

# Does the hook structure constrain future precipitation extremes and floods?

**Dr. Jiabo Yin**

**Associate Professor, Wuhan University, China**

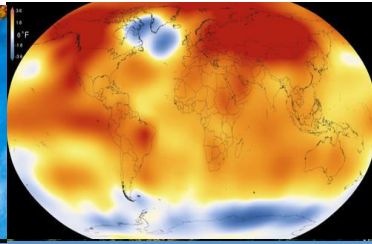
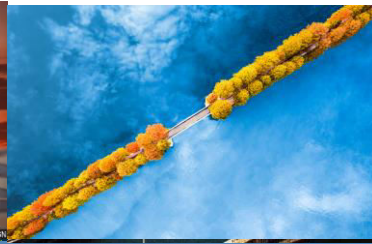
# Does the hook structure constrain future precipitation extremes and floods?

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**Honorary Research Associate, University of Oxford**

*In collaboration with Prof. Pierre Gentine, Prof. Louise Slater and Prof. Shenglian Guo*



# 1 Background


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## Save reefs to rescue all ecosystems

An approach that tackles the underlying causes of coral-reef decline could be applied to other habitats, argue Tiffany H. Morrison, Terry P. Hughes and colleagues.

Climate Warming

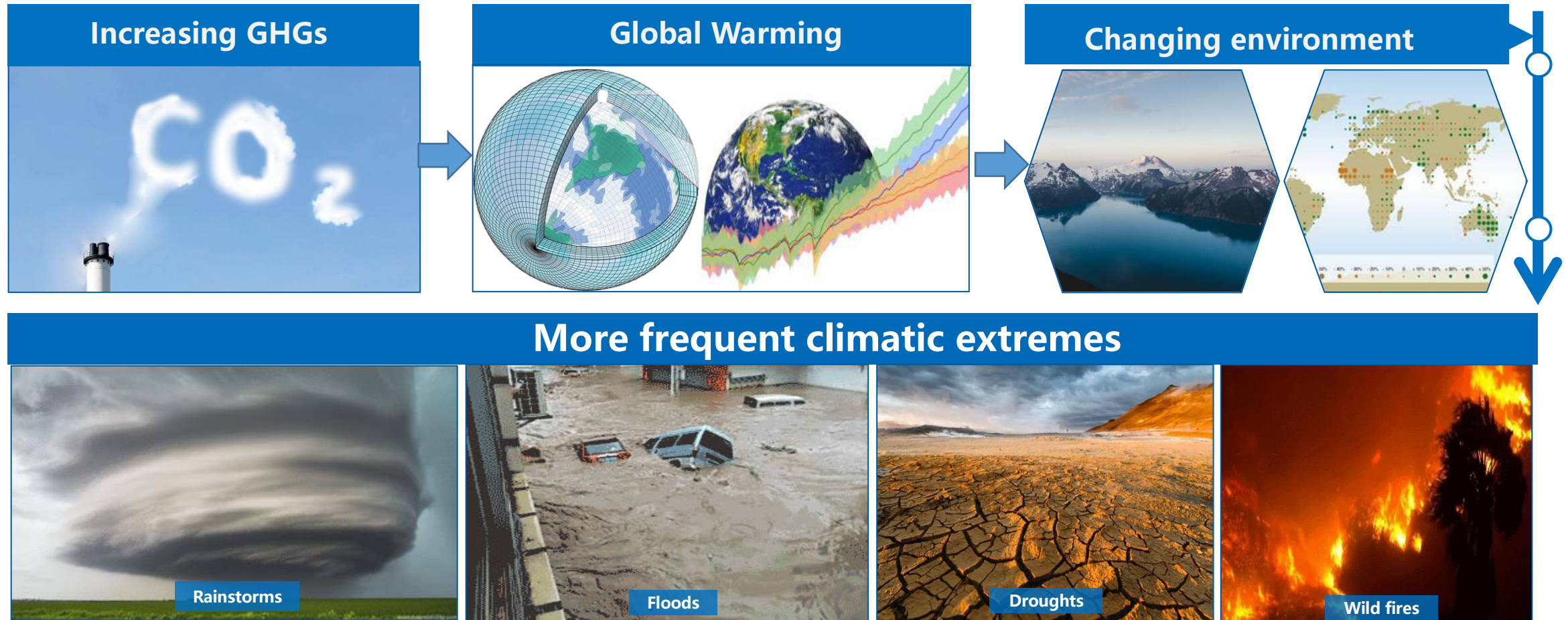
Nature Alert: All the coral reefs in the world might be gone by 2070 if global heating continues on its current path.

2019-2020: Australian wildfires have killed half a billion animals and plants.



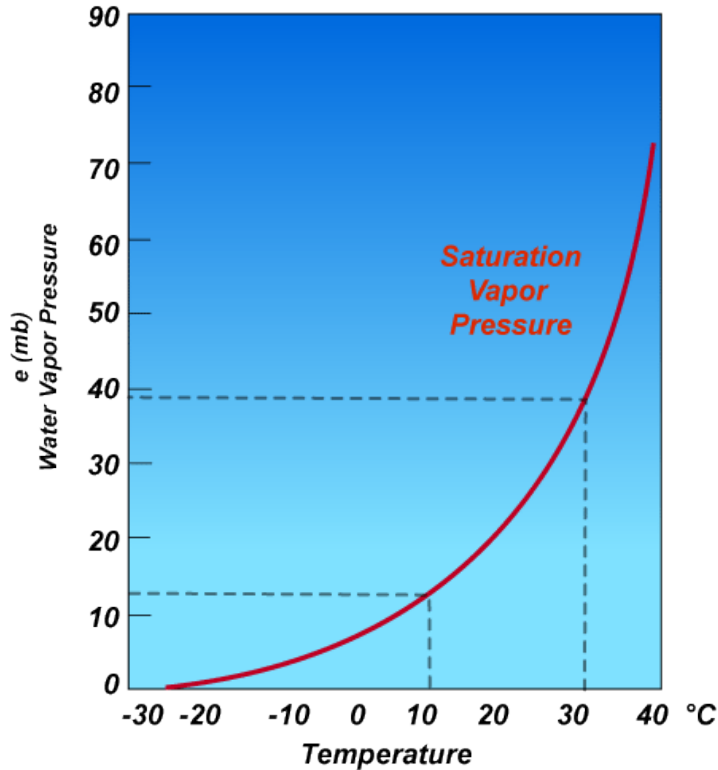
# 1 Background

- Anthropogenic warming due to increasing greenhouse gas emission has altered the climate system and water-carbon cycle



## 2 Hook structure of extreme precipitation and storm runoff

**Atmospheric water vapor holding capacity should increase with rising temperature**



$$e_s(T) = e_{s0} \exp\left(\frac{L_v}{R_v} \left[\frac{1}{T_0} - \frac{1}{T}\right]\right)$$

Annotations for the equation:

- Latent heat of vaporization (points to  $L_v$ )
- Vapor gas constant (points to  $R_v$ )
- saturated vapor pressure (points to  $e_s(T)$ )

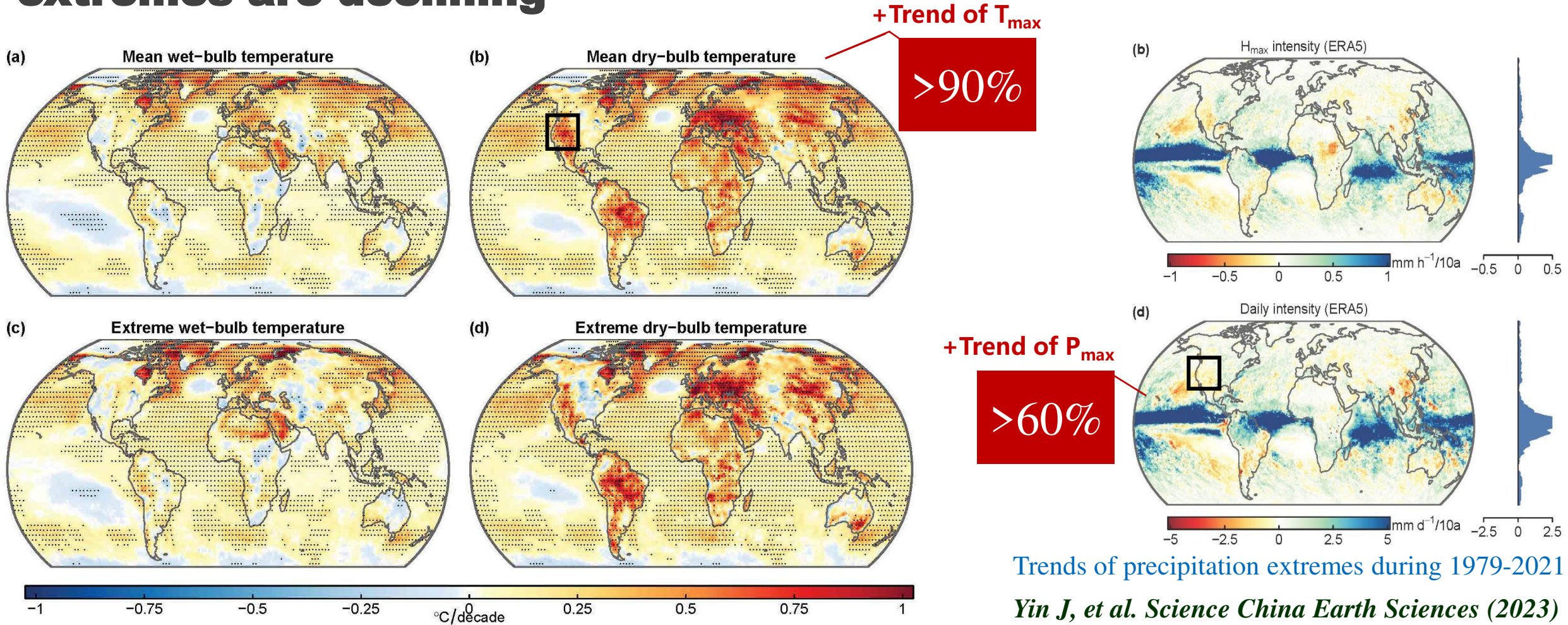
$$\frac{de_s}{e_s dT} = \frac{L_v}{R_v T^2}$$

- (1) saturation vapor pressure is dependent **solely on temperature**
- (2) **6.8 %/K** at 25 °C (usually called as C-C scaling)

**Clausius-Clapeyron**

# 2 Hook structure of extreme precipitation and storm runoff

**In many regions, temperature is rising, while precipitation extremes are declining**



Trends of precipitation extremes during 1979-2021

*Yin J, et al. Science China Earth Sciences (2023)*

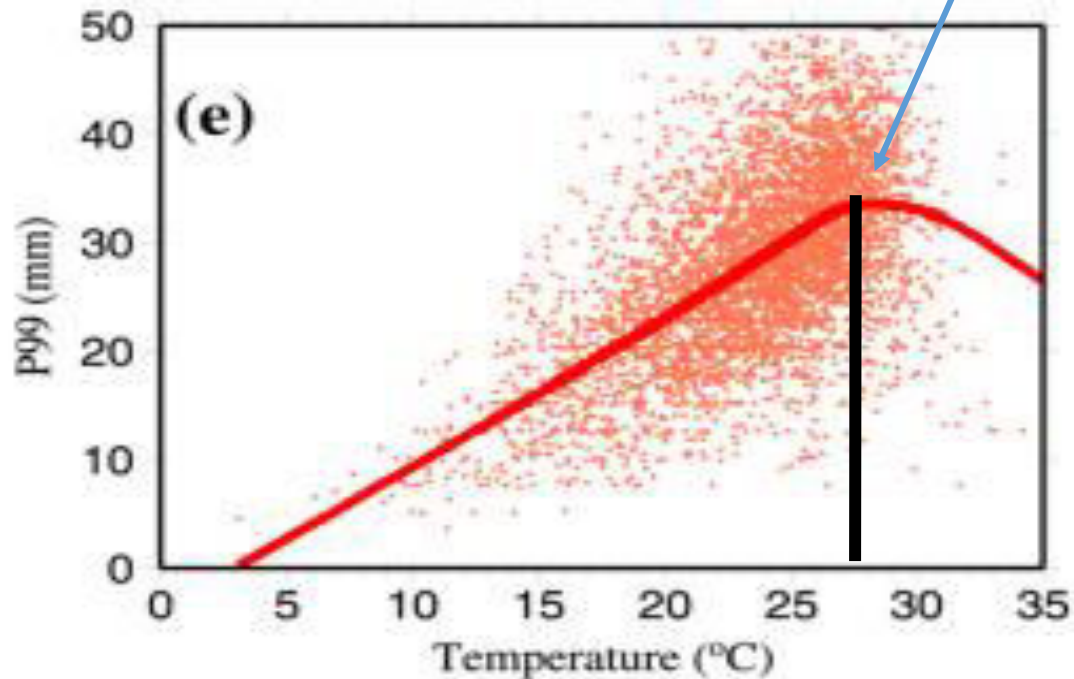
Global trend of mean and extreme temperatures during 1979-2021

*Yin J, et al. GRL (2022)*

## 2 Hook structure of extreme precipitation and storm runoff

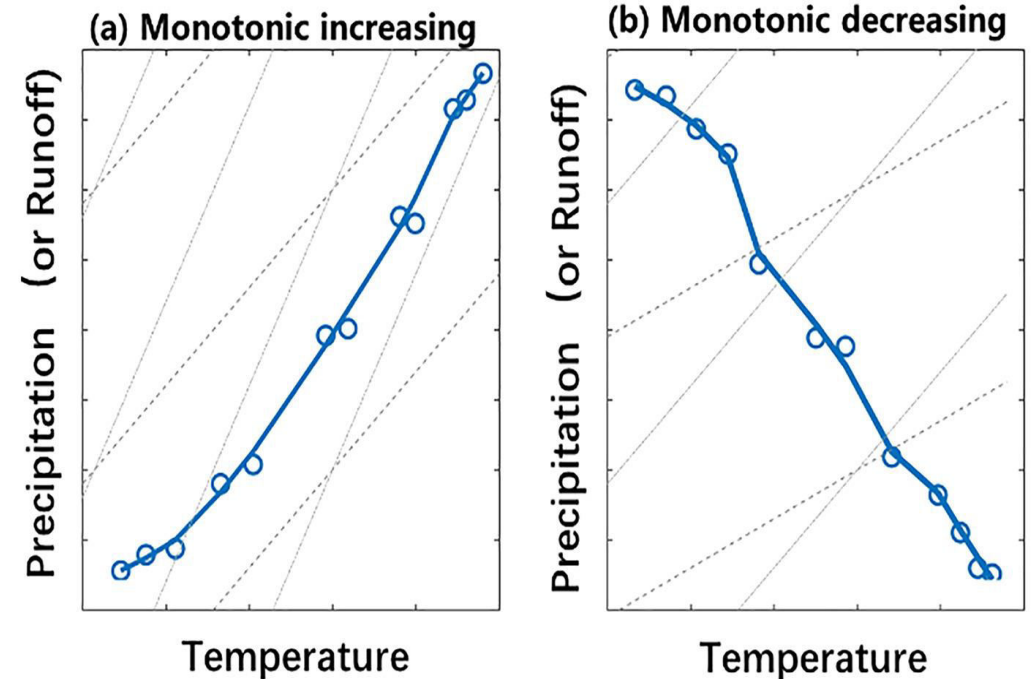
**Unlike the thermodynamic expectations, we find a hook structure between precipitation/runoff extremes and temperatures**

**Hook structure:** Extremes strengthen with rising temperature up to a peak point ( $T_{pp}$ ) and decline thereafter



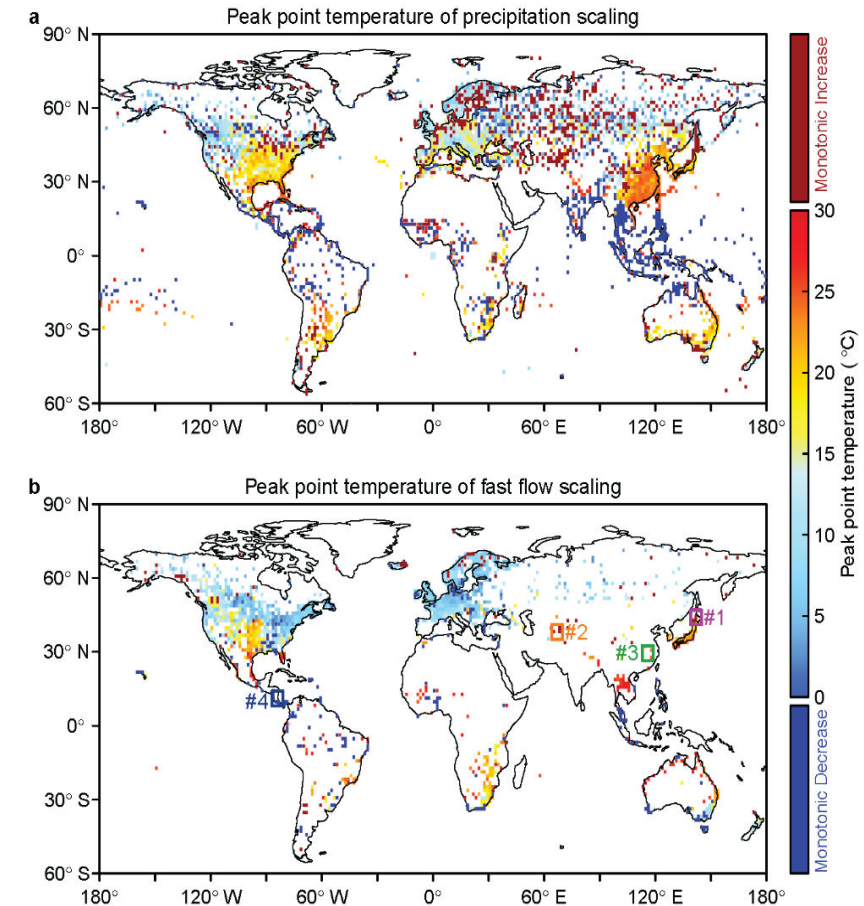
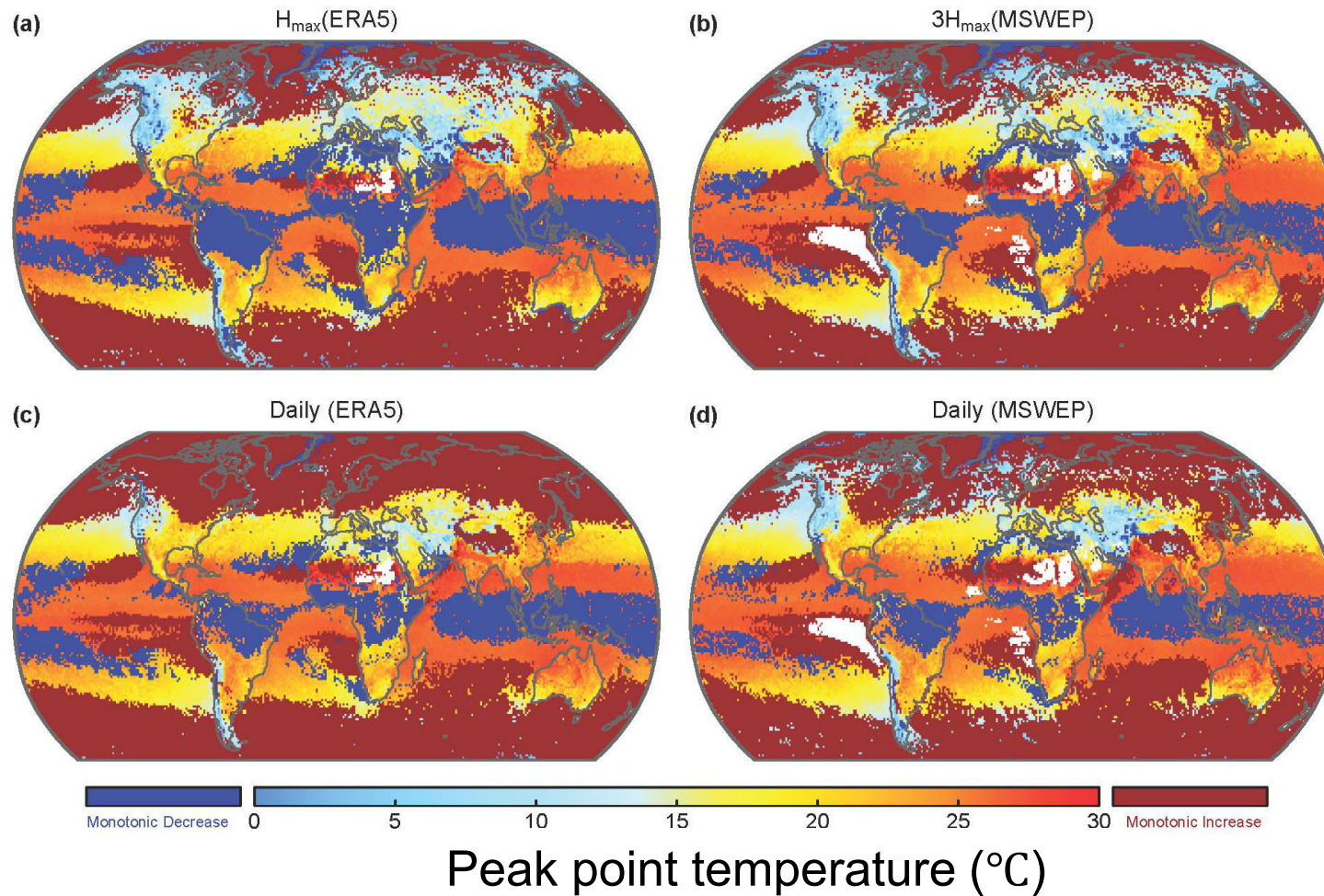
Binning Scaling

$$EPS = \left( \exp^{\frac{\ln P_b - \ln P_a}{T_b - T_a}} - 1 \right) \times 100\%$$



# 2 Hook structure of extreme precipitation and storm runoff

**The underlying causes of this widely reported hook structure is not yet well-understood**





## 2 Hook structure of extreme precipitation and storm runoff

**The underlying causes of this widely reported hook structure is not yet well-understood**

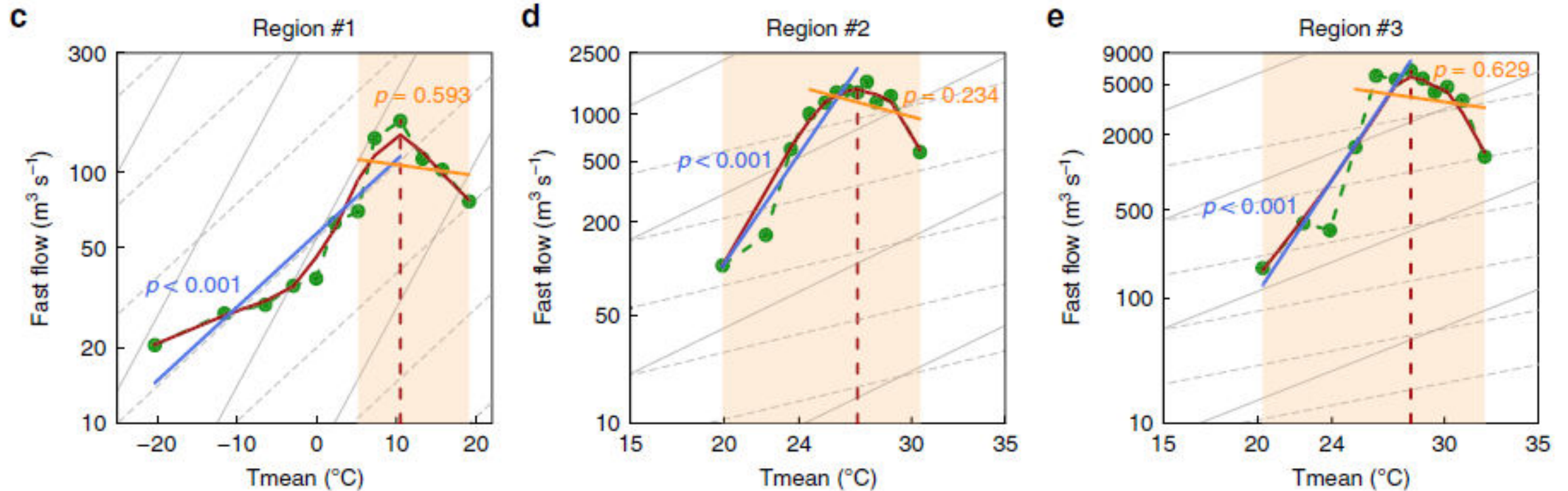


Figure: Temperature scaling of storm runoff over three typical catchments

*Yin J, et al. Nature Communications (2018)*

# 3 Understanding the Hook structure by atmospheric physics

## Why can we observe a hook structure?

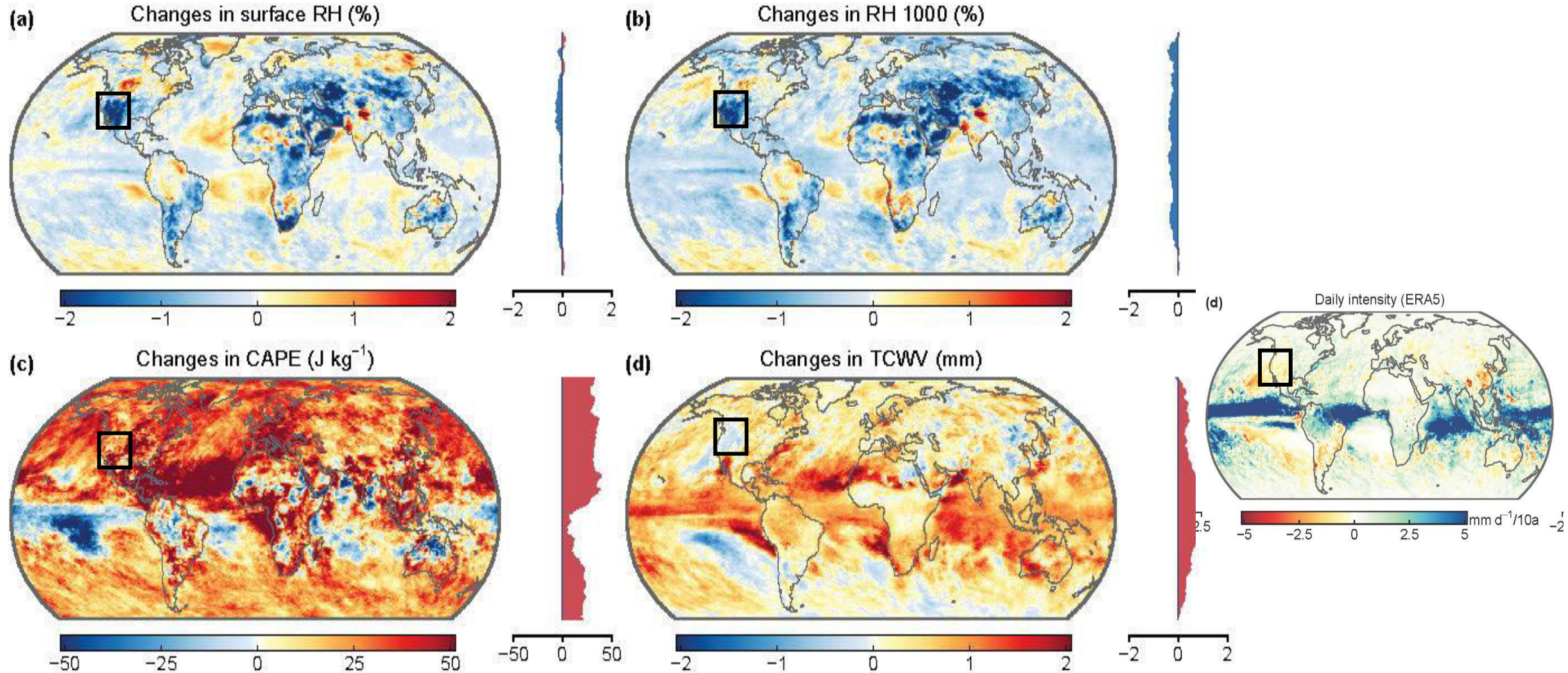


Figure: Trends in relative humidity, CAPE, and Total column water vapor (TCWV) during precipitation extremes

# 3 Understanding the Hook structure by atmospheric physics

## Why can we observe a hook structure?

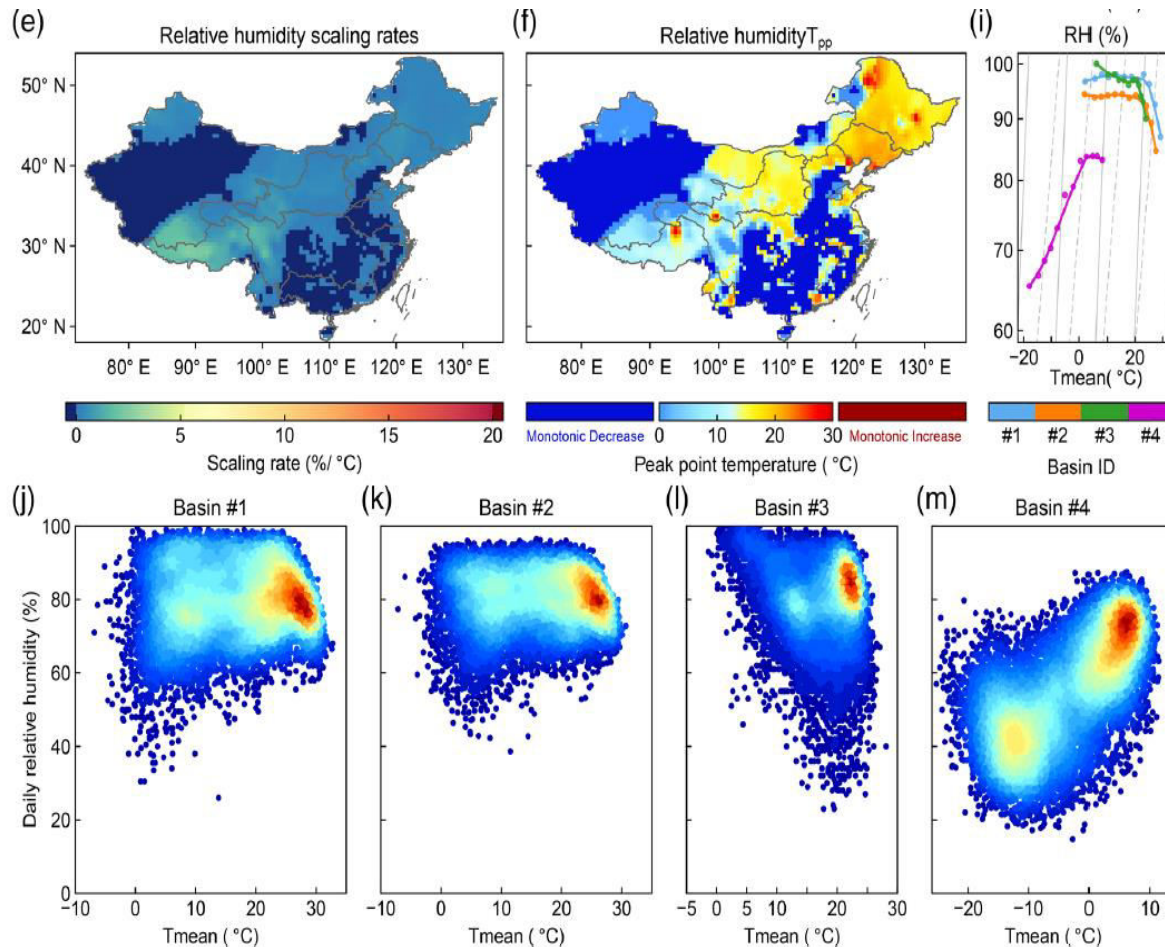


Figure: Scaling pattern between Relative humidity and temperatures

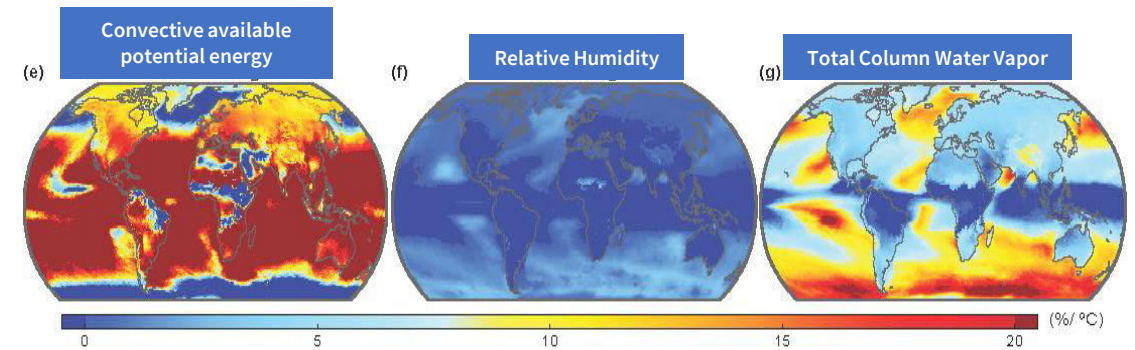


Figure: Temperature scaling of CAPE, RH and TCWV

- We find negative (sub C-C) scaling rates of *Relative Humidity* and *Total Column Water Vapor (TCWV)*, implying **continental moisture limitations** in hotter environments. **Atmospheric dynamics** might constrain extremes intensification.

*Yin J, et al. Water Resources Research (2021)*

# 3 Understanding the Hook structure by atmospheric physics

## Why can we observe a hook structure?

Divergent sensitivities of  $P_e$  are reported

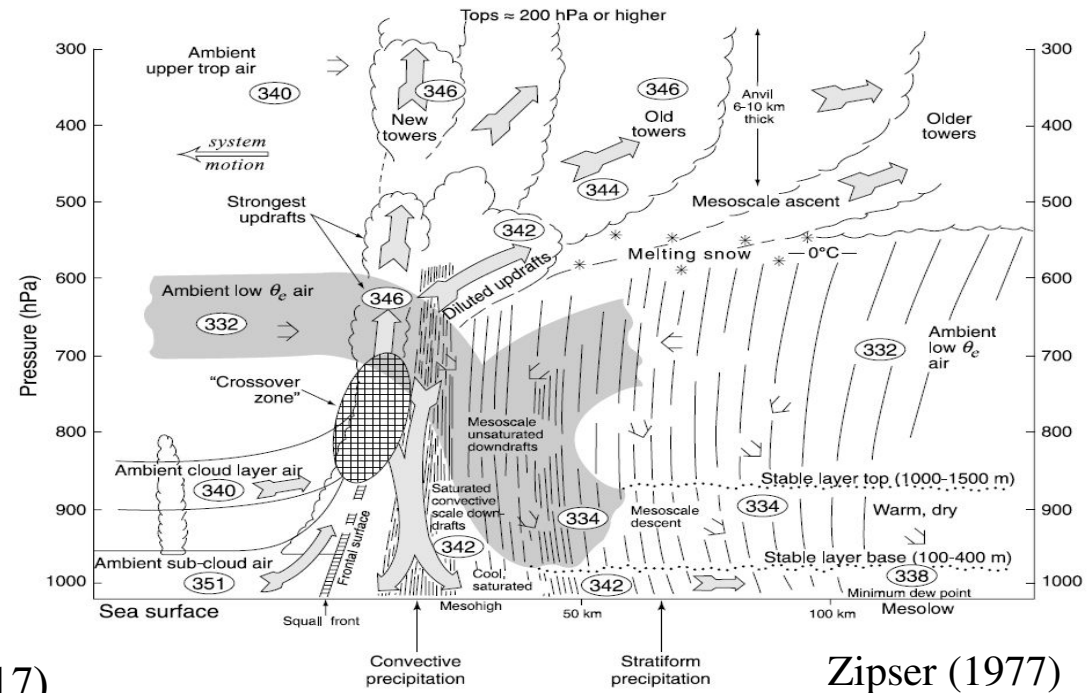
C-C scaling only tells part of the story

> Local vertical motion

> Available atmospheric moisture

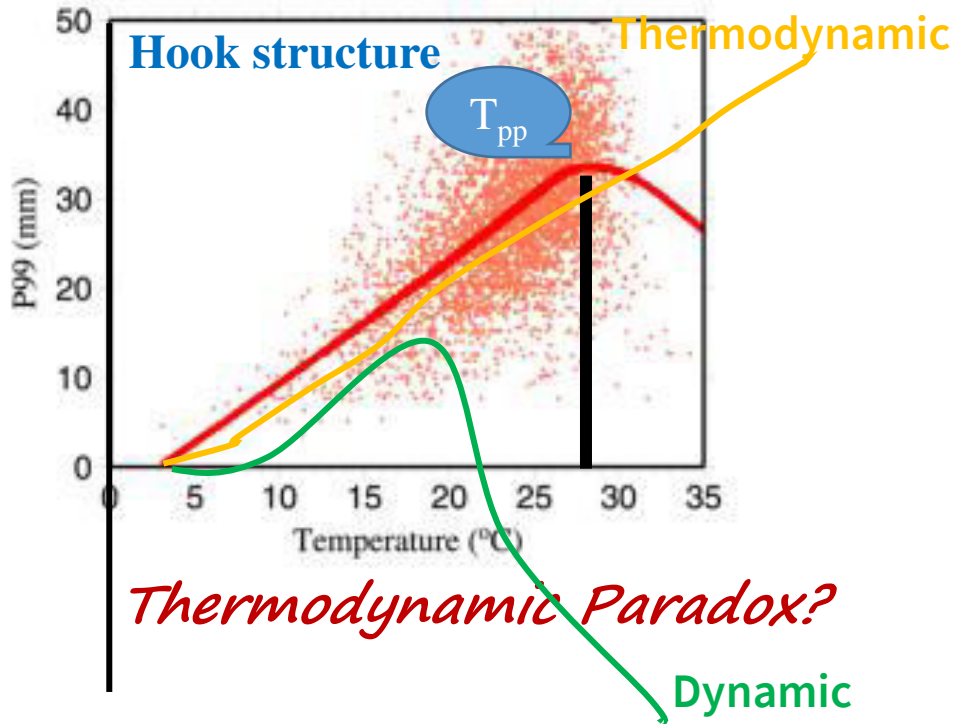
$$P_e \sim - \left\{ \omega_e \frac{dq_s}{dp} \Big|_{\theta^*} \right\} \text{ O'Gorman et al. (2012, 2017)}$$

Precipitation involves complicated systems and coupled processes. How these physical processes impact Extreme precipitation sensitivity (**EPS**)?

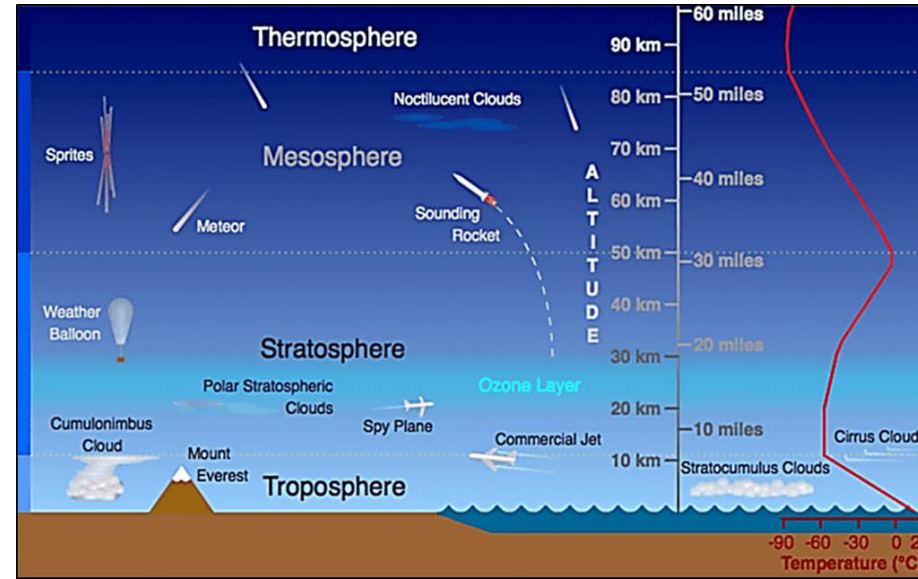


- The physical-based diagnose model is used to quantify the thermodynamic and dynamic contributions of EPS, which is based on **energy budgeted balance** during precipitation processes.

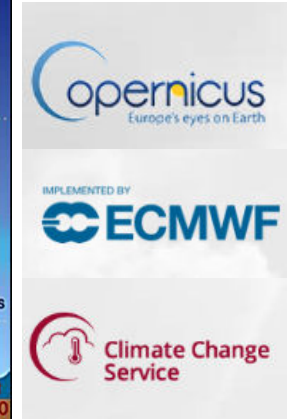
# 3 Understanding the Hook structure by atmospheric physics



*We focus on moisture transport in Troposphere*



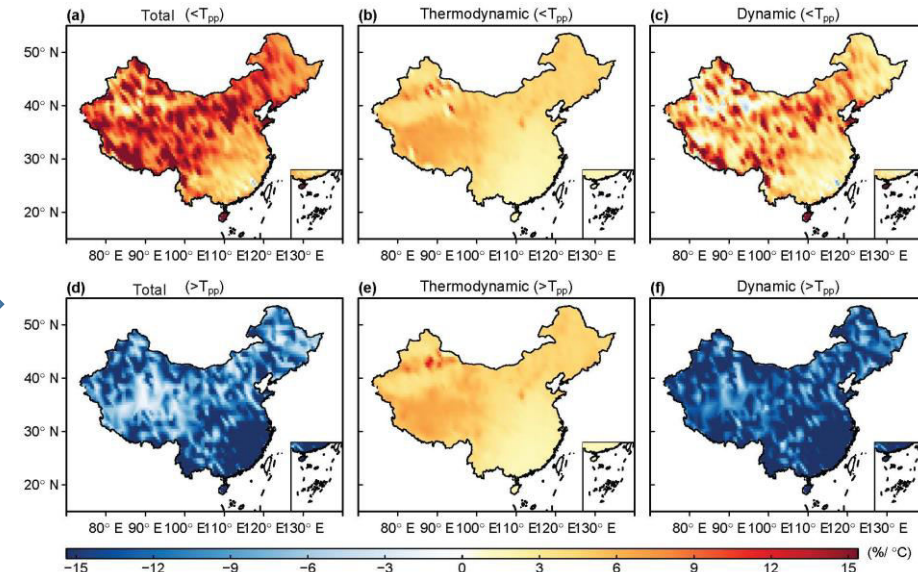
ERA5 data pressure levels (1-1000hPa)



**Physics-diagnosed model**

$$\frac{\delta P_e}{P_e} \approx \frac{\delta \{ \omega (\partial q_{\text{sat}} / \partial p) \}}{\{ \omega (\partial q_{\text{sat}} / \partial p) \}}$$

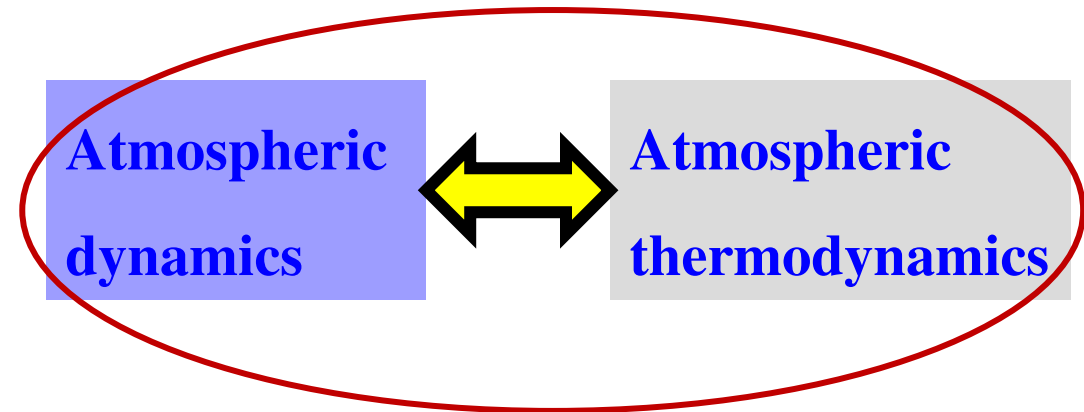
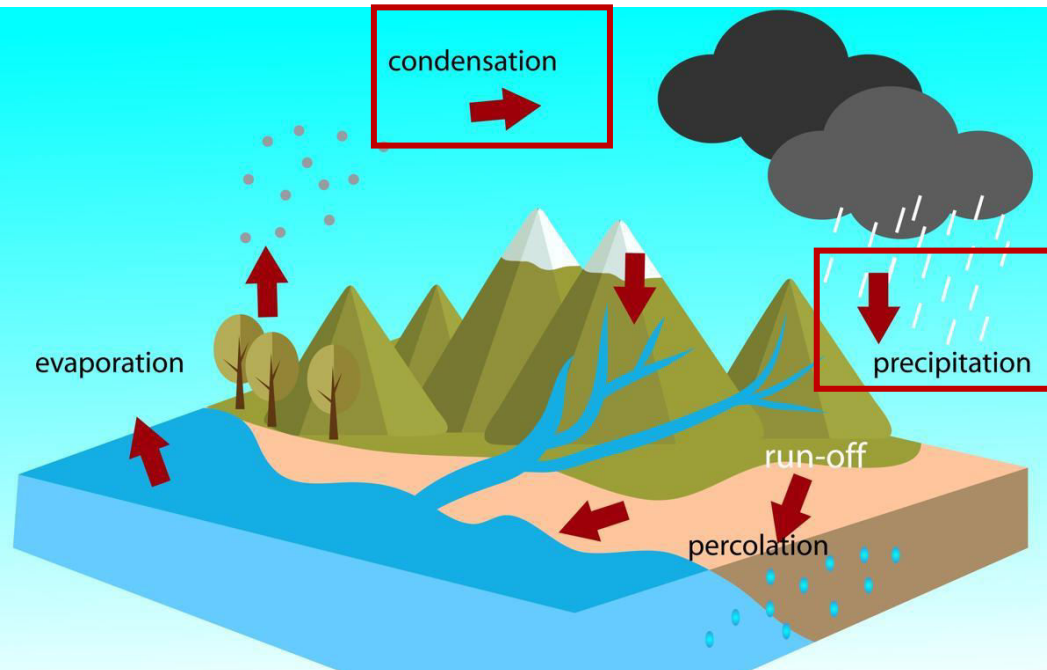
$$\frac{\delta P_e}{P_e} \approx \underbrace{\frac{\{ \omega \delta (\partial q_{\text{sat}} / \partial p) \}}{\{ \omega (\partial q_{\text{sat}} / \partial p) \}}}_{\text{Thermodynamic}} + \underbrace{\frac{\{ \delta (\omega) (\partial q_{\text{sat}} / \partial p) \}}{\{ \omega (\partial q_{\text{sat}} / \partial p) \}}}_{\text{Dynamic}}$$



*Yin J, et al. Chinese Science Bulletin (2021)*

### 3 Understanding the Hook structure by atmospheric physics

**Thermodynamic contributes to precipitation intensification, while atmospheric dynamics decline precipitation in hotter environment**



**Physical-diagnostic model**

$$\frac{\delta P_e}{P_e} \approx \underbrace{\frac{\{\omega \delta(\partial q_{\text{sat}} / \partial p)\}}{\{\omega(\partial q_{\text{sat}} / \partial p)\}}}_{\textit{Thermodynamic}} + \underbrace{\frac{\{\delta(\omega)(\partial q_{\text{sat}} / \partial p)\}}{\{\omega(\partial q_{\text{sat}} / \partial p)\}}}_{\textit{Dynamic}}$$

**Do all the thermodynamic components always intensify precipitation extremes?**

### 3 Understanding the Hook structure by atmospheric physics

**Do all the thermodynamic components always intensify precipitation extremes? Can we know more details?**

By further decomposing moist-adiabatic derivative of saturation specific humidity

$$P_e \sim - \left\{ \omega_e \frac{dq_s}{dp} \Big|_{\theta^*} \right\}$$

$$P_{the} \sim - \left\{ \omega_{avg} \frac{dq_s}{dp} \Big|_{\theta^*} \right\} = - \left\{ \omega_{avg} \left( \frac{\partial q_s}{\partial p} + \frac{\partial q_s}{\partial T} \cdot \frac{dT}{dp} \Big|_{\theta^*} \right) \right\} = - \left\{ \omega_{avg} \frac{\partial q_s}{\partial p} \right\} - \left\{ \omega_{avg} \frac{\partial q_s}{\partial T} \cdot \frac{dT}{dp} \Big|_{\theta^*} \right\}$$



Pressure component

$$pPR = - \left\{ \omega_{avg} \frac{\partial q_s}{\partial p} \right\}$$

Temperature component

$$pT = - \left\{ \omega_{avg} \frac{\partial q_s}{\partial T} \cdot \left( \frac{dT}{dp} \Big|_{\theta^*} \right)_{avg} \right\}$$

Lapse Rate component

$$pLR = - \left\{ \omega_{avg} \frac{\partial q_s}{\partial T} \cdot \frac{dT}{dp} \Big|_{\theta^*} \right\} - \left( - \left\{ \omega_{avg} \frac{\partial q_s}{\partial T} \cdot \left( \frac{dT}{dp} \Big|_{\theta^*} \right)_{avg} \right\} \right)$$

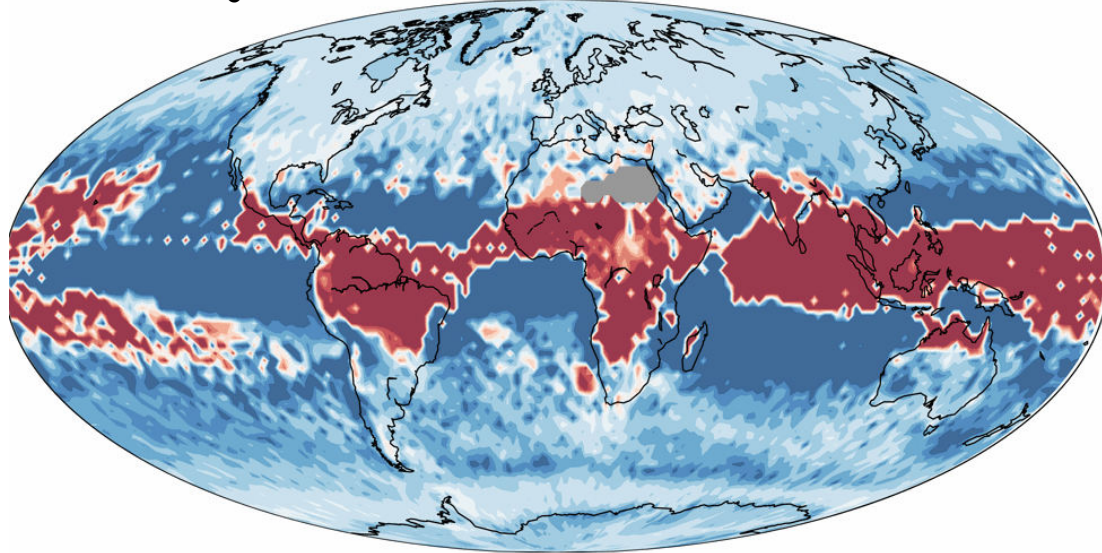
*Gu, Yin\*, Nature Communications (2023)*

# 3 Understanding the Hook structure by atmospheric physics

**Does the thermodynamic always intensify precipitation extremes? Can we know more details?**

Actual  $P_e$  EPS

EPS from ERA5 ( $\langle T_{pp}/His$ )



Diagnostic-based EPS

Diagnostic-based EPS from ERA5 ( $\langle T_{pp}/His$ )

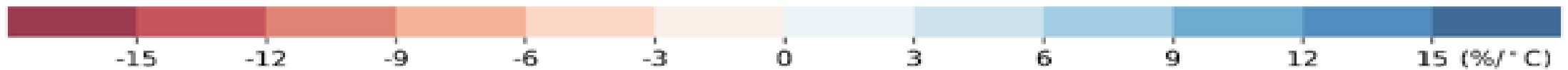
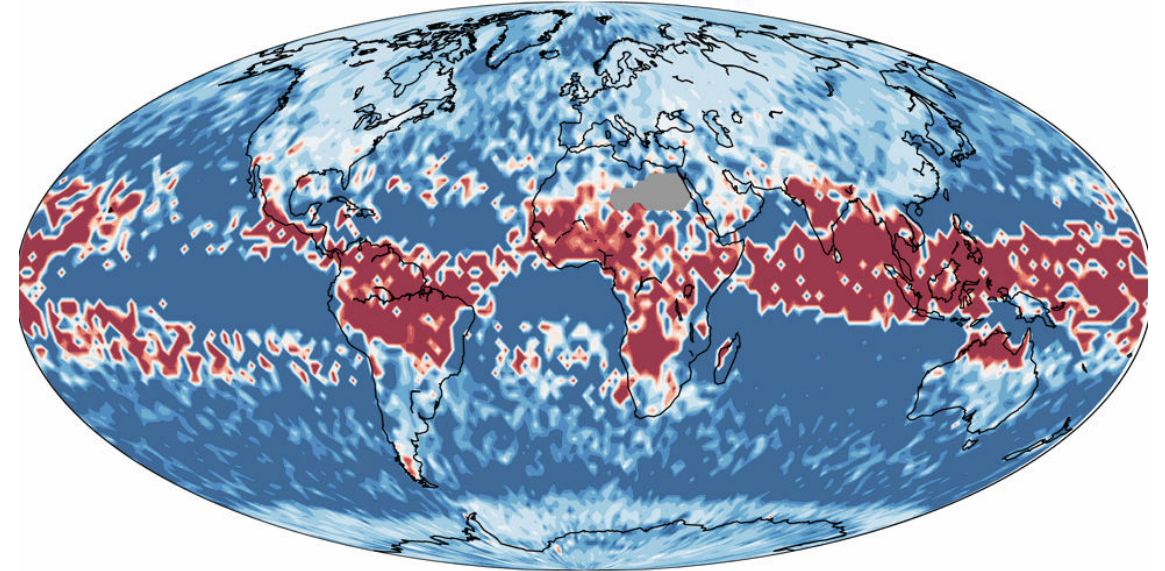


Figure: Evaluation of simulation performance of physically diagnostic model

*Gu, Yin\*, Nature Communications (2023)*



### 3 Understanding the Hook structure by atmospheric physics

**The thermodynamic components do not always contribute to precipitation intensification due to changes in temperature lapse rate**

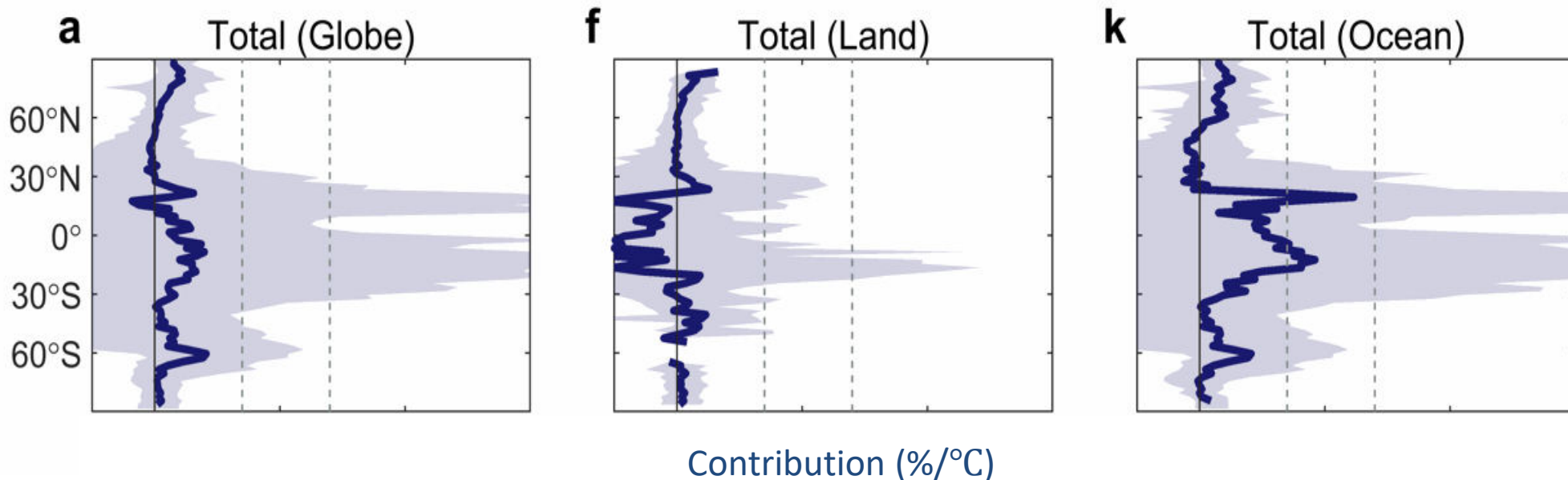
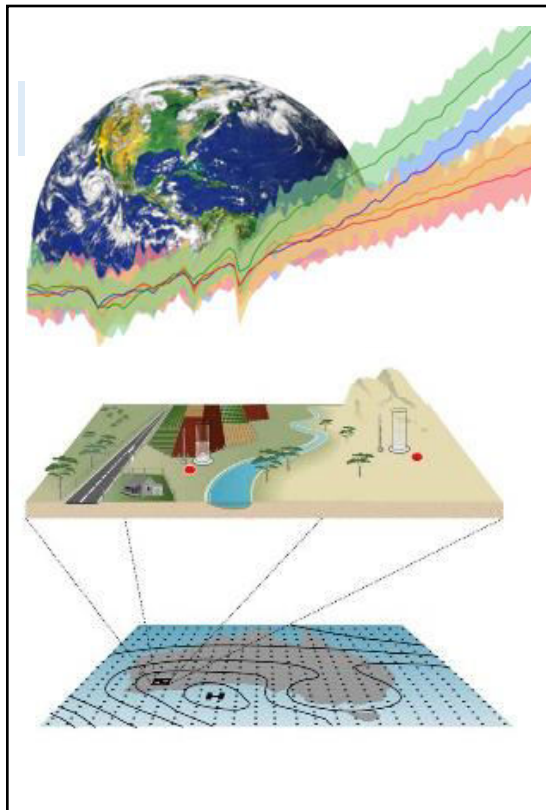


Figure: Zonal EPS anomalies between the reference and future periods

# 4 A potential upper bound for future extremes?

## Does the hook structure imply a potential upper bound for future extremes?

Climate-hydrological model chain



31 multi-model ensemble  
**WCRP CMIP5**  
World Climate Research Programme

Quantile mapping correction



11 multi-member ensemble  
**WCRP CMIP6**  
World Climate Research Programme

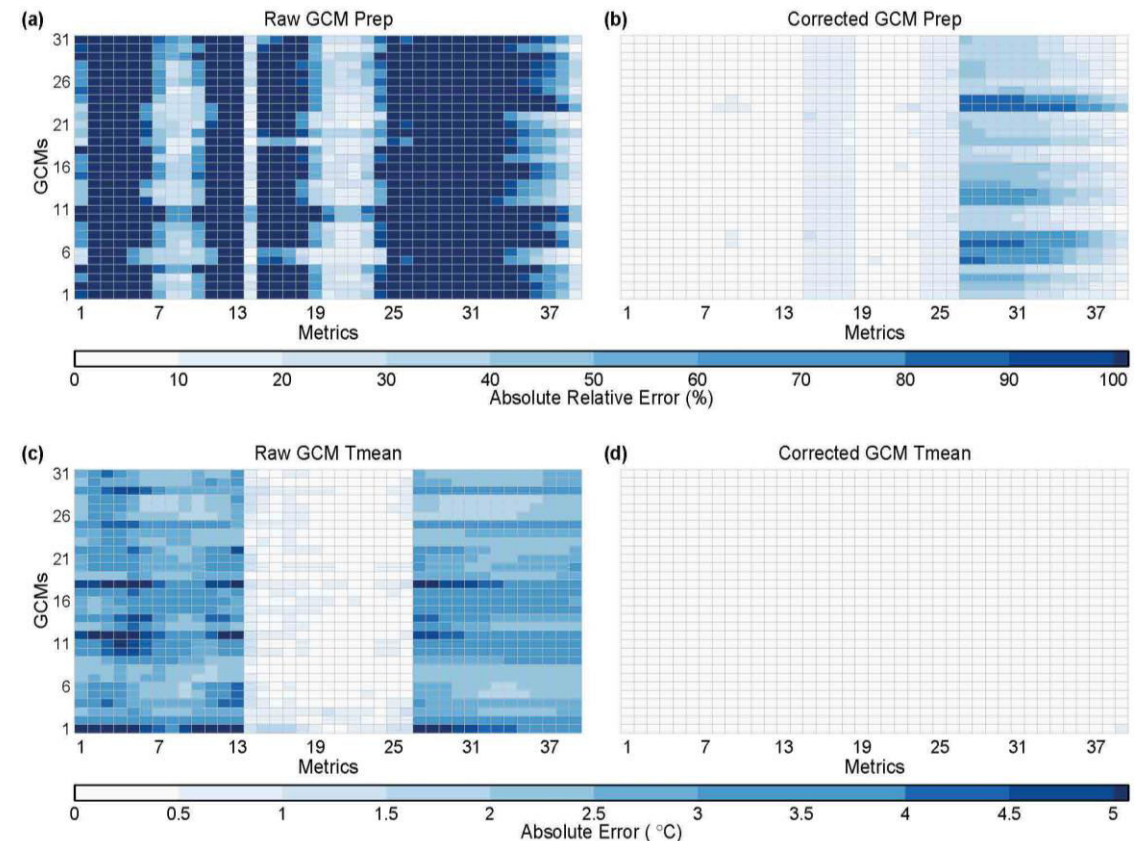


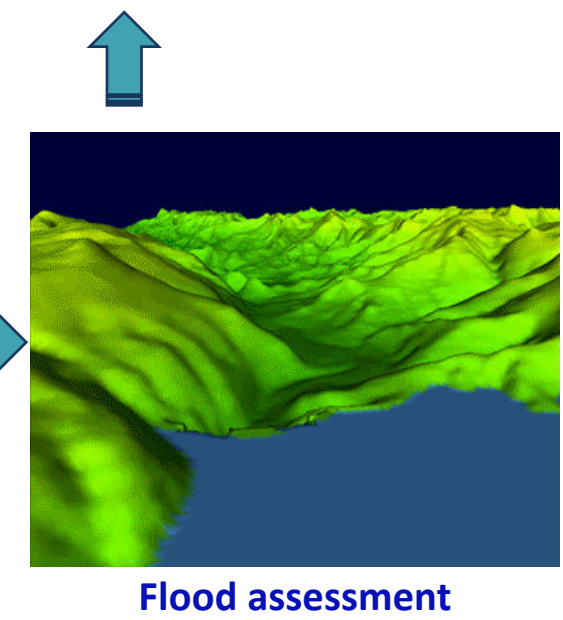
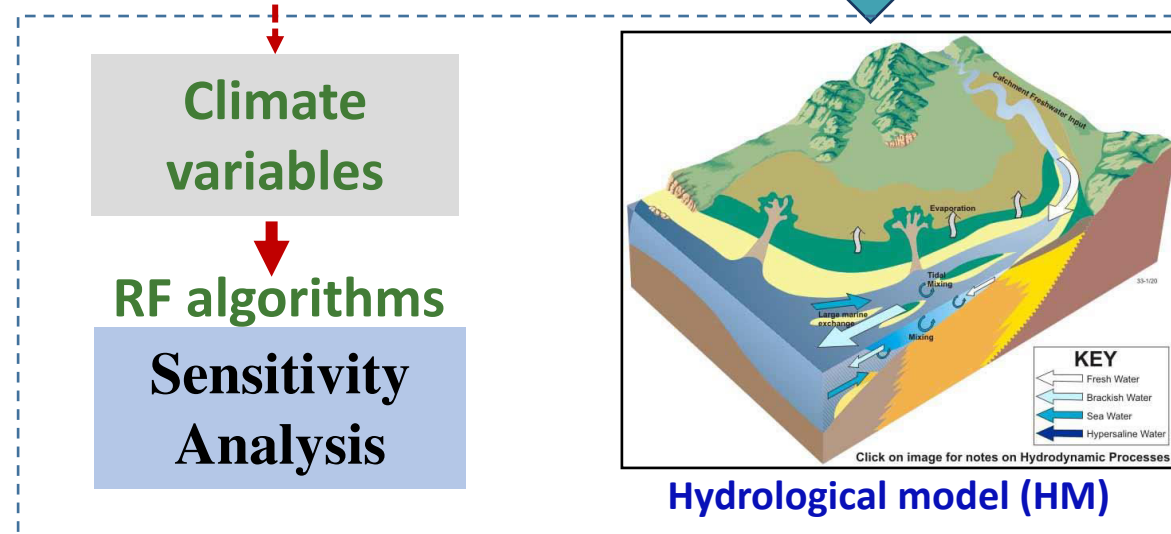
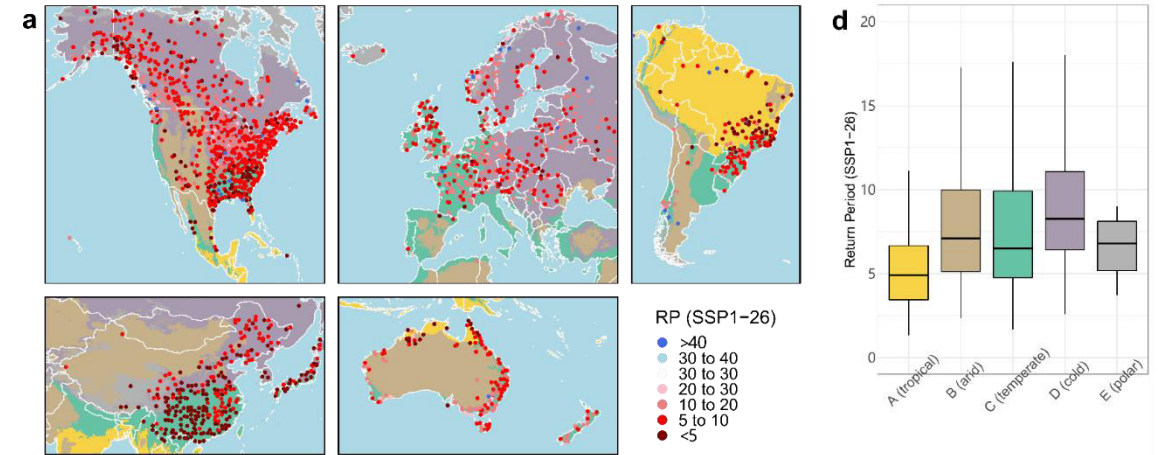
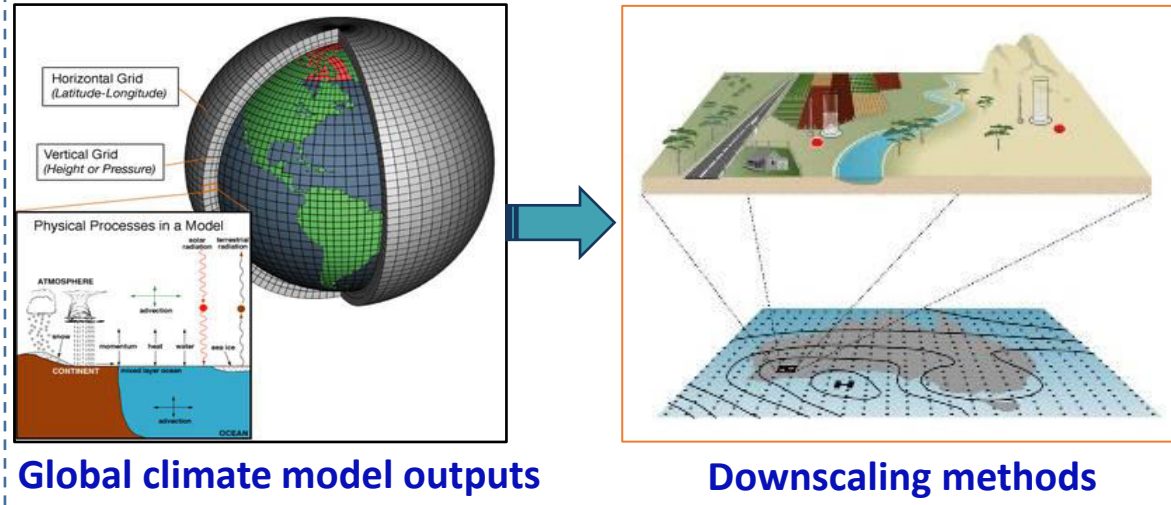
Figure: Bias correction performance of climate outputs

*Yin J\*, et al. Nature Sustainability (2023)*

# 4 A potential upper bound for future extremes?

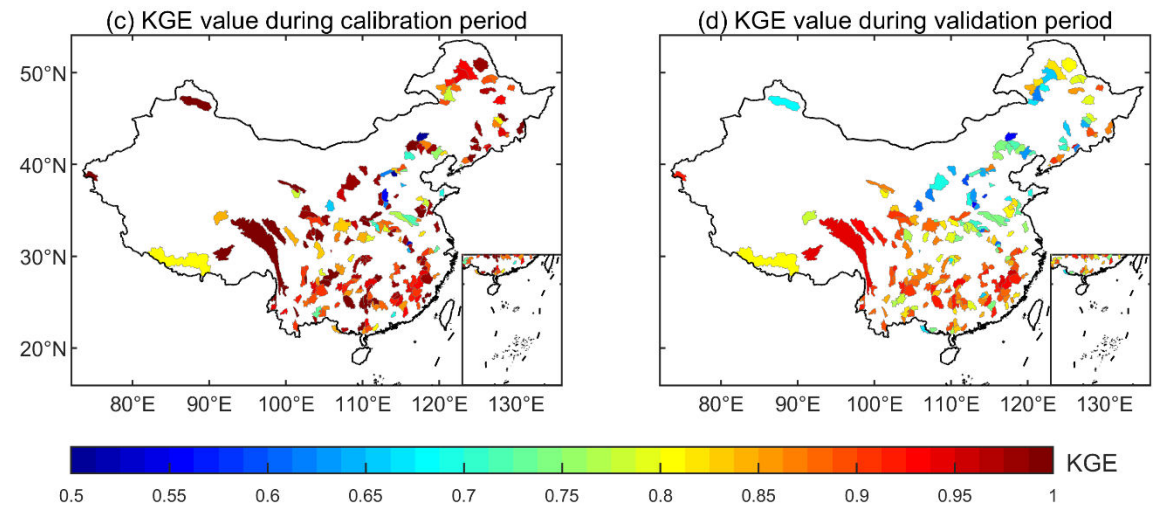
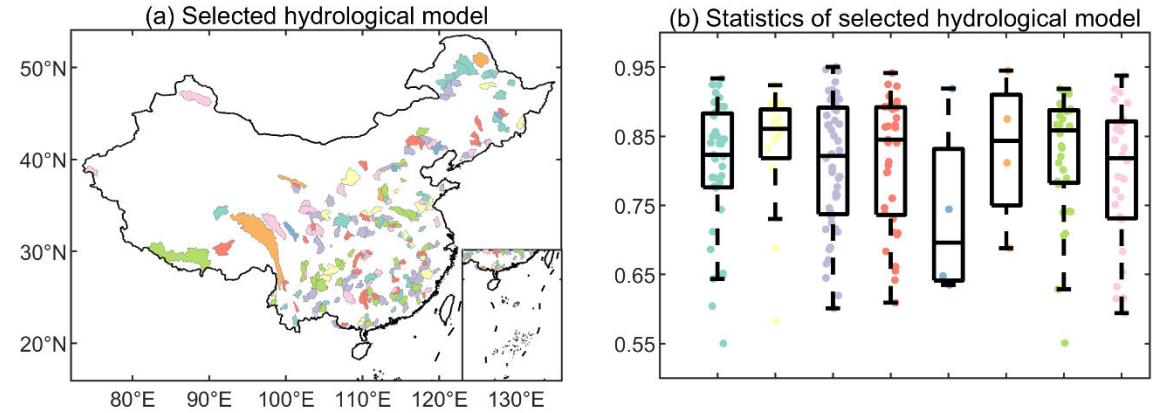
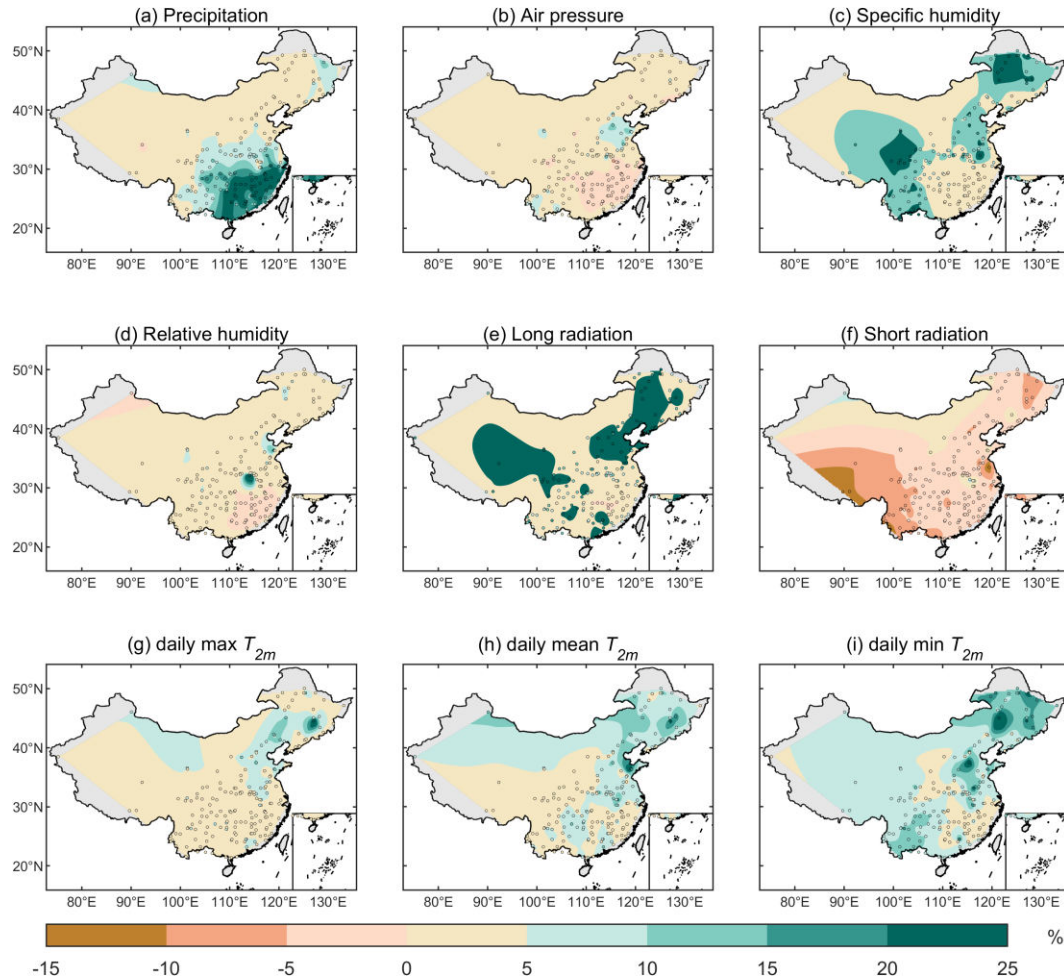
We propose a hybrid **HM-LSTM** model

*Yin J\*, et al. Nature Sustainability (2023)*



# 4 A potential upper bound for future extremes?

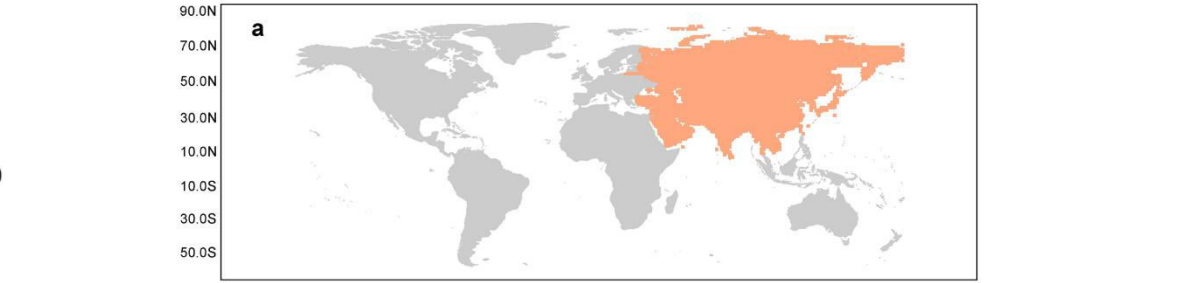
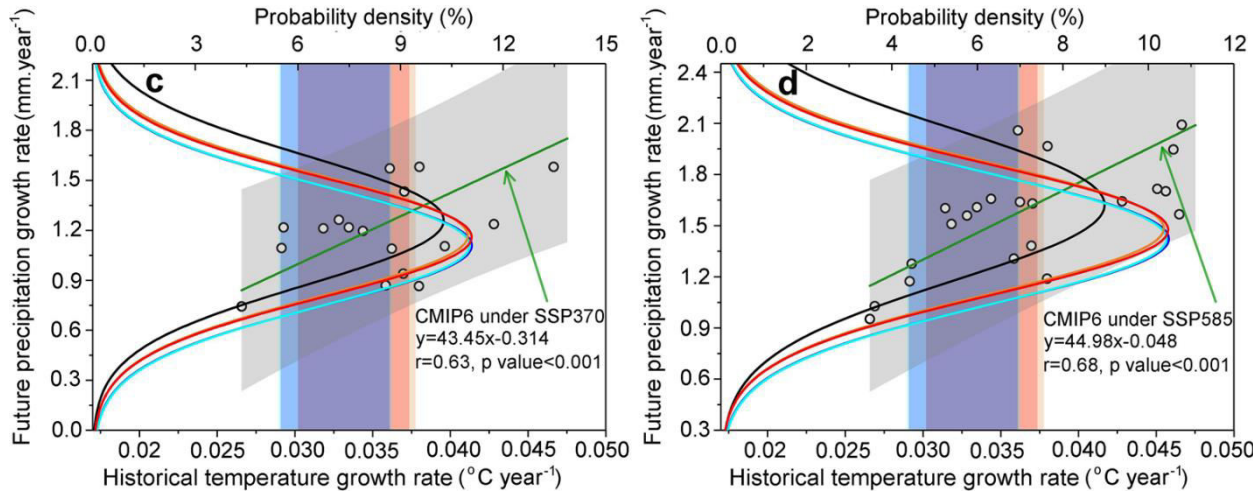
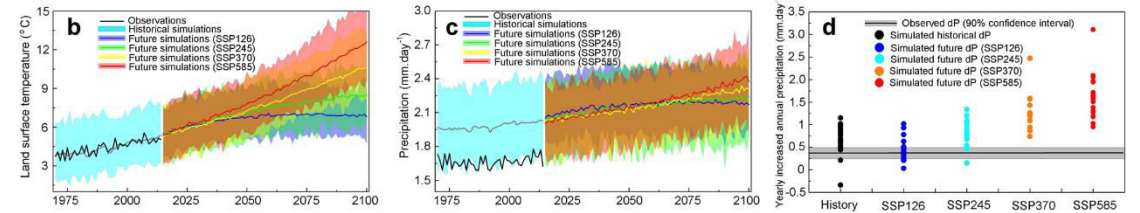
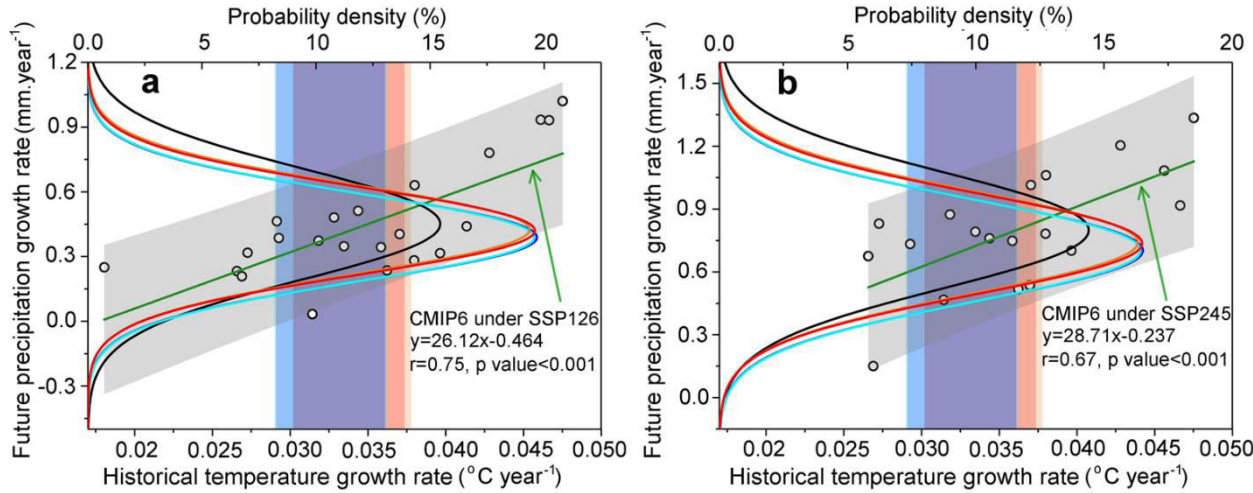
## Sensitivity of climate variables to runoff



Performance of machine Learning-constrained runoff Simulations

# 4 A potential upper bound for future extremes?

## Future projection of precipitation, evaporation and snow cover by Emergent Constraint



— PDF before EC  
 — emergent constraint and bias correction methods). We use the least-squares linear regression method to build the emergent constraint relationship (See Eq. (1))<sup>25</sup>. The prediction error of the regression ( $\sigma_y$ ) is calculated by Eq. (2).

$$y_i = ax_i + b \quad (1)$$

where  $y_i$  is the value given by  $x_i$ ;  $a$  and  $b$  are the slope and intercept values, respectively;

$$\sigma_y(x) = s \sqrt{1 + \frac{1}{N} + \frac{(x - \bar{x})^2}{N \cdot \sigma_x^2}} \quad (2)$$

# 4 A potential upper bound for future extremes?

**Does the hook structure imply a potential upper bound for future extremes?**

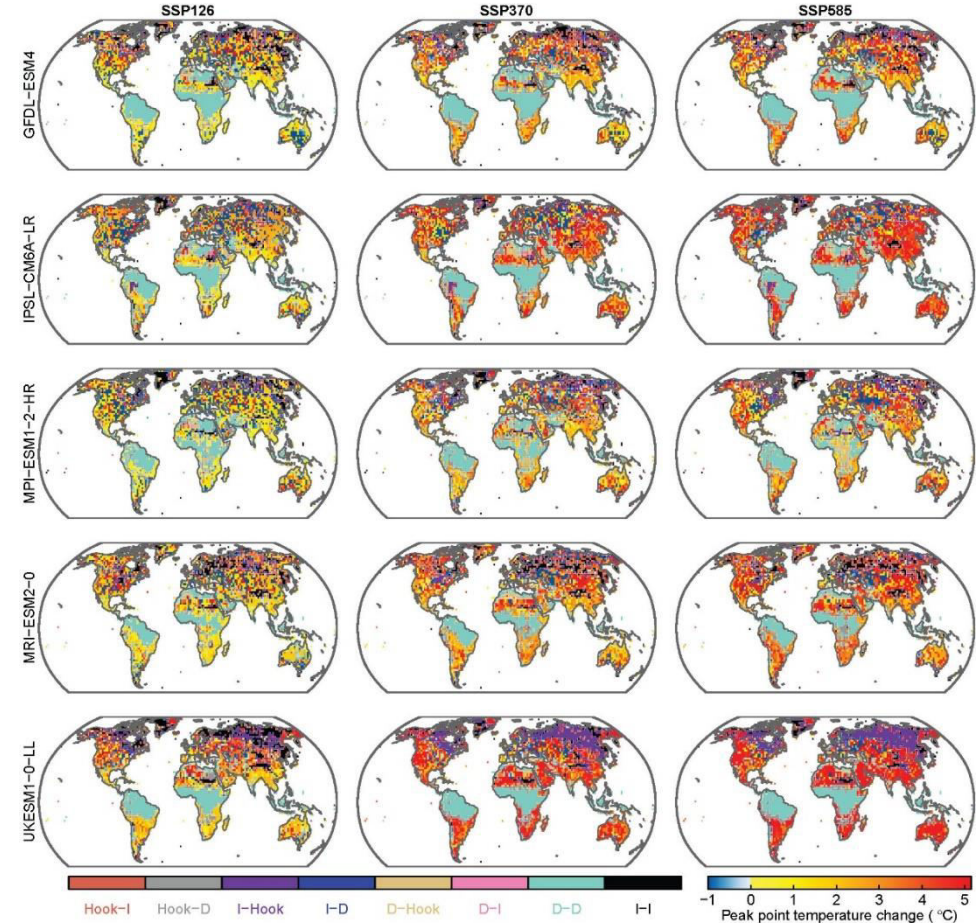
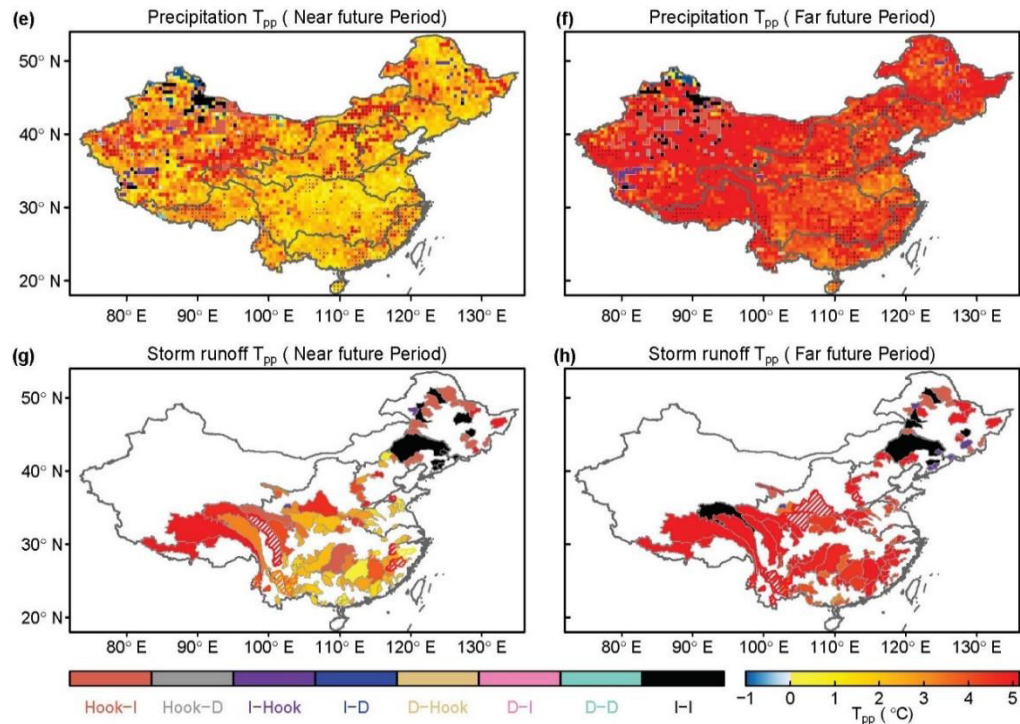
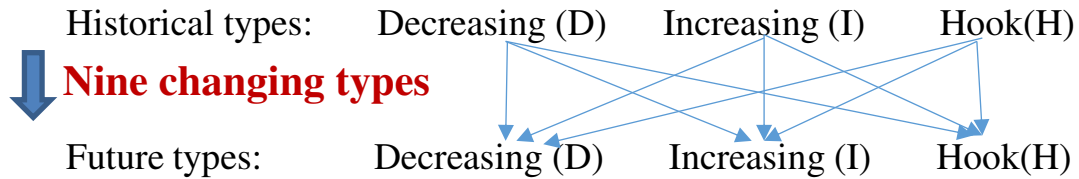


Figure: The GCM ensemble mean change of scaling structures and  $T_{pp}$  relative to historical period

# 4 A potential upper bound for future extremes?

## Does the hook structure imply a potential upper bound for future extremes?

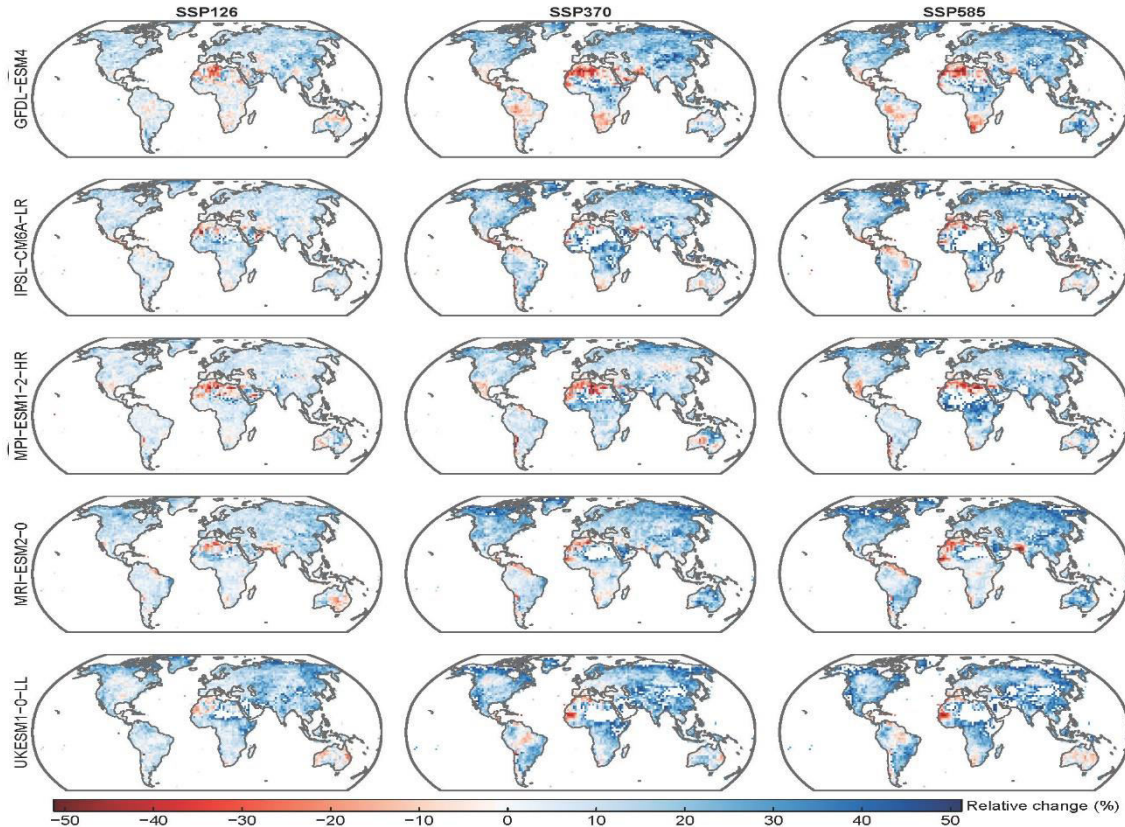
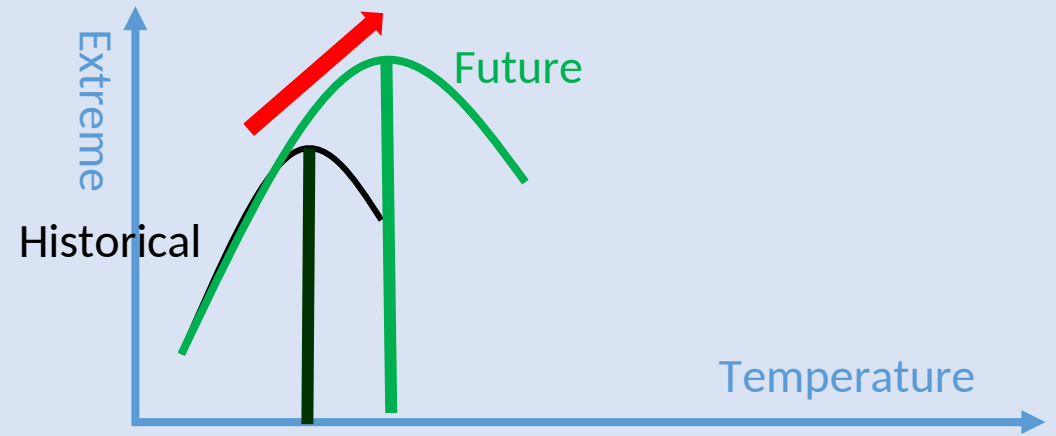


Figure: Relative changes of precipitation extremes in future climates

The hook structure is not stable under climate warming!

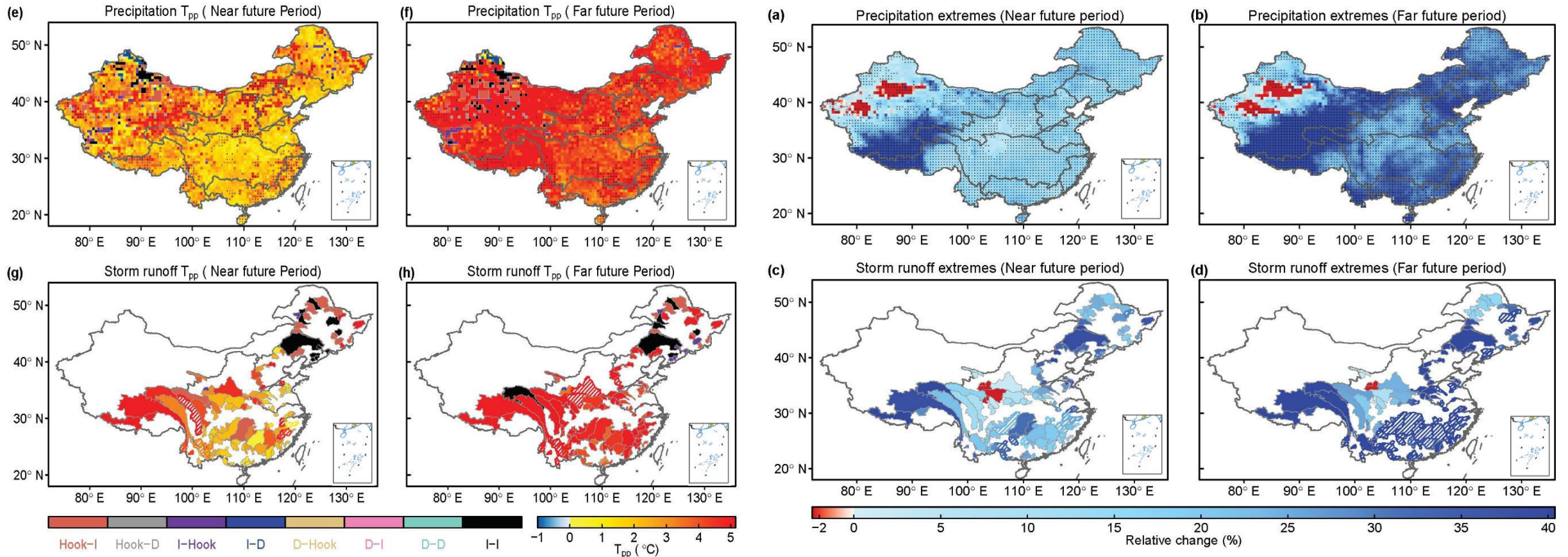
Along with an increasing  $T_{pp}$ , the hook structure shows an upward shift, resulting in a significant intensification of hydrological extremes in the future.



More than 80% of continental areas retain a hook structure during historical and future periods, while Peak point temperature ( $T_{pp}$ ) progressively increases with atmospheric warming.

# 4 A potential upper bound for future extremes?

## Does the hook structure imply a potential upper bound for future extremes?



$T_{pp}$  shifts toward warmer temperatures, resulting in 10%–30% increases in storm runoff extremes.

*Yin J, et al., WRR (2021 Editors' Choice Awards)*



# Conclusions

- ❑ Precipitation and storm runoff extremes show a hook structure with temperature rising.
- ❑ Atmospheric thermodynamic intensifies precipitation extremes, while atmospheric dynamics decline precipitation in hotter environment.
- ❑ The thermodynamic components do not always contribute to precipitation intensification due to changes in temperature lapse rate.
- ❑ The hook structure does not imply potential bound for future extreme intensification.



# Thank you!

## Research interests:

Atmospheric dynamics; Climate change;  
Ecohydrology; Machine learning;  
Hydrological extremes; Remote sensing

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*In collaboration with Prof. Pierre Gentine, Prof. Louise Slater and Prof. Shenglian Guo*

