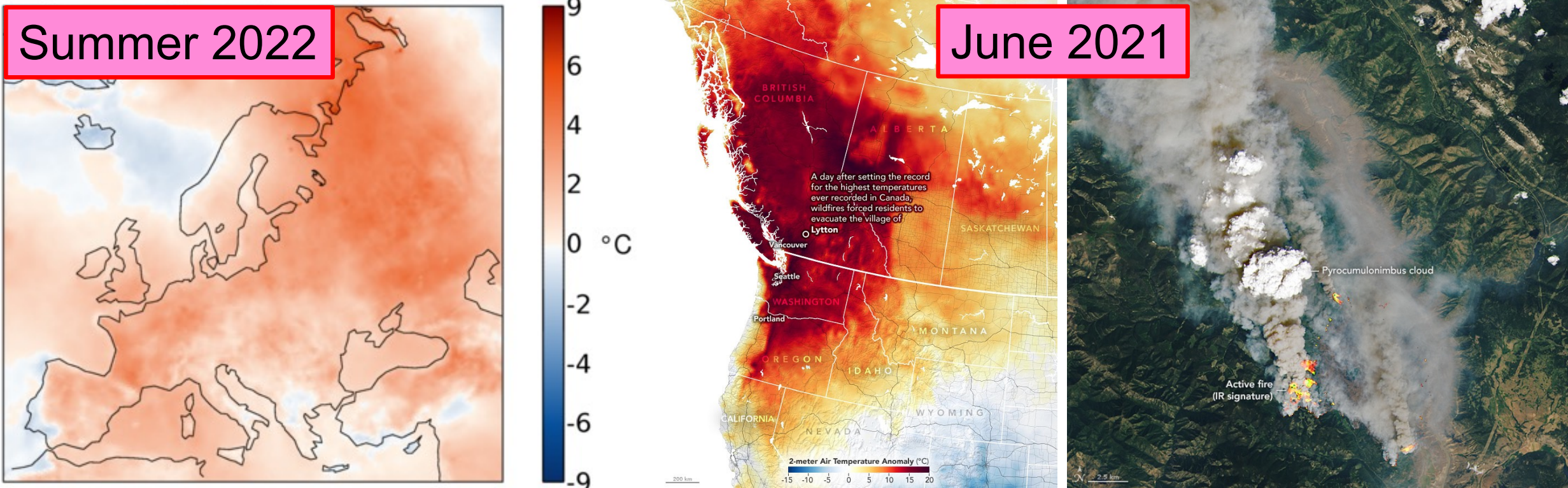


# Attribution des événements extrêmes



Laurent Terray, CECI, Cerfacs/CNRS

Journées du GDR « Défis théoriques pour le climat », Paris, 5-7 juin 2023

## Earth's Future











### COMMENTARY

10.1029/2021EF002271

## Attributing and Projecting Heatwaves Is Hard: We Can Do Better

### Key Points:

- The IPCC AR6 WG1 states the “frequency and intensity of hot extremes have increased”

Geert Jan Van Oldenborgh<sup>1</sup> , Michael F. Wehner<sup>2</sup> , Robert Vautard<sup>3</sup> ,  
Friederike E. L. Otto<sup>4</sup> , Sonia I. Seneviratne<sup>5</sup> , Peter A. Stott<sup>6</sup> , Gabriele C. Hegerl<sup>7</sup> ,  
Sjoukje Y. Philip<sup>1</sup>, and Sarah F. Kew<sup>1</sup> 

- The effect of increased greenhouse gas on high temperatures is amplified or moderated at local scales by other factors
- Confident quantitative attribution statements of the human influence on heatwaves are limited by our understanding of these local processes

# Outline

1. Extreme event attribution
2. The case of very extreme events: the June 2021 Pacific Northwest heatwave
3. Summary

# Extreme Event Attribution (EEA)

- **Question generally asked:** has climate change caused a specific extreme event (heatwave, drought, storm)?
- **Attribution science:** make robust and quantitative statements about the extent to which human influence (and other factors) have influenced the magnitude and/or probability of occurrence of extreme events
- Framing the attribution study of extreme event is key

# Extreme attribution approaches

- The standard “probability-based” approach

**Q:** How was the likelihood/magnitude of the event affected by climate change?

————→ Any extreme event is unique (will not happen again anytime soon !)

————→ Need to assess risk for a **class** of events with “*similar or greater*” impacts

- The storyline or “singular/conditional” approach

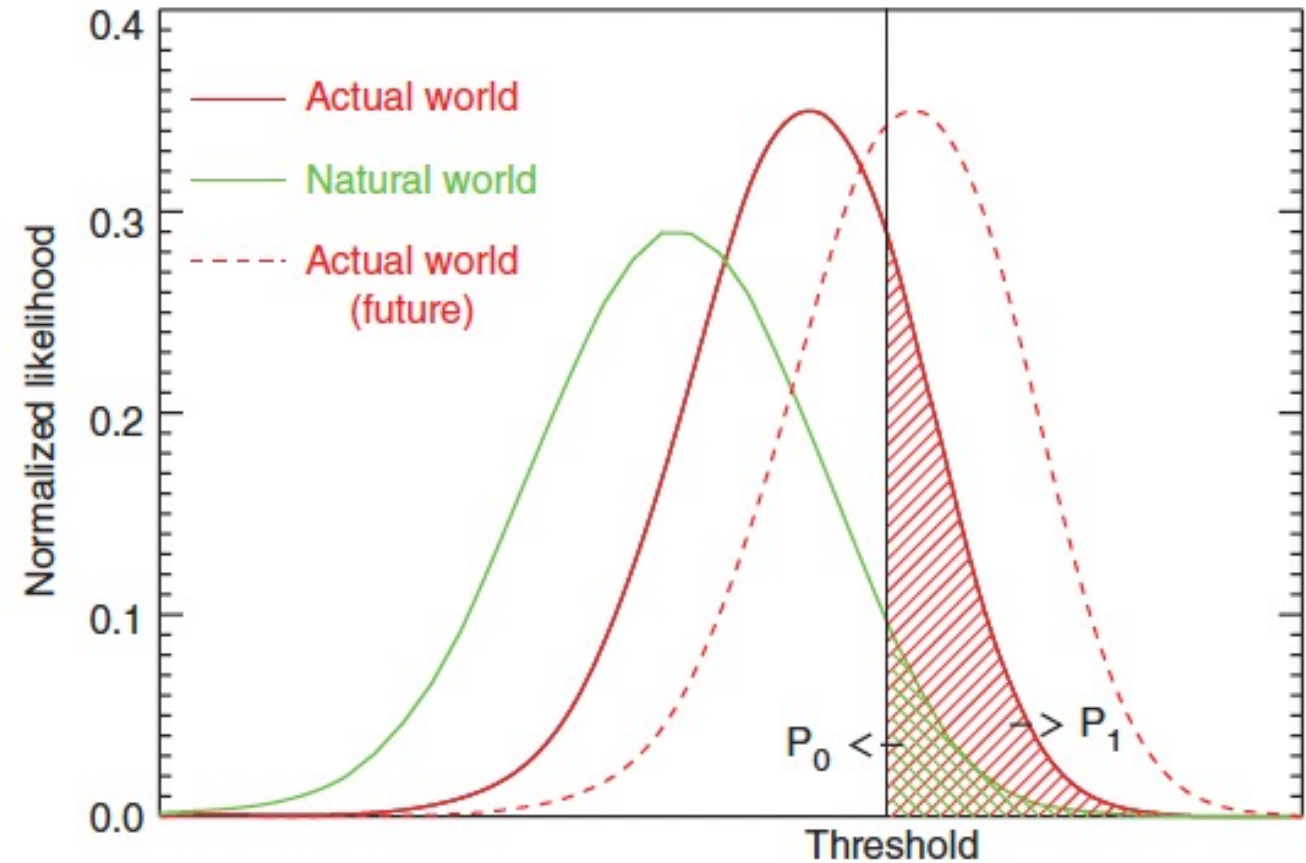
**Q:** What were the relevant causal factors that led to the event?

**Q:** How might climate change and/or internal variability have contributed to those causal factors?



# The probability-based approach

- Compare the frequency  $p_1$  of a class of events in a **factual world** (the one we live in) with that of a **counterfactual world**  $p_0$  (without anthropogenic forcing)
- **PR** =  $p_1 / p_0$ .     **FAR** =  $1 - p_0 / p_1$



Class of events

# The probability-based approach in practice

Probability –  
based  
approach

Without models

**Empirical approach**

*Statistical fit to Obs. ★*

**Analogue approach**

*Observations/reanalysis*

With models

**Coupled model approach**

1. *Unconditional*

2. *Conditional: external forcings ★  
modes (AMV, PDV), atmospheric  
circulation*

**Atmospheric model approach**

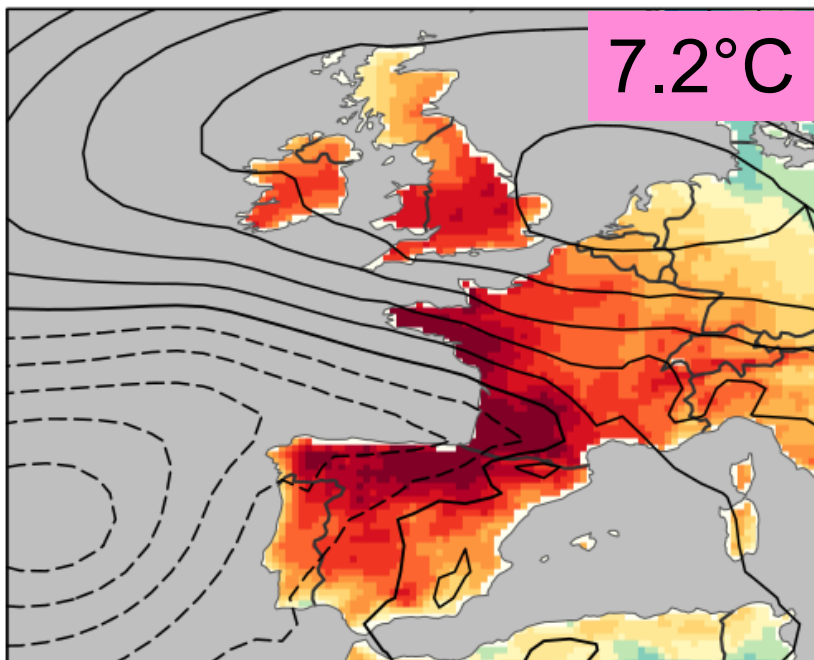
1. *Conditional to SST/SIC ★*

2. *Atmospheric circulation, soil moisture*

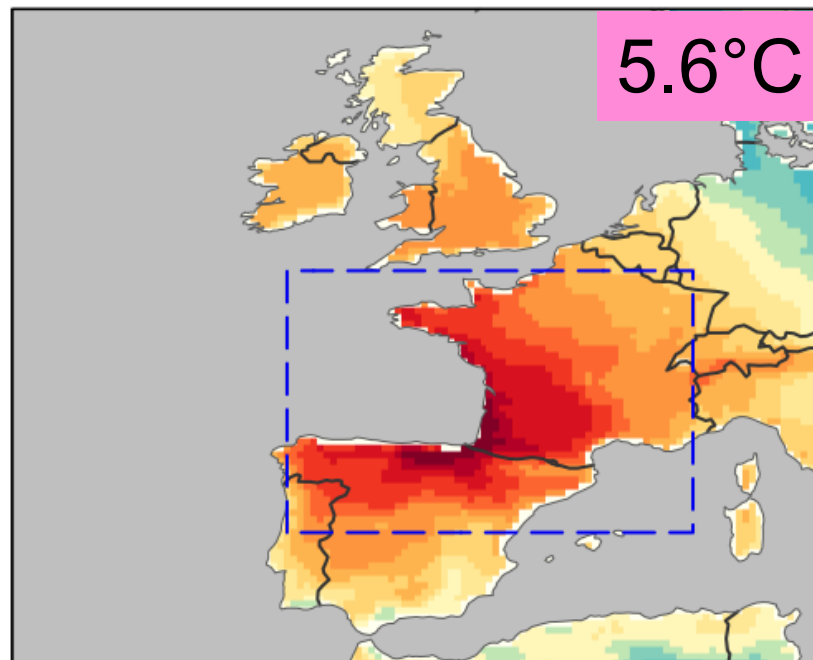
# The storyline/conditional approach

- Heatwave 15–18 July 2022
- Conditional to the atmospheric circulation (dynamical adjustment)

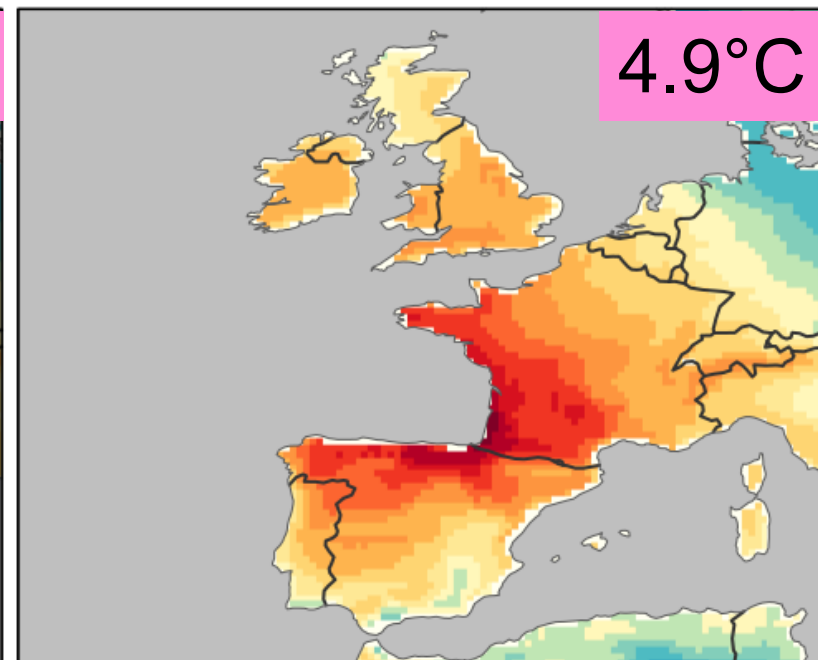
TX Anomaly



Dynamic Factual



Counterfactual





# The WWA protocol

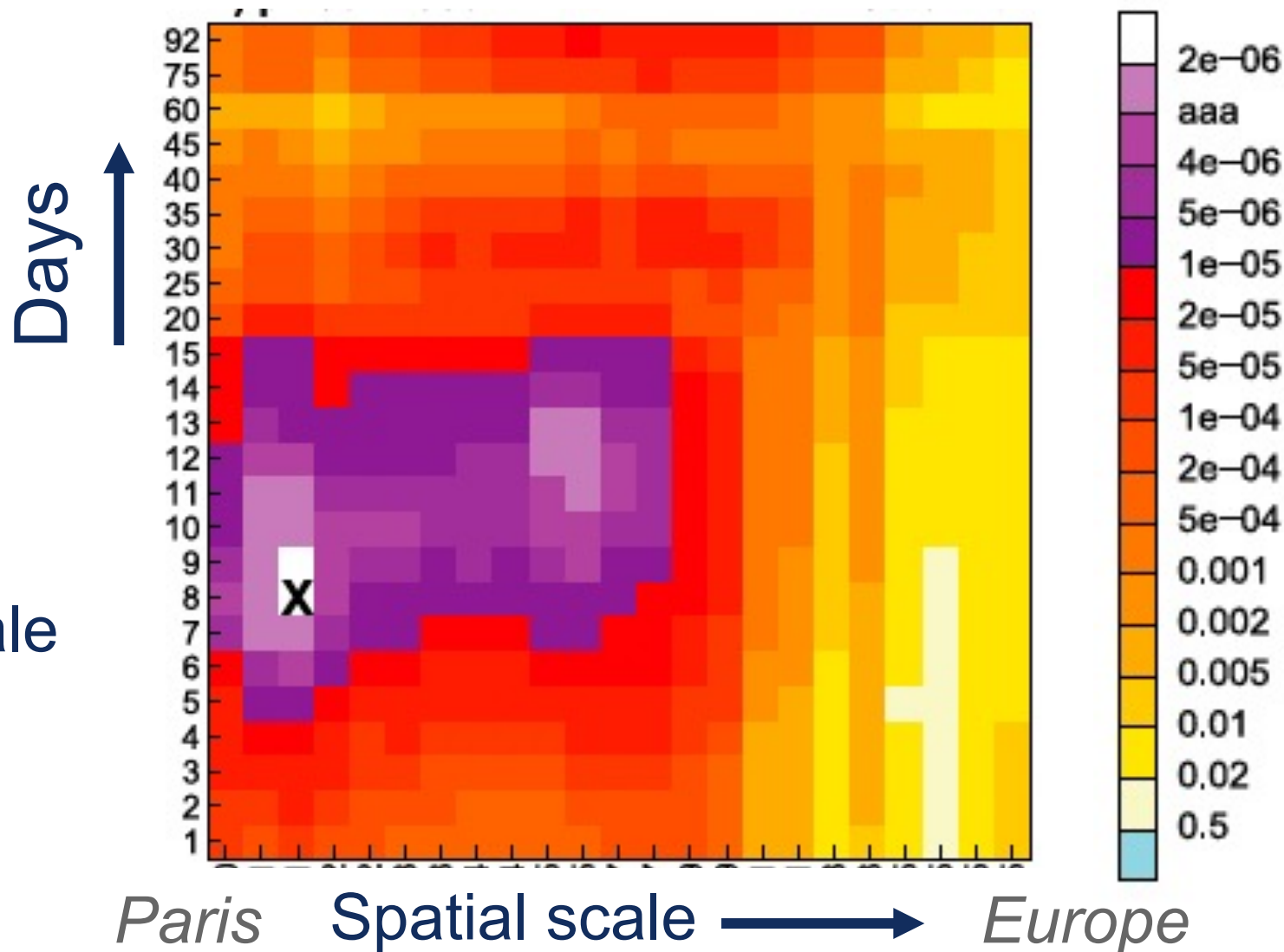
- Analysis trigger
- Event definition: spatial and time scale
- Observed analysis (GEV Fit and trend)
- Model evaluation and selection: statistical description and physical causes of extremes
- Multi-method – multi-model attribution
- Synthesis and communication

# Define the class of events: spatial and time scales ?

- Maximizing the rarity of the extreme event (minimize  $p_1$ )
- 2003 heatwave
- Temp. June 1, Paris
- 1950 – 2015
- Gaussian fit

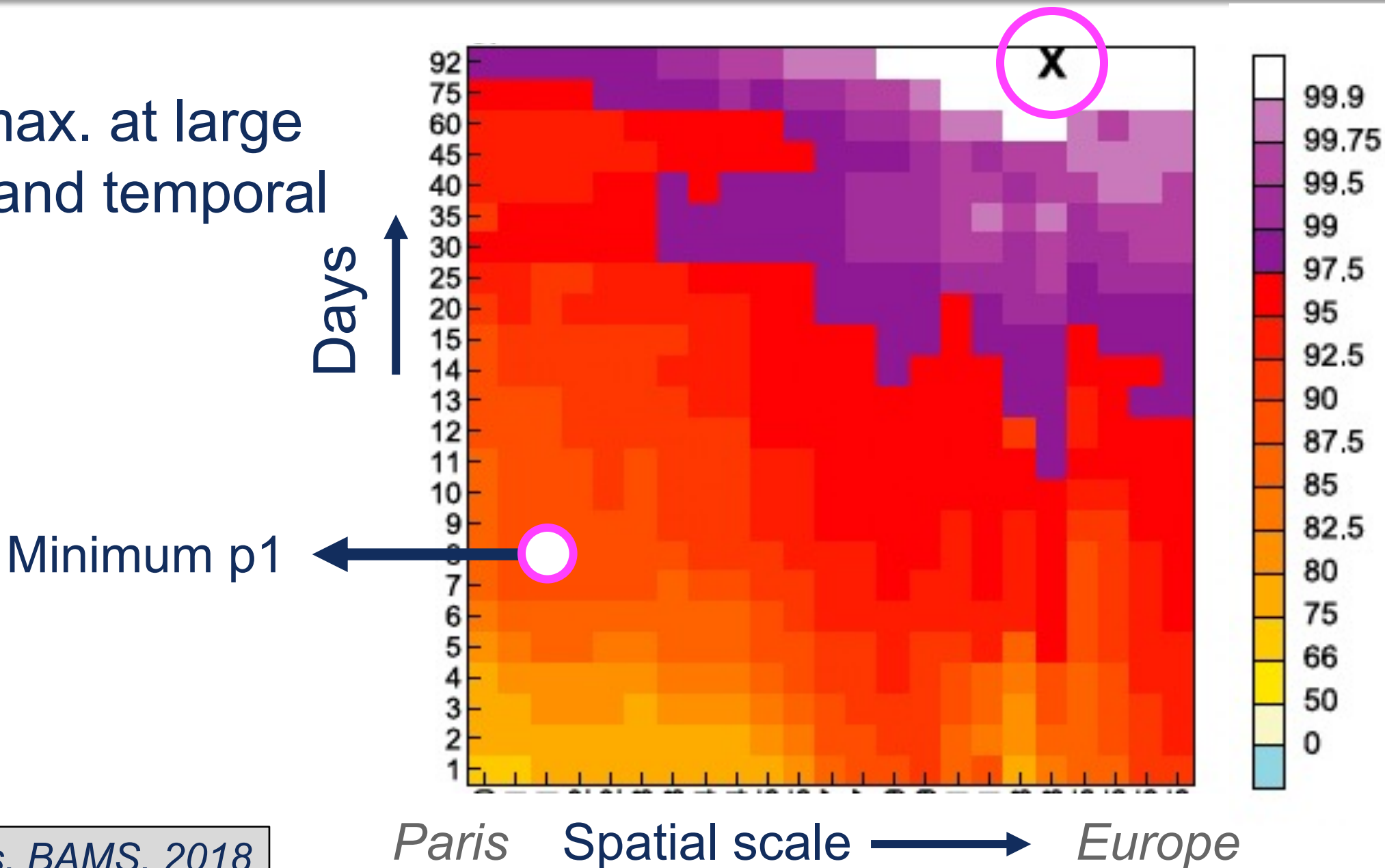
Minimize ( $P_1$ ):

→ 8 days and small scale



# Maximizing the rarity does not bias attributable risk

- FAR : max. at large spatial and temporal scales



# Observations: GEV fit and trend

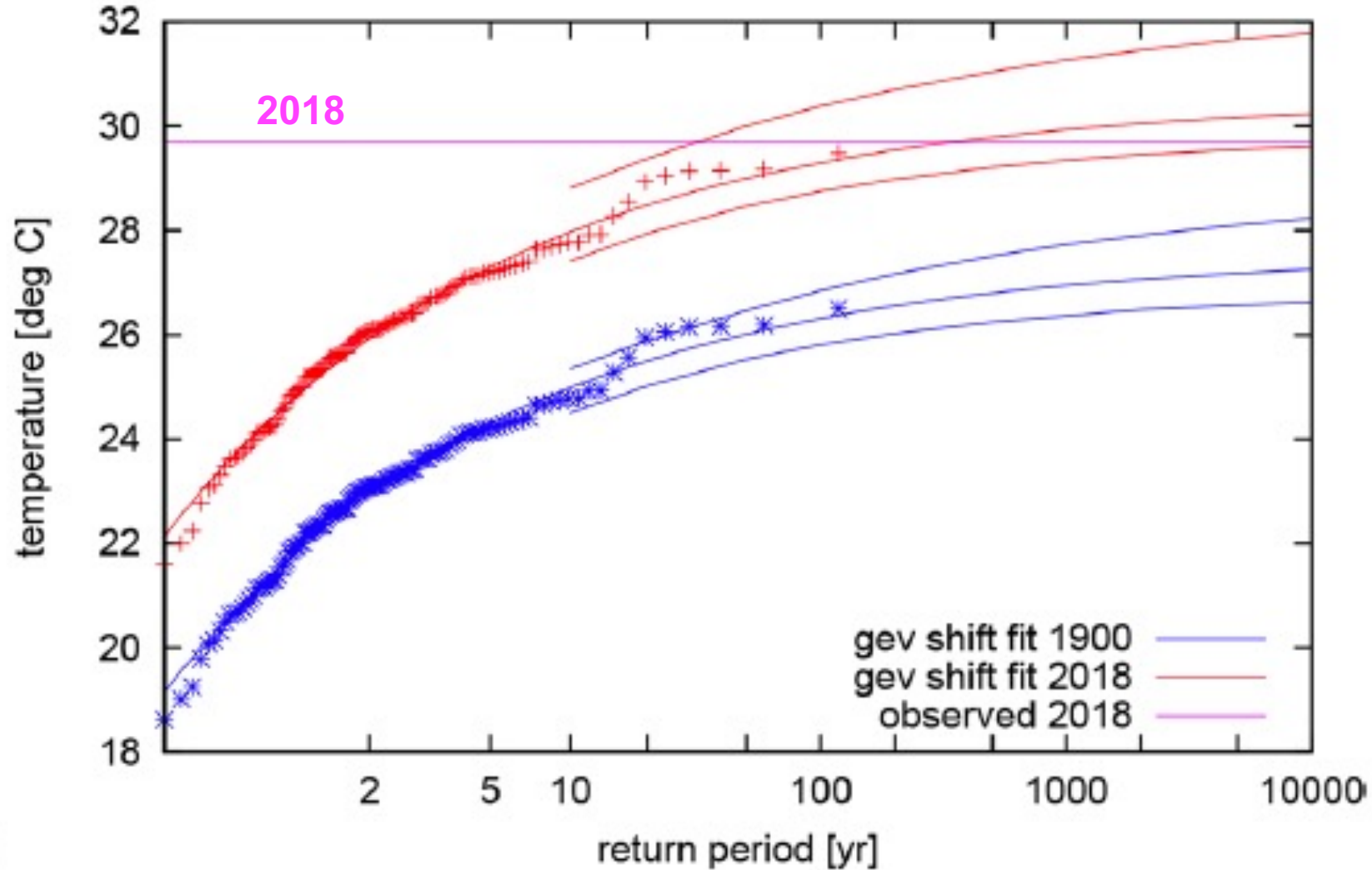
- Generalized extreme value distribution: block maxima

$$P(x) = \exp \left[ - \left( 1 + \xi \frac{x - \mu}{\sigma} \right)^{-1/\xi} \right]$$

- Assume trend scales with GMST :  $\mu \sim \mu_0 + \beta \cdot \text{GMST}$
- Fit: estimation of  $\beta$  in addition to the GEV parameters

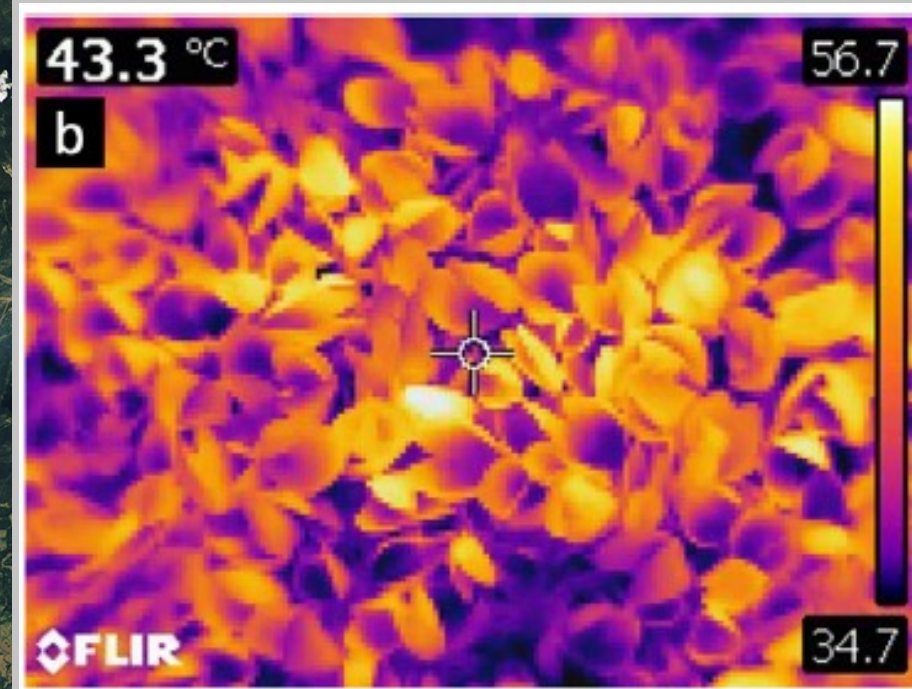
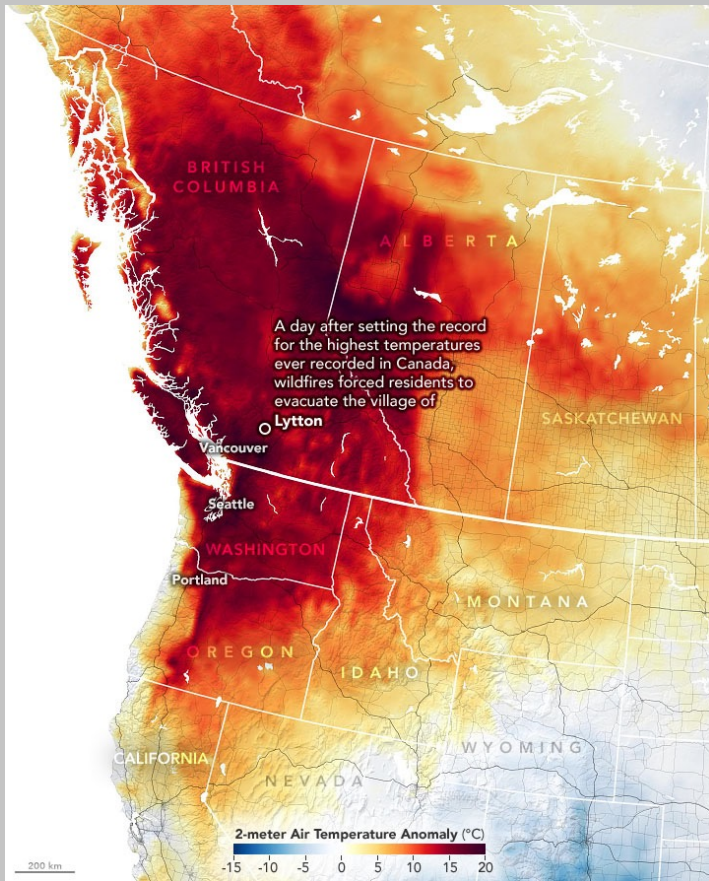
# Observations: GEV fit and trend

- Annual Max. TX in De Bilt (1900–1917)



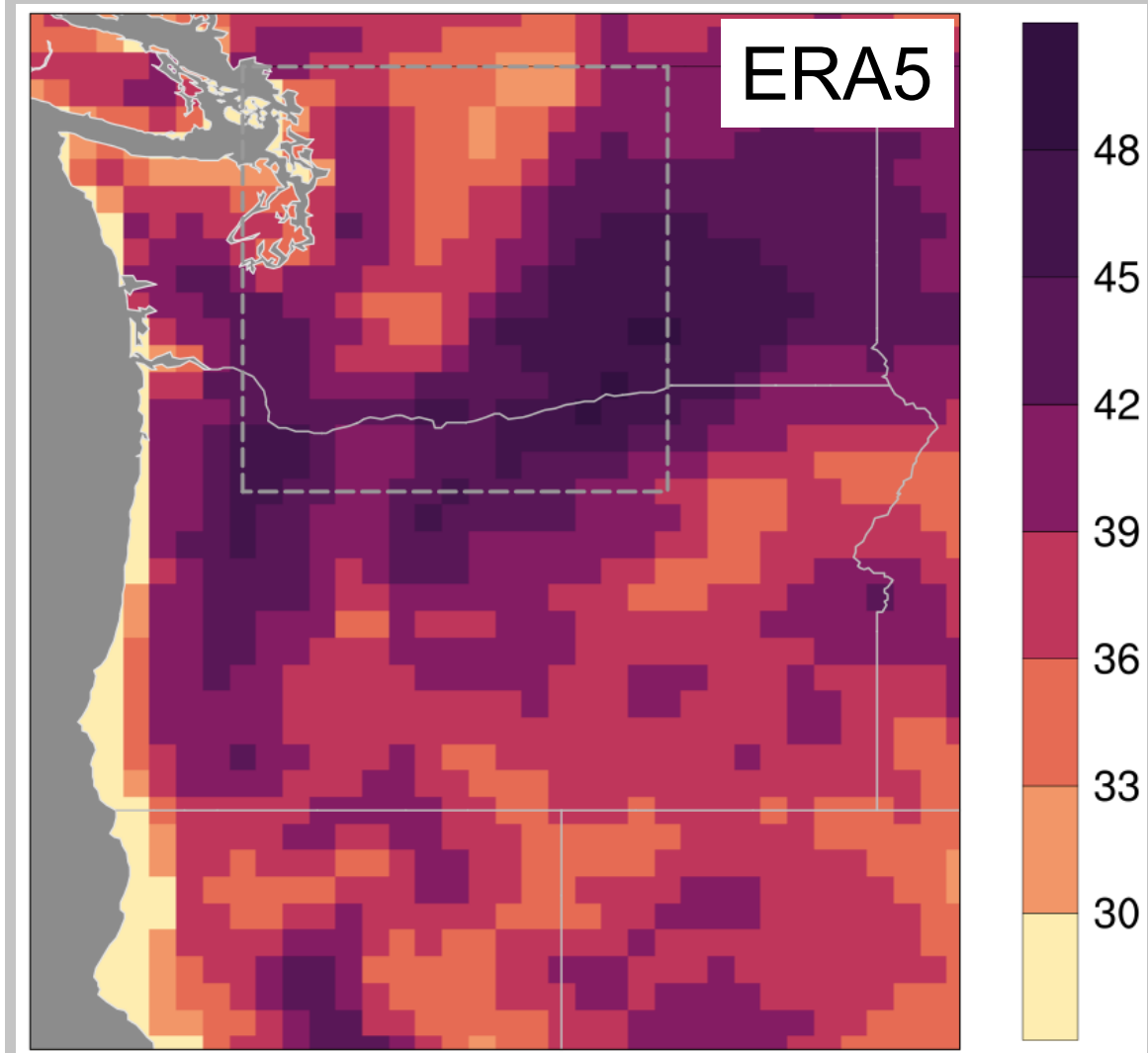
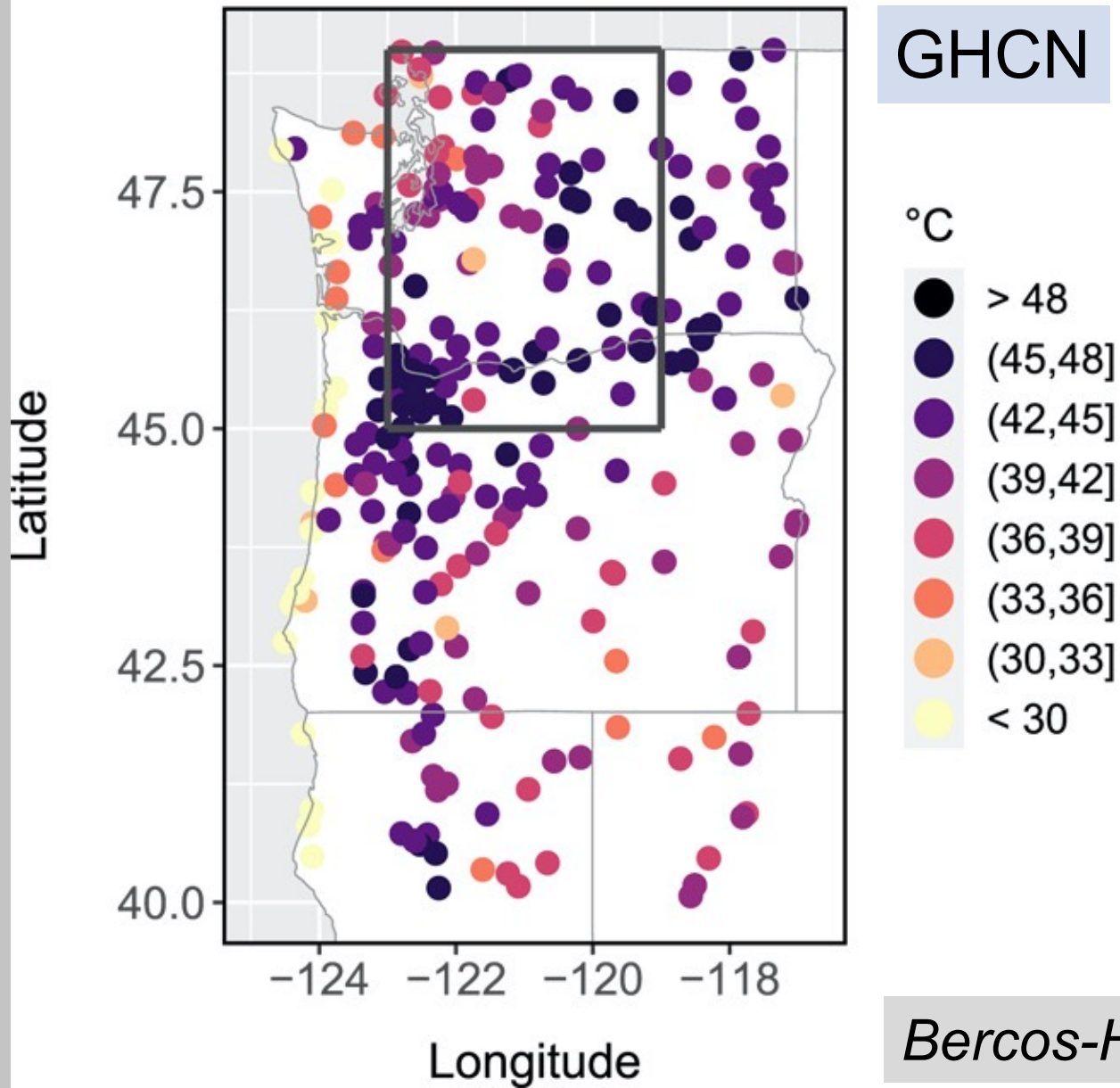


# The June 2021 Pacific Northwest heatwave



# ERA5 and Observations for late June 2021

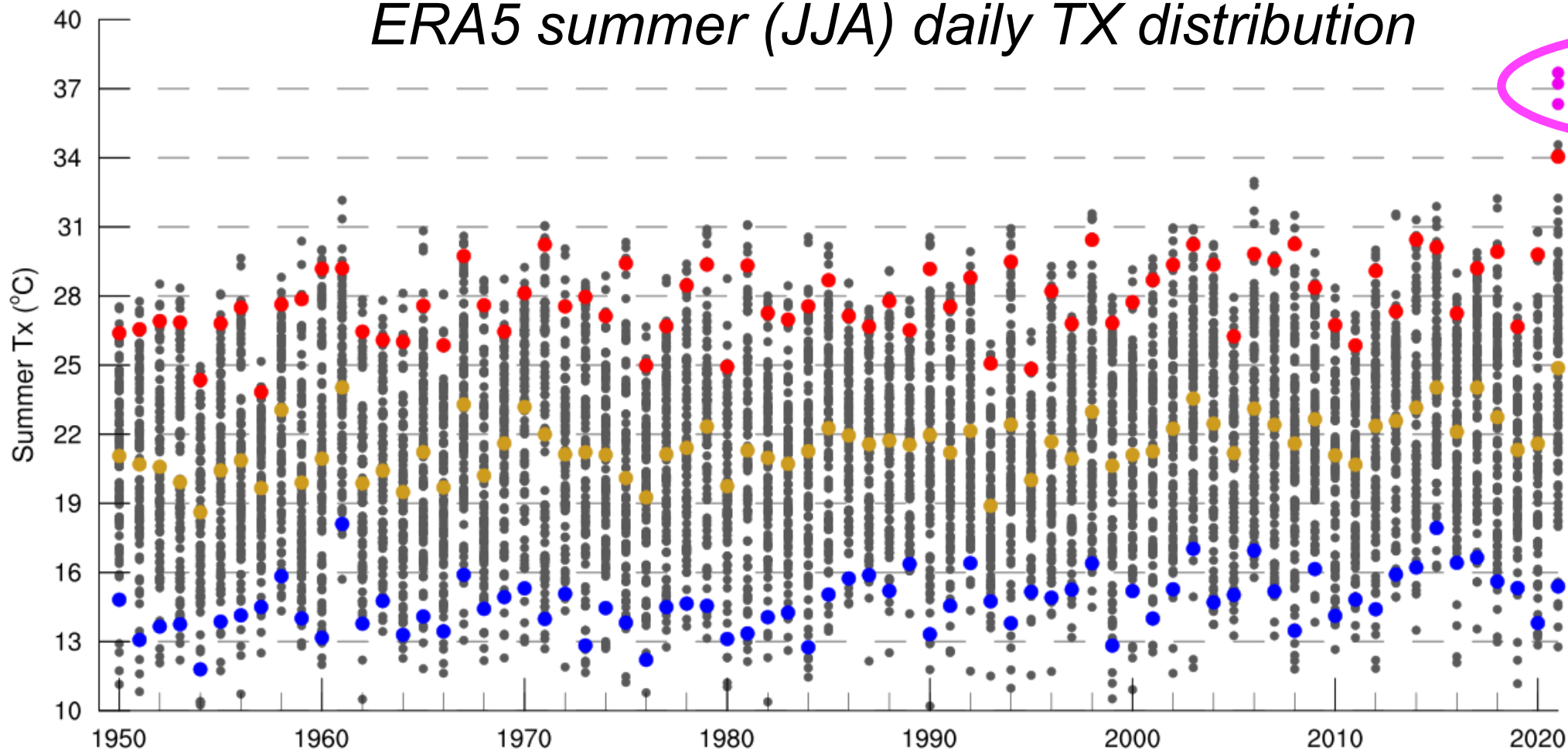
(a) max Tmax: 6/25/21 – 7/4/21





# The extreme character of the June 2021 heatwave

*ERA5 summer (JJA) daily TX distribution*



June 28–30

5- $\sigma$  event

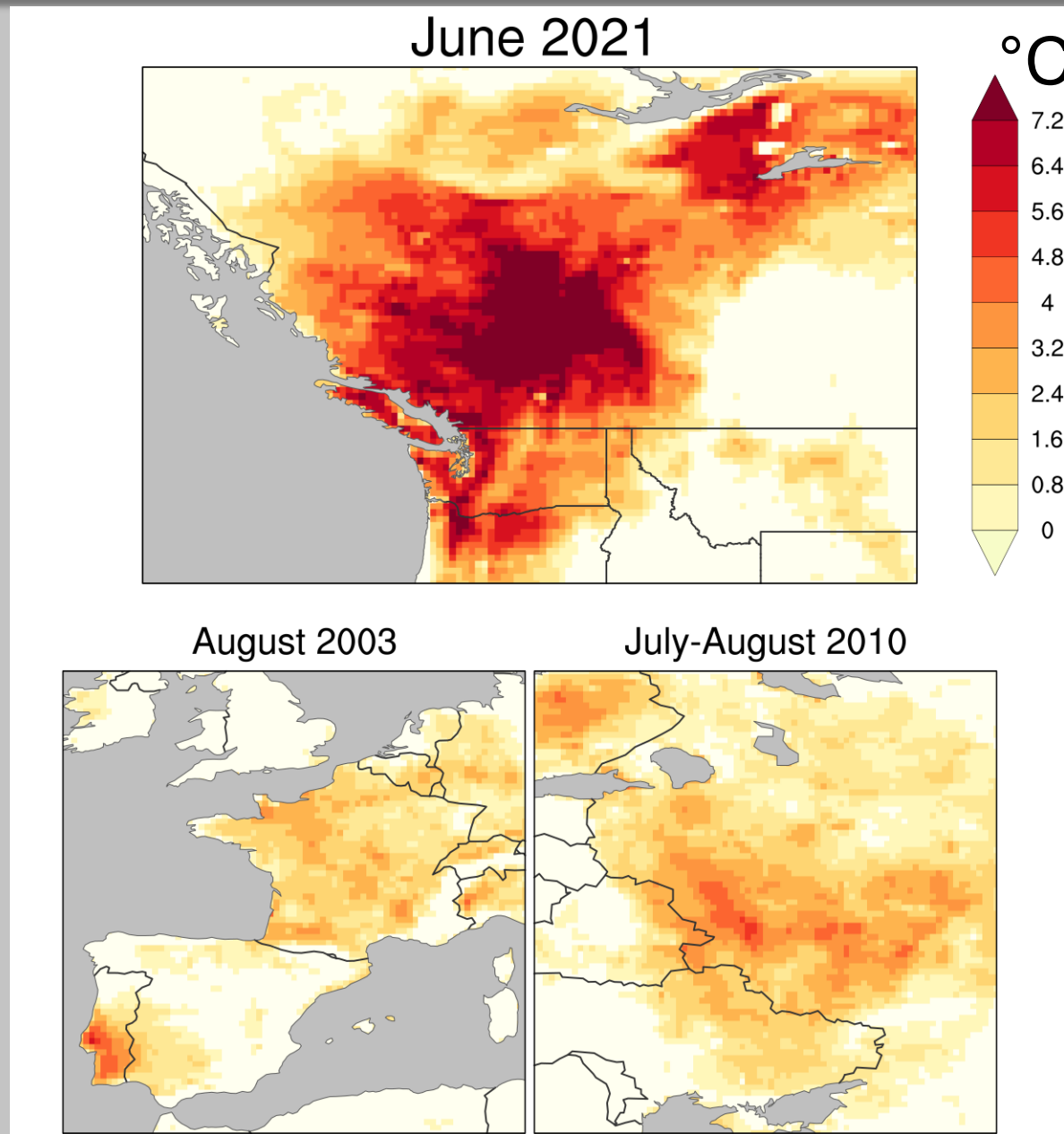
TX percentiles

- 95<sup>th</sup>
- 50<sup>th</sup>
- 5<sup>th</sup>

# The extreme character of the June 2021 heatwave

Increase in new TX records for 3 heatwaves:

- June 2021 (Canada)
- August 2003 (Europe)
- July-August 2010 (Russia)



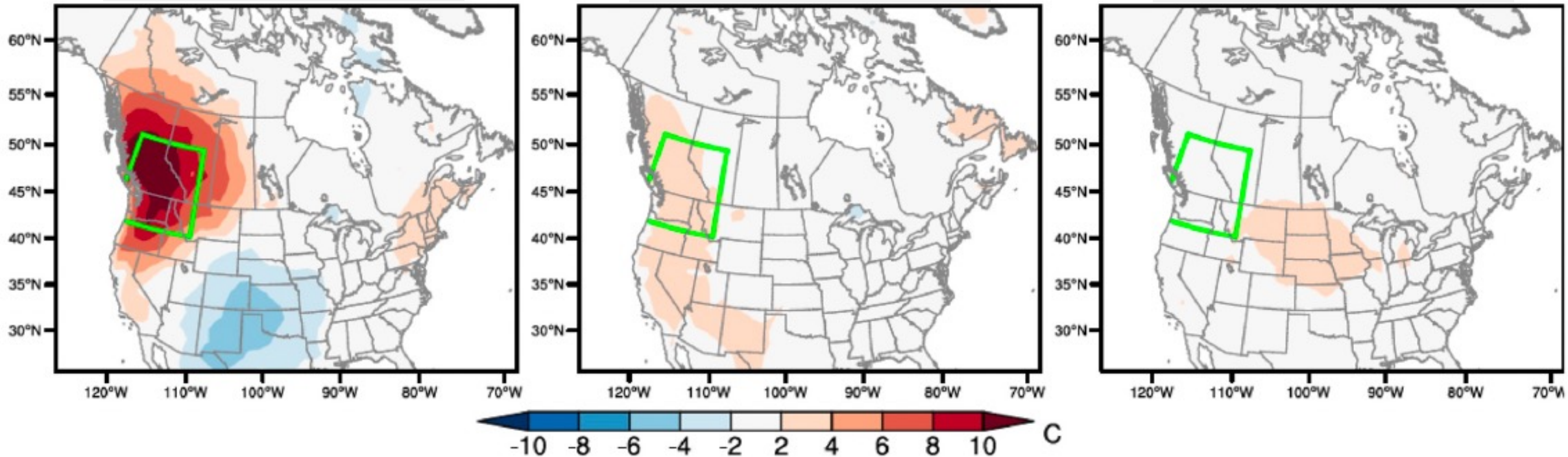
# Was the June 2021 heatwave predicted ?

- Initialized S2S ECMWF forecast system

Initialized June 24

Initialized June 17

Initialized June 10

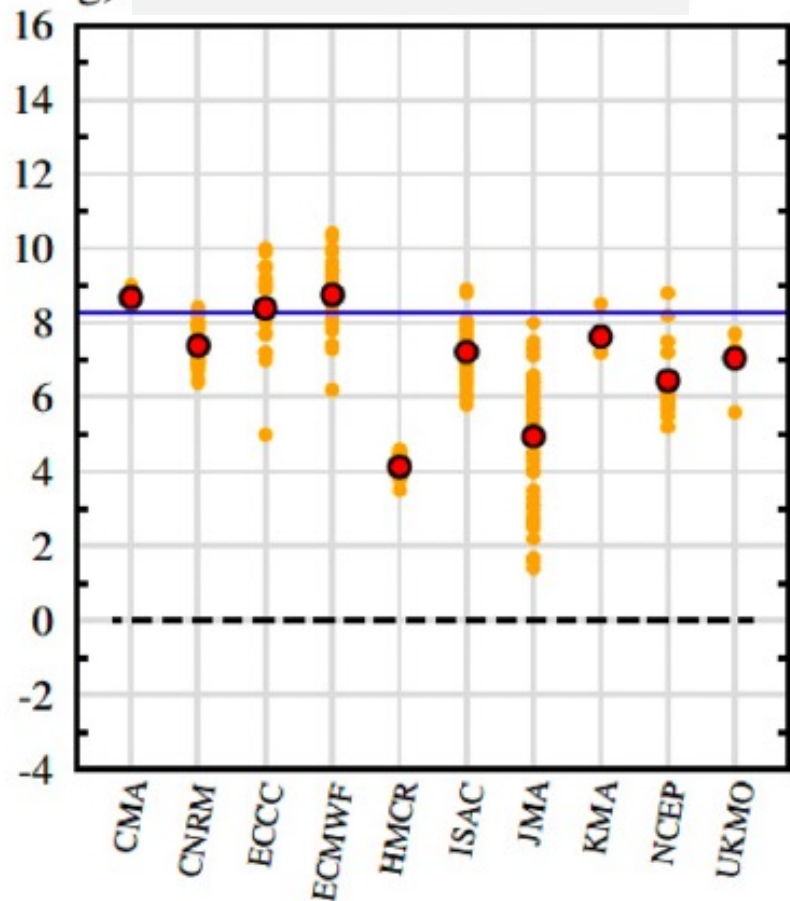




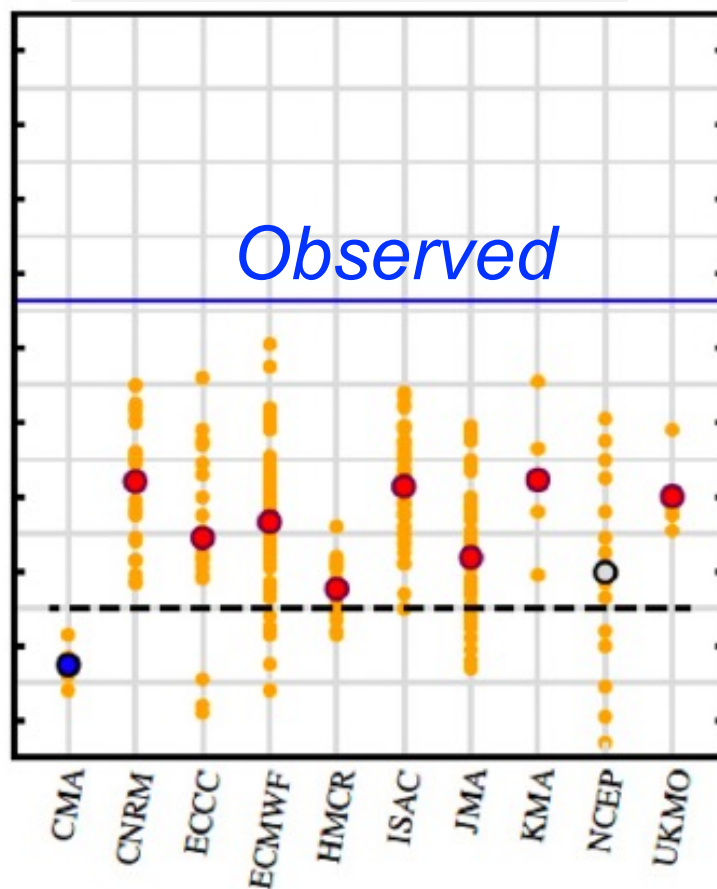
# Was the June 2021 heatwave predicted ?

- S2S Multi-Model forecast system
- Prediction of box-averaged temperature

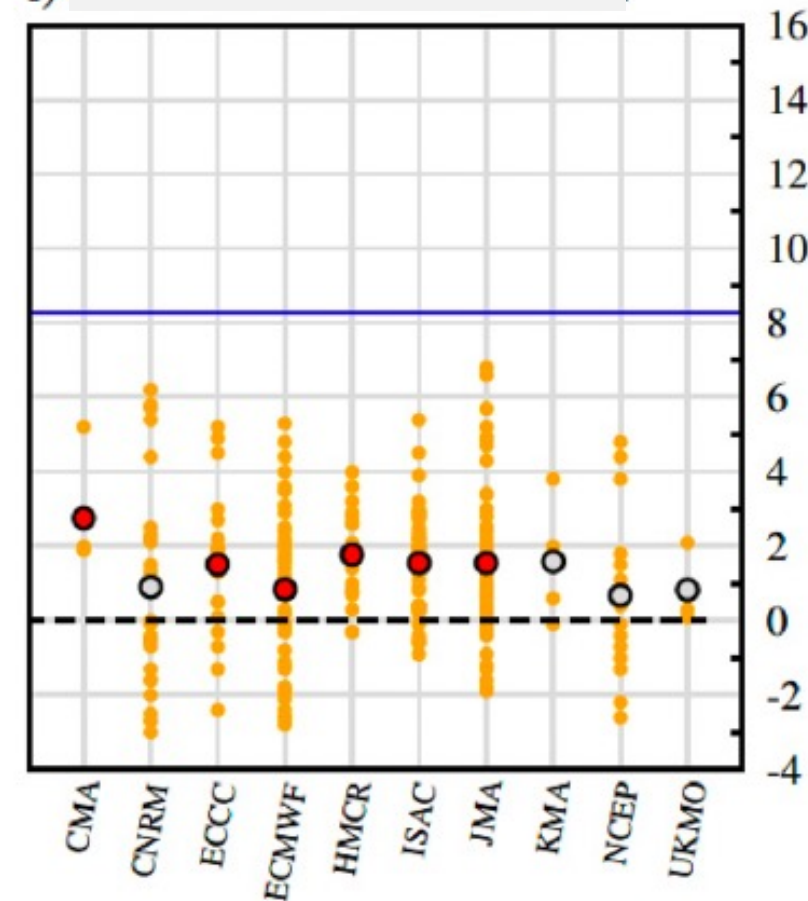
g) Initialized June 24



h) Initialized June 17



i) Initialized June 10

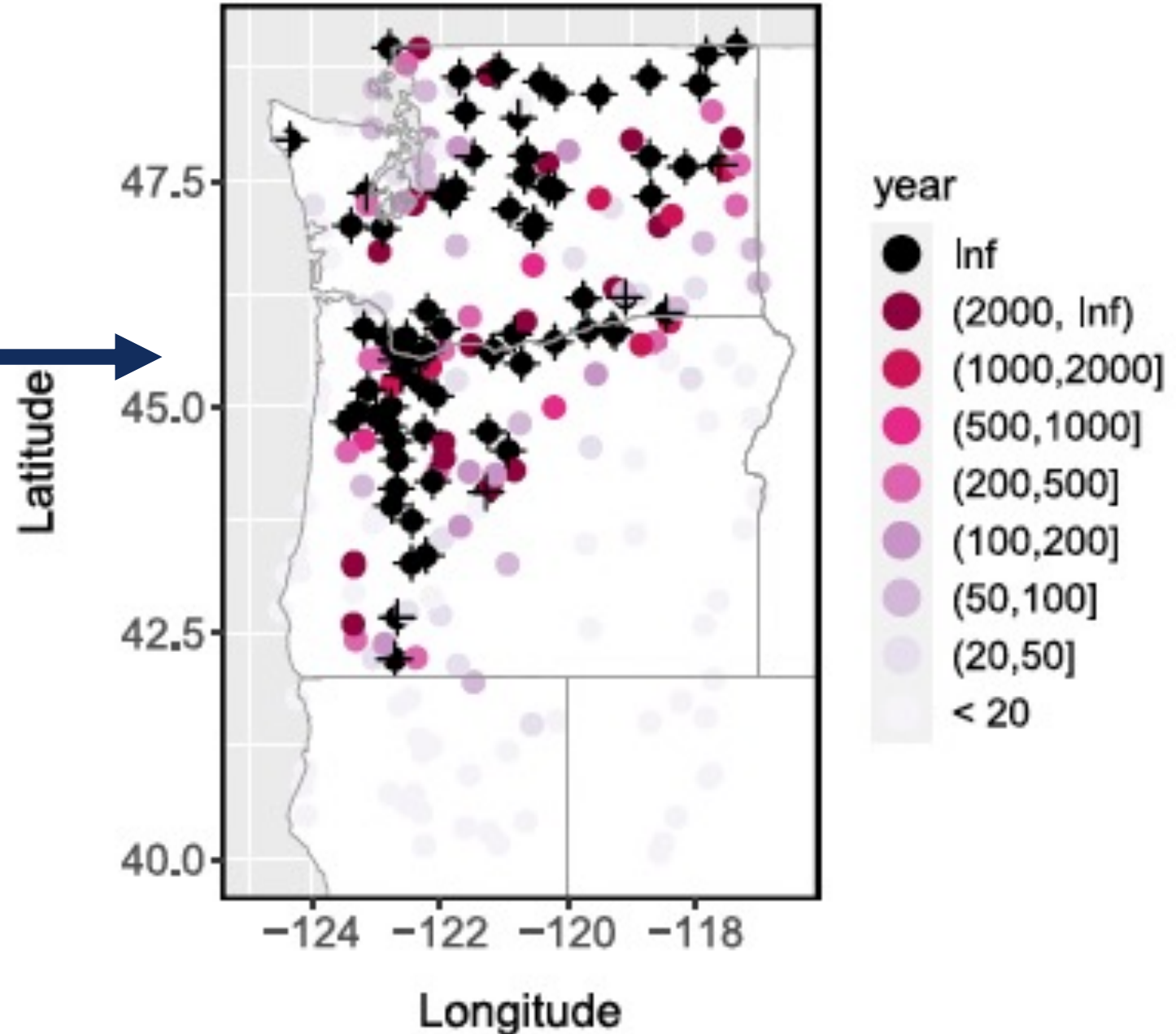


# The probability-based approach fails ....

Out of sample: non-stationary GEV fit

Infinite return periods !

In sample (including 2021):  
poor fit to the past data !



# Storyline approach: drivers of the June 2021 heatwave

Four main potential ingredients:

- The atmospheric circulation pattern
- *A soil moisture deficit*
- *A late June atmospheric river*
- *Possible ocean influence (PDO) ?*

# The atmospheric precursor

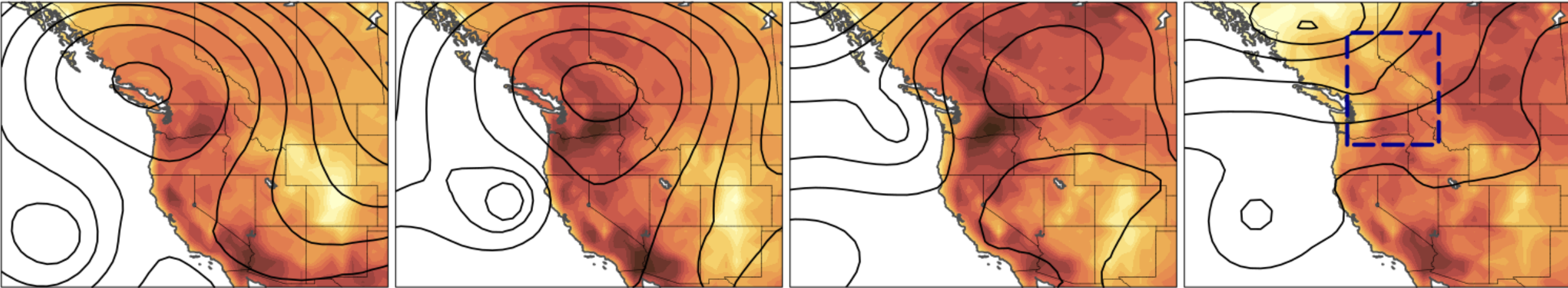
- ERA5 : maximum temperature (TX), 500-hPa geopotential height (Z500)

June 26

June 28

June 30

July 2



Dynamic contribution to the heatwave ?

# Dynamical Adjustment

- Separate the variability due to atmospheric circulation (*the dynamic component*) from a residual (« *thermodynamic* » *component*)
- Method based on constructed daily analogues (here Z500, 500 hPa geopotential height) to derive the TX (maximum temperature) dynamical component
- TX dynamic component is estimated in both factual and counterfactual worlds (removing a smooth non linear trend from TX data)

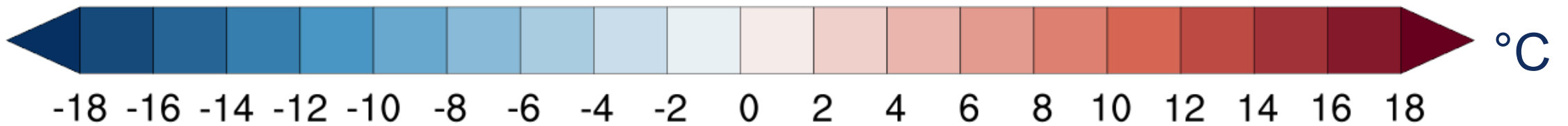
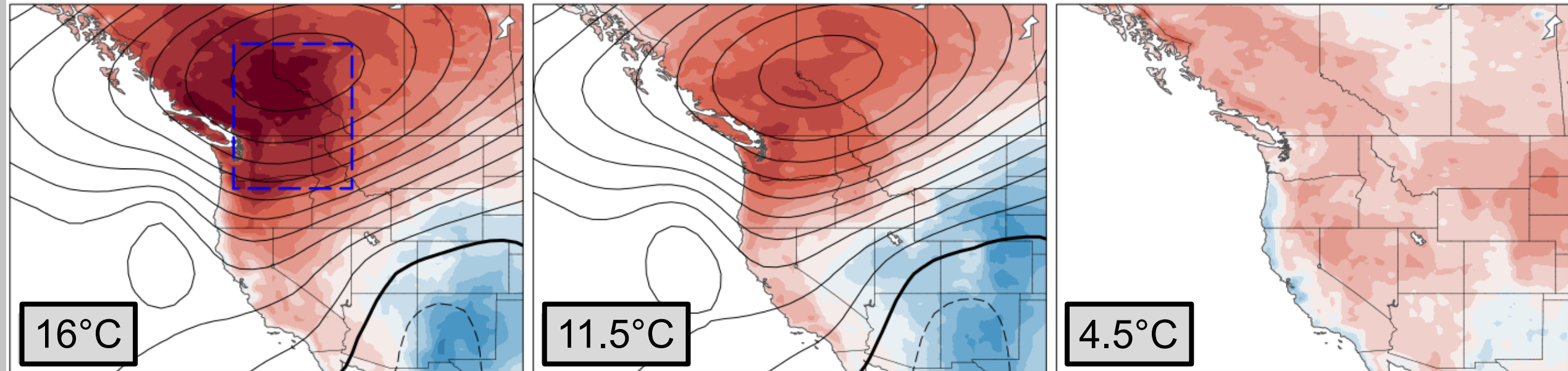


# Heatwave Dynamic Component

a) Observed

b) Dynamic

c) Residual



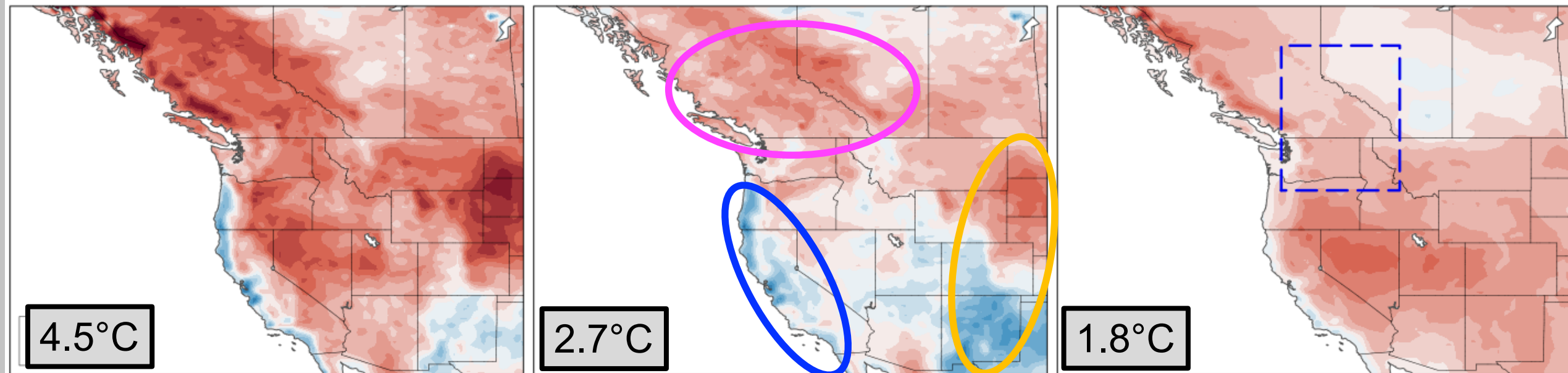
*TX anomalies relative to the 1991-2020 climatology*

# Residual: Internal and Forced Contributions

a) Residual

b) Internal

c) Forced



Note: different color scale !

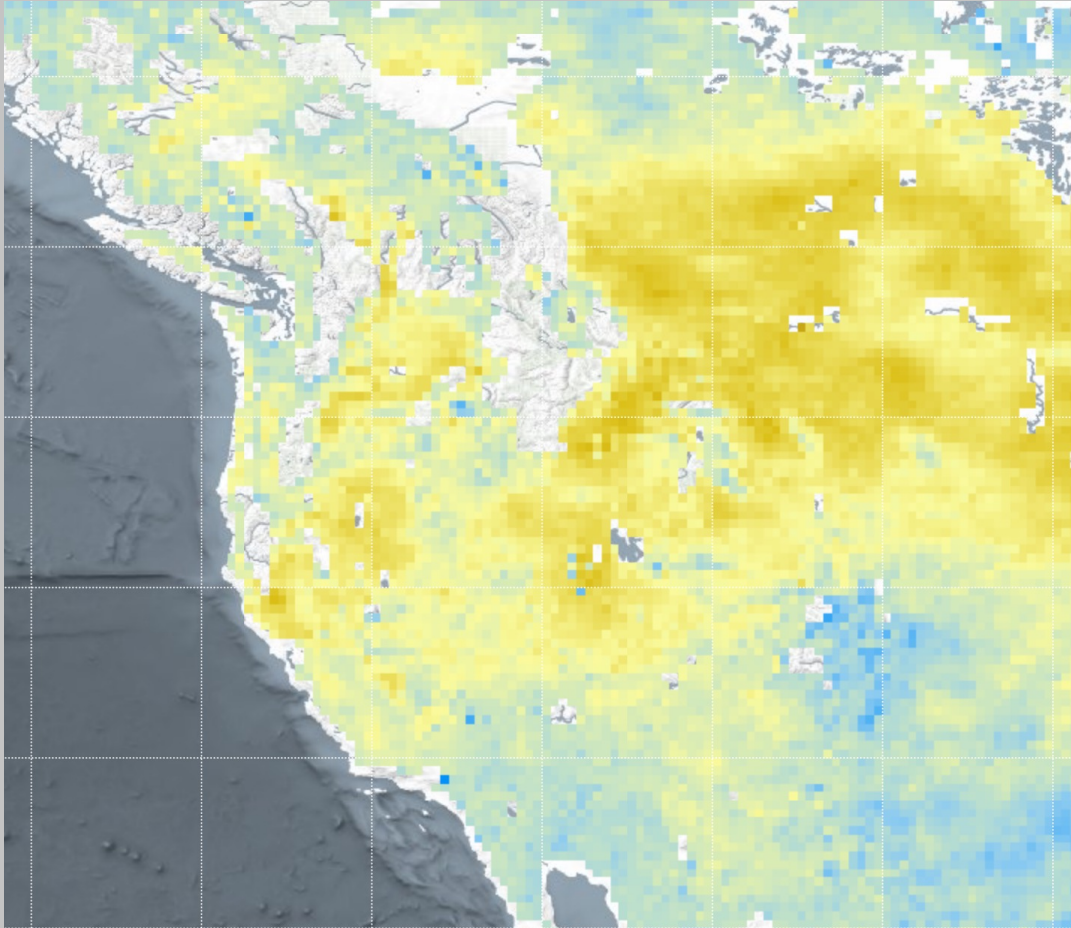
# Drivers of the June 2021 heatwave

Four main potential ingredients:

- *The atmospheric circulation pattern*
- **A soil moisture deficit**
- *A late June atmospheric river*
- *Possible ocean influence (PDO) ?*

# Soil moisture deficit in June 2021

ESA CCI product (%)

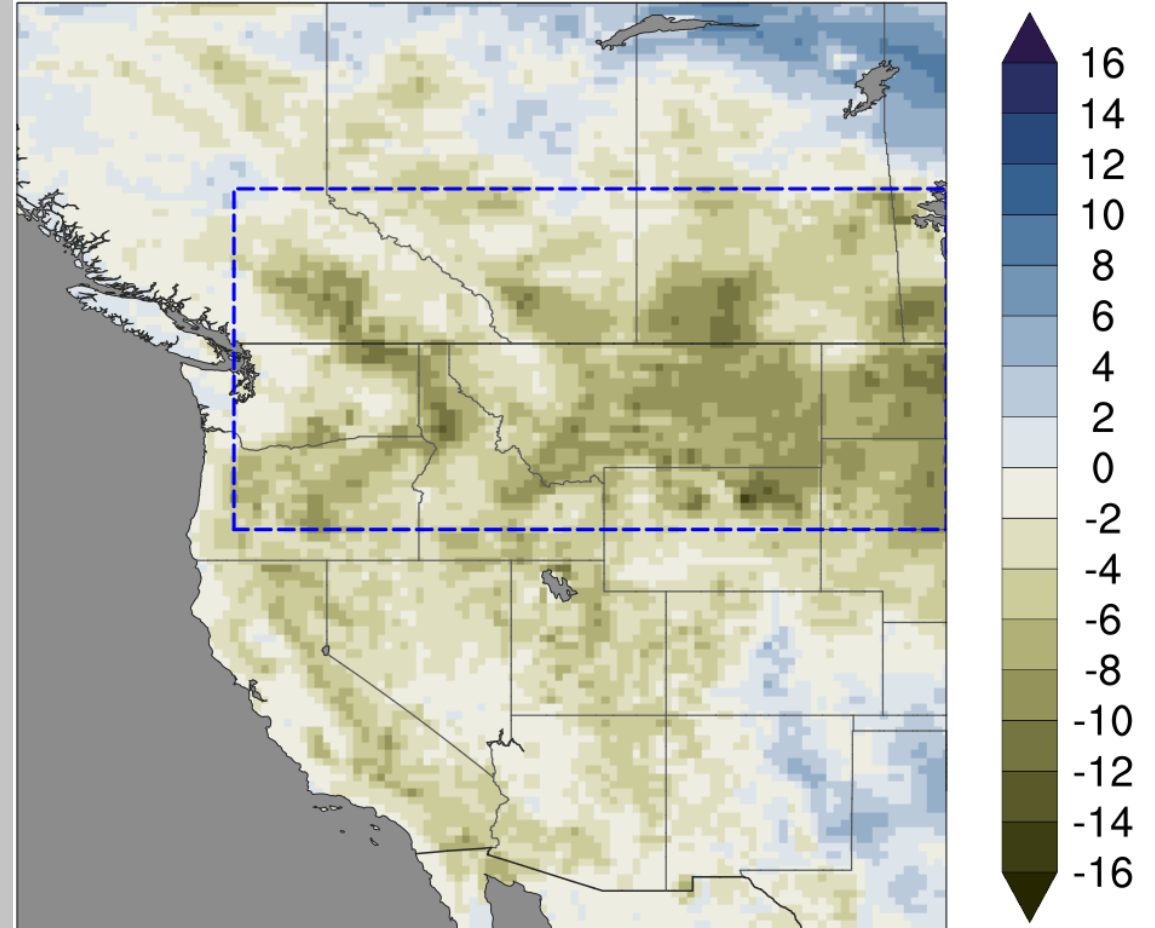


-16

+16



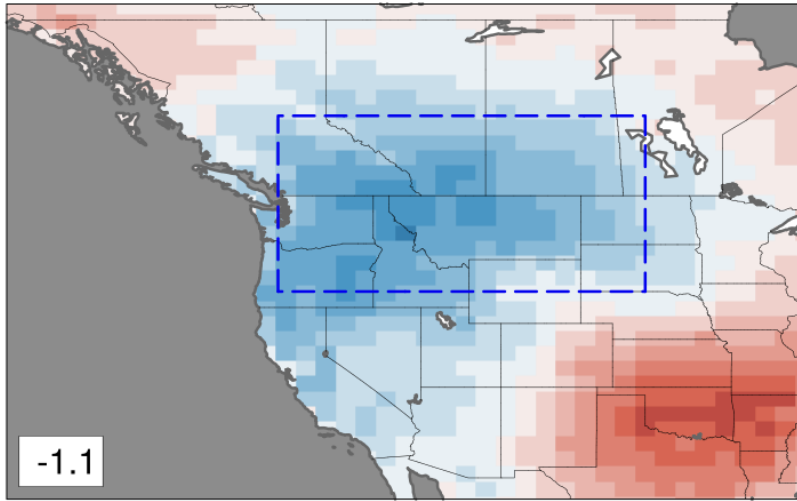
ERA5 (%)



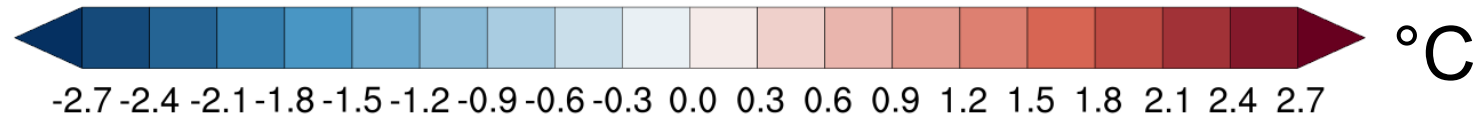
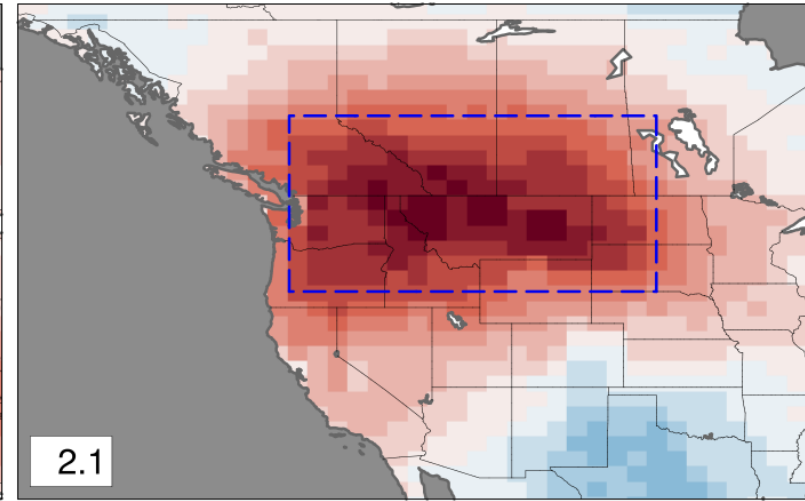
16  
14  
12  
10  
8  
6  
4  
2  
0  
-2  
-4  
-6  
-8  
-10  
-12  
-14  
-16

# Summer TX composite ERA5

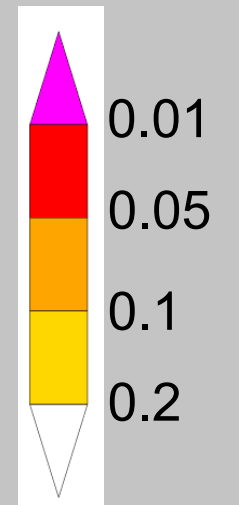
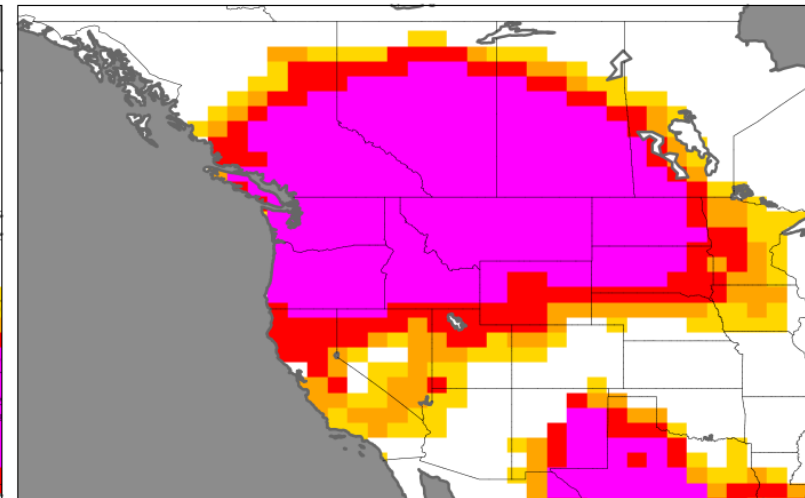
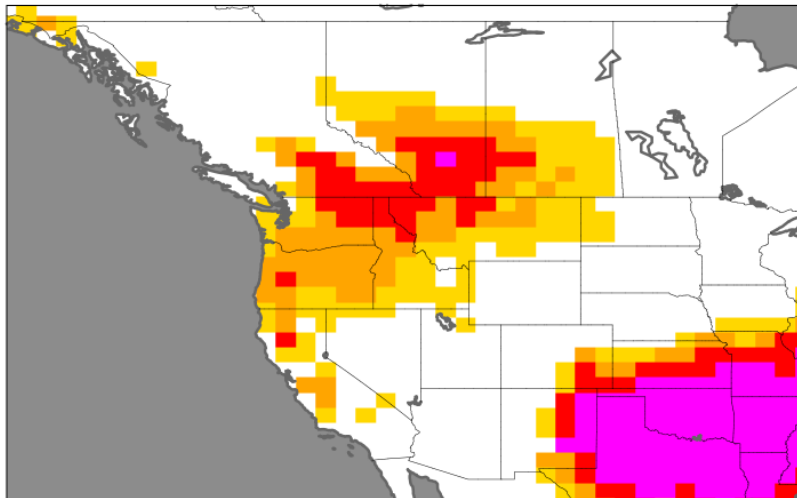
SM +



SM -



$P\_value$



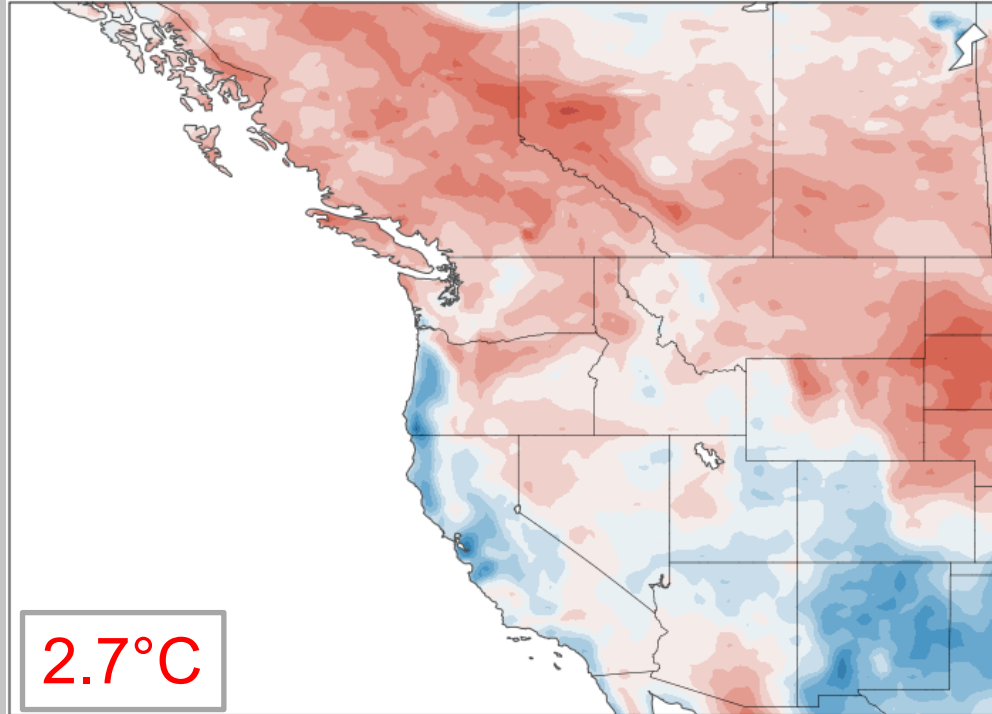
# Estimate soil moisture contribution to the event ?

- Cannot be inferred directly from the composite analysis
- Select June-July ERA5 days with the region-averaged soil moisture anomaly  $> 1$  sigma and  $< -1$  sigma
- Perform dynamical adjustment separately on the two daily datasets
- Look at impact of a  $-2$  sigma soil moisture anomaly.

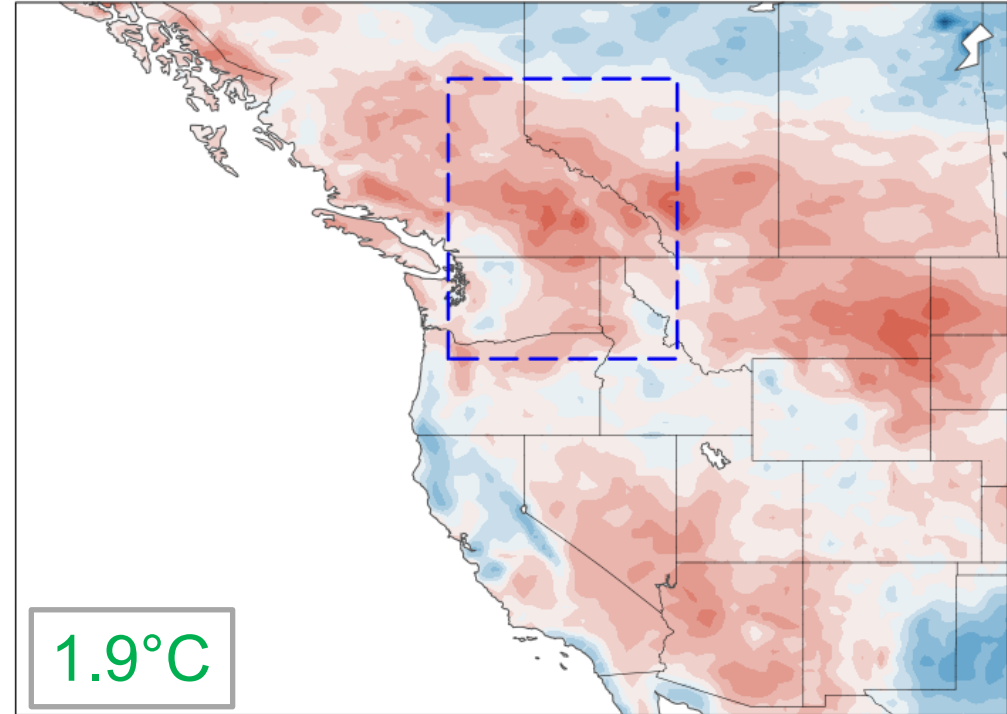


# Soil moisture contribution

a) TX Internal Residual



b) Soil moisture contribution



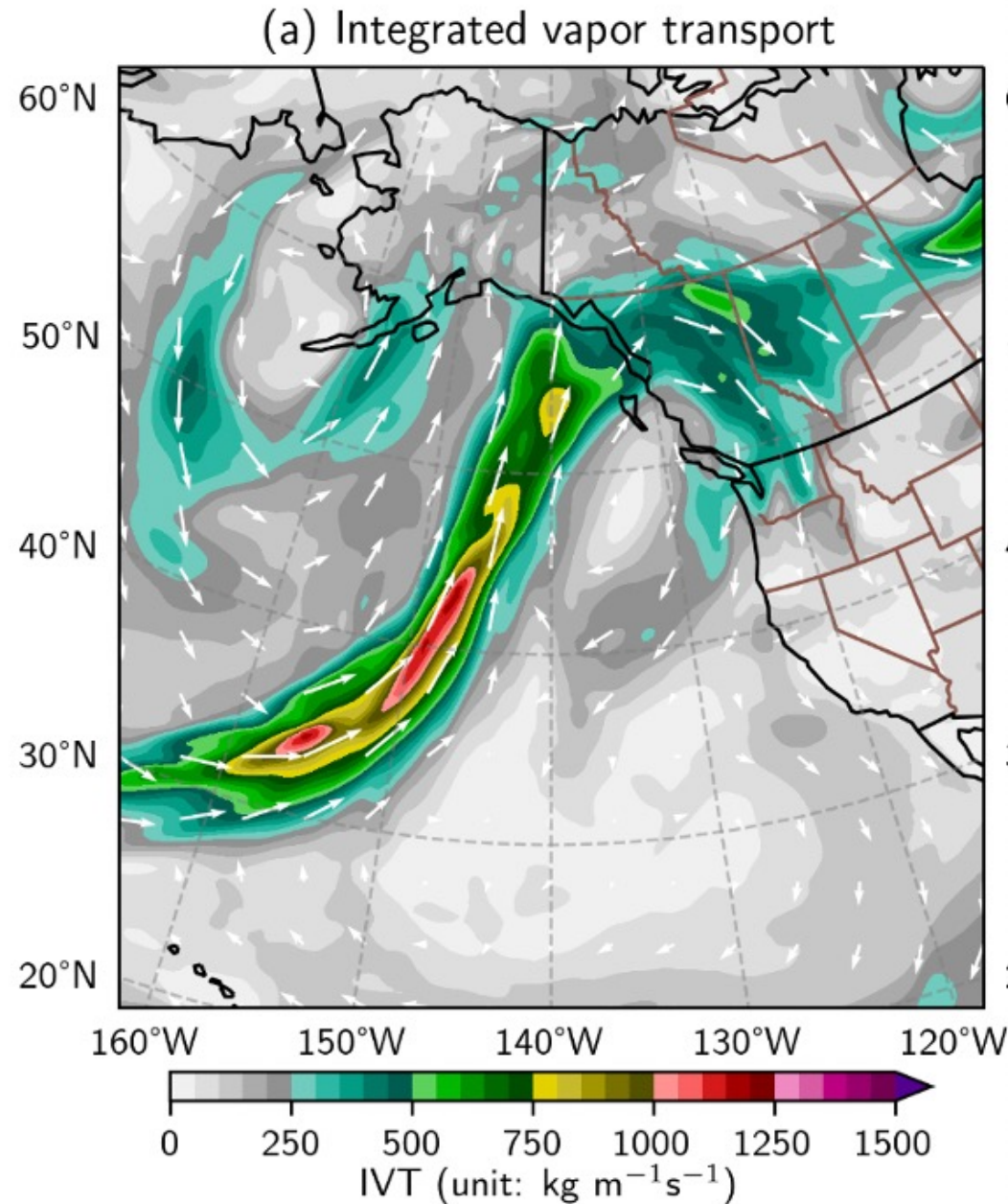
# Drivers of the June 2021 heatwave

## Four main potential ingredients:

- *The atmospheric circulation pattern*
- *A soil moisture deficit*
- **A late June atmospheric river**
- *Possible ocean influence (PDO) ?*

# Late June 2021 atmospheric river

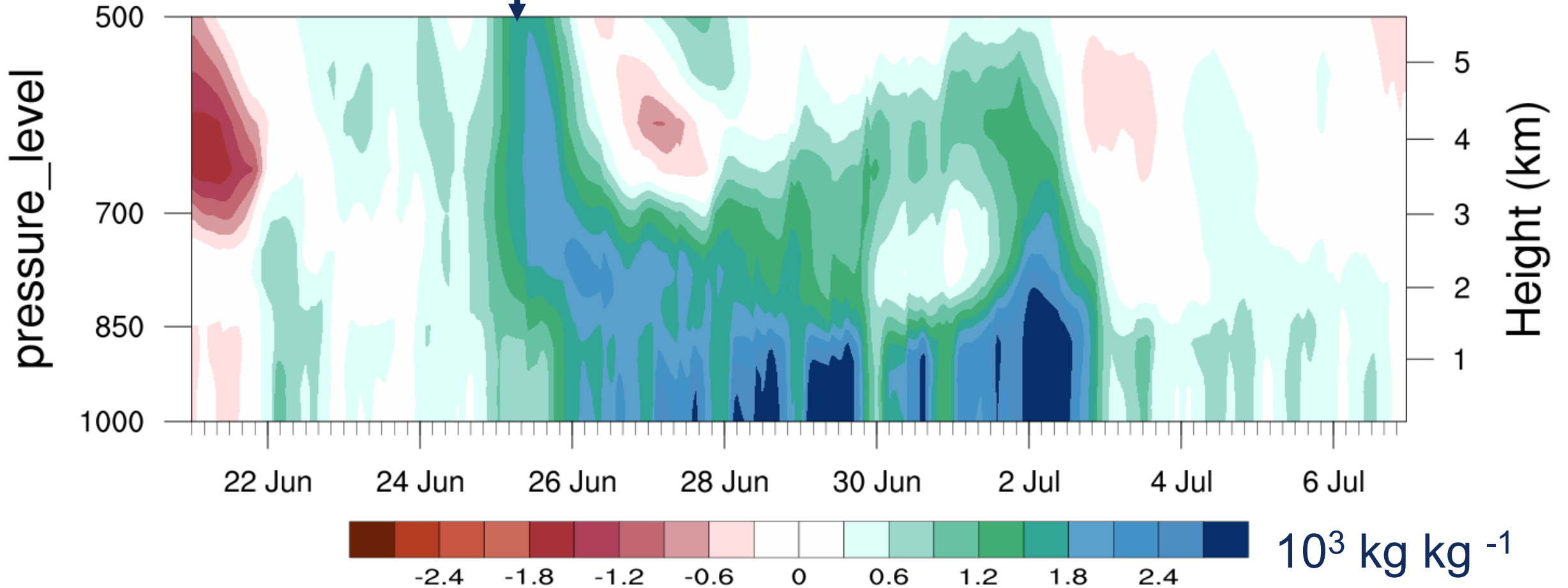
June 25, 12H00 UTC



# The importance of moisture

Atmospheric river, June 25

Heatwave



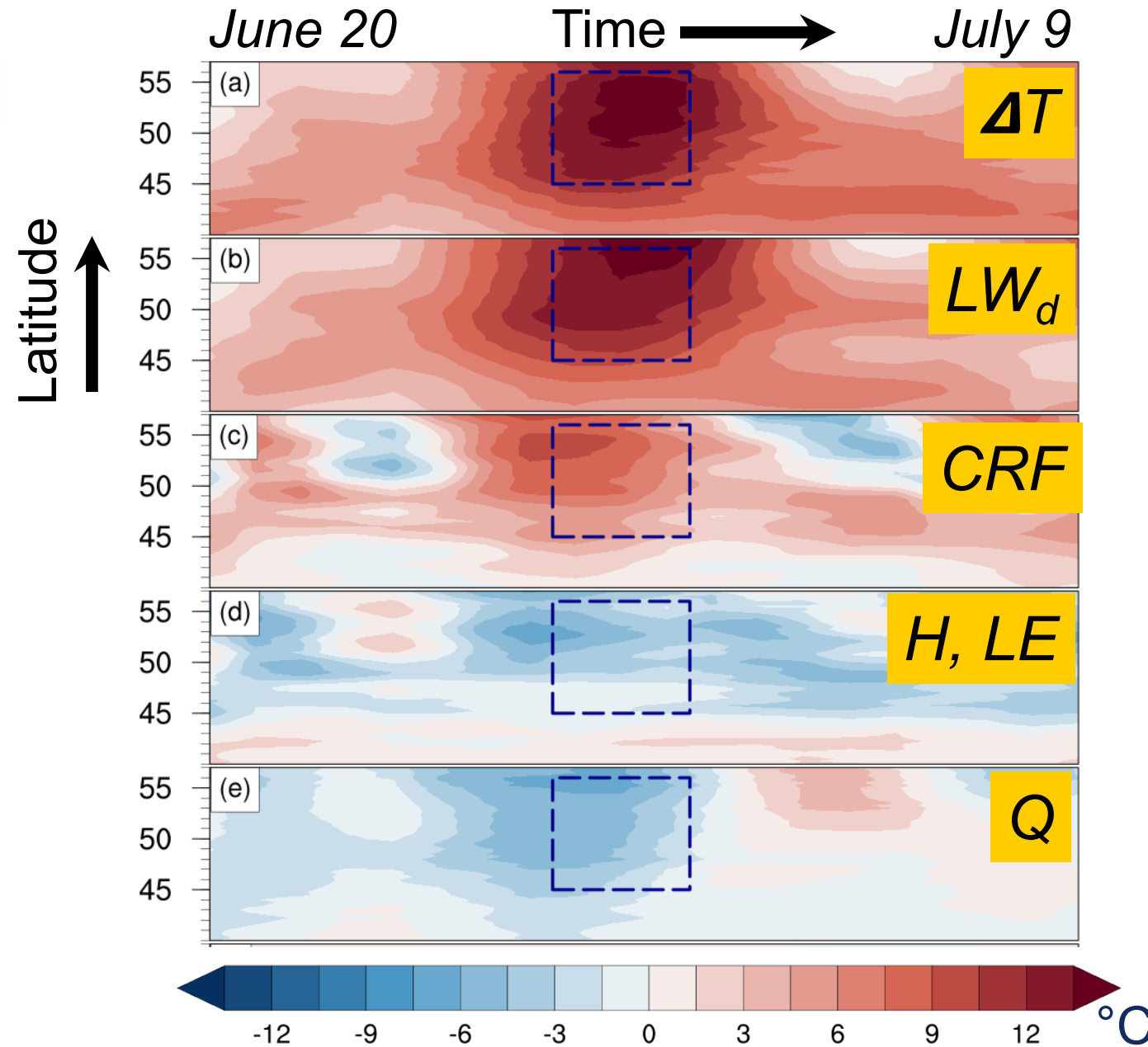
# Surface heat budget for the heatwave region

$$Q = (1 - \alpha)S^\downarrow + F^\downarrow + F^\uparrow - H - LE$$

With  $F \cong 4 \sigma T_s^4$

Perturbed state: summer 2021

Reference : climatology





# Summary

- Probability-based approach for the June 2021 heatwave fails to assess FAR and PR
- Storyline approach: circulation  $72\% \pm 9\%$ , soil moisture ( $12\%$ ), forced contribution ( $11\%$ )
- Model-based approach (Schumacher et al. 2022, nudged experiments): circulation  $81\%$ , soil moisture  $12\%$  and forced TX response  $7\%$
- Late June 2021 heatwave would have been an extraordinary event even without climate change ( $14.2^\circ\text{C}$  instead of  $16^\circ\text{C}$ )
- Assuming a 7-day weather sequence and 30 d.o.f globally, one has  $\sim 156000$  events over 100 years
- Non-zero probability to have some very extreme ones by chance