



# Coastal flood implications of 1.5 °C, 2 °C and 2.5 °C global mean temperature stabilization targets



D.J. Rasmussen, Klaus Bittermann, Maya K. Buchanan, Scott Kulp,  
Benjamin H. Strauss, Robert E. Kopp, Michael Oppenheimer

D.J. Rasmussen, K. Bittermann, M.K.  
Buchanan, S. Kulp, B.H. Strauss, R.E. Kopp,  
and M. Oppenheimer, 2017: **Coastal flood  
implications of 1.5 °C, 2.0 °C, and 2.5 °C  
temperature stabilization targets in the 21st  
and 22nd century.** ArXiv e-prints. eprint:  
1710.08297.

Now available on [arXiv.org](https://arxiv.org/abs/1710.08297)

**What's so special with these temperatures: 1.5 °C, 2 °C  
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# **Paris Agreement (2015)**

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## Paris Agreement (2015)

Goal: Stabilize global mean surface temperature (GMST) by limiting warming to “well below 2.0 °C above pre-industrial levels” and to further pursue efforts to “limit the temperature increase to 1.5 °C above pre-industrial levels” (UNFCCC, 2015)

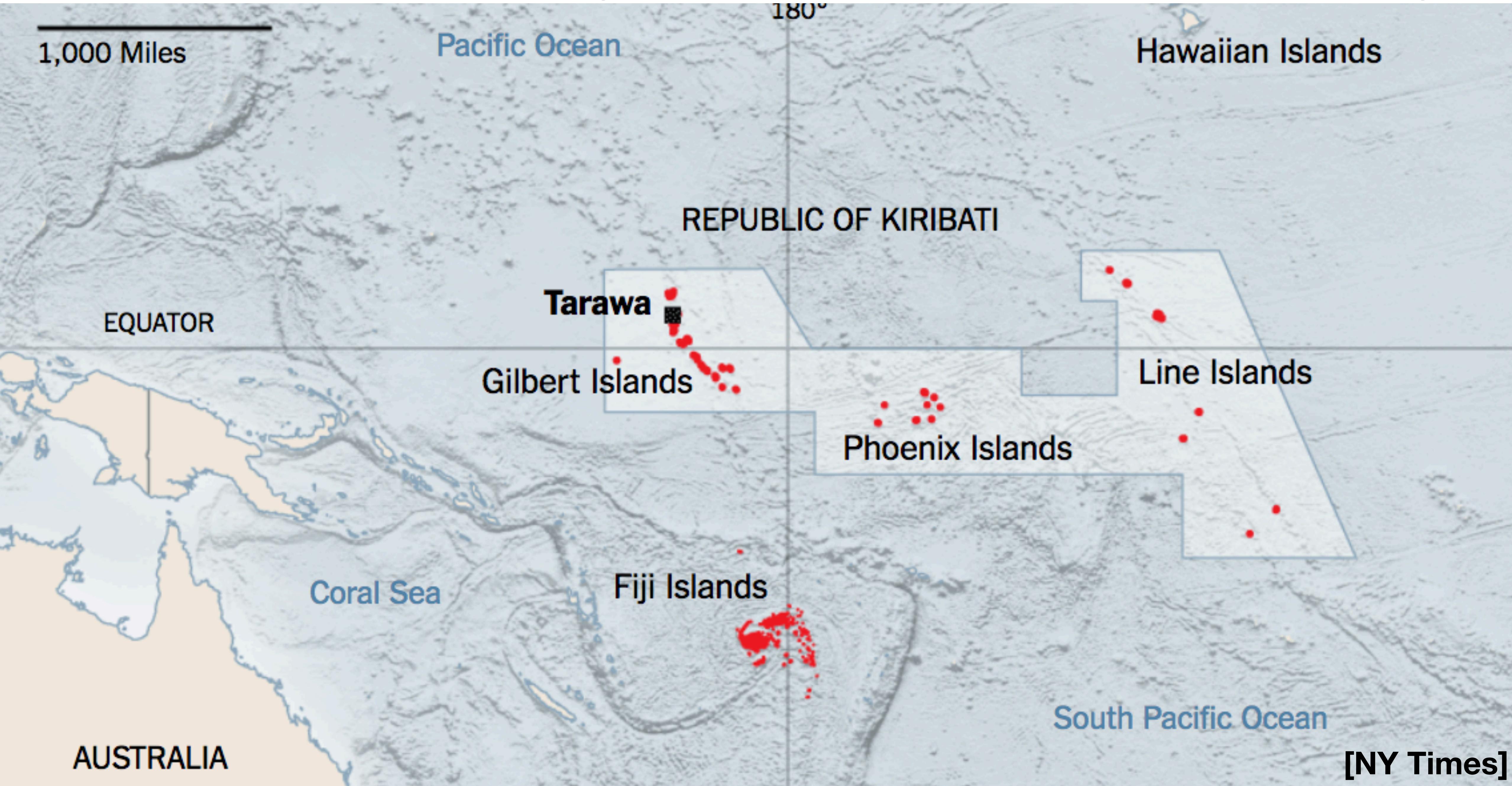
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This study: include 2.5 °C to assess warmer temperature stabilizations

# Small Island Developing States Advocated for 1.5 °C Target



# Tarawa



[NY Times]



# Tarawa

[NY Times]



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## Flood Protection Construction

[NY Times]

# Pre-Quiz

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- b) 5%
- c) 1%
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Small island nations will experience the largest coastal flood benefits from 1.5 °C vs. 2.0 °C stabilization over this century. (T/F)

# So what do temperature stabilization targets have to do with global sea levels?

Global mean surface temperature (GMST)  
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- Warmer surface temperatures increase rate of glacier and ice-sheet melt and fracturing



Higher sea levels imply permanent inundation



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...but first more frequent flooding

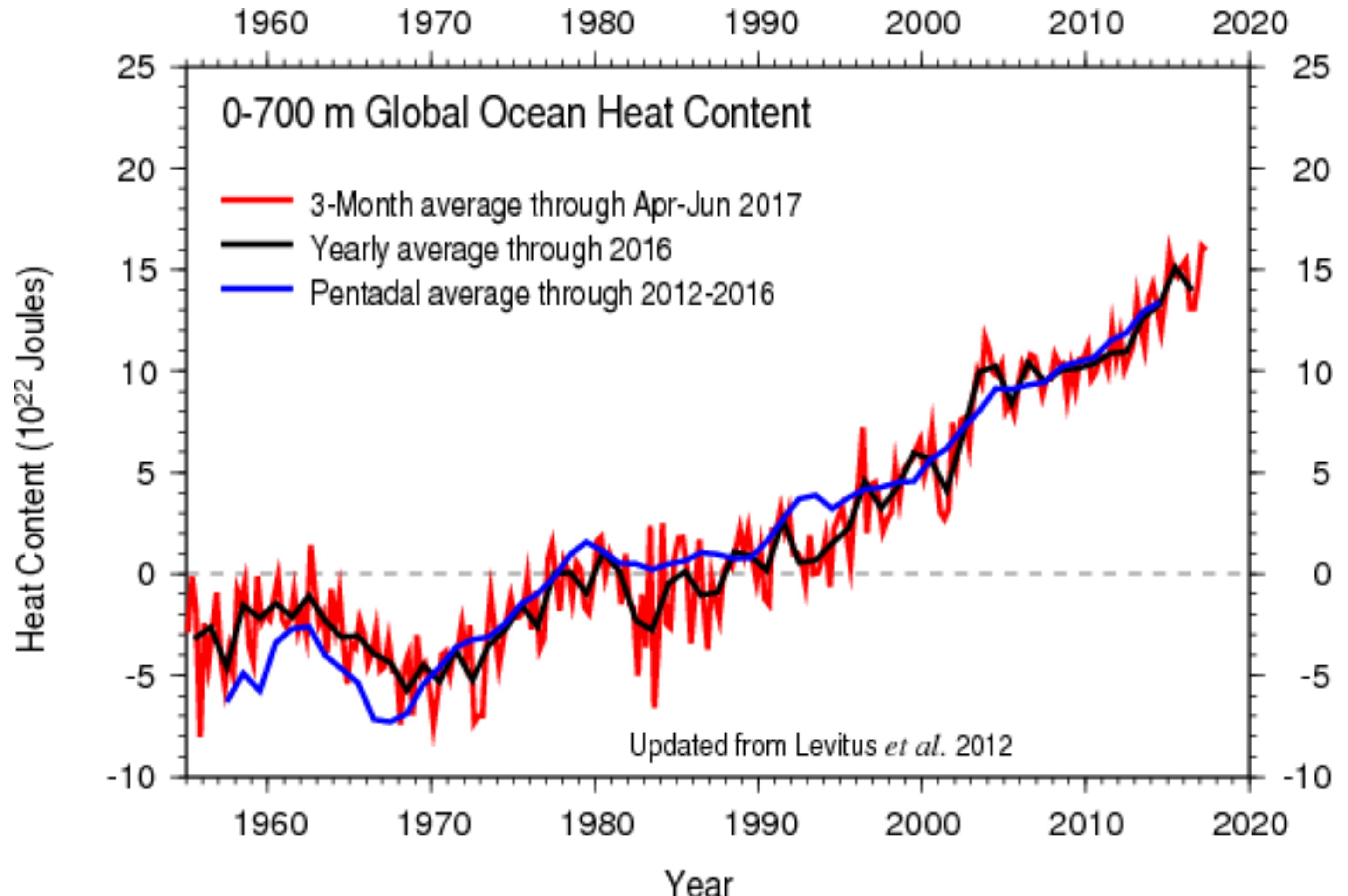


**Stabilized Temperature**  **≠ Stabilized Sea Level** 

# Stabilized Temperature



# $\neq$ Stabilized Sea Level



Ocean volume will continue to expand due to lag associated with the uptake of heat from the atmosphere to the ocean

**“Thermal Expansion”**



Stabilized Temperature  ≠ Stabilized Sea Level 

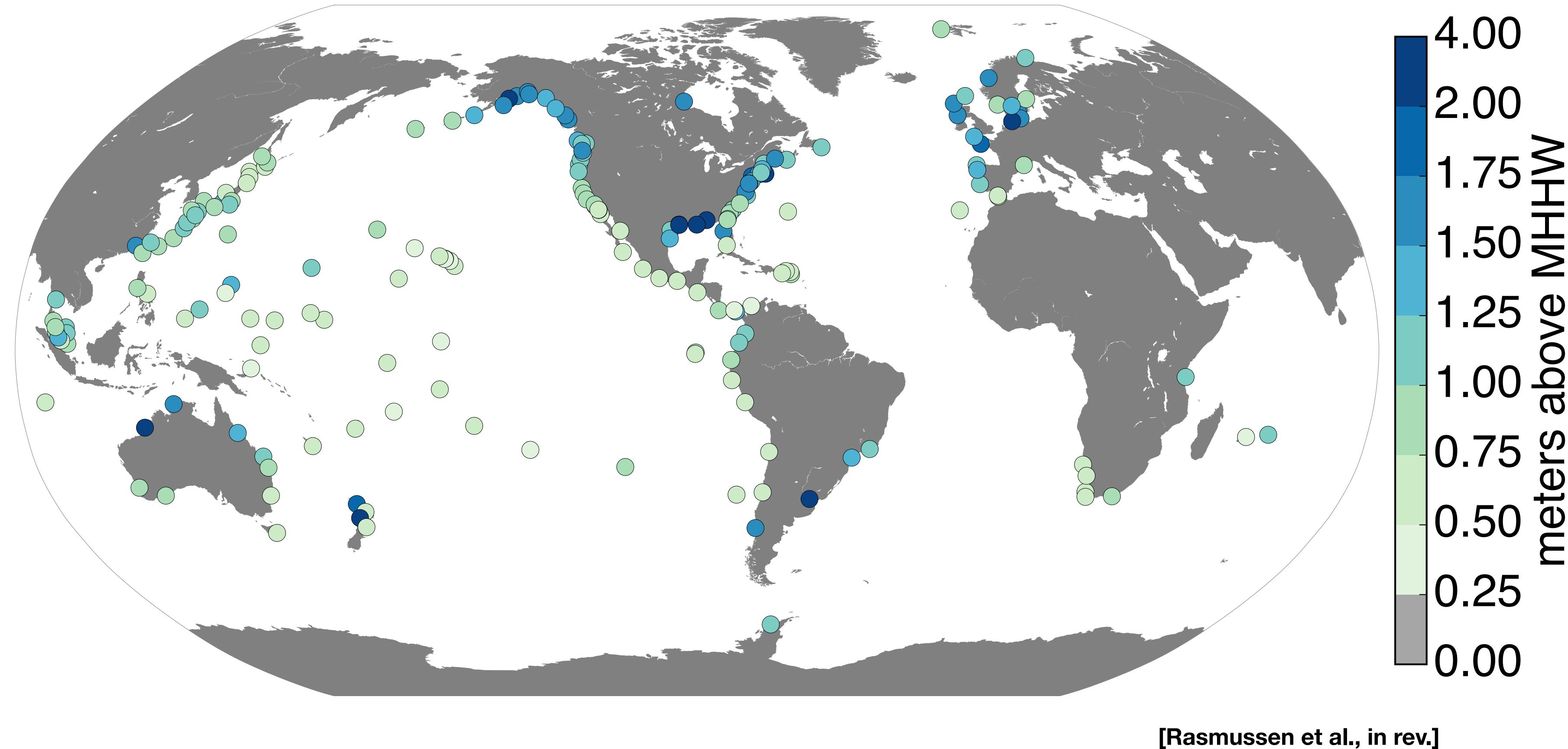
Ice-sheets are slow to respond to a given forcing (as seen in paleo-record), so melting and fracturing likely to continue

# Stabilized Temperature ≠ Stabilized Sea Level

- Ocean volume will continue to expand due to lag associated with the uptake of heat from the atmosphere to the ocean
- Ice-sheets are slow to respond to a given forcing (as seen in paleo-record), so melting and fracturing likely to continue
- **GSL rise will increase the baseline height from which storm surges and astronomical tides occur**

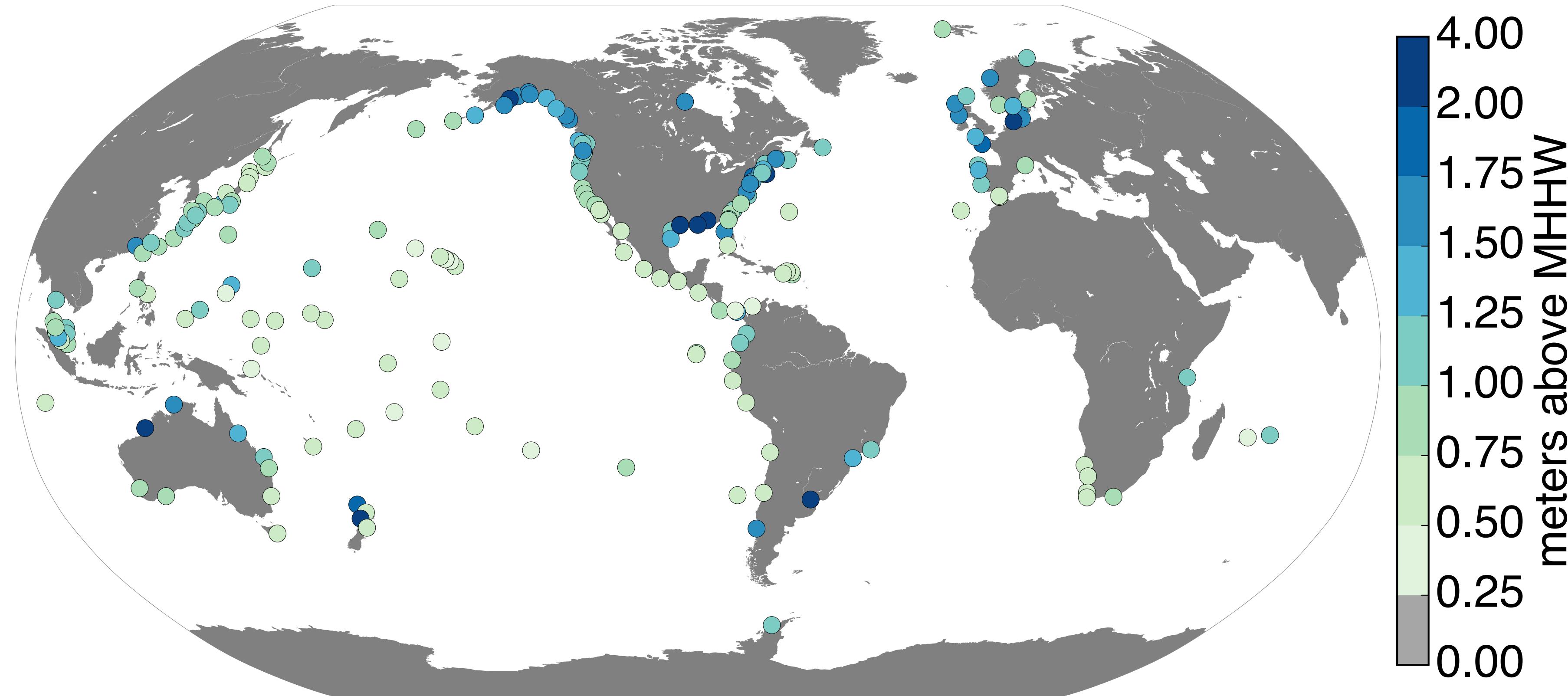
# Global sea level rise will increase the frequency of coastal floods (e.g., the 100-yr or 1%yr-1 flood)

Historical 100-yr Flood Height



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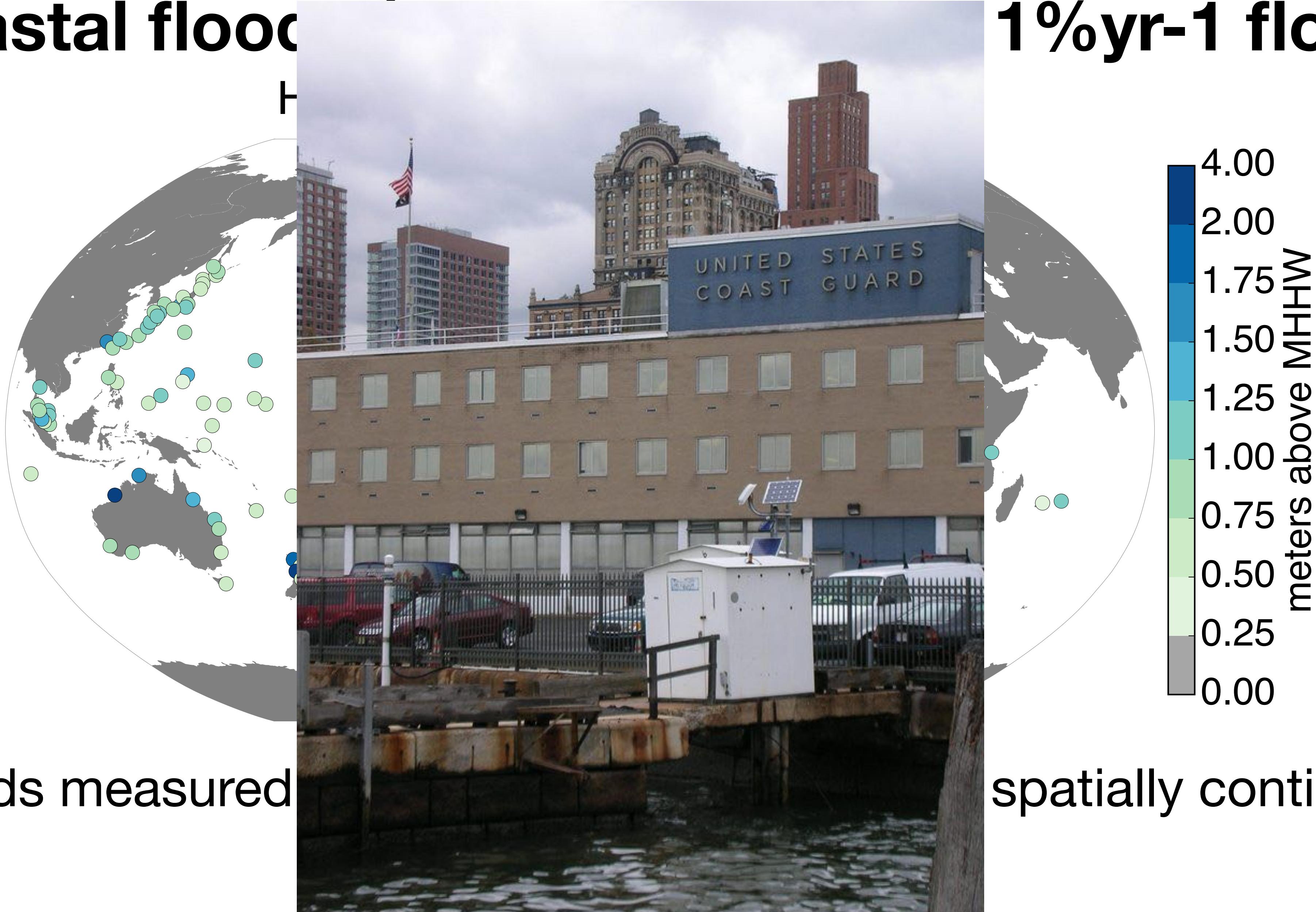
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Floods measured as “point” estimates – NOT spatially continuous

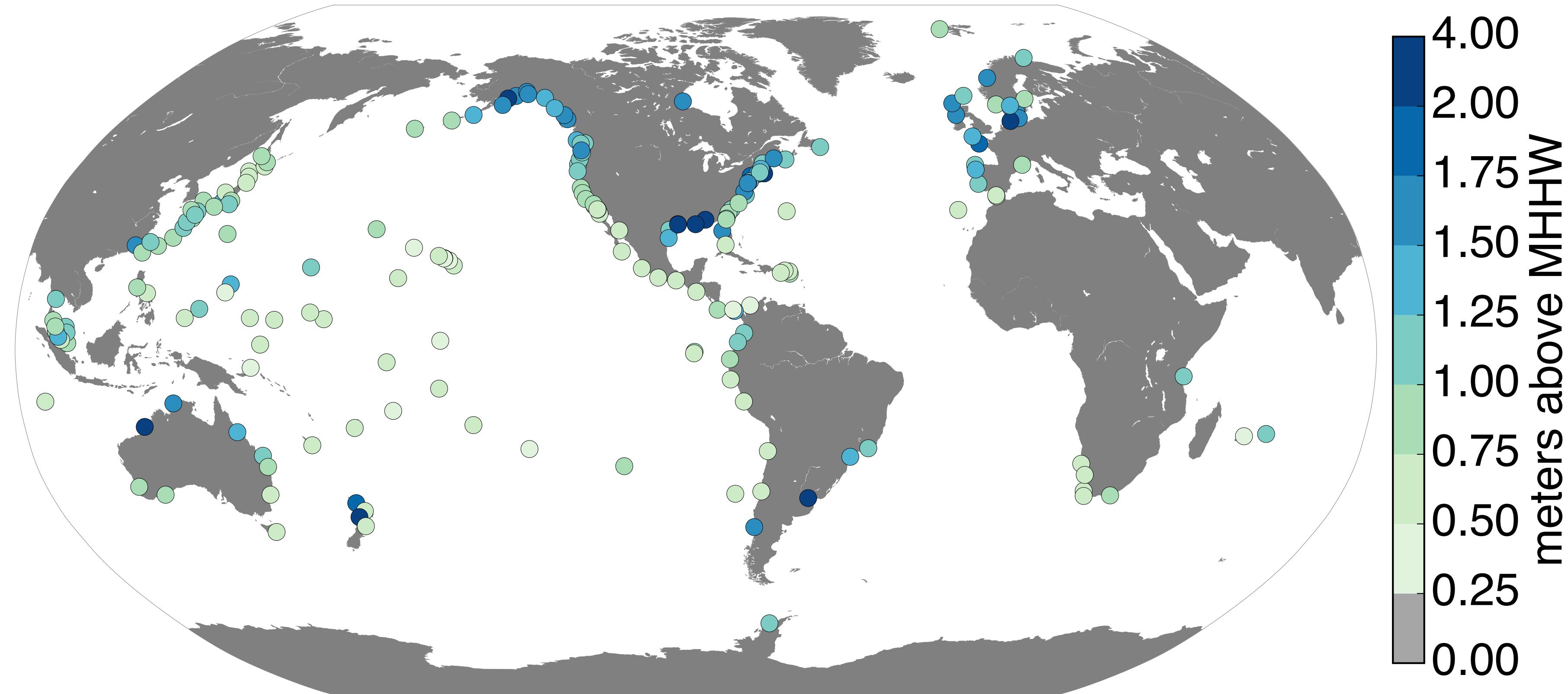
[Rasmussen et al., in rev.]

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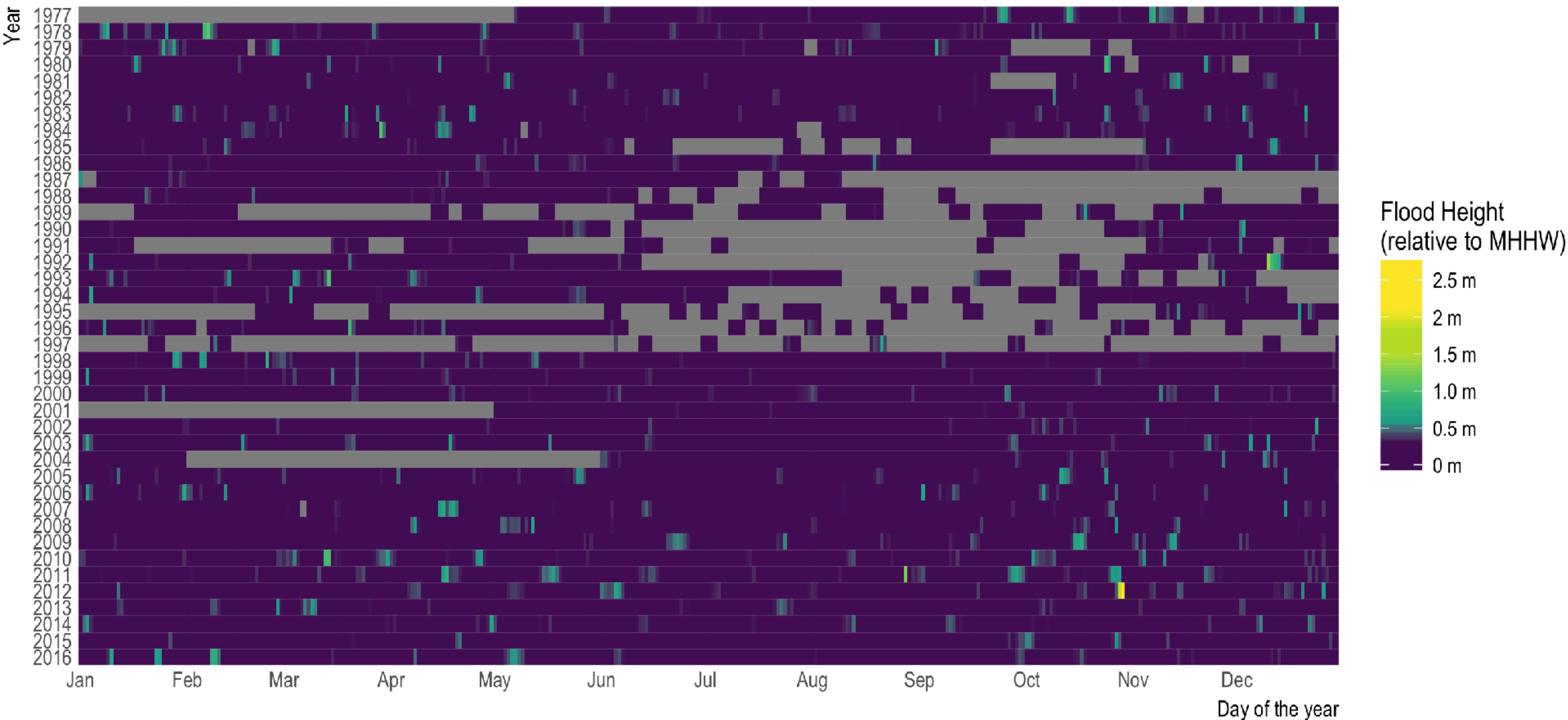


Floods measured as “point” estimates – NOT spatially continuous [Rasmussen et al., in rev.]

Floods are defined as water height over MHHW (independent of damage)

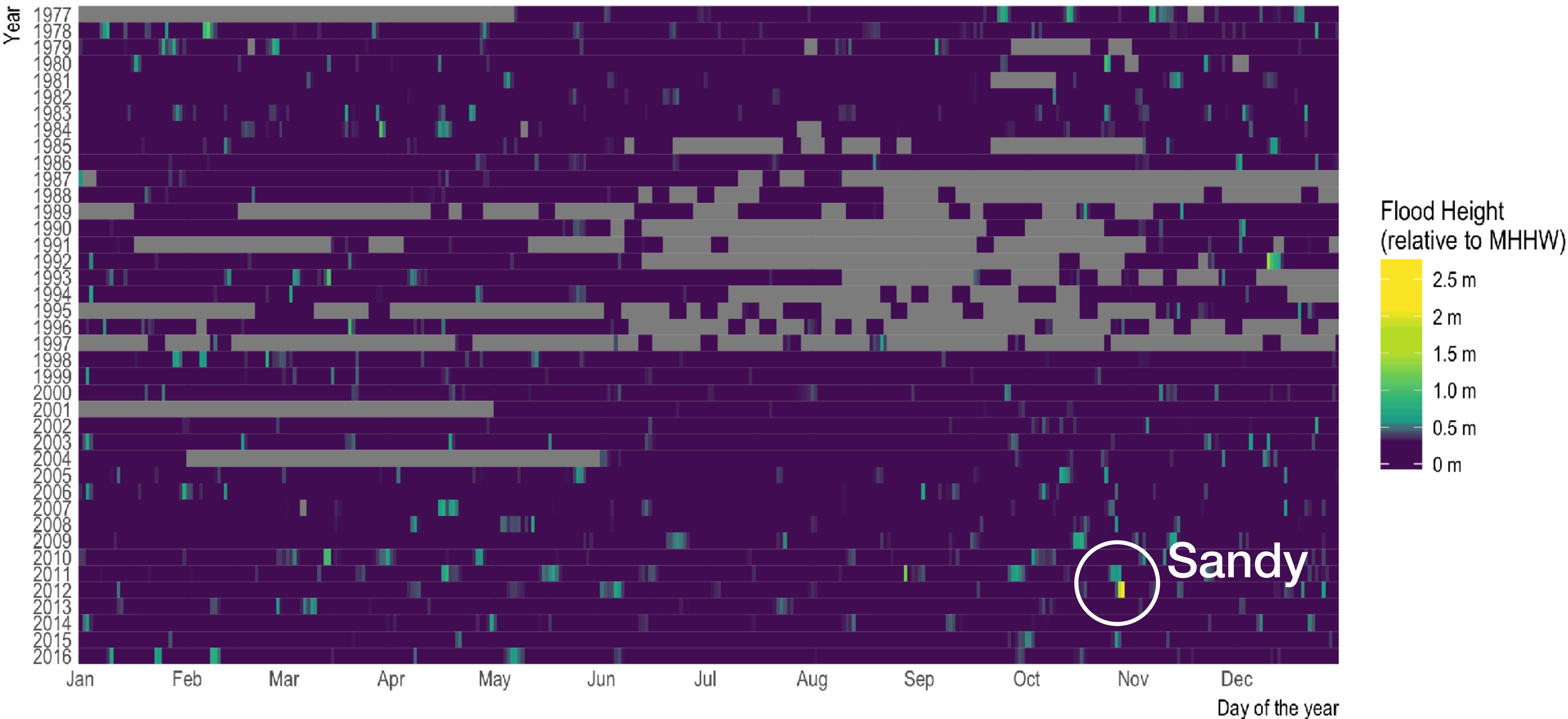
# Daily Flood Events at the Battery, New York City

1977-2016 (Grey are missing data)



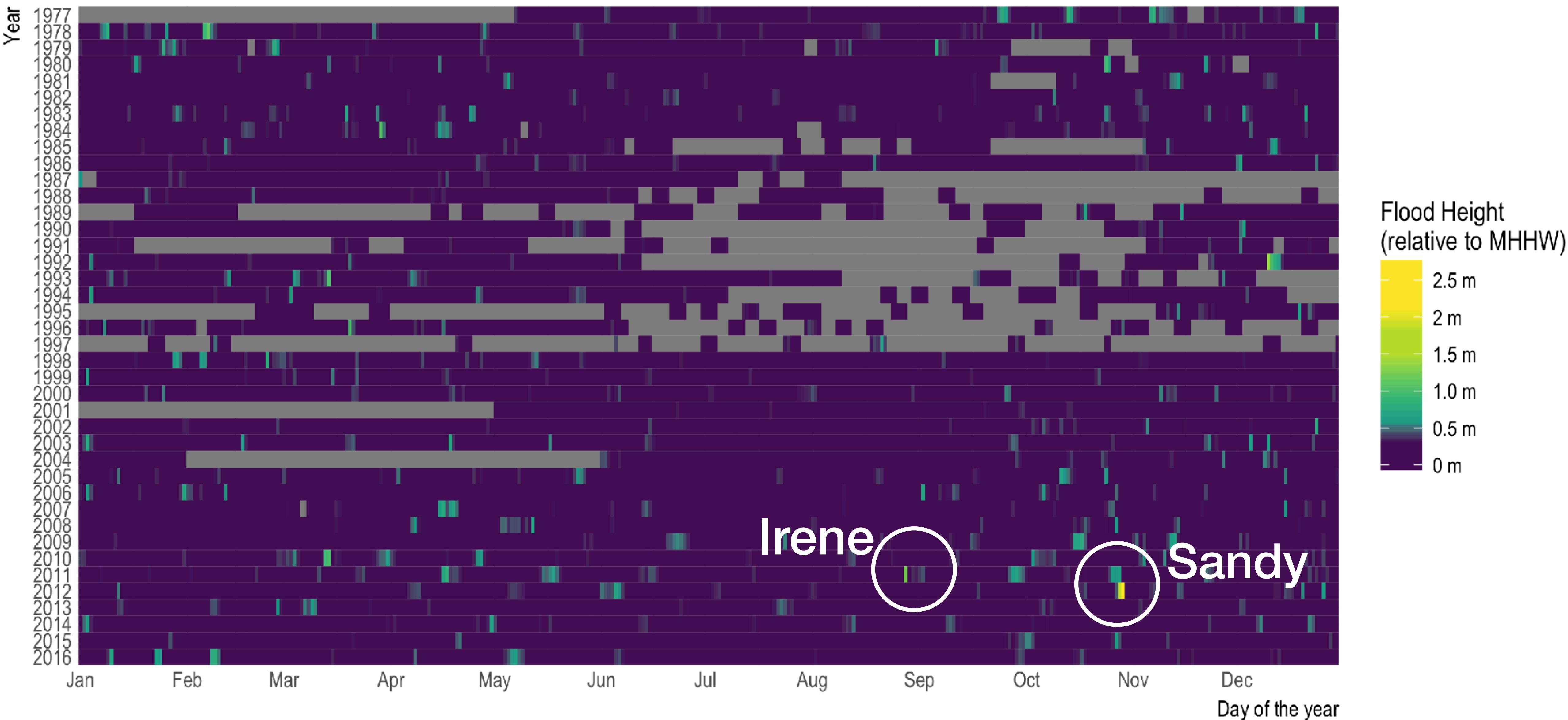
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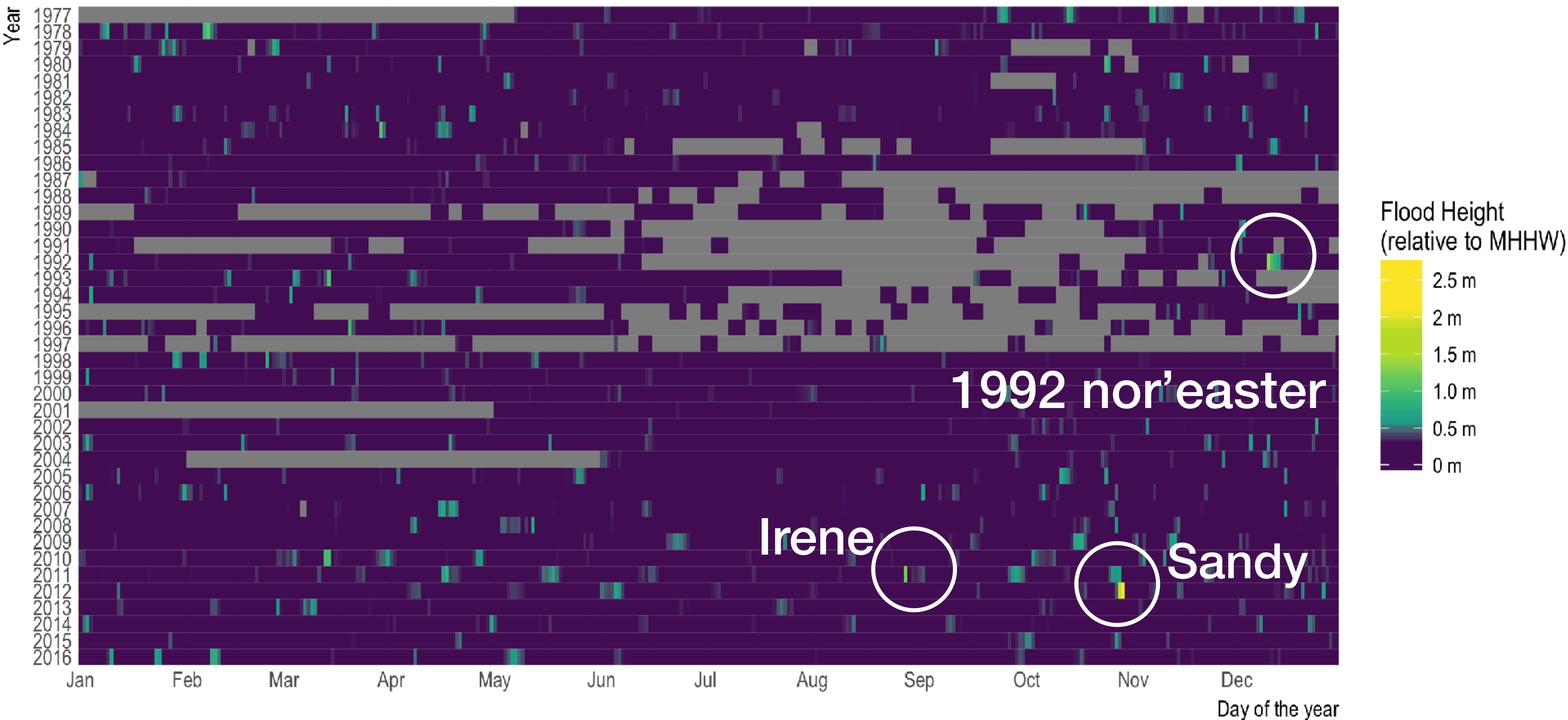
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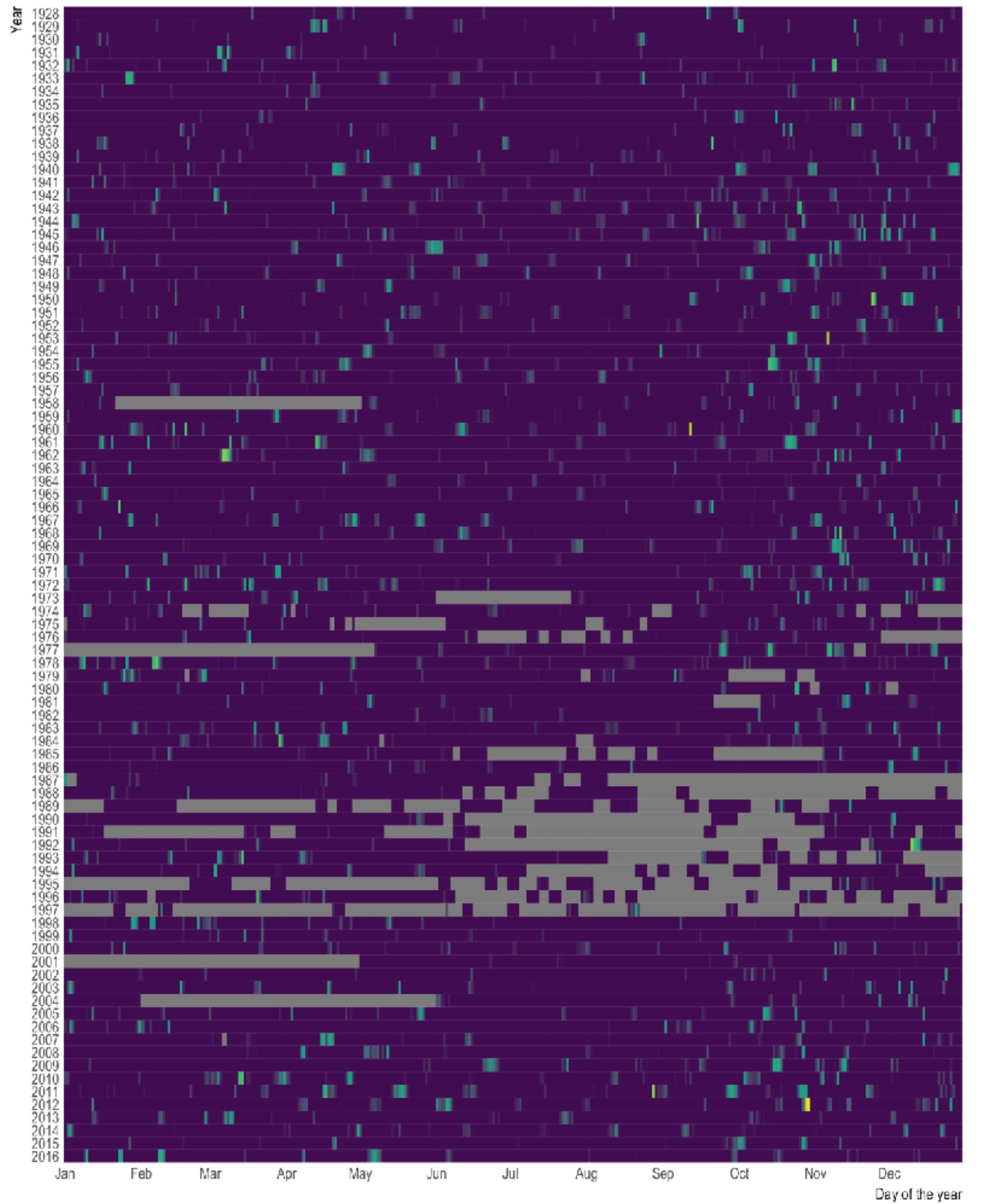


“Sky full of...  
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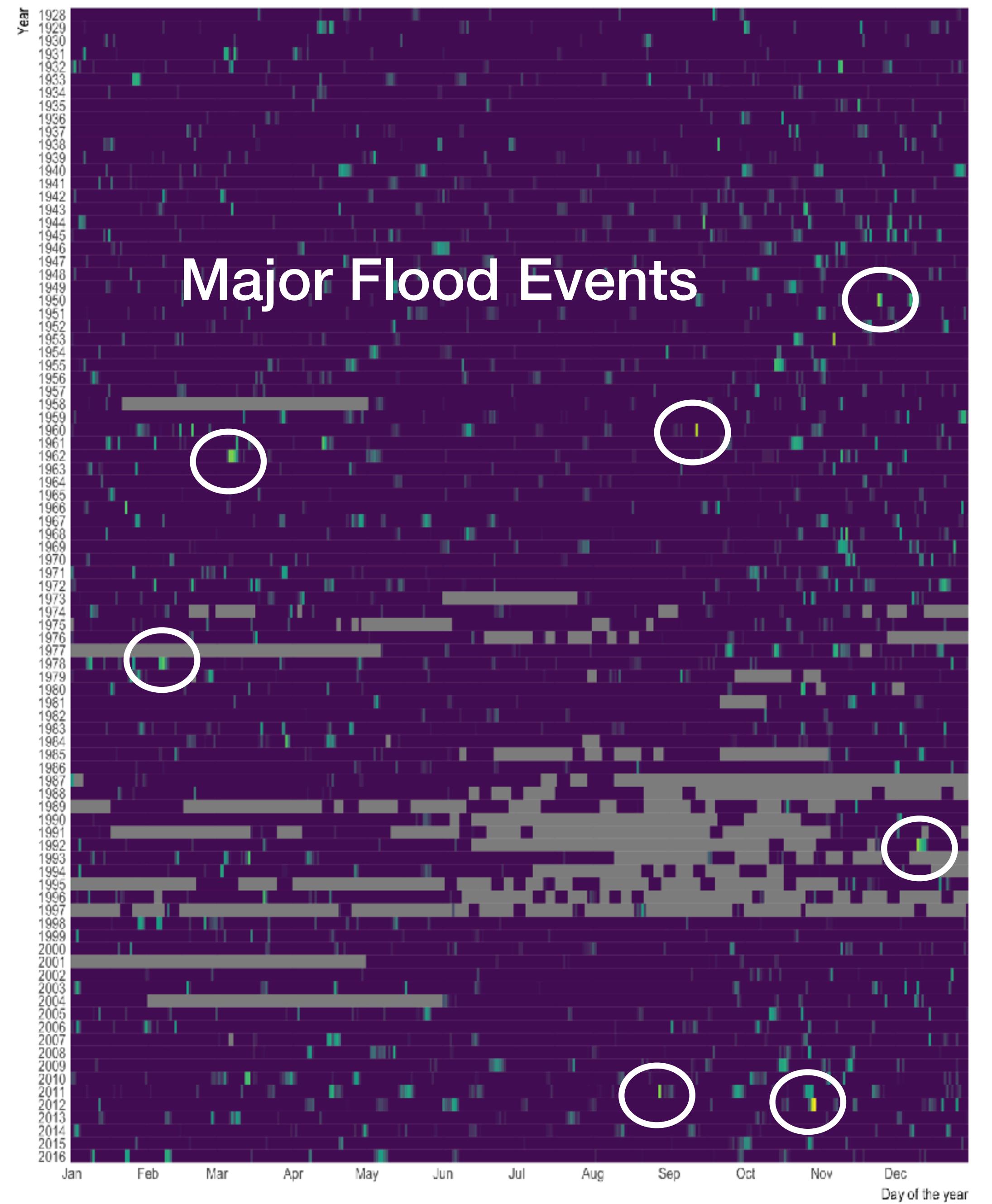


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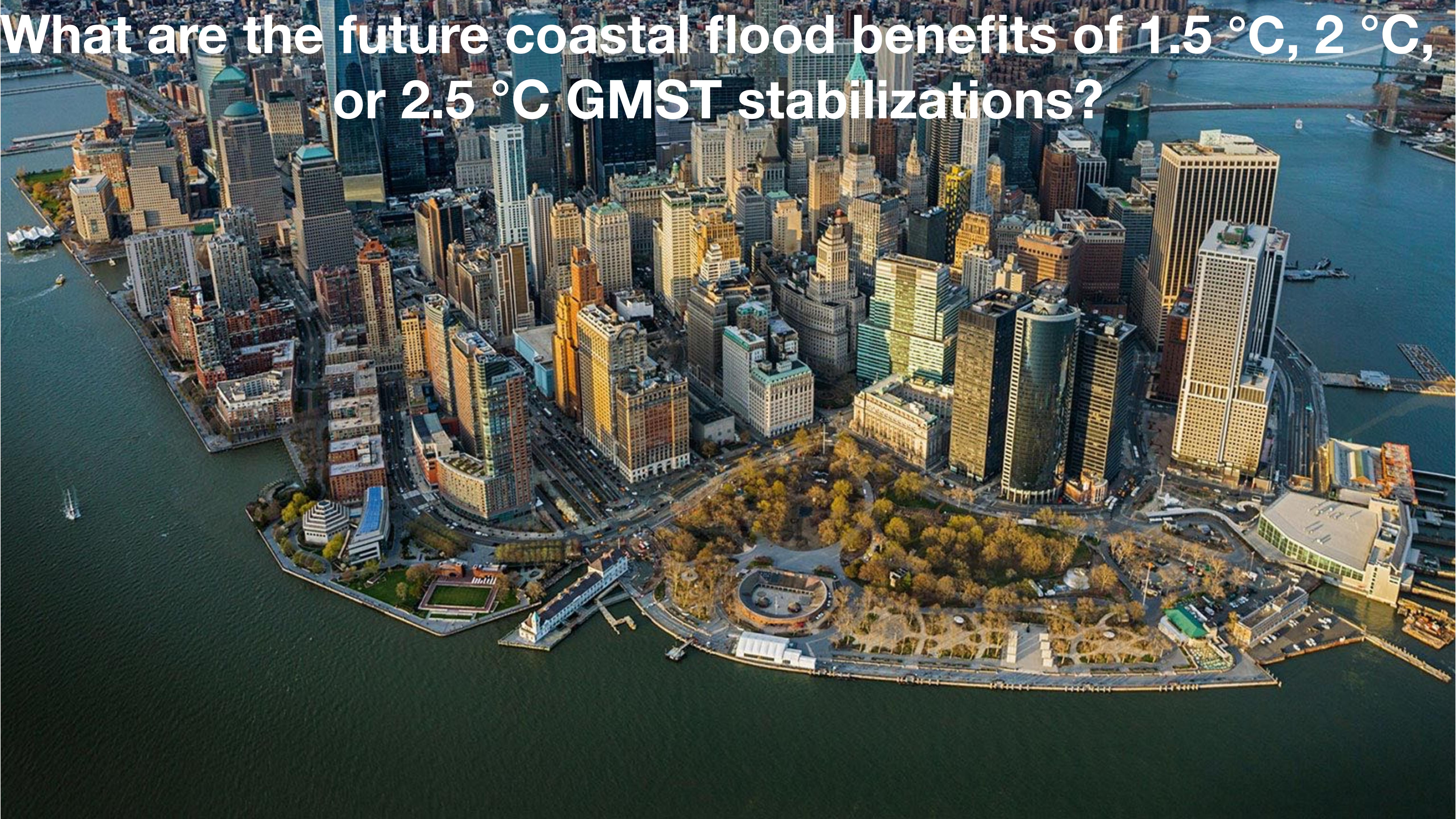


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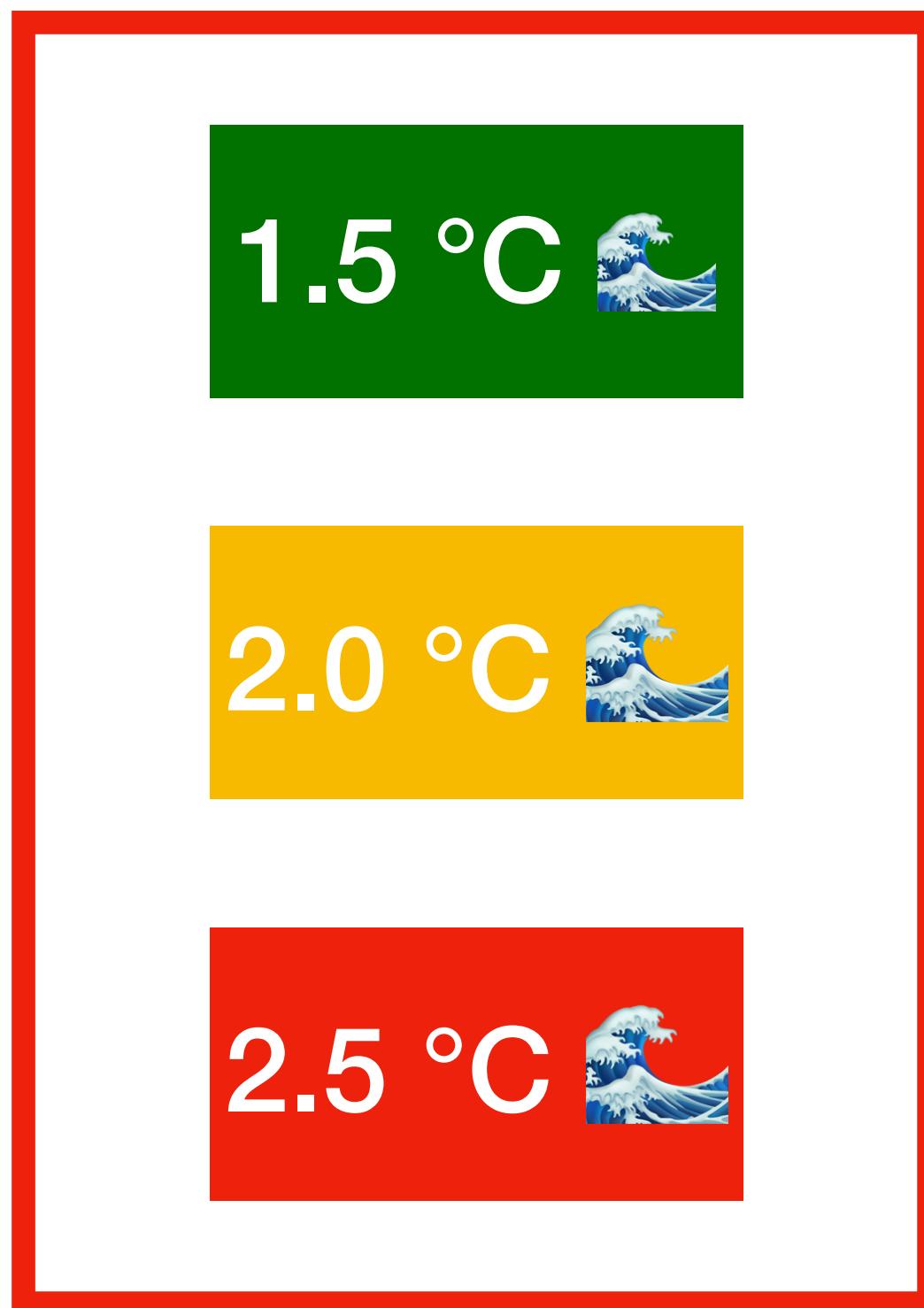
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> 625 million people currently live in low-lying coastal areas  
(Neumann et al., 2015)

# **How we project future coastal flood probabilities:**

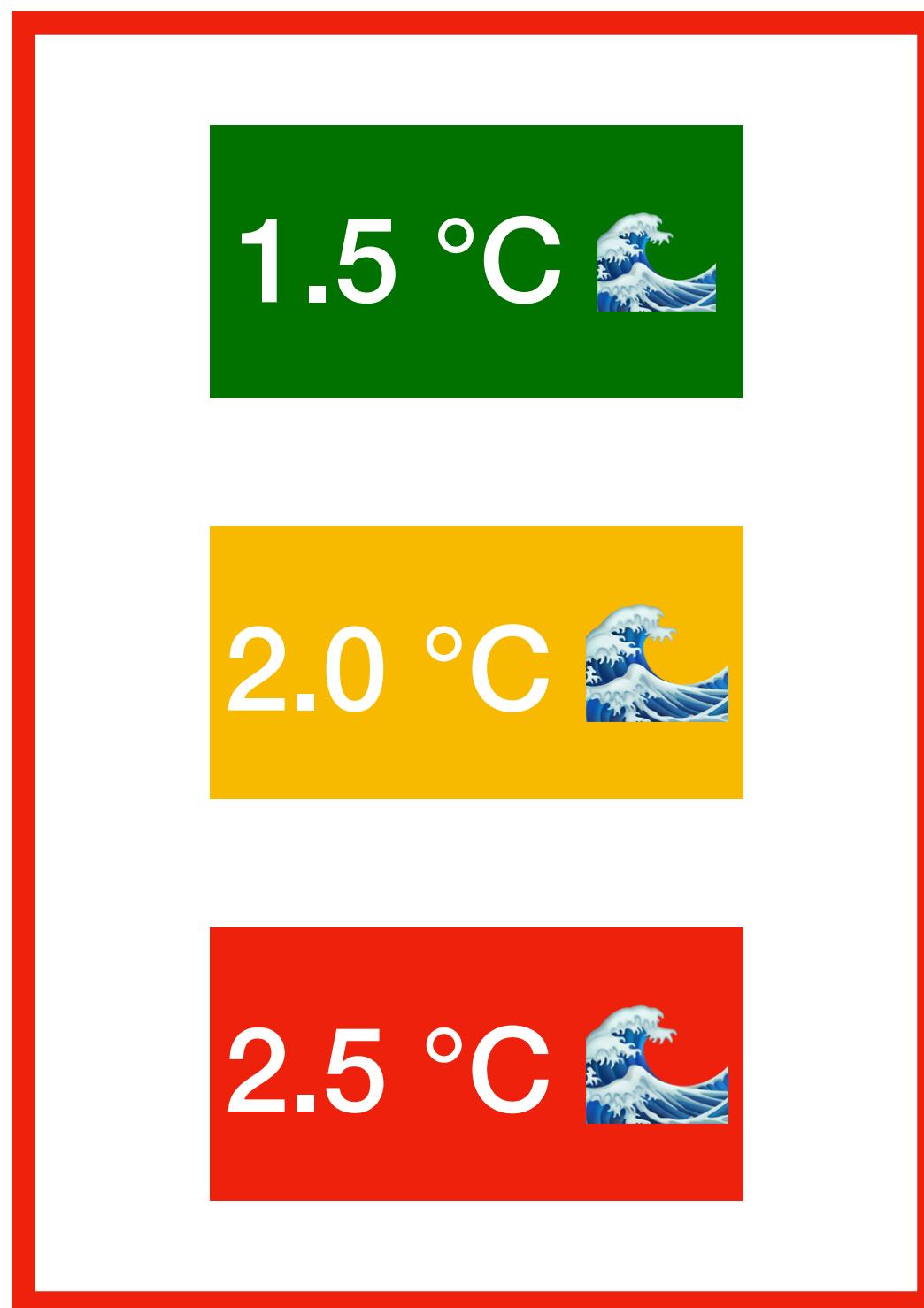
# How we project future coastal flood probabilities:



Global and Local Sea Level Rise (Kopp et al., 2014)

1. Generate local and global probabilistic SLR projections for 1.5 °C, 2.0 °C, and 2.5 °C GMST stabilization using process-model framework of Kopp et al., 2014

# How we project future coastal flood probabilities:

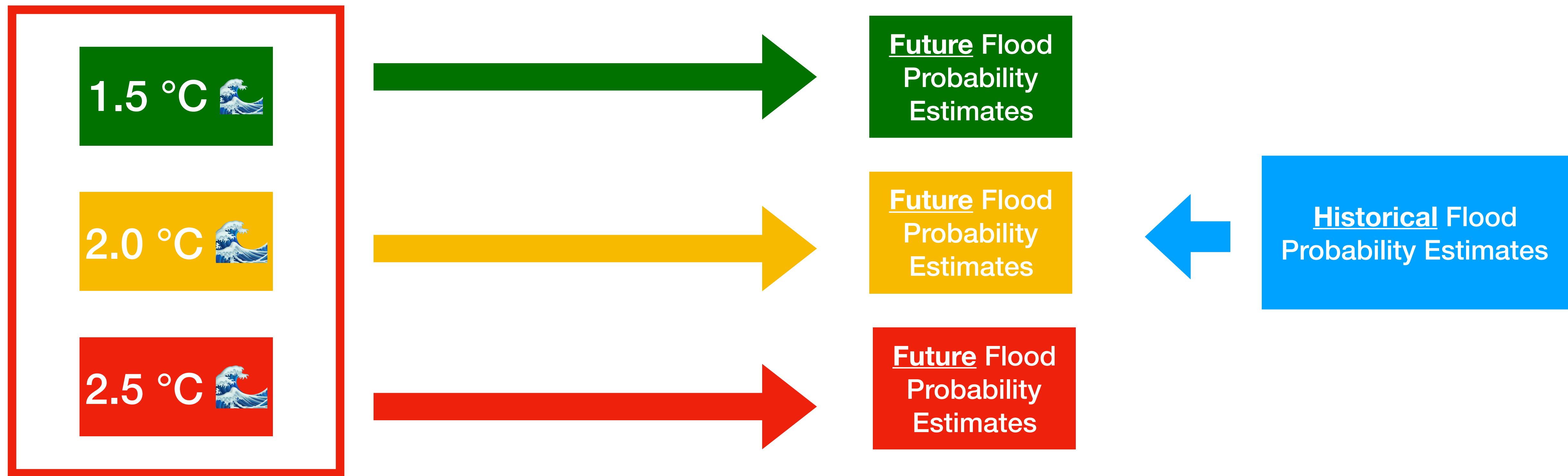


Historical Flood  
Probability Estimates

Global and Local Sea Level Rise (Kopp et al., 2014)

2. Estimate historical flood height probabilities (i.e., flood return periods)

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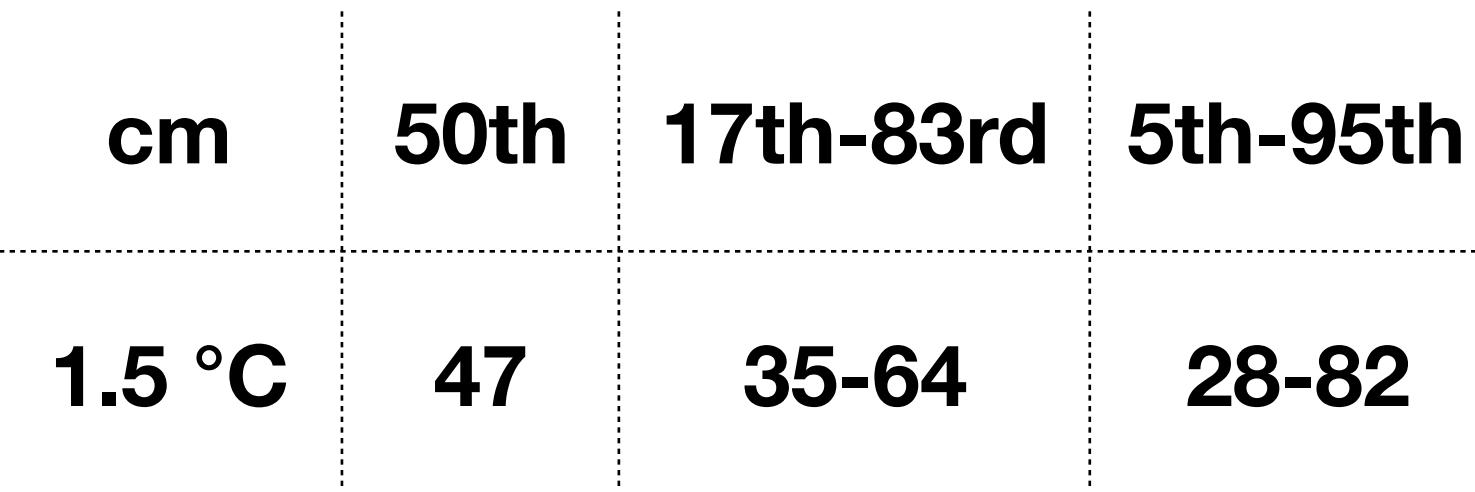
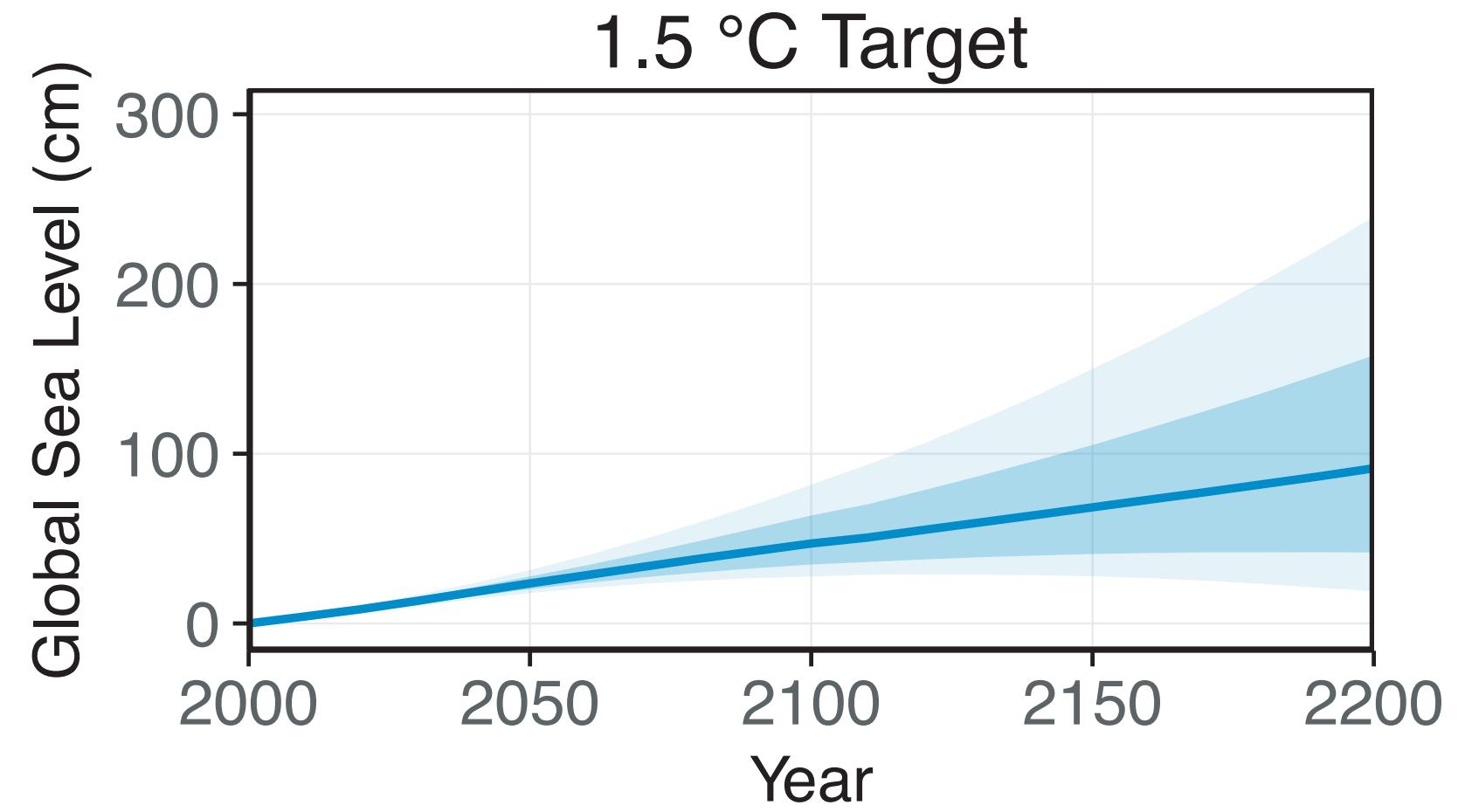


Global and Local Sea Level Rise (Kopp et al., 2014)

3. Combine local SLR projections and historical flood probabilities to estimate probabilities of future coastal flood events

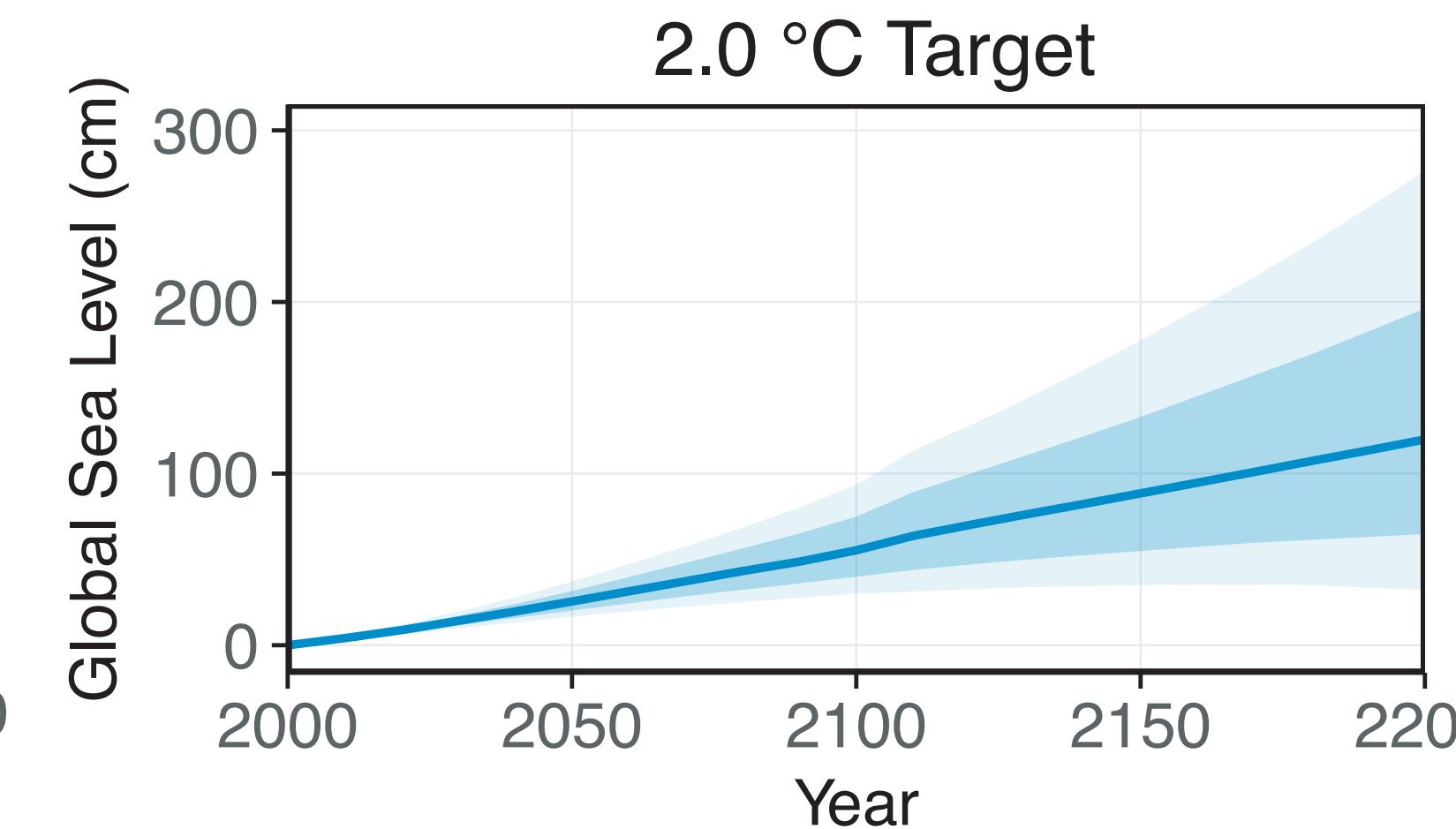
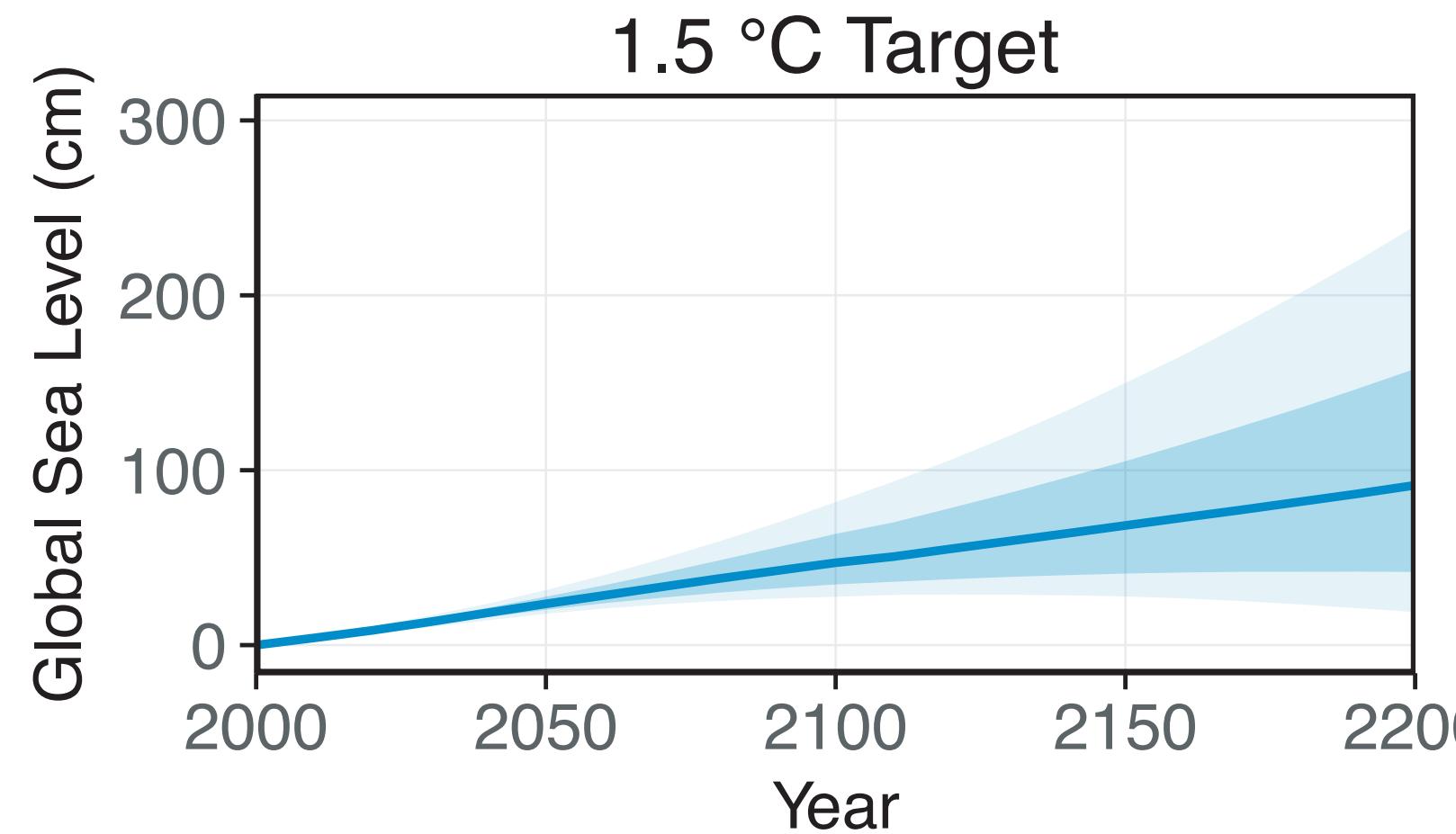
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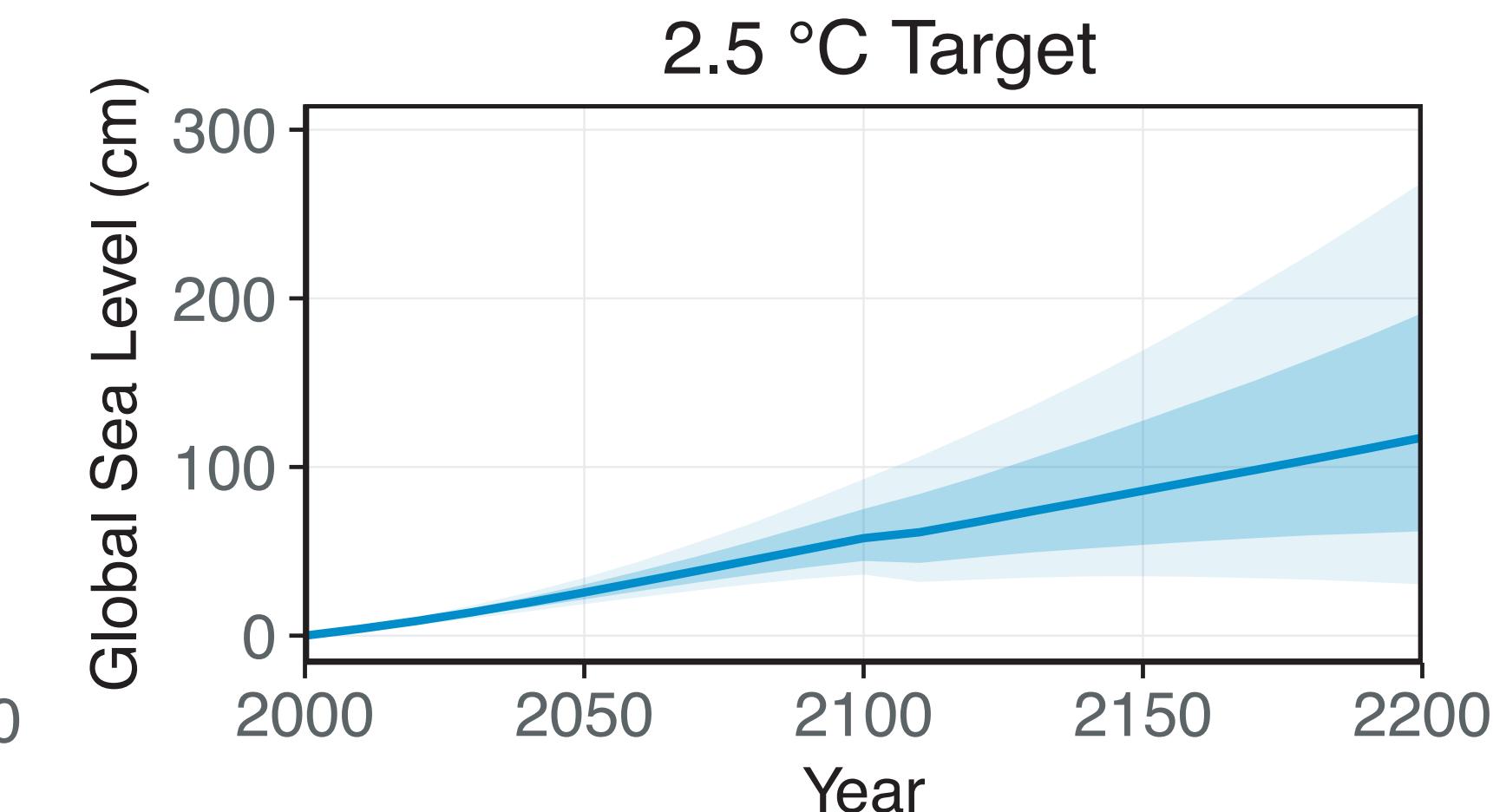
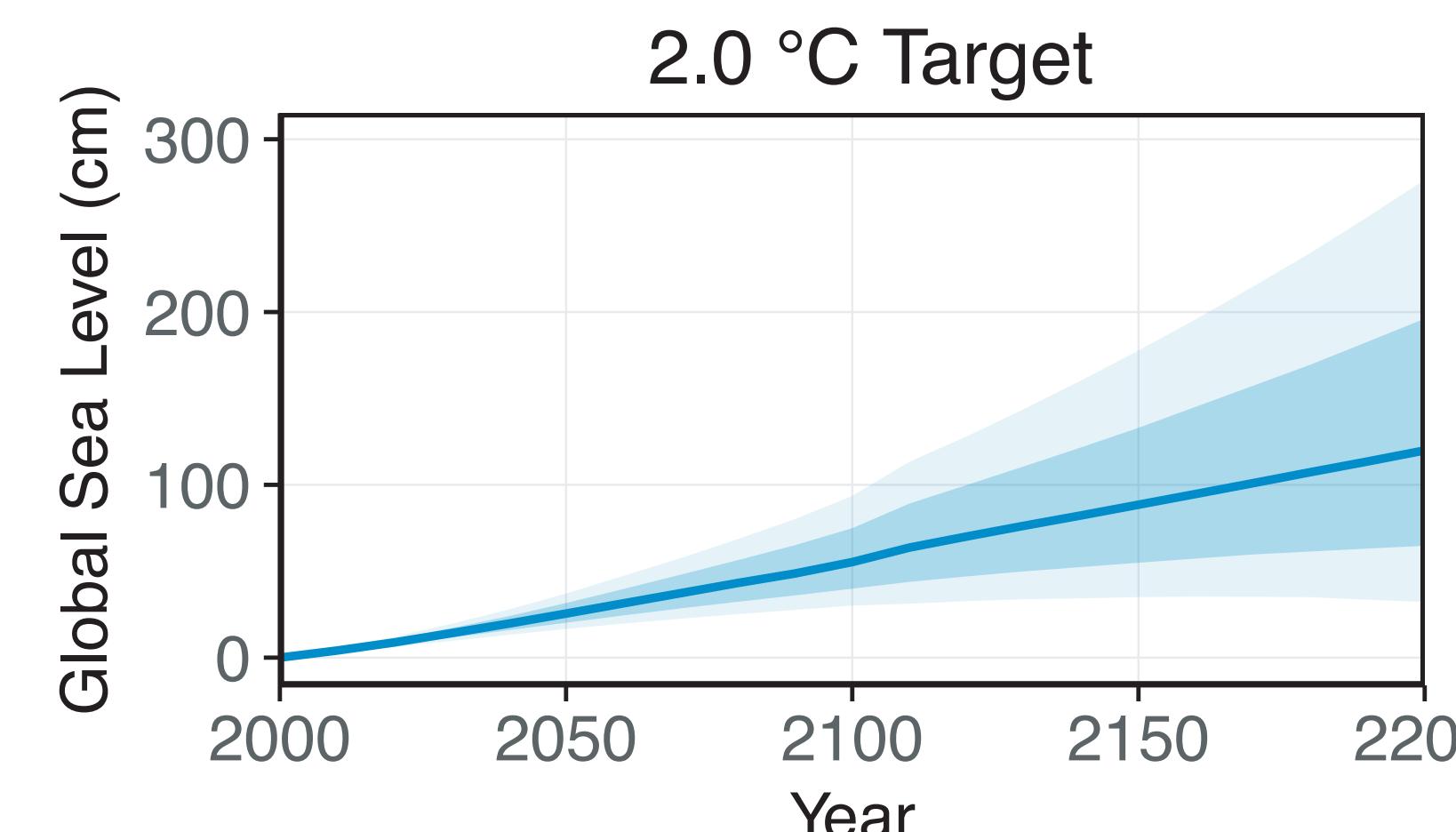
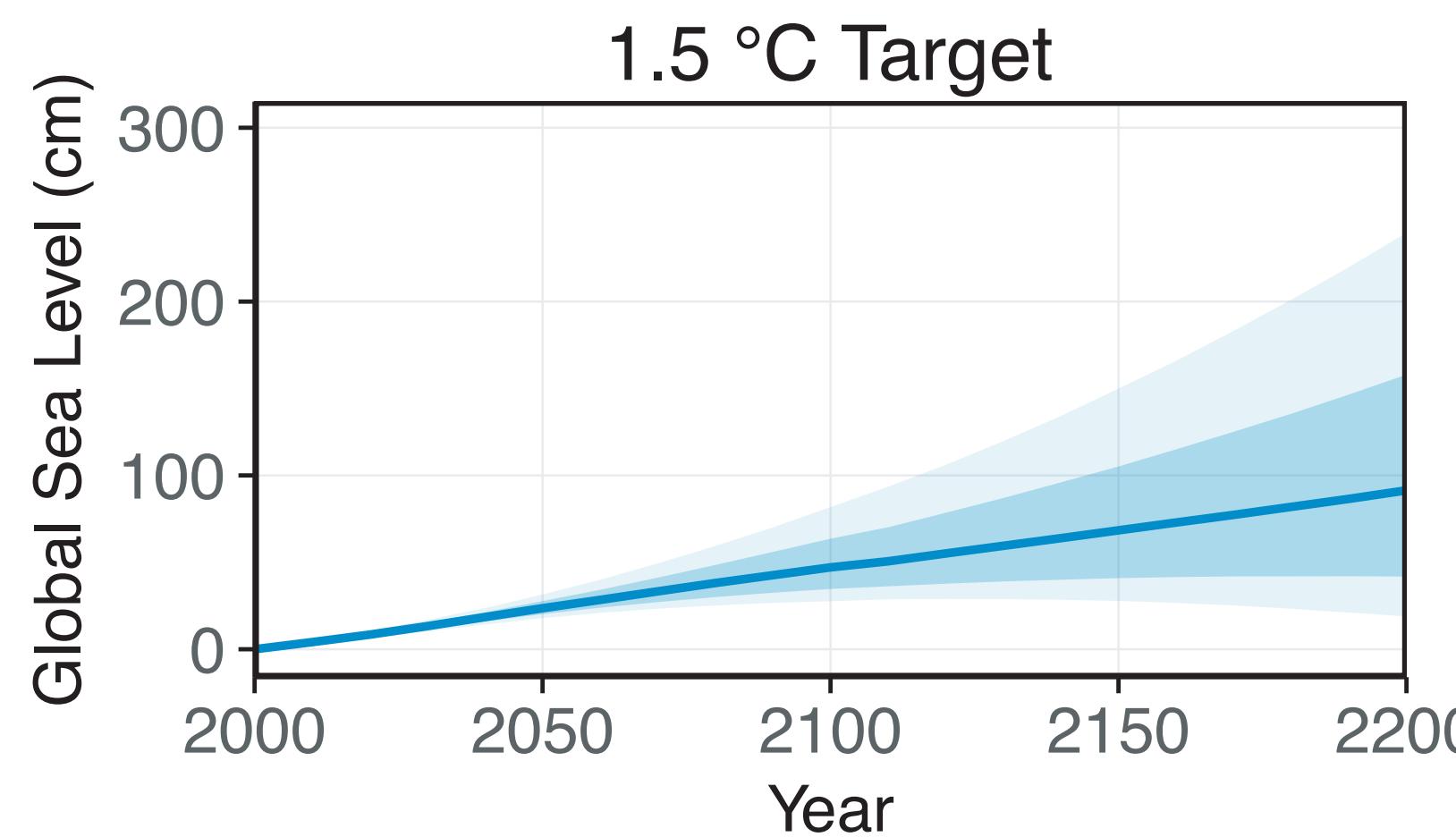


cm	50th	17th-83rd	5th-95th
1.5 °C	47	35-64	28-82

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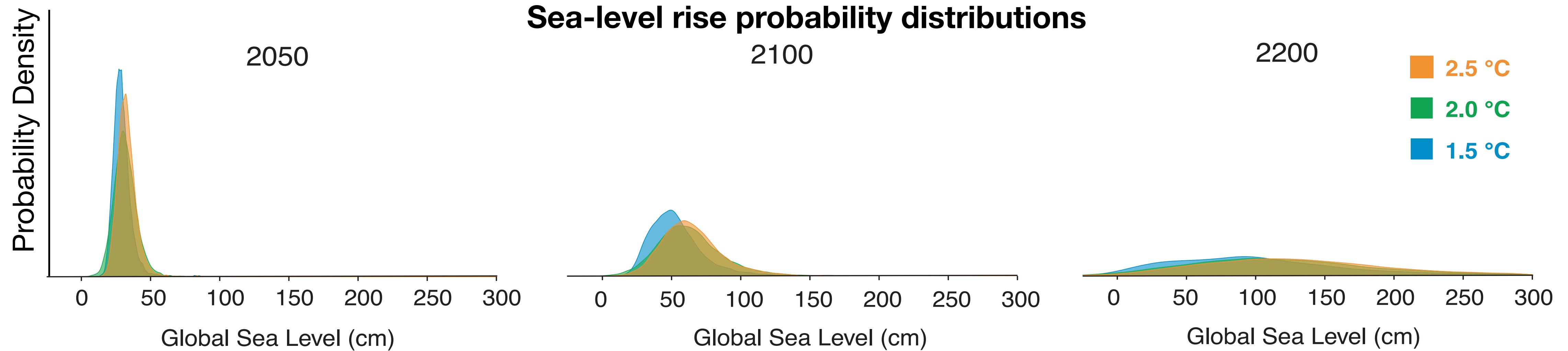


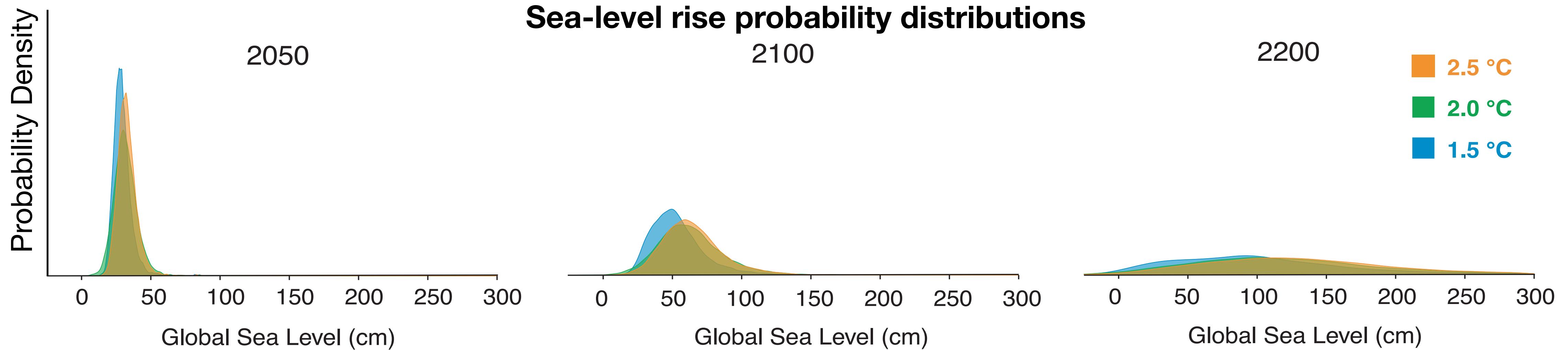
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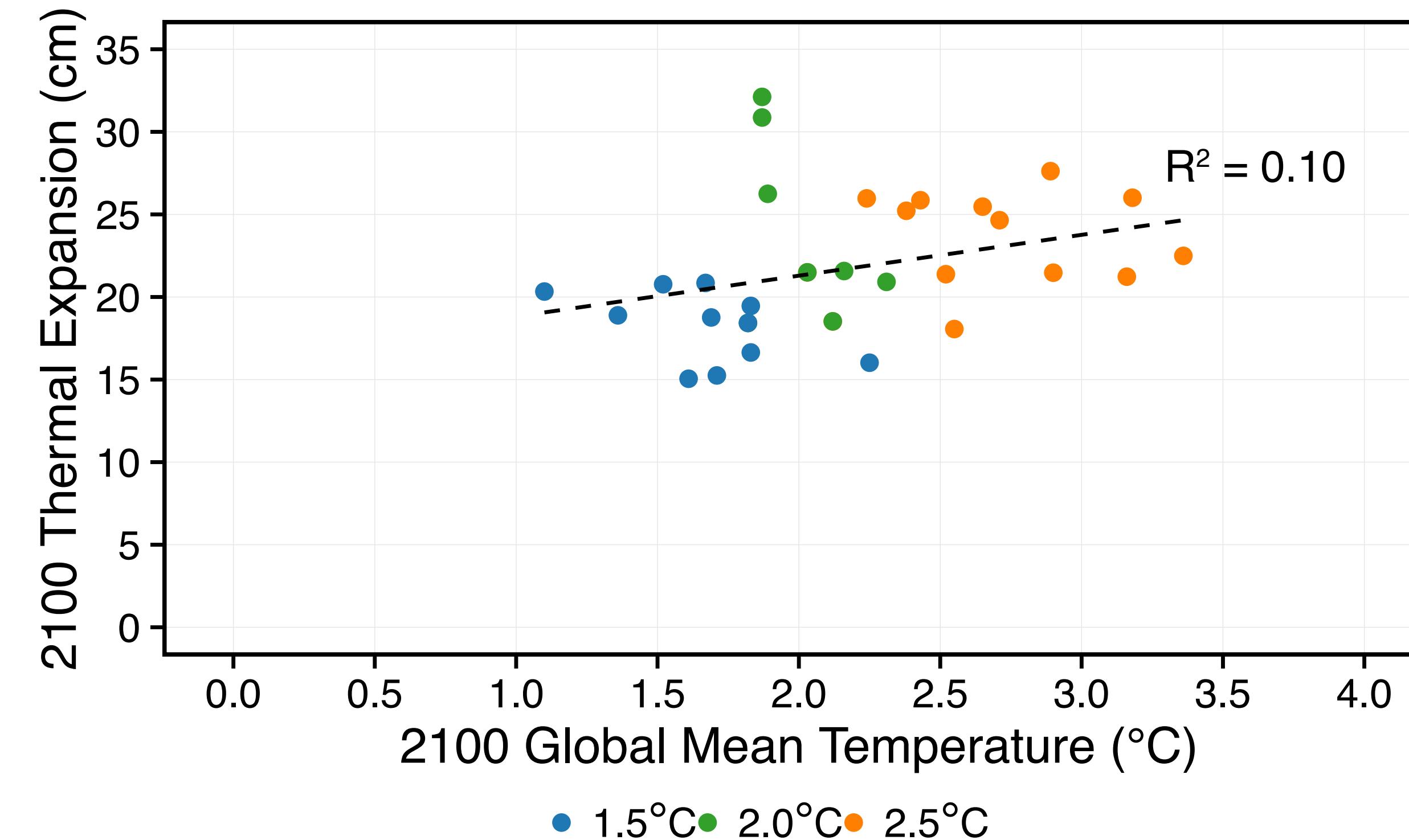
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2.5 °C	58	44-75	36-93

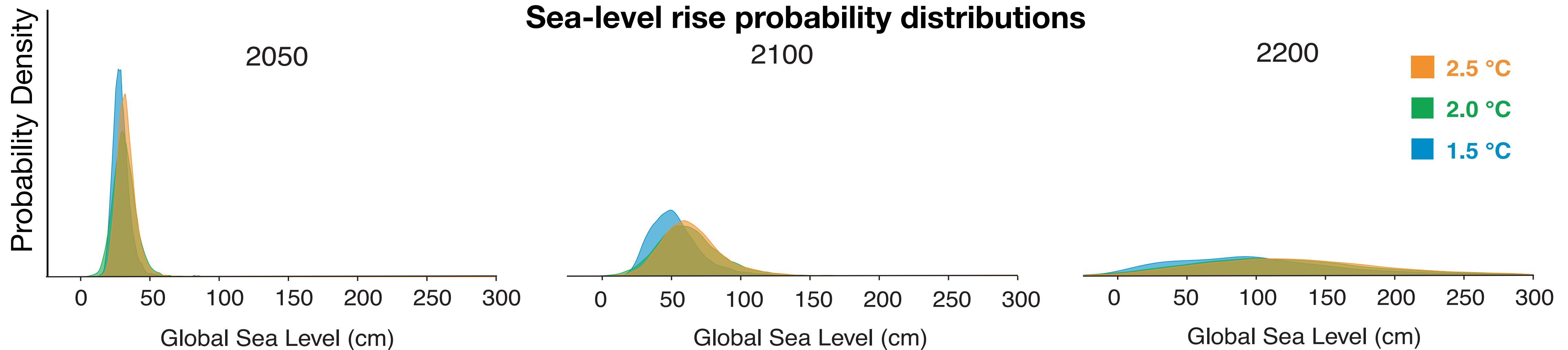
# Sea-level rise probability distributions



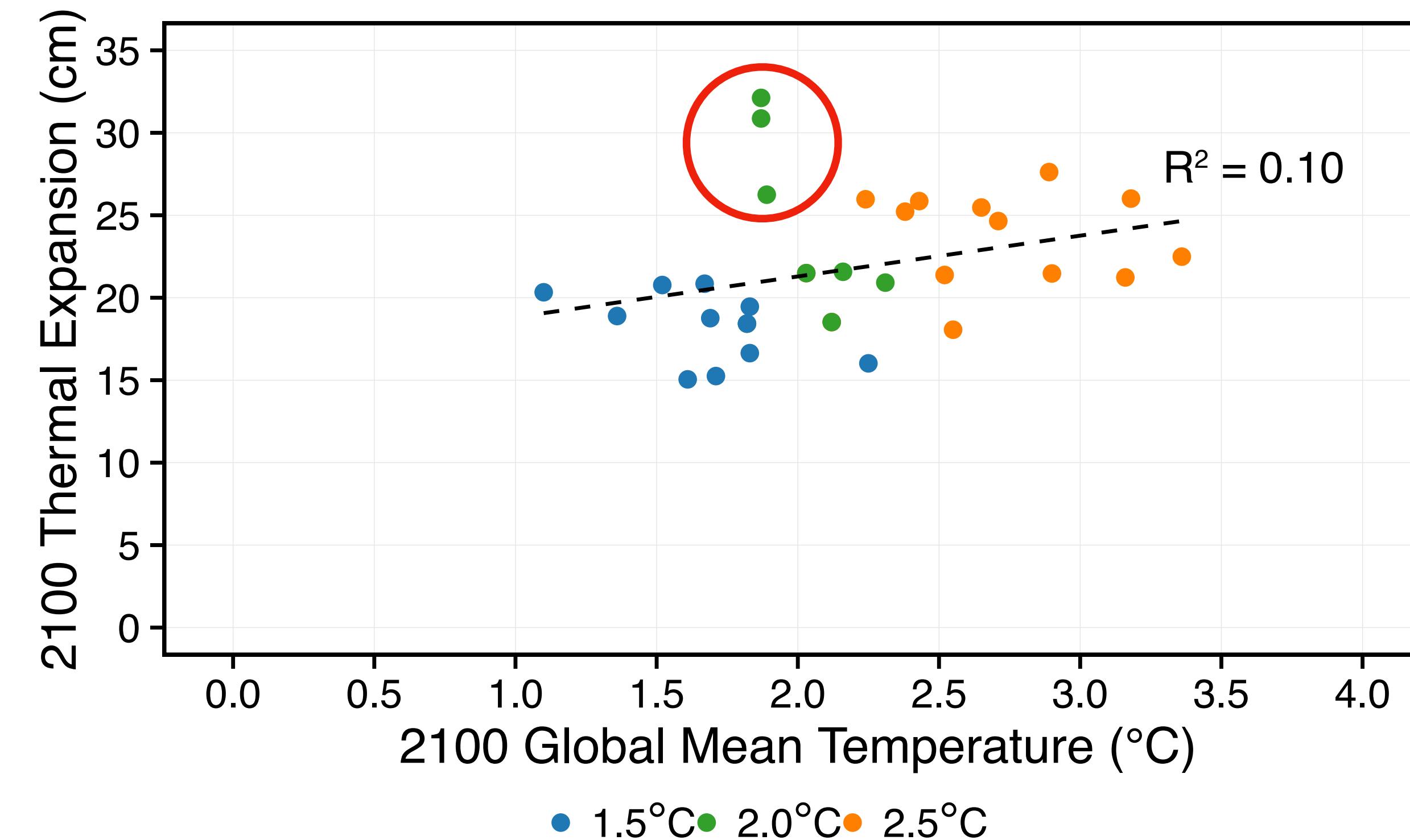


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**Approach:**

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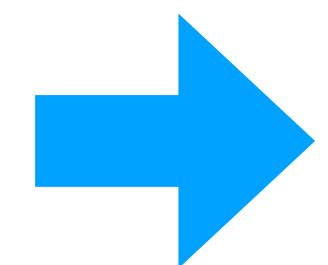
Gridded,  
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How high will  
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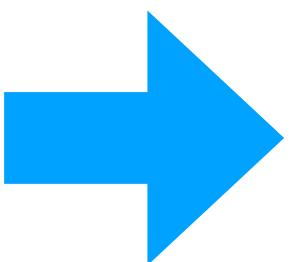
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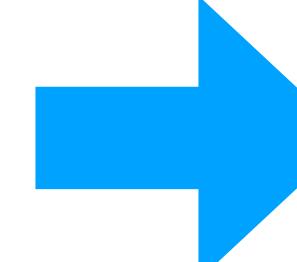
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What land is  
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National population  
and boundary data  
(Bright et al., 2011)

Who lives there?

# Who currently resides in areas at risk of being permanently inundated by future SLR?

Under 2.0 °C scenario:

- ~60 million people currently reside in lands projected to be submerged by 2150 (~1% of current global population)
- ~500,000 current residents of Small Island Developing States
- ~20% of the current population of the Marshall Islands

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Under 2.0 °C scenario:

**Assumes  
people don't  
move around...**

- ~60 million people *currently* reside in lands projected to be submerged by 2150 (~1% of current global population)
- ~500,000 *current* residents of Small Island Developing States
- ~7% of the *current* population of Kiribati

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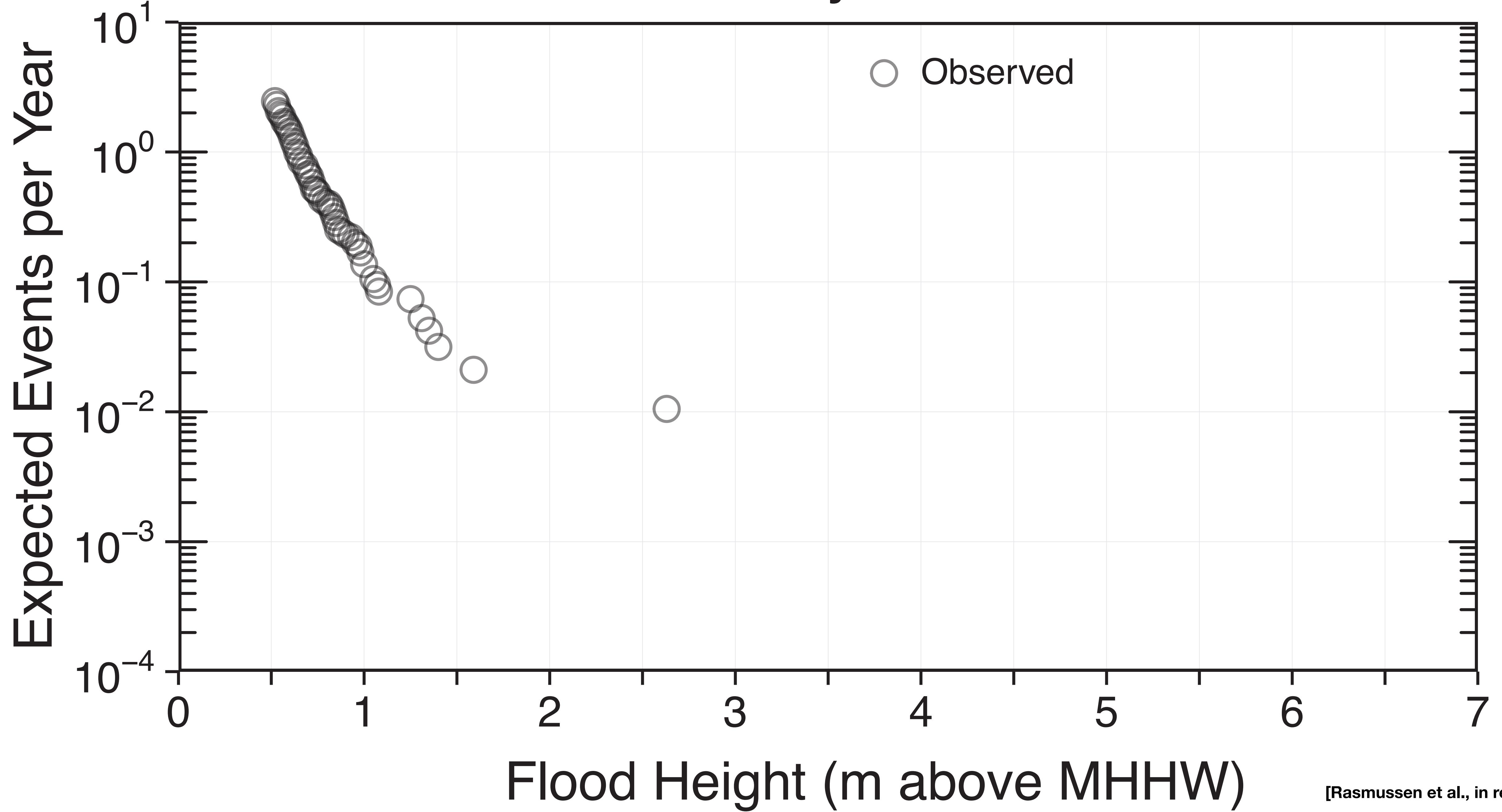
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- Estimate annual expected number of floods using method from Buchanan et al. (2016; 2017):
  - General Pareto Distribution (GPD)
  - GPD exceedances assumed to be a Poisson process
  - Sample GPD parameter uncertainty and the SLR uncertainty

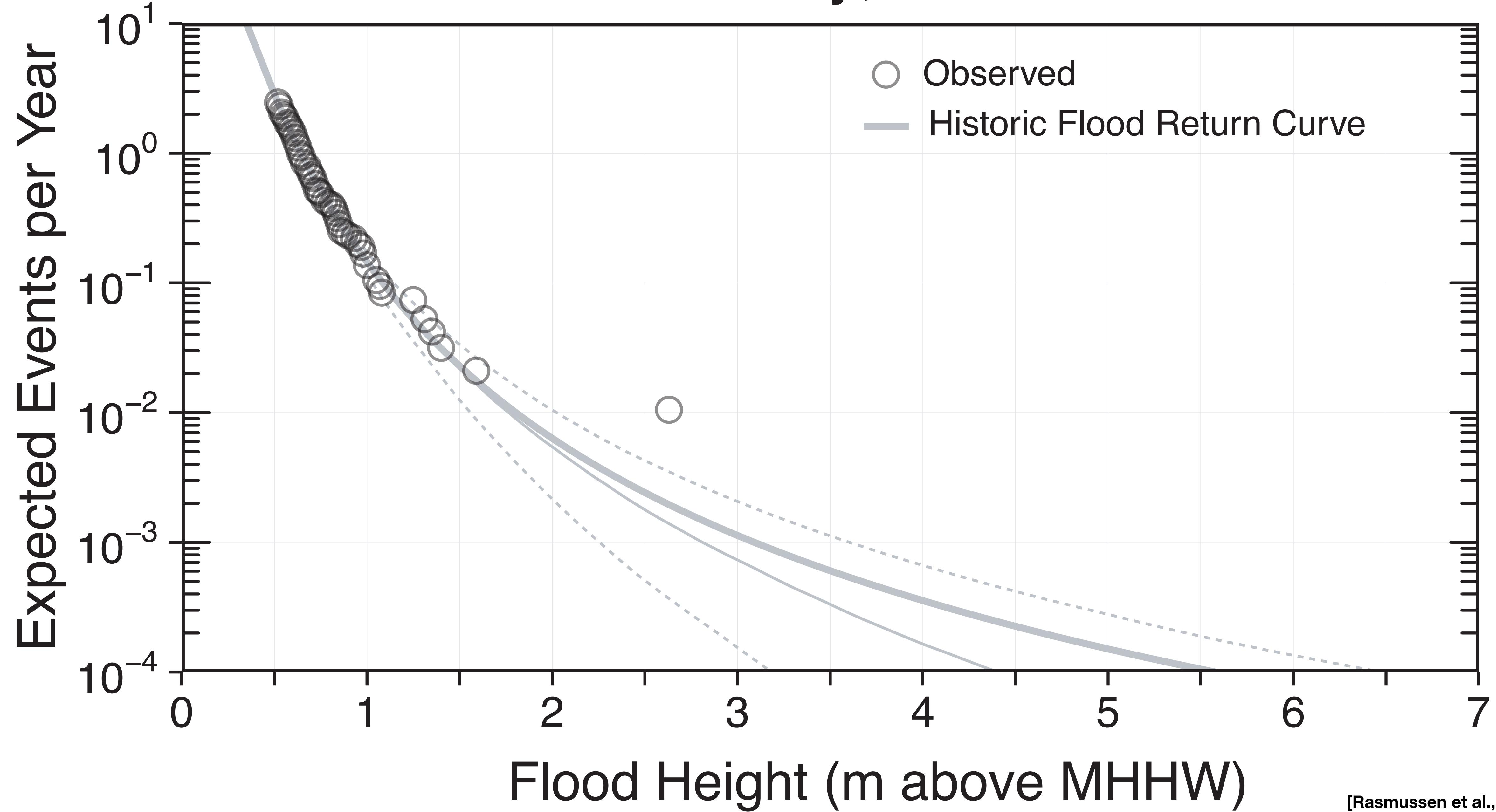
# **New York City Flood Events**

Case Study: New York City

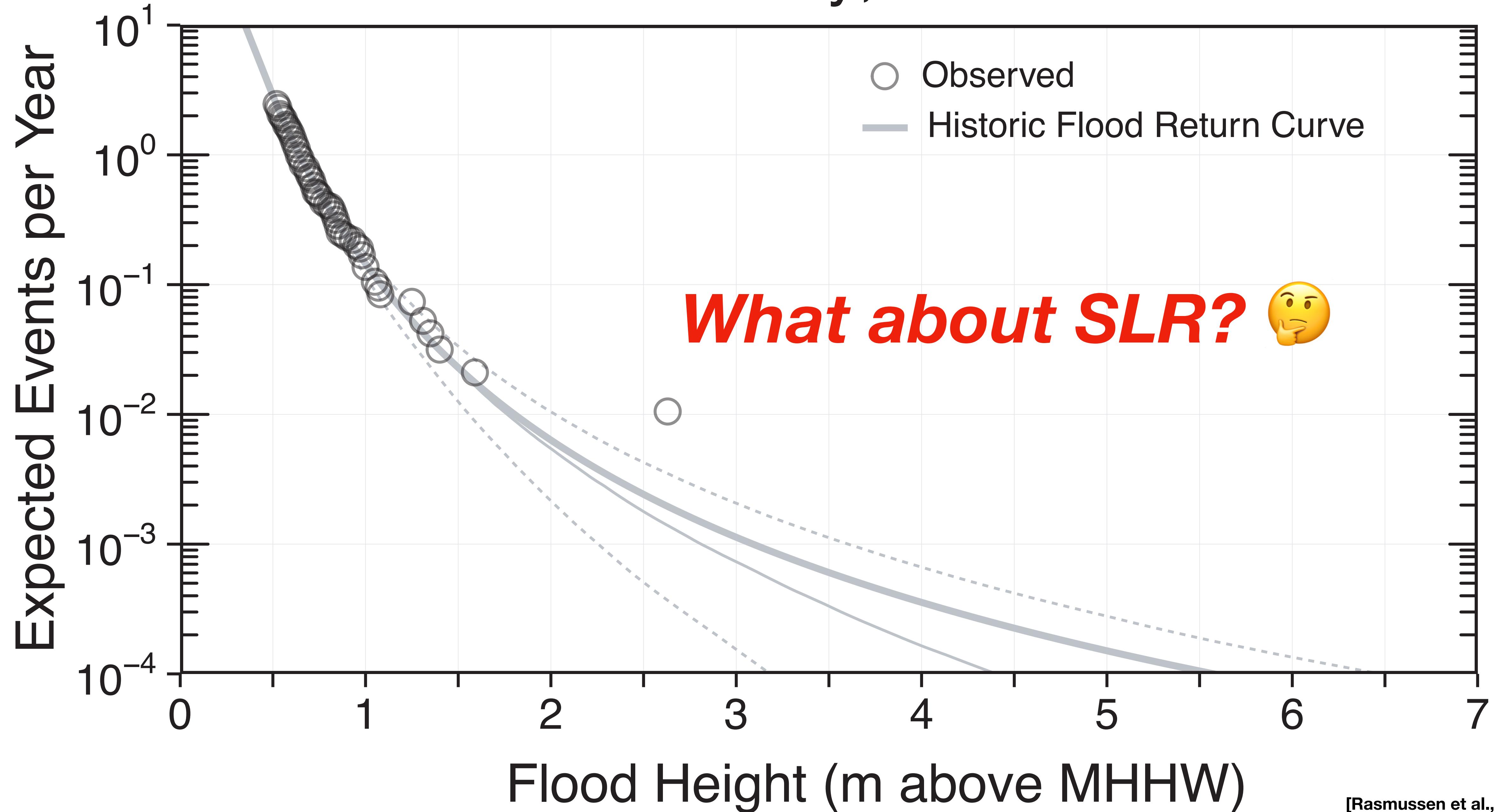
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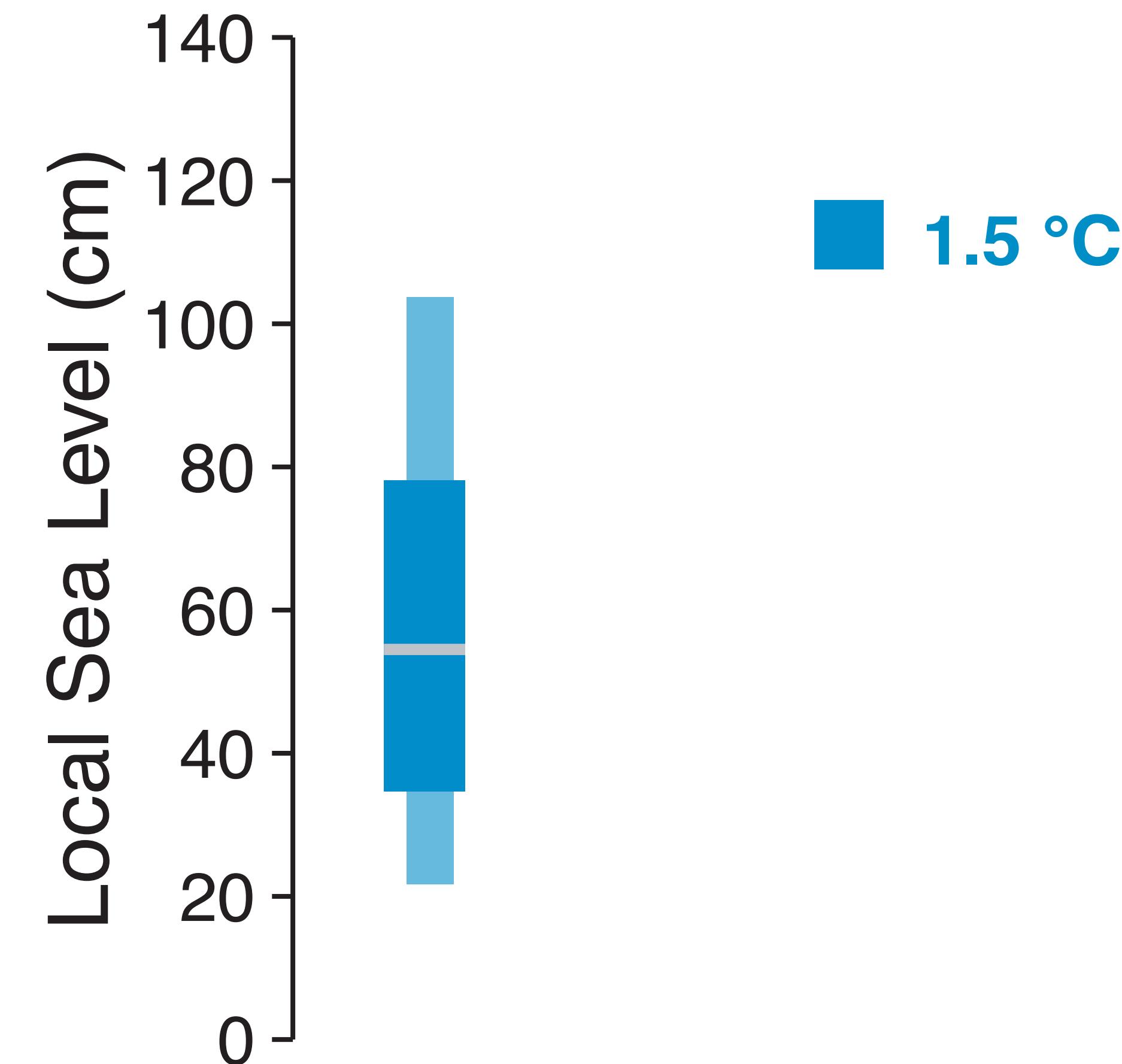
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# What about Local SLR?

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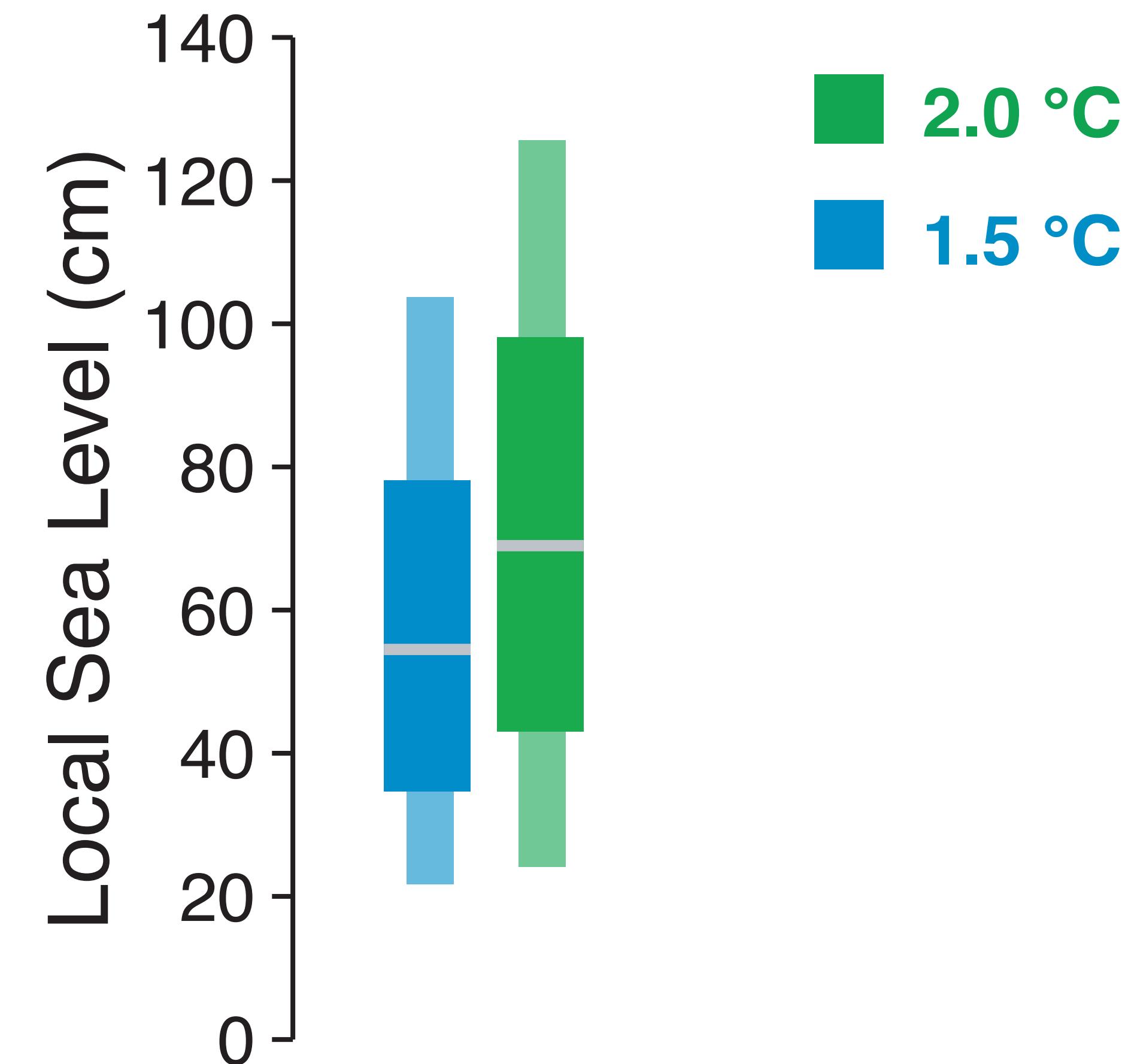
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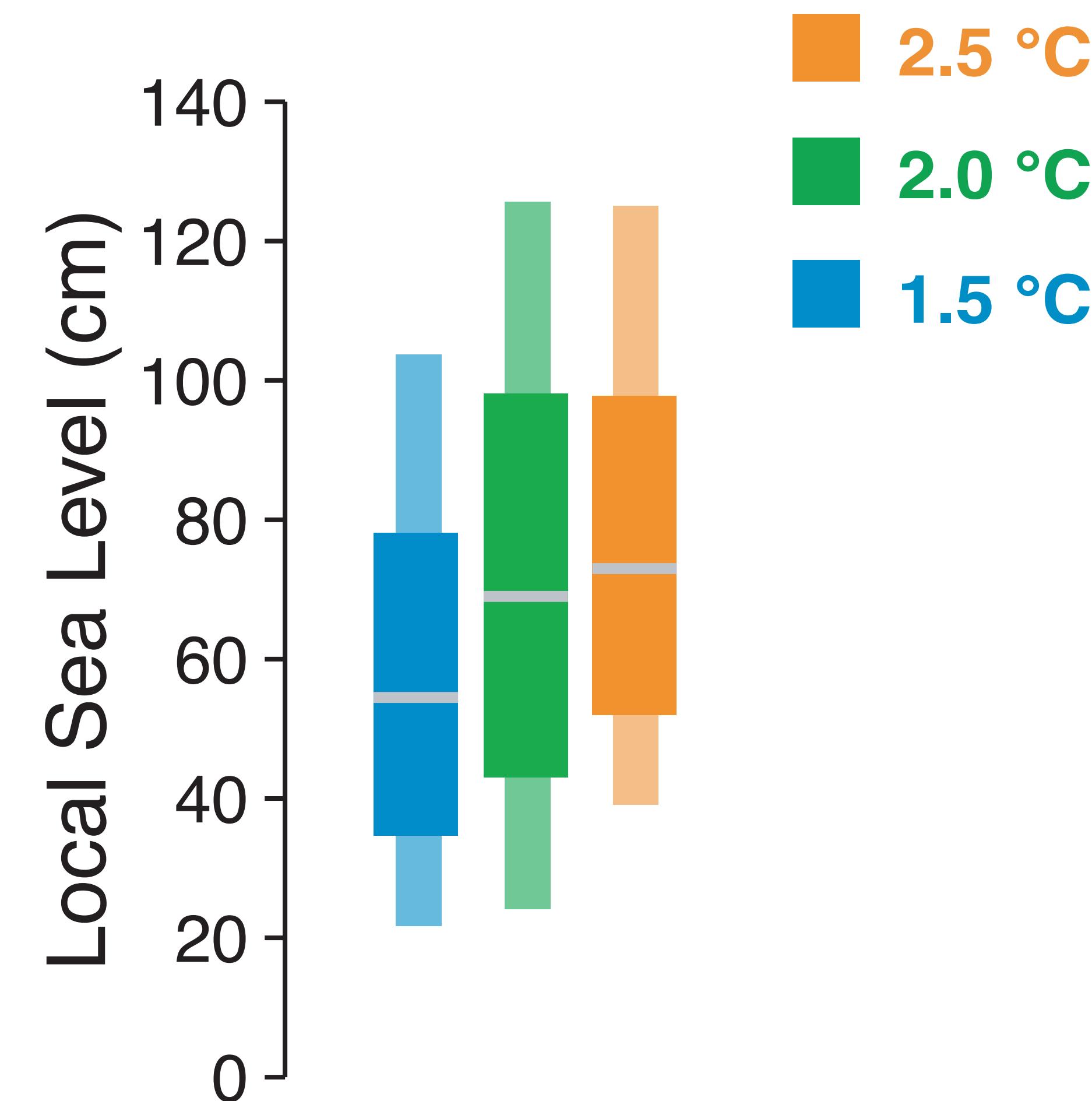
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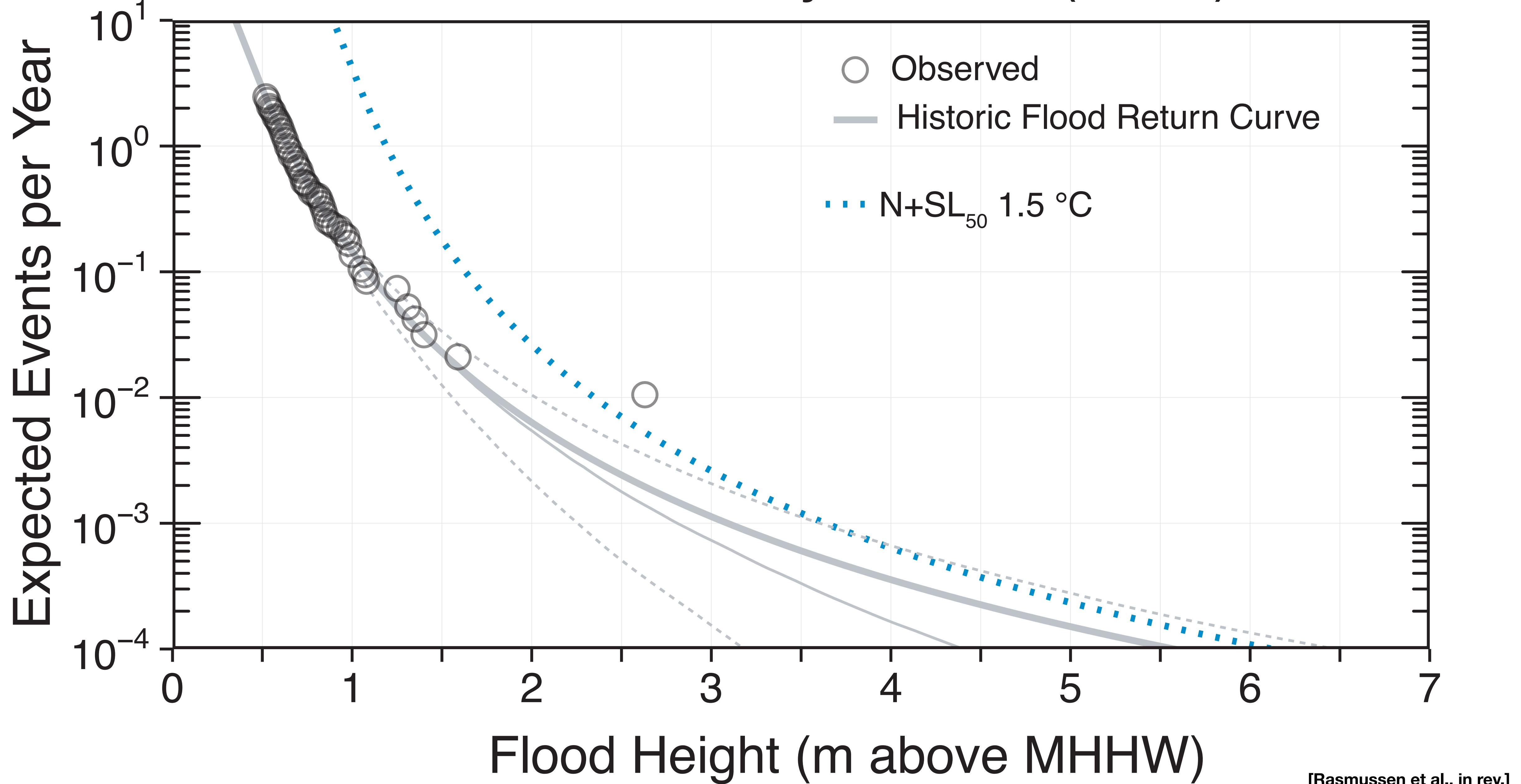
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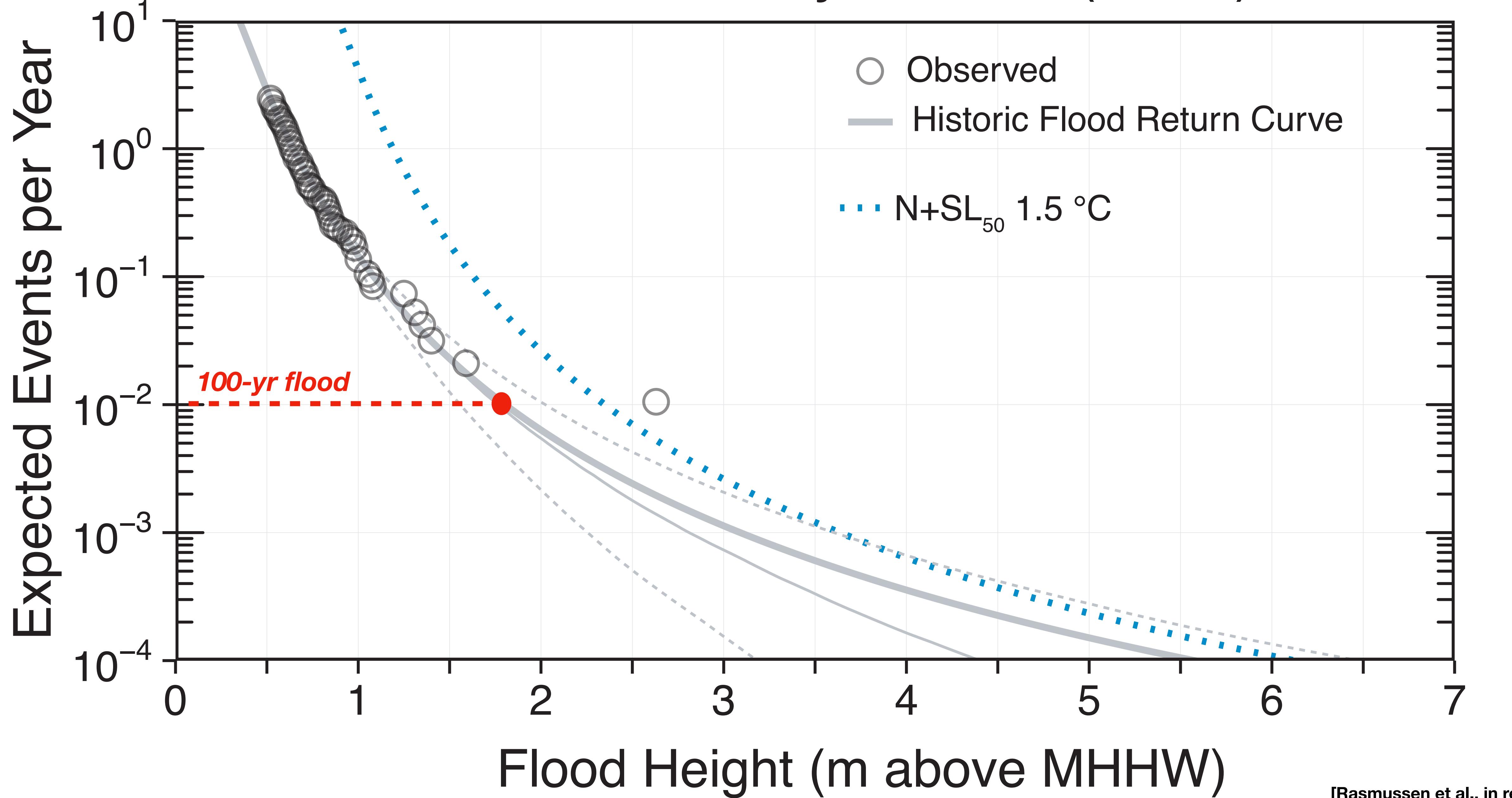
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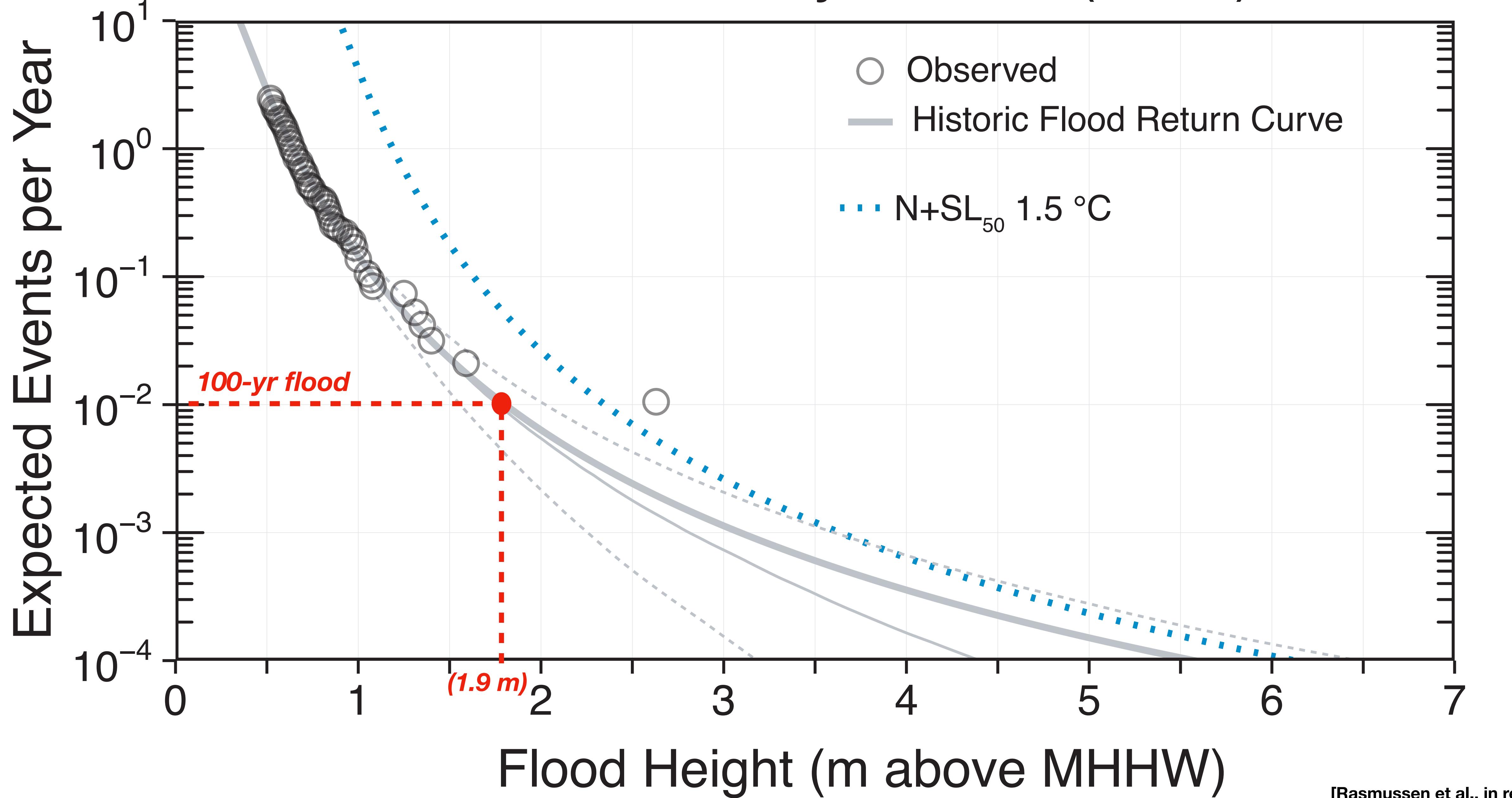
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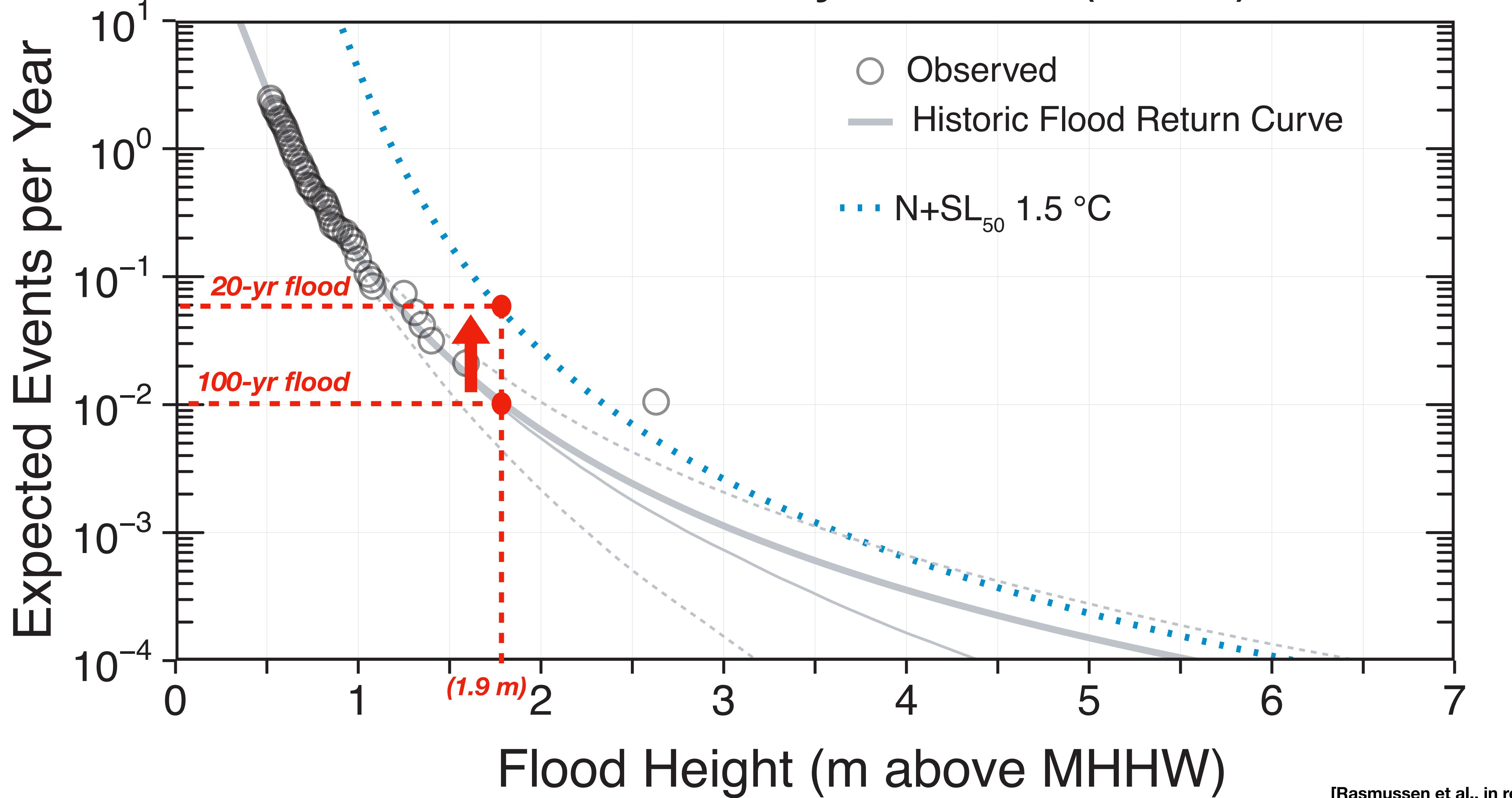
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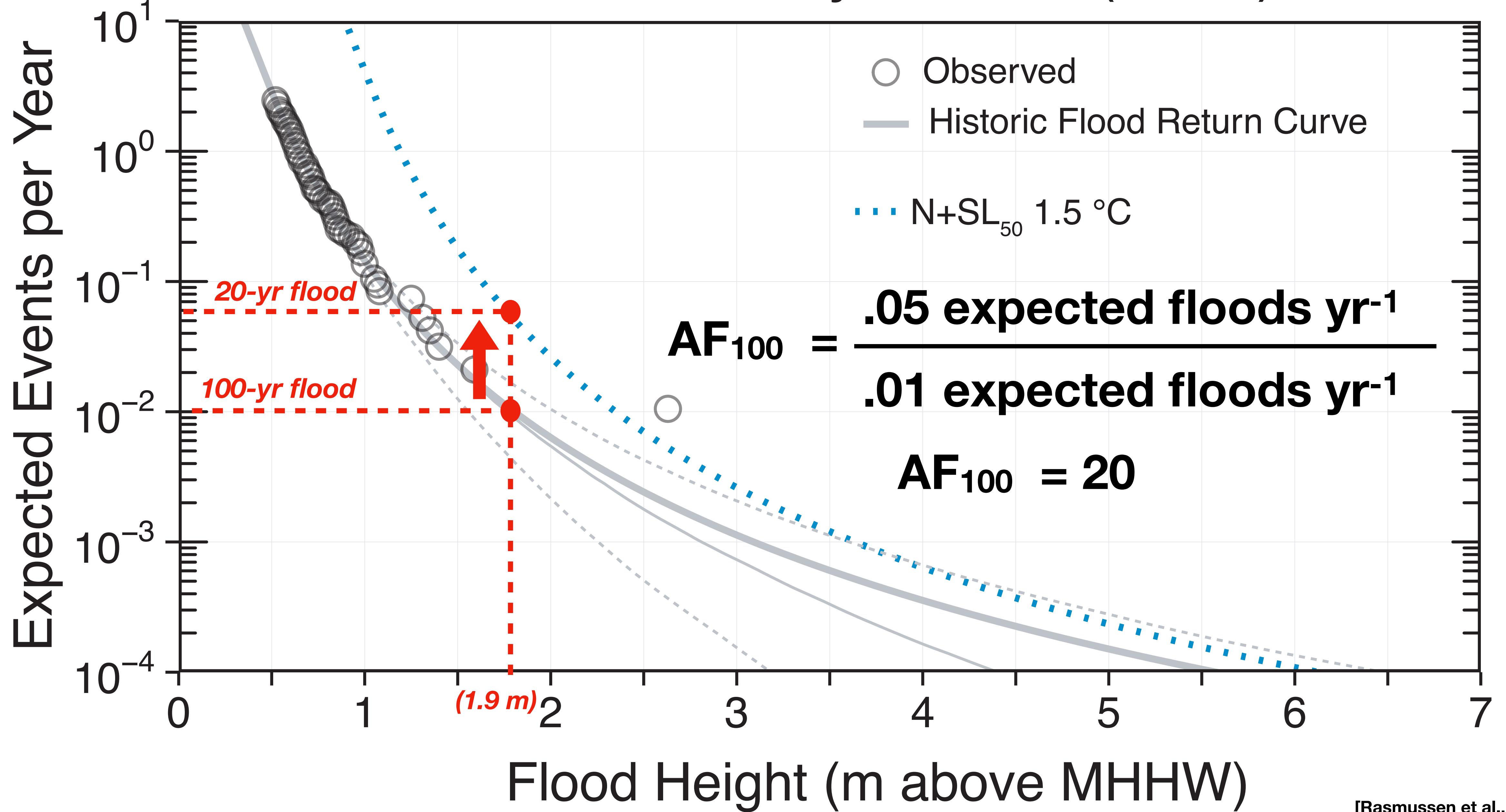


# Flood Frequency Amplification Factors (AF)

[i.e., Buchanan et al., 2017]

$$AF = \frac{\text{Future Annual Expected Number of Floods}}{\text{Current Annual Expected Number of Floods}}$$

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



# Where are greatest benefits from 1.5 °C vs. 2.0 °C? (2100)

$$\text{AF ratio} = \frac{\text{AF}_{100\text{-yr}, \text{2.0 }^\circ\text{C}}}{\text{AF}_{100\text{-yr}, \text{1.5 }^\circ\text{C}}}$$

Larger AF ratios imply greater benefits from 1.5 °C over 2.0 °C

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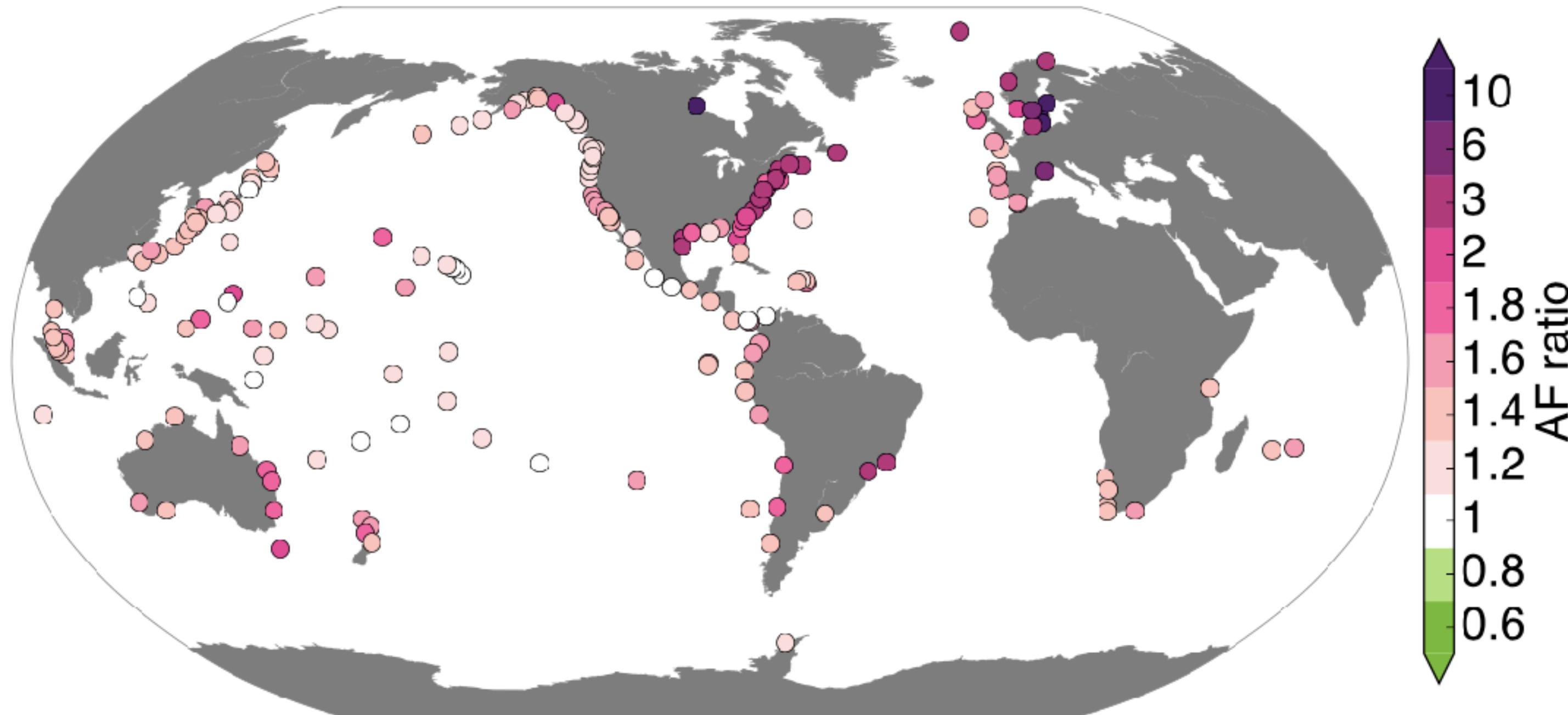
Local flood benefits from 1.5 °C over 2.0 °C target (100-yr flood)

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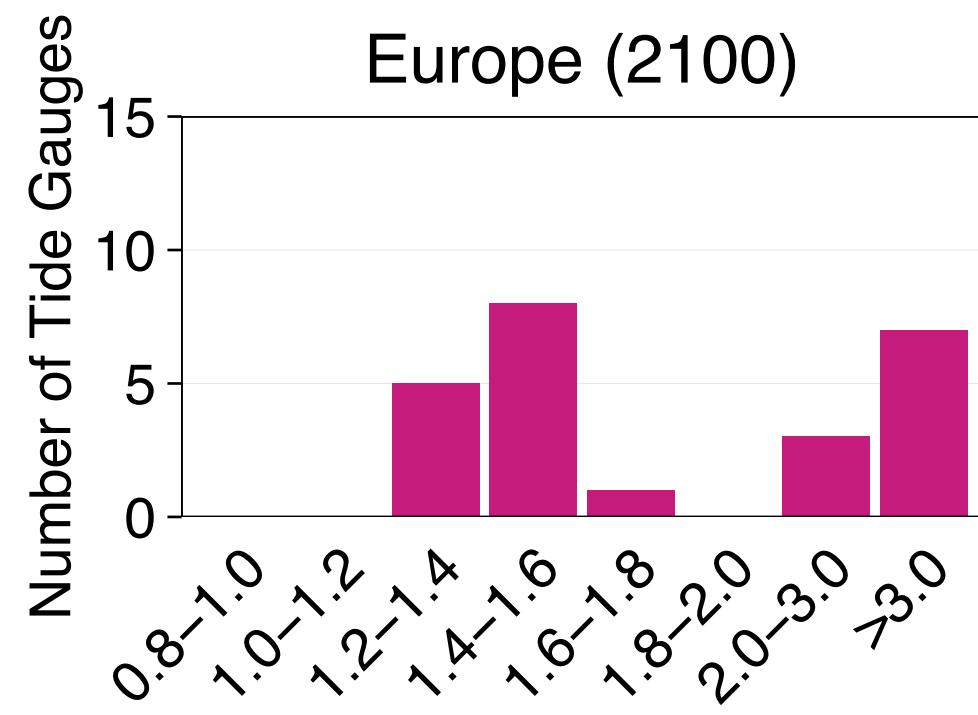
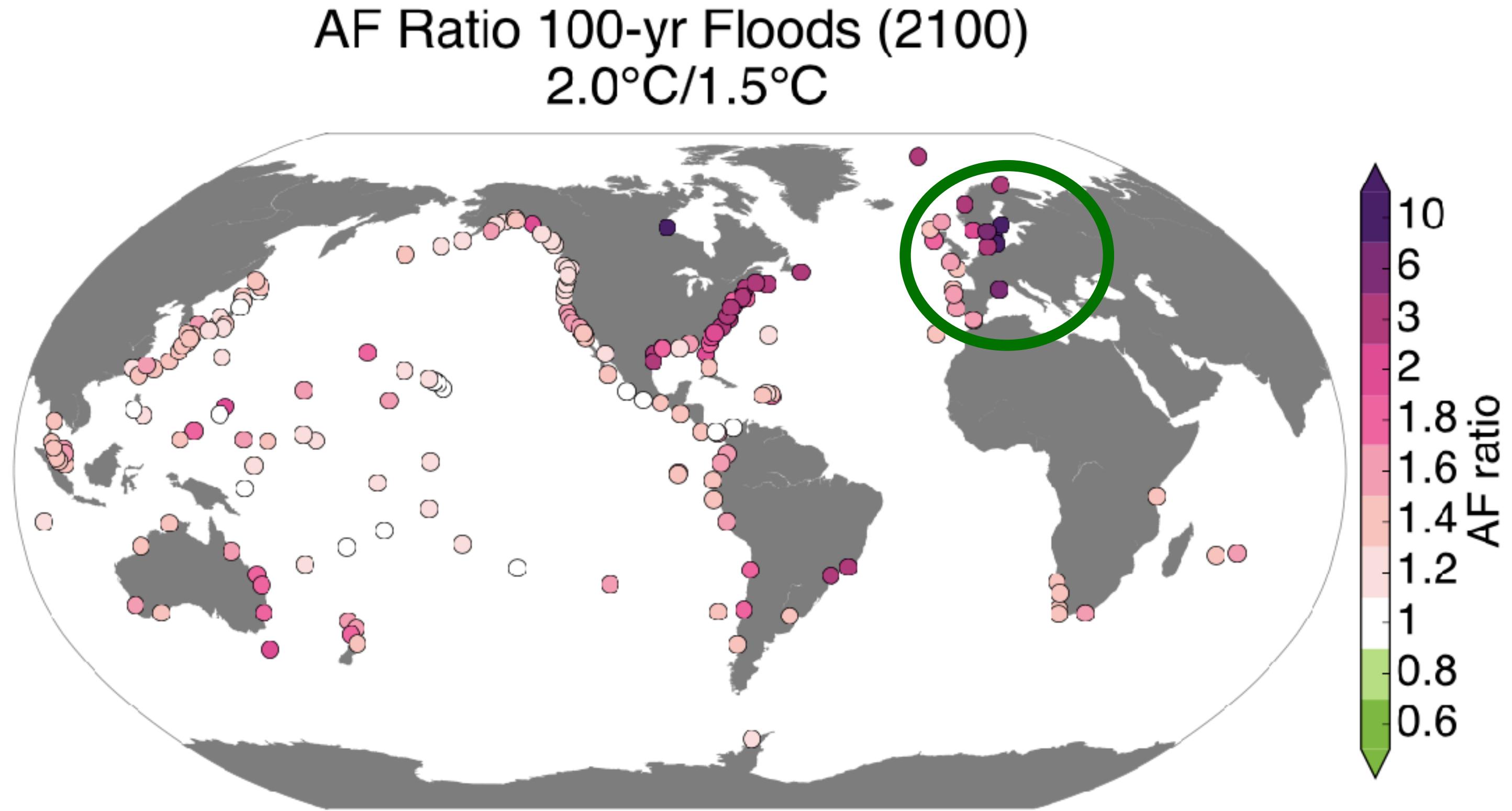
AF Ratio 100-yr Floods (2100)  
2.0°C/1.5°C



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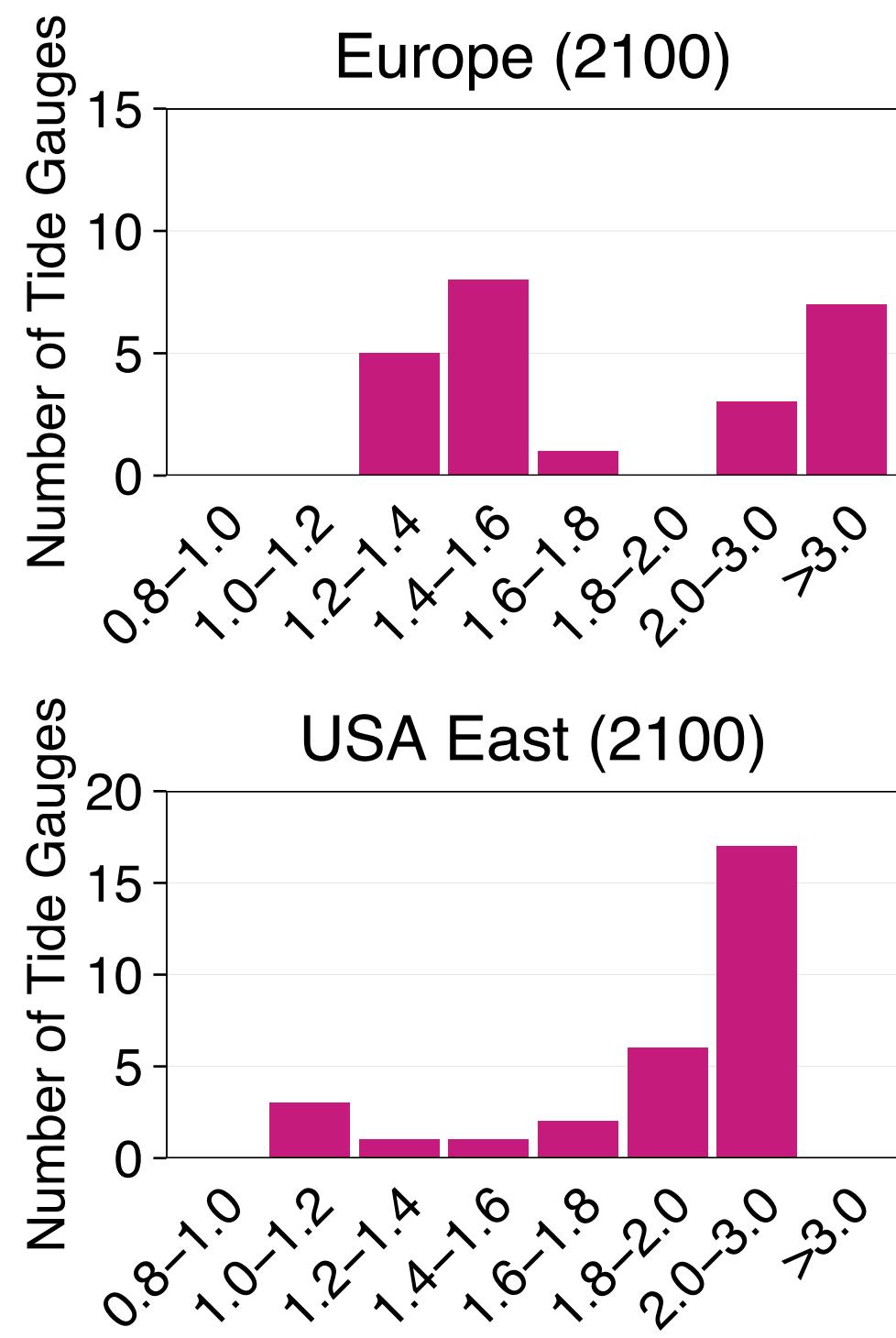
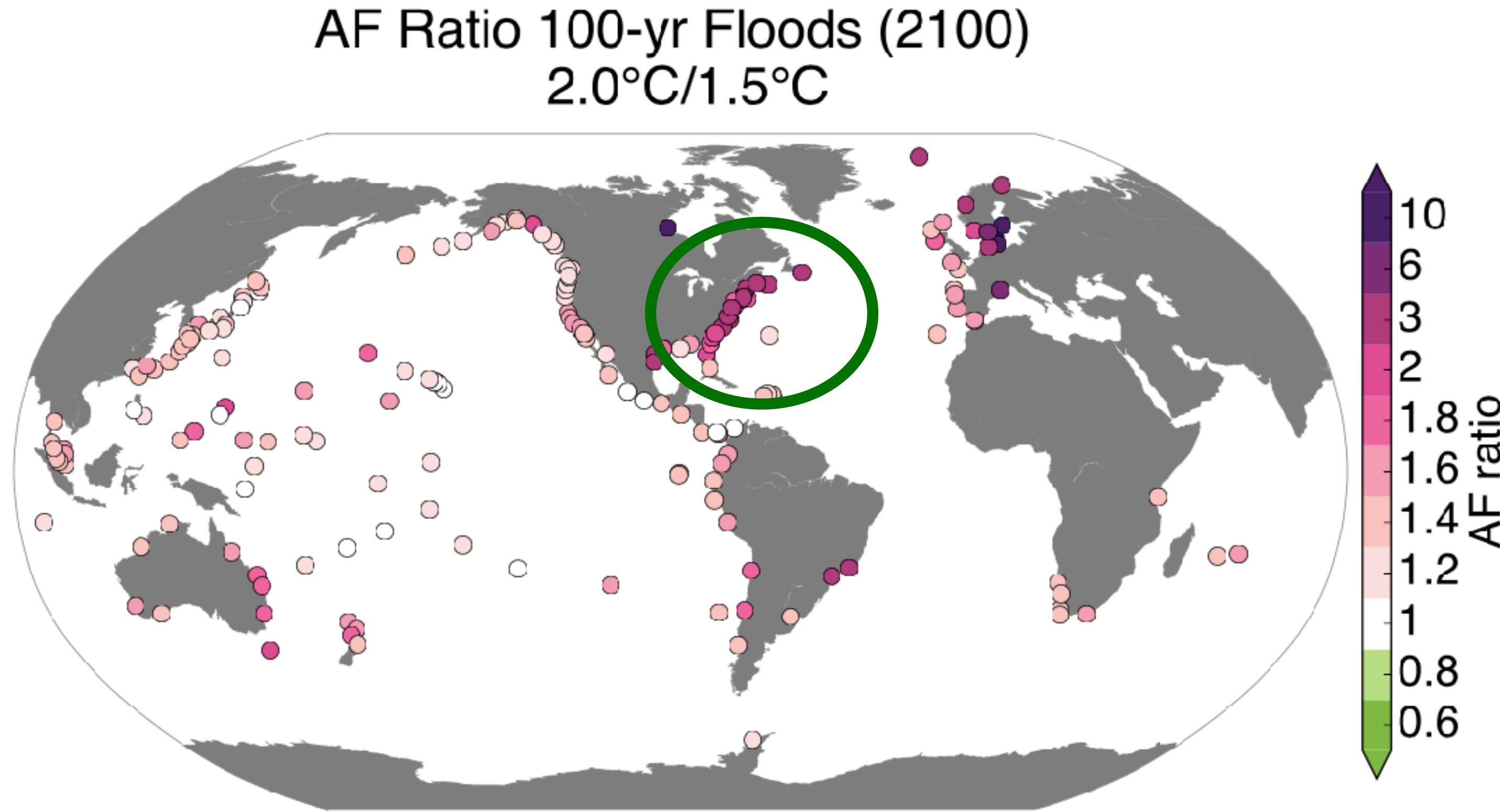
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Increase in the number of 100-yr floods  
is reduced by roughly half for Eastern  
U.S. and Europe.

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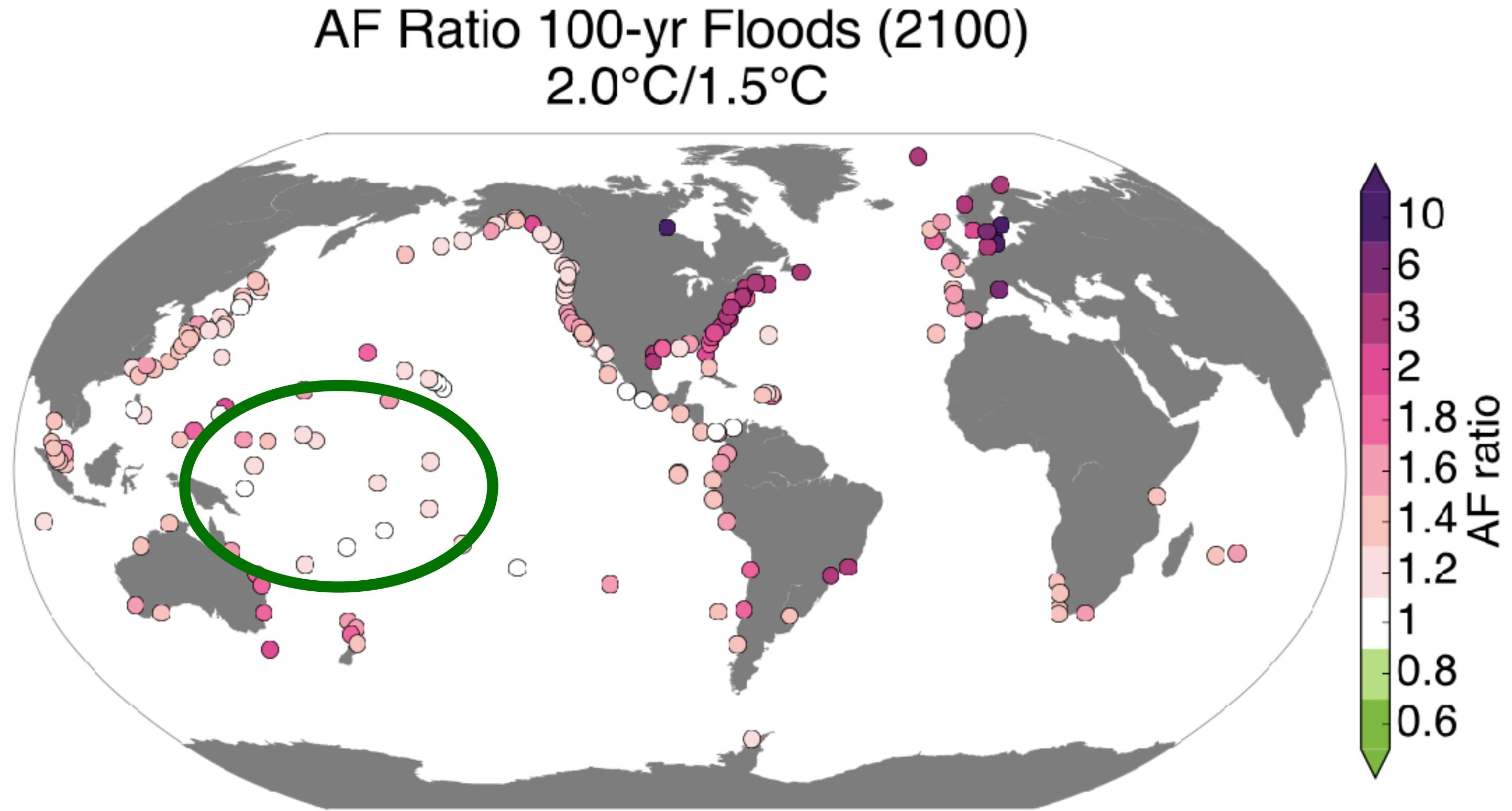
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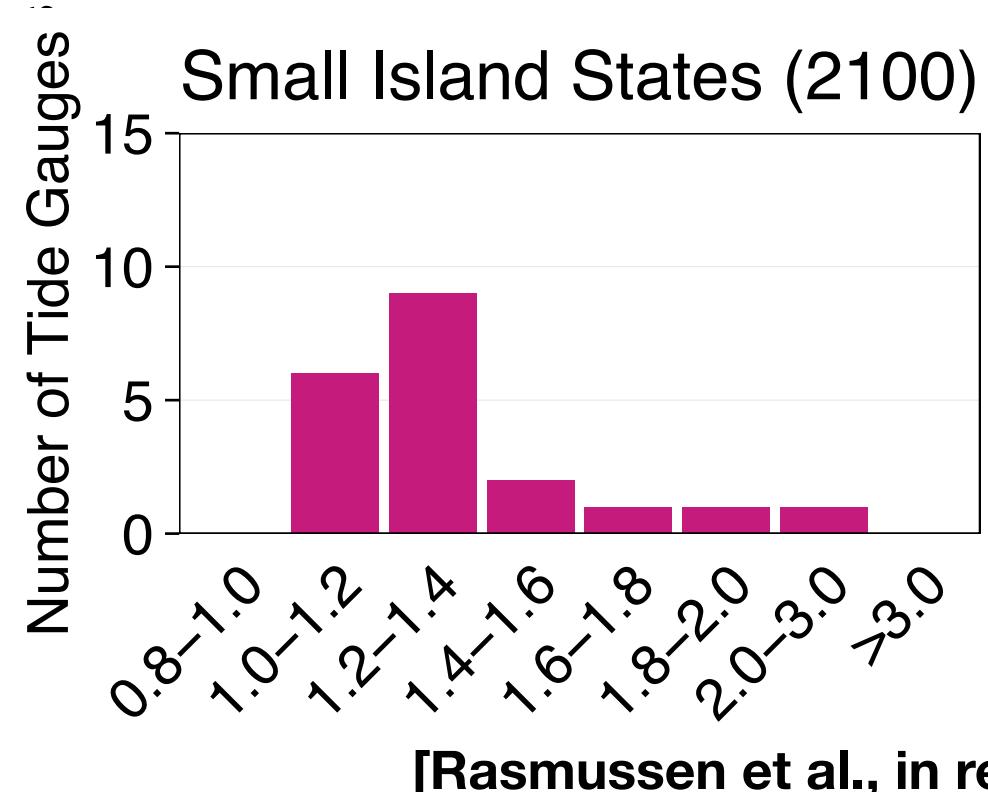
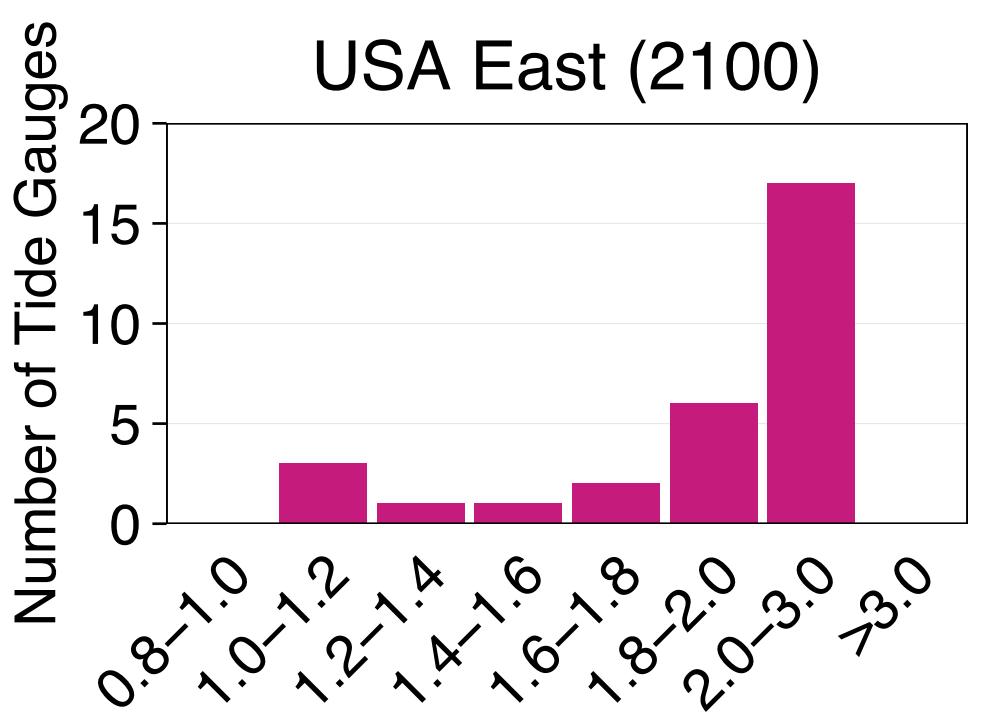
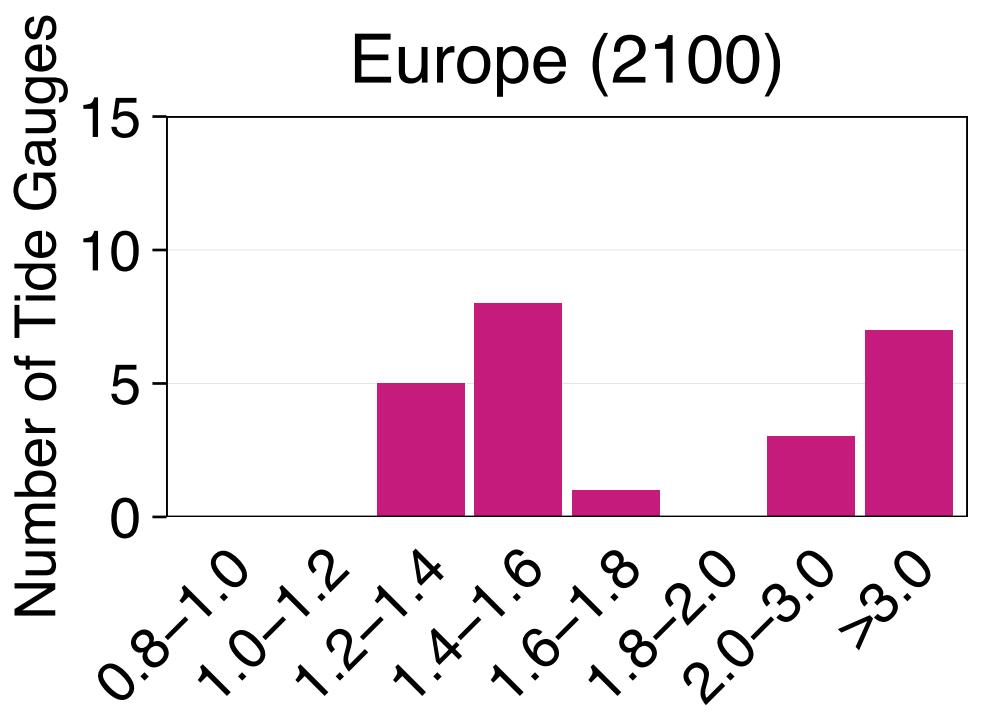
Increase in the number of 100-yr floods  
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# Where are greatest benefits from 1.5 °C vs. 2.0 °C? (2100)

Local flood benefits from 1.5 °C over 2.0 °C target (100-yr flood)

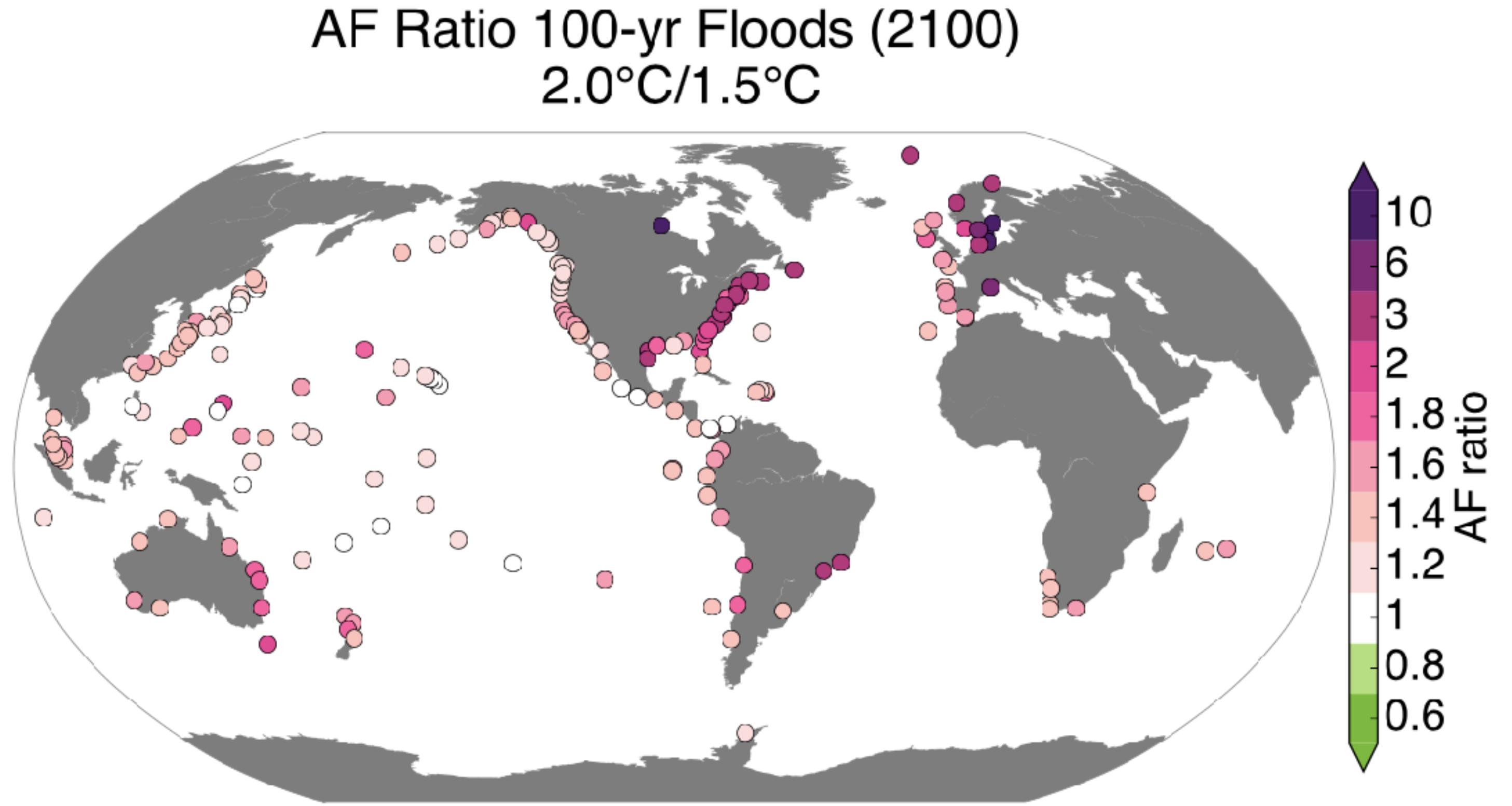


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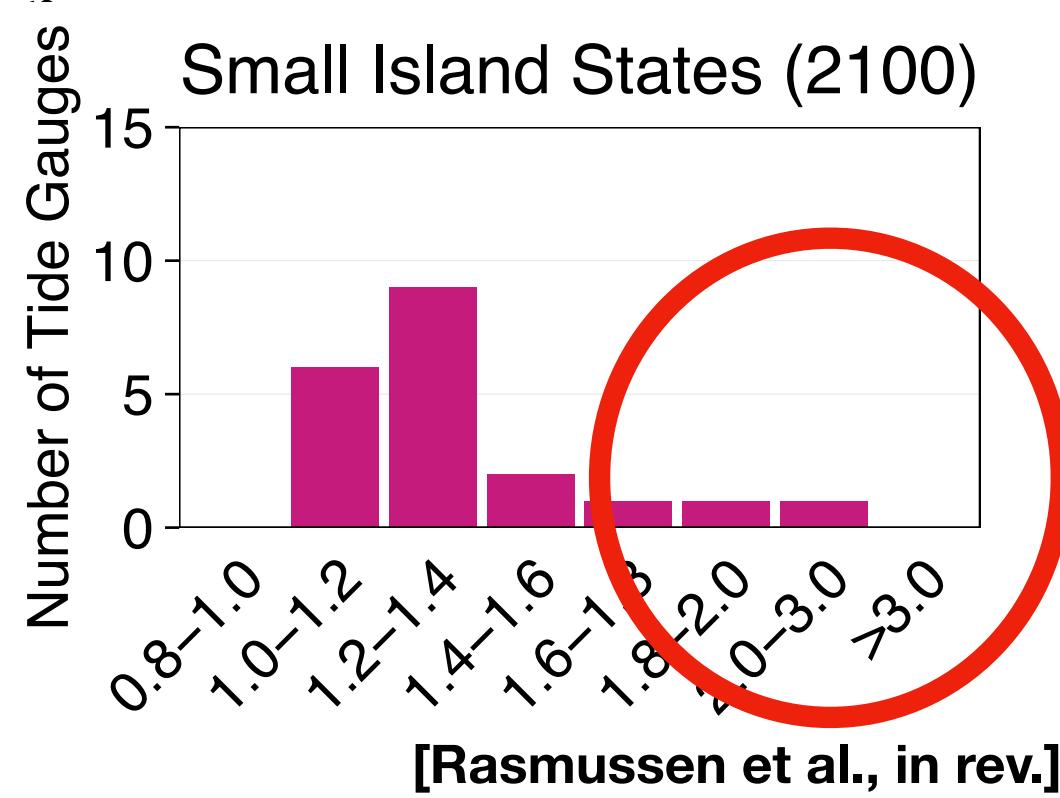
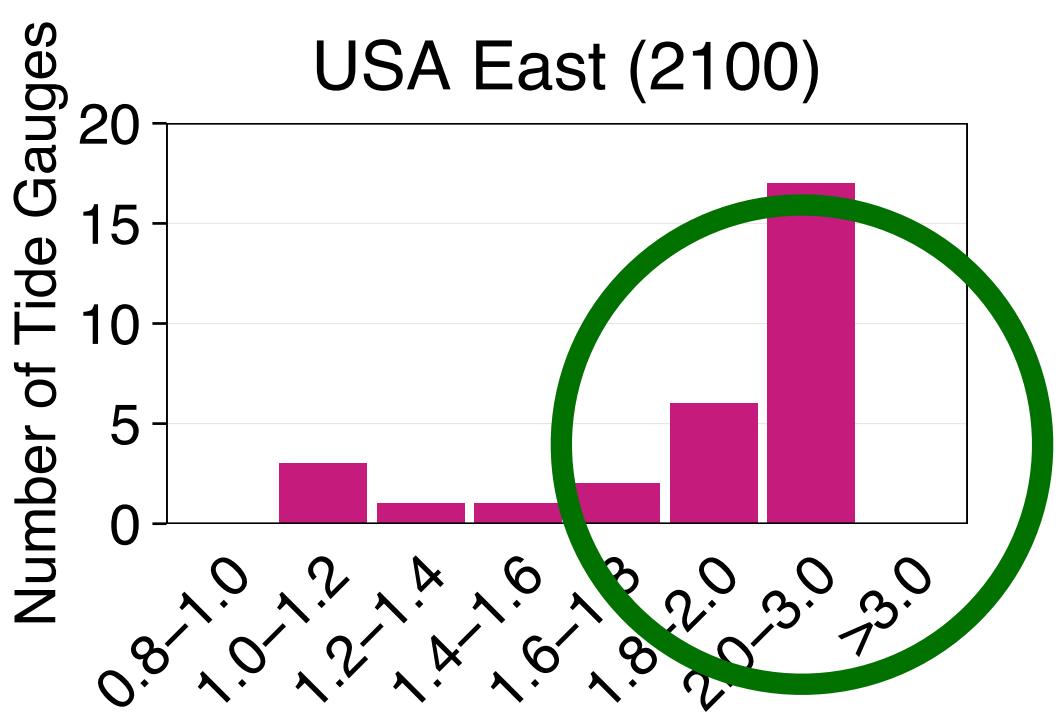
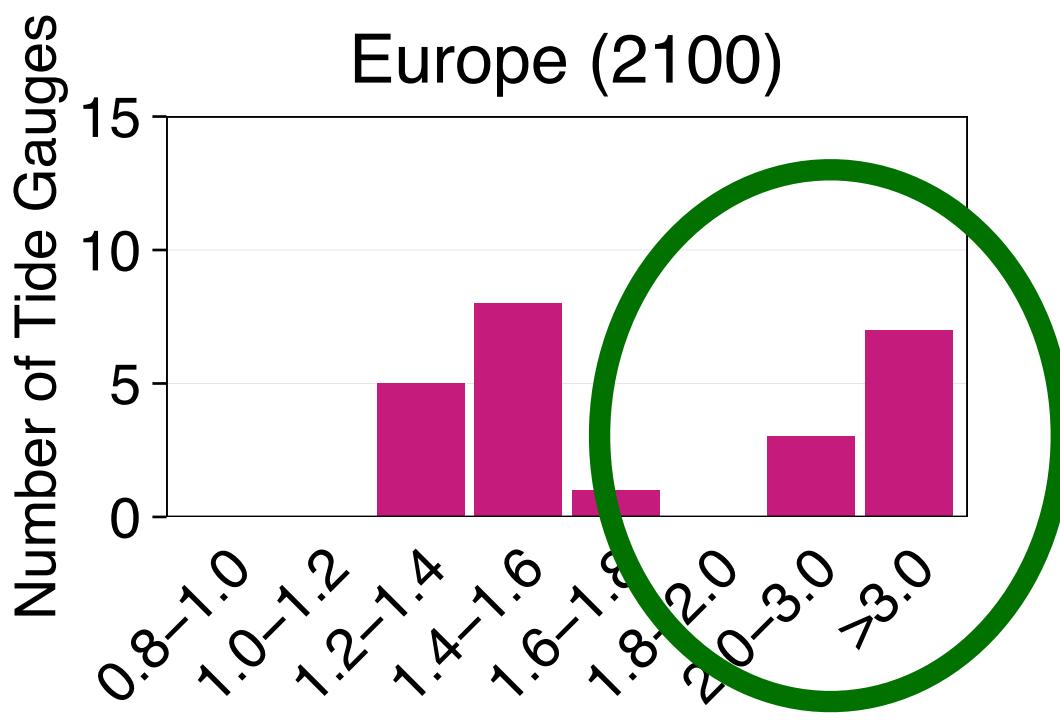
Local flood benefits from 1.5 °C over 2.0 °C target (100-yr flood)



***More tide  
gauges with  
larger benefits***

Increase in the number of 100-yr floods  
is reduced by roughly half for Eastern  
U.S. and Europe.

***less benefit***



# Post-Quiz

The Paris Agreement will stabilize coastal flood frequency in the 21st century. (T/F)

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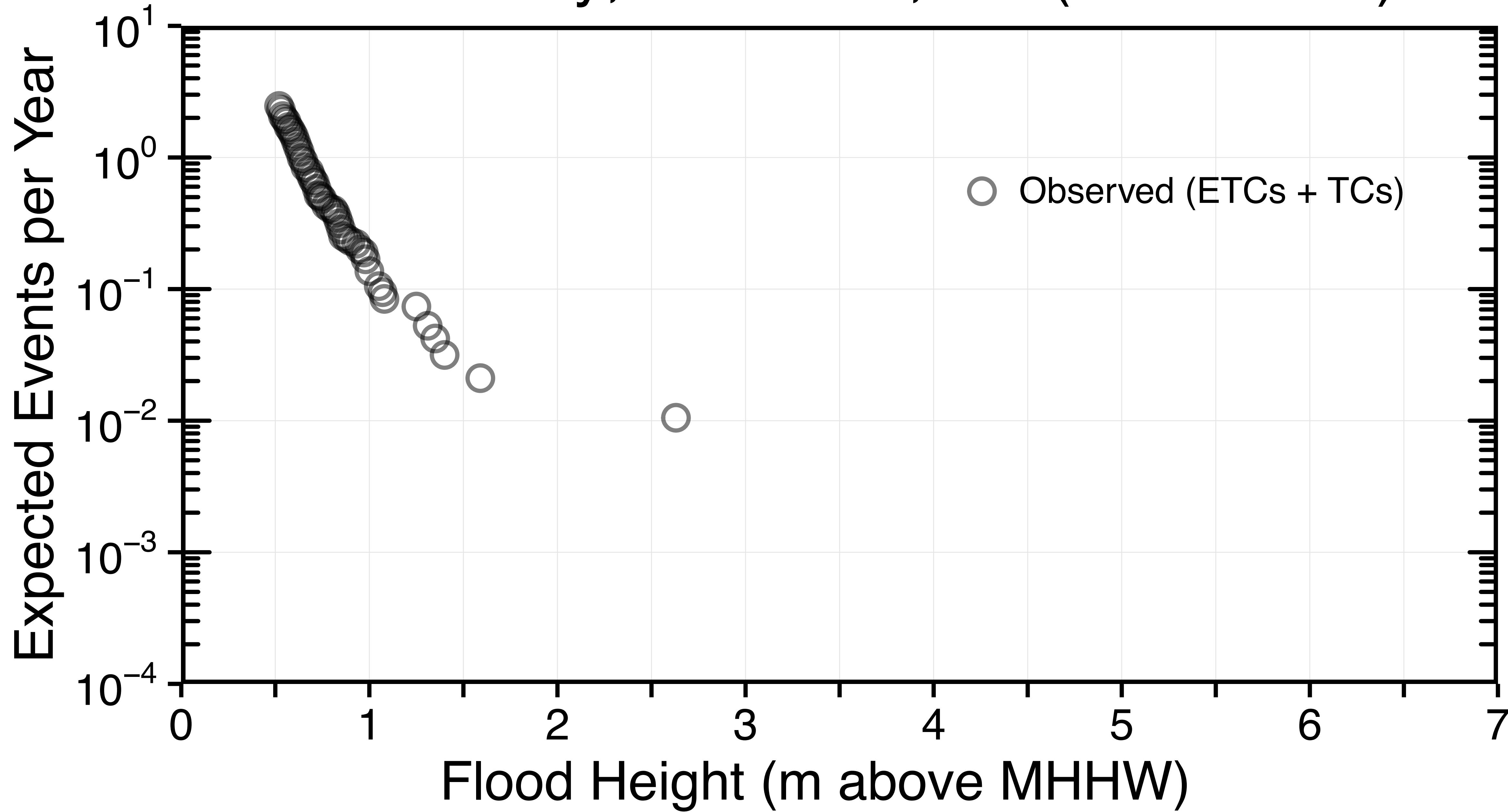
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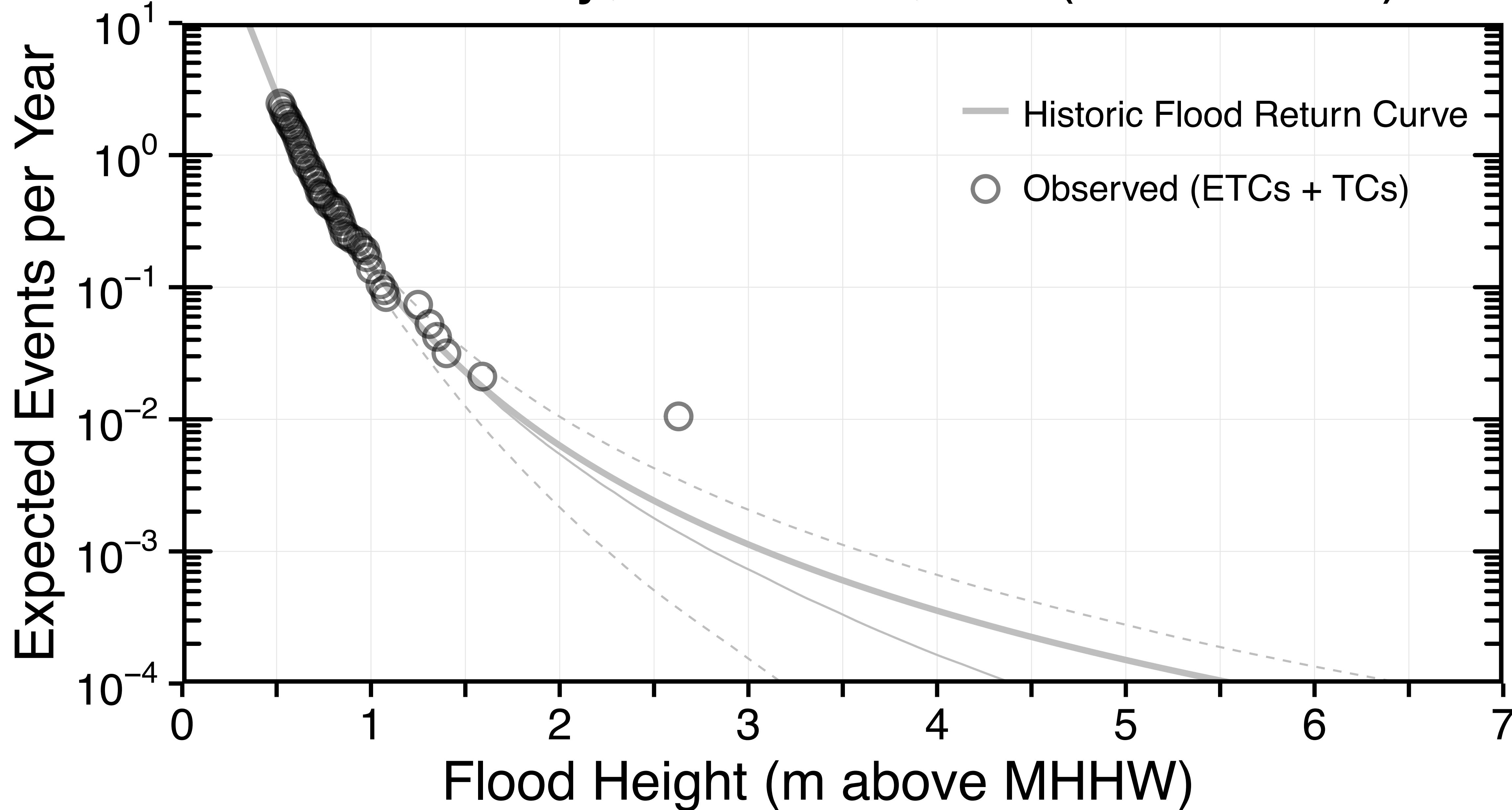
**False. U.S.A. and Europe largest projected benefit**

Separate extra-tropical  
cyclones from tropical  
cyclones...

# The Battery, New York, NY (1920-2014)



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# The Battery, New York, NY (1920-2014)

Expected Events per Year

10<sup>1</sup>  
10<sup>0</sup>  
10<sup>-1</sup>  
10<sup>-2</sup>  
10<sup>-3</sup>  
10<sup>-4</sup>

0 1 2 3 4 5 6 7

Flood Height (m above MHHW)

Observed (January-May,  
November-December)

1.5

1.0

0.5

0.1

0.05

0.01

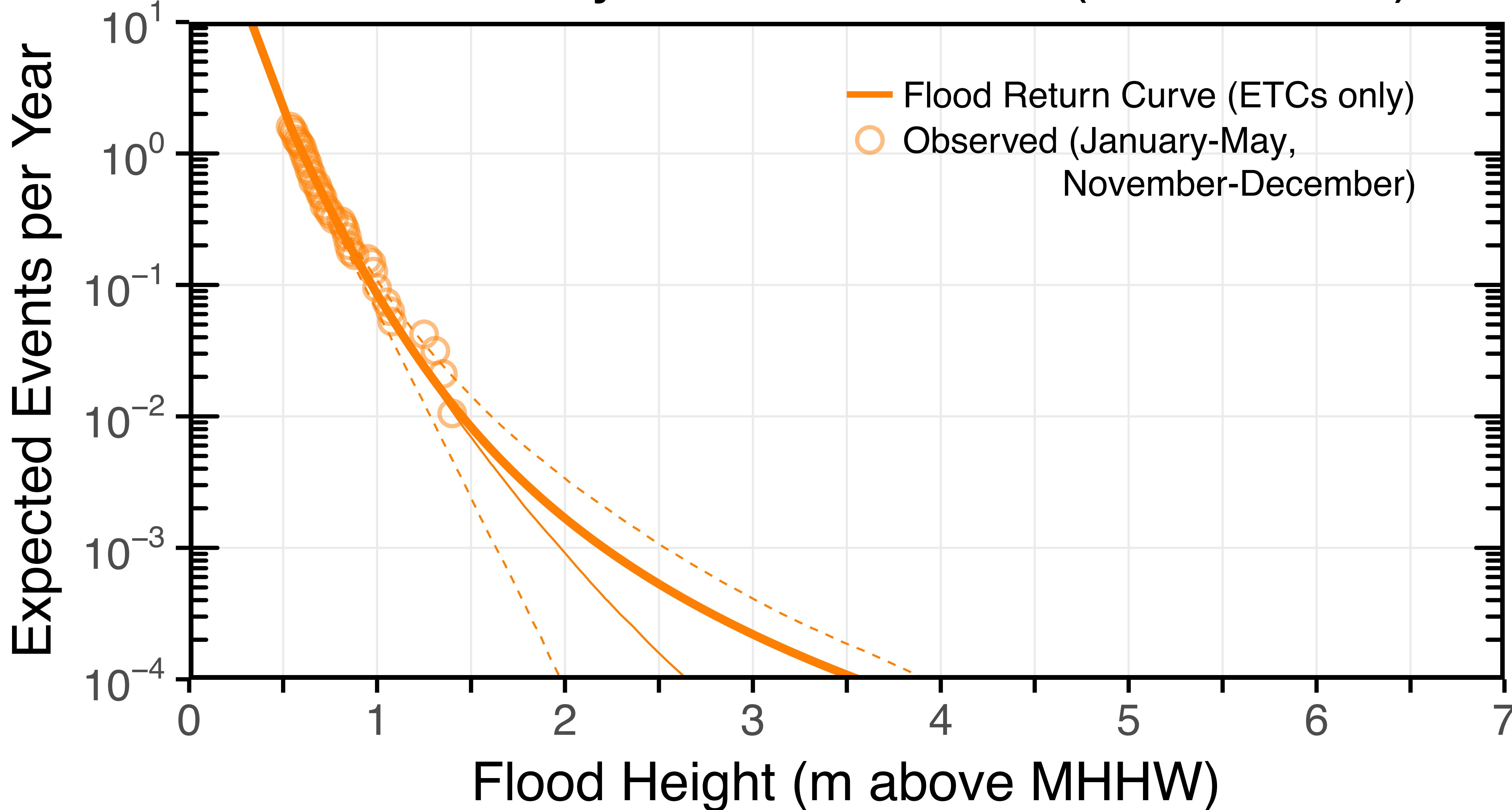
0.005

0.001

0.0005

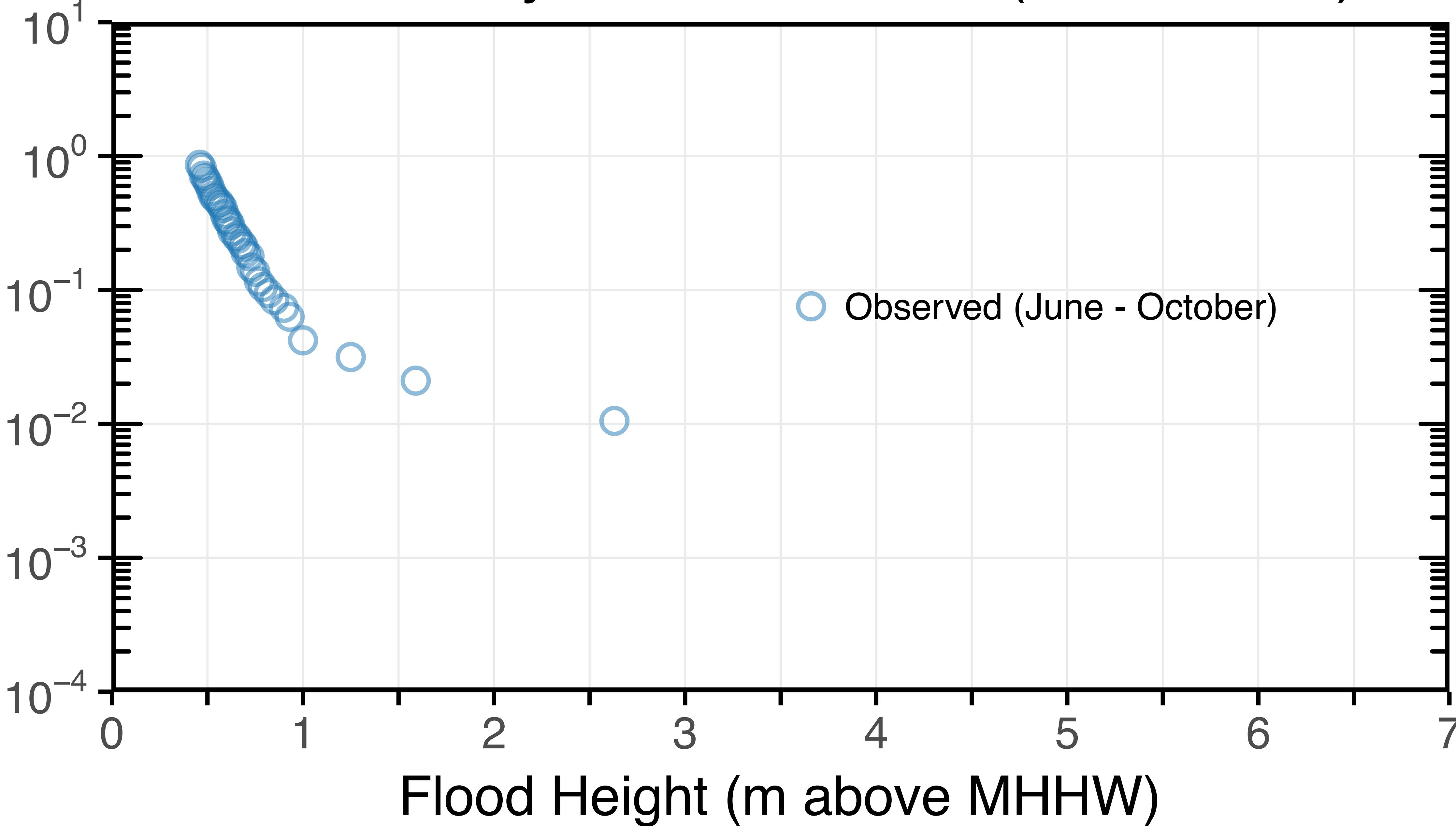
0.0001

# The Battery, New York, NY (1920-2014)



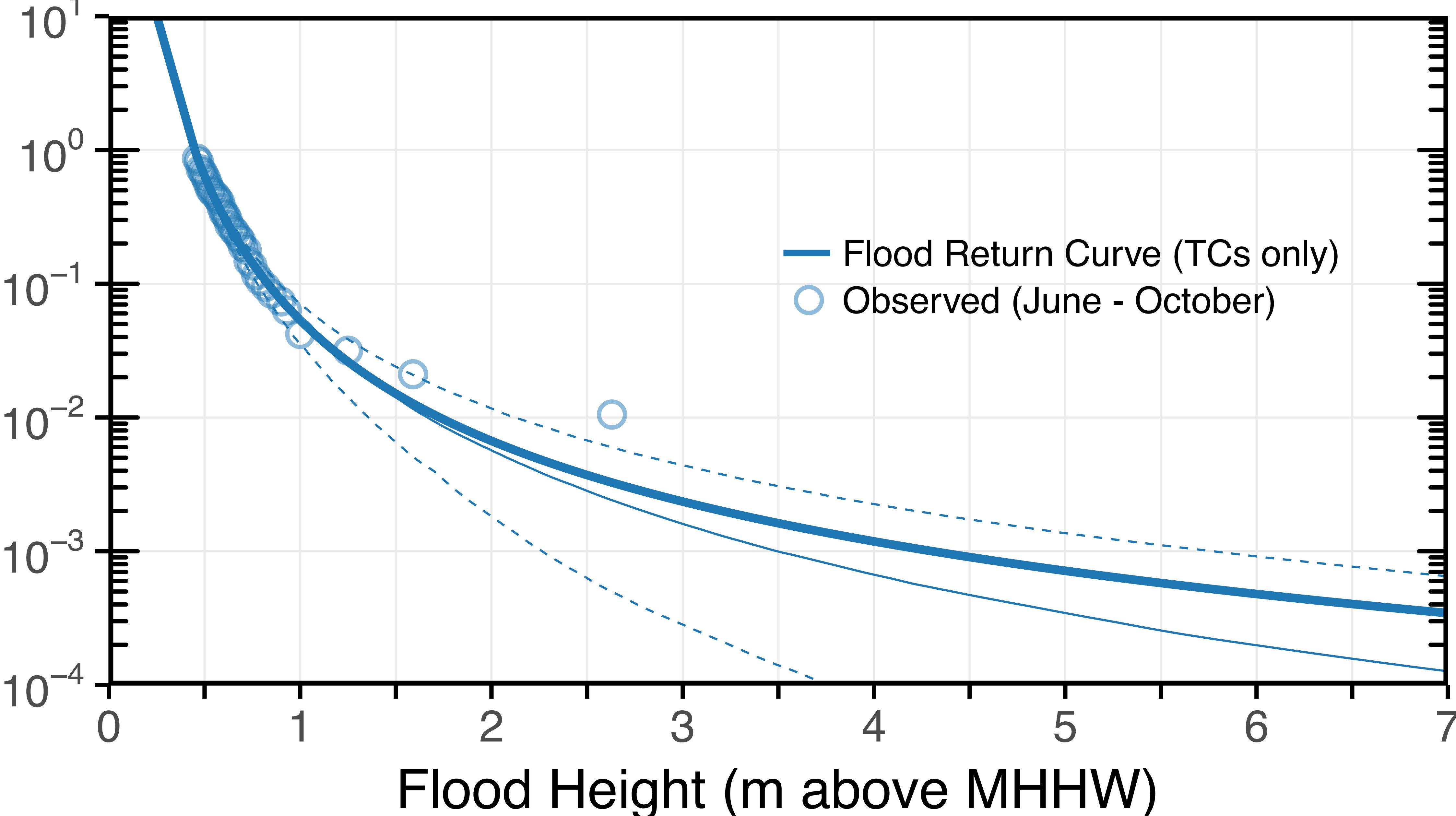
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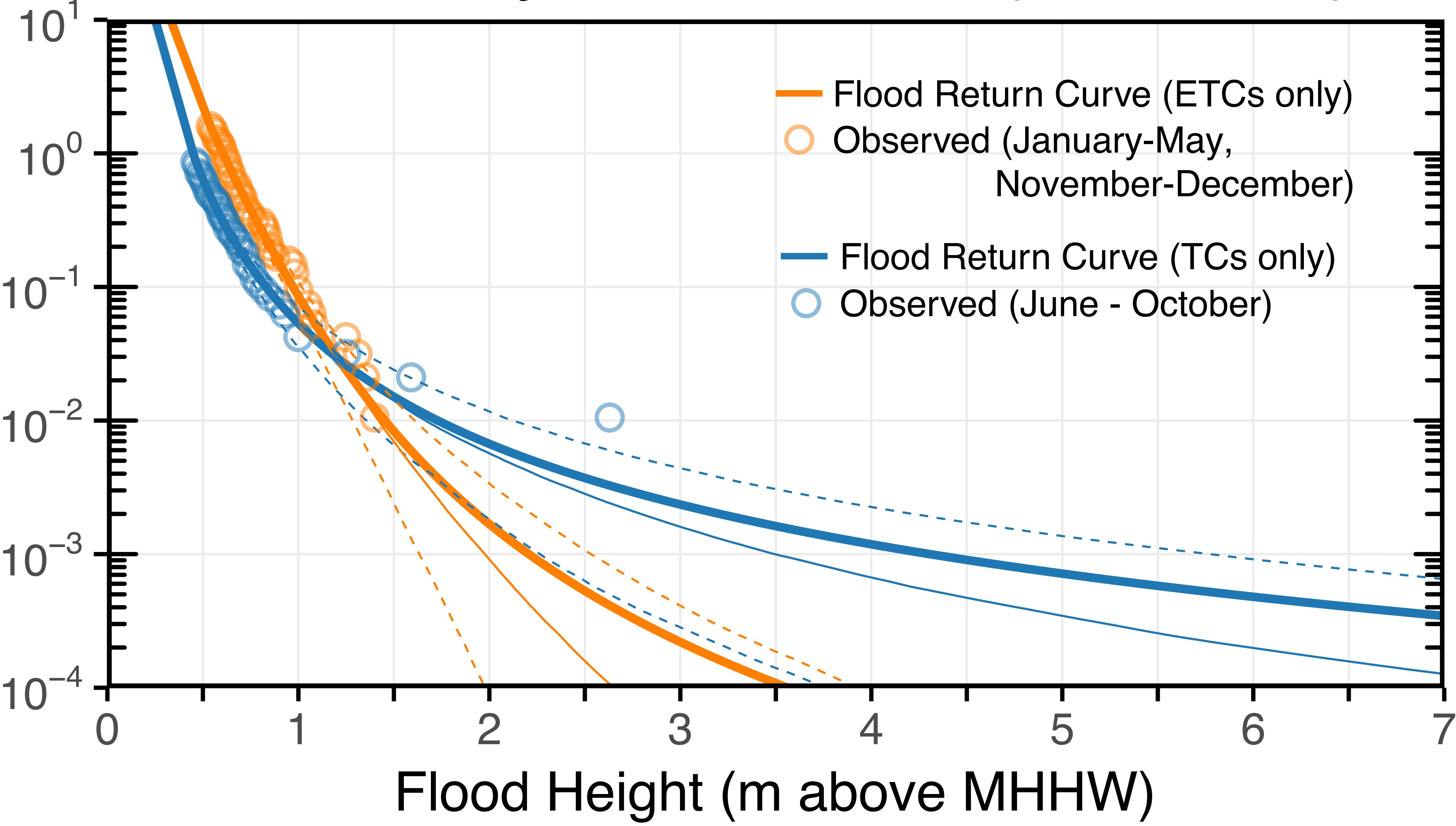
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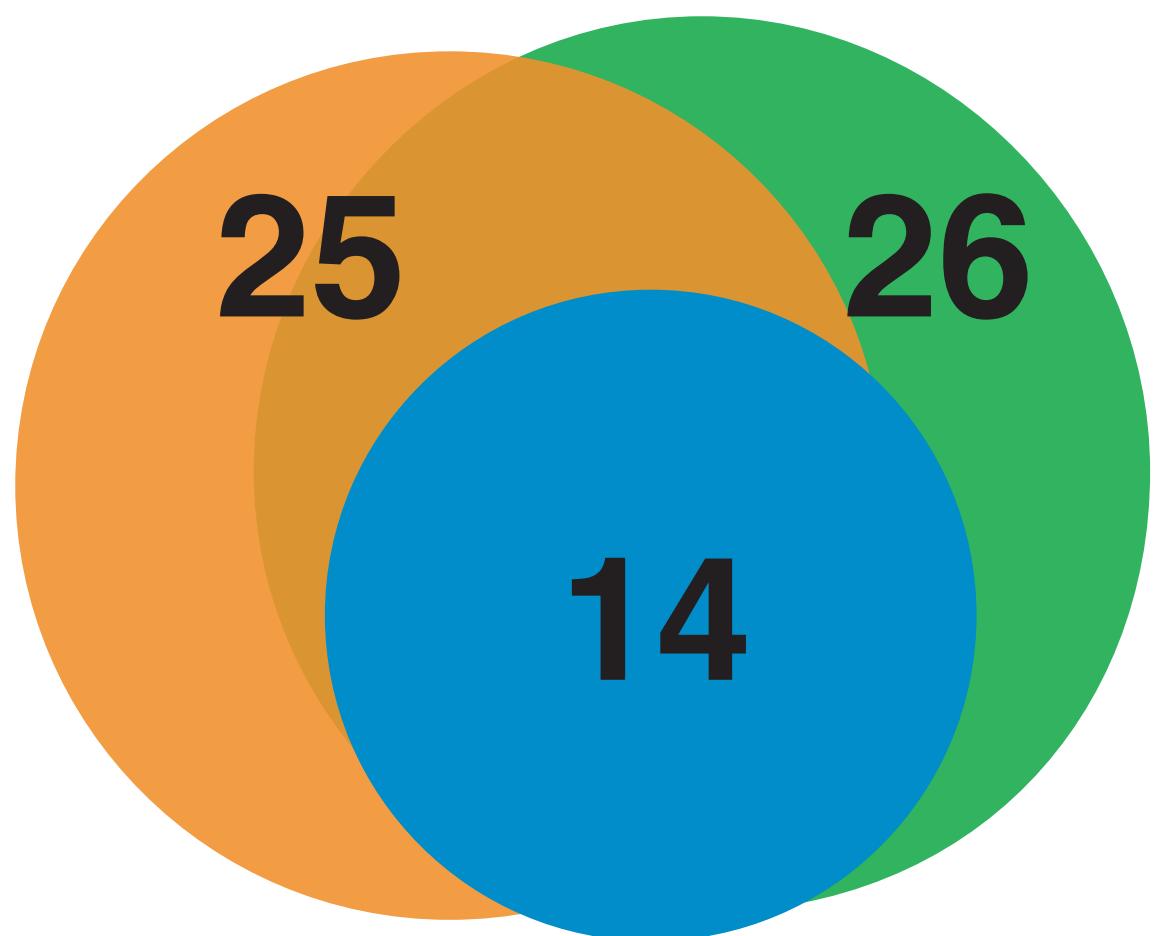
Expected Events per Year



# Number of annual expected floods (NYC; 2100)

## 10-yr floods per year

(1.09 m above MHHW)



Current: 0.1  
events per year

2.5 °C

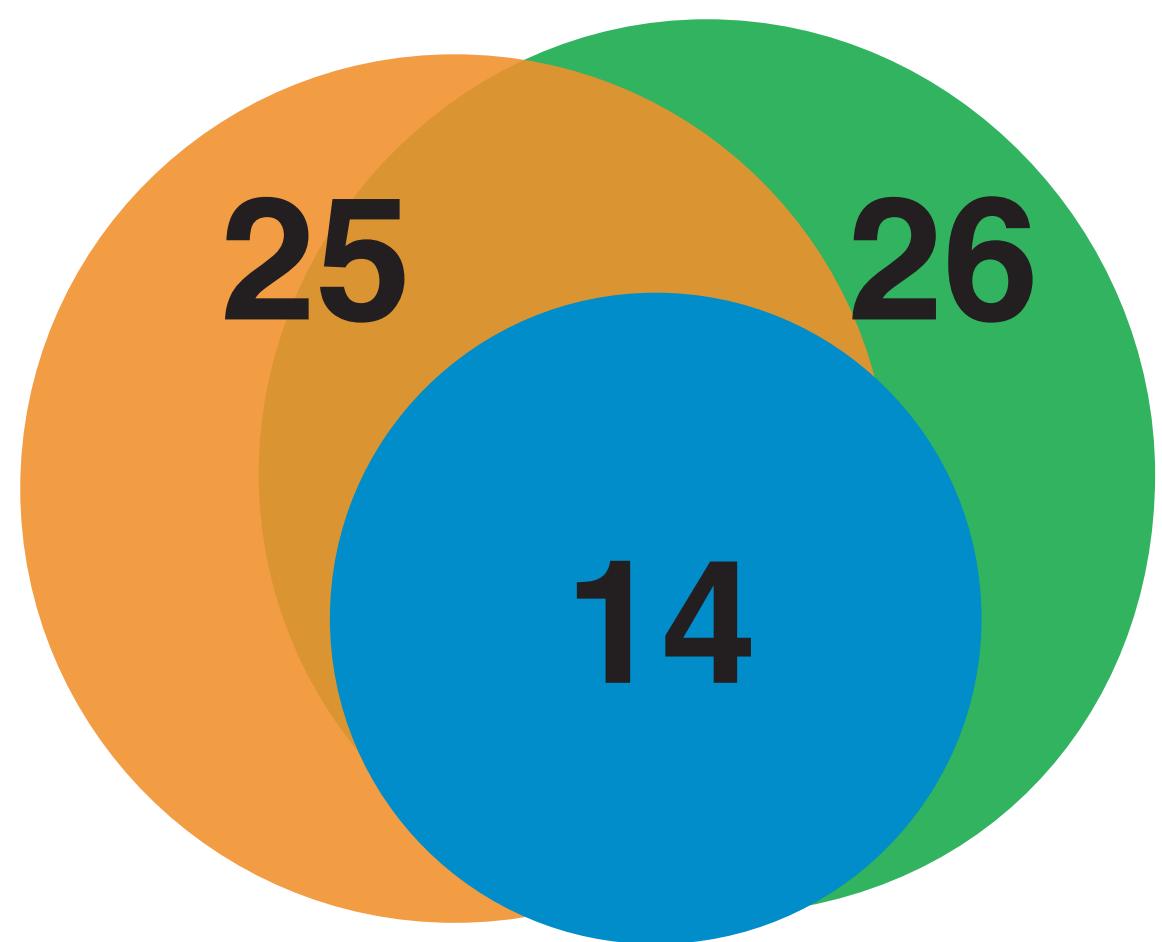
2.0 °C

1.5 °C

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## 10-yr floods per year

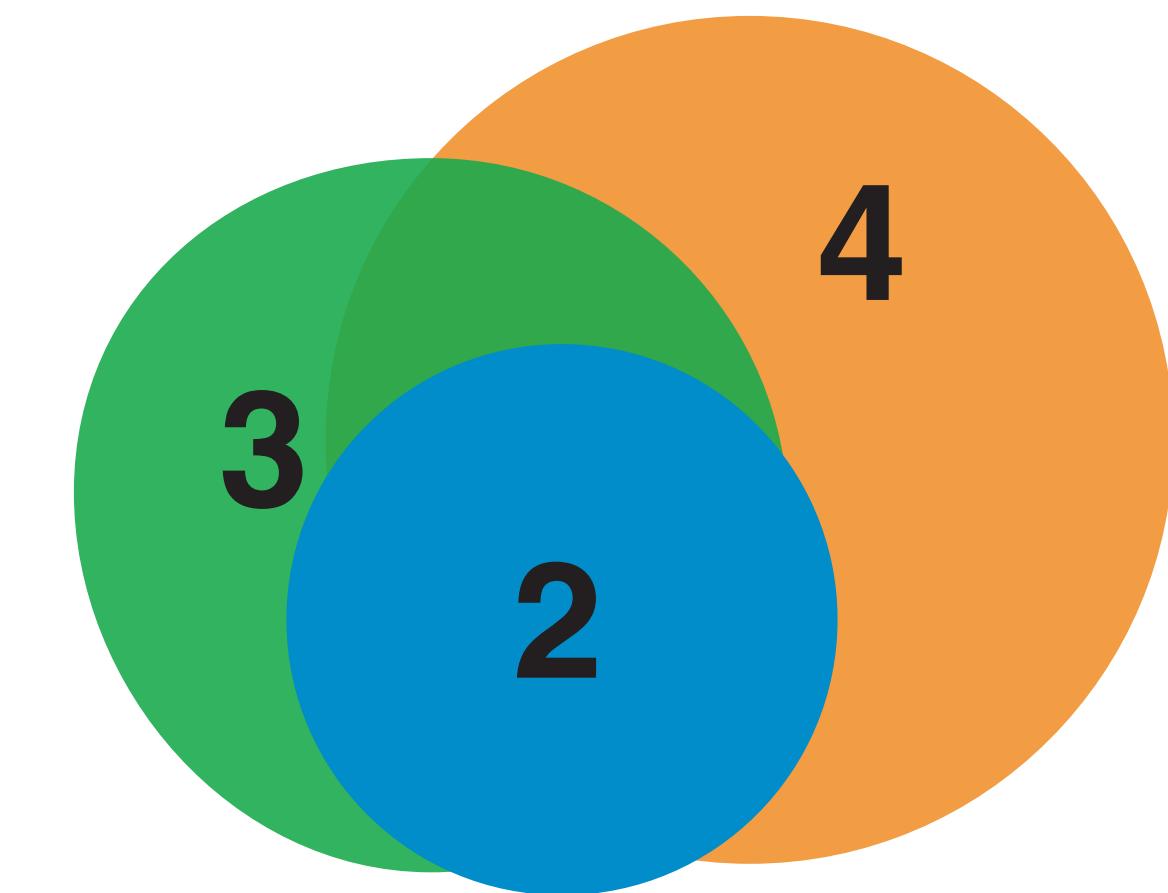
(1.09 m above MHHW)



Current: 0.1  
events per year

## 100-yr floods per year

(1.86 m above MHHW)



Current: 0.01 events per year

2.5 °C

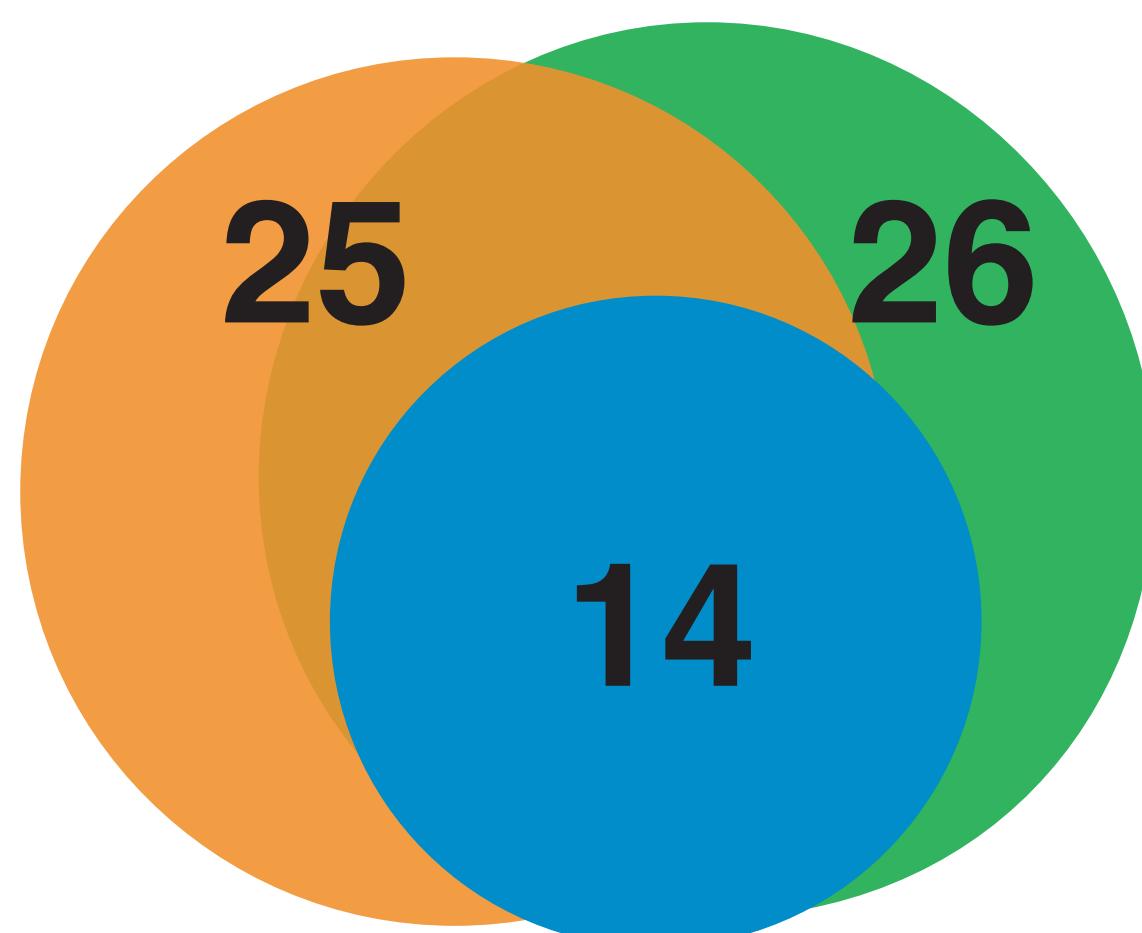
2.0 °C

1.5 °C

# Number of annual expected floods (NYC; 2100)

## 10-yr floods per year

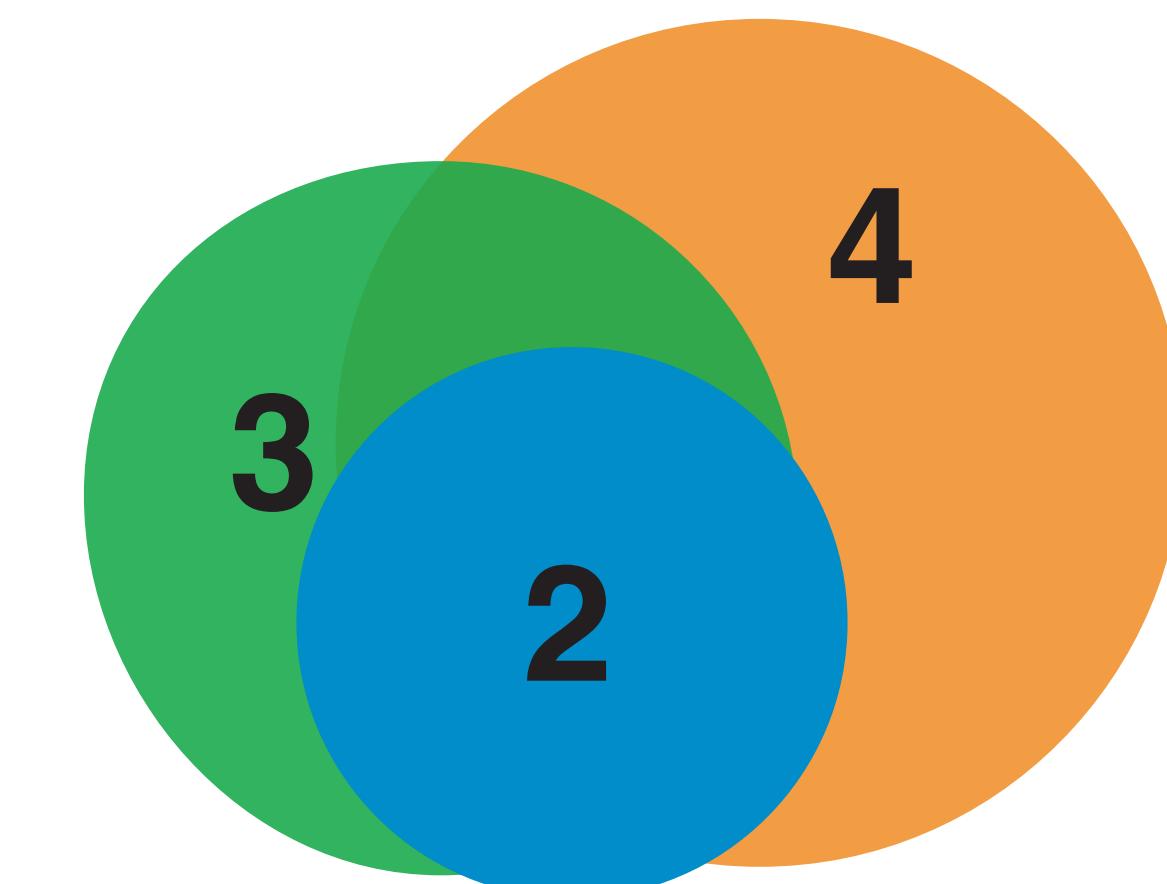
(1.09 m above MHHW)



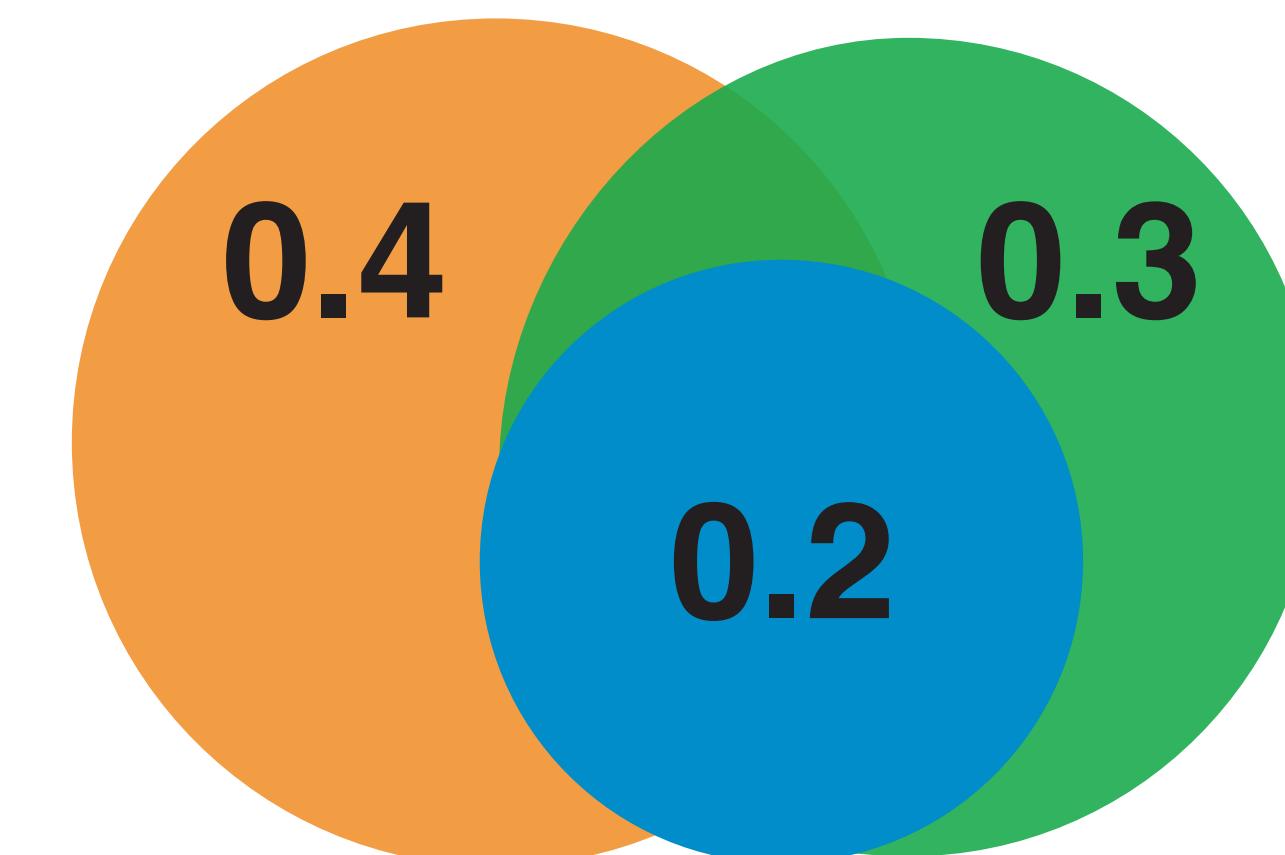
Current: 0.1  
events per year

## 100-yr floods per year

(1.86 m above MHHW)



Current: 0.01 events per year



Current: 0.002 events per year

2.5 °C

2.0 °C

1.5 °C



New York City  
Financial District

Battery Park

Top of sea wall is ~0.76 m  
above MHHW



So, really only a flood if surge  
is > 0.76m above MHHW

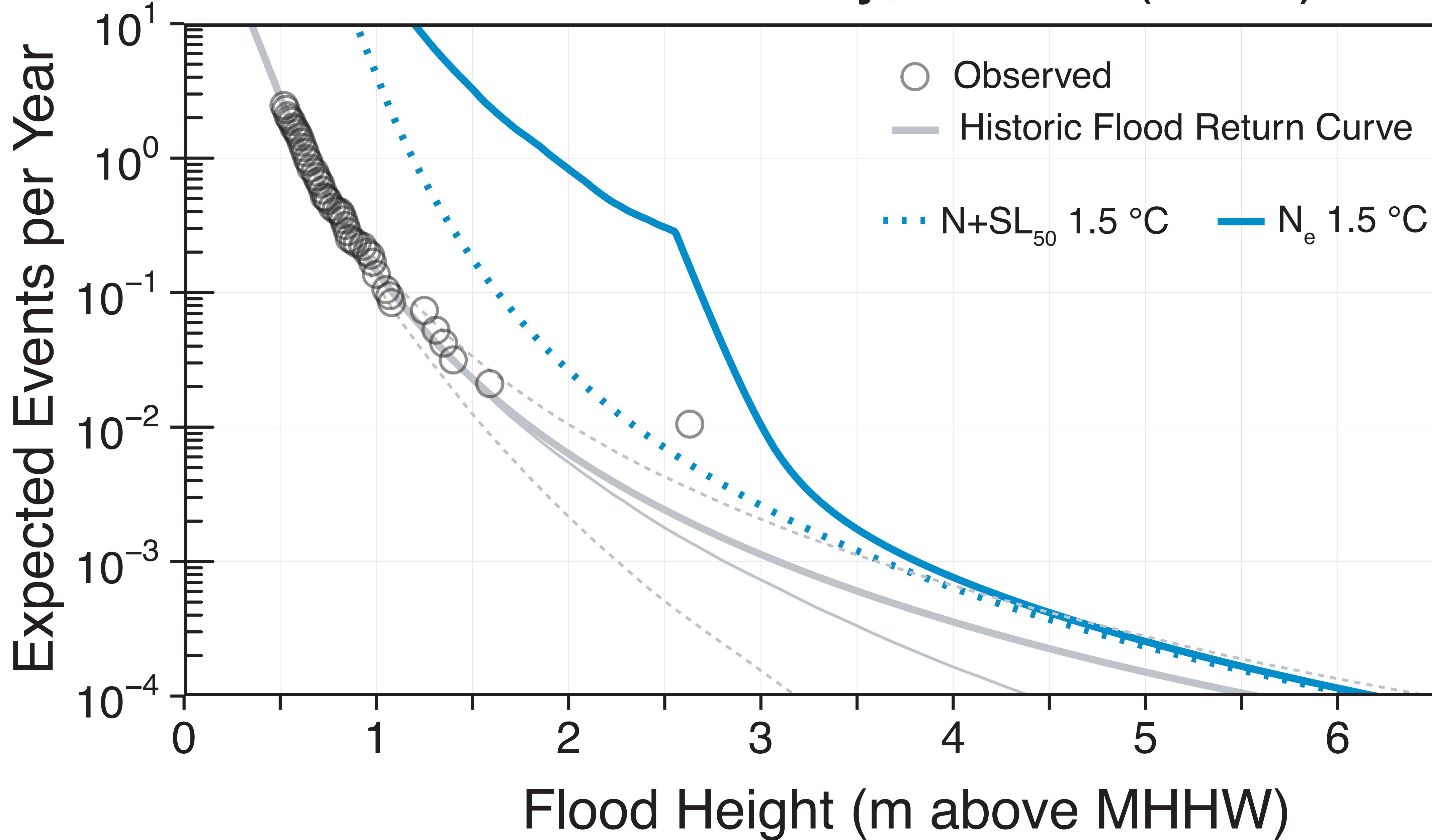
New York City  
Financial District

Battery Park

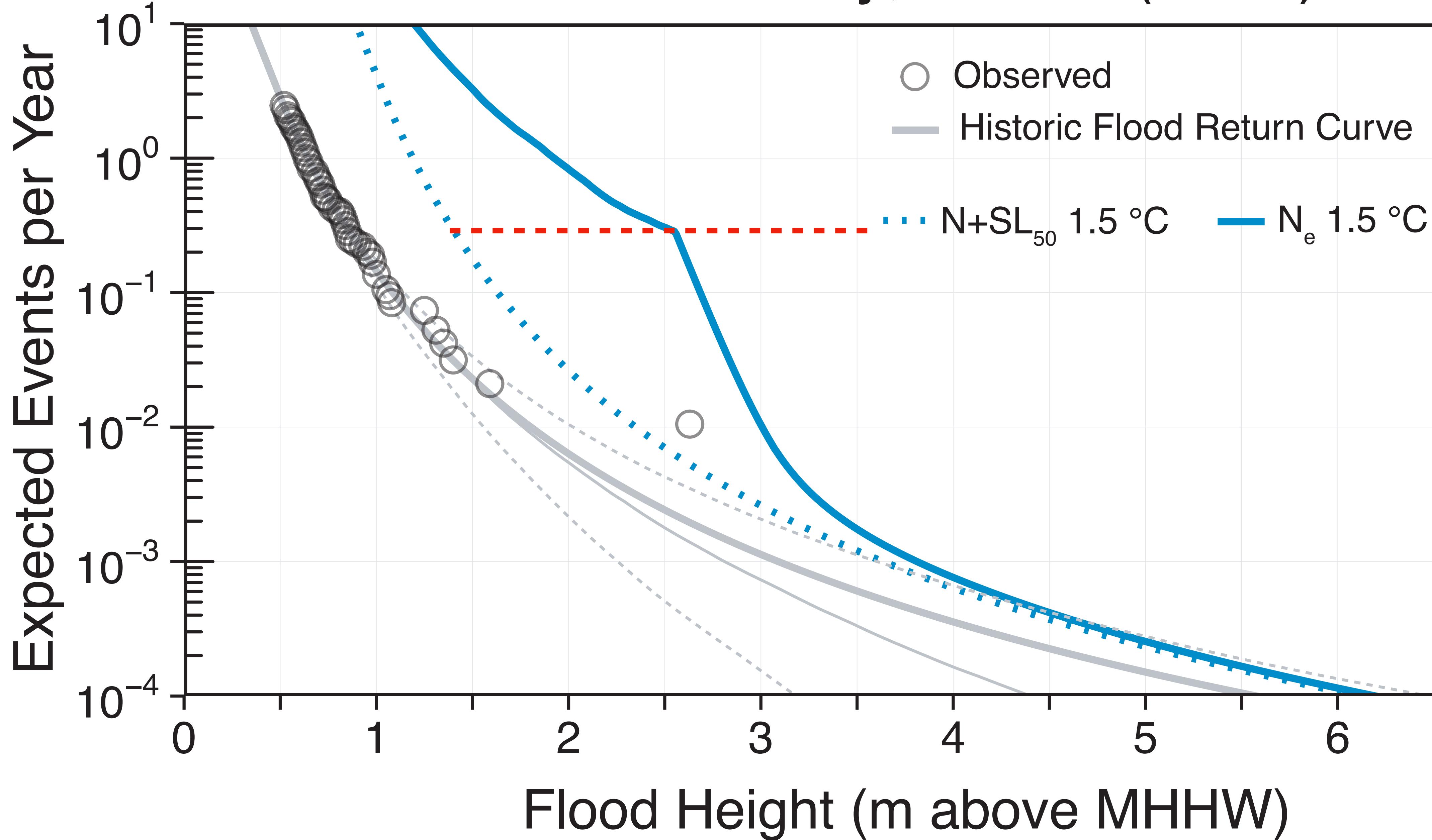
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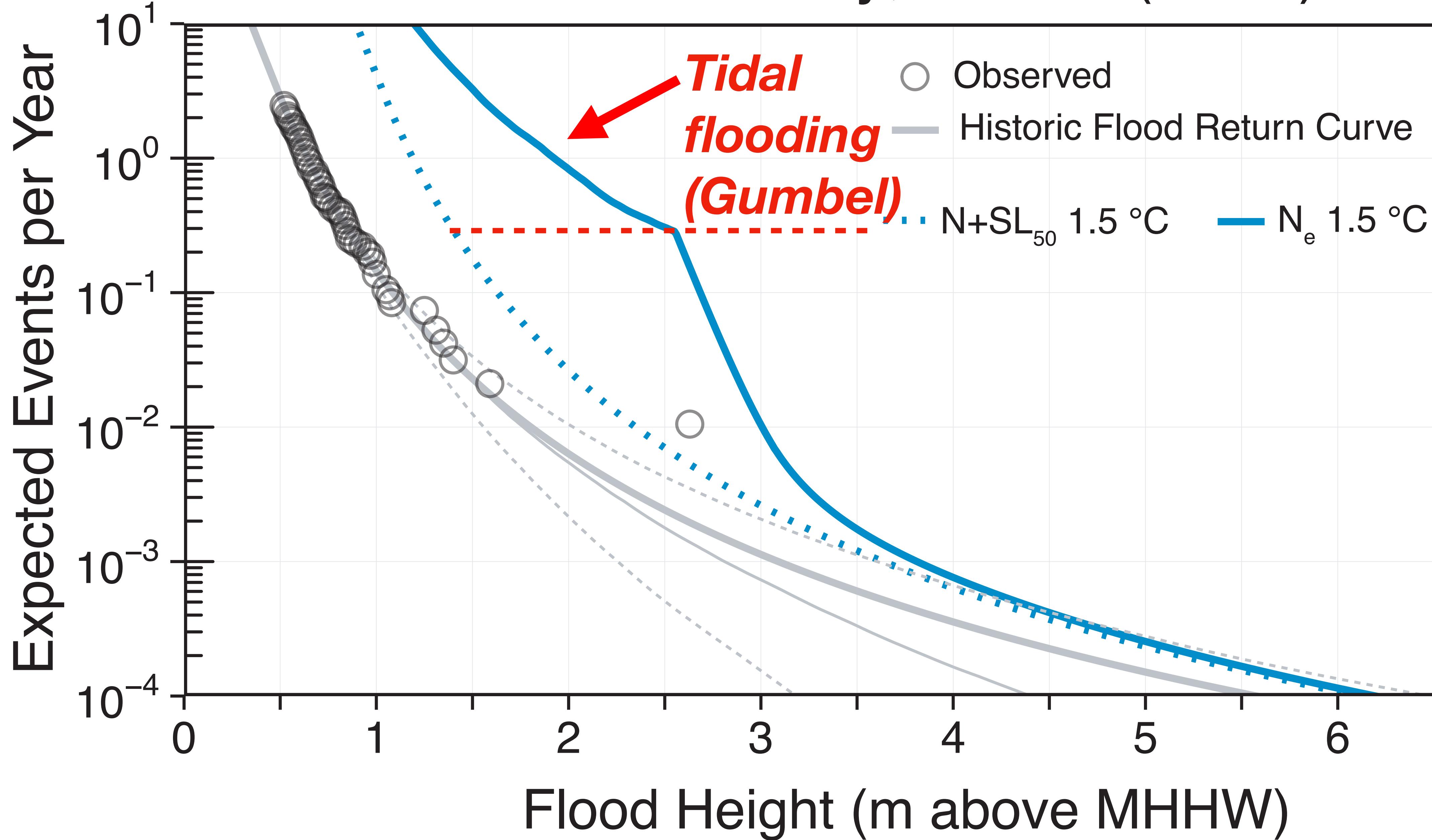
# New York City, U.S.A. (2100)



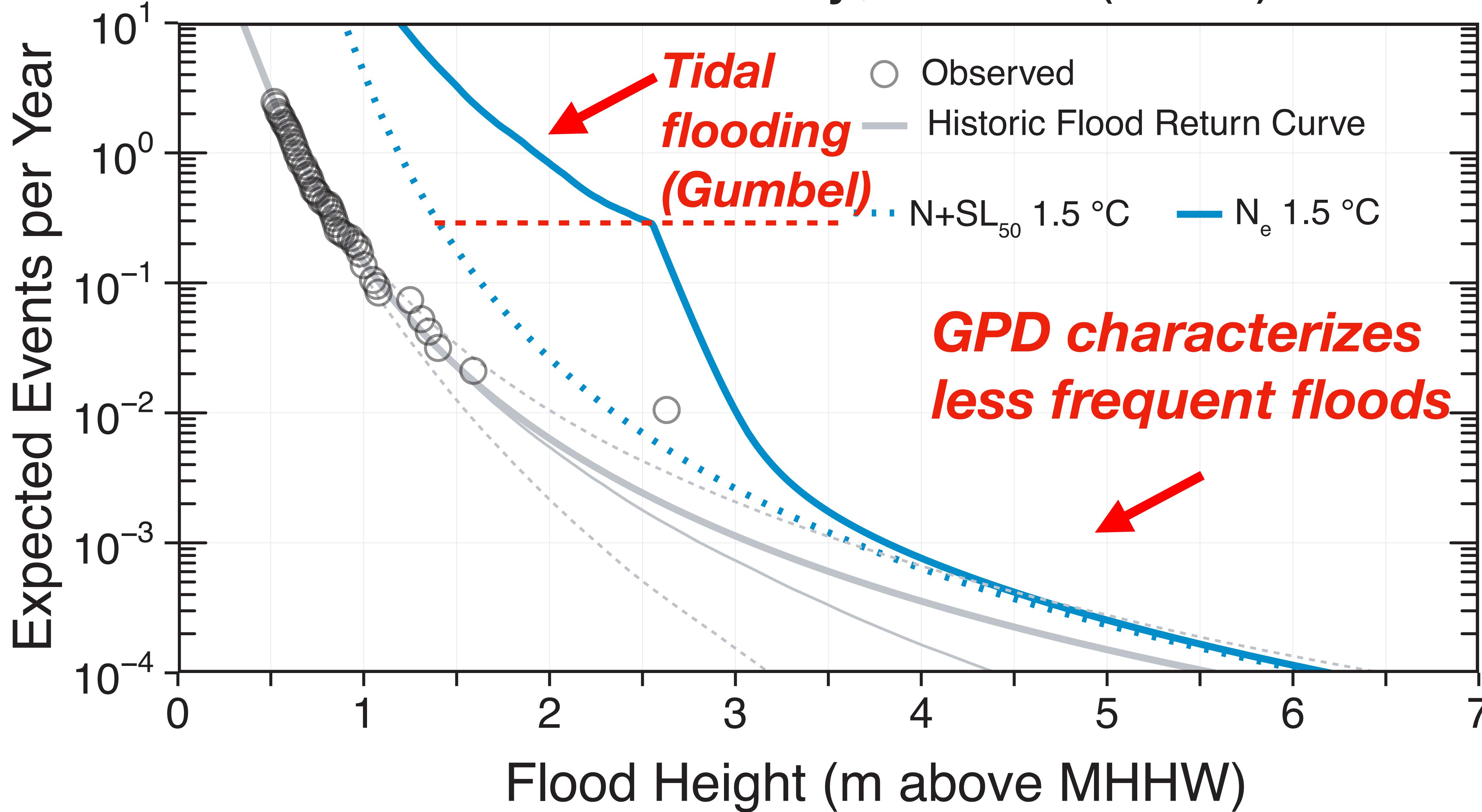
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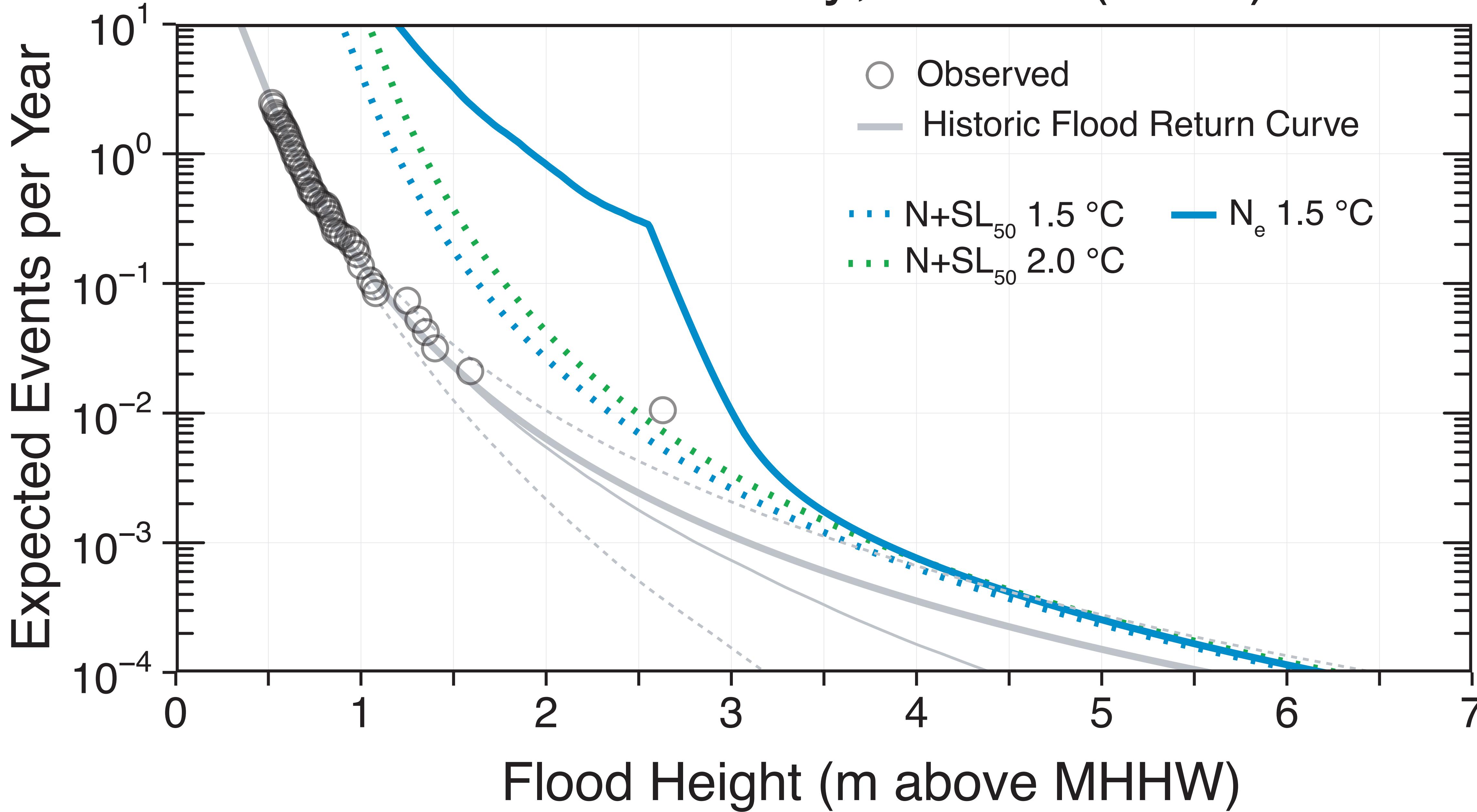
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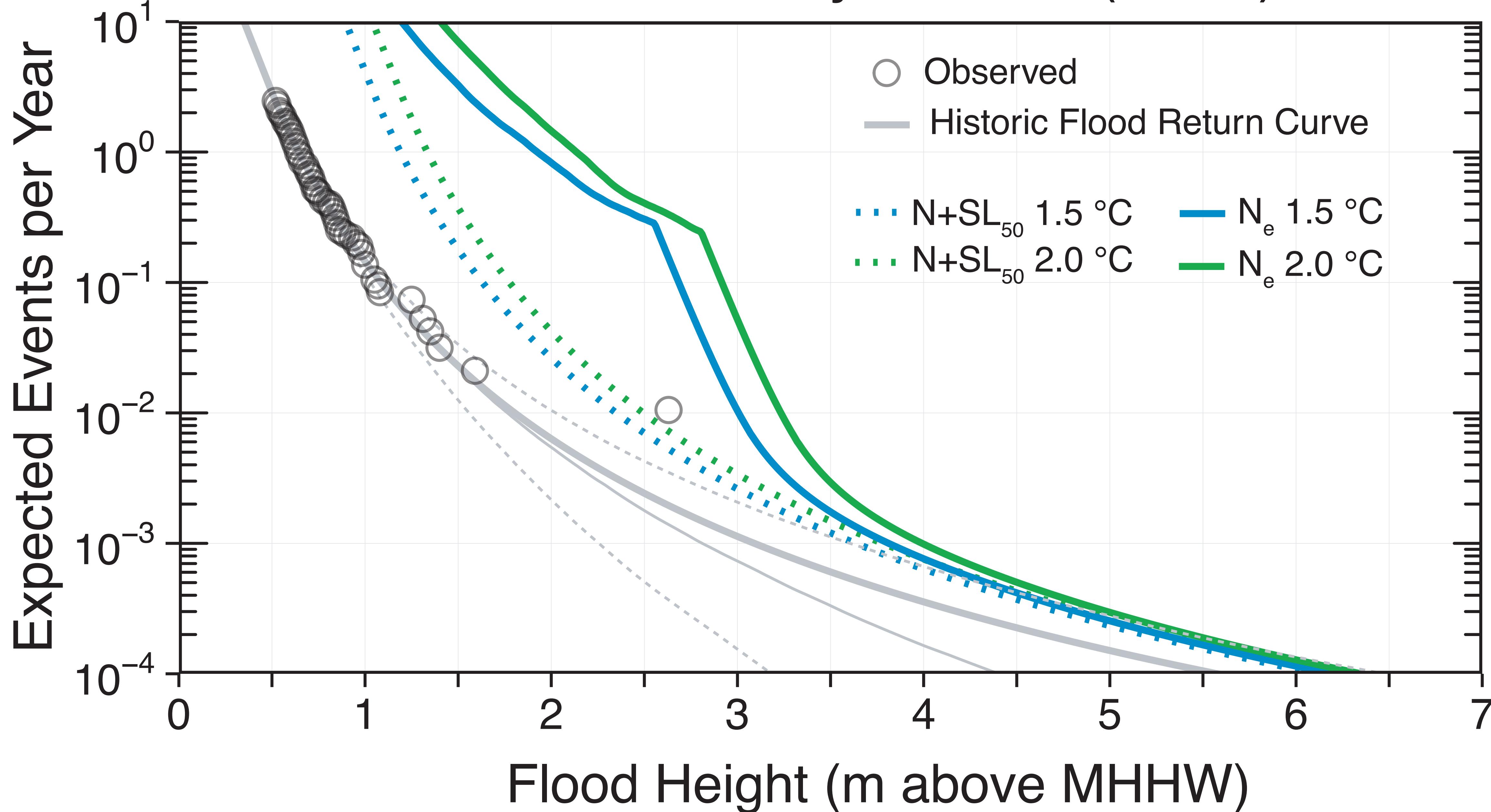
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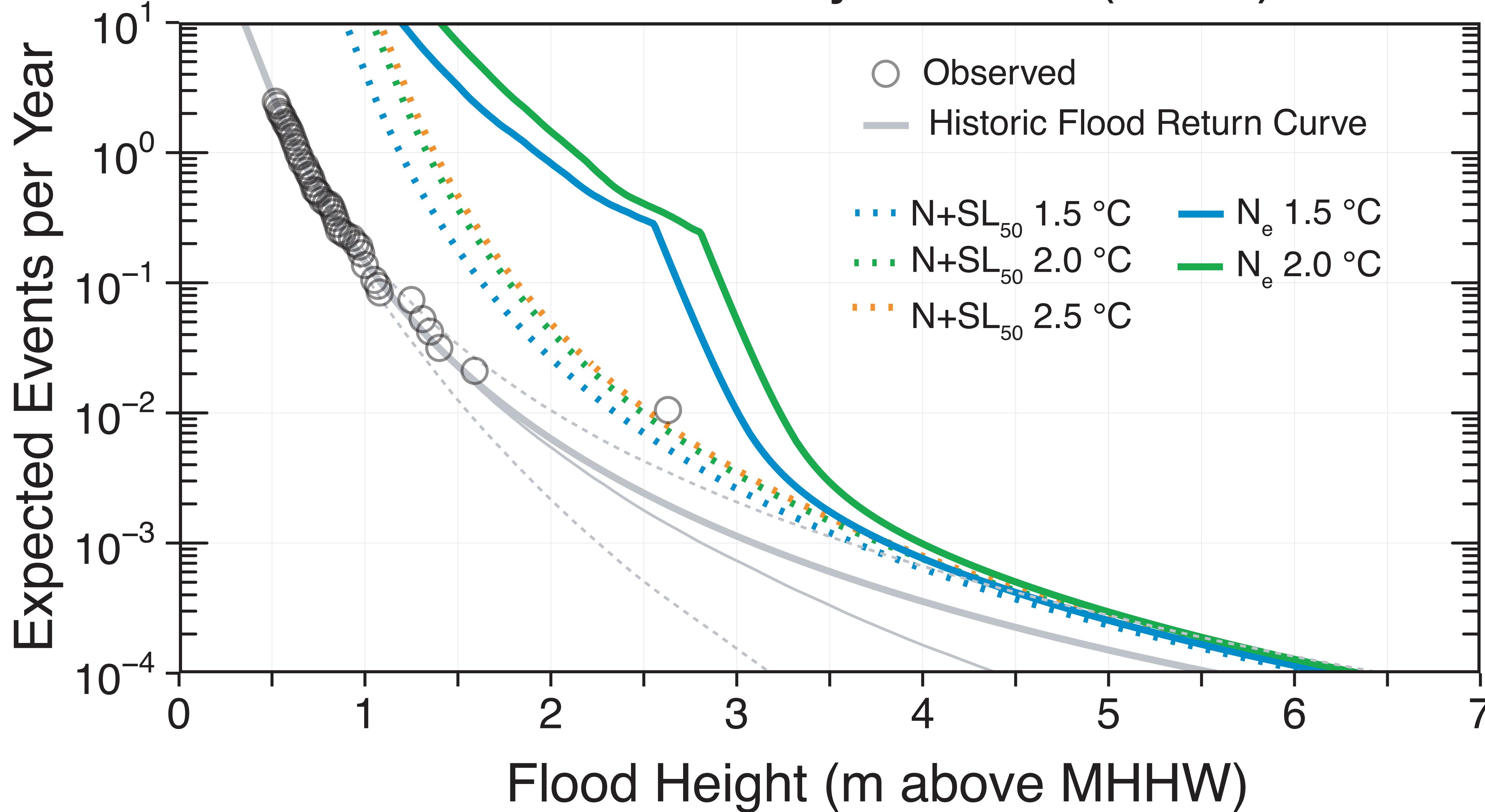
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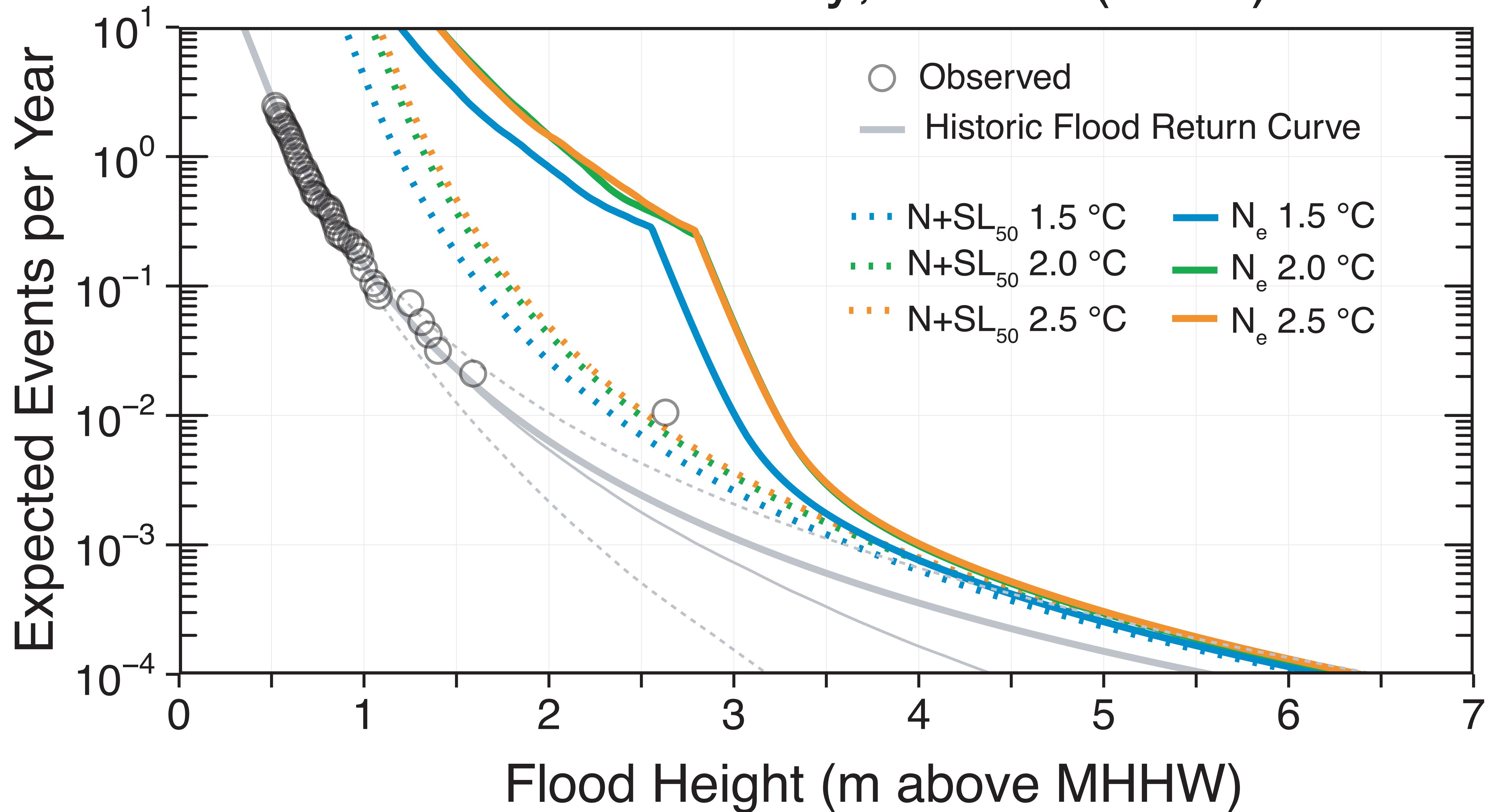
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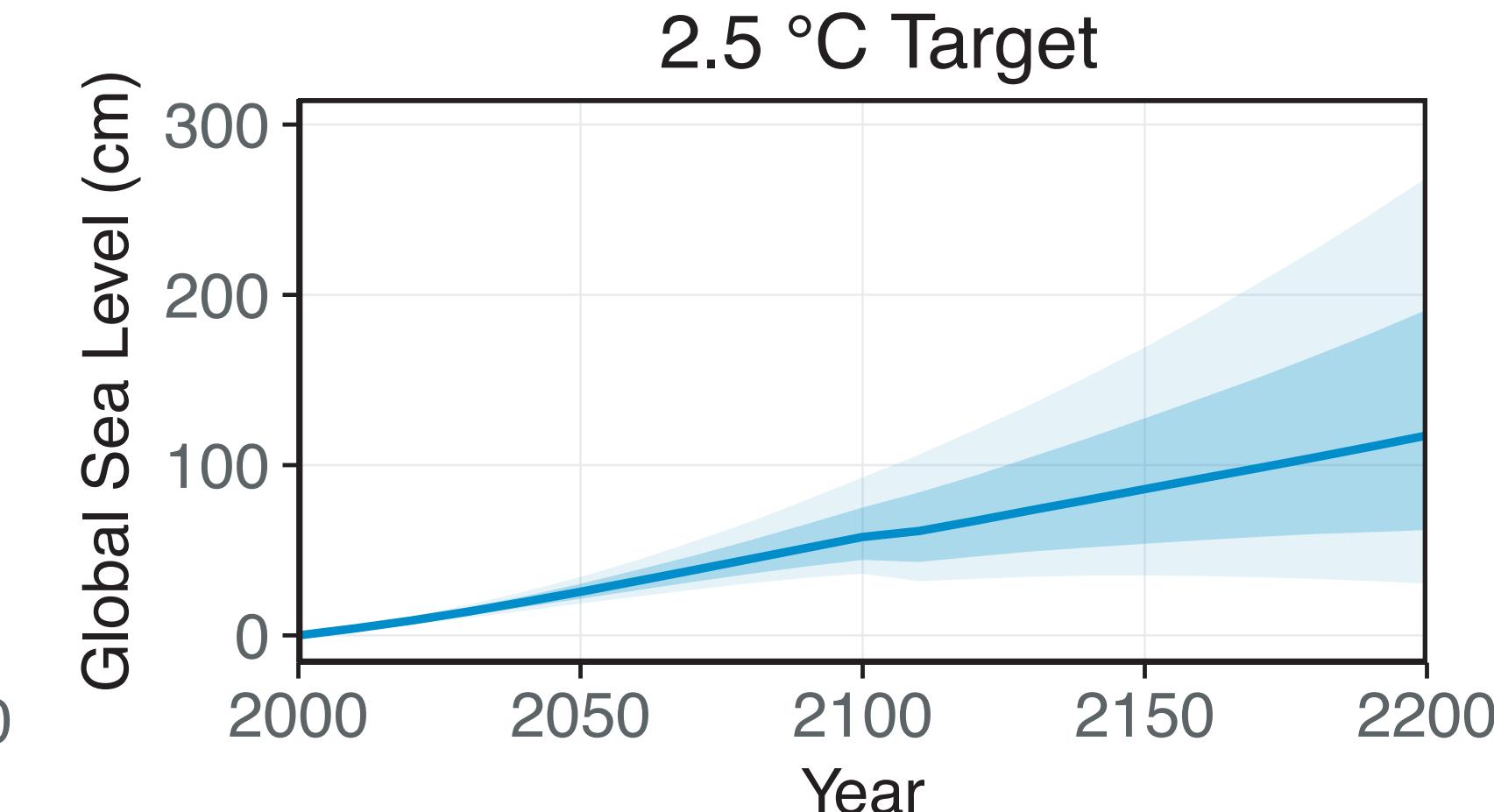
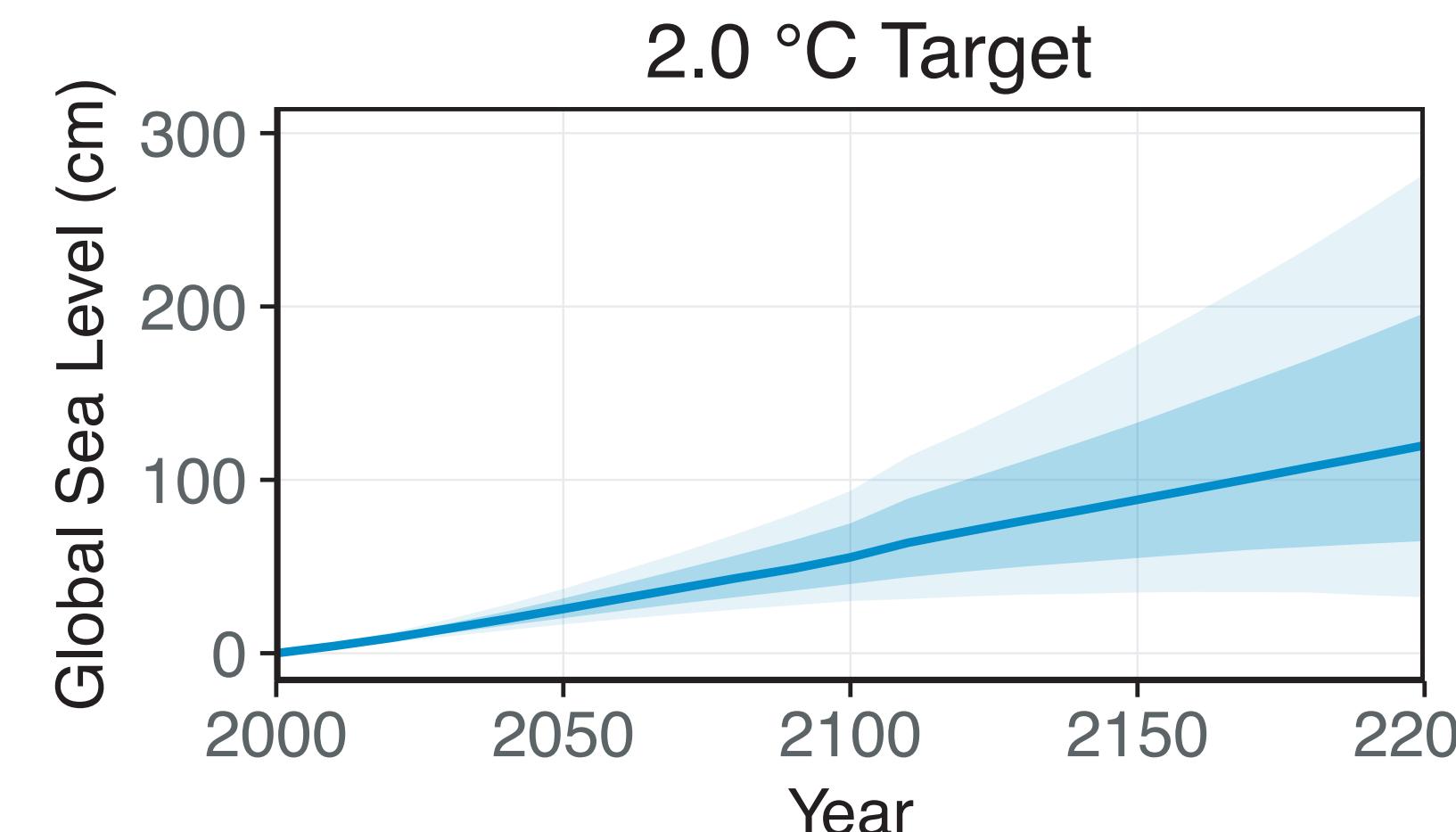
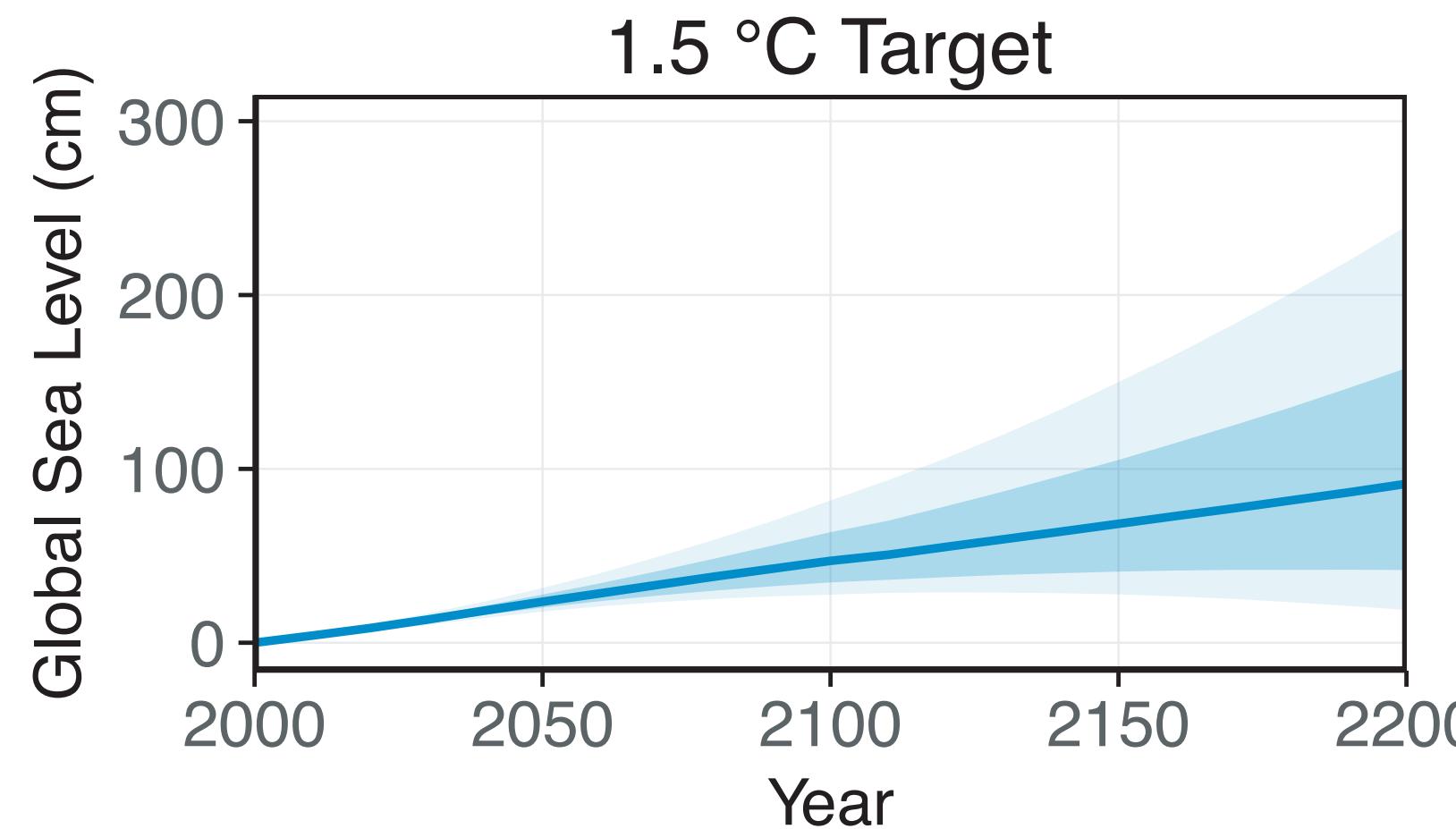
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# Global Mean Sea-Level (GSL) Rise Projections



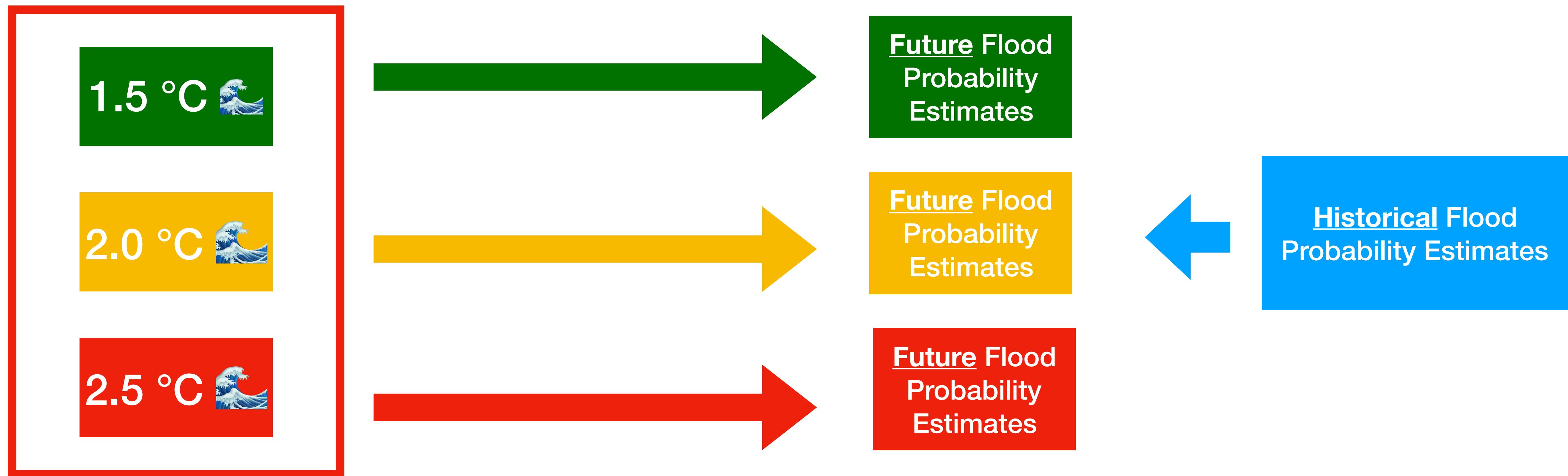
GSL projections for 2100 with RCPs (for comparison)

cm	50th	17th-83rd	5th-95th
1.5 °C	47	35-64	28-82
RCP2.6	50	37-65	29-82
RCP4.5	59	45-77	36-93

cm	50th	17th-83rd	5th-95th
2.0 °C	55	40-75	30-94
RCP2.6	50	37-65	29-82
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cm	50th	17th-83rd	5th-95th
2.5 °C	58	44-75	36-93
RCP4.5	59	45-77	36-93
RCP8.5	79	62-100	52-121

# How we project future coastal flood probabilities:



Global and Local Sea Level Rise (Kopp et al., 2014)

Global and Local Sea Level Rise projections require  
climate model (GCM) output...

**GCM output is conditional on Representative  
Concentration Pathways (RCPs)...**

**RCPs: climate policy scenarios?**

GCM output is conditional on Representative Concentration Pathways (RCPs)...

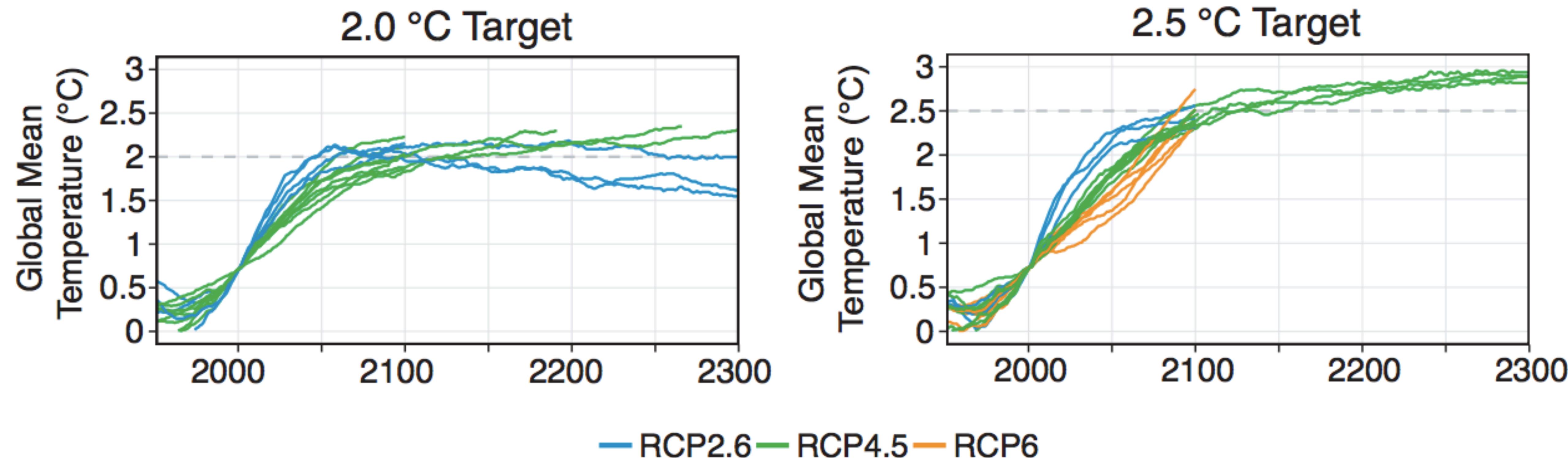
RCPs: climate policy scenarios?

**No!**

Representative of a *range* of possible emissions and forcing scenarios

Not a specific emissions target or climate policy (such as a global mean temperature stabilization)

# Solution: group GCM output based on 2100 Global mean surface temperature (GMST) instead of RCP...



Approximates GMST stabilization (kind of...)