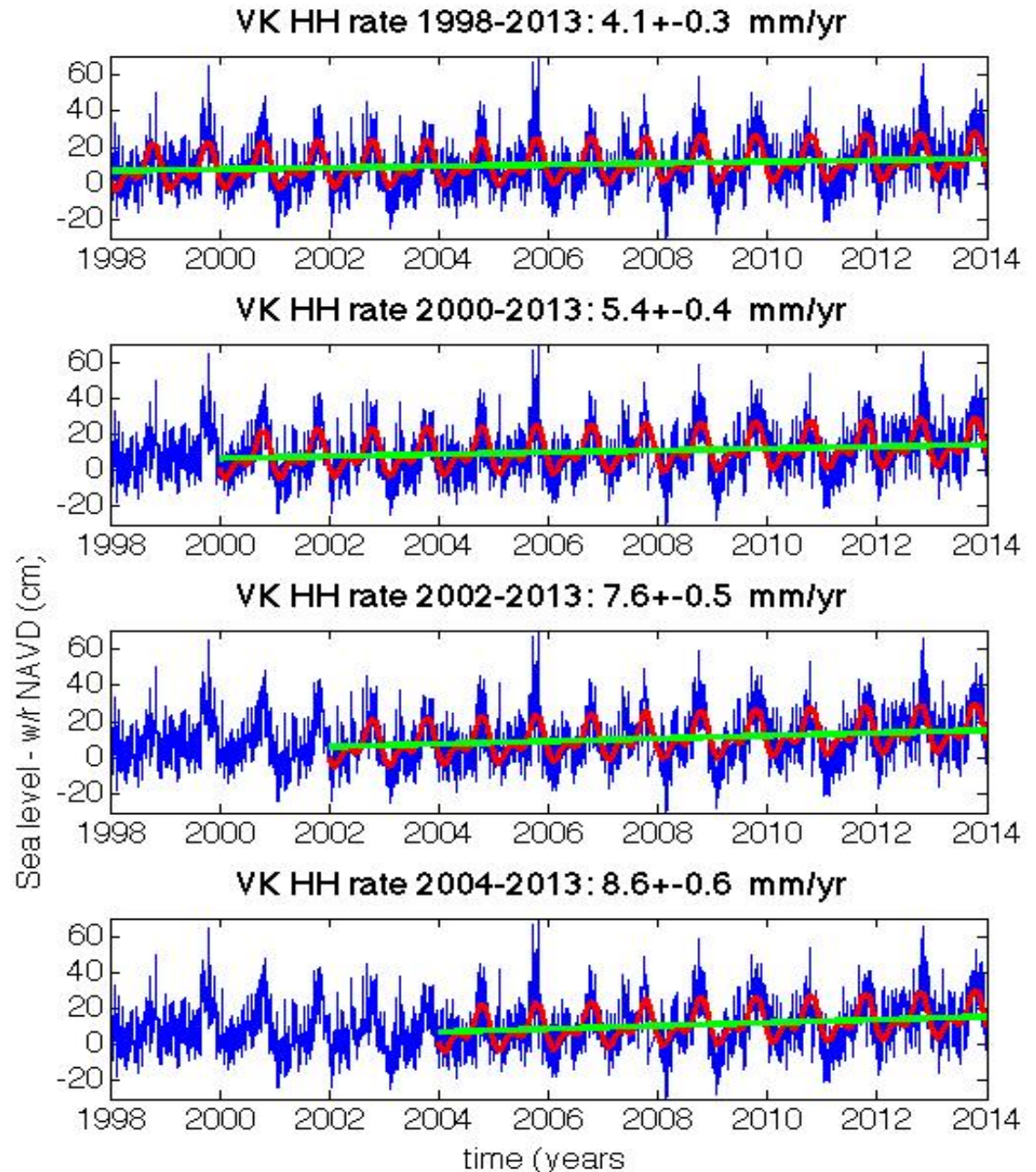
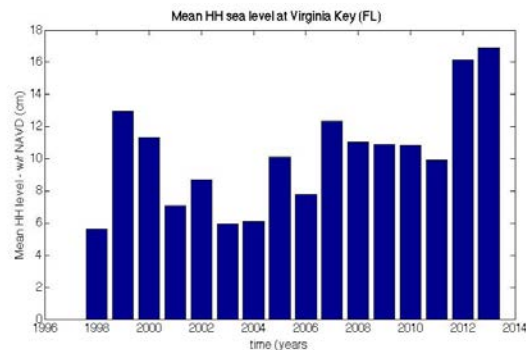


Ezer (2013)

Ezer (2013) suggested that the acceleration of SLR began in 2000.

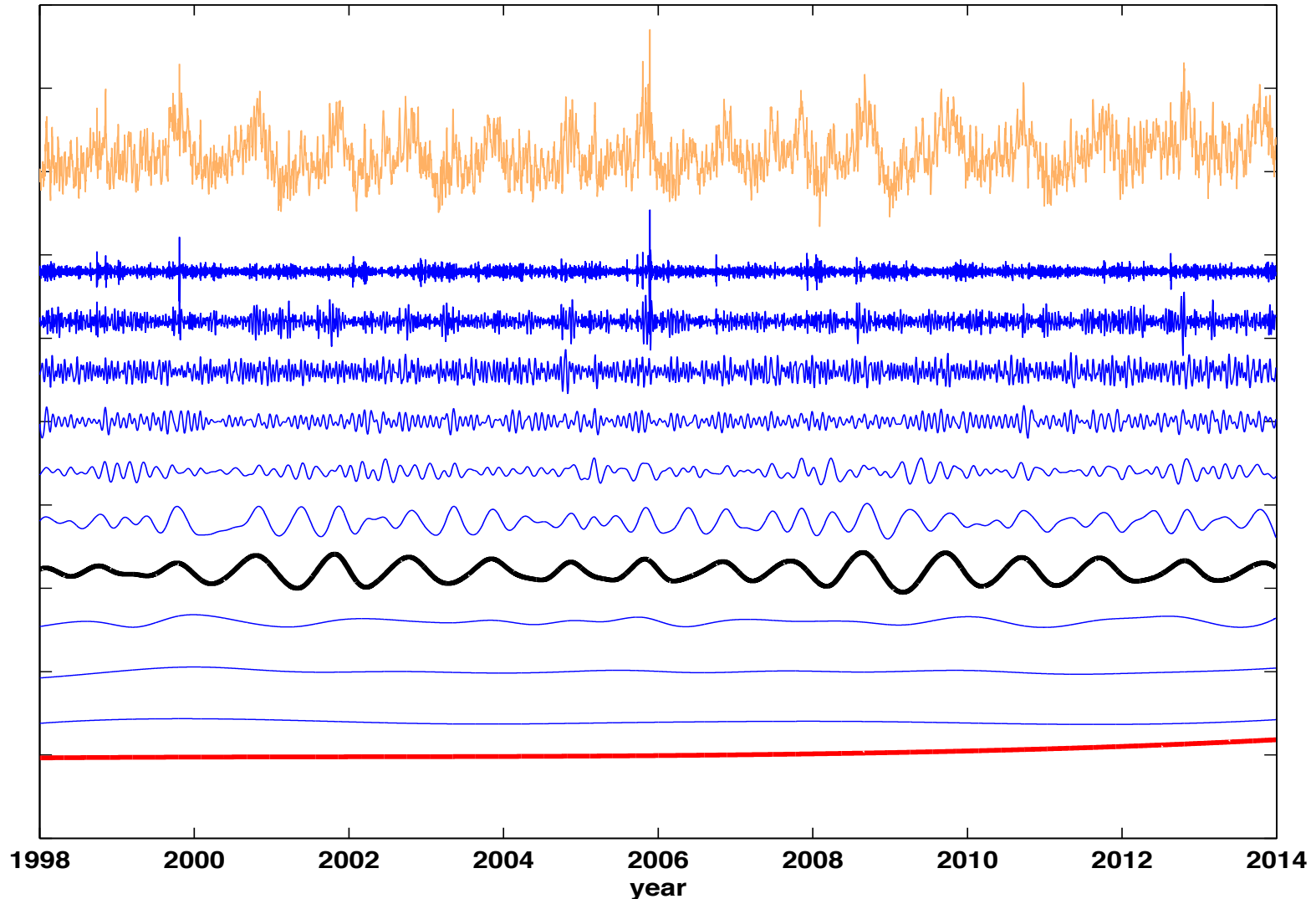
Changing the extent of the time series shows that the rate of SLR increases as the series shortens.

The observed pattern suggests that the SLR acceleration in VK began after 2004, which is supported by calculating annual mean HH levels (see histogram).



# Ensemble Empirical Mode Decomposition - EEMD

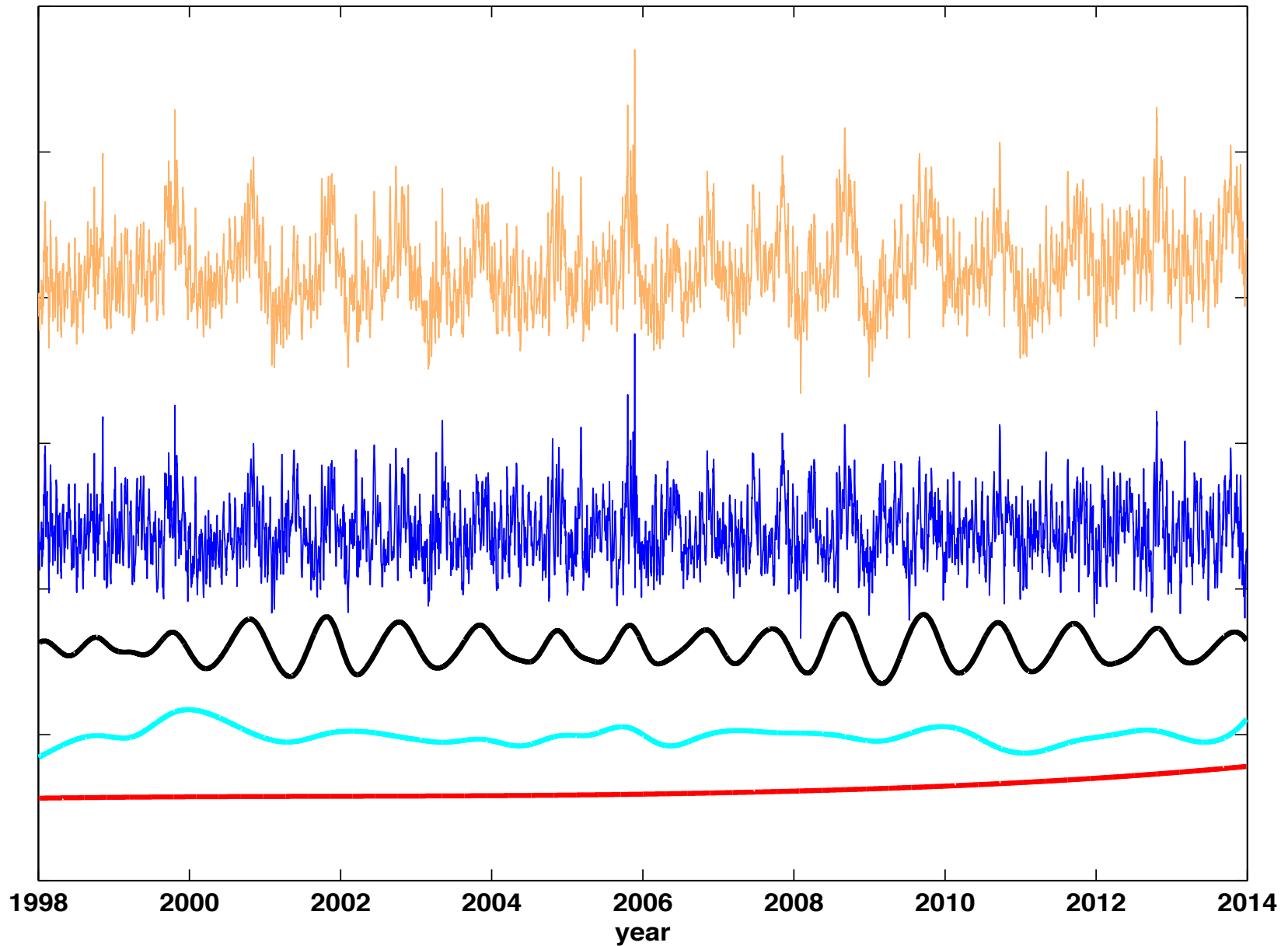
Components of Sea Level (brown: original data; black: annual cycle; red: trend)



Calculated by: Zhaohua Wu (FSU)

# Ensemble Empirical Mode Decomposition - EEMD

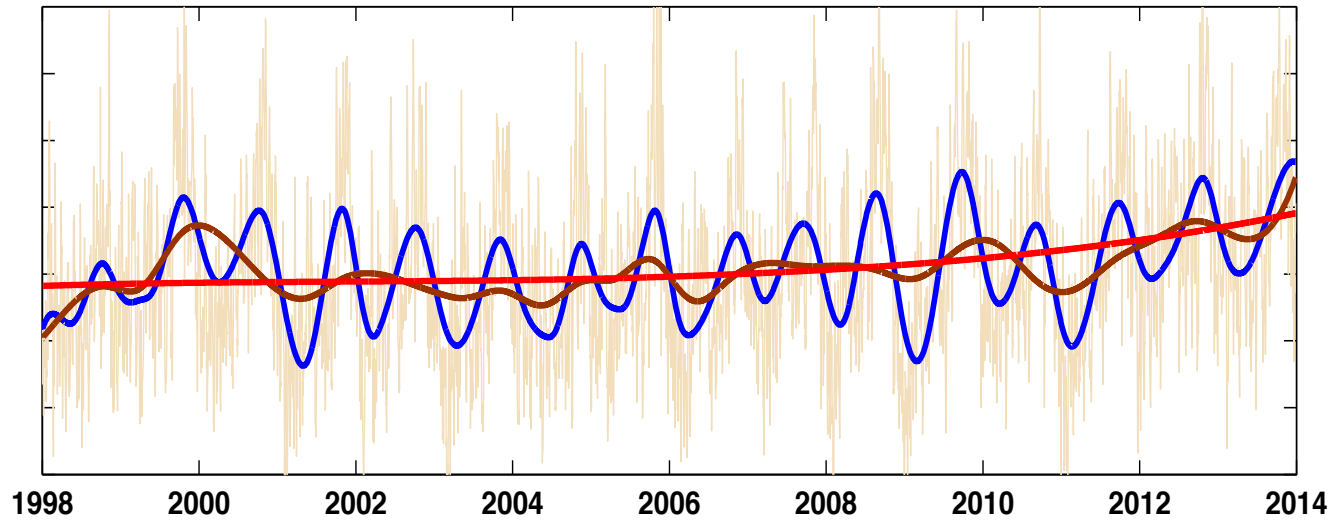
EEMD as a Filter (brown: original data; blue: high fre.; black: MAC; cyan: interannual; red: trend)



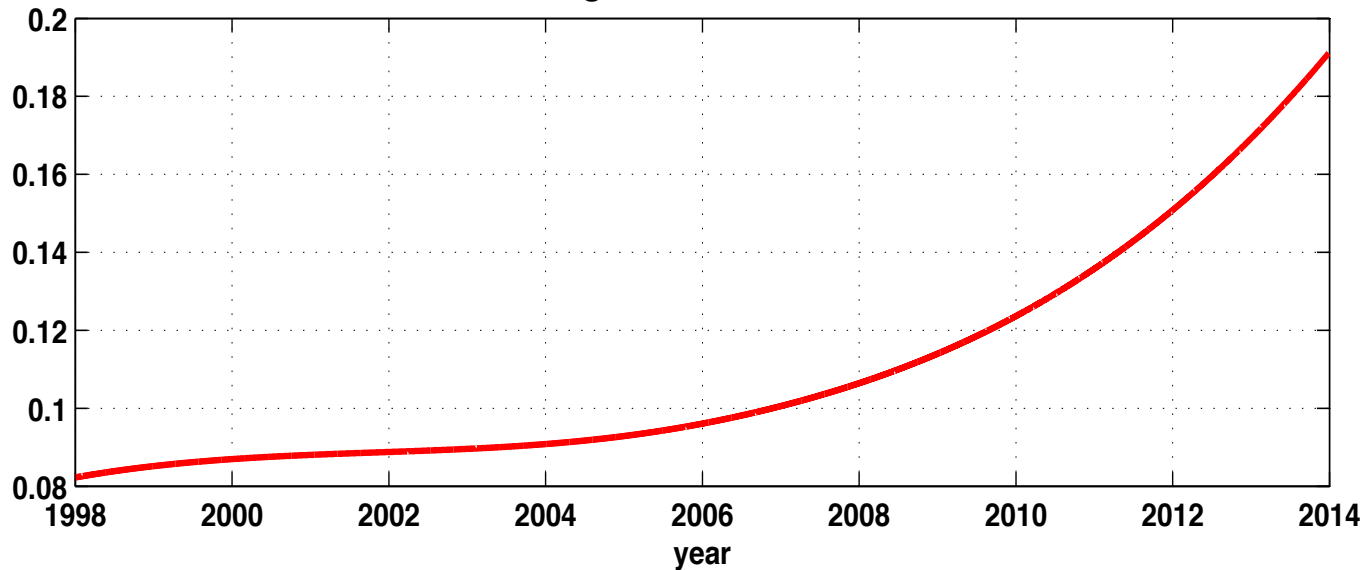


# EEMD – Virginia Key

Reconstructions of Sea Level (brown: original data)



Enlarged Sea Level Trend

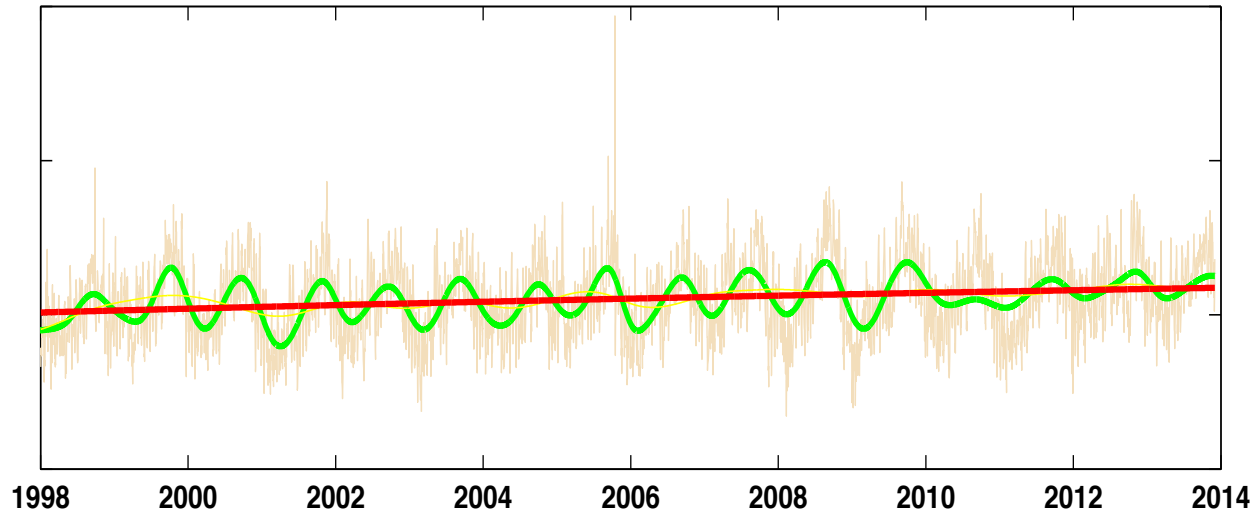


Acceleration of  
SLR since 2006

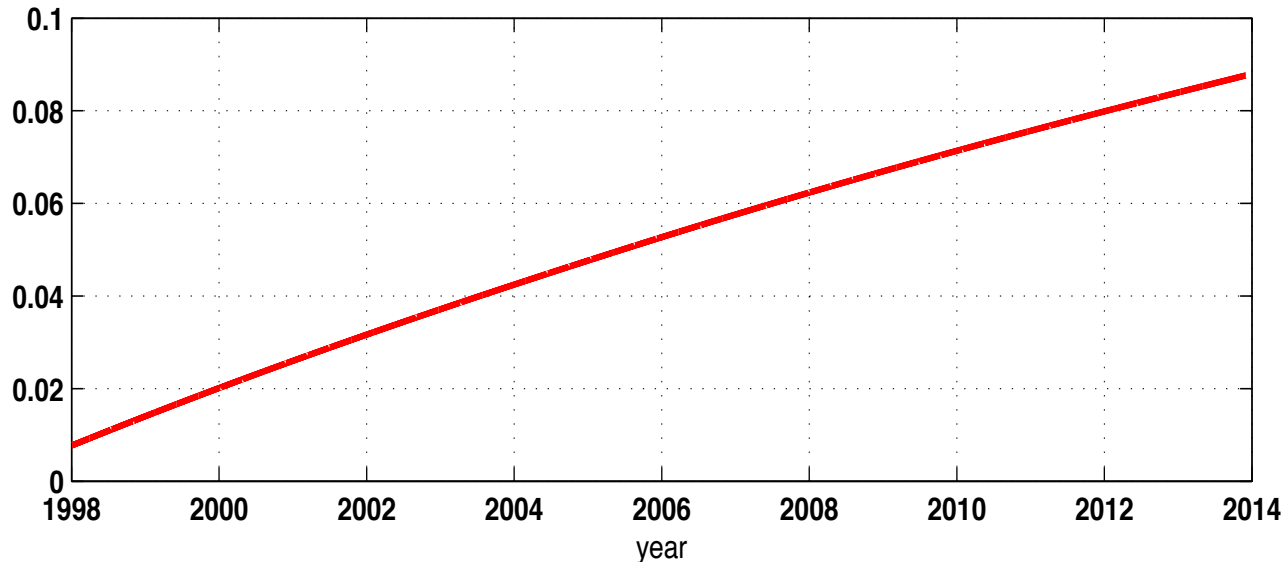
Total trend  
increase since  
2006 – 10 cm

# EEMD – Key West

Reconstructions of Sea Level at KW (brown: original data)



Enlarged Sea Level Trend



High SLR rate  
since 1998

Results agree with  
the analysis of  
Ezer (2013)

Total trend  
increase since  
1998 – 8 cm

# Accelerating rates of SLR

Since 2006, the rate of SLR is even higher.

| Station        | 1998-2013     | 2004-2013     |
|----------------|---------------|---------------|
| Cape Canaveral | $3.1 \pm 0.6$ | $6.3 \pm 1.0$ |
| Virginia Key   | $4.1 \pm 0.3$ | $8.6 \pm 0.6$ |
| Key West       | $4.7 \pm 0.3$ | $5.3 \pm 0.6$ |
| Naples         | $5.0 \pm 0.4$ | $6.7 \pm 0.7$ |

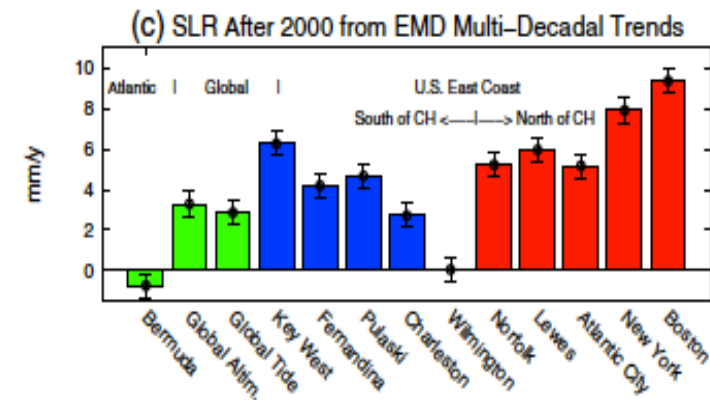
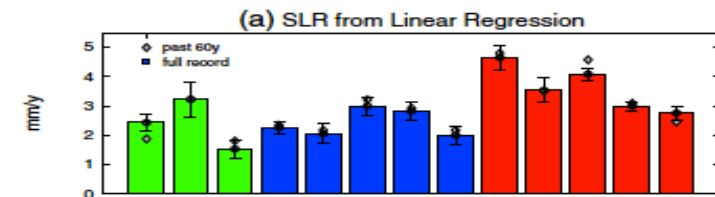
Delayed acceleration in Virginia Key and Cape Canaveral



# Accelerating rates of SLR

**Sea level rise, spatially uneven and temporally unsteady: Why the U.S. East Coast, the global tide gauge record, and the global altimeter data show different trends**

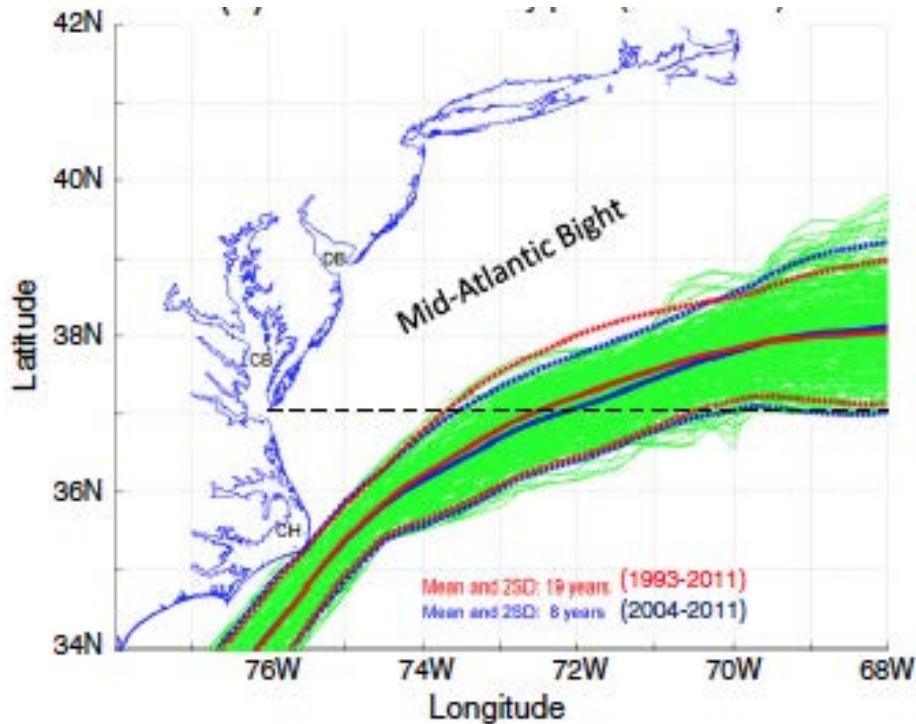
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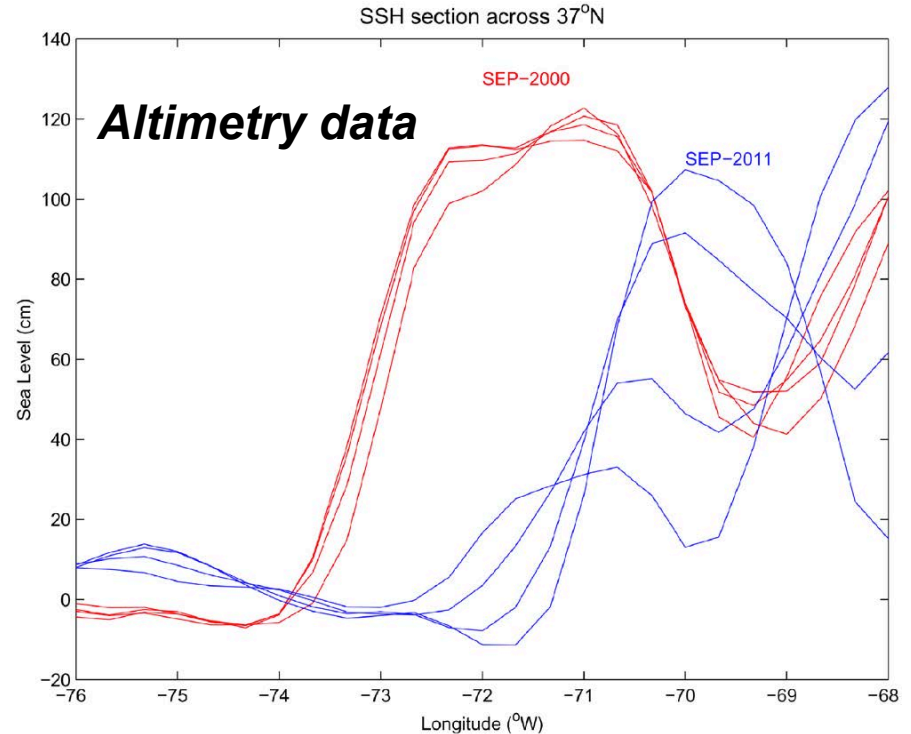
Ezer (2013)

# Accelerating rates of SLR

Location of GS front (altimetry data)



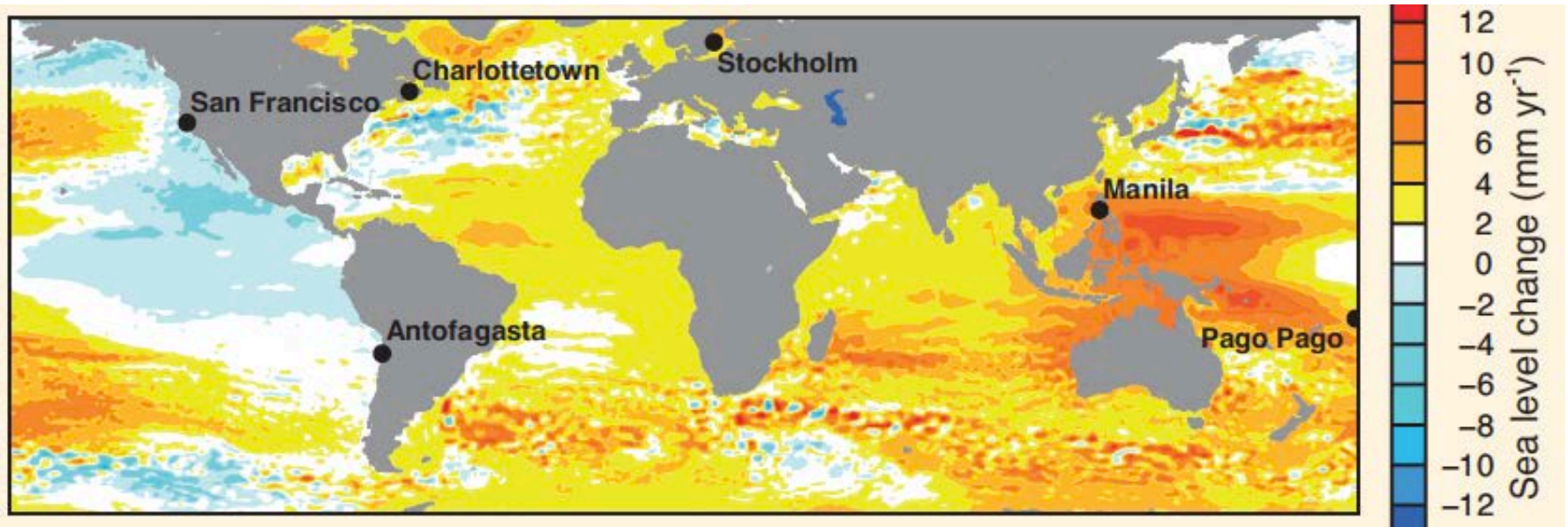
Sea level (cm)



- The Gulf Stream (GS) creates dynamic sea level topography, which is proportional to GS velocity.
- Weakening of the GS leads to the relaxation of the dynamic sea level topography and increase of near shore sea level.

Ezer et al. (2013)

# Weakening of the Gulf Stream



Altimetry measurements of sea level changes (1992-2012) indicate sea level subsidence along the Gulf Stream.

IPCC report (2013)

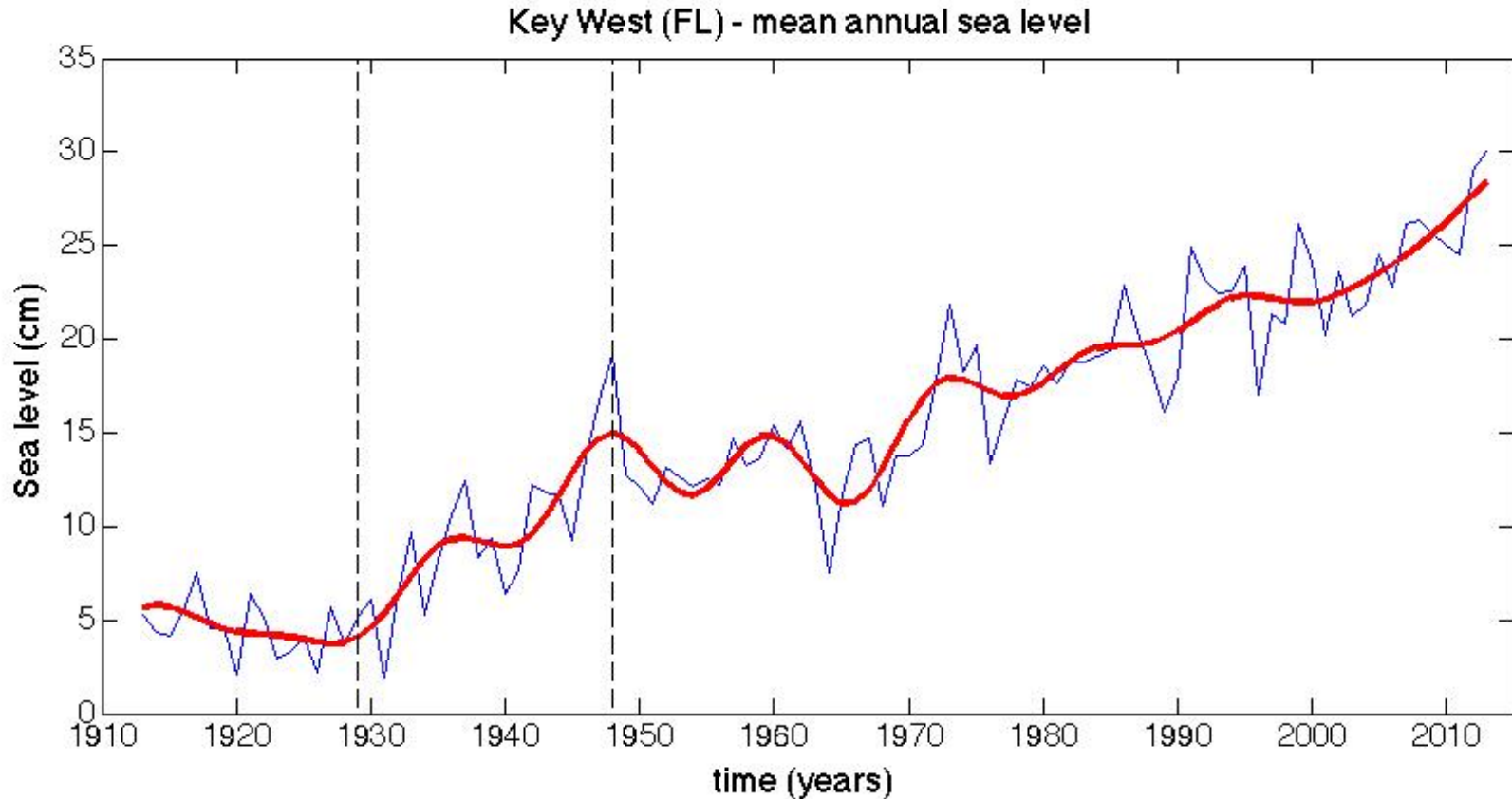
# Accelerating rates of SLR



- SLR in Miami Beach and Cape Canaveral are affected by the Florida current, which flows through the Florida Straits.
- In both locations, the SLR acceleration began in 2006, several years after the acceleration started along the Gulf Stream and within the Gulf of Mexico (around 2000).
- Why?

Ezer et al. (2013)

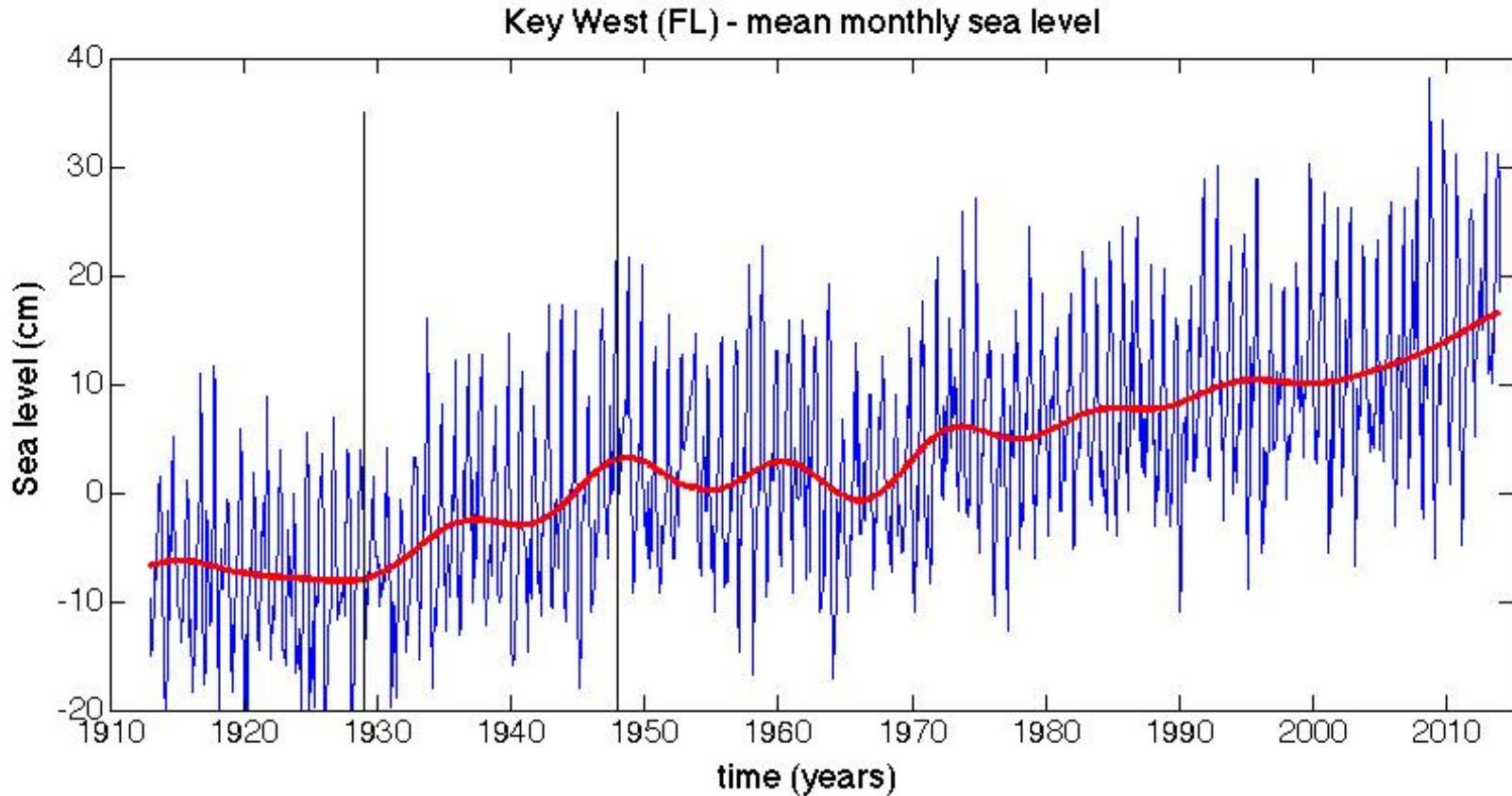
# Past SLR acceleration



Accelerated rate of SLR along the US Atlantic coast  
between 1929-1948

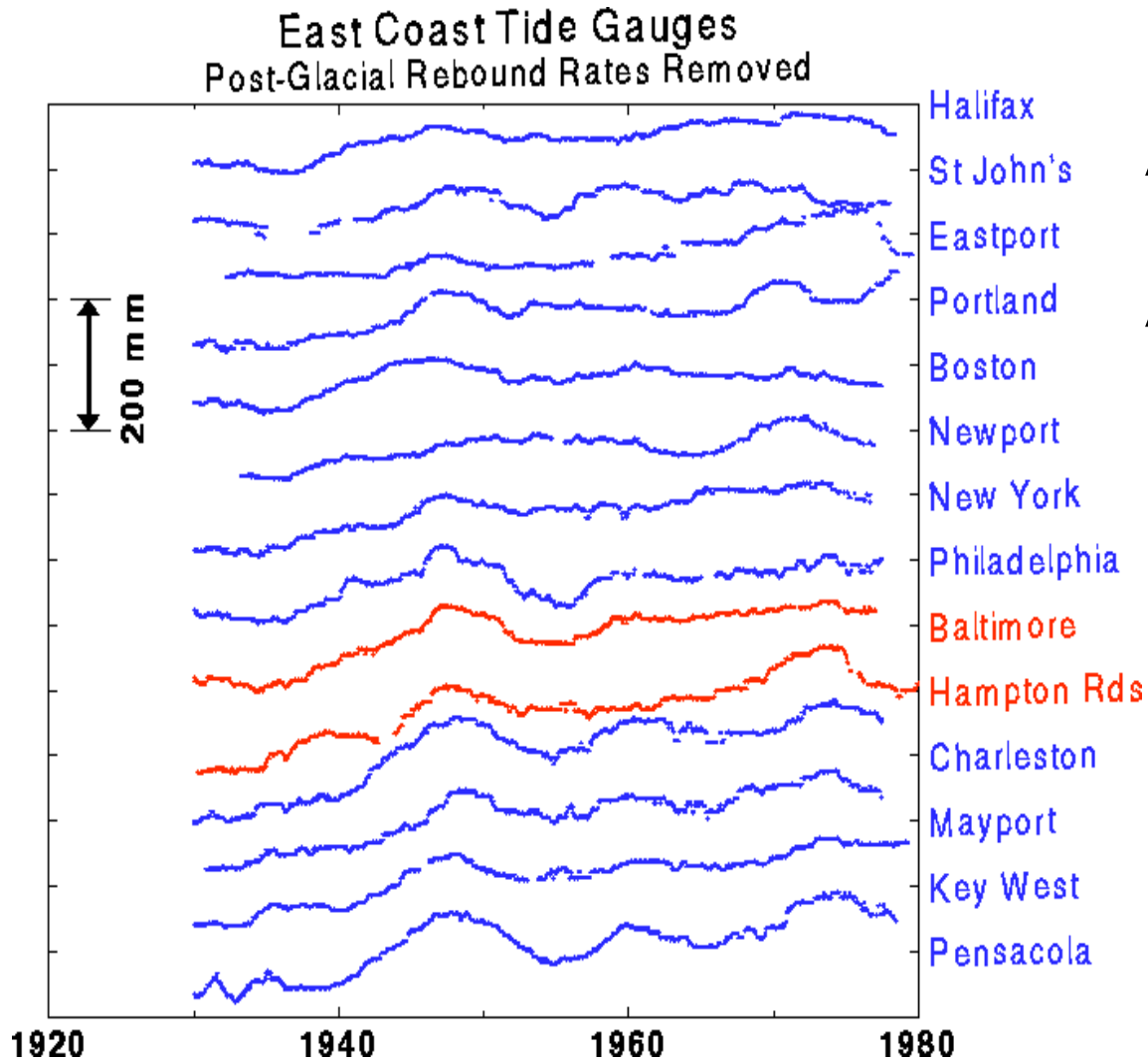


# Past SLR acceleration



Accelerated rate of SLR along the US Atlantic coast  
between 1929-1948

# Past SLR acceleration

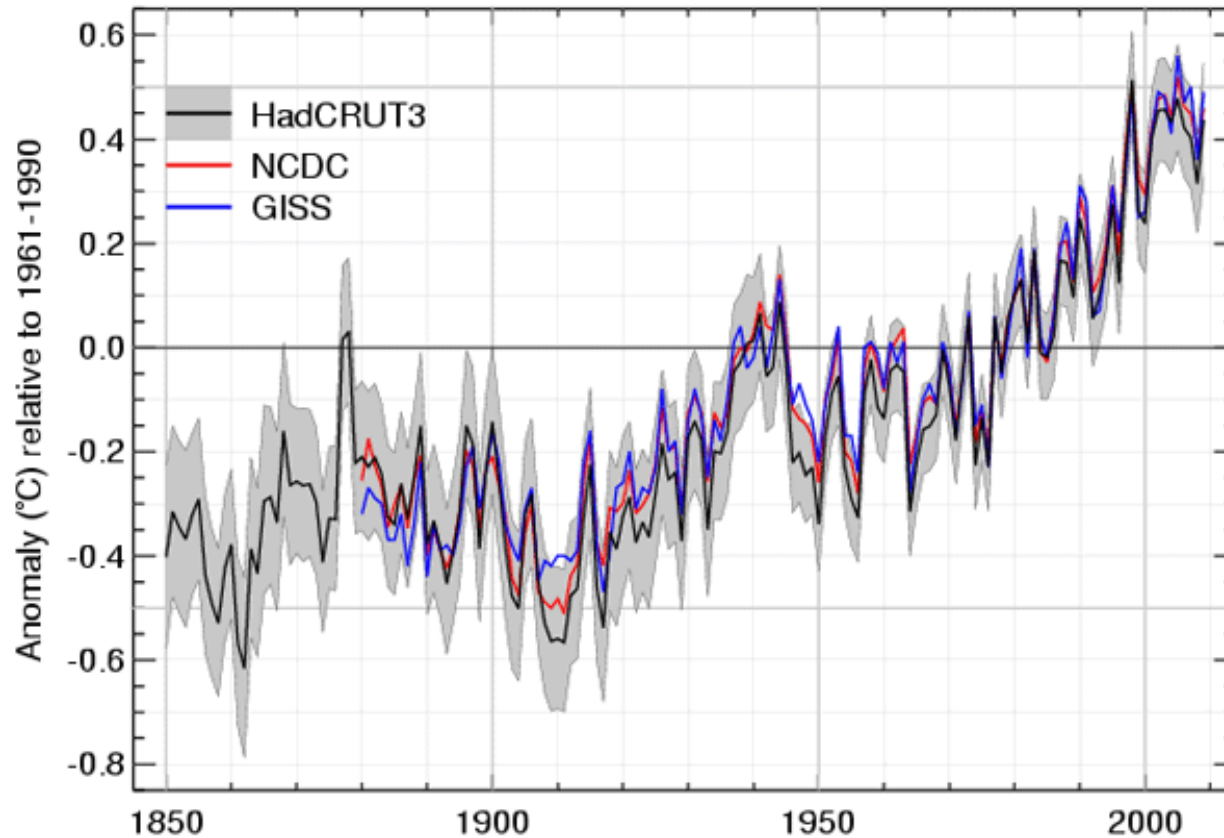


Accelerated rates of SLR along the US Atlantic coast between 1930-1950

Source: NOAA page of Sea Level

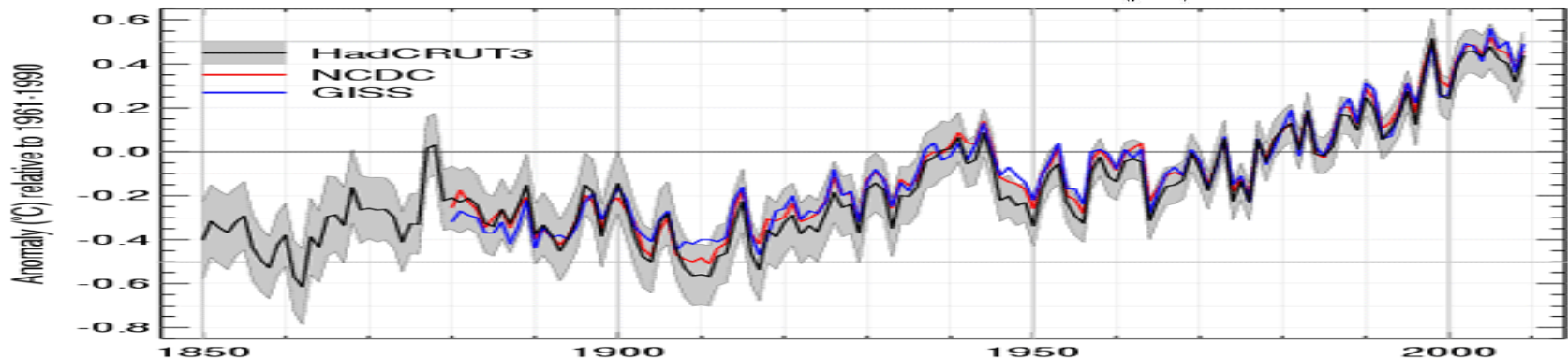
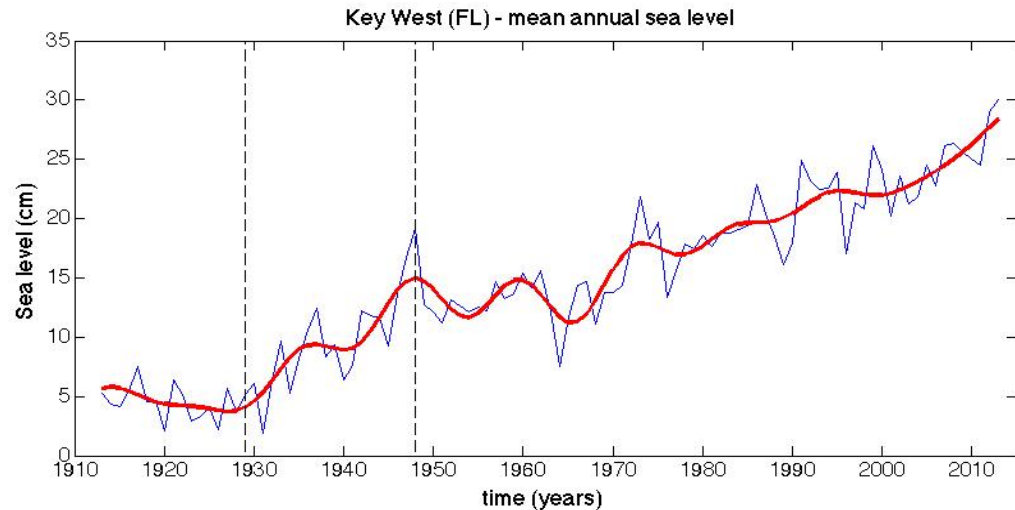
<https://www.ngs.noaa.gov/GRD/GPS/Projects/CB/SEALEVEL/sealevel.html>

# Past SLR acceleration



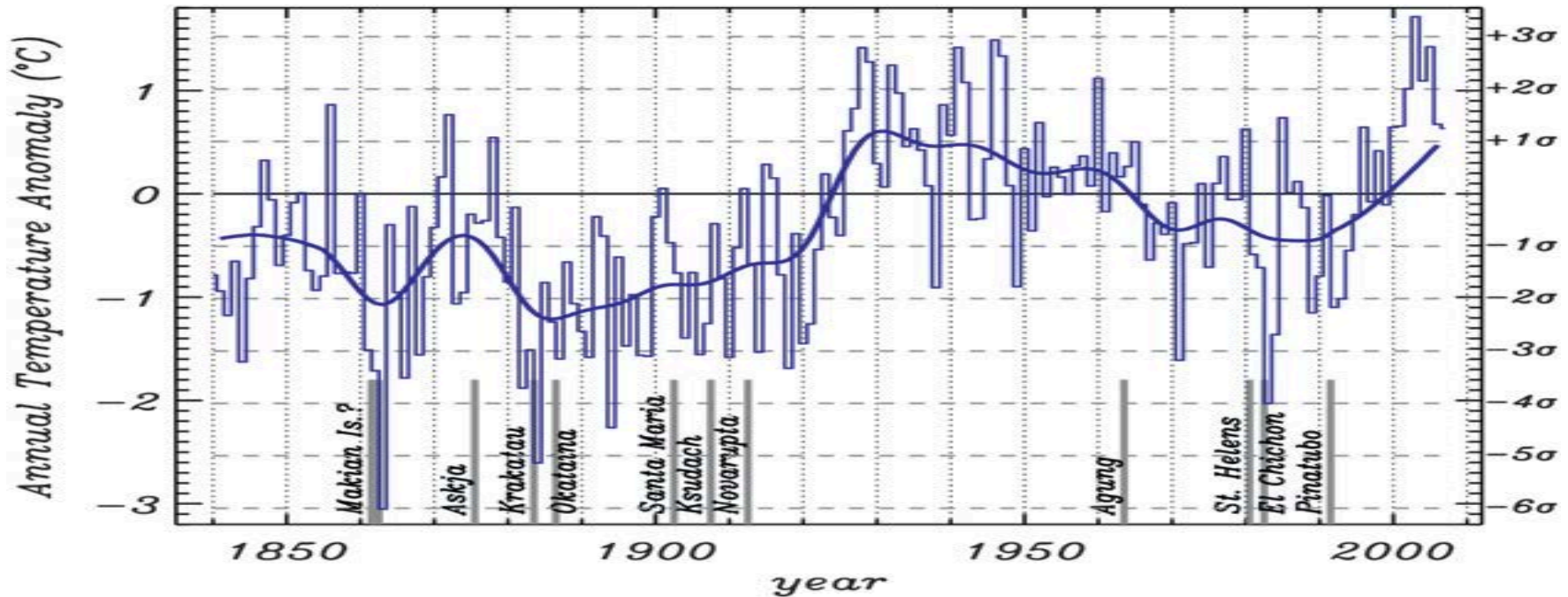
**Global temperature 1850-2008 Average annual surface temperature, as reported independently by NOAA (NCDC), NASA (GISS) and the Hadley Centre and Climate Research Unit of the University of East Anglia in the UK (HadCRUT3).**

# Past SLR acceleration



The high rate of SLR along the US Atlantic coast occurred between 1930-1950. It is only partly correlates with a global warming trend that occurred between 1910-1940.

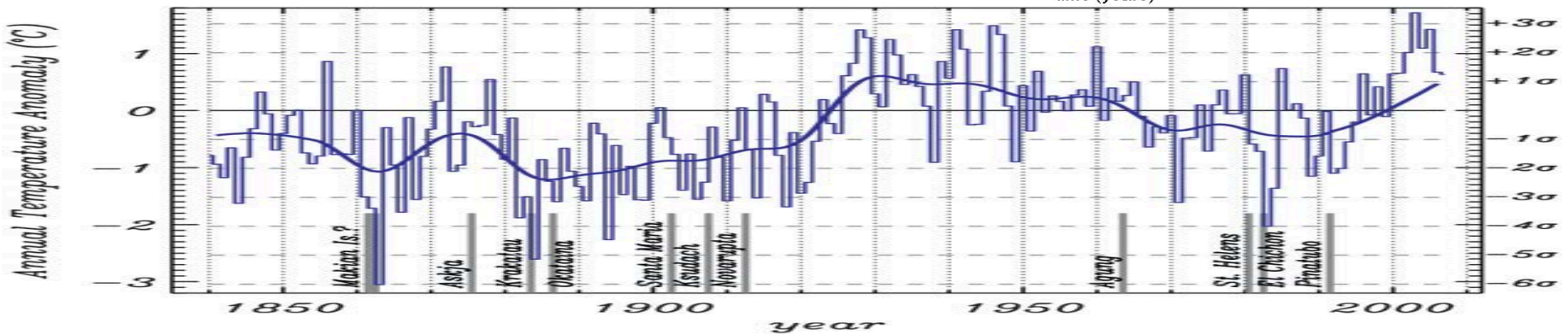
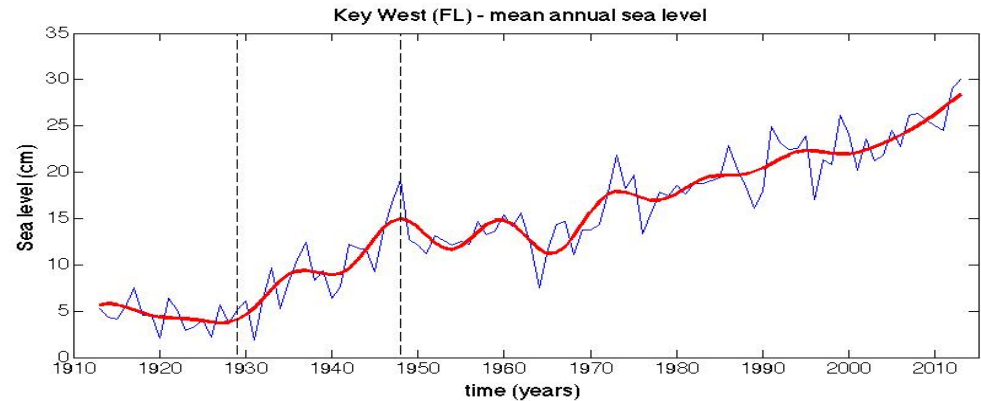
# Past SLR acceleration



Box and Yang (2009)

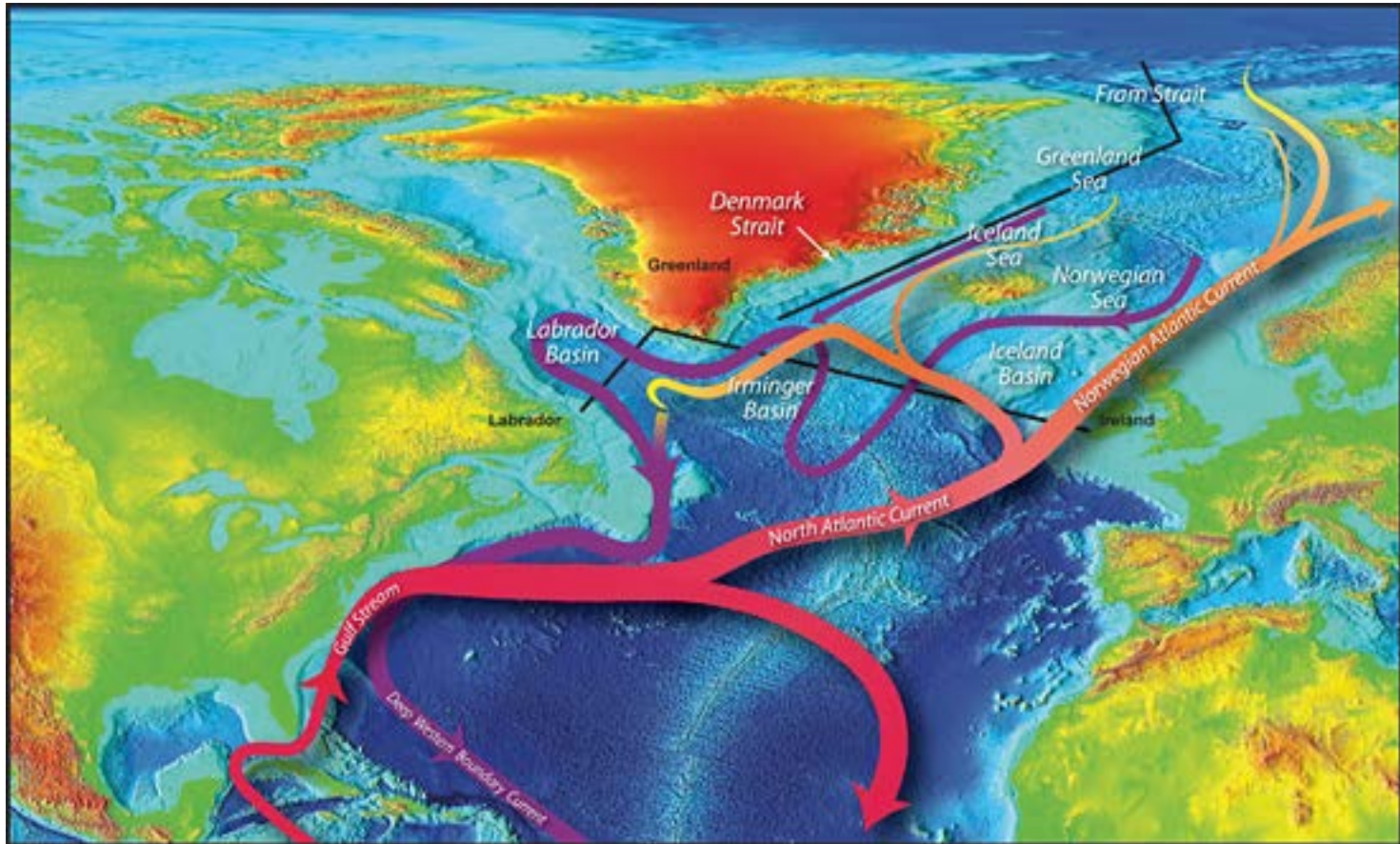
During 1925-1948 air surface temperatures in Greenland was anomalously high (similar to present-day temperature levels).

# Past SLR acceleration



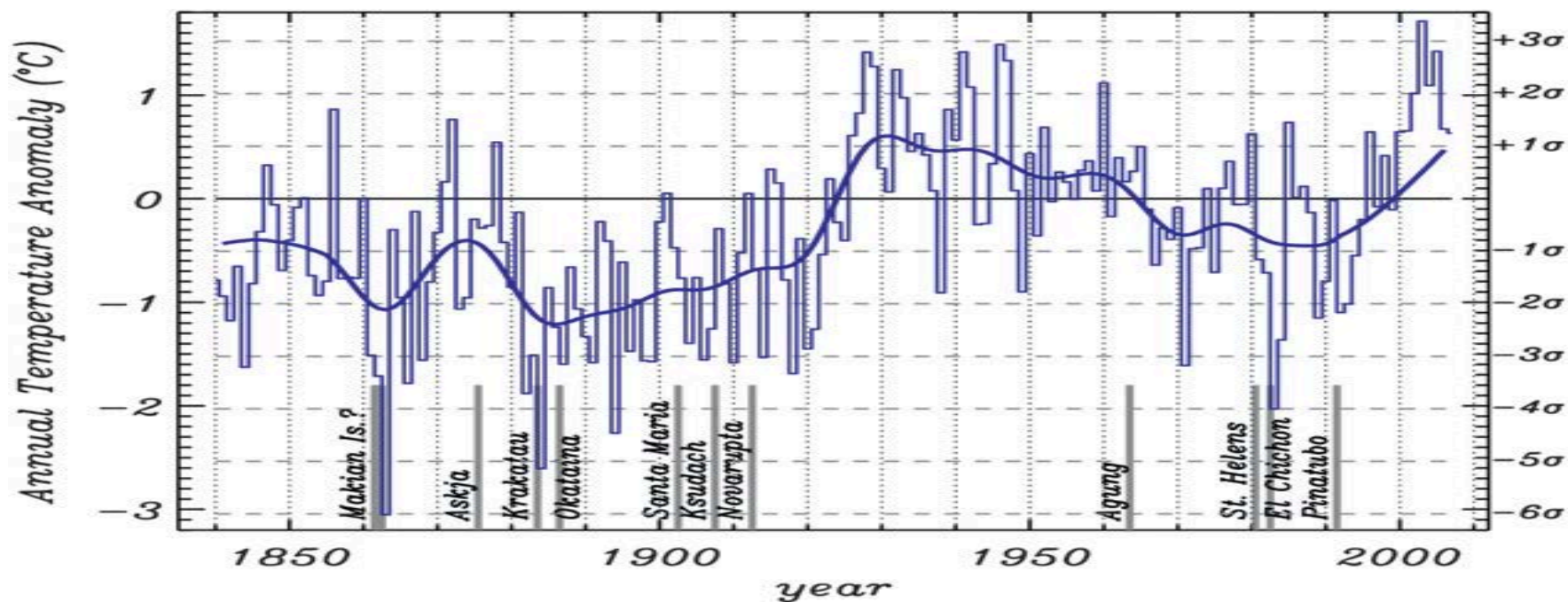
- The correlation between high air surface temperatures in Greenland and accelerated rate of SLR during 1930-1950 suggests a strong ties between rapid ice melt in Greenland, weakening of the GS, and high rates of SLR.
- There is a delay (5-8 years) between beginning of warming phase in Greenland and the acceleration of SLR along the Atlantic shores.

# Atlantic Meridional Overturning Circulation (AMOC)



[Woods Hole's image of the day]

# Current phase of ice melt in Greenland



Box and Yang (2009)

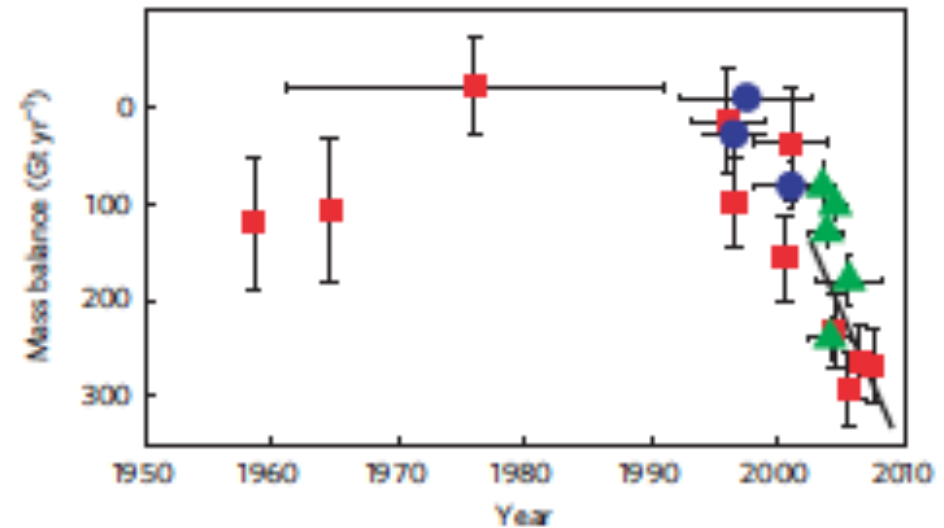
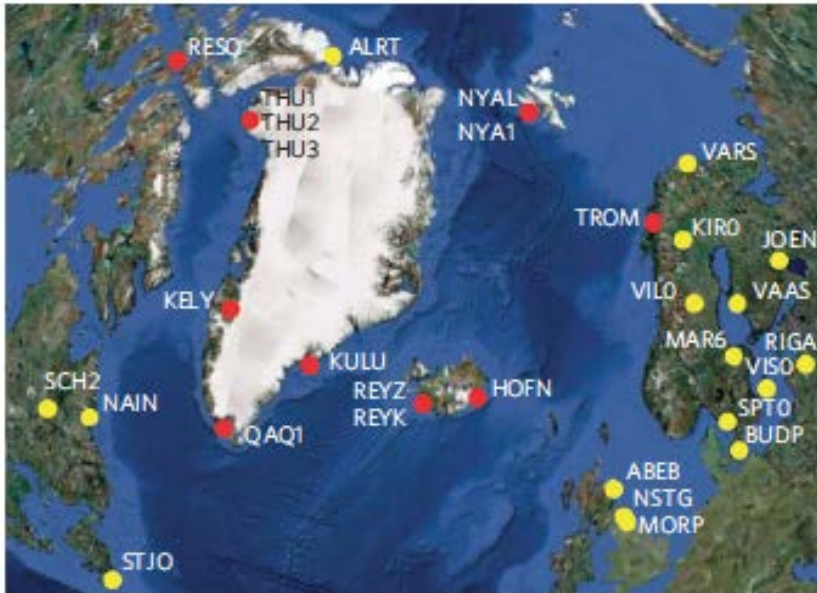
- High surface temperature in Greenland start occurring in the mid-1990's.
- Possibly ~5 year delay between ice melt in Greenland and accelerated rate of SLR along the Atlantic shores.



# Current phase of ice melt in Greenland

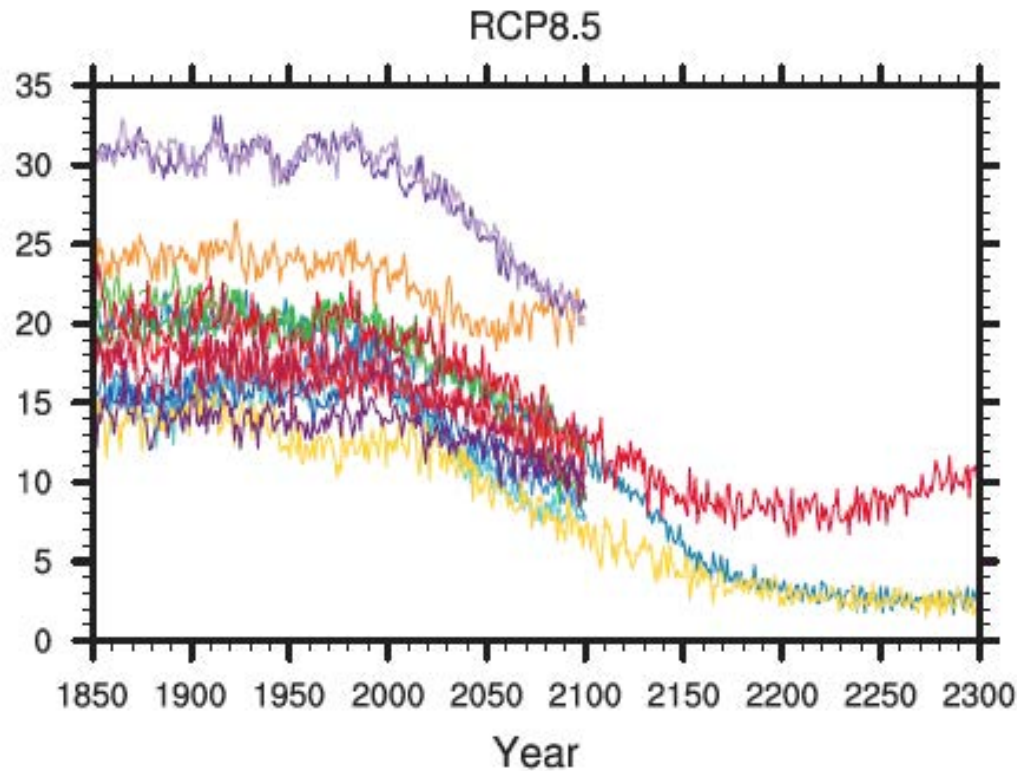
Accelerating uplift in the North Atlantic region as an indicator of ice loss

Jiang et al. (2010)



- Based on accelerated rate of crustal uplift, as measured by GPS stations, Jiang et al. (2010) suggested that the current phase of Greenland ice melt began in mid-1990's.

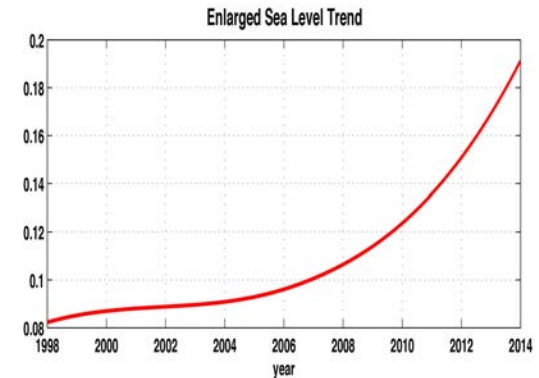
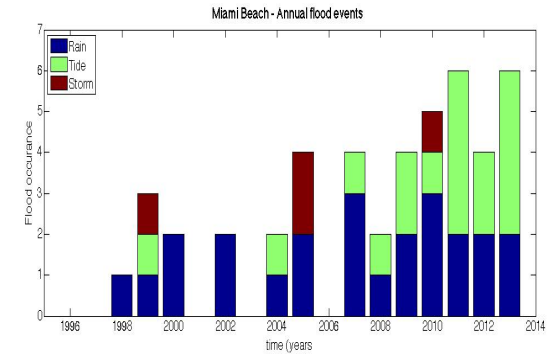
# AMOC forecasting



- AMOC forecast according to IPCC report (2013):  
Continue weakening of AMOC  
⇒ Further weakening of the Gulf Stream  
⇒ High rates of SLR along the US Atlantic shores  
(higher than average global rates)

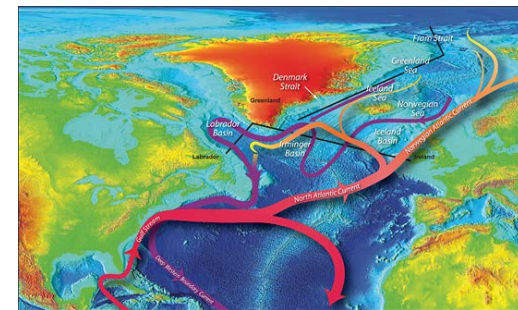
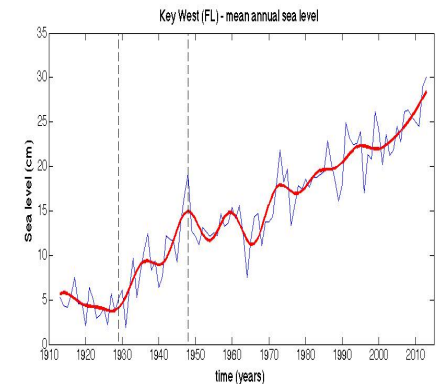
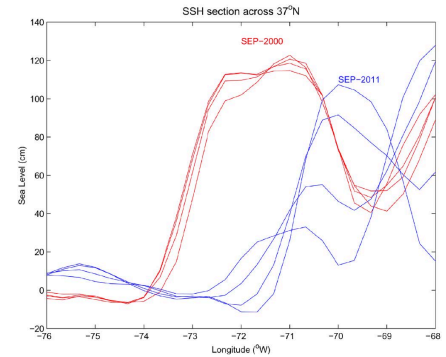
# Summary - I

- Flooding frequency in Miami Beach increased since 2006
- The local rate of SLR in Miami since 2006 is  $> 8$  mm/yr, almost three times higher than the average global rate.
- Since 2006 local sea level in Miami rose by  $\sim 10$  cm, causing more frequent rain and tide (“sunny sky”) flooding events.
- The Miami-Beach \$400 million engineering project may work during rain-induced flood events, but will be less efficient in tide-induced events.



# Summary - II

- The accelerating rate of SLR in Miami is consistent with similar rates found along the US Atlantic coast, and are caused by the weakening of the Gulf Stream.
- A similar period of accelerating rates of SLR occurred along the US Atlantic coast between 1930-1950. It is correlated with a period of anomalously high surface air temperature in Greenland.
- We suggest that the increasing rate of ice melt in Greenland affects the AMOC, weakens the Gulf Stream, increases the rate of SLR along the US Atlantic shores, and consequently increases flooding frequency in Miami Beach.



# Acknowledgements

- **Tide gauge data - NOAA**
- **Flood Claim record**  
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- **Additional flood documentation - Pictures Miami Beach**  
Elizabeth Wheaton and Margarita Wells – City of Miami Beach, Public Works Department  
  
Christine Borski - City of Miami Beach, Office of the City Manager
- **EEMD calculations - Zhaohua Wu (FSU)**