

Designing coastal defense strategies in an era of uncertain sea-level rise

D.J. Rasmussen

STEP PhD seminar, May 2019

Maeslant Surge Barrier, Netherlands



[Eastern Scheldt Storm Surge Barrier]

Research Area:

Engineered coastal flood defense in an era of sea-level rise



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“When to act?” & “the decision to build”: Political science/ Policy/ Environmental Law



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- Lots of proposals for large coastal infrastructure... what are conditions that lead to projects getting built or not built?



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- How high to build coastal defense strategies?
 - Modeling the return periods of extreme water levels
 - Characterizing uncertainty in future sea-level rise projections (under specific climate policies, like the Paris Agreement)

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**More mature
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[IHNC-Lake Borgne Surge Barrier]

Overview



IHNC-Lake Borgne Surge Barrier

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1. Background/ motivation
 - What are the key processes driving sea-level rise and coastal flooding?



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IHNC-Lake Borgne Surge Barrier



Overview

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3. Methods/ approach



Aerial photograph of the IHNC-Lake Borgne Surge Barrier, a long, narrow structure extending from the bottom right towards the top left. The barrier is surrounded by wetland areas and water. A small boat is visible near the barrier's end. The text "[IHNC-Lake Borgne Surge Barrier]" is overlaid on the bottom right of the image.

[IHNC-Lake Borgne Surge Barrier]

Overview

1. Background/ motivation
 - What are the key processes driving sea-level rise and coastal flooding?
2. My research questions
3. Methods/ approach
4. Results

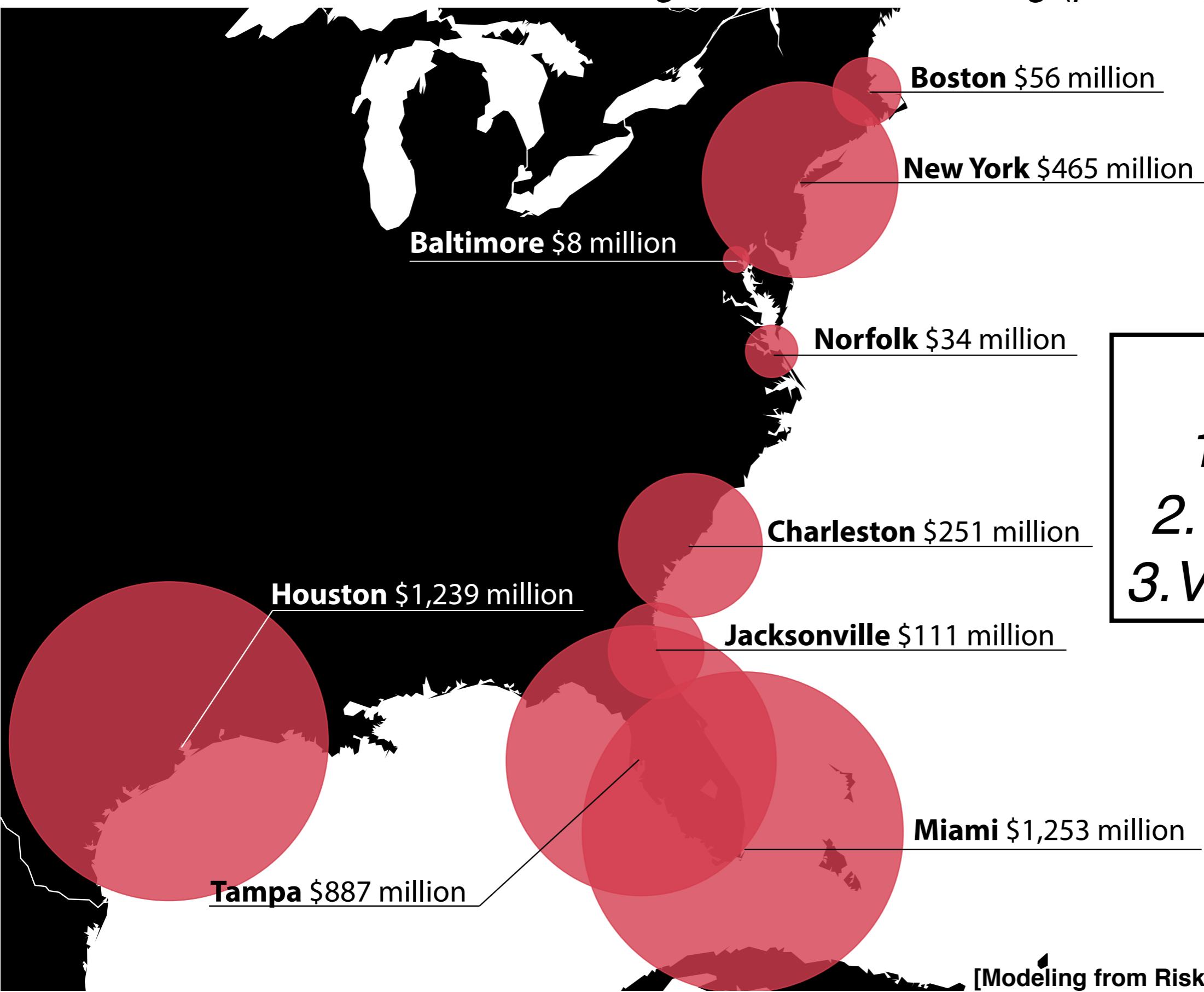


D.J. Rasmussen, R.E. Kopp, and M. Oppenheimer (in prep): **A damage allowance framework for calculating the design heights of coastal flood protection options under deeply uncertain future Antarctic ice melt.**

Available at : bit.ly/2VFd1nJ

Cities around the eastern U.S. are exposed to coastal flood risk

Annual average loss due to flooding (present)

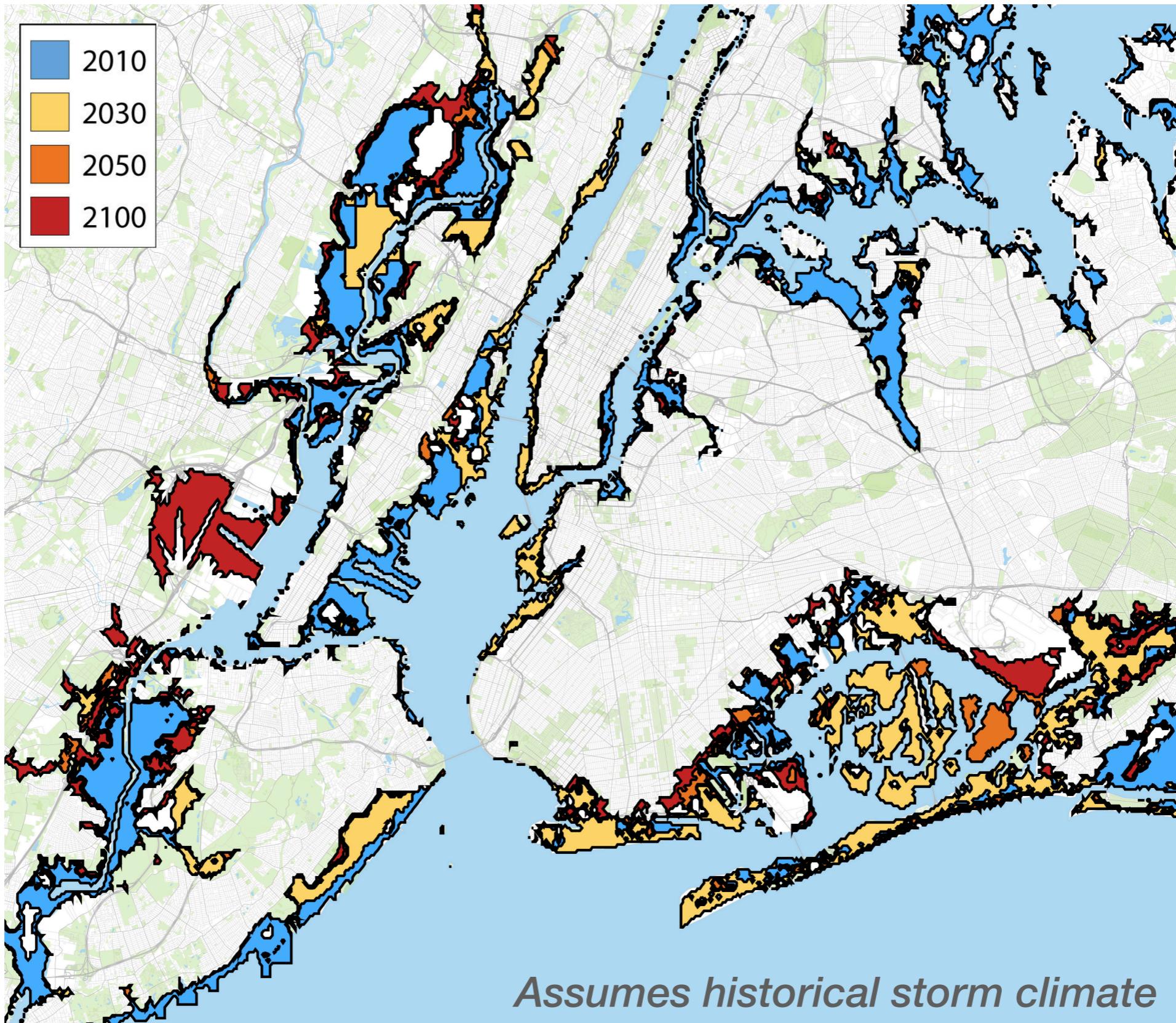


Risk

- 1. Hazard***
- 2. Exposure***
- 3. Vulnerability***

Sea-level rise leads to expanding flood zones

1% annual probability of flooding, New York City and New Jersey



An aerial photograph of a major coastal city, likely New York City, showing the dense urban skyline across a wide river or bay. In the foreground, a large shipping port is visible, filled with numerous colorful shipping containers stacked in organized rows. Several large cargo ships are docked at the port, and industrial cranes are scattered throughout the area. The water is a deep blue, and in the far distance, a range of mountains is visible under a clear sky.

**So what can we do to
reduce coastal flood risk?**

An aerial photograph of the Isle de Jean Charles, a narrow strip of land in southern Louisiana. The land is mostly green, with some brownish areas indicating wetlands or erosion. A small cluster of houses and buildings is visible along the coast. In the background, the Gulf of Mexico stretches to the horizon under a clear blue sky.

Relocate



[Isle de Jean Charles, Louisiana]

[Mexico Beach, Florida/ Hurricane Michael]



Protect

[Maeslant Surge Barrier]

The design of these strategies must consider the key processes that drive coastal flooding:

1. Changing mean sea-levels
2. Extreme events

Sources of global mean sea-level change

Contributions over 1993-2010 that comprise
trend of 3.0 ± 0.7 mm/yr

Terrestrial water
storage

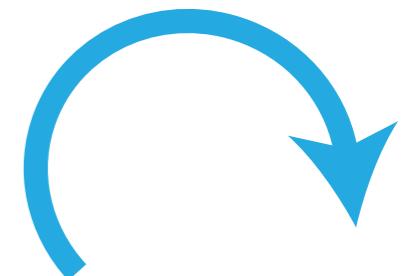
Ice
melting

50%

37%

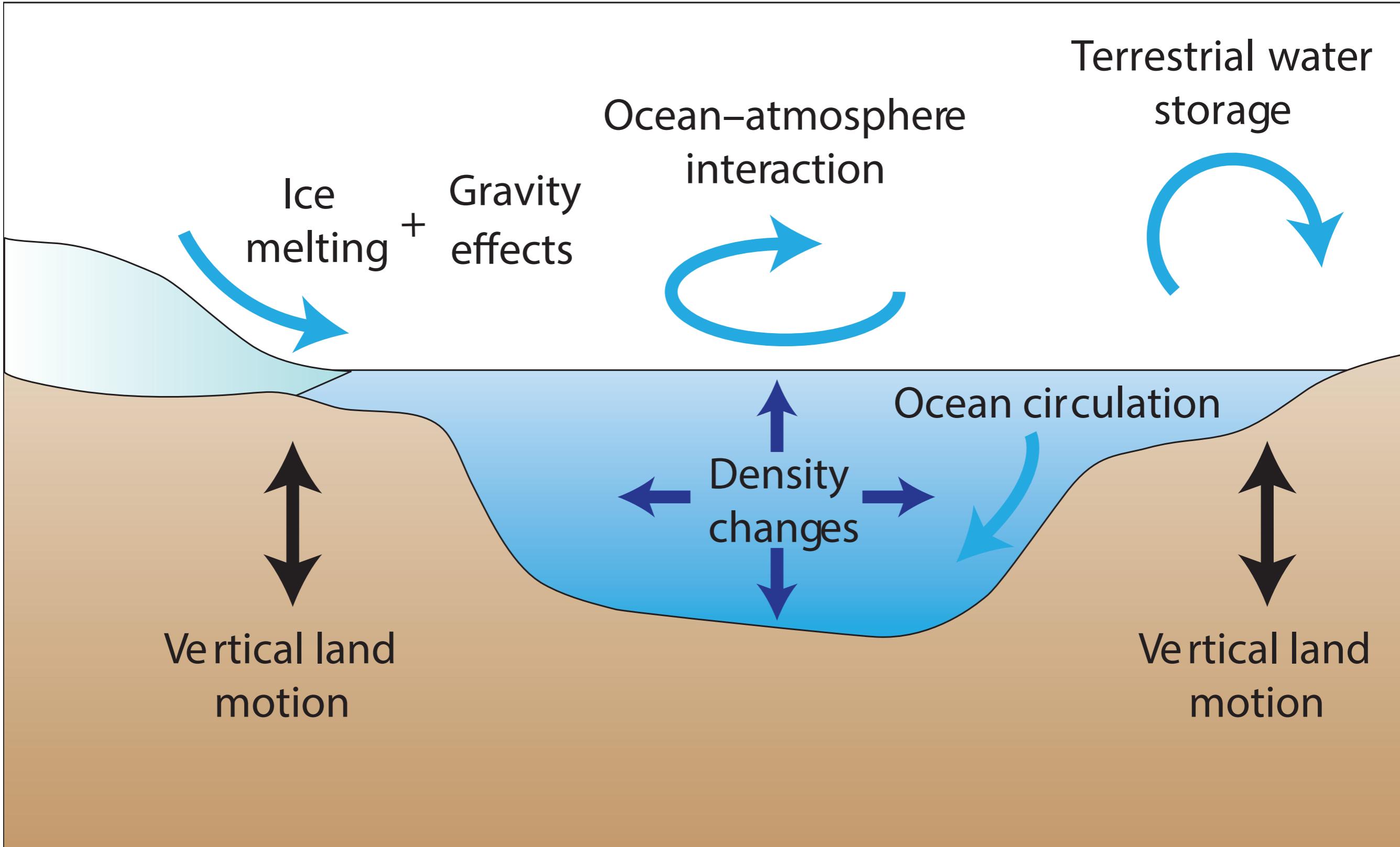
Density
changes

13%



Local sea-level change is more complex

Local sea-level change is more complex



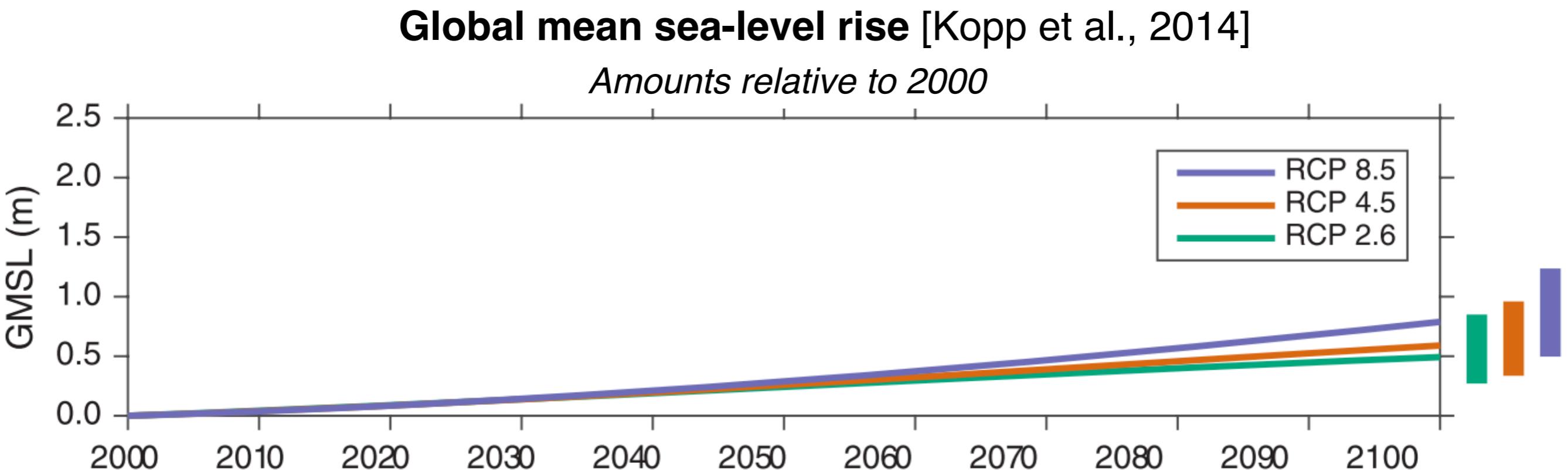
Future projections of sea-level rise

Approach: “bottom-up” accounting of components over time and their uncertainty

Global mean sea-level rise [Kopp et al., 2014]

Future projections of sea-level rise

Approach: “bottom-up” accounting of components over time and their uncertainty

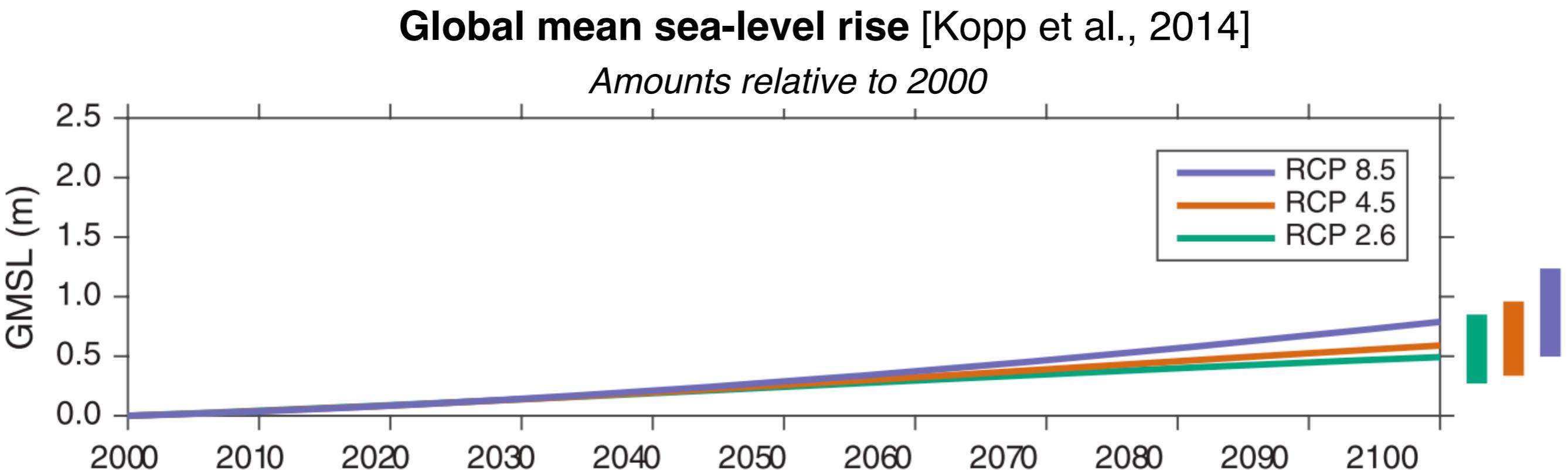


Year	Projected global-mean SLR (90% probability range; RCP 8.5)
2030	0.1-0.2 m (0.3-0.6 ft)
2050	0.2-0.4 m (0.7-1.3 ft)
2100	0.5-1.2 m (1.6-4.0 ft)

Amounts relative to 2000

Future projections of sea-level rise

Approach: “bottom-up” accounting of components over time and their uncertainty

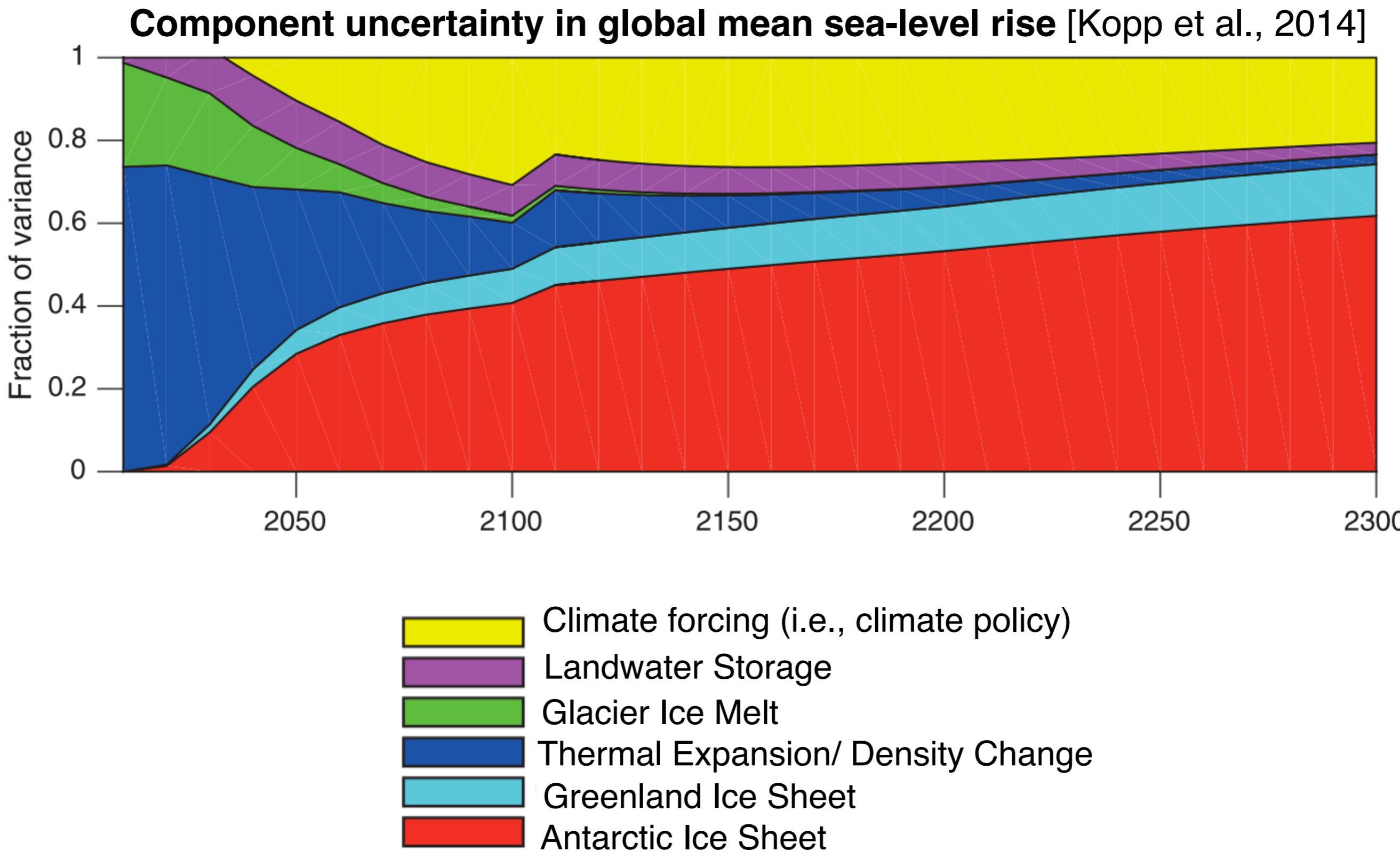


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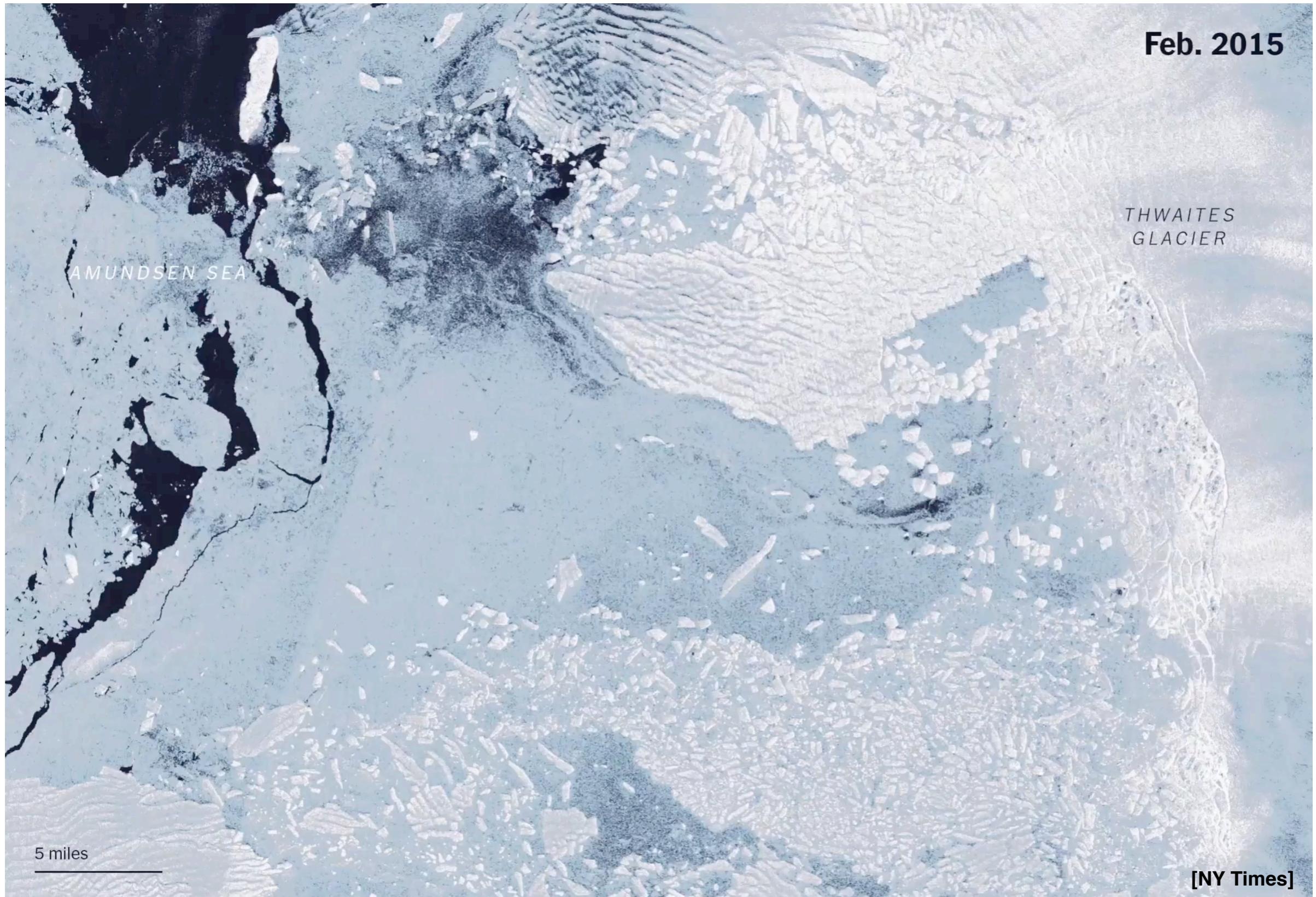
Amounts relative to 2000

The rate and amount of future sea-level rise is uncertain

Antarctic ice sheet dominates future sea-level rise uncertainty after 2050 (sea-level rise “wildcard”)



What happens in Antarctica doesn't stay in Antarctica...

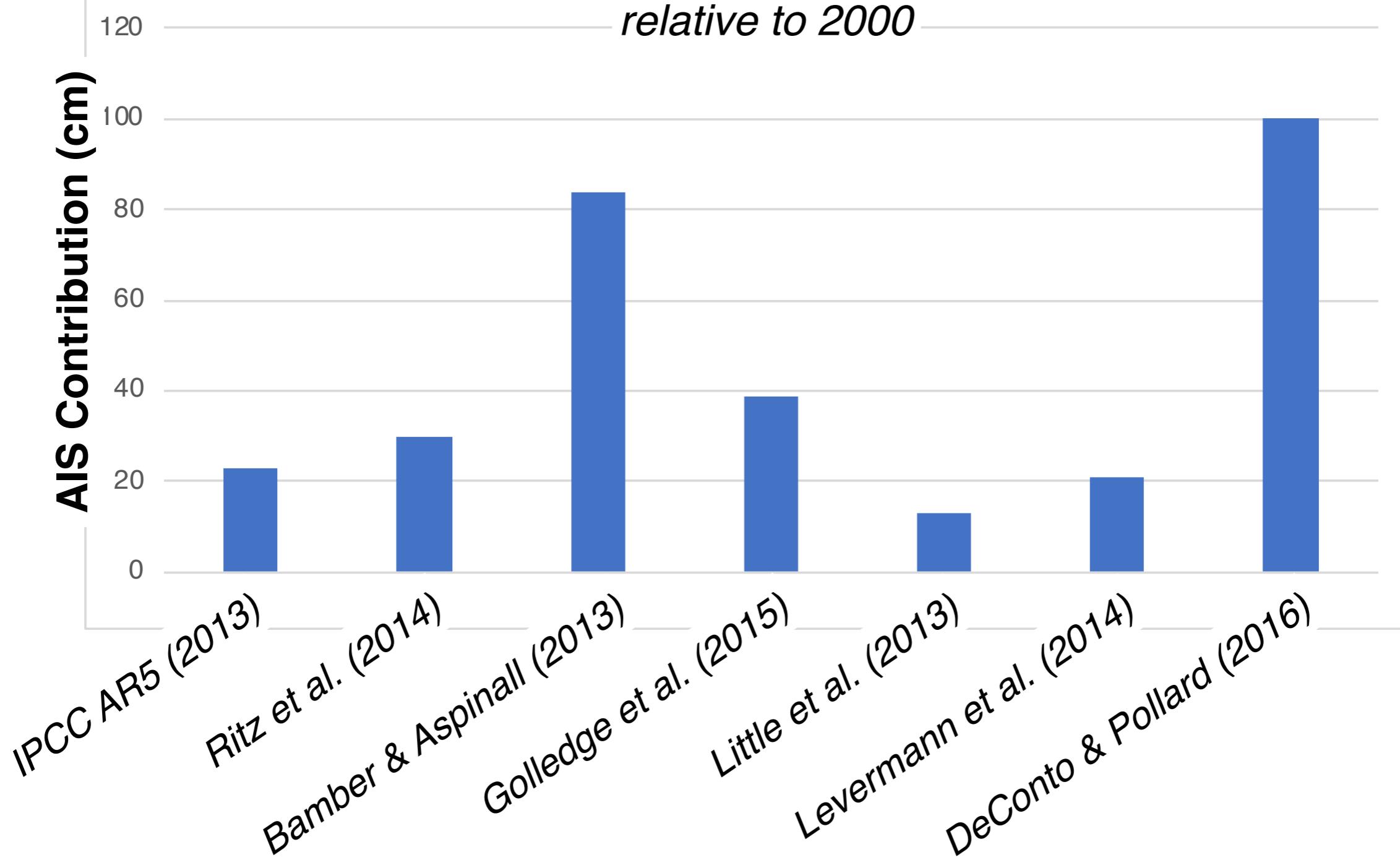


Antarctic ice sheet (AIS) contribution to sea level is a rapidly evolving area of research, but remains deeply uncertain

“Deeply uncertain”: No single, unambiguous probability distribution of future Antarctic behavior exists

Contributions from AIS to future global mean sea-level by 2100 (95th percentile)

relative to 2000

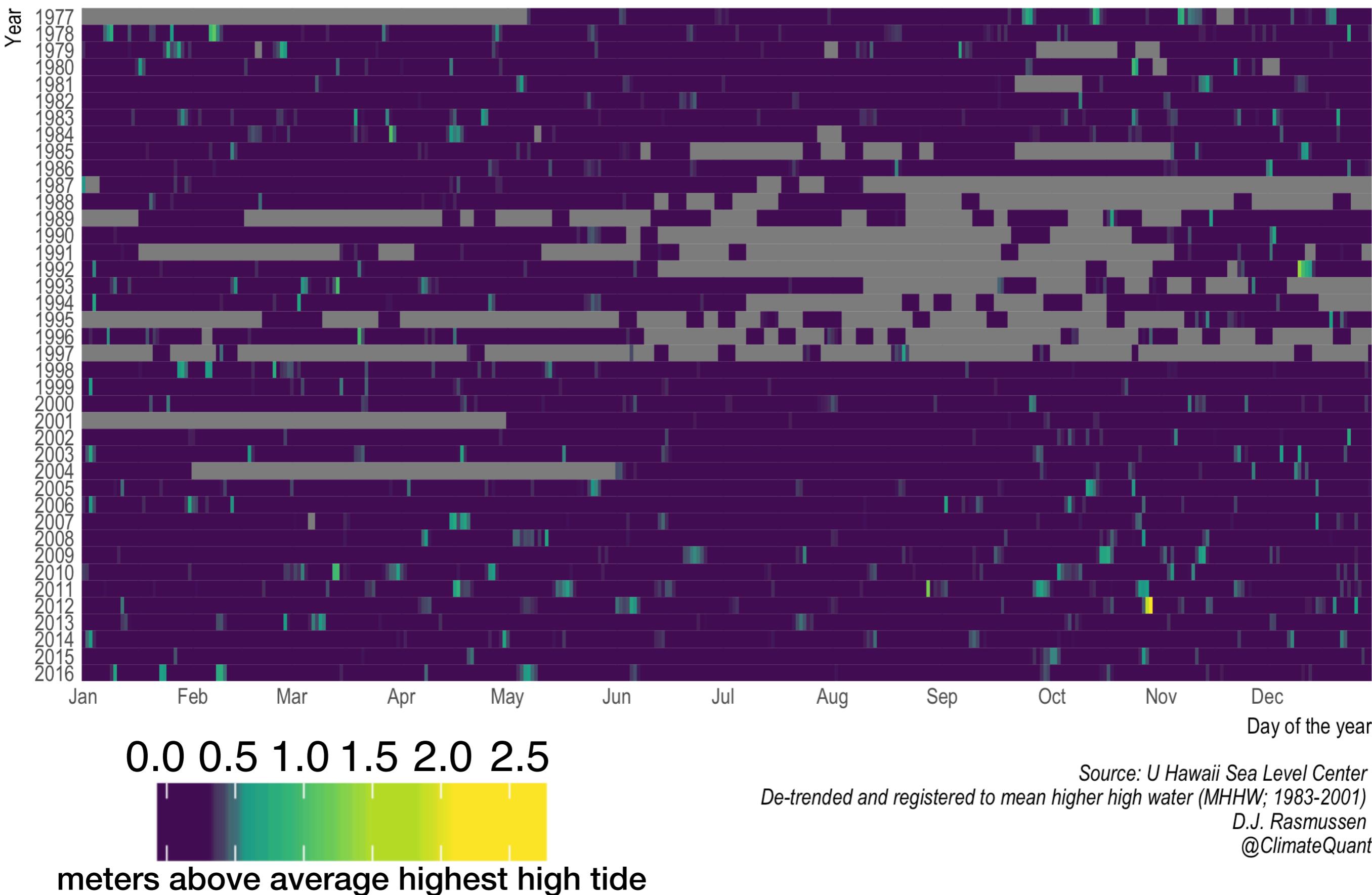


*****Applications using sea-level rise data (post-2050) should accommodate this ‘deep uncertainty’*****

2. extreme coastal water levels

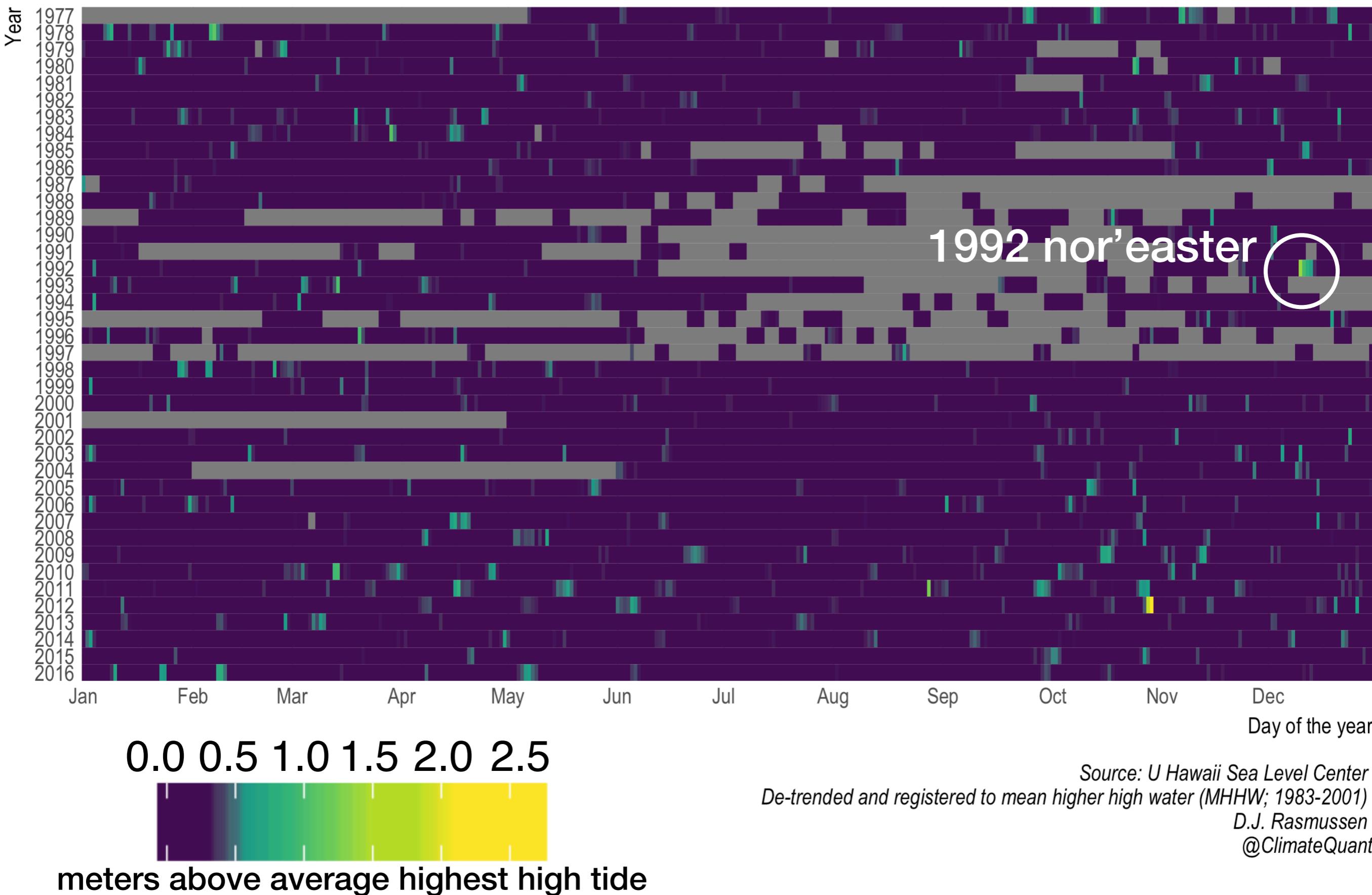
Extreme coastal water level events at the Battery, New York City

1977-2016 (Grey are missing data)



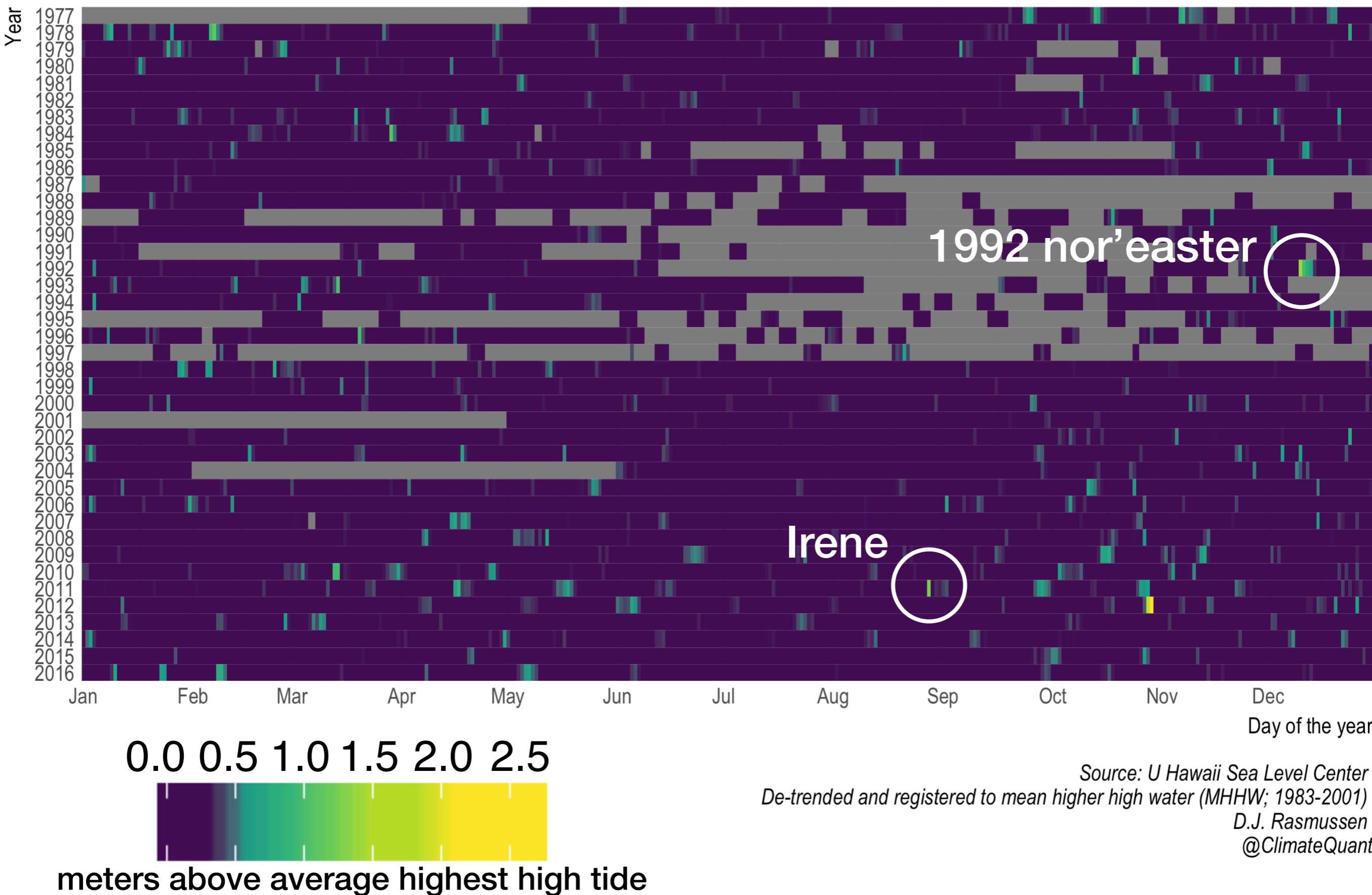
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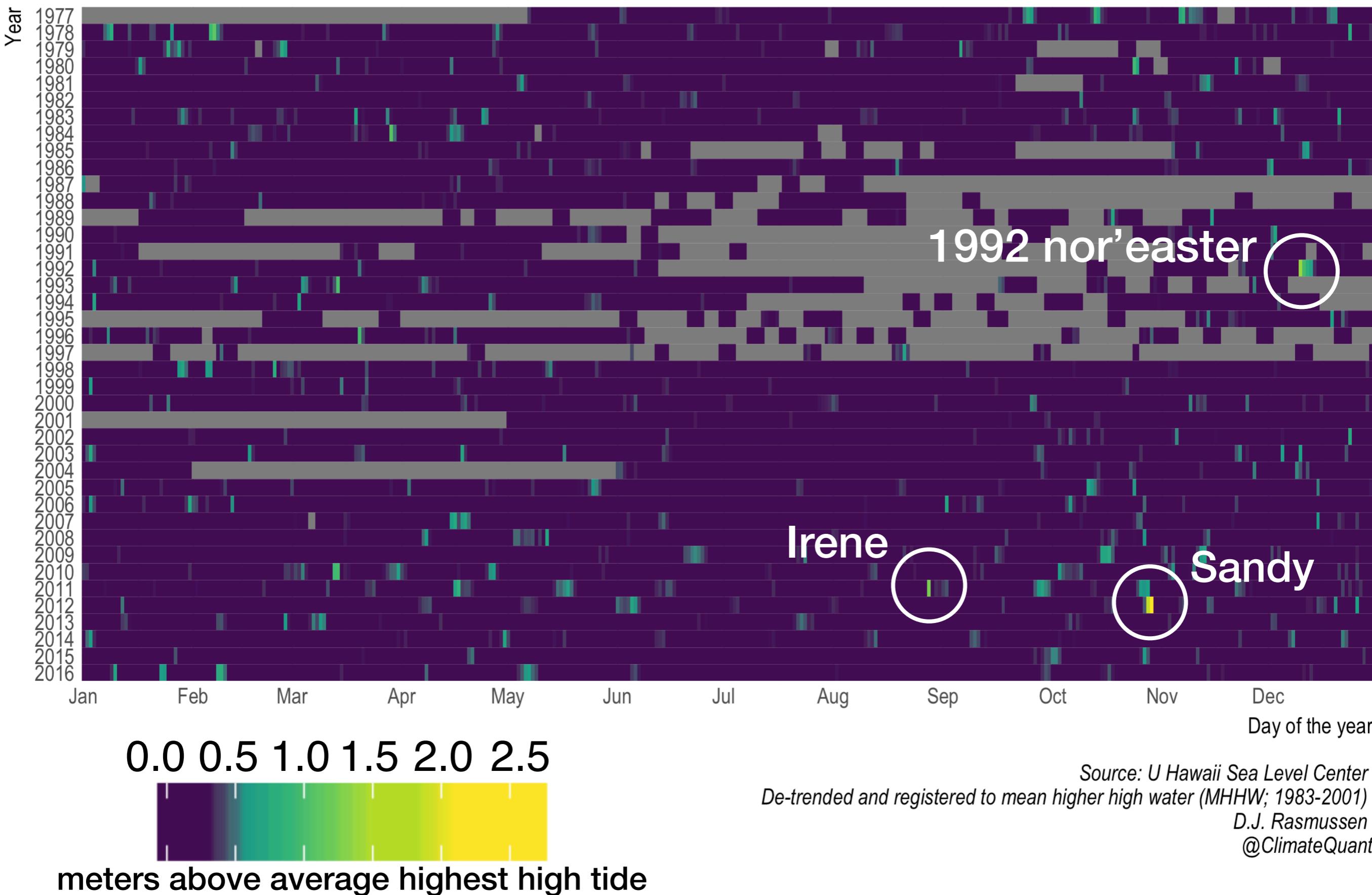
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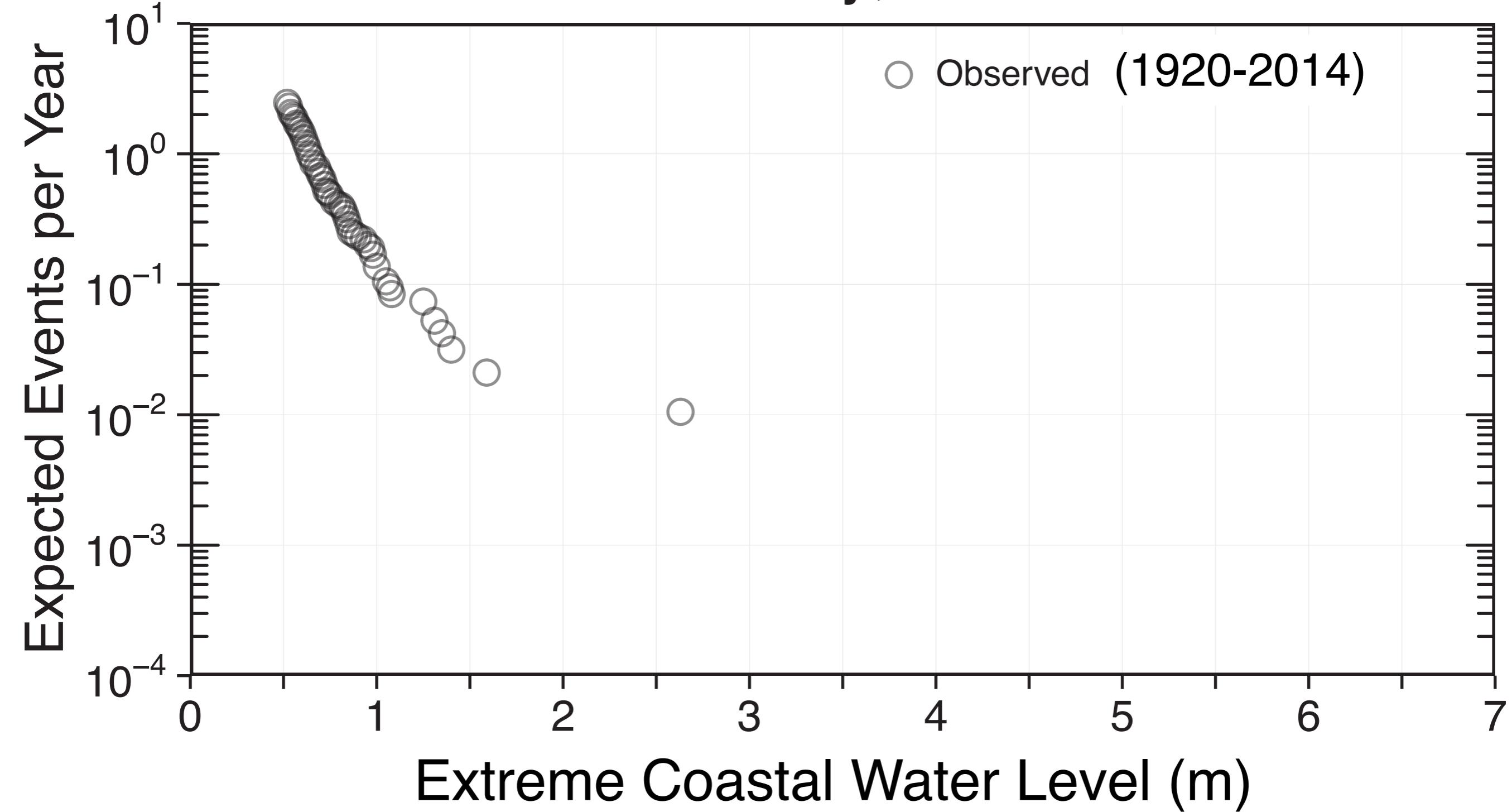
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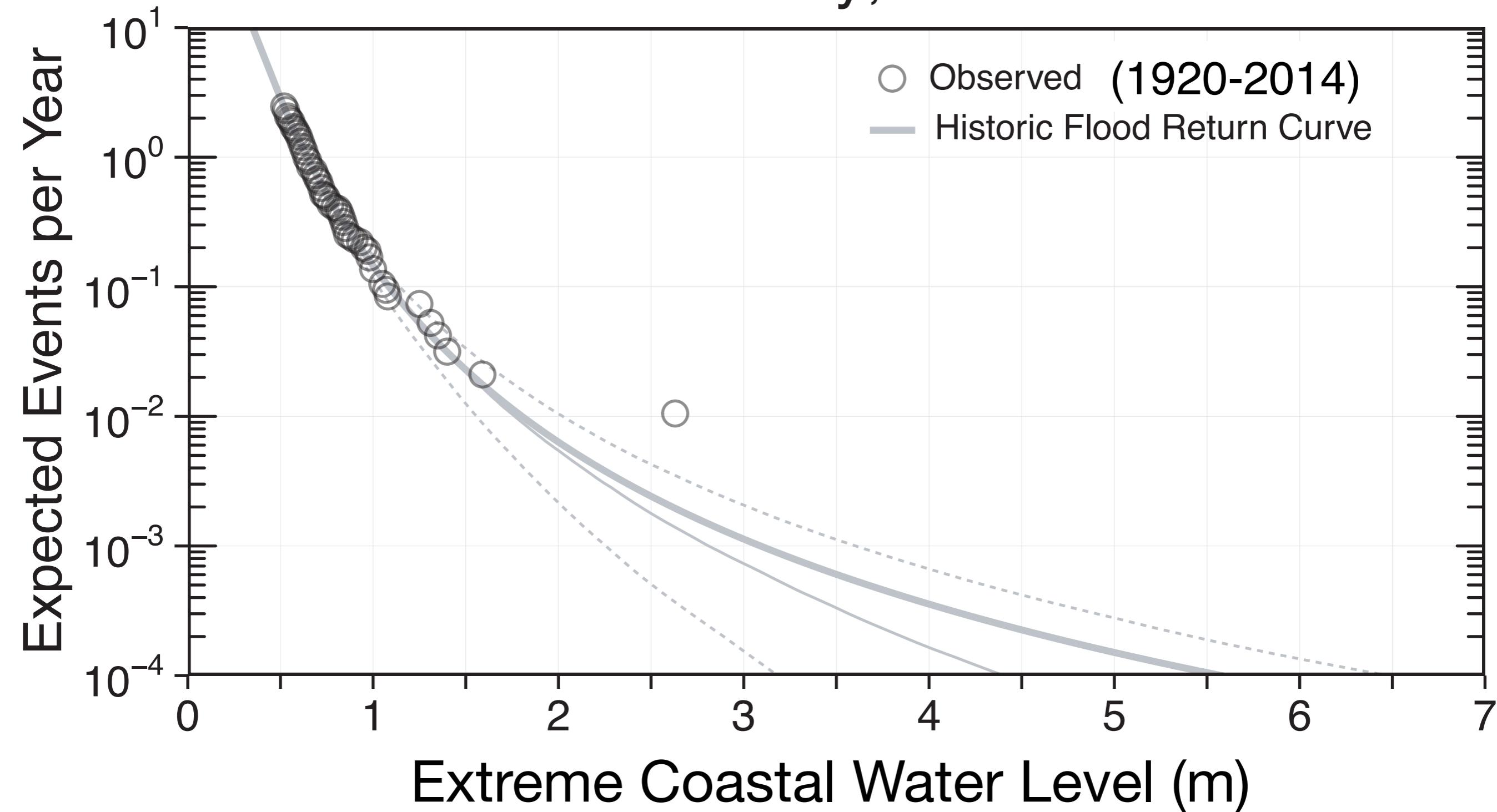
**Long-term hourly records of sea level contain information
about extreme water levels that can lead to flooding**

New York City, U.S.A.



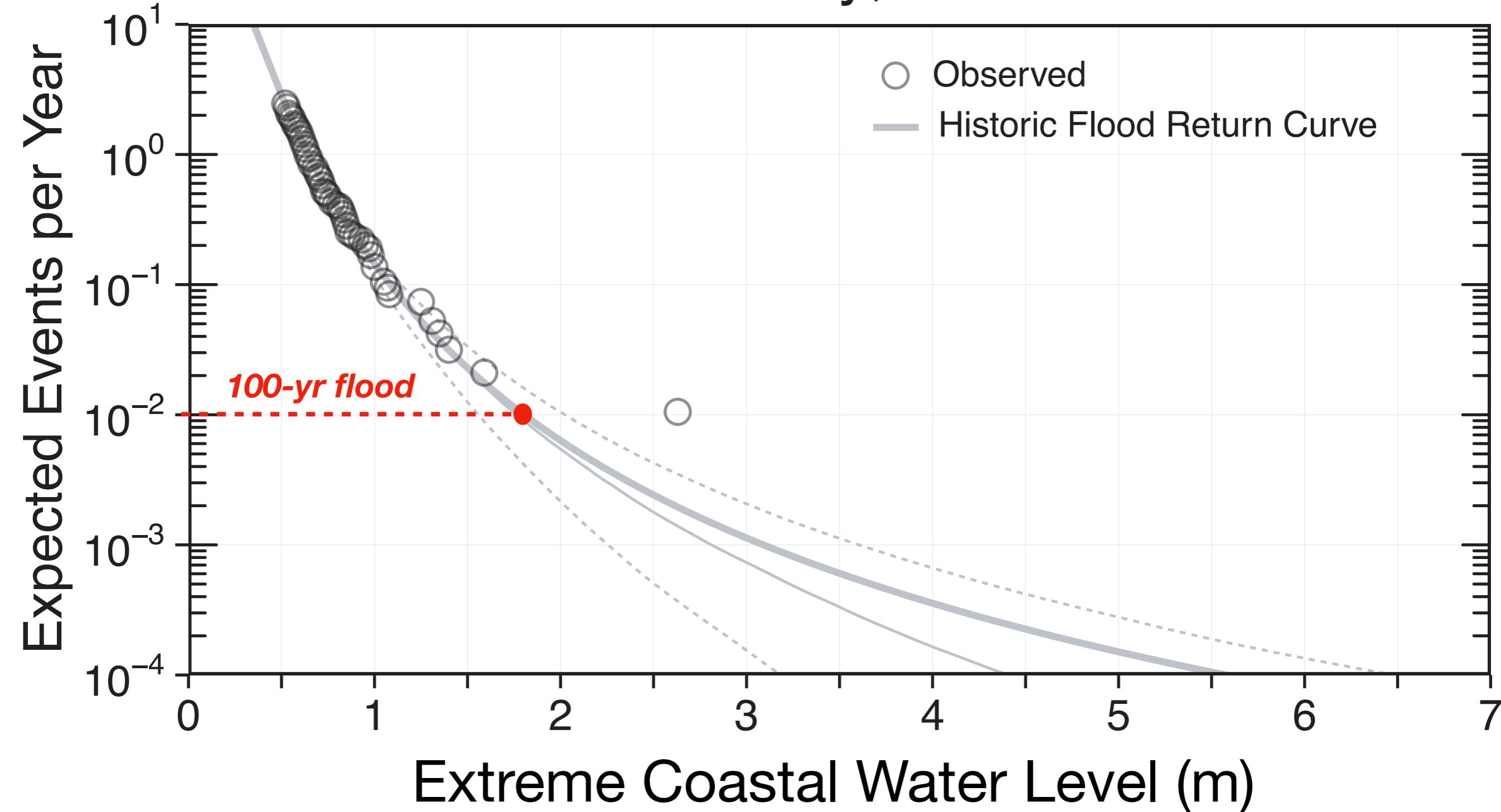
Extreme value theory used to fit a probability distribution to observed extreme sea levels

New York City, U.S.A.

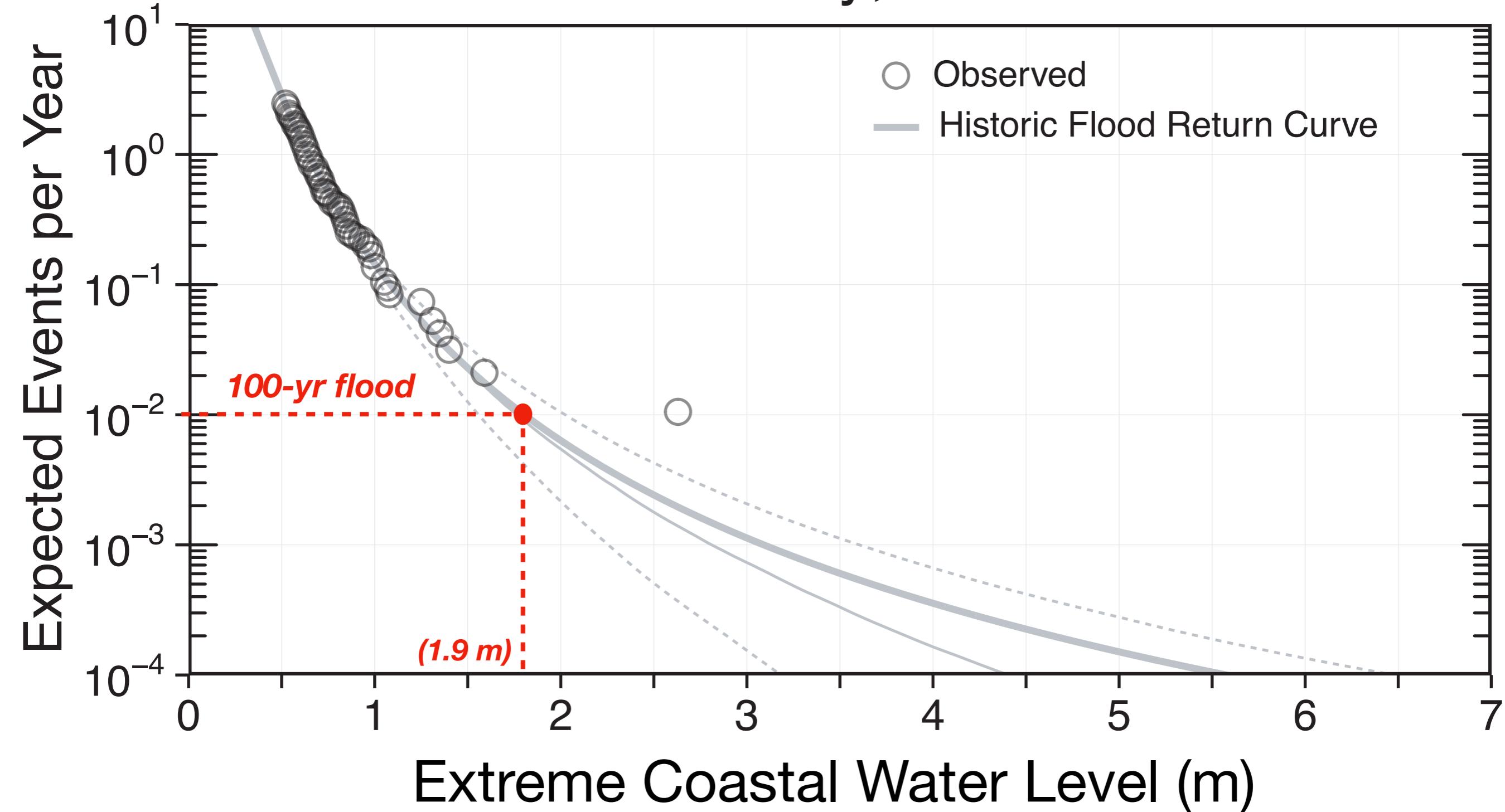


Return periods of water levels of various heights can be estimated

New York City, U.S.A.

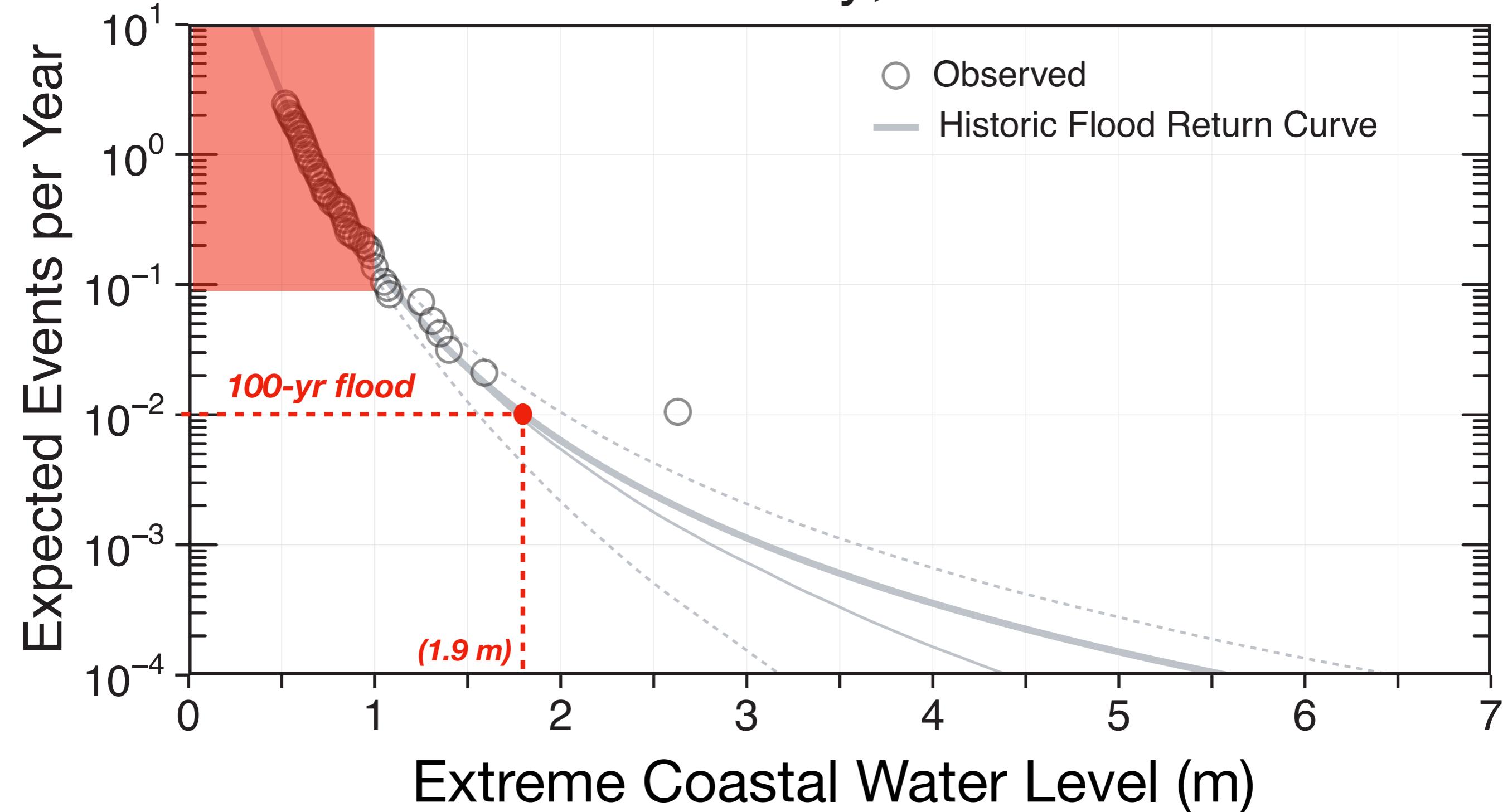


New York City, U.S.A.



The most frequent events usually lead to minor damages

New York City, U.S.A.

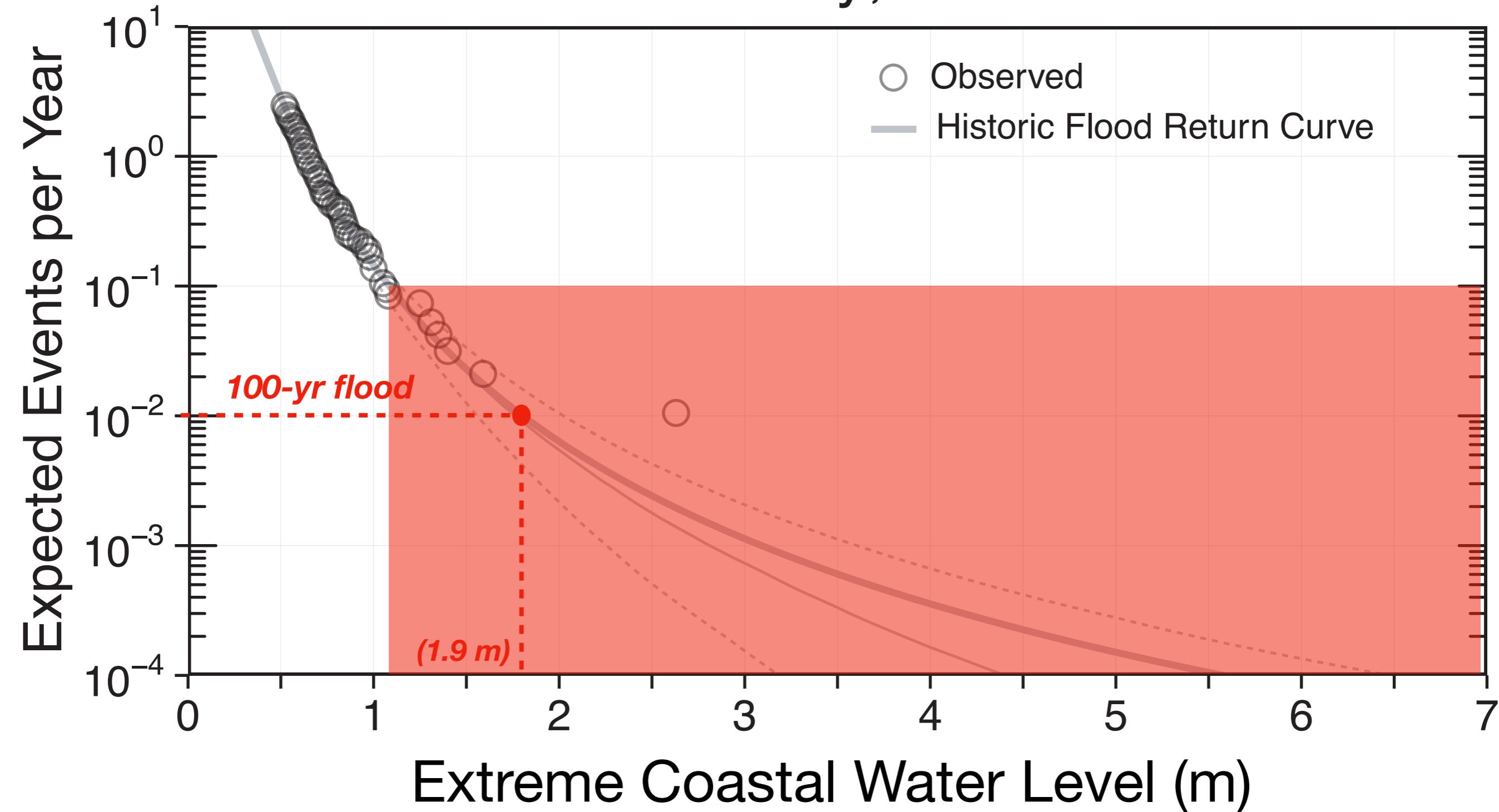


A photograph of a residential street completely submerged in floodwater. Several houses are visible along the left side, and a few cars are parked in the water. A chain-link fence on the right has a red sign that reads "KEEP OUT".

High tide flooding

Rare events can lead to catastrophic damage, if not well protected

New York City, U.S.A.





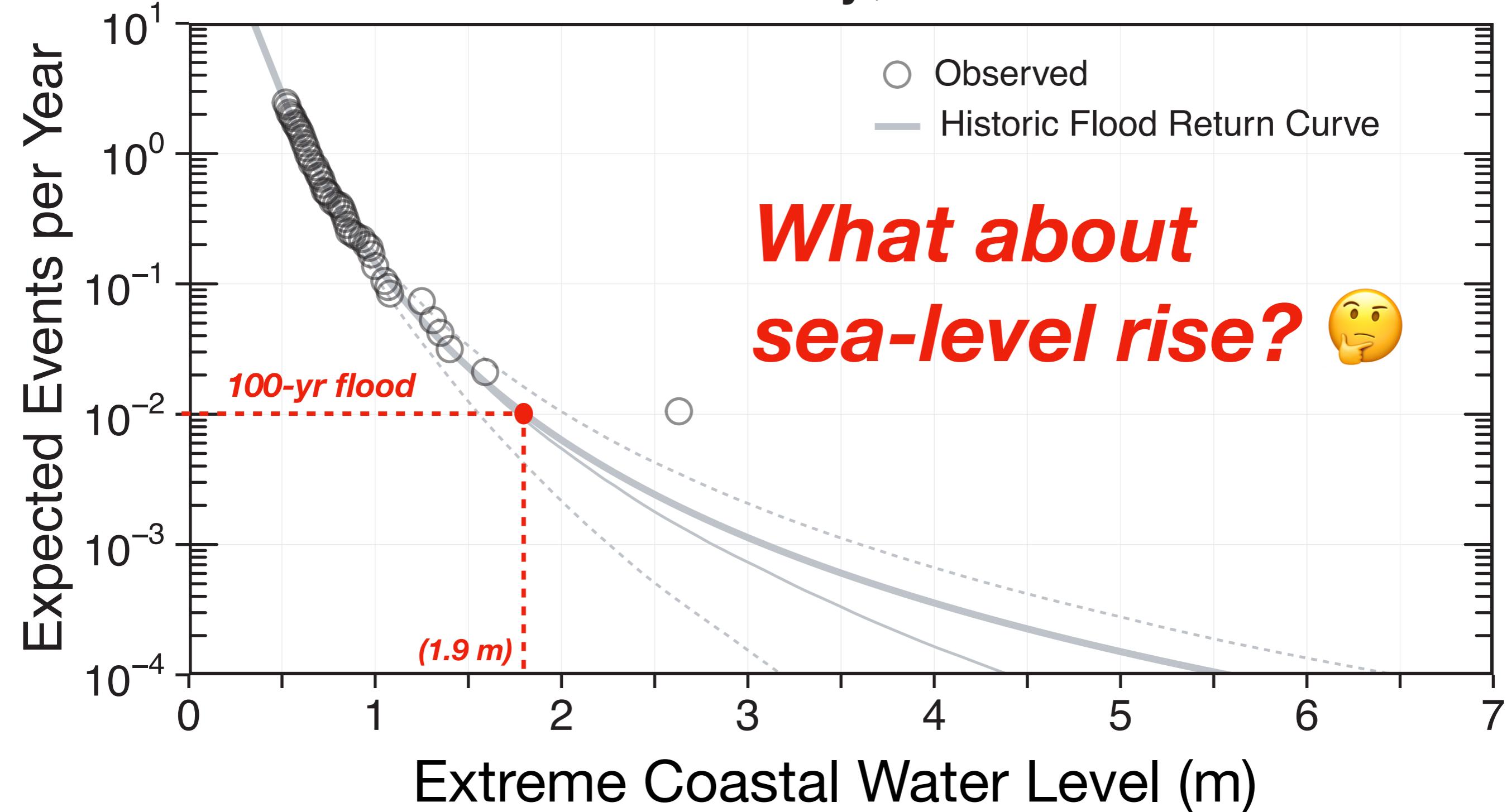
LaGuardia Airport (Nov. 1950)



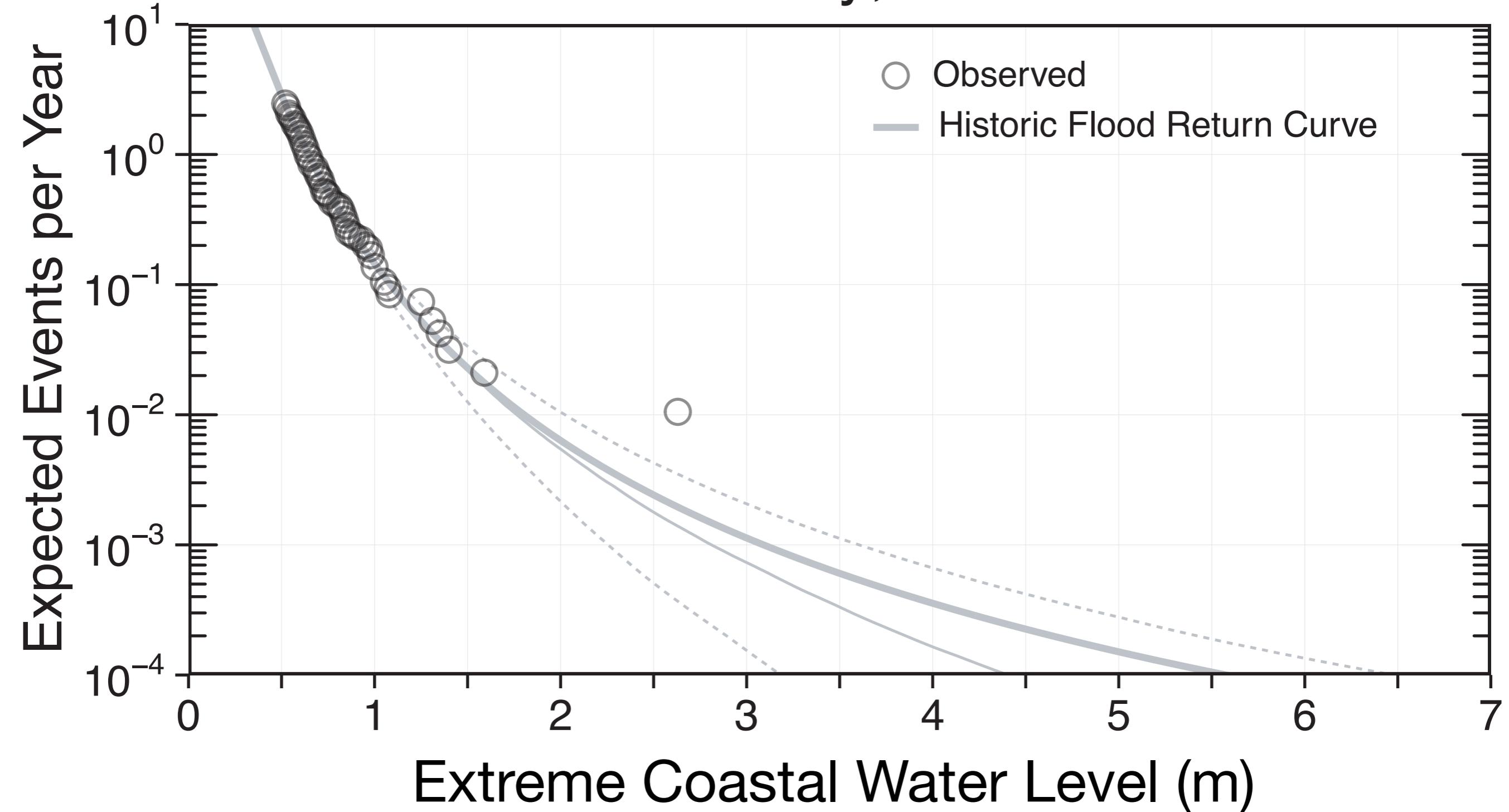
South Ferry Subway (Oct. 2012)

Rare event flooding

New York City, U.S.A.

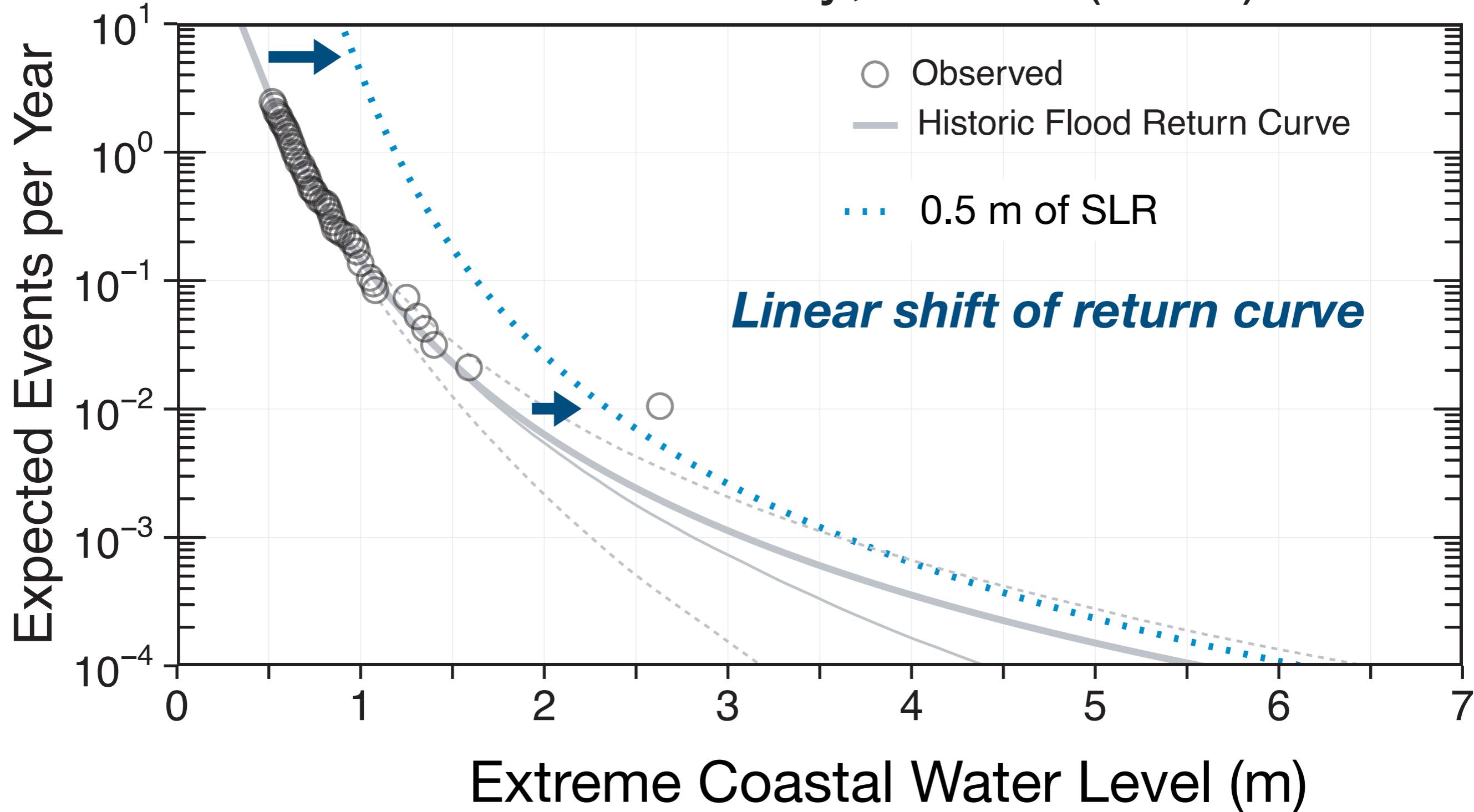


New York City, U.S.A.



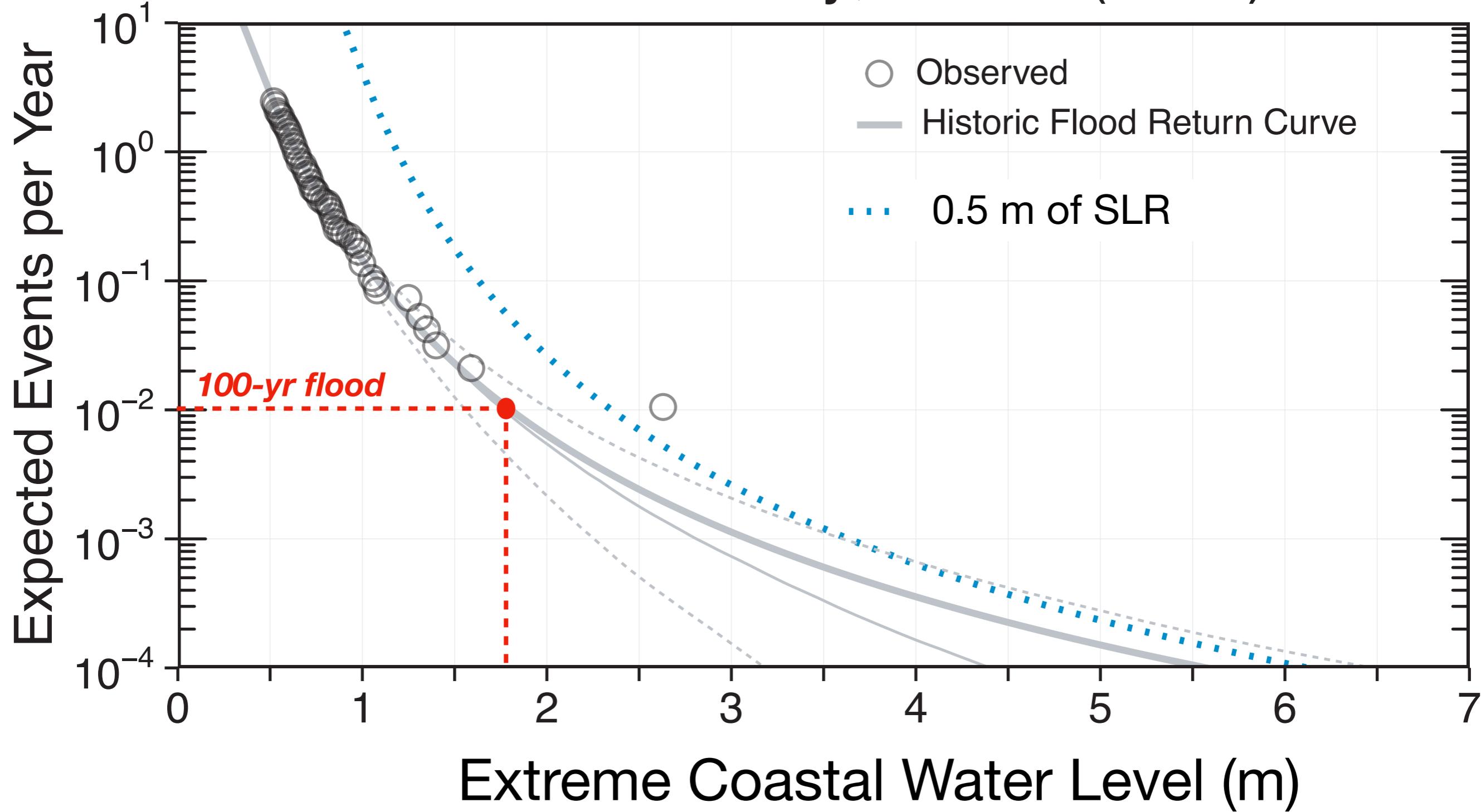
Sea-level rise increases the frequency of all extreme water level events

New York City, U.S.A. (2100)



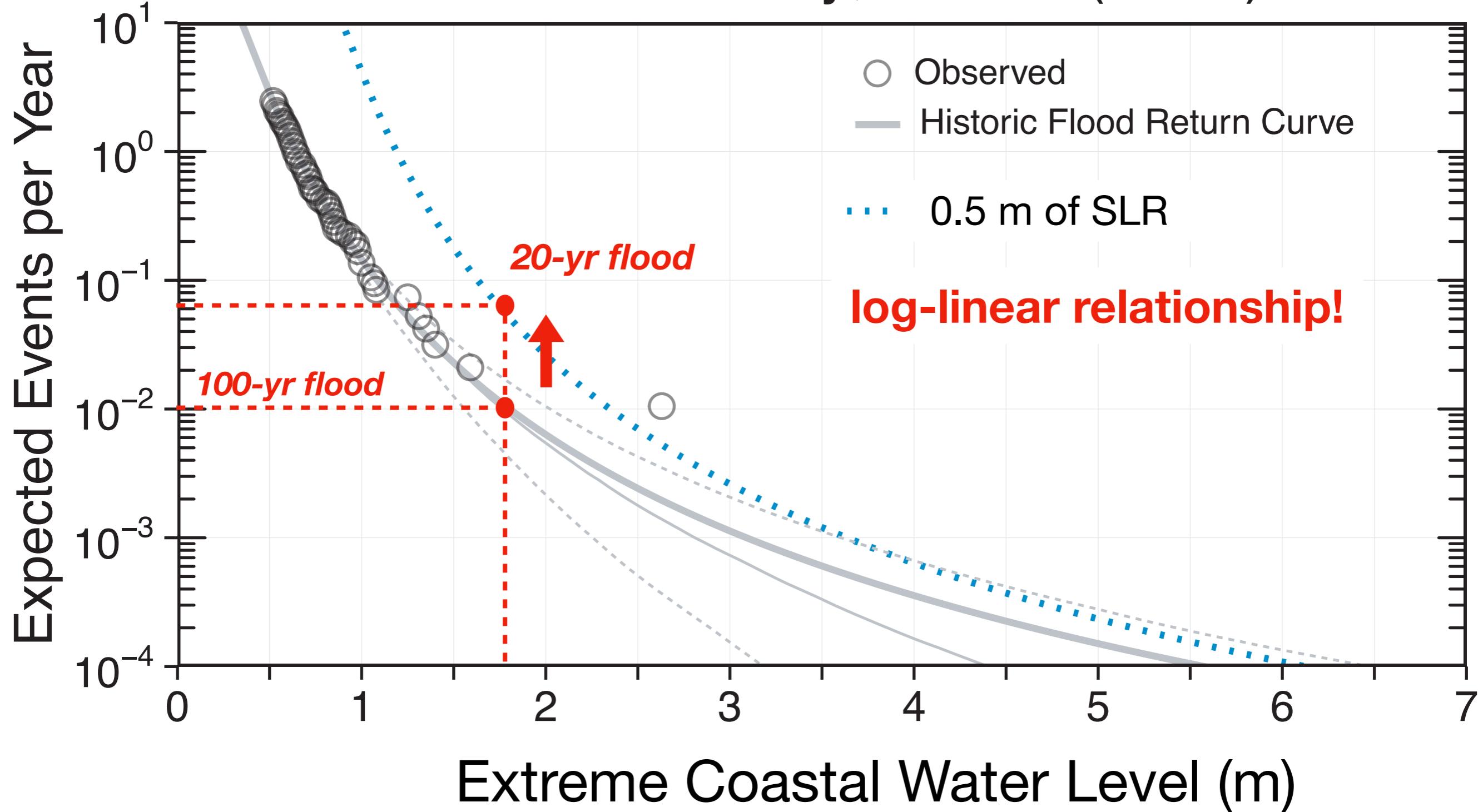
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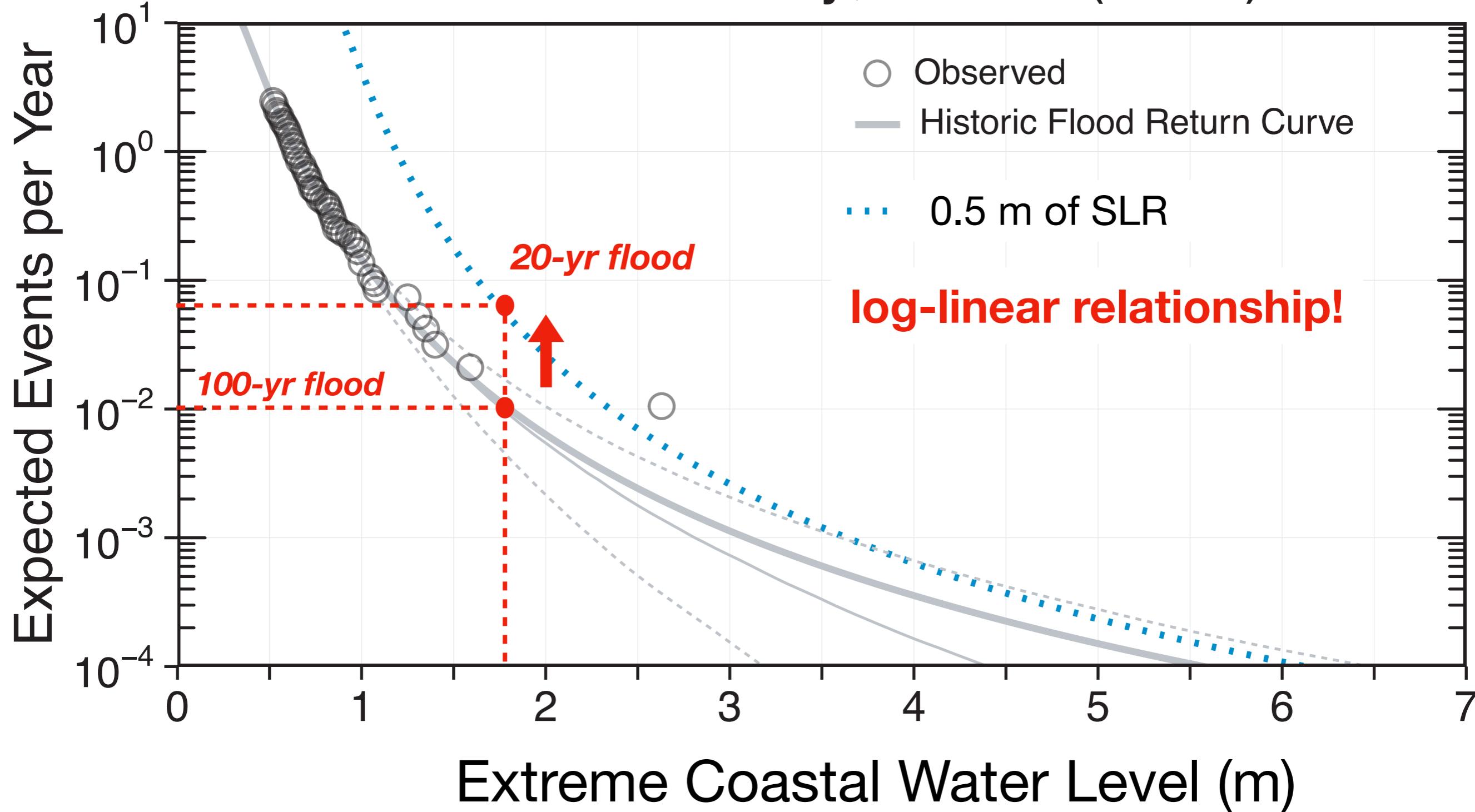
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How to design to a ‘moving’ target?

A ‘flood allowance’ accommodates changing frequency of extreme water levels

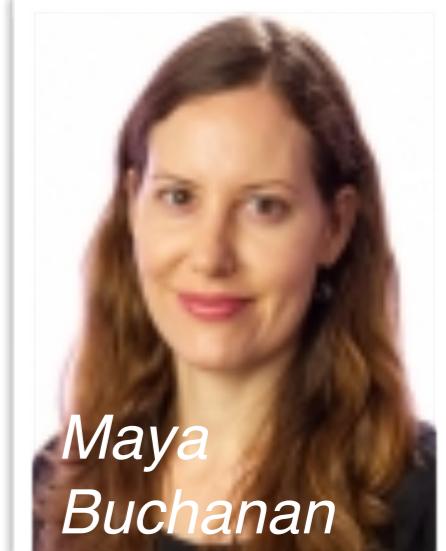
[Hunter, 2012; Buchanan et al., 2016]

Flood allowance (noun): the vertical required to keep the expected number of extreme coastal water level events constant under uncertain sea-level change

Engineering metric: “How high to build the levee?”



John Hunter



Maya
Buchanan

A ‘flood allowance’ accommodates changing frequency of extreme water levels

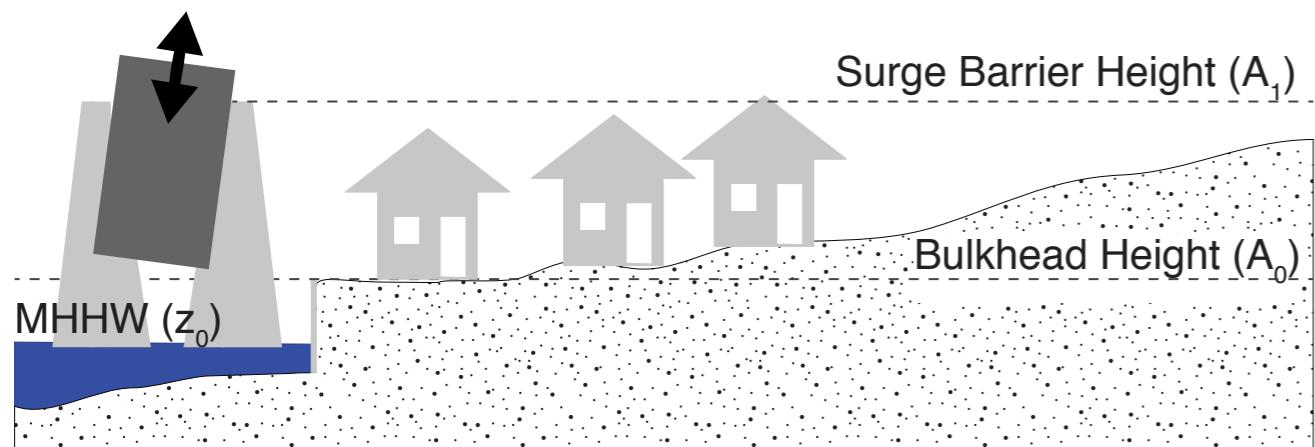
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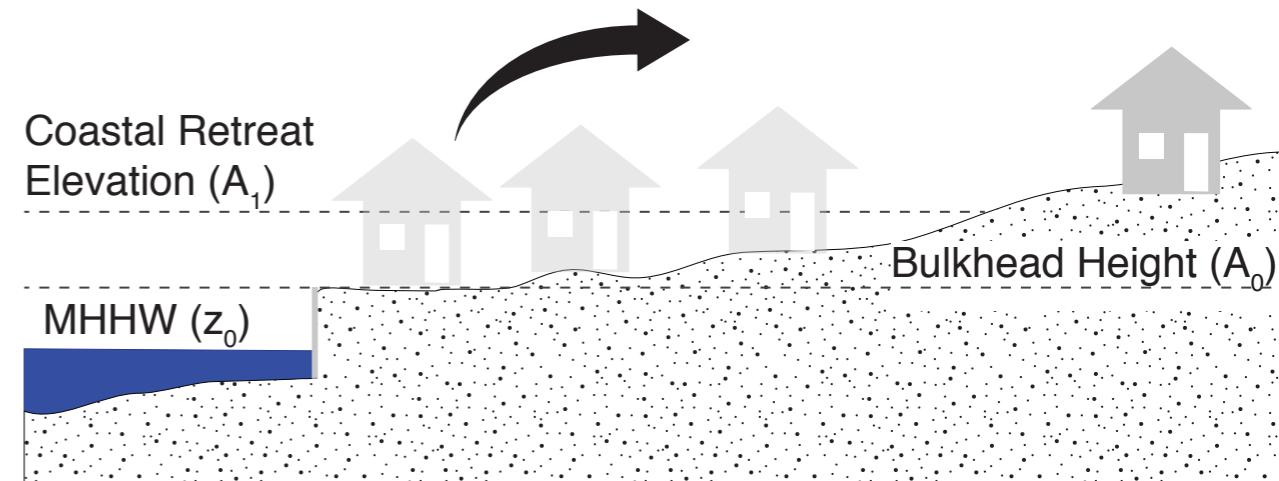
Engineering metric: “How high to build the levee?”

Examples:

Surge Barrier



Coastal Retreat



John Hunter



Maya Buchanan

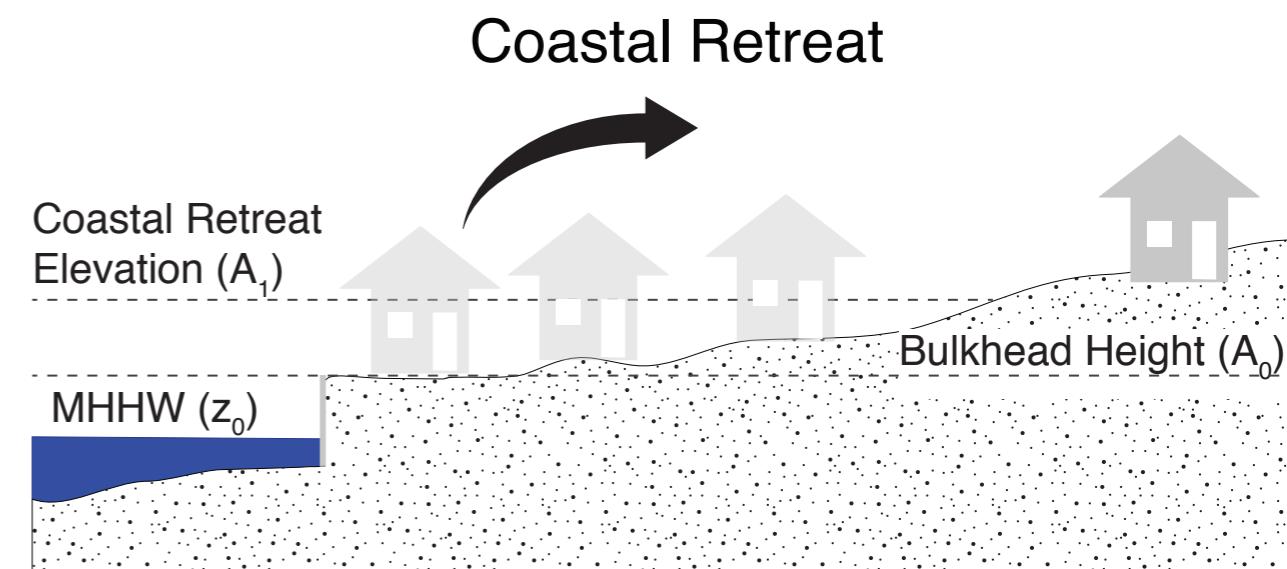
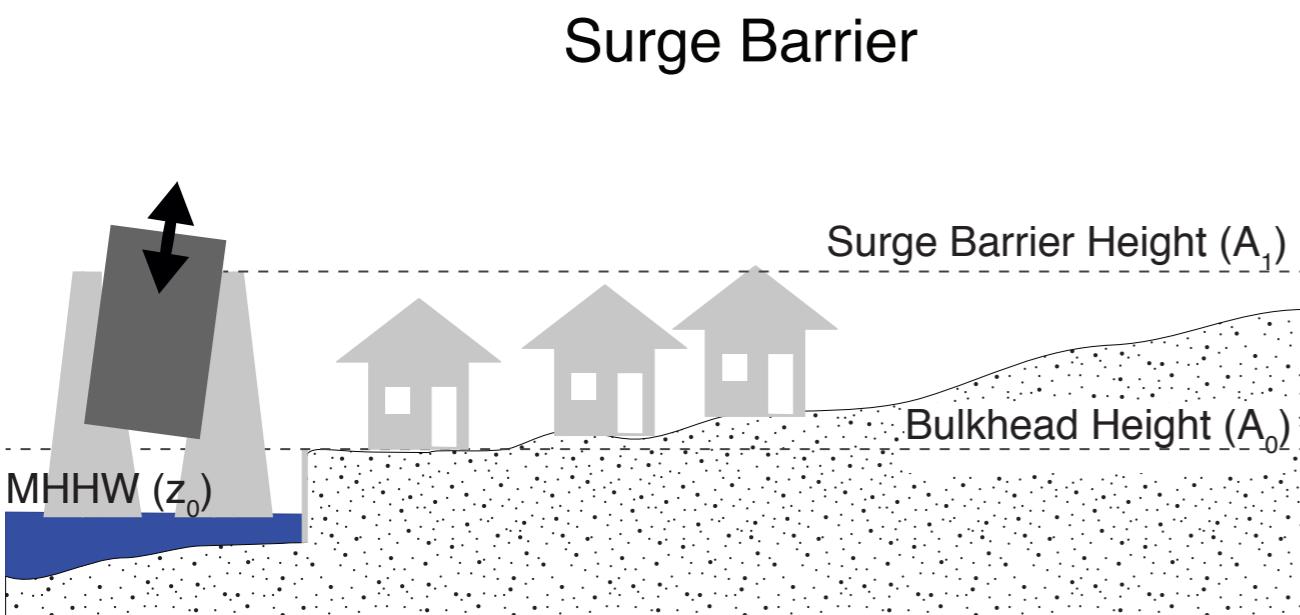
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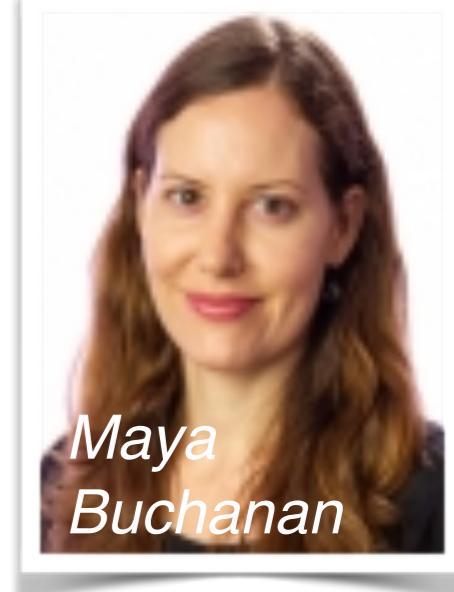
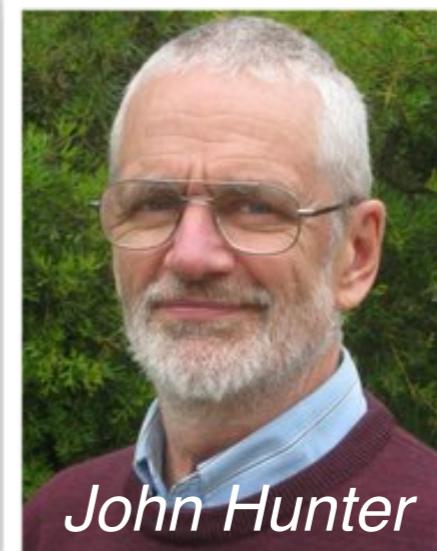
Engineering metric: “How high to build the levee?”

Examples:



Type of flood allowances:

1. For a given point in time (“instantaneous”)
2. Over a given time period (“design life”)



John Hunter

Maya Buchanan

Flood allowance illustrated with basic math

Sea-level rise increases exceedance probability of z : $f(z-\Delta)$

$$f(z^*) = f(z^* - \Delta + A(z^*))$$

Height of extreme water level: $z^* = 1.9\text{ m}$

Current exceedance probability of z^* : $f(z^*) = 0.01$

Known amount of local sea-level rise: $\Delta = 0.5\text{ m}$

Vertical adjustment to maintain $f(z^*)$: $A(z^*)$ *the “allowance”*

Flood allowance illustrated with basic math

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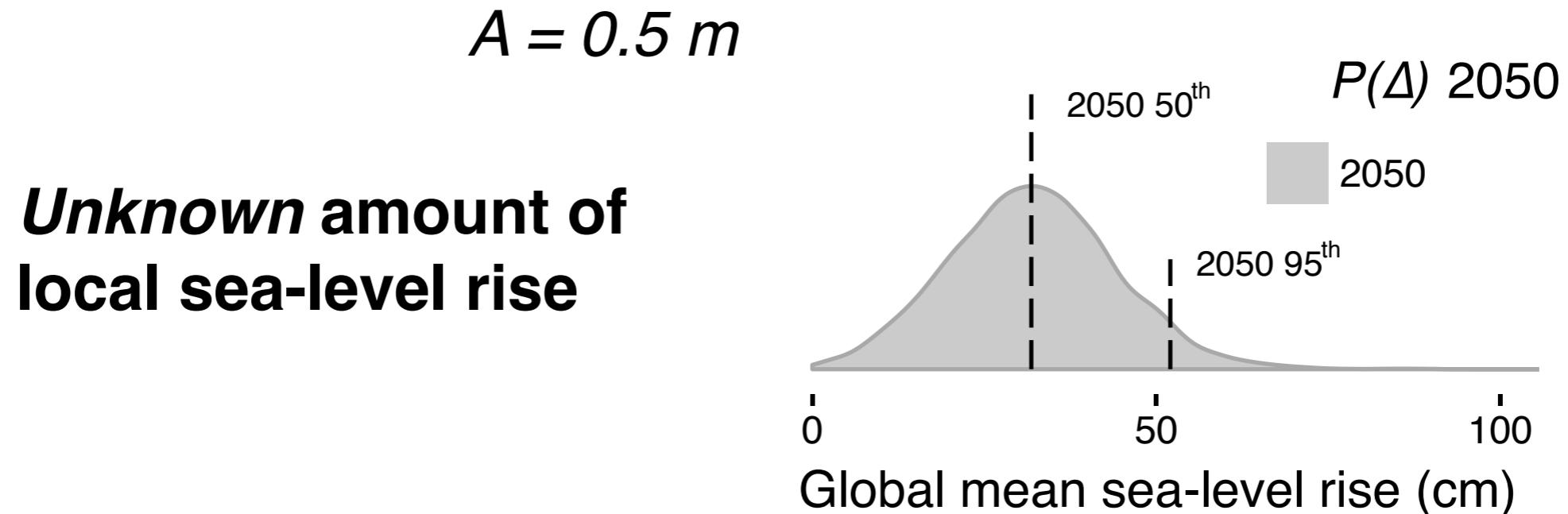
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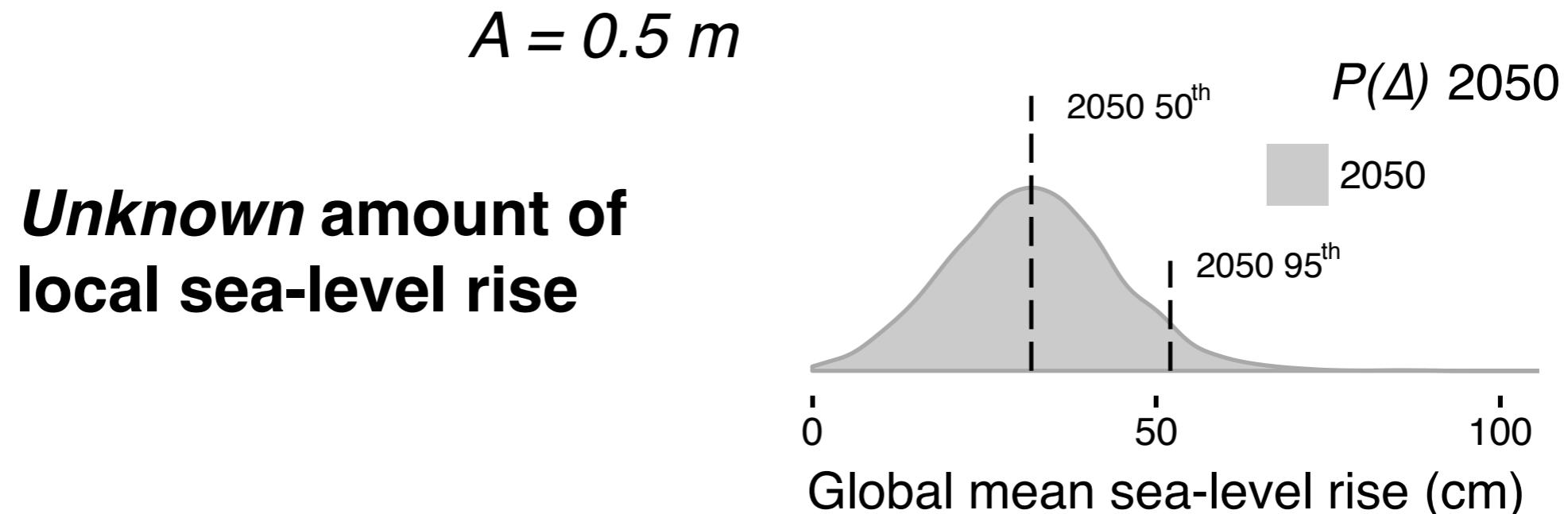
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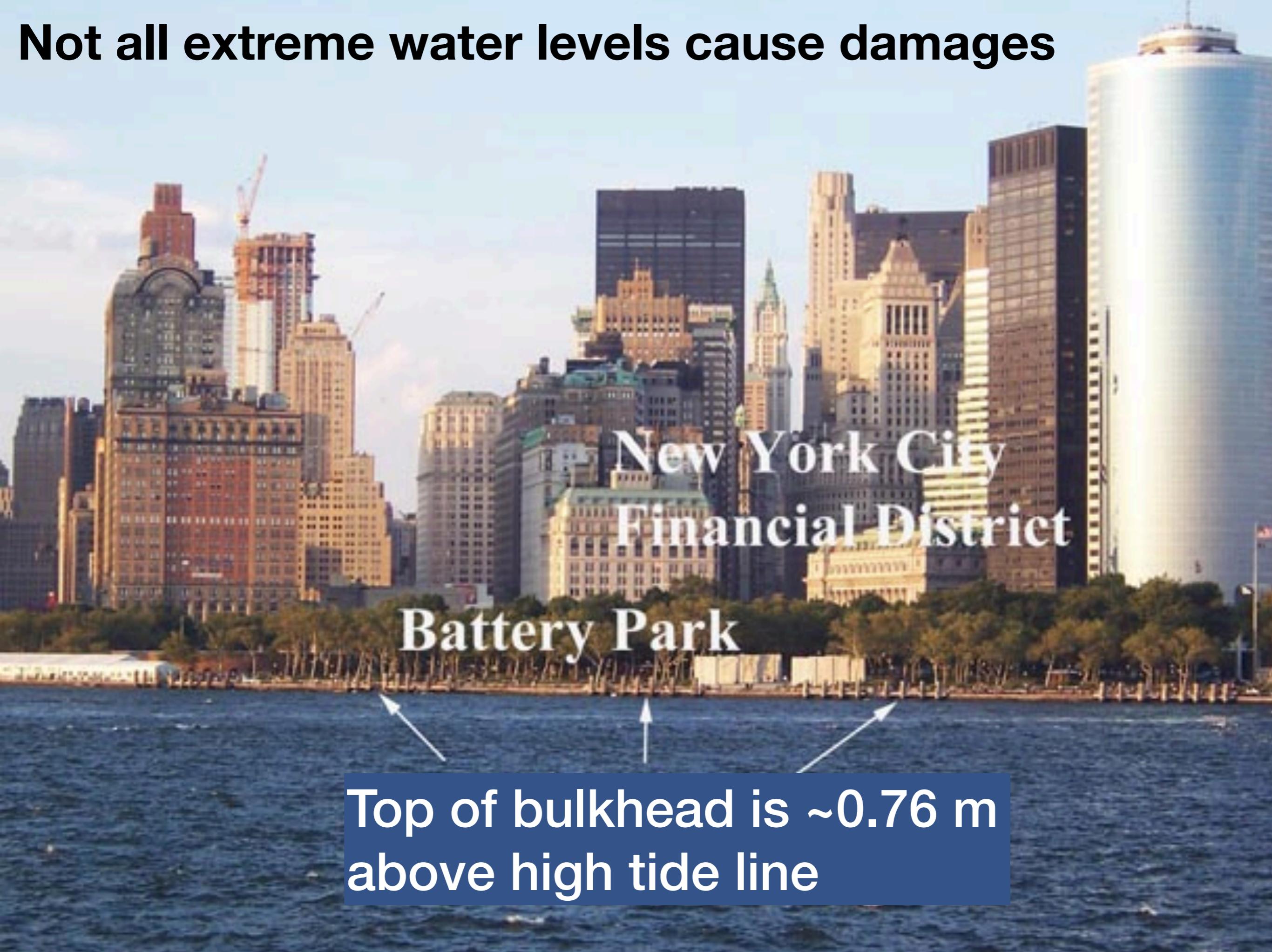
Vertical adjustment to maintain $f(z^*)$: $A(z^*)$ *the “allowance”*



$$f(z^*) = \int_{\Delta} f(z^* - \Delta + A(z^*)) P(\Delta) d\Delta$$

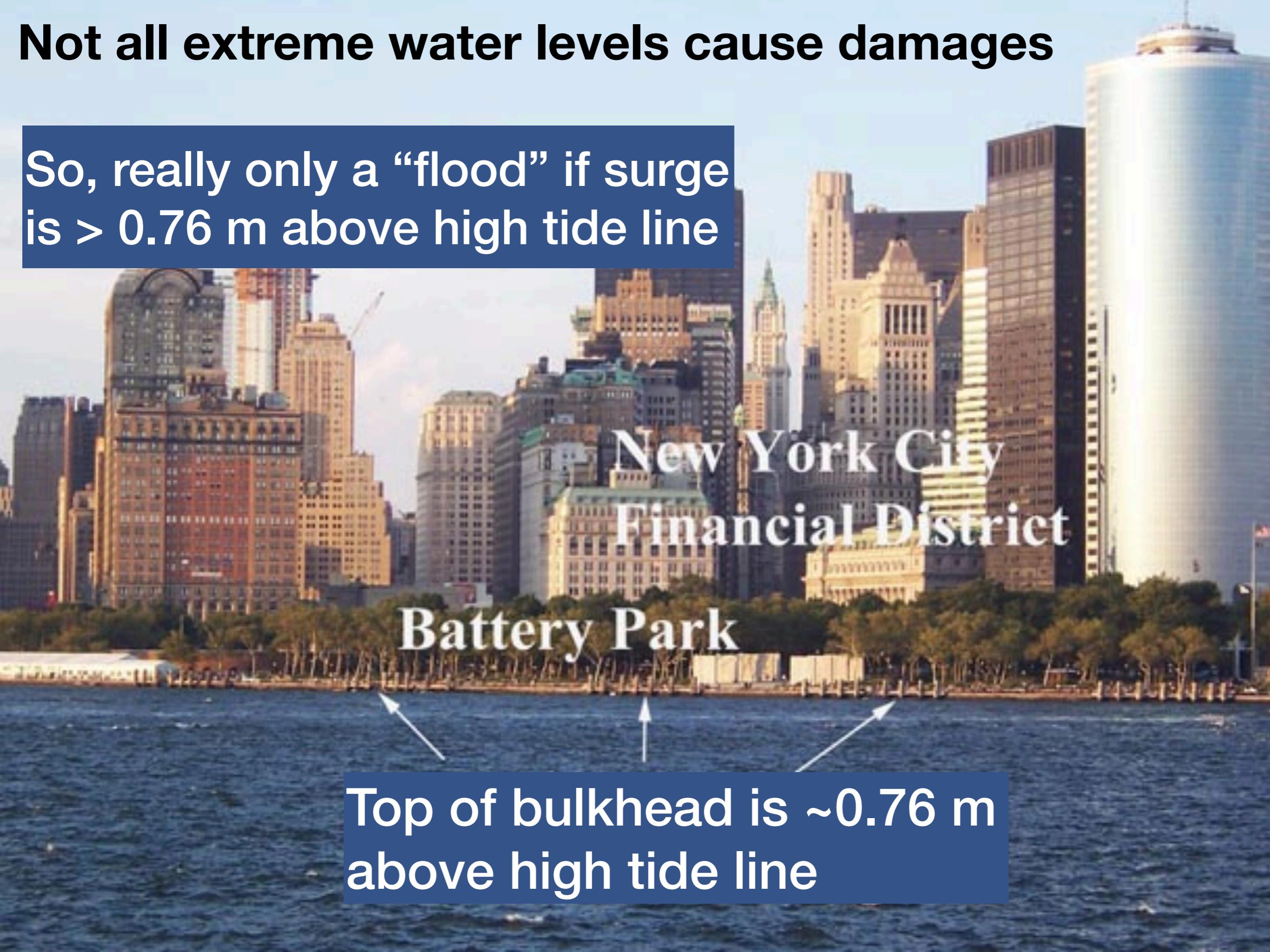
Solve for A numerically

Not all extreme water levels cause damages

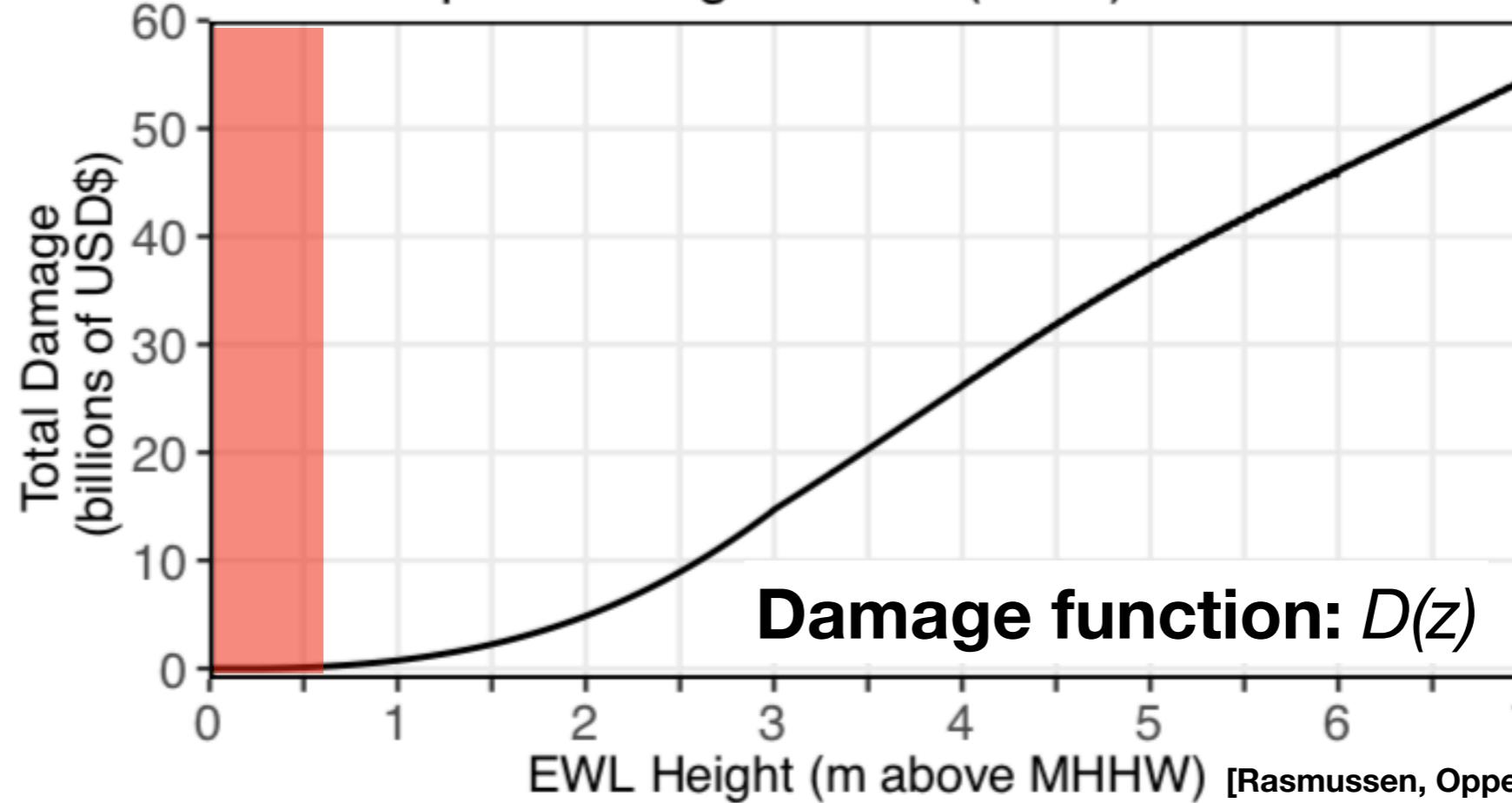
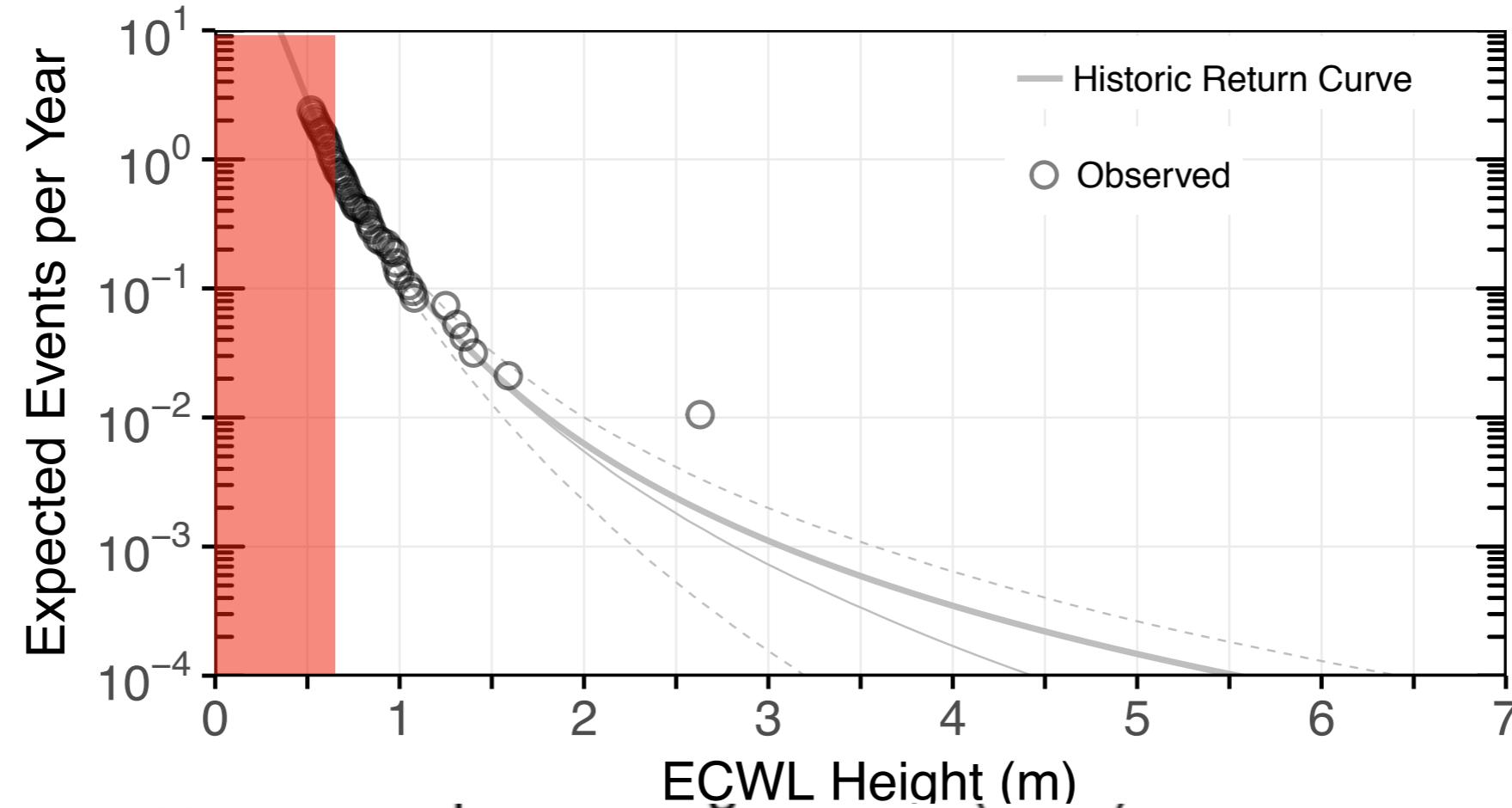


Not all extreme water levels cause damages

So, really only a “flood” if surge
is > 0.76 m above high tide line

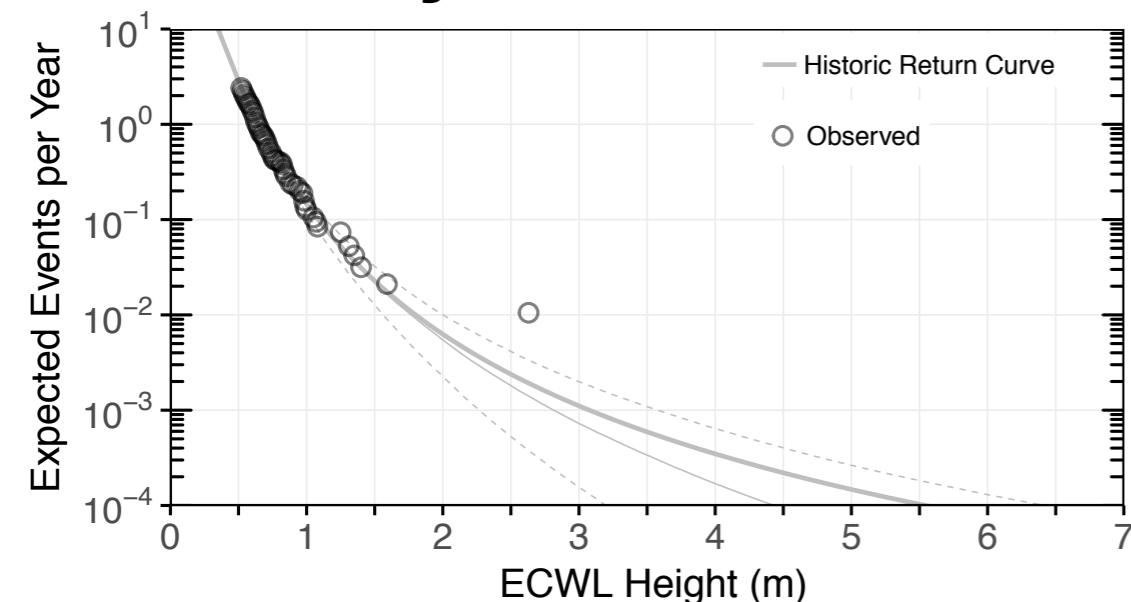


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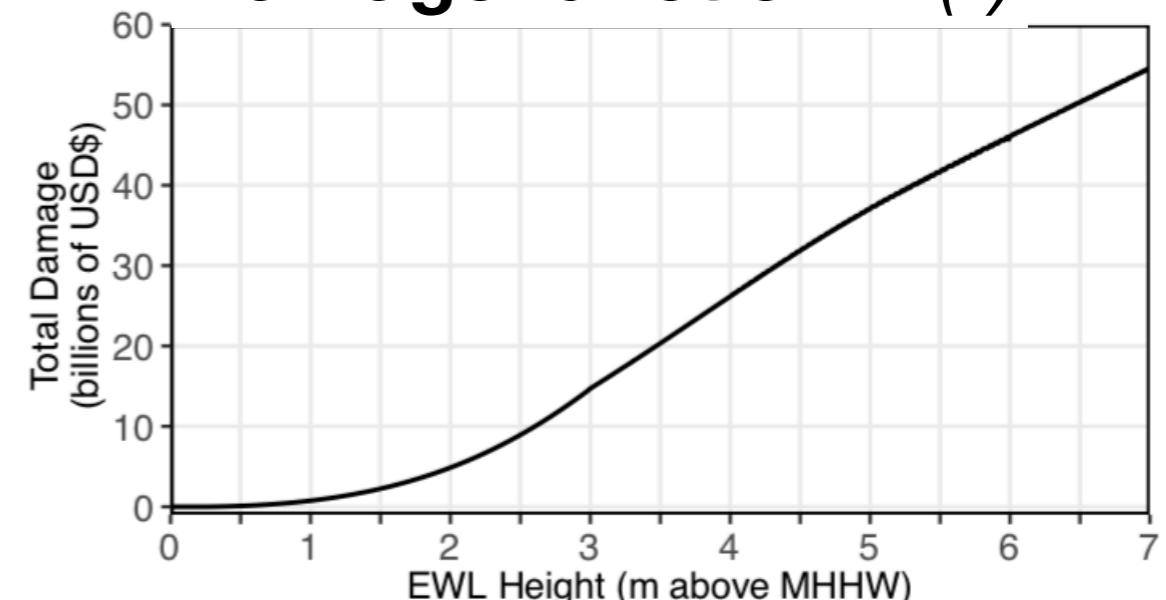
Coastal managers may be more interested in financial metrics

Probability of water level z : $f(z)$



X

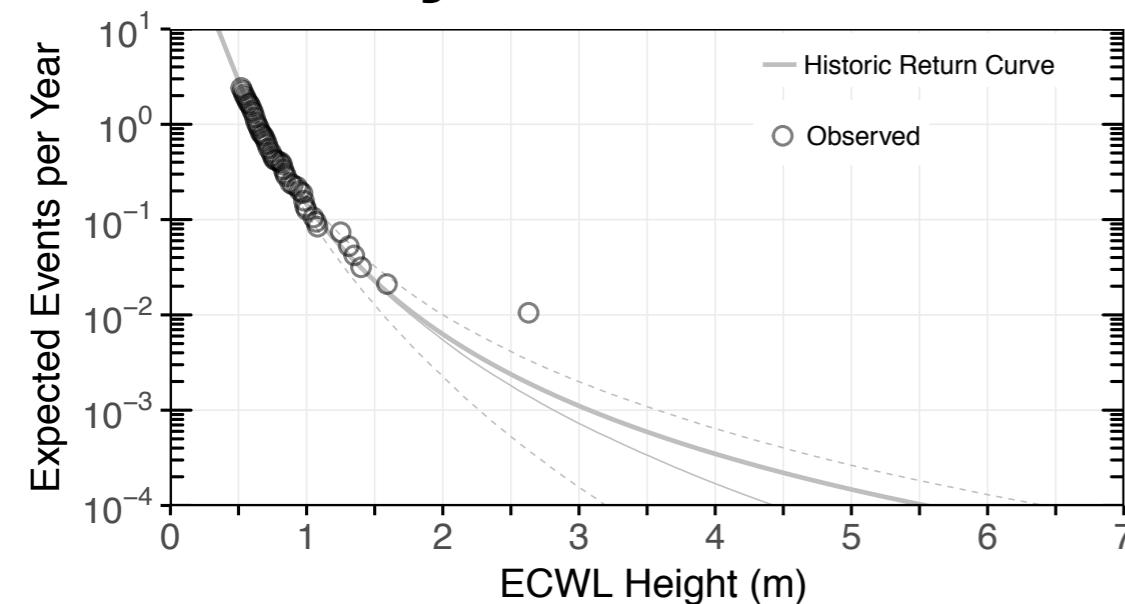
Damage function: $D(z)$



||

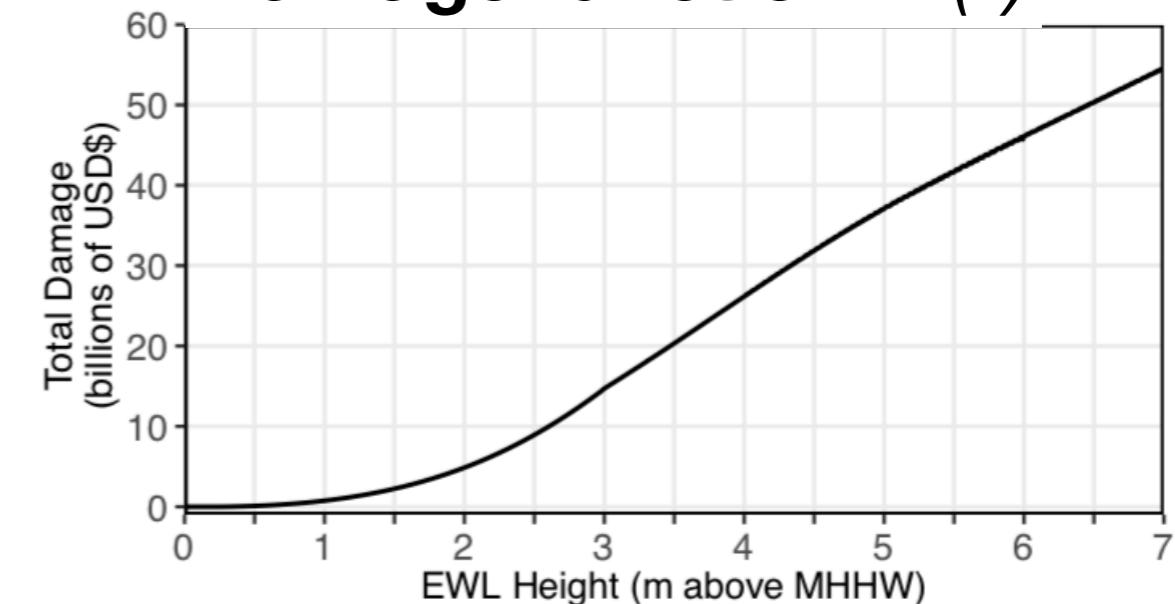
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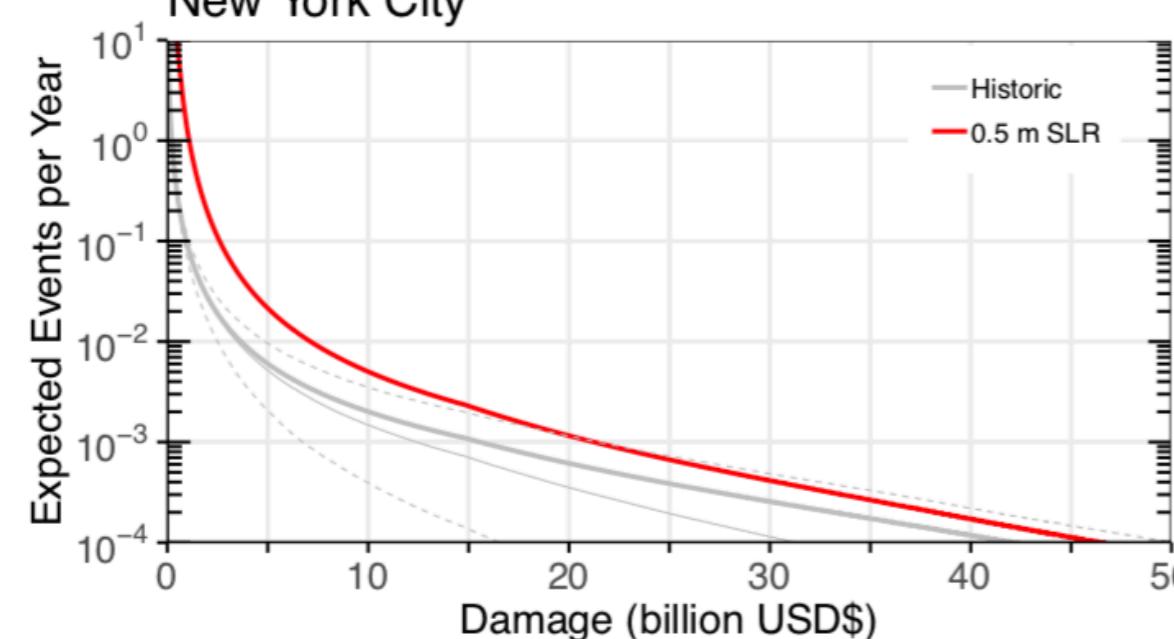
X

Damage function: $D(z)$



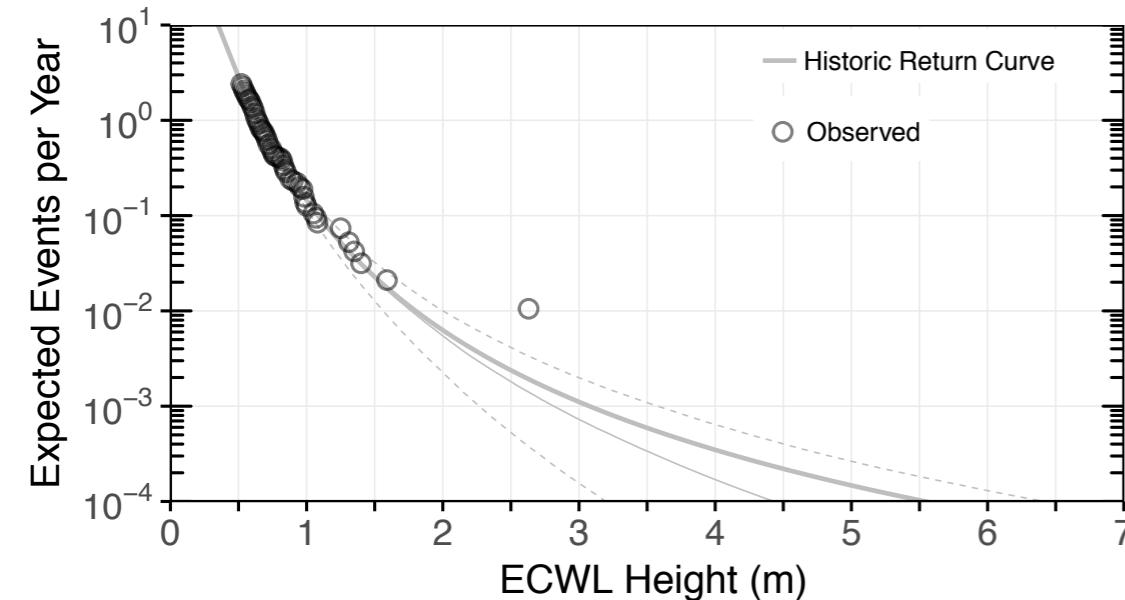
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New York City



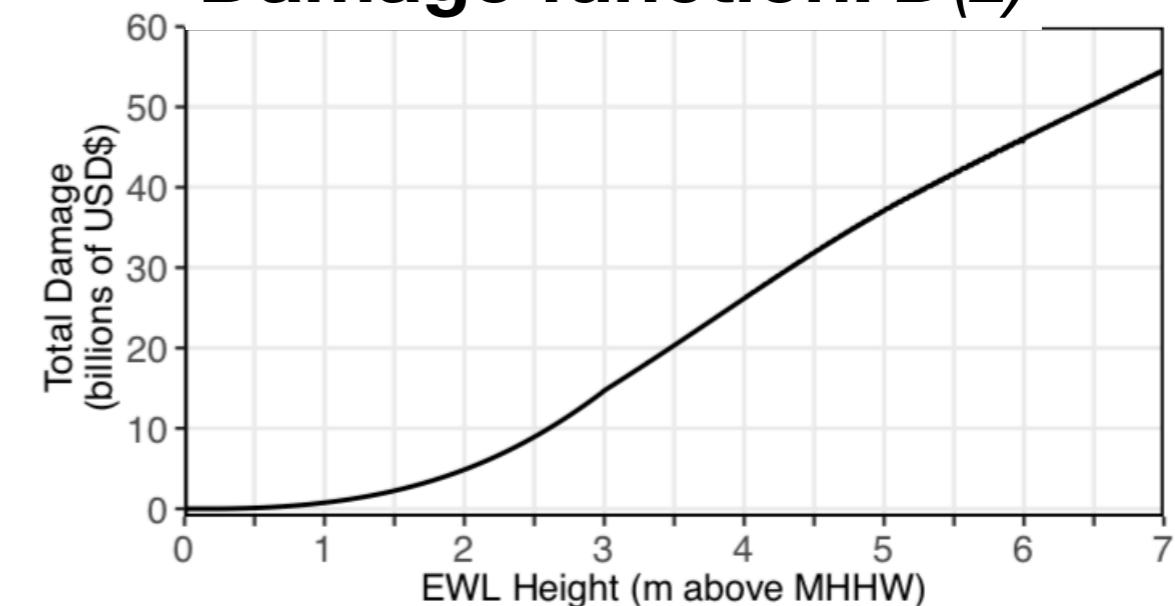
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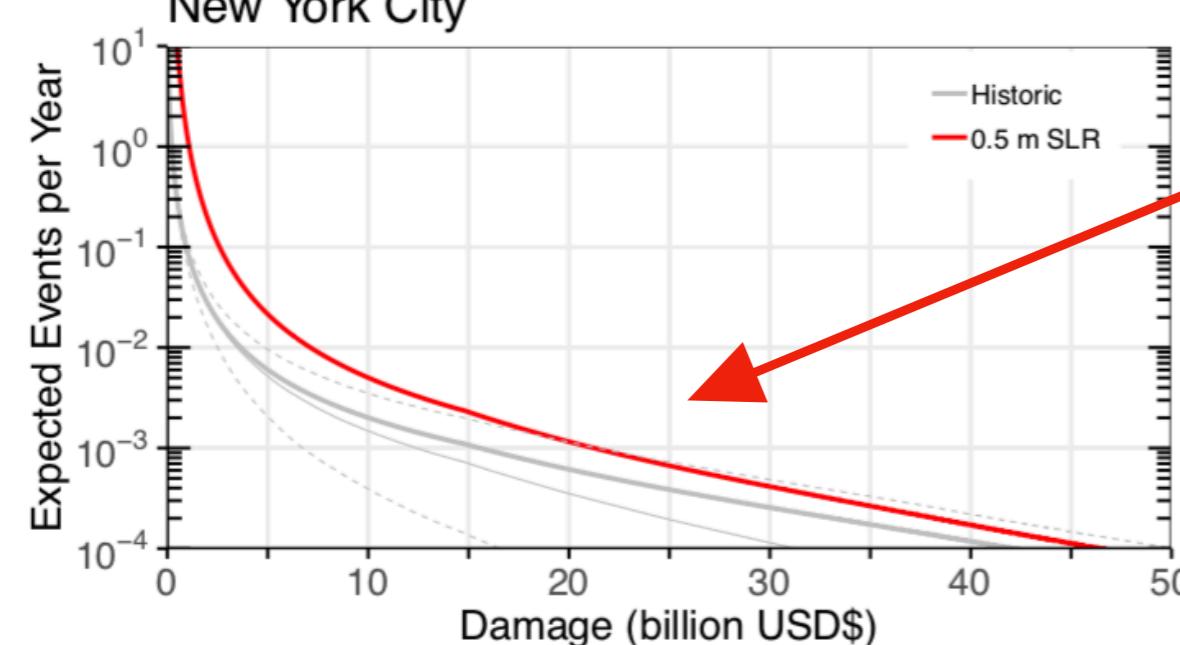
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Damage function: $D(z)$



||

New York City



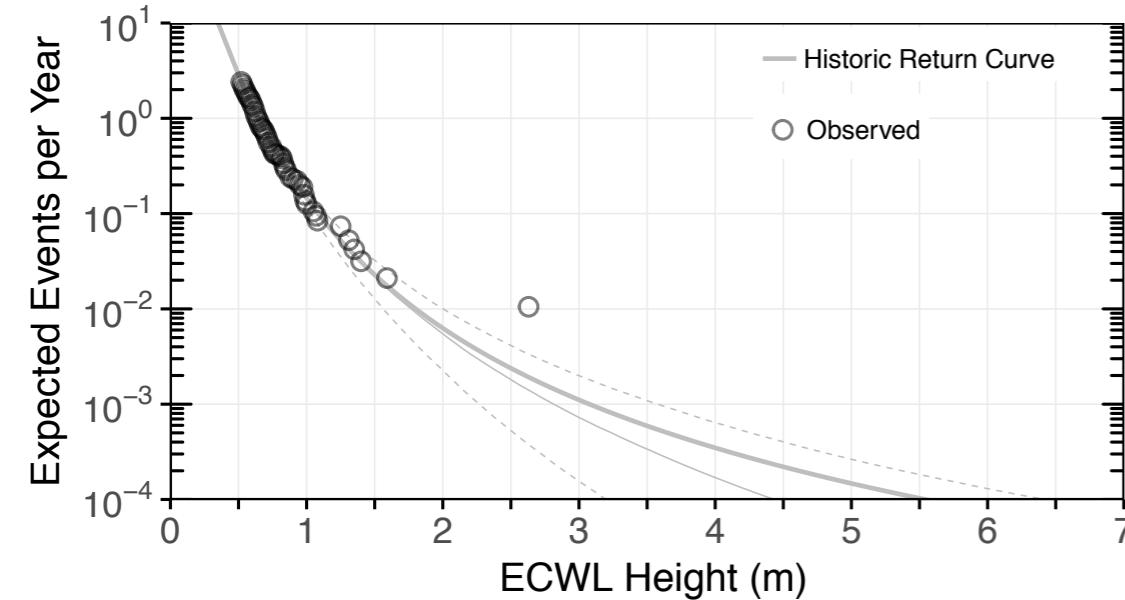
Area under each curve is the annual average loss (AAL)

$$\mathbb{E}[D(z)] = \int_z D(z) f(z) dz$$



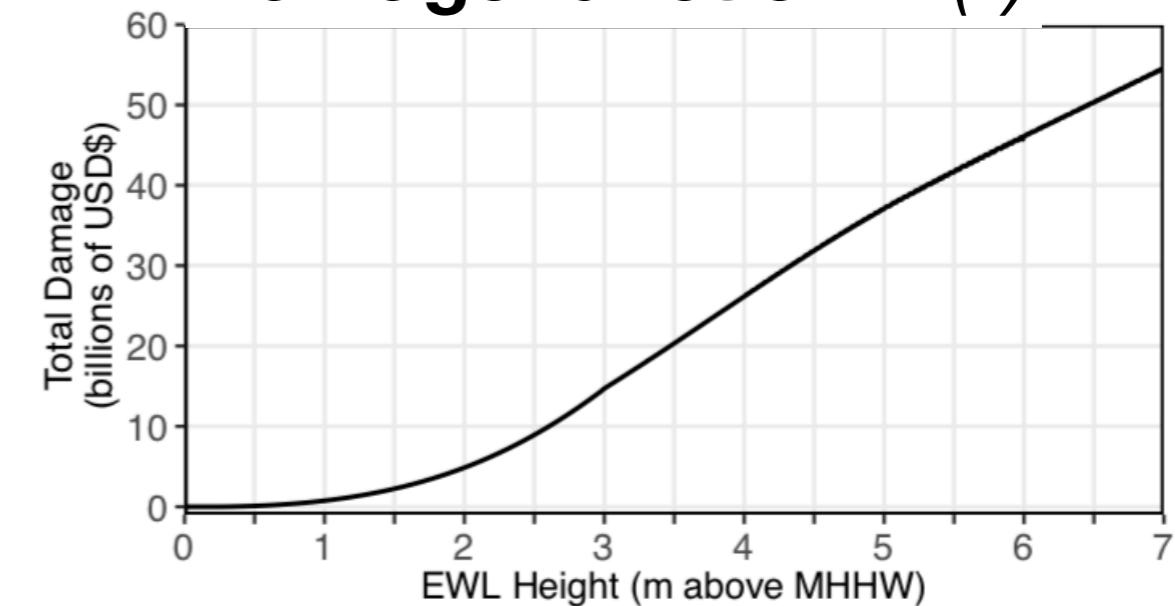
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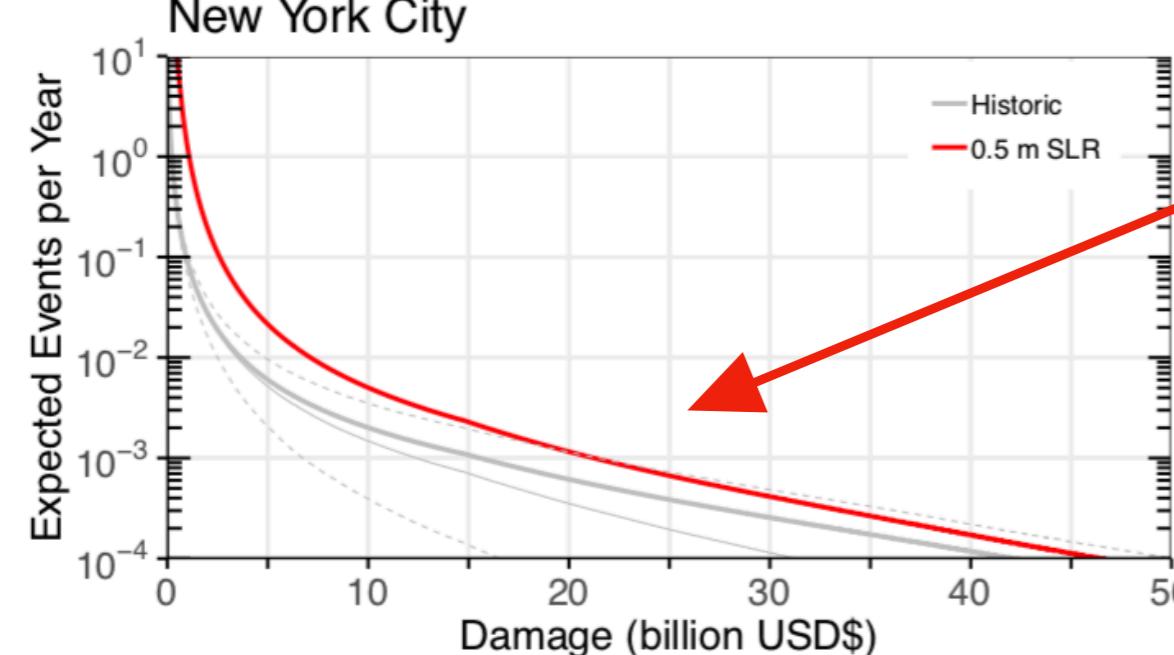
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Damage function: $D(z)$



==

New York City



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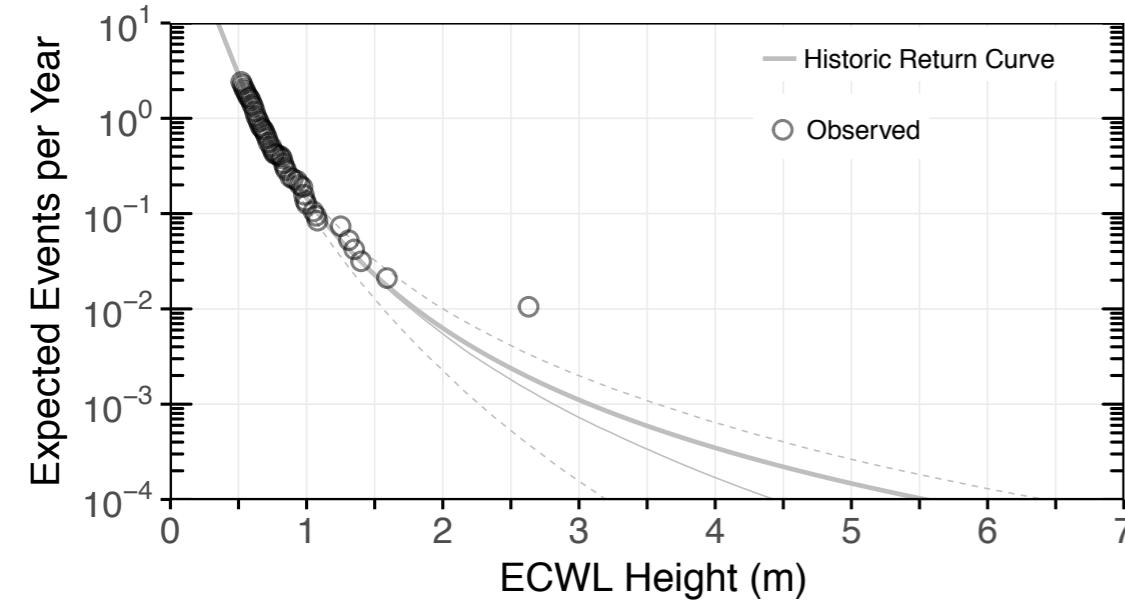
$$\mathbb{E}[D(z)] = \int_z D(z) f(z) dz$$

Present-day AAL for New York City $\sim \$0.5$ billion

AAL for New York City with 0.5 m of sea-level rise $\sim \$1.5$ billion

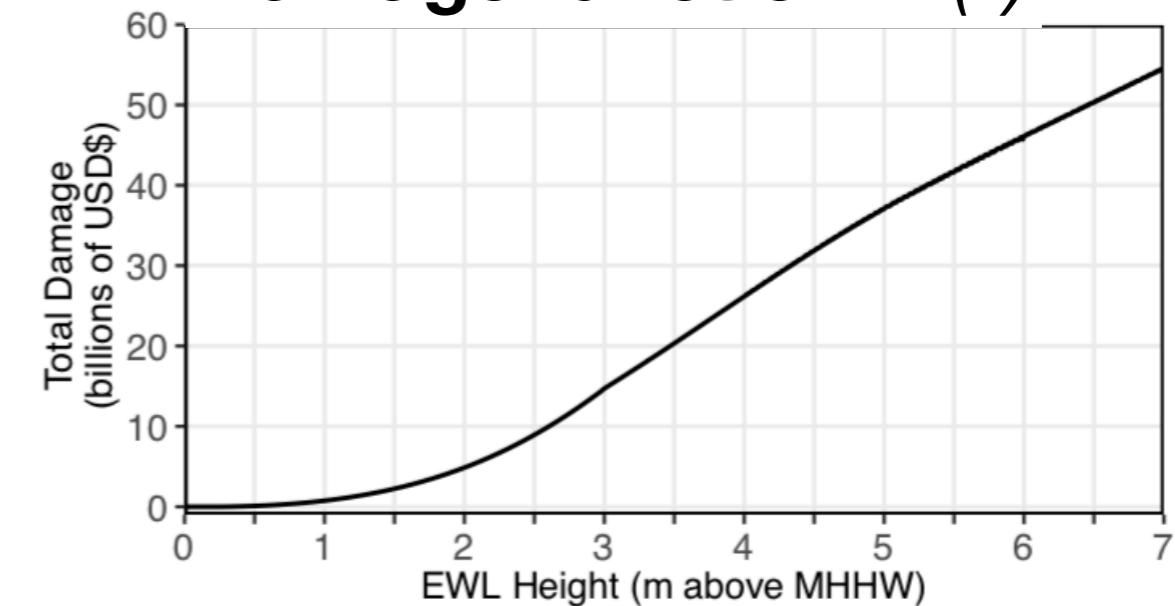
Coastal managers may be more interested in financial metrics

Probability of water level z : $f(z)$



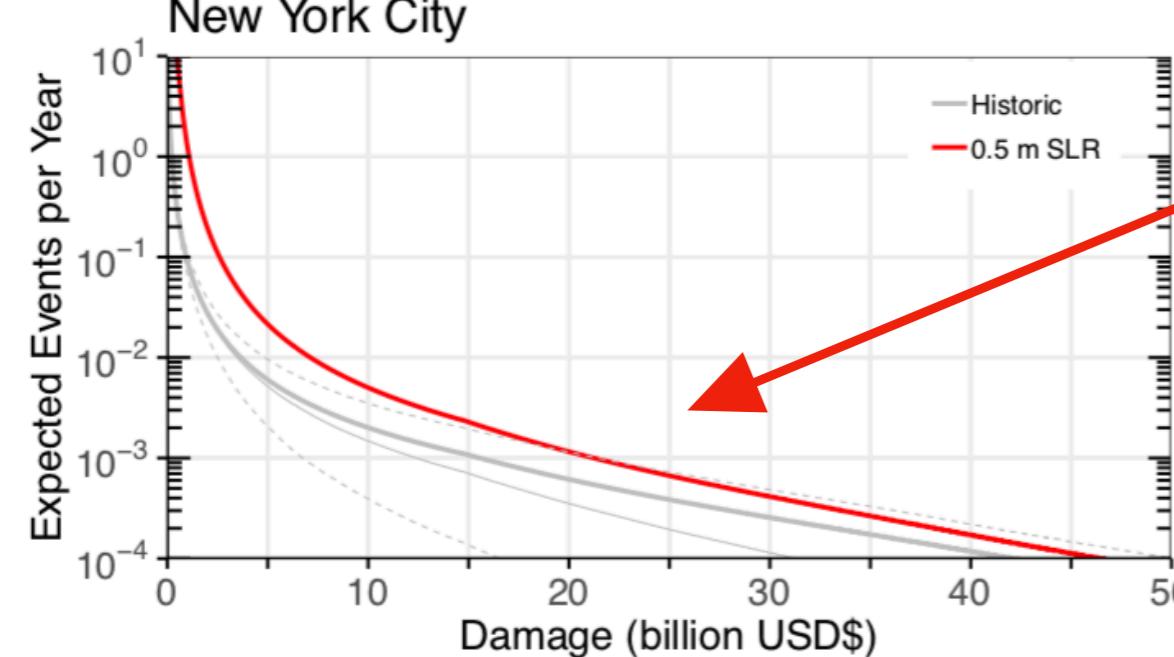
X

Damage function: $D(z)$



==

New York City



Area under each curve is the annual average loss (AAL)

$$\mathbb{E}[D(z)] = \int_z D(z) f(z) dz$$

Present-day AAL for New York City $\sim \$0.5$ billion

AAL for New York City with 0.5 m of sea-level rise $\sim \$1.5$ billion

How to maintain the current AAL as sea-levels rise?

Research questions

#1: How to incorporate deeply uncertain projections of AIS into a framework to design coastal flood defenses?

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#2: How to account for damages in flood allowances?

#1: How to incorporate deeply uncertain projections of AIS into a framework to design coastal flood defenses?

Unknown amount of local sea-level rise: $P(\Delta)$

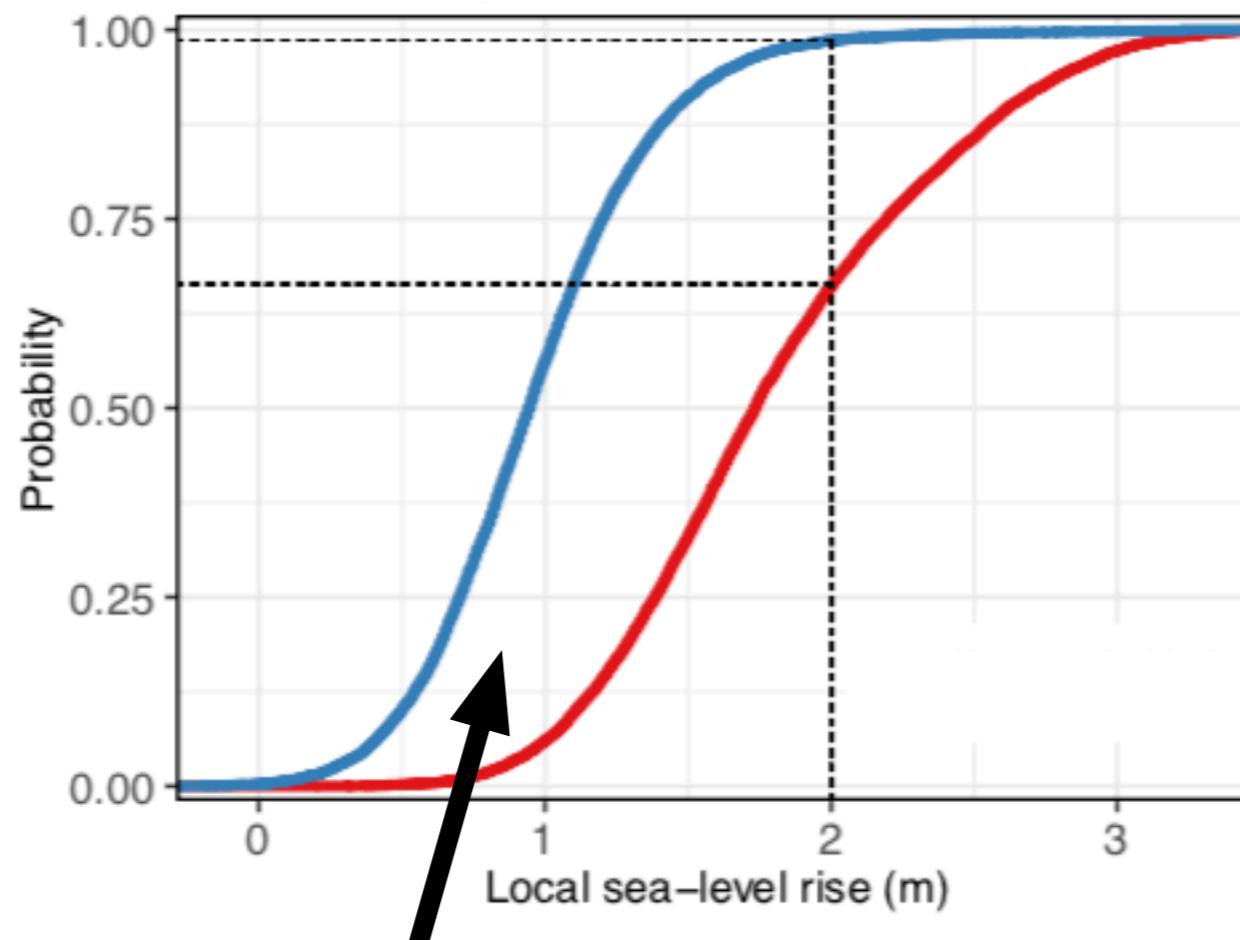
$$f(z^*) = \int_{\Delta} f(z^* - \Delta + A(z^*))P(\Delta) d\Delta.$$

Objective: Create an ‘effective’ probability distribution $\tilde{P}(\Delta)$ based on a *subjective view* of future Antarctic behavior

**“Possibilistic” approaches can be used to express incertitude
e.g., a *probability box*, or ‘*p-box*’**

[Baudrit et al., 2007; Le Cozannet et al., 2017]

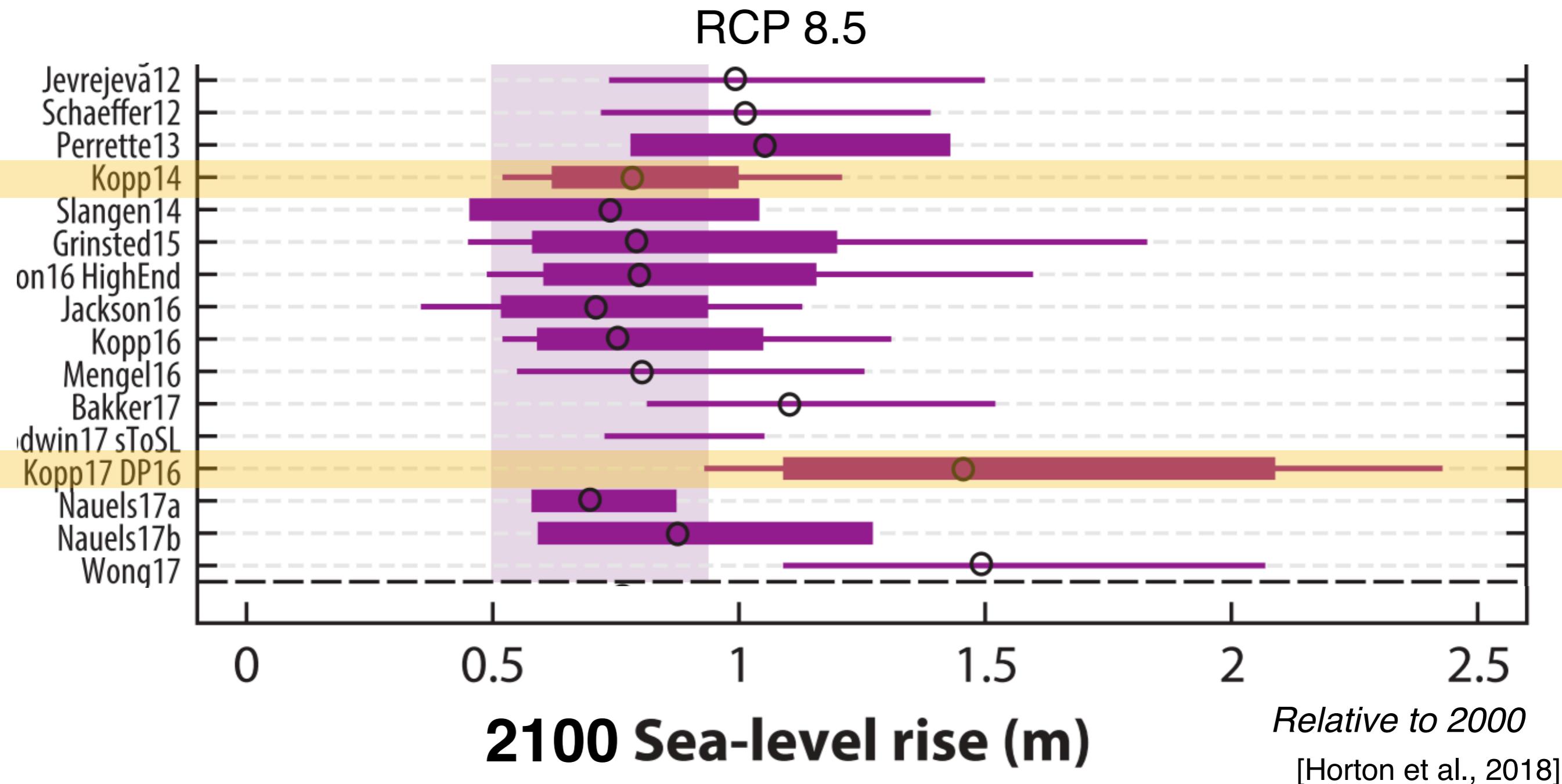
The ‘p-box’ is defined by CDFs



‘True’ value of 2100 sea-level rise lies somewhere in-between the CDFs

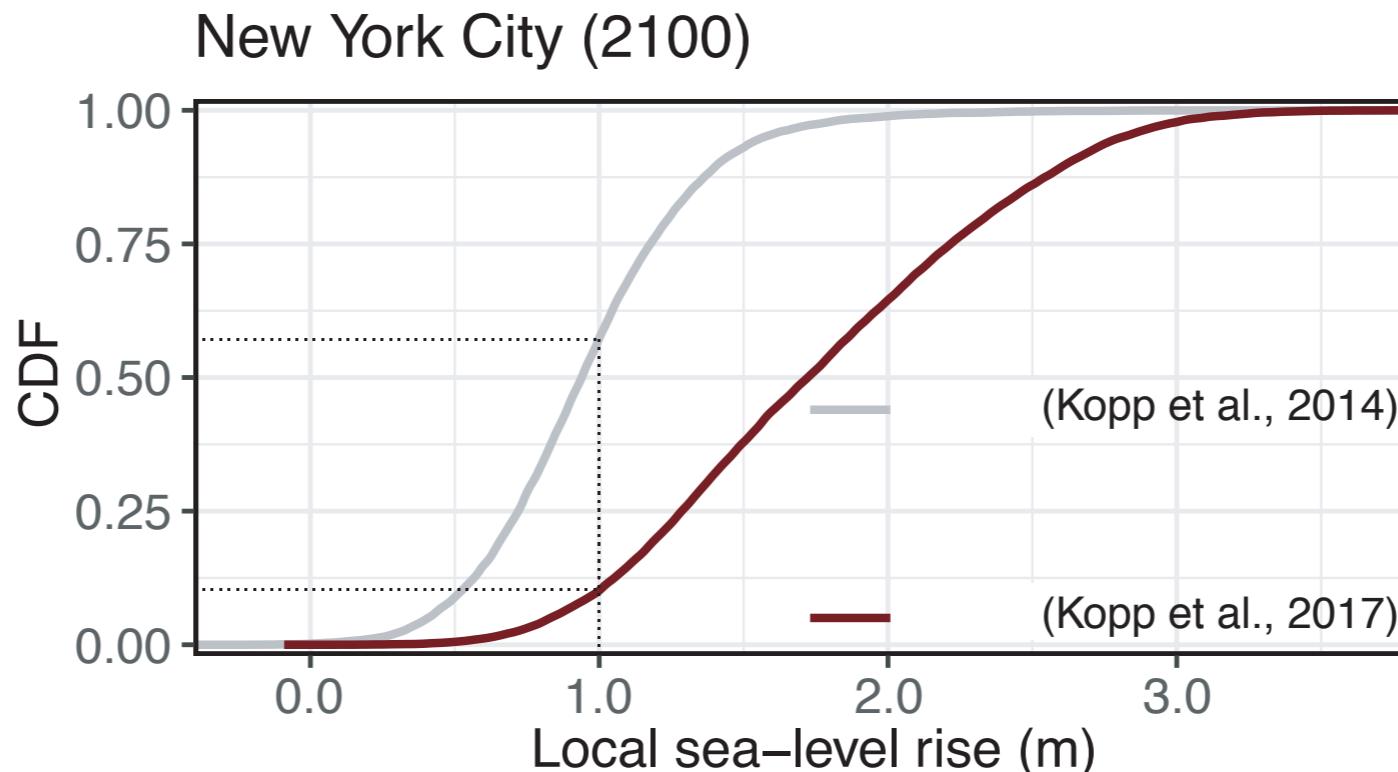
How to choose CDF bounds?

Kopp et al. (2014) and Kopp et al. (2017) span the range of possible sea-level rise values



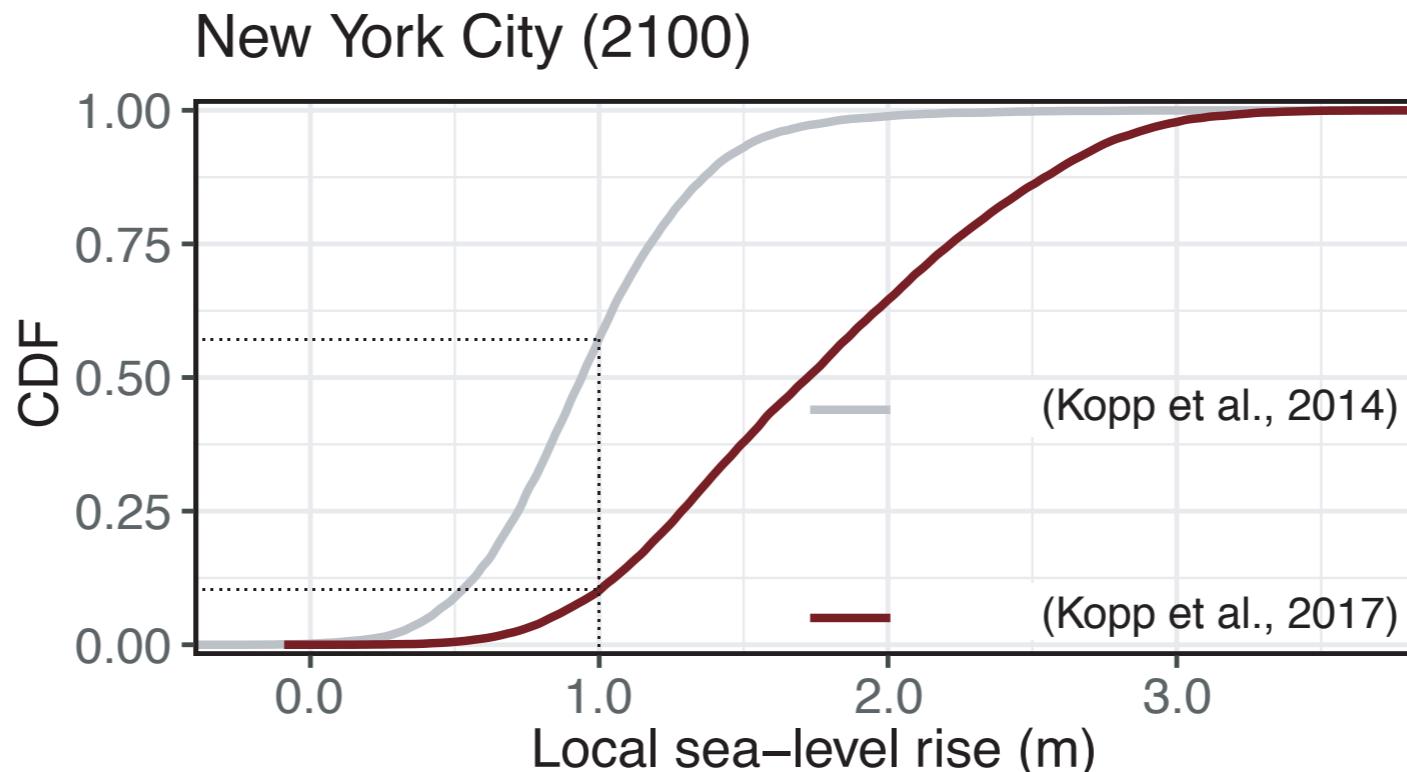
Kopp et al. 2014 & 2017 frameworks identical, except for treatment of Antarctic ice melt

“Possibilistic” approaches can be used to express incertitude



Probability of 1-m of local sea-level rise: 45% - 90%

“Possibilistic” approaches can be used to express incertitude

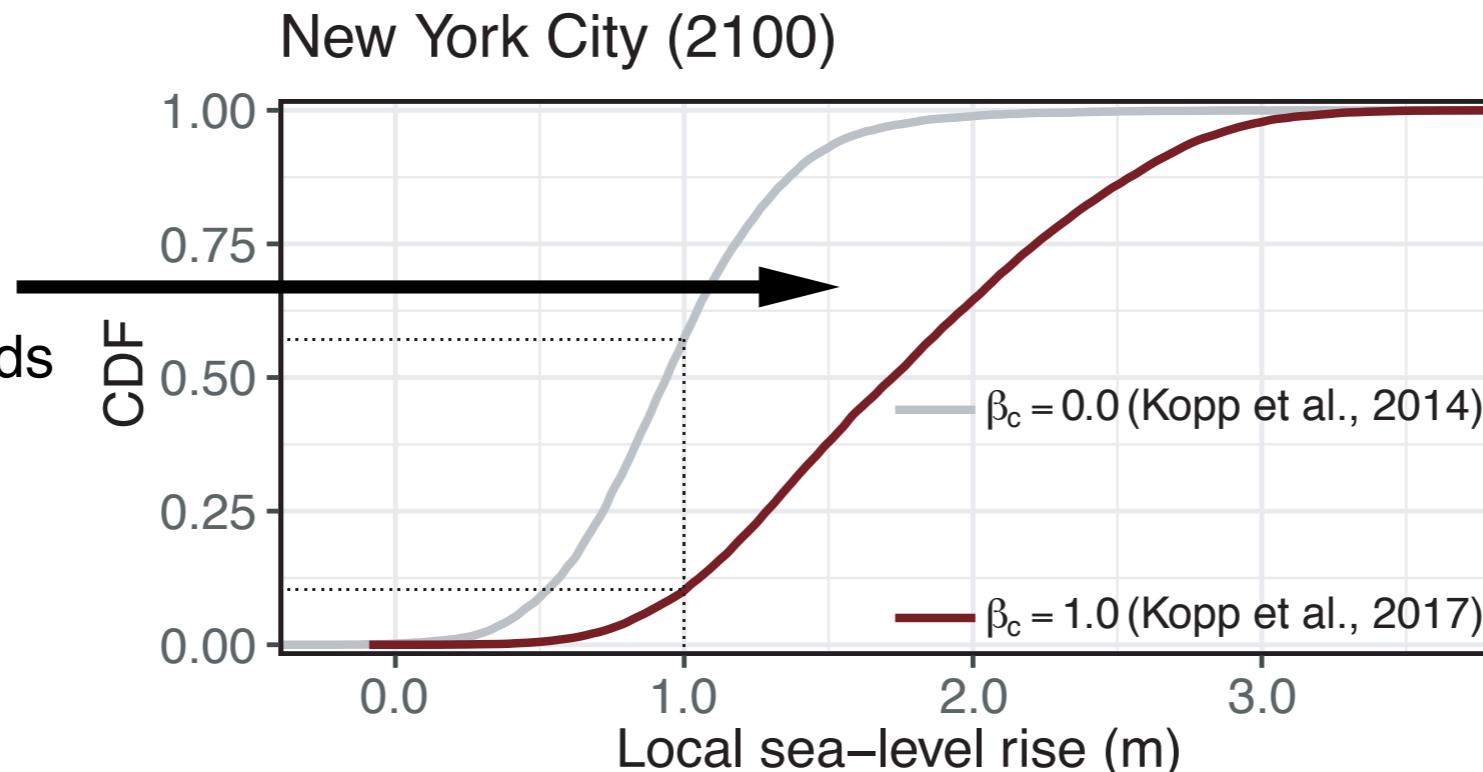


Two parameters:

1. Maximum 2100 AIS contribution: AIS_{max} [25, 50, 100, 150, 175 cm]
(i.e., where to cut off the tail of the AIS distribution)
2. Likelihood of AIS collapse initiation: β_c [0-1]

“Possibilistic” approaches can be used to express incertitude

β_c produces curves in
between CDF bounds

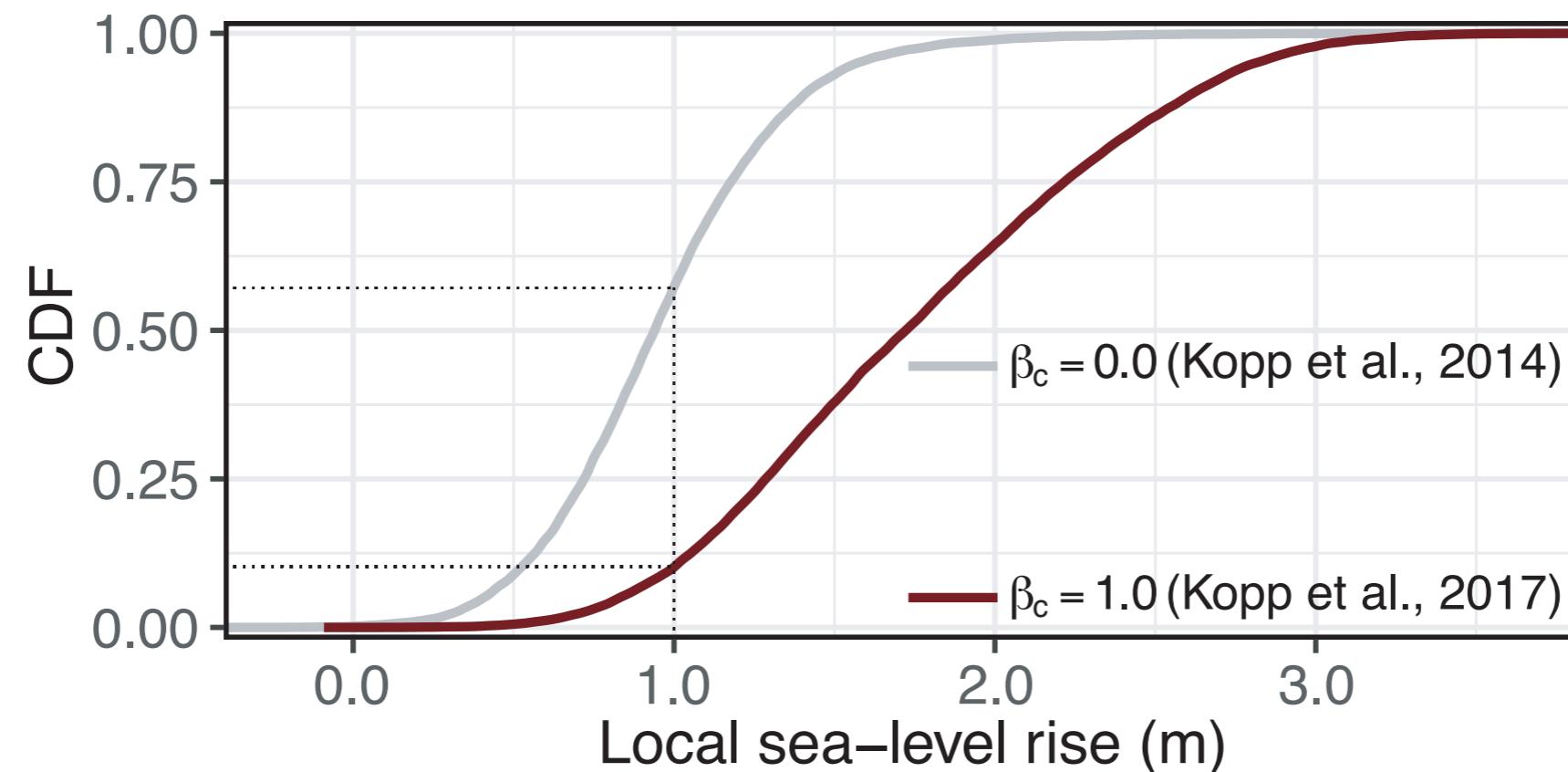


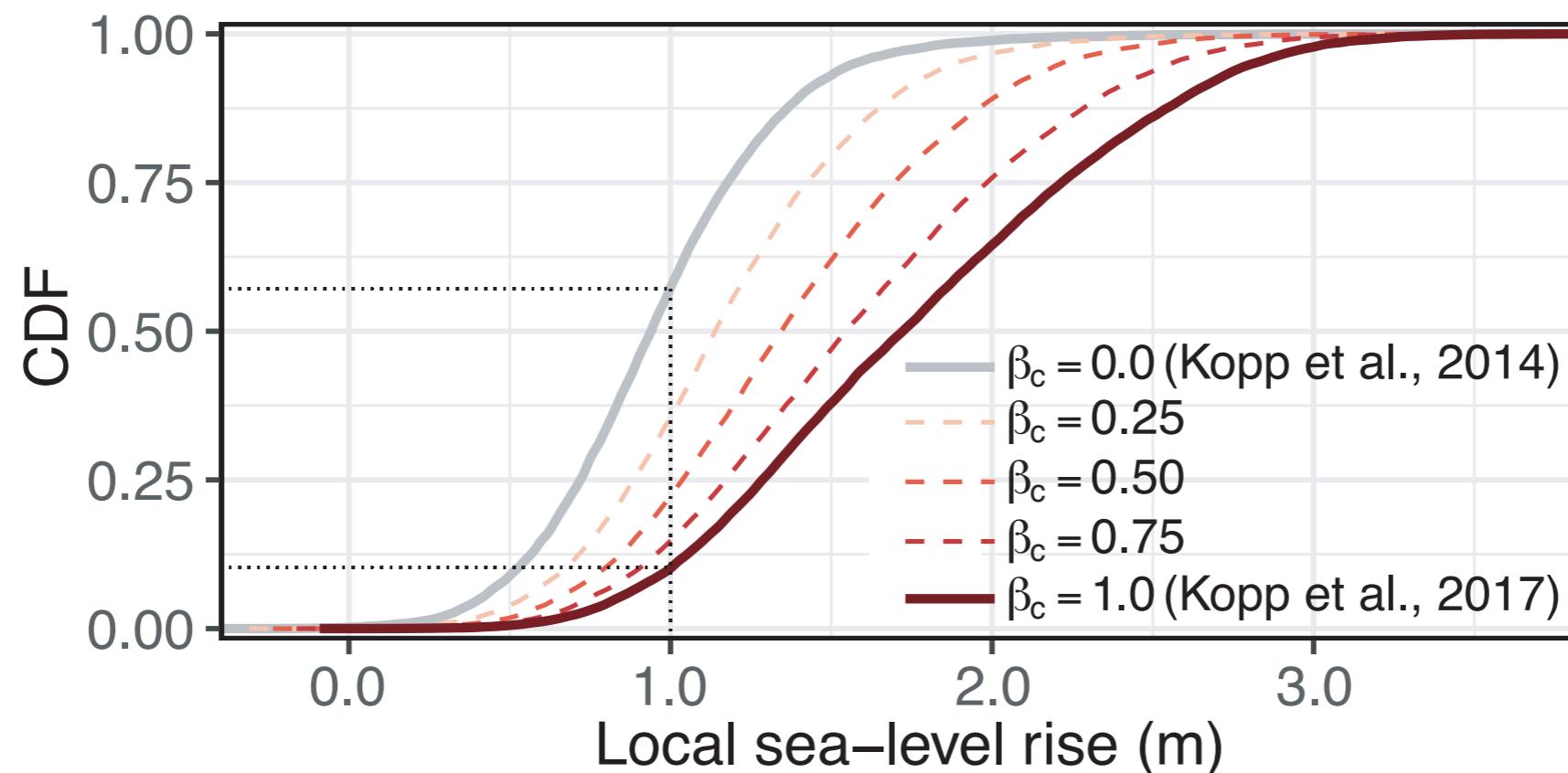
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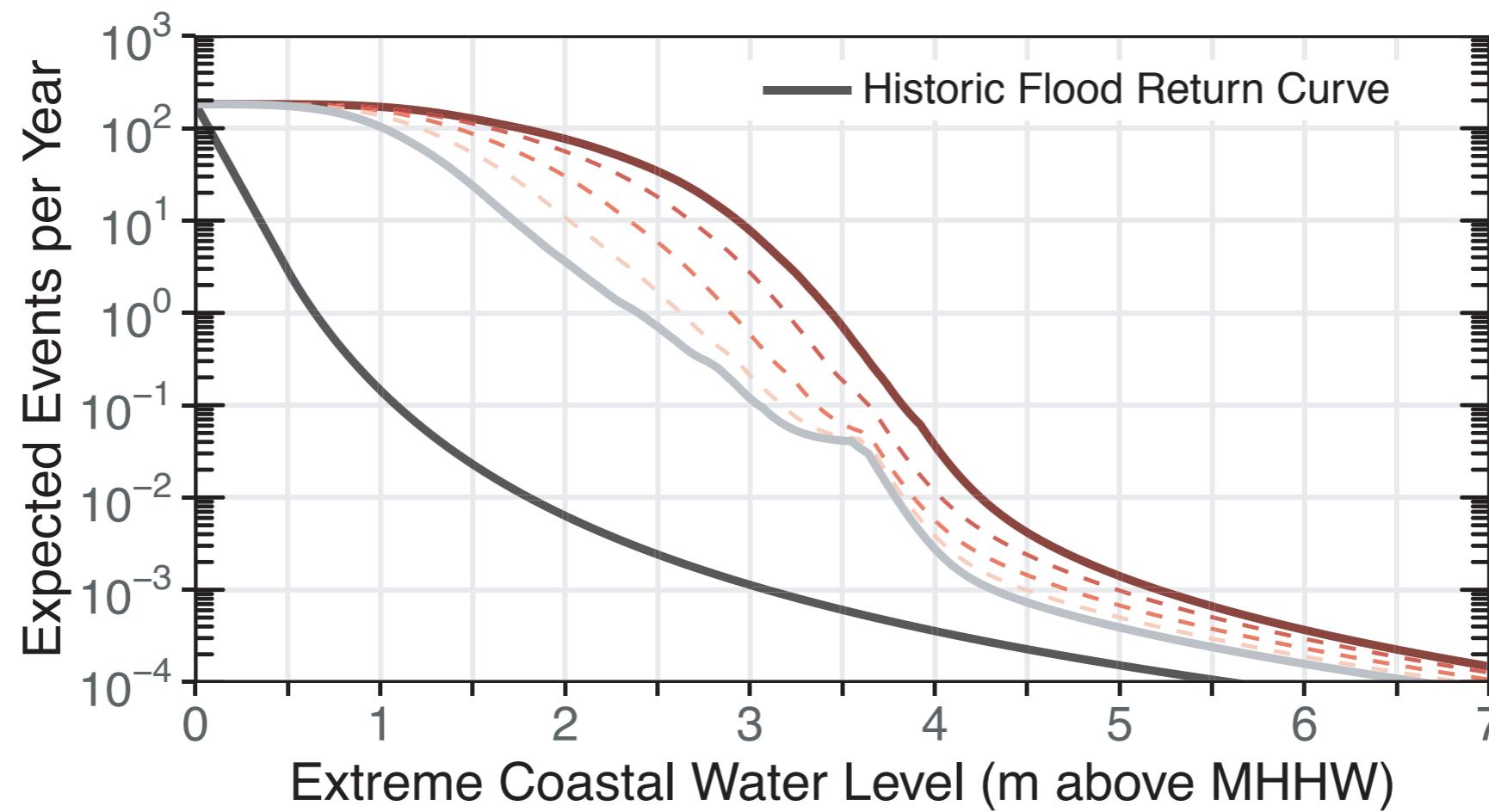
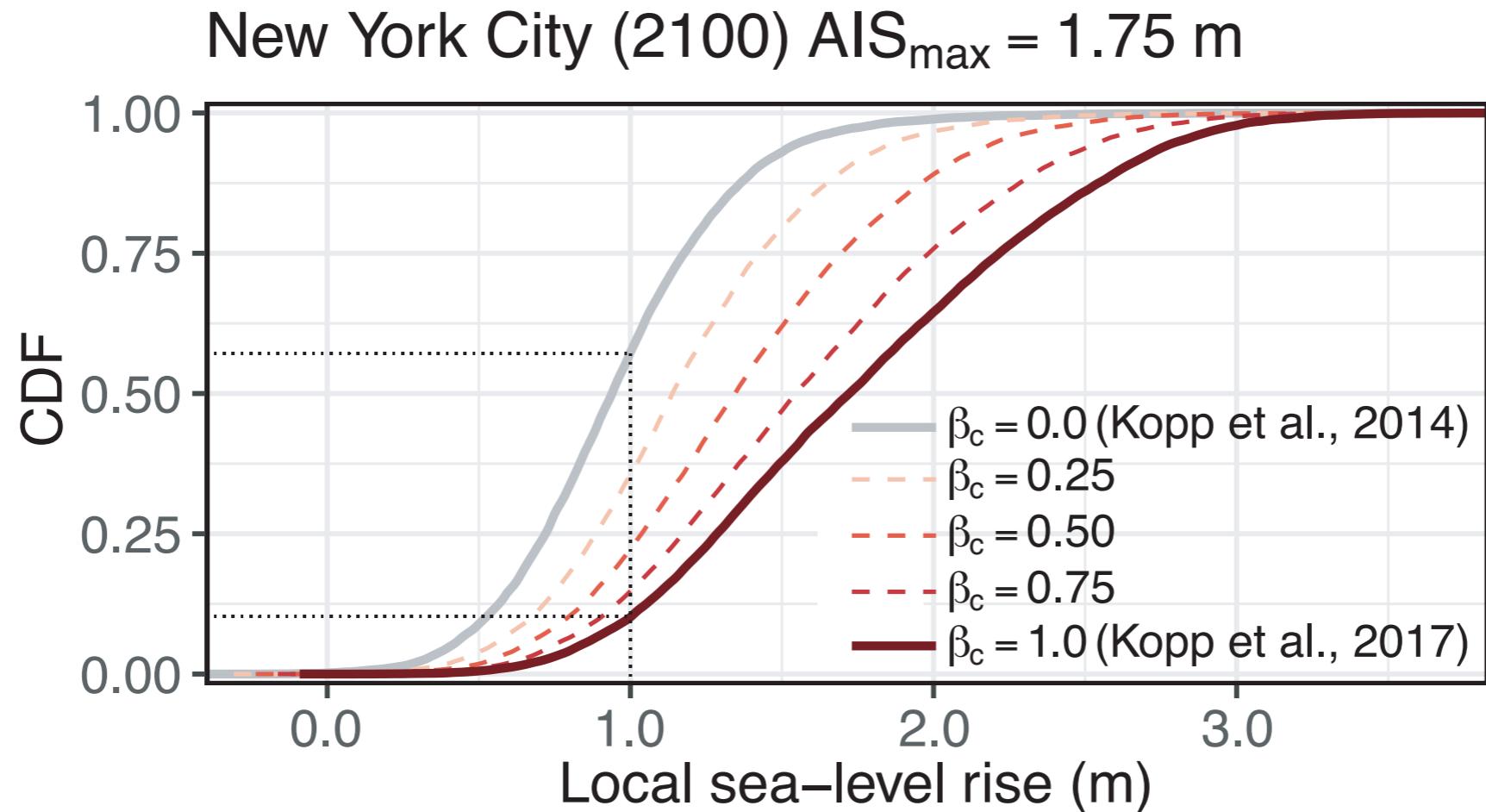
1. Maximum 2100 AIS contribution: AIS_{max} [25, 50, 100, 150, 175 cm]
(i.e., where to cut off the tail of the AIS distribution)
2. Likelihood of AIS collapse initiation: β_c [0-1]

Effective SLR probability distribution: $\tilde{P}(\beta_c, AIS_{max}, t)$

$$\tilde{P}(\beta_c, AIS_{max}, t) = \beta_c P_{high}(AIS_{max}, t) + (1 - \beta_c) P_{low}(AIS_{max}, t)$$

New York City (2100) AIS_{max} = 1.75 m

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#2: How to account for damages in flood allowances?

Our answer: 'damage allowance'

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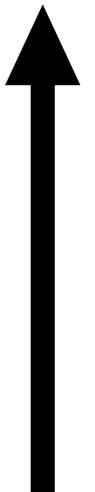
Our answer: 'damage allowance'

$$\int_z \int_{\Delta} D^*(z) f(z - \Delta) \tilde{P}(\Delta) d\Delta dz = \int_z D(z) f(z) dz$$

#2: How to account for damages in flood allowances?

Our answer: 'damage allowance' Annual average loss

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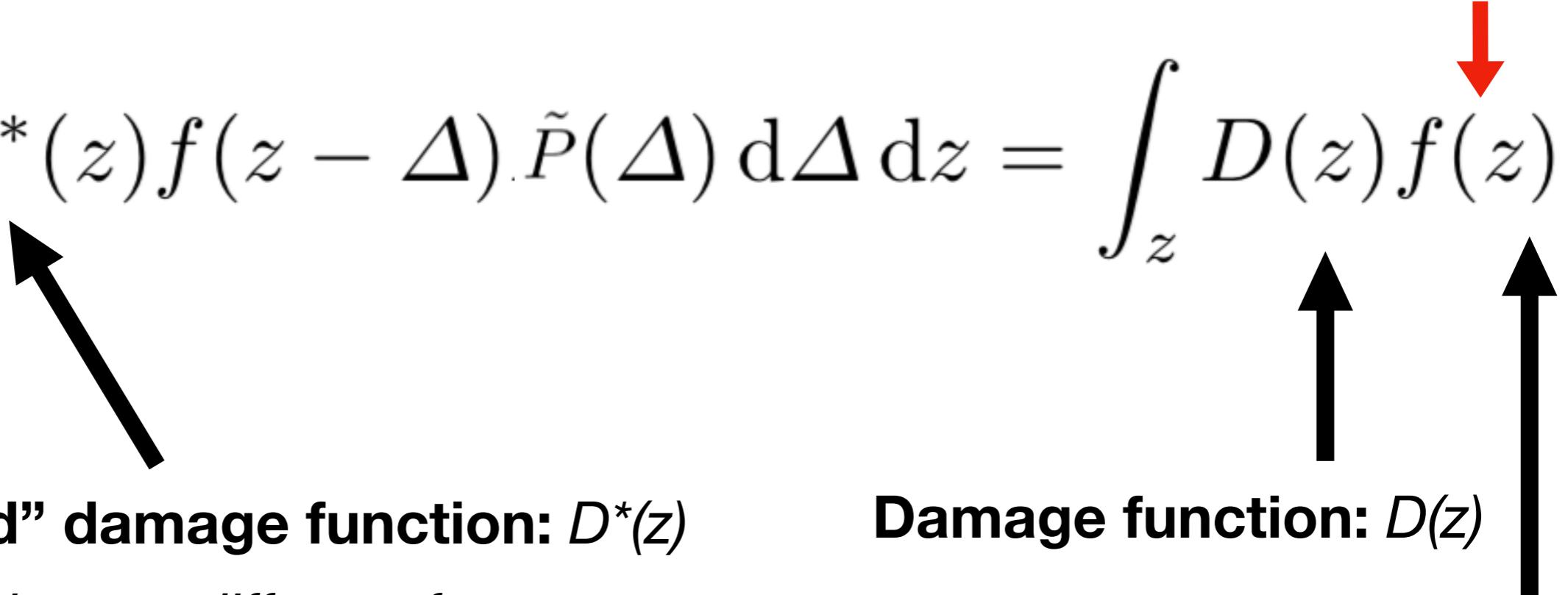


Damage function: $D(z)$

Probability of water level z : $f(z)$

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“Protected” damage function: $D^*(z)$

$D^(z)$ takes on different forms
based on protection strategy*

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Unknown amount of local sea-level rise: $\tilde{P}(\Delta)$

Damage function: $D(z)$

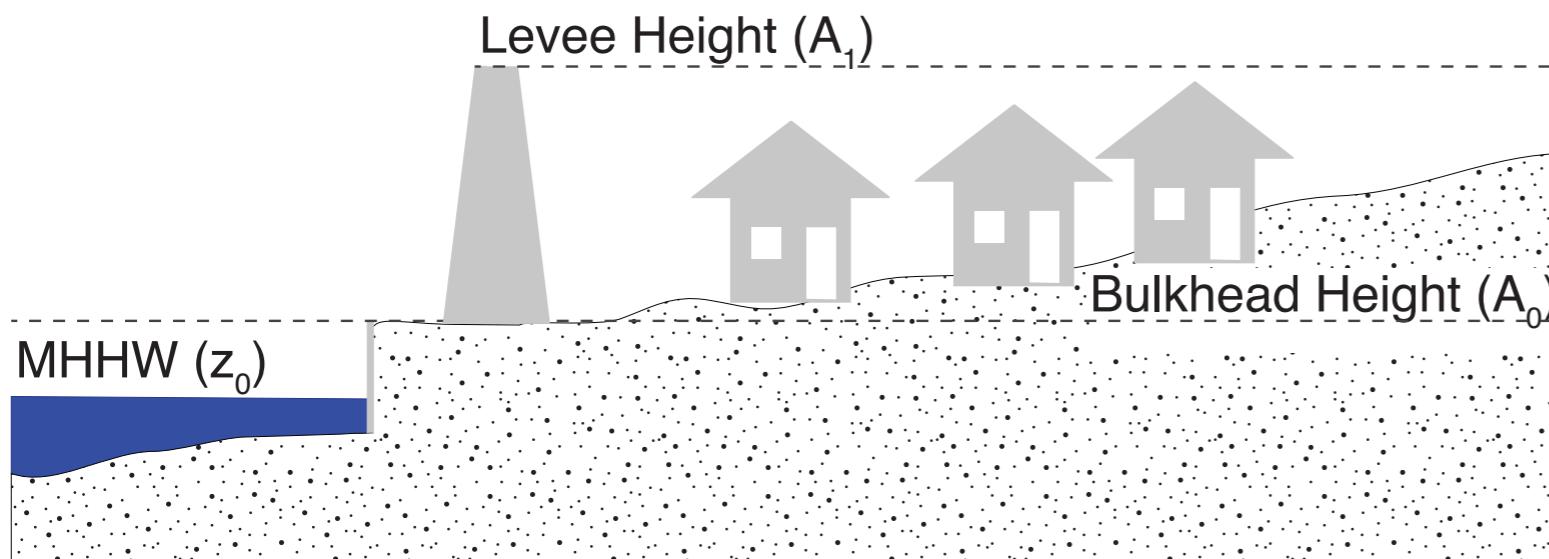
Probability of water level z : $f(z)$

Objective: find a “protected” damage function $D^*(z)$ that produces an AAL that is equal to a given target

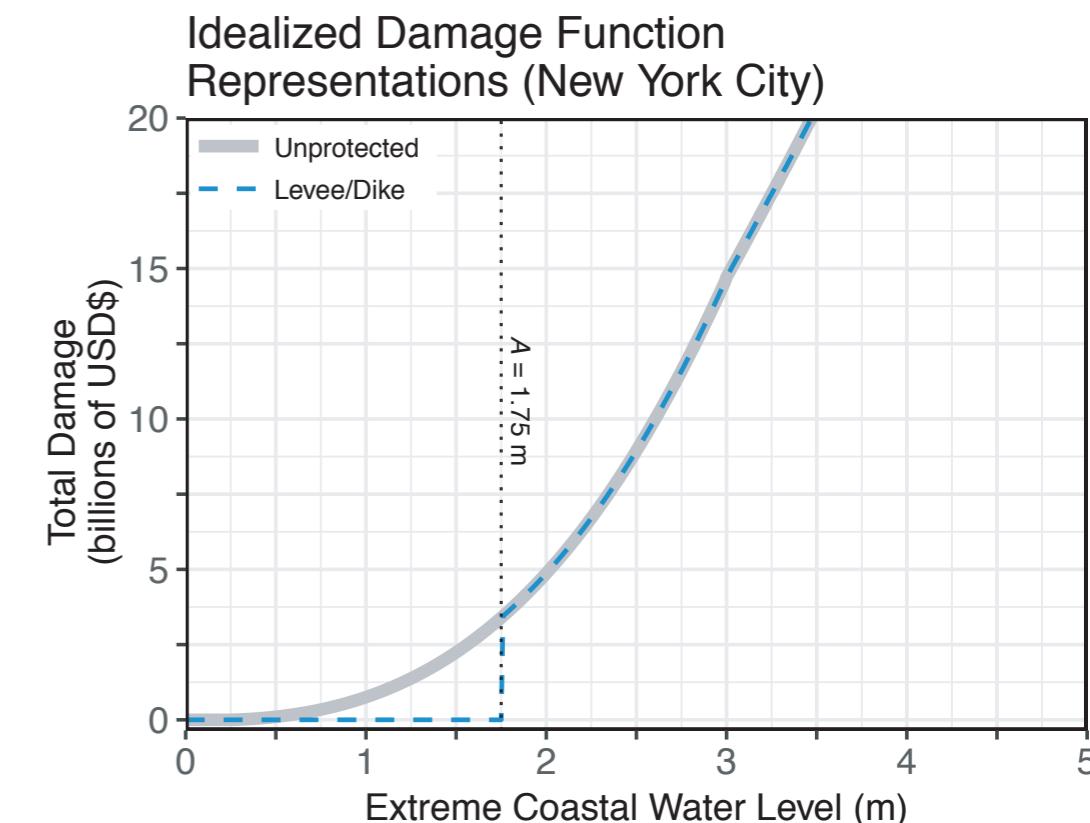
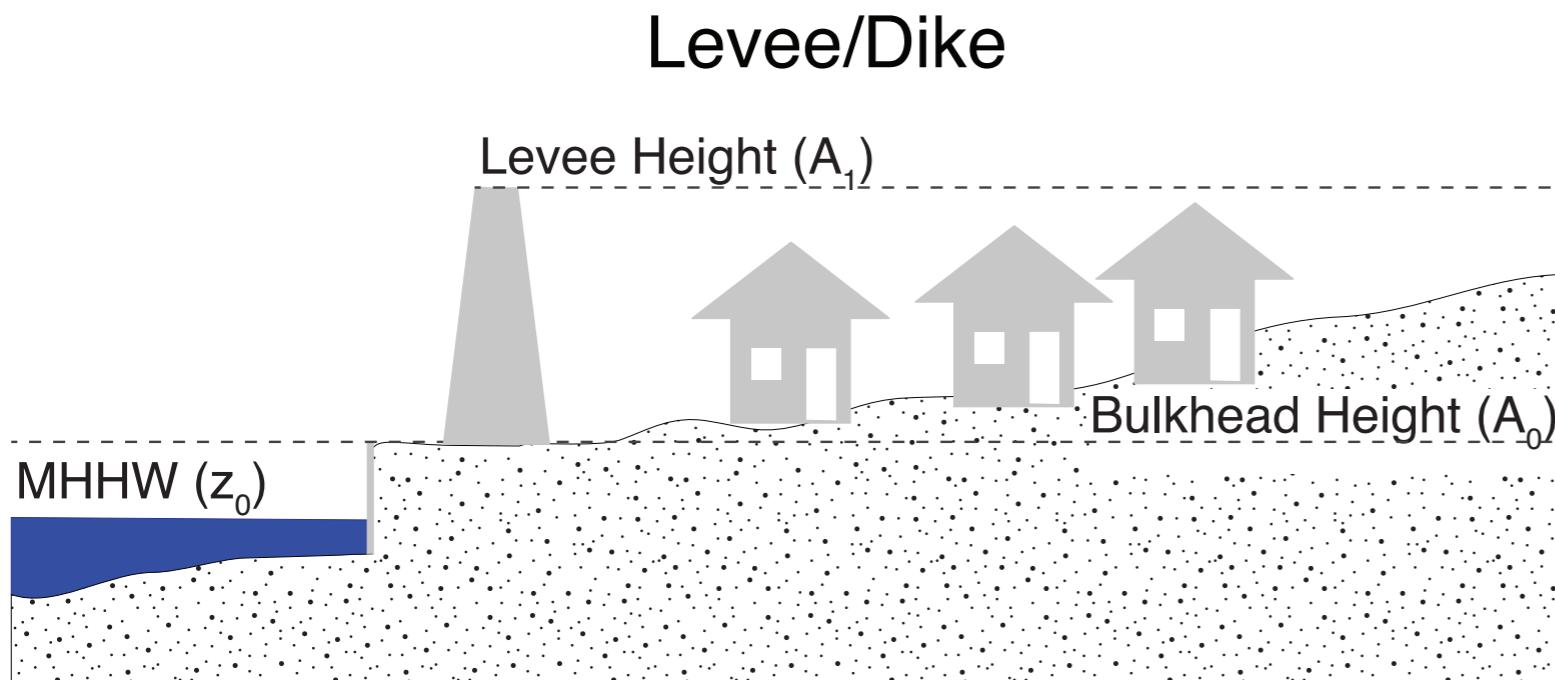
Strategies: elevation, levee/dike, storm surge barrier, coastal retreat

Example damage allowance calculation for a levee/dike

Levee/Dike



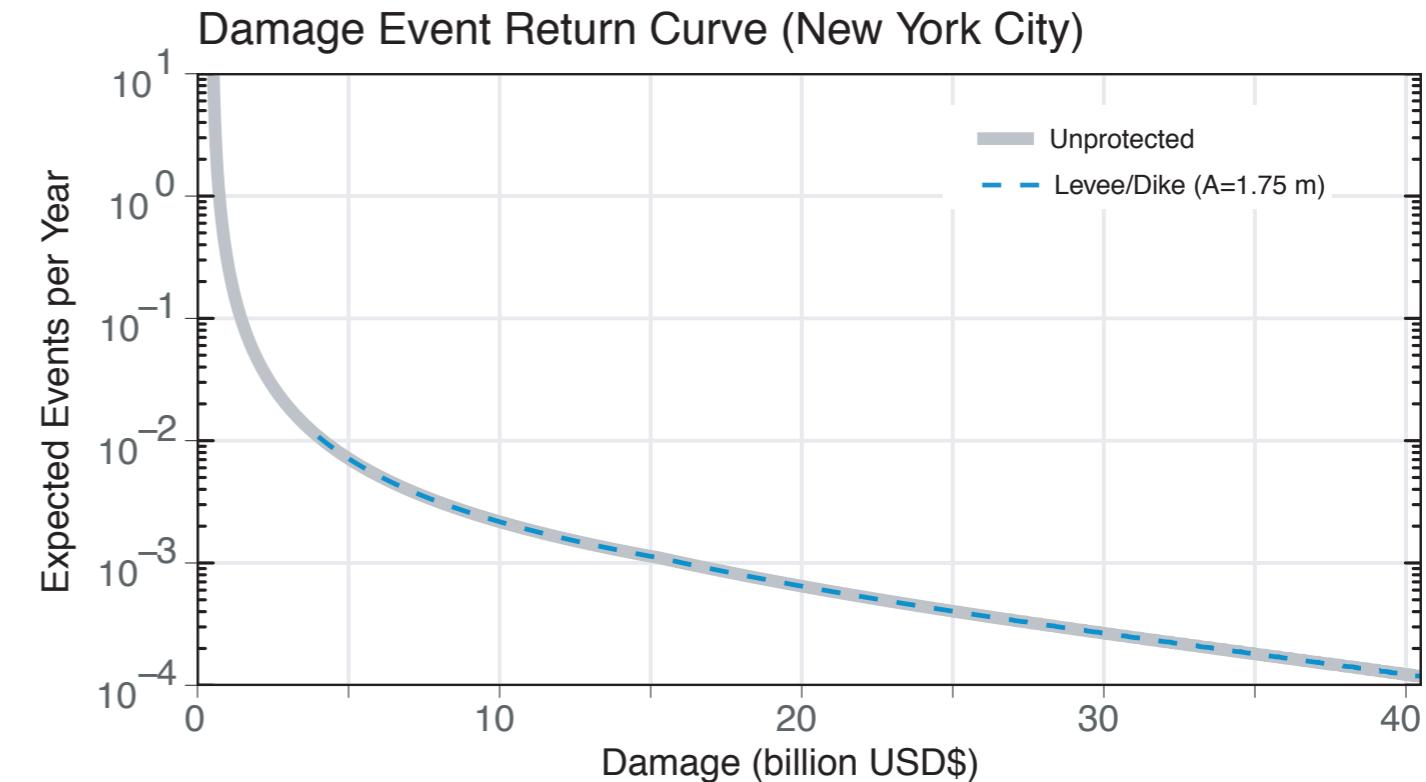
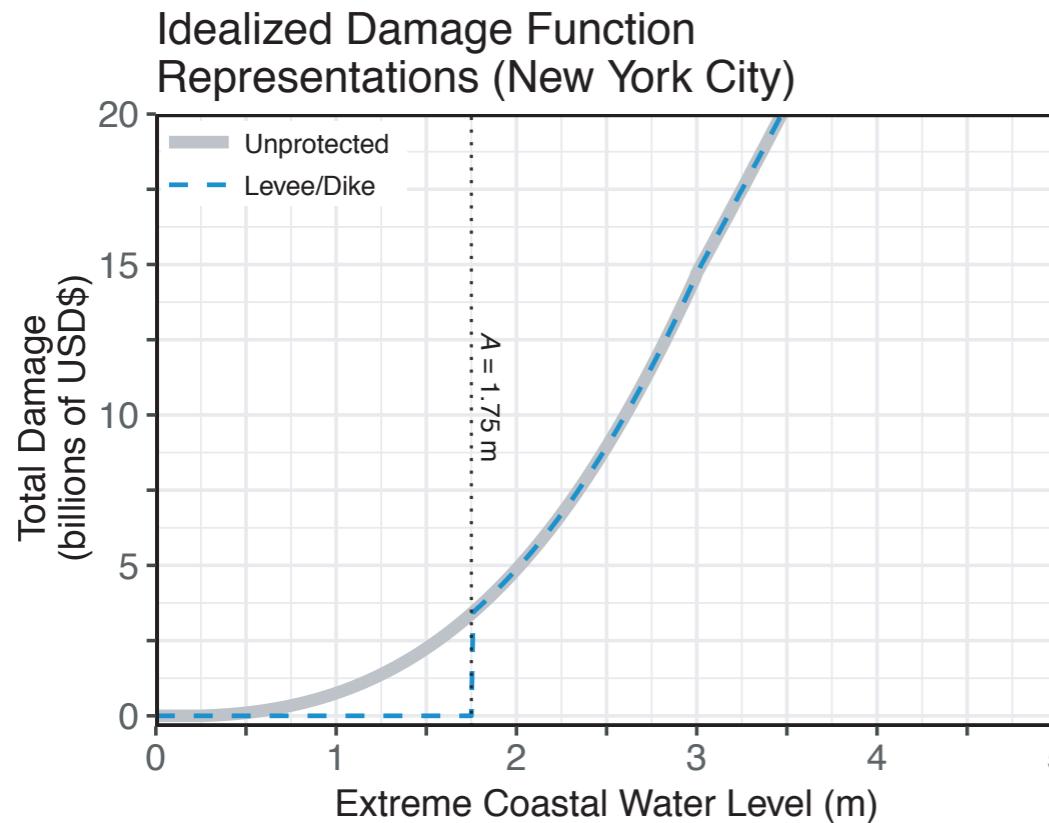
Example damage allowance calculation for a levee/dike



“Protected” damage function: $D^*(z)$

$$D^*(z) = p_f(z, A) D(z)$$

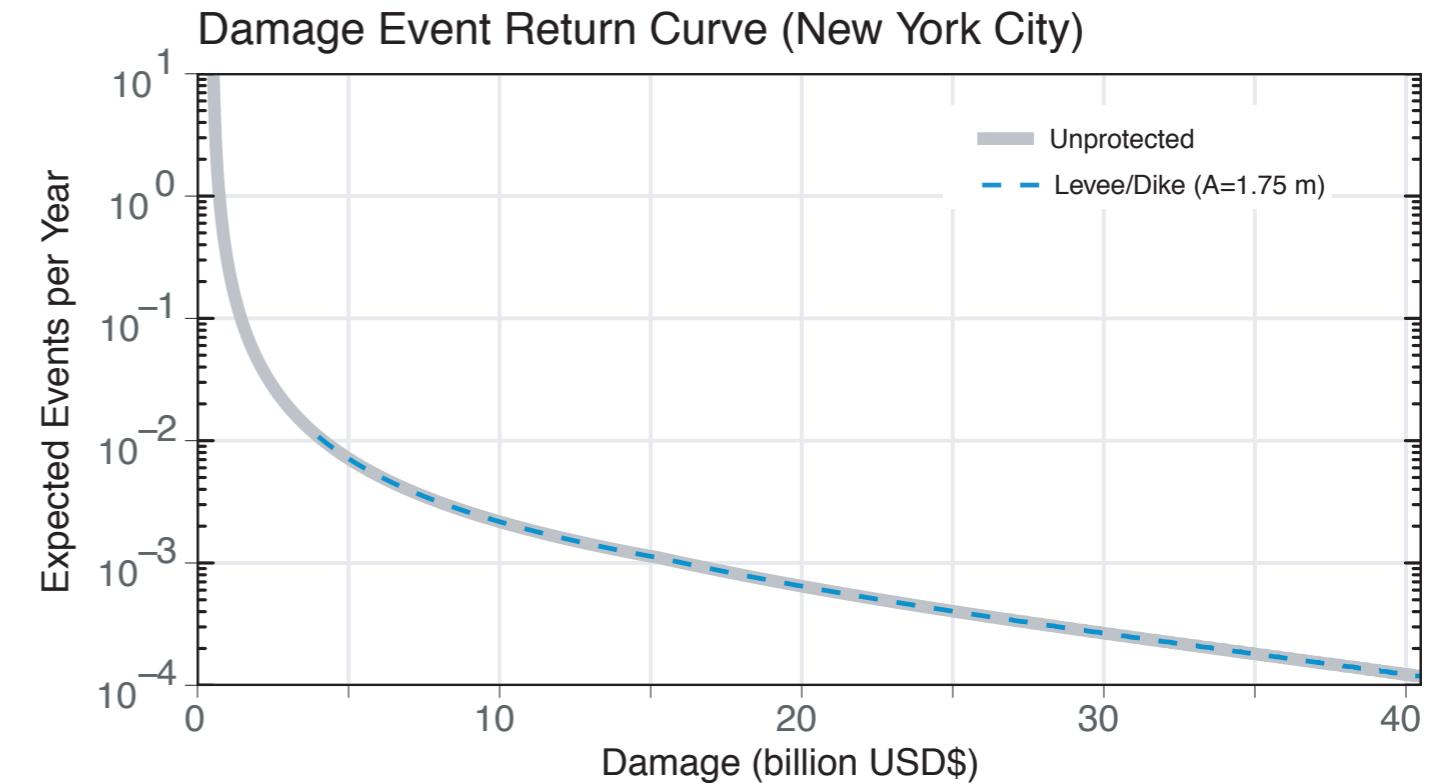
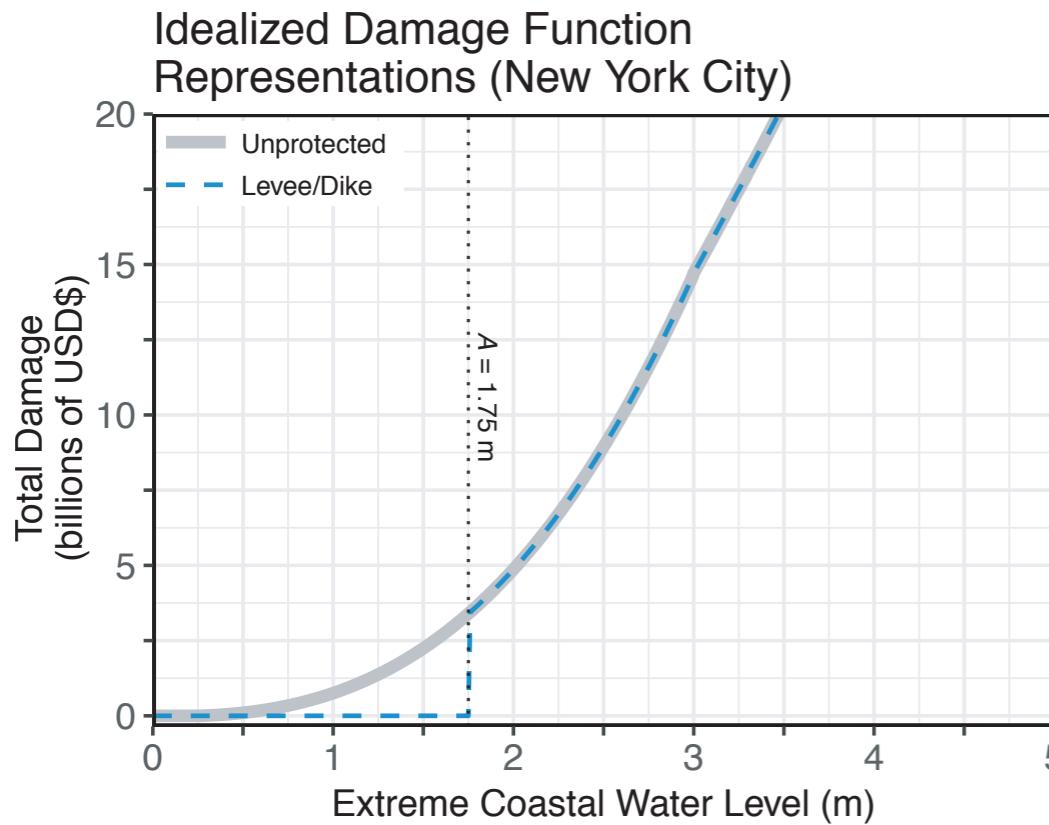
Example damage allowance calculation for a levee/dike



$$D^*(z) = p_f(z, A) D(z)$$

$$\int_z \int_{\Delta} D^*(z) f(z - \Delta) P(\Delta) d\Delta dz = \int_z D(z) f(z) dz$$

Example damage allowance calculation for a levee/dike



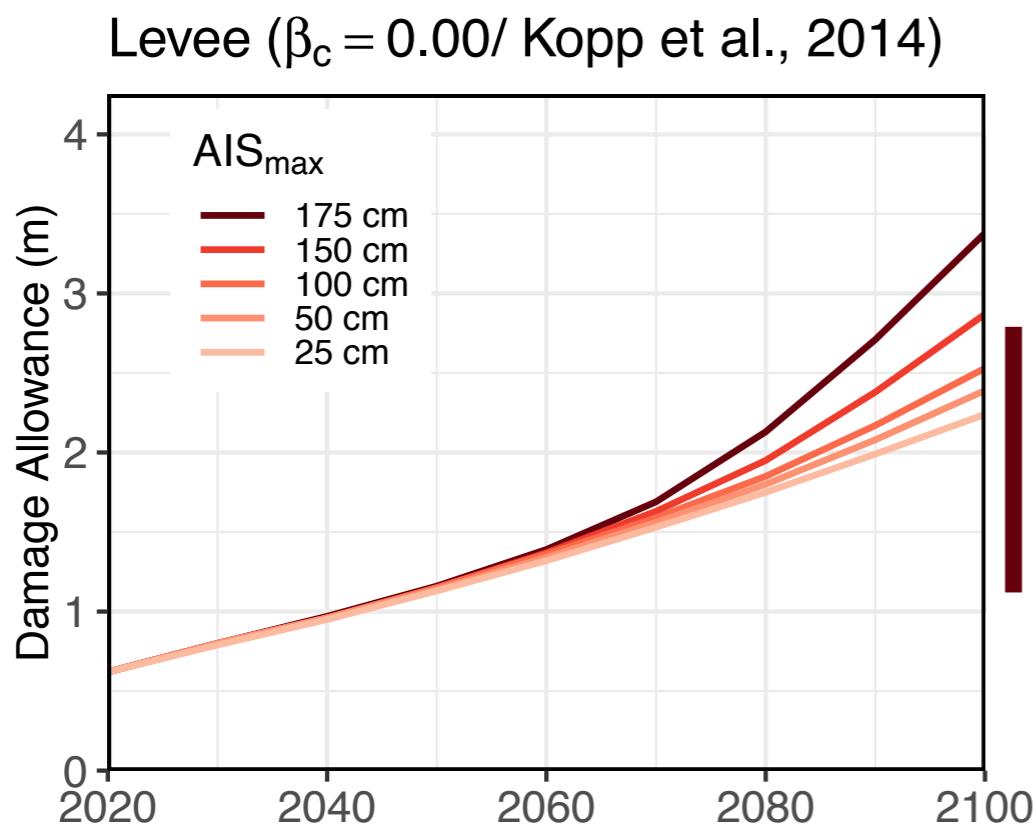
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$$\int_z \int_{\Delta} p_f(z, A) D(z) f(z - \Delta) P(\Delta) d\Delta dz = \int_z D(z) f(z) dz$$

Solve for A numerically

Damage allowance for levee/dike strongly depends on where the ‘tail’ of the AIS is cut off (i.e., AIS_{max})

‘instantaneous’ allowance



Lines = full PDF of sea-level rise

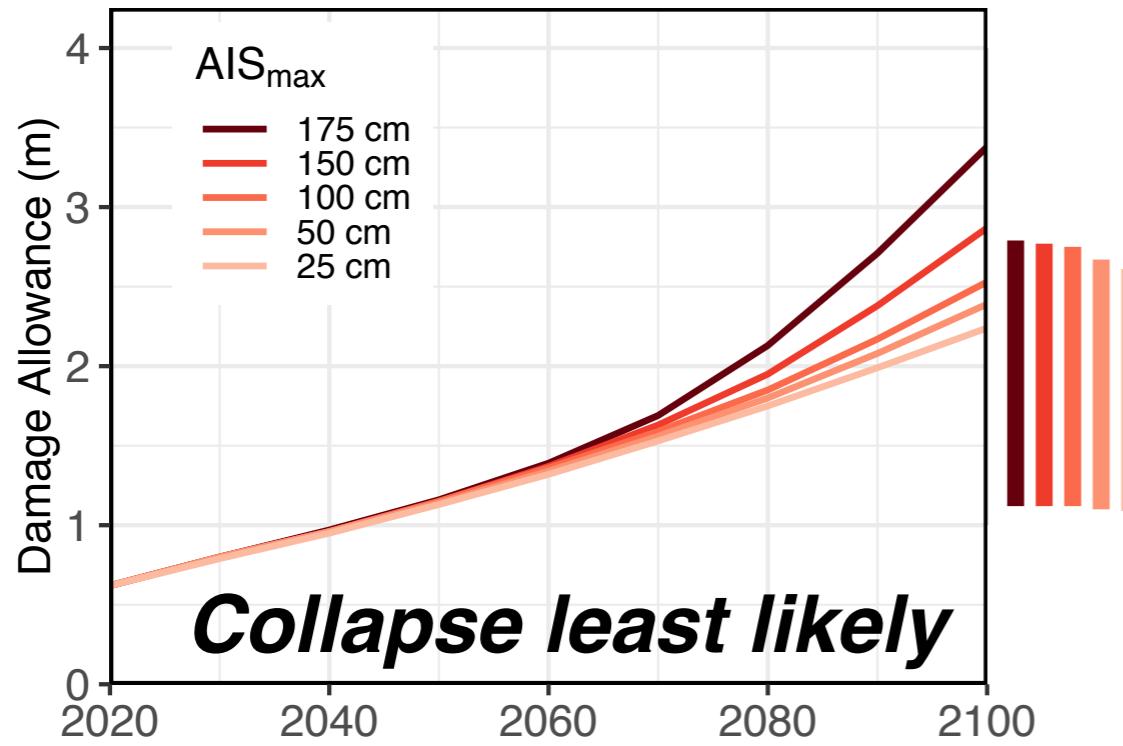
Bars =

95th percentile of sea-level rise

5th percentile of sea-level rise

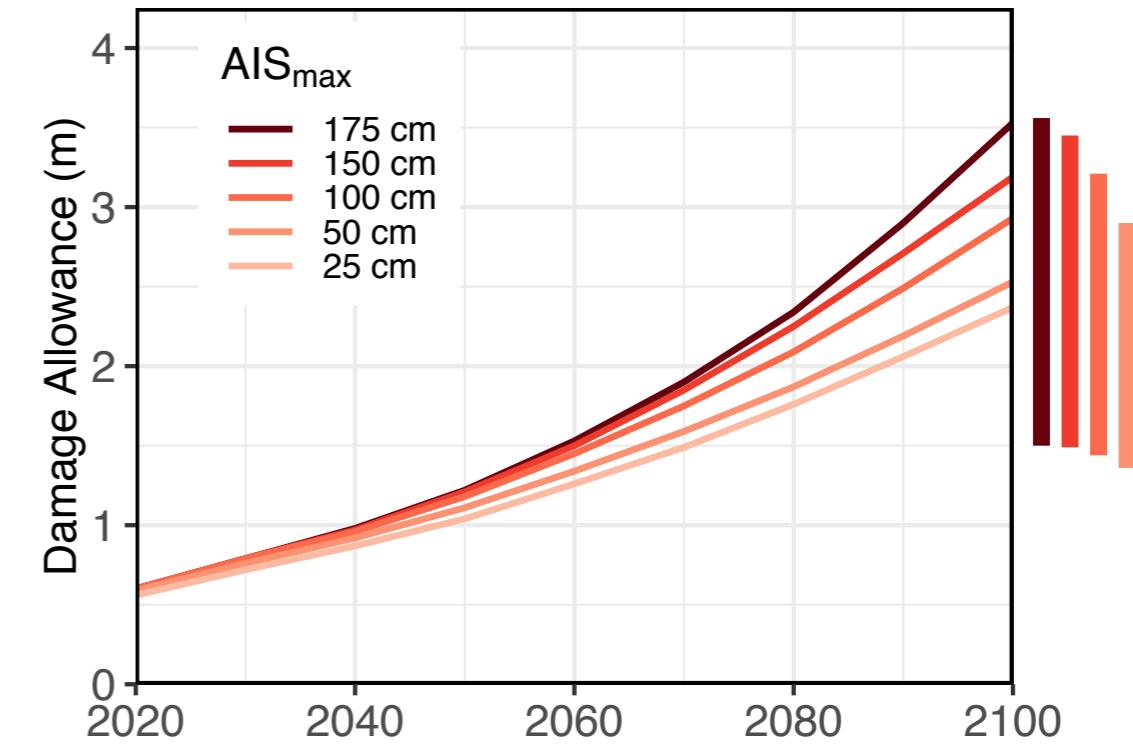
Damage allowance for levee/dike also depends on perceived likelihood of AIS collapse (i.e., β_c)

Levee ($\beta_c = 0.00$ / Kopp et al., 2014)

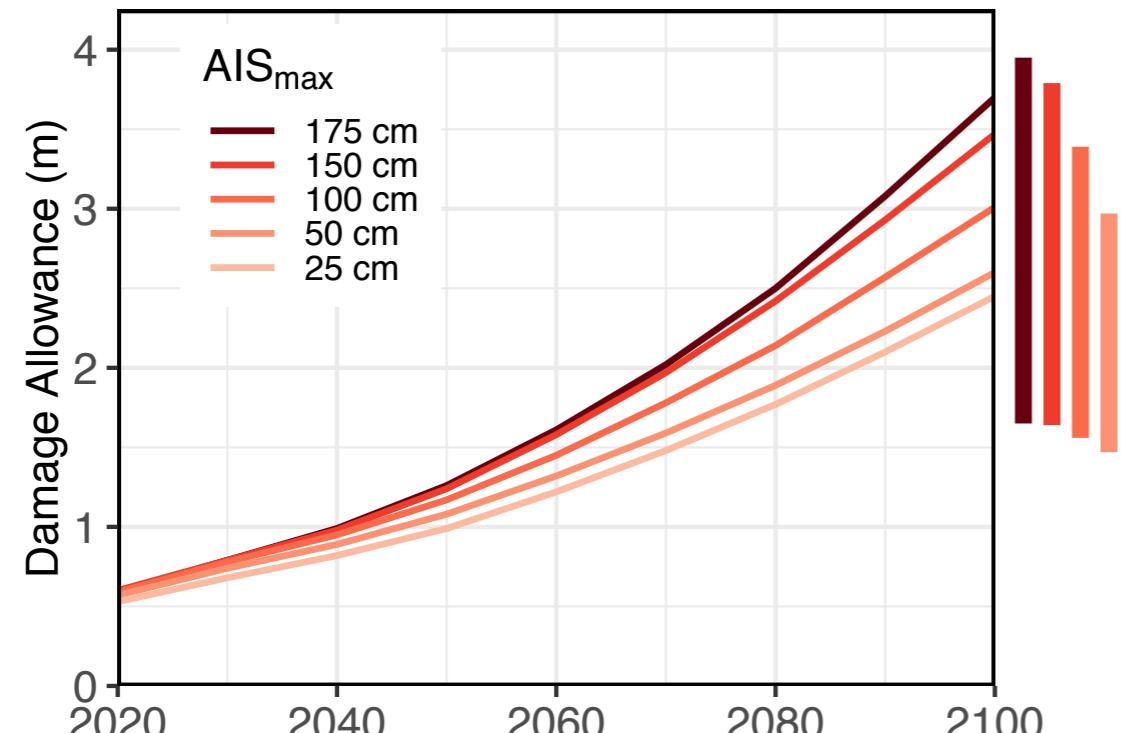


Collapse least likely

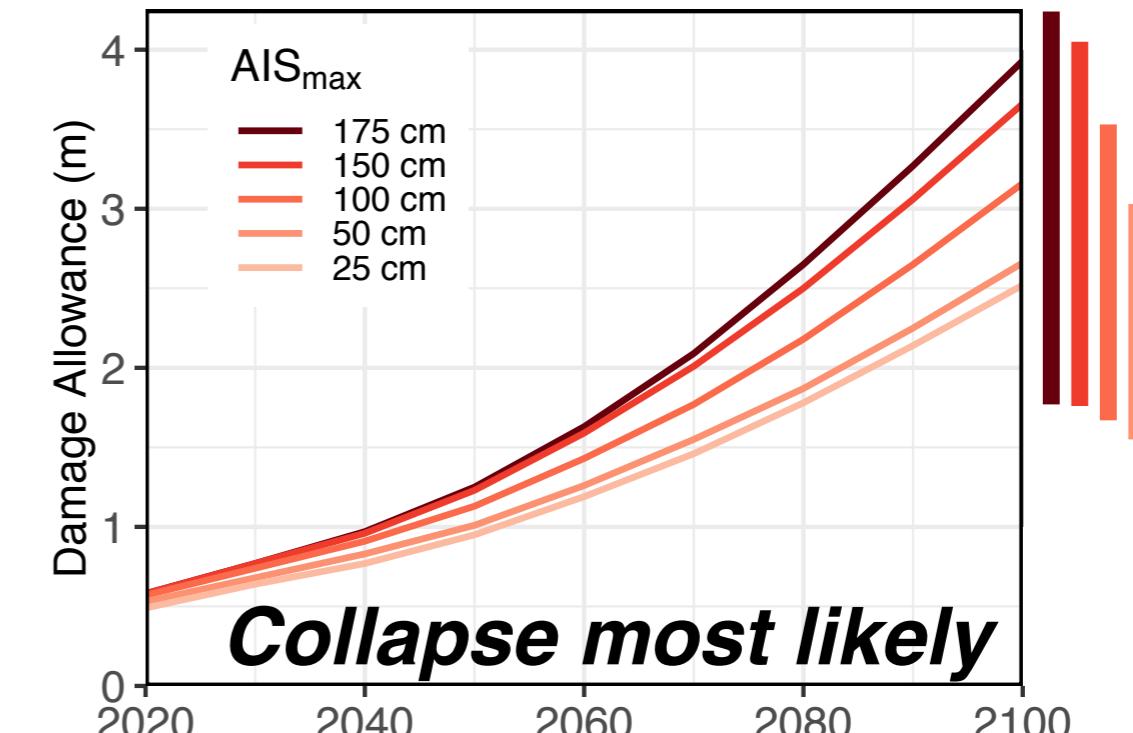
Levee ($\beta_c = 0.50$)



Levee ($\beta_c = 0.75$)



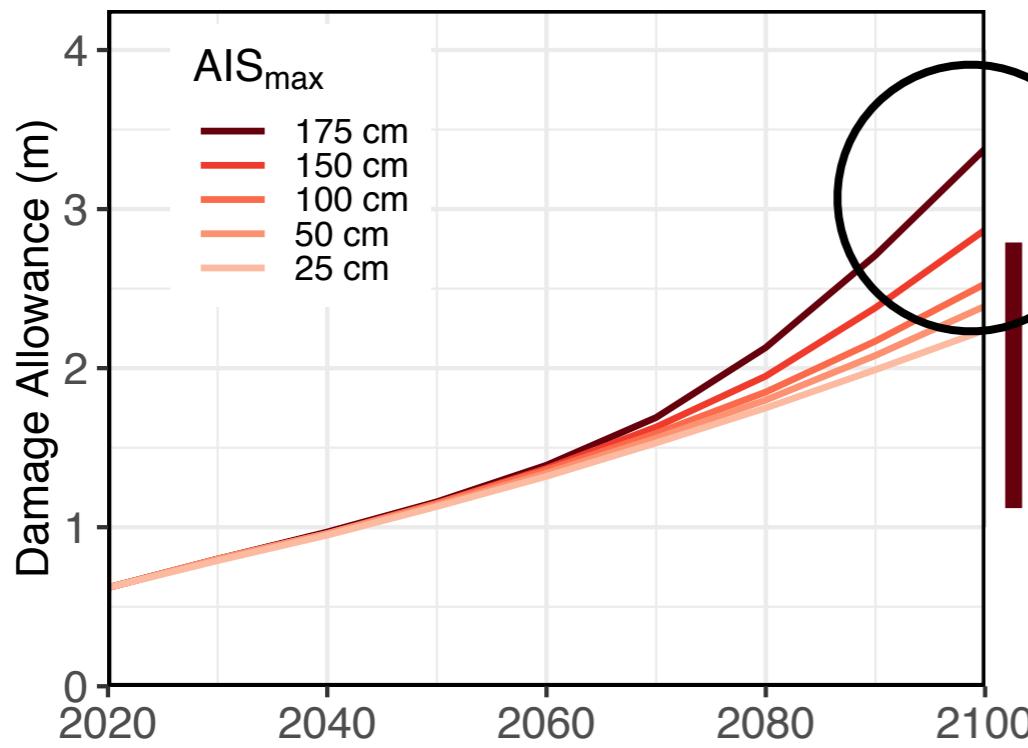
Levee ($\beta_c = 1.00$ / Kopp et al., 2017)



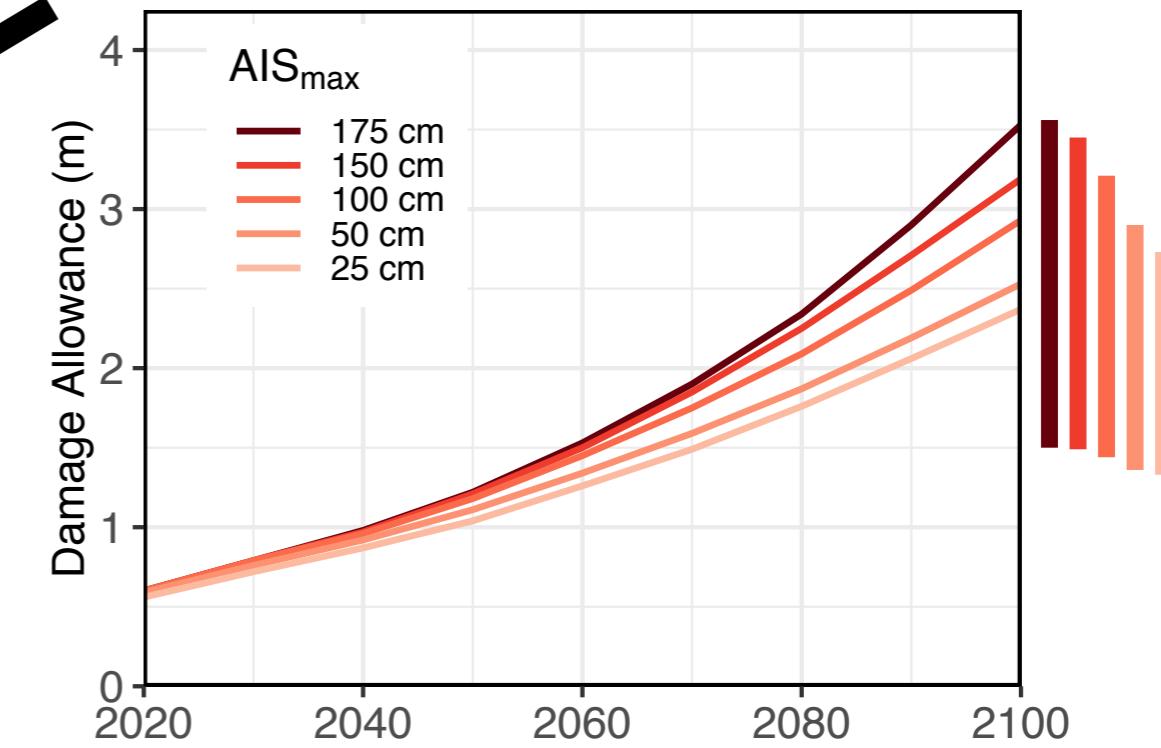
Collapse most likely

Expected values driven by sea level extremes in tail

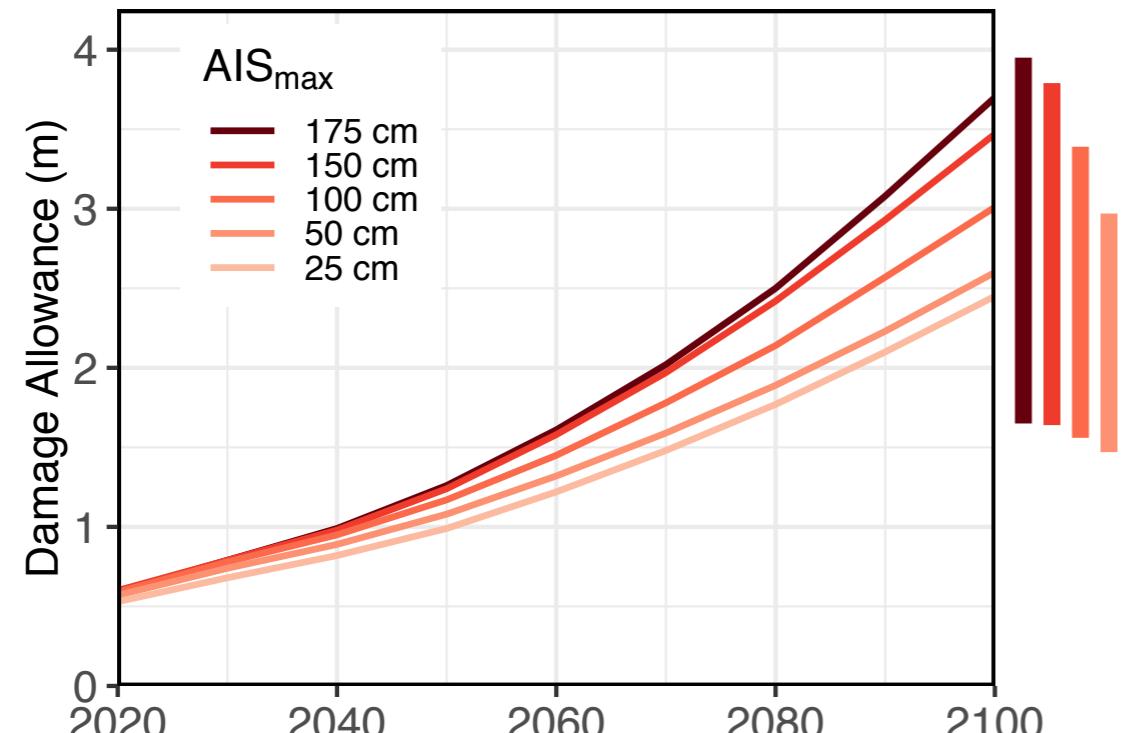
Levee ($\beta_c = 0.00$ / Kopp et al., 2014)



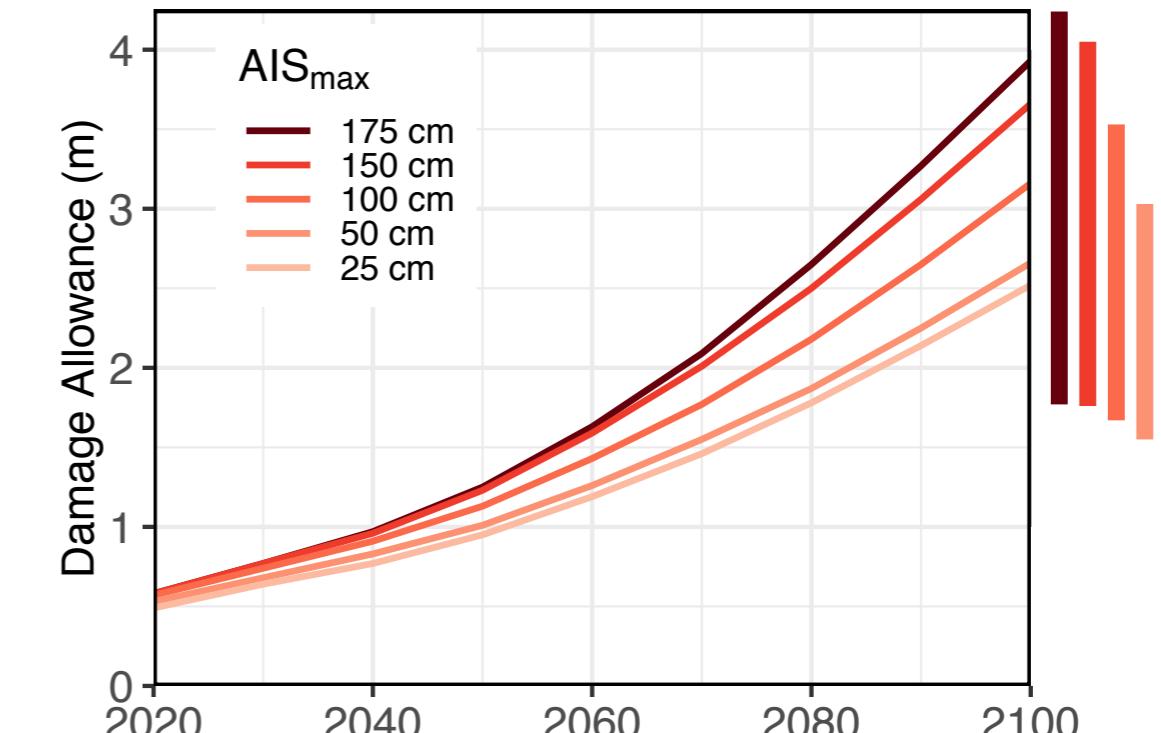
Levee ($\beta_c = 0.50$)



Levee ($\beta_c = 0.75$)

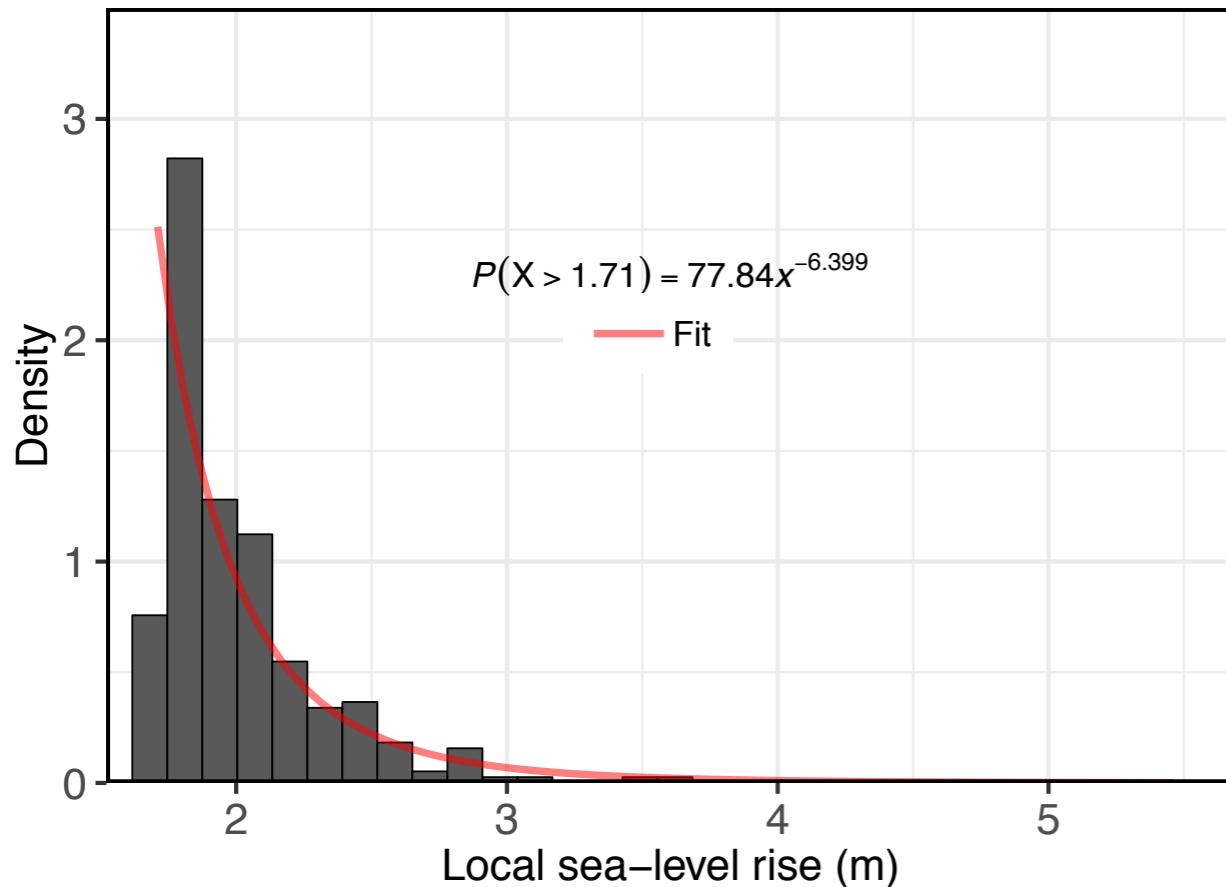


Levee ($\beta_c = 1.00$ / Kopp et al., 2017)

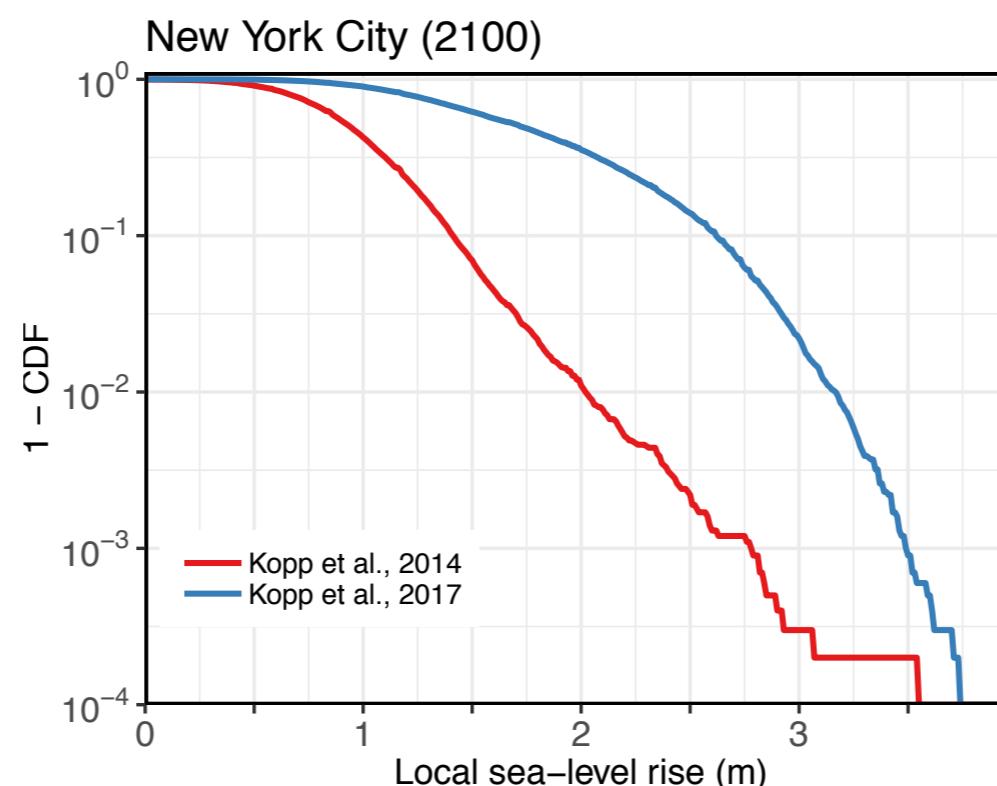
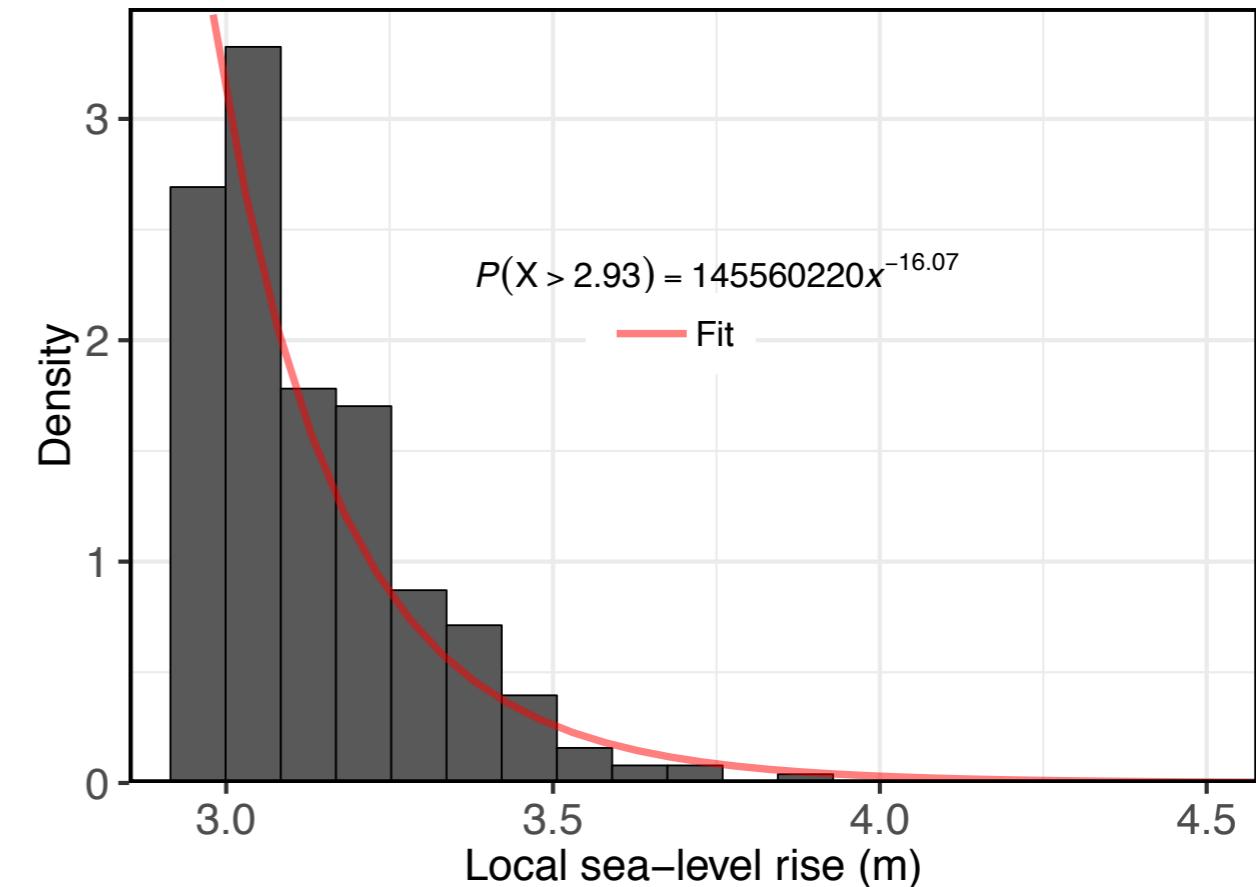


Length of the tail on the sea-level rise PDF matters

New York City (2100); Kopp et al., 2014



New York City (2100); Kopp et al., 2017



Lessons learned:

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‘Damage allowances’ are another tool for coastal risk manager’s or engineer’s tool box

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Subjective assessment of AIS stability necessary under deep uncertainty

Lessons learned:

'Damage allowances' are another tool for coastal risk manager's or engineer's tool box

Planners must be cognizant of deep uncertainty, and recognize when it should be taken into account (e.g., beyond 2050)

Subjective assessment of AIS stability necessary under deep uncertainty

There is value in reducing this uncertainty in terms of lower levee heights that are less expensive

