

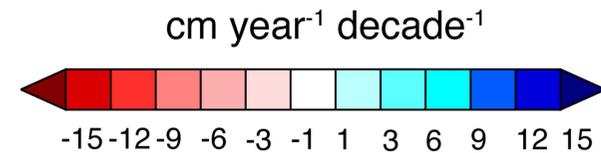
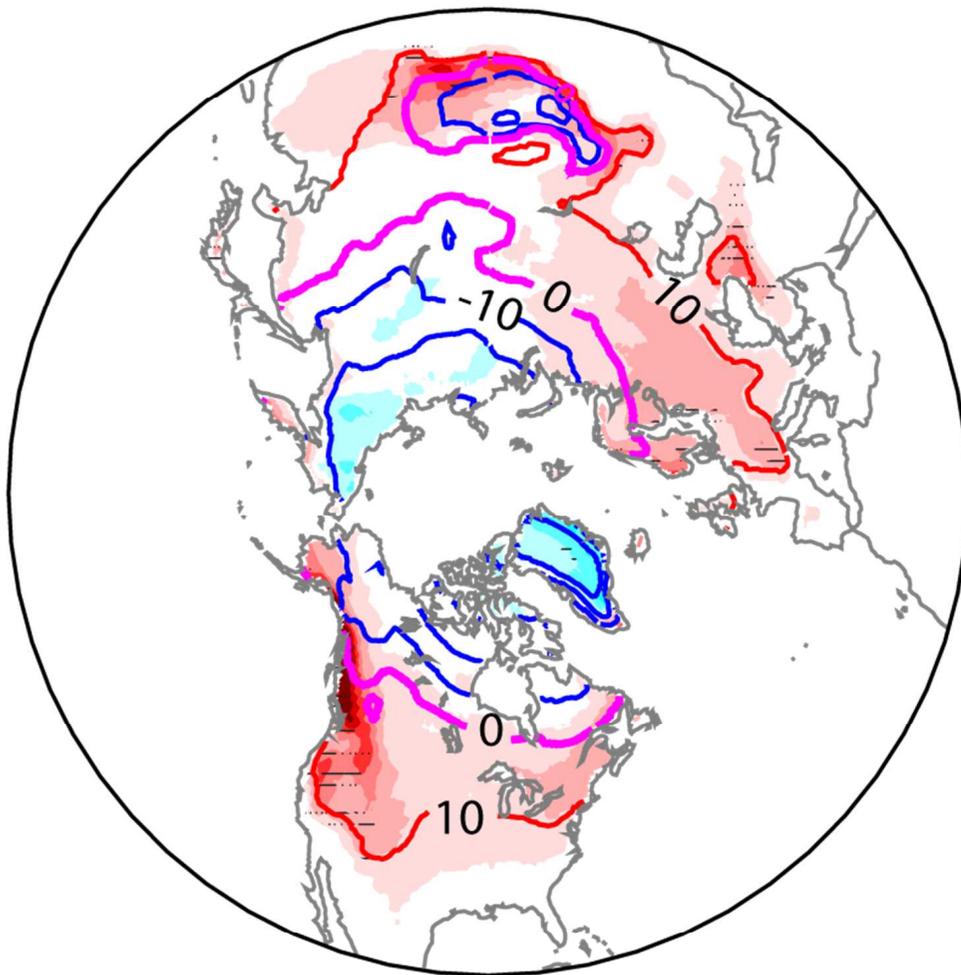
# Response of snowfall extremes to climate change: theory and simulations



**Paul O’Gorman, MIT**

Workshop on Water in the Climate System, 2014

# Simulations of climate warming: declines in annual-mean snowfall in many regions



CMIP5 multimodel mean trends in snowfall depth (2006-2100 based on rcp4.5)

Contours of 2m temperature shown in degrees Celsius for 1986-2005

# What about snowfall extremes? (heavy daily snowfall events)

- Important because of disruption of transportation (roads, air, rail), business, schools
- May not respond to climate change like mean snowfall  
e.g., heavy snowfall events in both anomalously cold and warm years (Kunkel et al, 2013; Changnon et al 2006)

# Regional studies of observed snowfall extremes: Decadal variability but inconsistent long-term trends

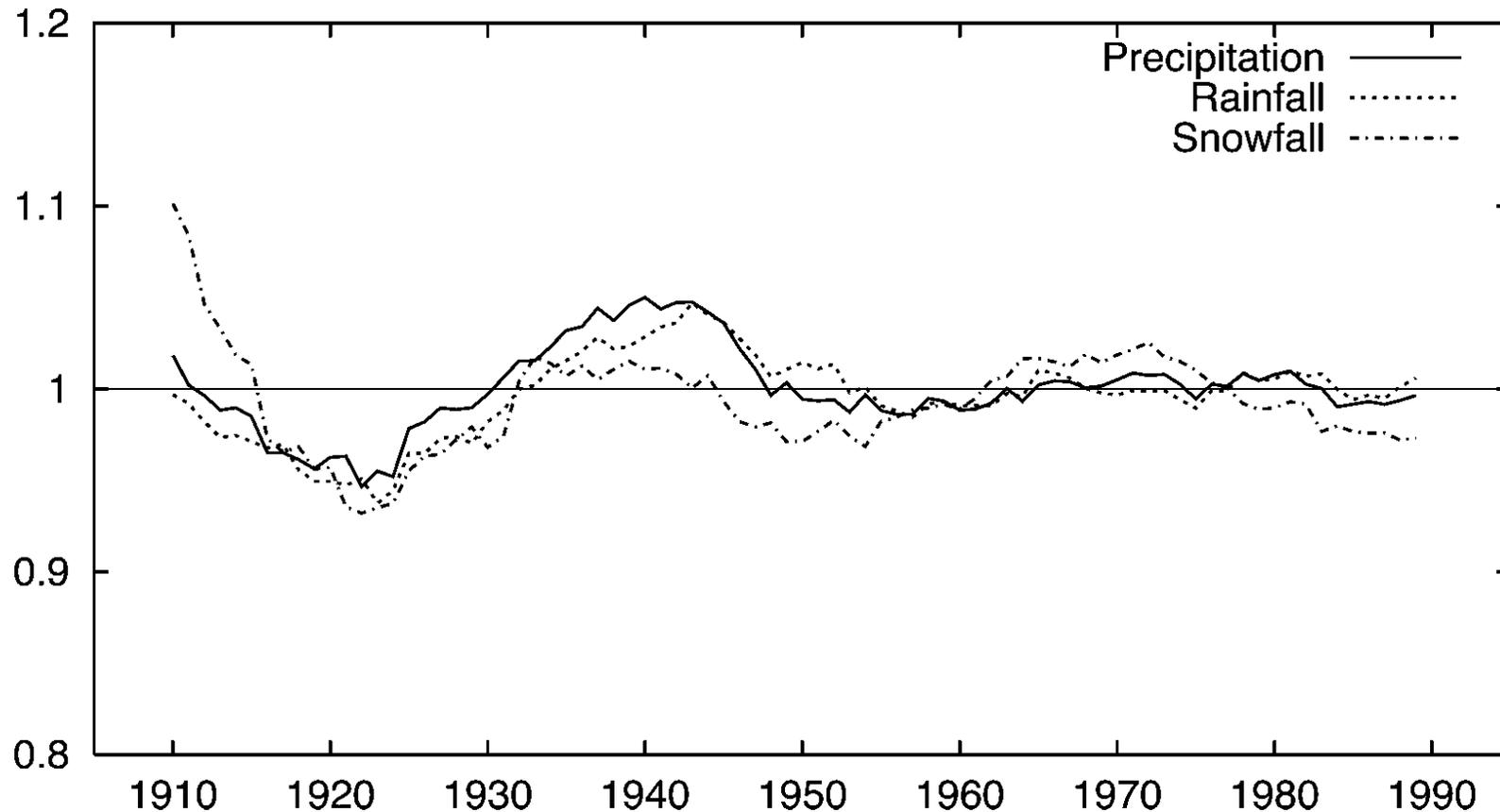
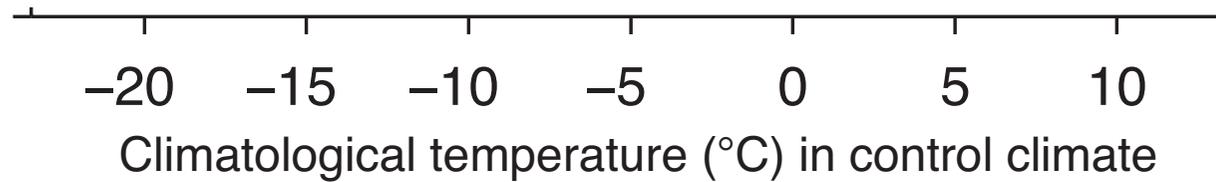


FIG. 6. Nationally averaged 20-yr return values (relative to the values for 1971–90) of annual maximum daily precipitation, rainfall, and snowfall. The 20-yr return values are first estimated using 20-yr running windows for every station, and then normalized by the values estimated for the period 1971–90. Values are plotted in the center of the 20-yr window.

# Effect of climate change on daily snowfall extremes in global simulations

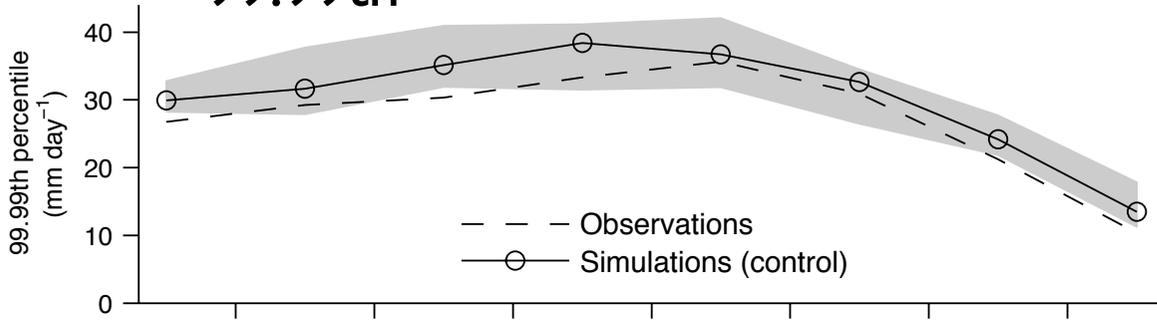
- High percentiles of daily snowfall in liquid water equivalent
- CMIP5 (use 20 models) under RCP8.5
- Compare warm climate (2081-2100) to control climate (1981-2000)

# Analyze according to climatological temperature in control climate

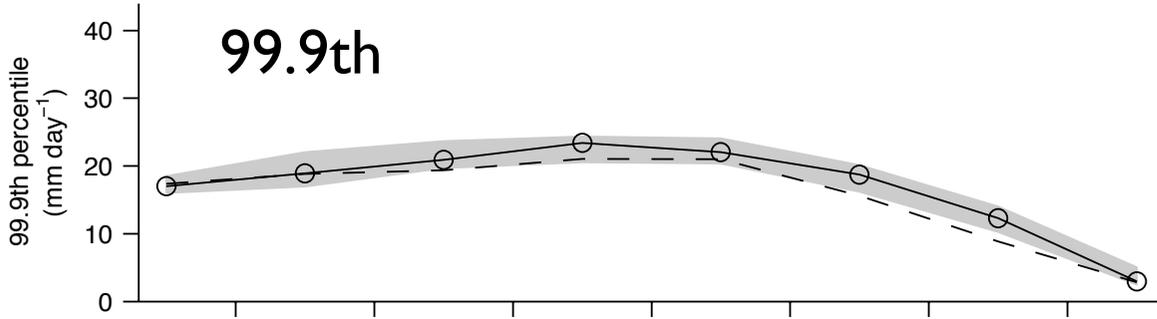


Grid boxes and days binned by climatological monthly surface air temperature in control climate

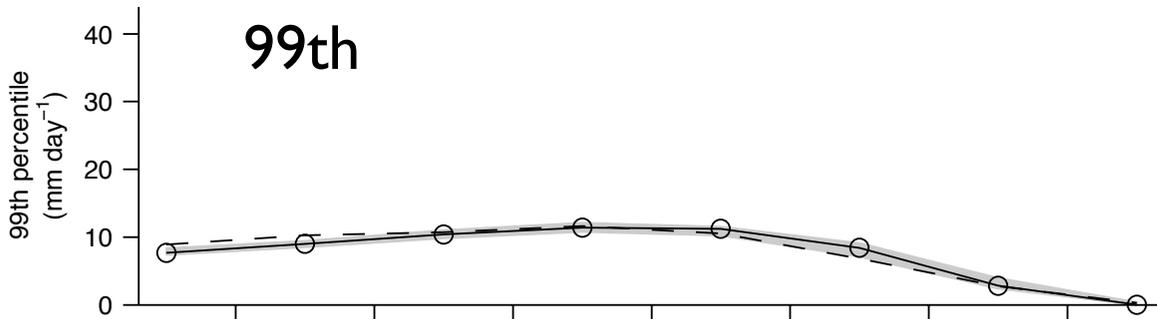
99.99th



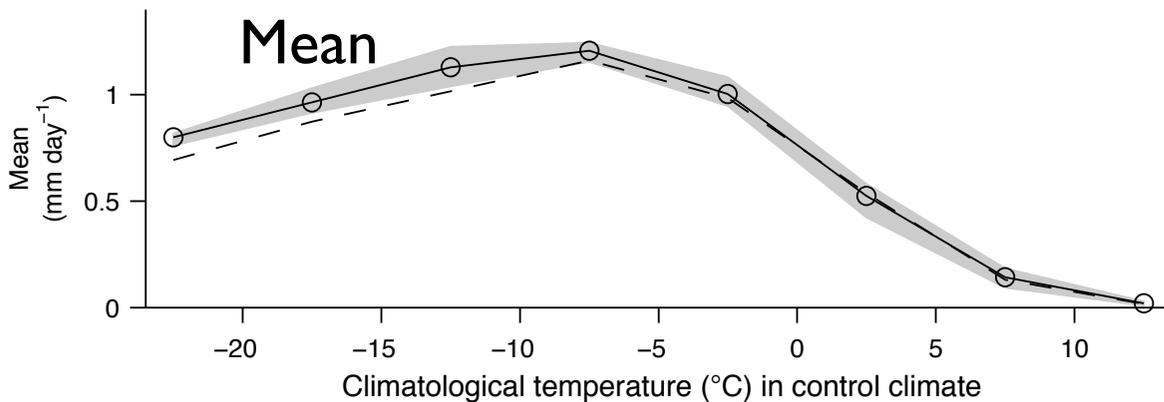
99.9th



99th



Mean

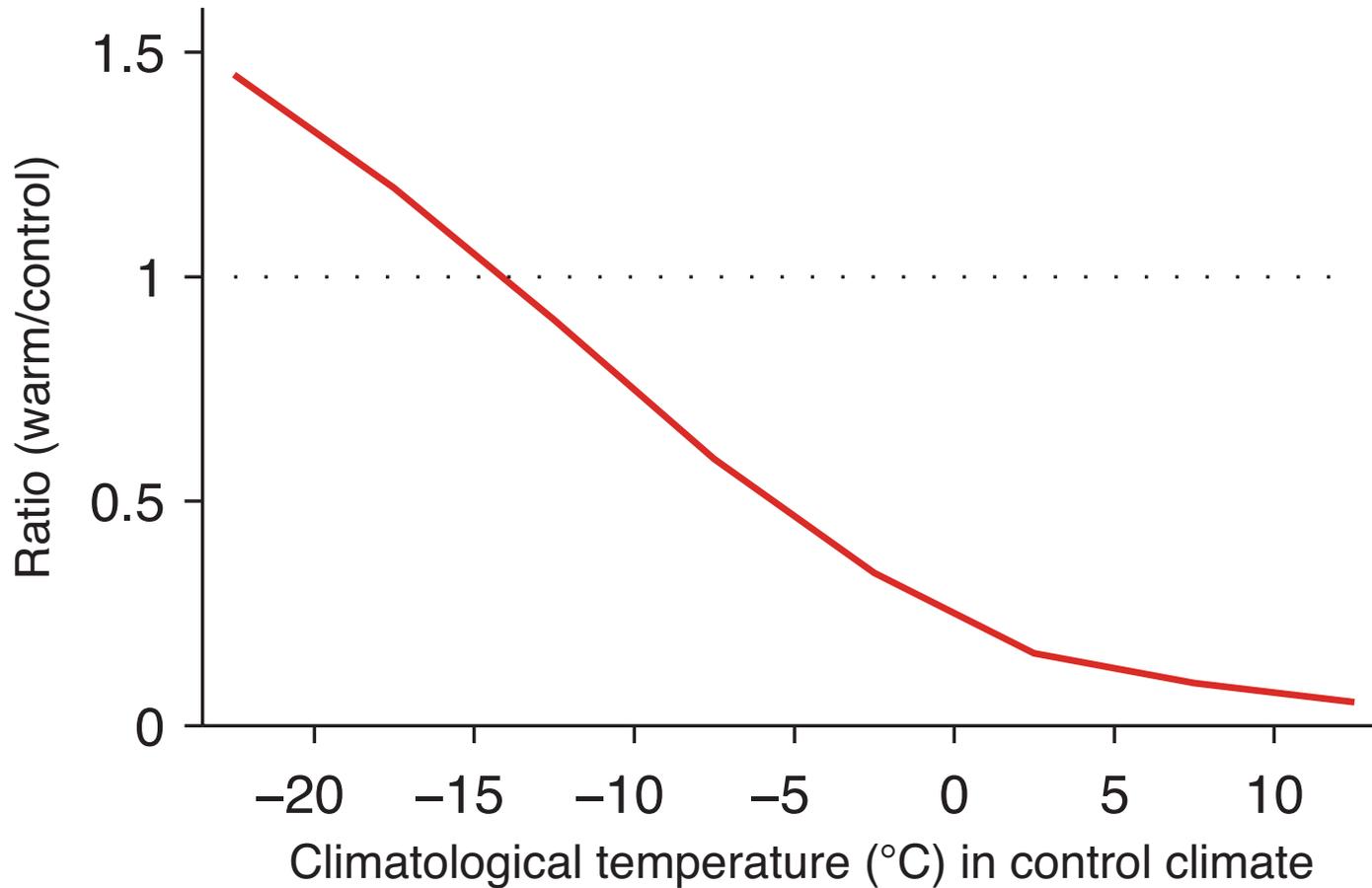


Simulated snowfall extremes compare well with estimates from observations

Northern hemisphere land only

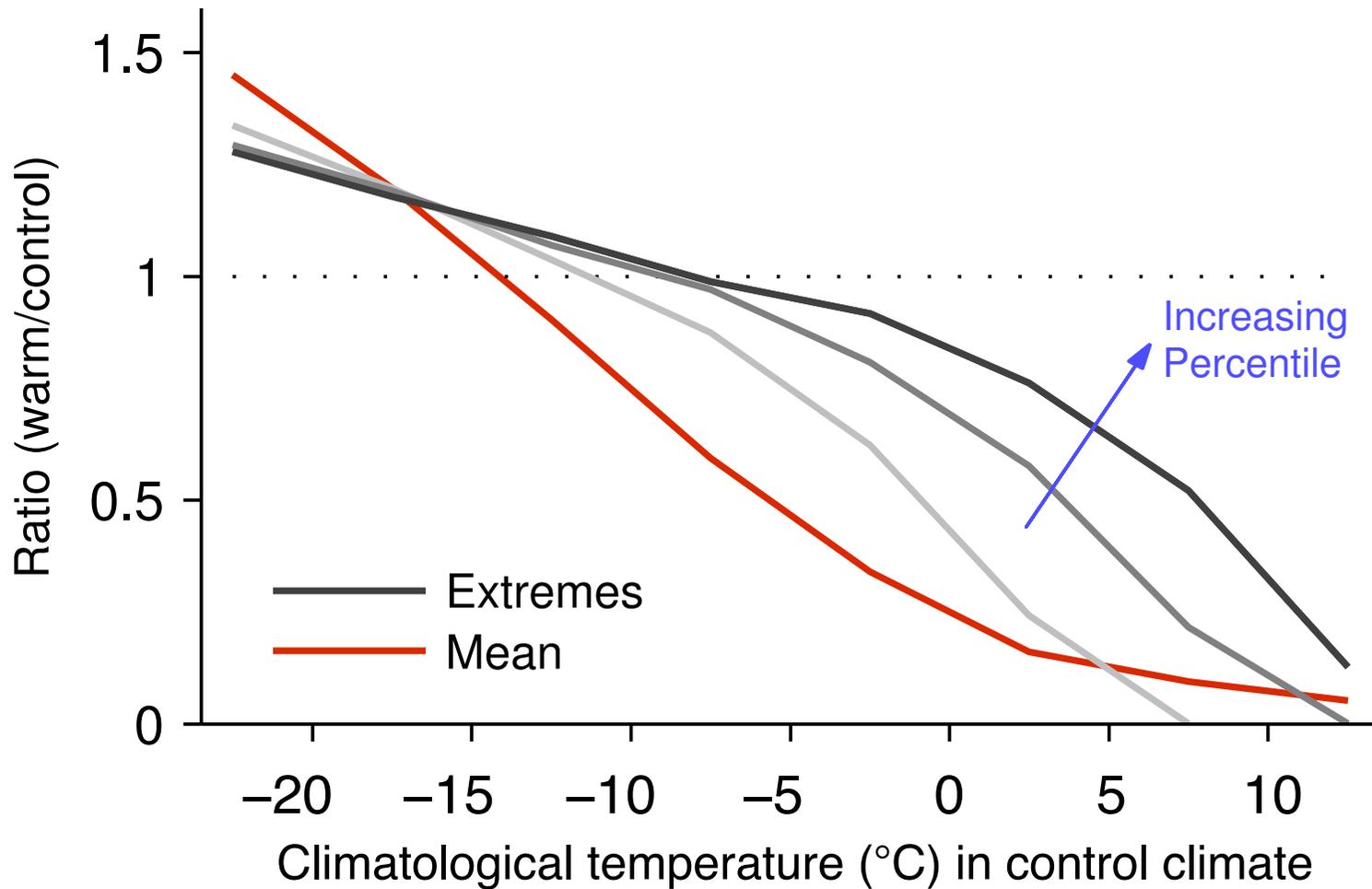
Observational estimates based on daily precipitation rates (GPCP 1DD), snowfall fraction (Feiccabrino et al 2013), and daily surface temperatures (NCEP2)

# Response of mean snowfall to climate warming: ratio of warm over control-climate values



(Northern Hemisphere land below 500m)

# Weaker response of daily snowfall extremes as compared to mean snowfall



99th, 99.9th and 99.99th percentiles of daily snowfall

## Features of the response of snowfall extremes that would like to understand:

- Climatological temperature at which snowfall extremes response goes from positive to negative
- Weaker fractional changes at higher percentiles

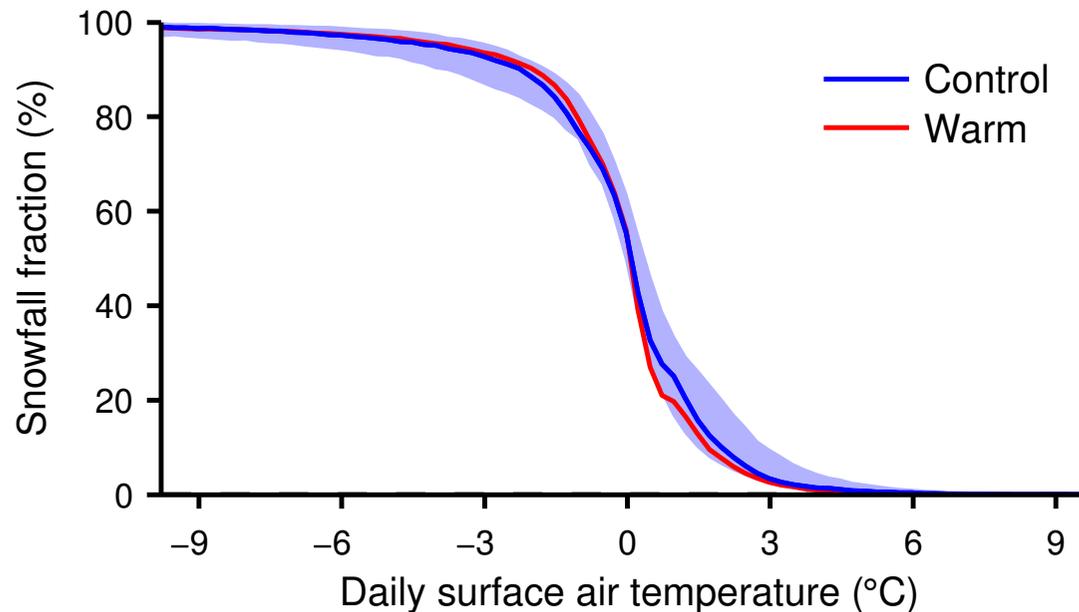
Simple theory (based on known physics/  
observations) for the response of snowfall  
extremes to changes in climate

# Theory assumptions I:

Relate daily snowfall rate ( $s$ ) to precipitation rate ( $p$ )  
and surface air temperature ( $T$ )

$$s = f(T)p$$

Snowfall fraction:  $f(T)$



## Theory assumptions 2: Relate precipitation rate ( $p$ ) to temperature ( $T$ )

$$p = e^{\beta T} \hat{p}$$

$$\beta = 0.06^{\circ}\text{C}^{-1}$$

- Normalized precipitation variable  $\hat{p}$  behaves like upward velocity; follows gamma distribution on wet days
- Temperature is normally distributed and independent of  $\hat{p}$

## Integral expression for $q^{\text{th}}$ percentile of snowfall ( $s_q$ )

$$1 - \frac{q}{100} = \int_{-\infty}^{\infty} dT \int_{hs_q}^{\infty} d\hat{p} \frac{w\gamma^k}{\Gamma(k)} \hat{p}^{k-1} e^{-\gamma\hat{p}} \frac{1}{\sqrt{2\pi}\sigma} e^{-\frac{(T-\bar{T})^2}{2\sigma^2}}$$

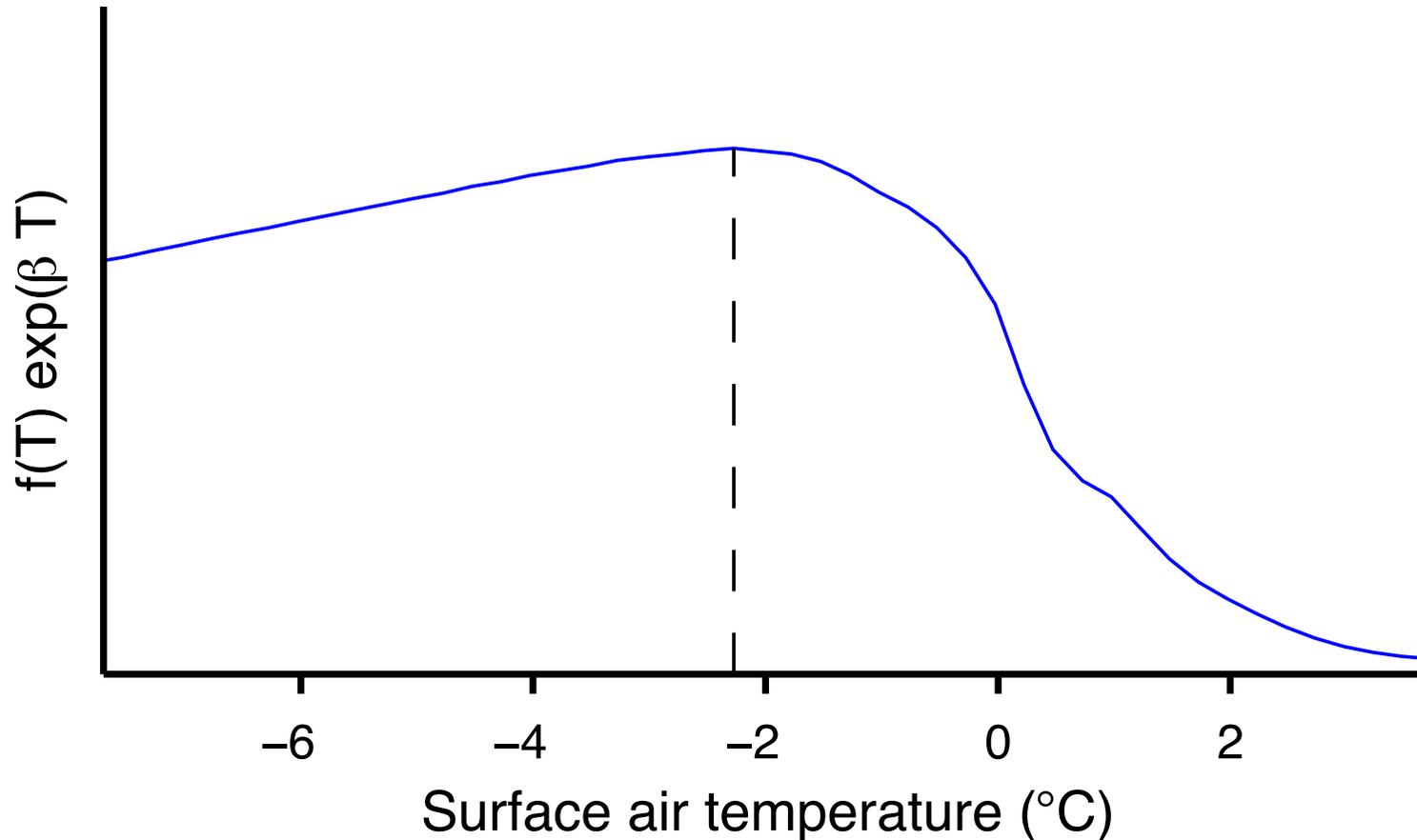
where the fraction of wet days is  $w$  and  $h(T) = e^{-\beta T} f(T)^{-1}$

→ Evaluate using asymptotic methods for large  $s_q$

Asymptotics gives expression for snowfall extremes  
that involves optimal temperature  $T_m$

$$(\gamma s_q h_m)^{\frac{3}{2}-k} e^{\gamma s_q h_m} = \frac{w}{\sigma \left(1 - \frac{q}{100}\right) \Gamma(k)} \sqrt{\frac{h_m}{h_m''}} e^{-\frac{(\bar{T}-T_m)^2}{2\sigma^2}}$$

Temperature dependence of snowfall reaches a maximum at  $T_m$  (roughly  $-2^\circ\text{C}$ )



Competition between increasing precipitation and decreasing snowfall fraction with increasing temperature

## Simple result if only mean temperature changes

$$\delta S_q = -\frac{\delta \bar{T}}{\sigma^2 \gamma h_m} \left( \bar{T} + \frac{\delta \bar{T}}{2} - T_m \right)$$

$\delta S_q$  Change in  $q^{\text{th}}$  percentile of snowfall with climate change

$\delta \bar{T}$  Change in mean temperature

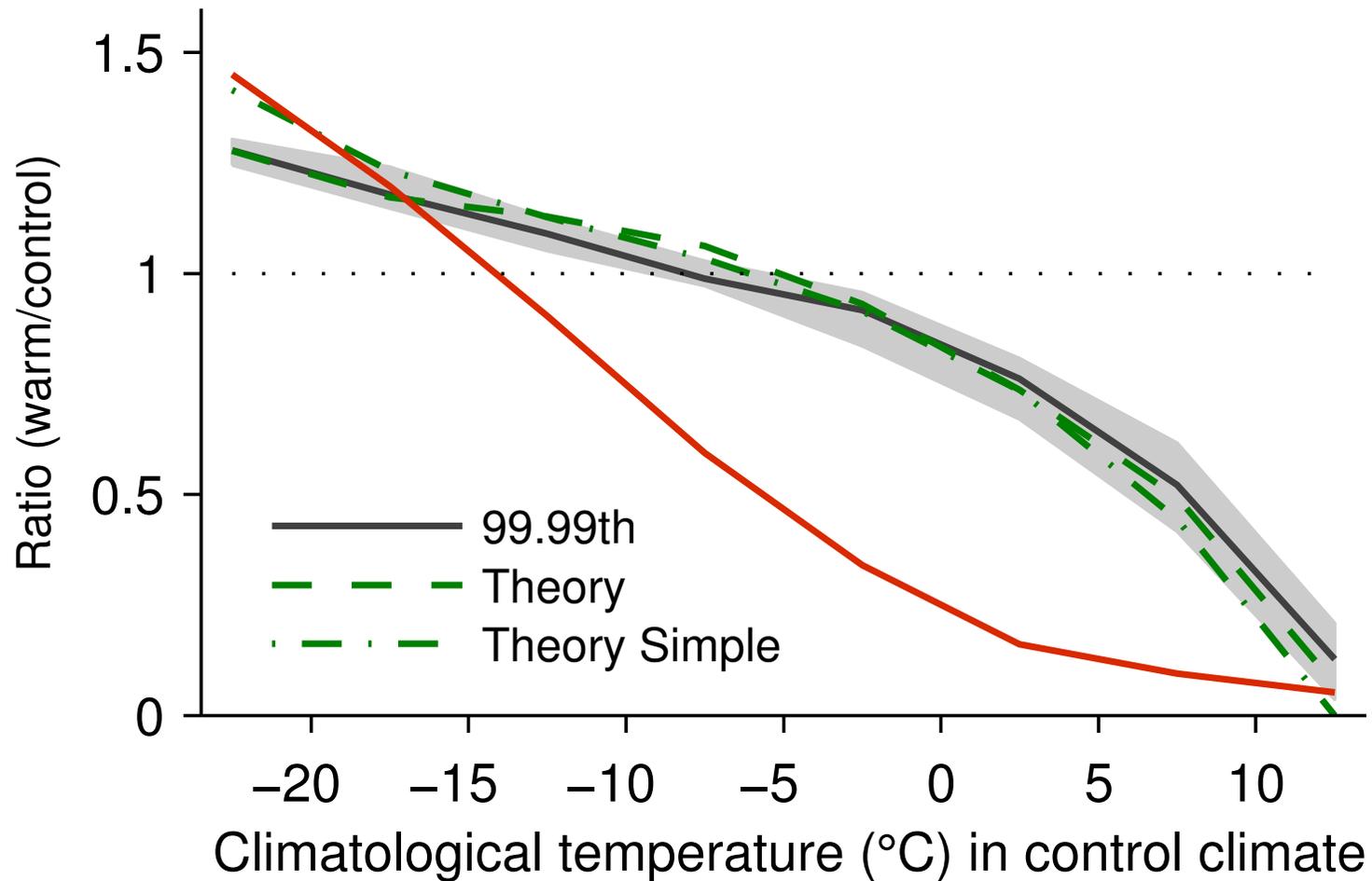
$\sigma^2$  Variance of daily temperature

$T_m$  Optimal temperature

$\gamma h_m$  Inverse precipitation scale

# Theory matches simulations

(and dynamic changes don't matter very much)



Shading shows interquartile range of model ratios

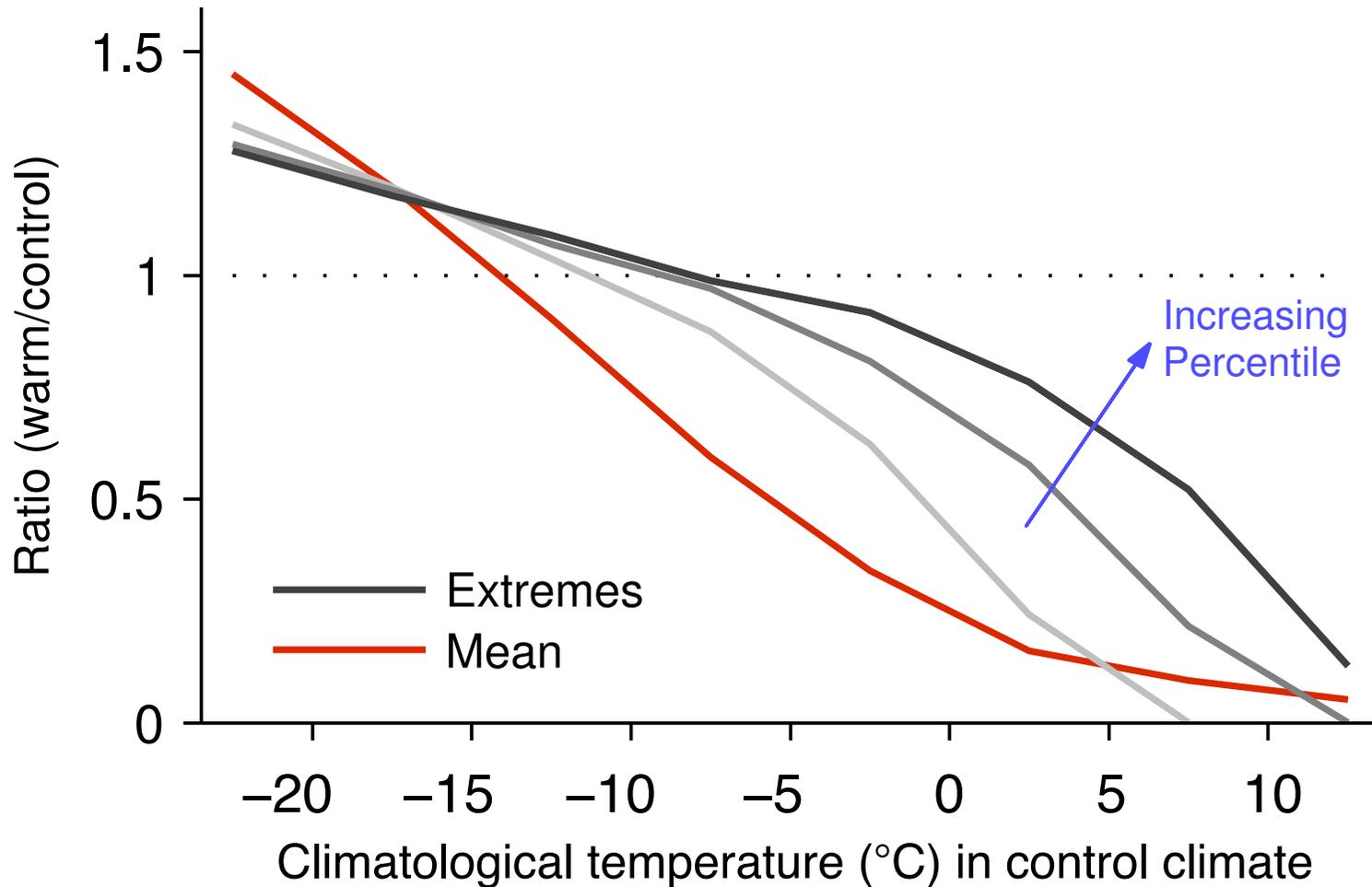
Changes in snowfall extremes don't depend on percentile  $q$ !

$$\delta s_q = -\frac{\delta \bar{T}}{\sigma^2 \gamma h_m} \left( \bar{T} + \frac{\delta \bar{T}}{2} - T_m \right)$$

Example: same change for 99th percentile as 99.99th percentile

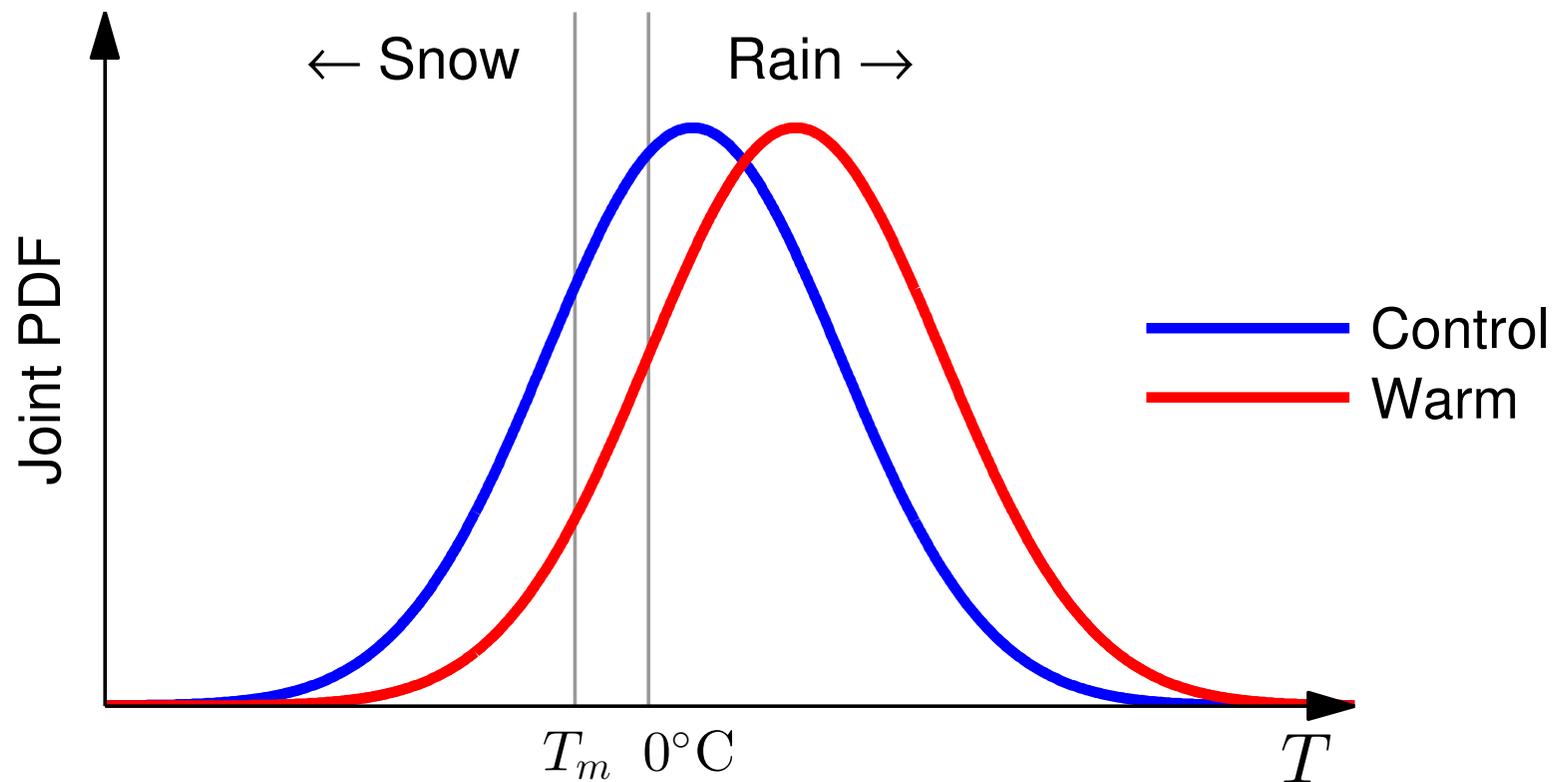
$$\Rightarrow \delta s_q / s_q \rightarrow 0 \text{ as } s_q \rightarrow \infty$$

# Fractional changes in snowfall extremes tend to zero for high percentiles



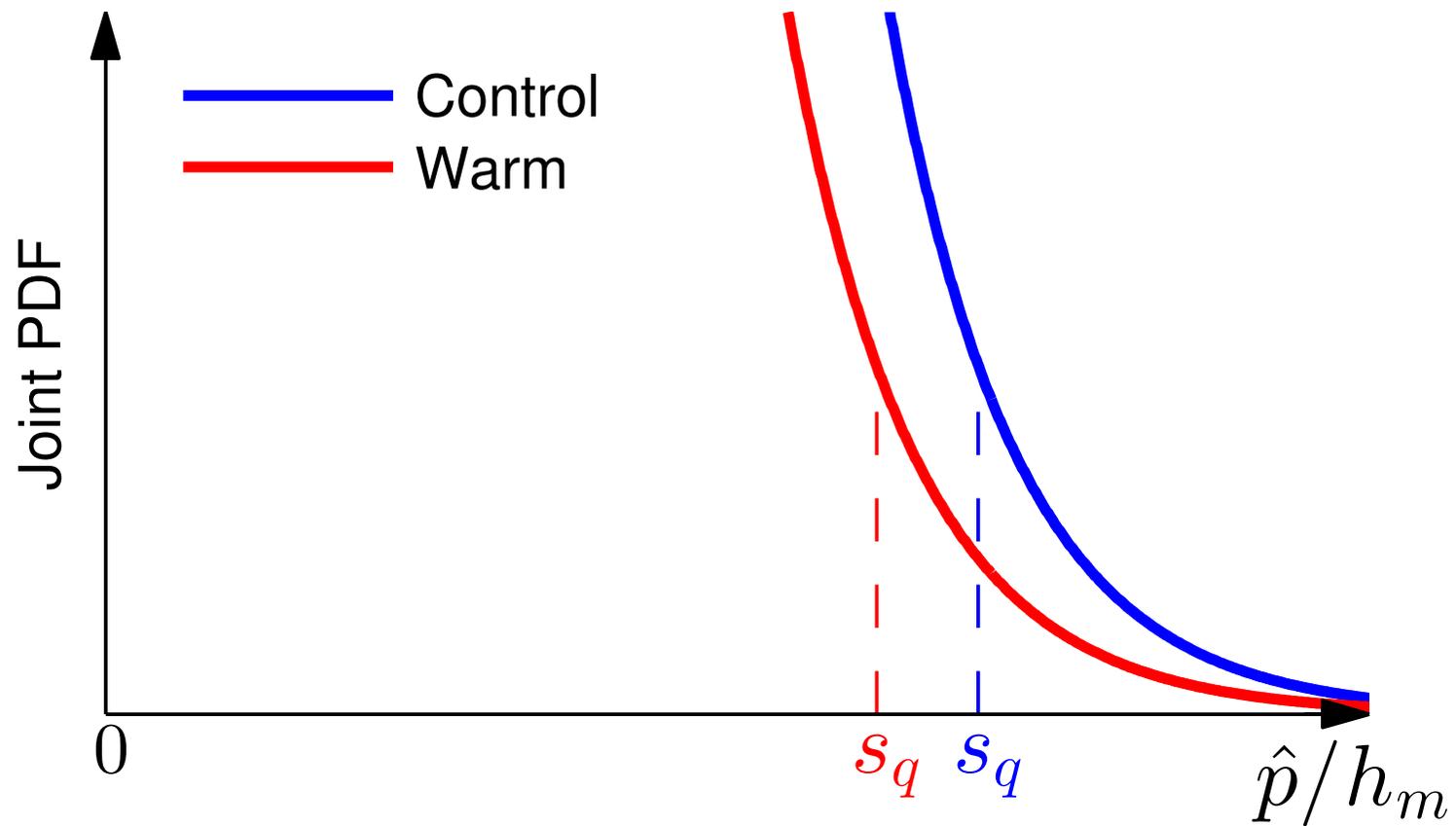
99th to 99.99th percentiles of daily snowfall

# Intuition: Probability of optimal temperature ( $T_m$ ) for snowfall extremes does change as climate warms

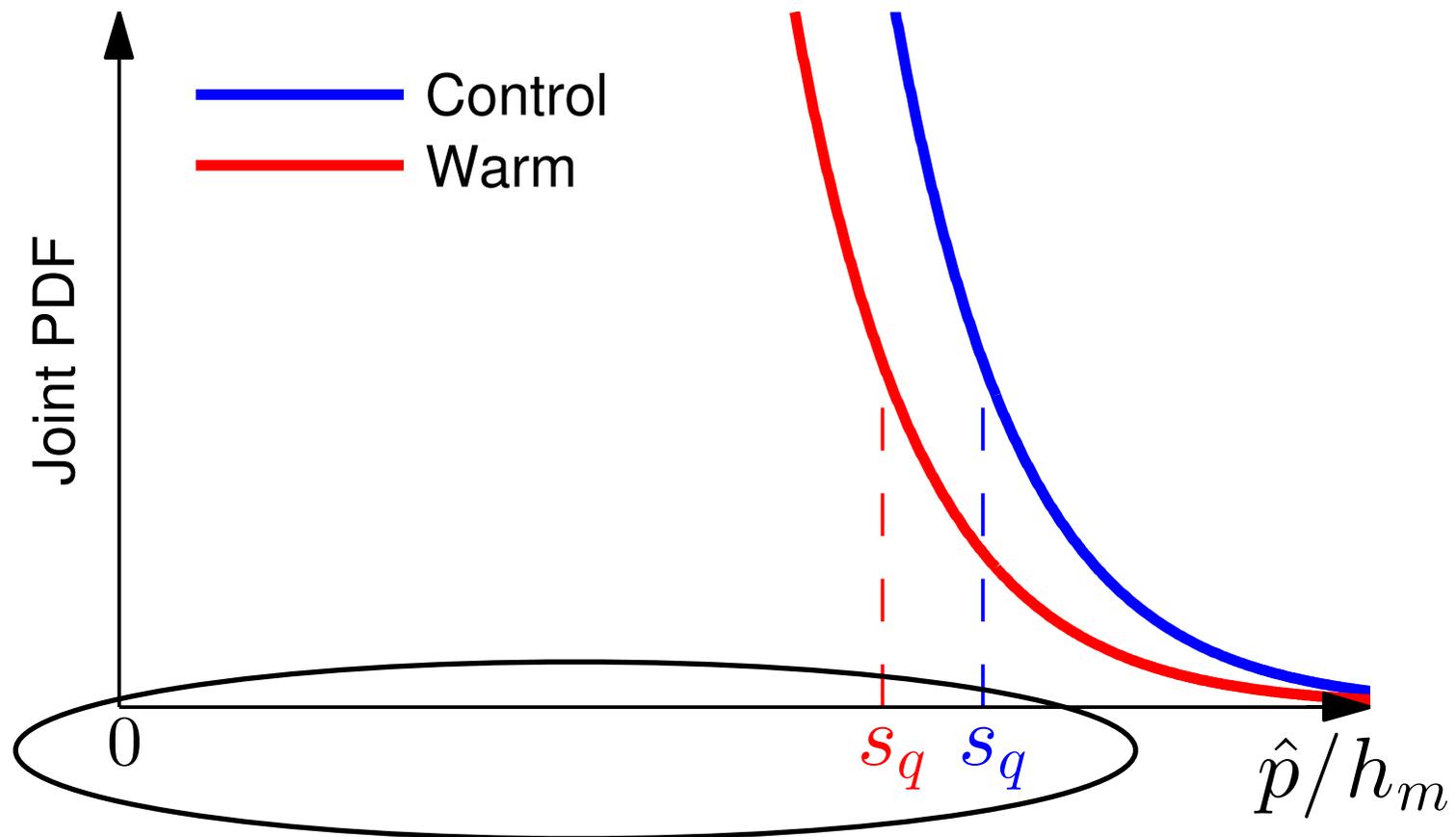


Also mean snowfall decrease substantially

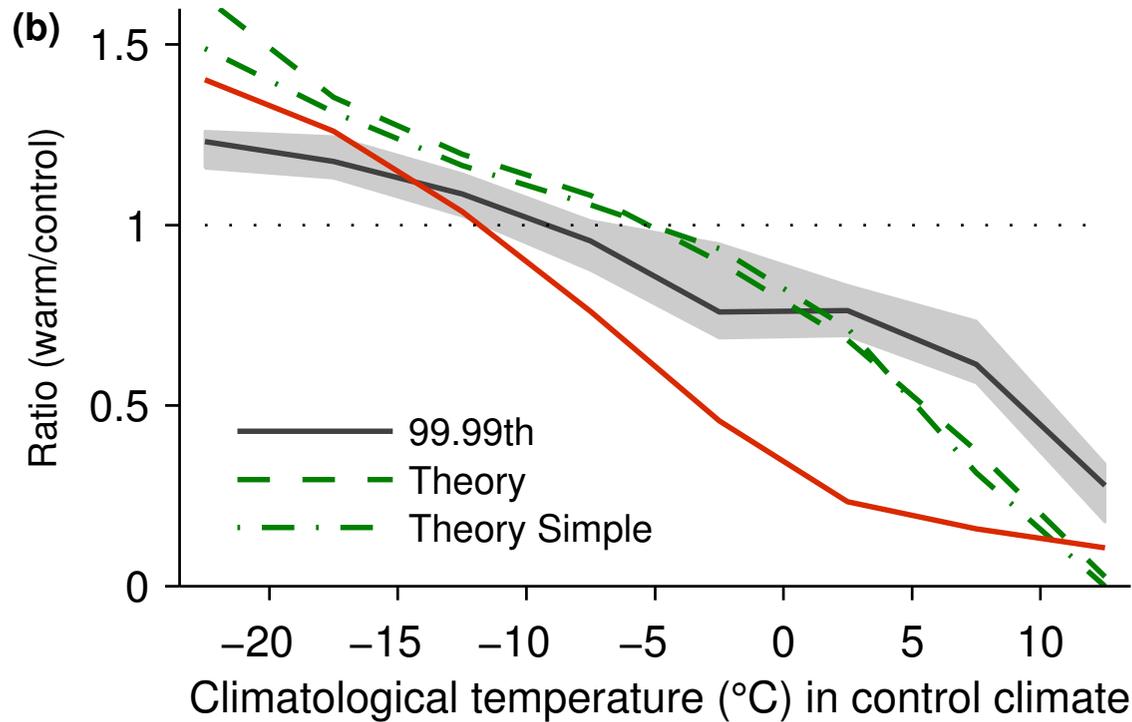
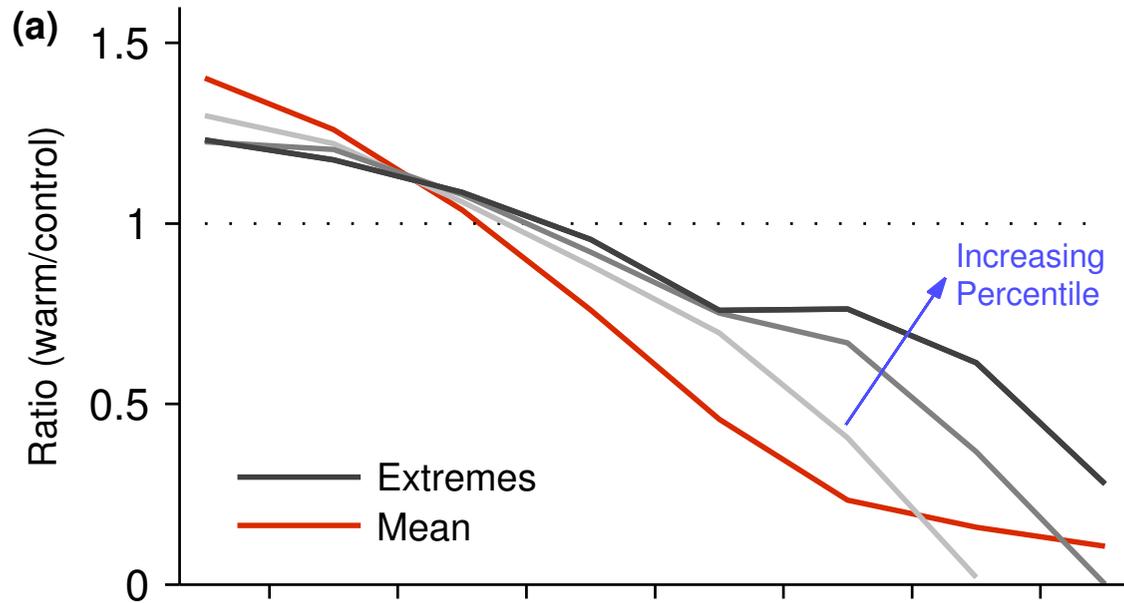
# Results in changes in snowfall percentiles



## Results in changes in snowfall percentiles



...but fractional change in  $s_q$  is fairly small and is similar for all high percentiles



Similar results above  
500m elevation  
(but models have  
issues there)

*cf. Kapnick & Delworth, 2013*

# Conclusions

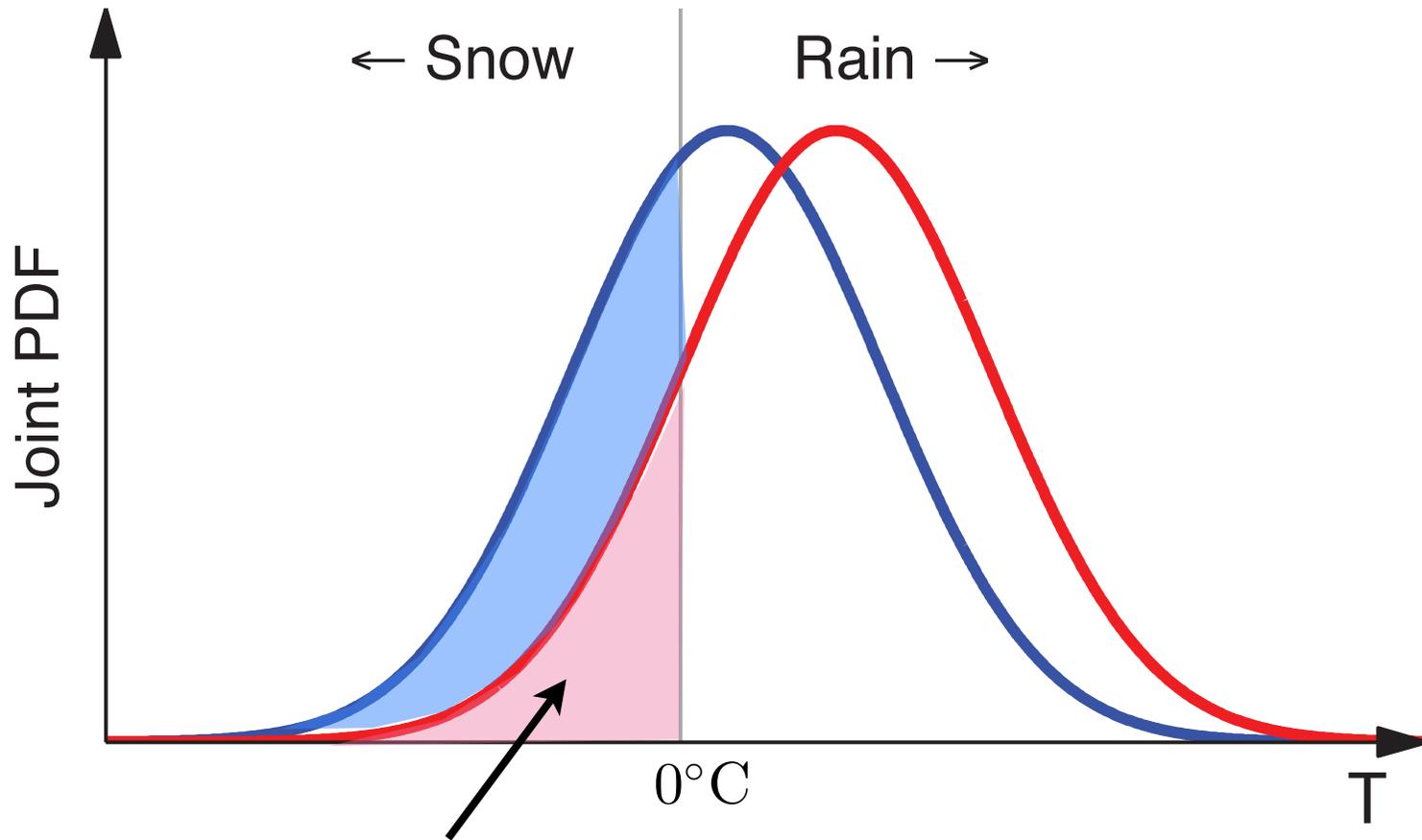
- *Simulations*: Smaller fractional changes in snowfall extremes than in mean snowfall in many cases
- *Simple asymptotic theory*: captures main features of response

$$\delta S_q = -\frac{\delta \bar{T}}{\sigma^2 \gamma h_m} \left( \bar{T} + \frac{\delta \bar{T}}{2} - T_m \right)$$

- *Implications*: detection and perception of climate change, changes in snowfall extremes still likely to have impacts

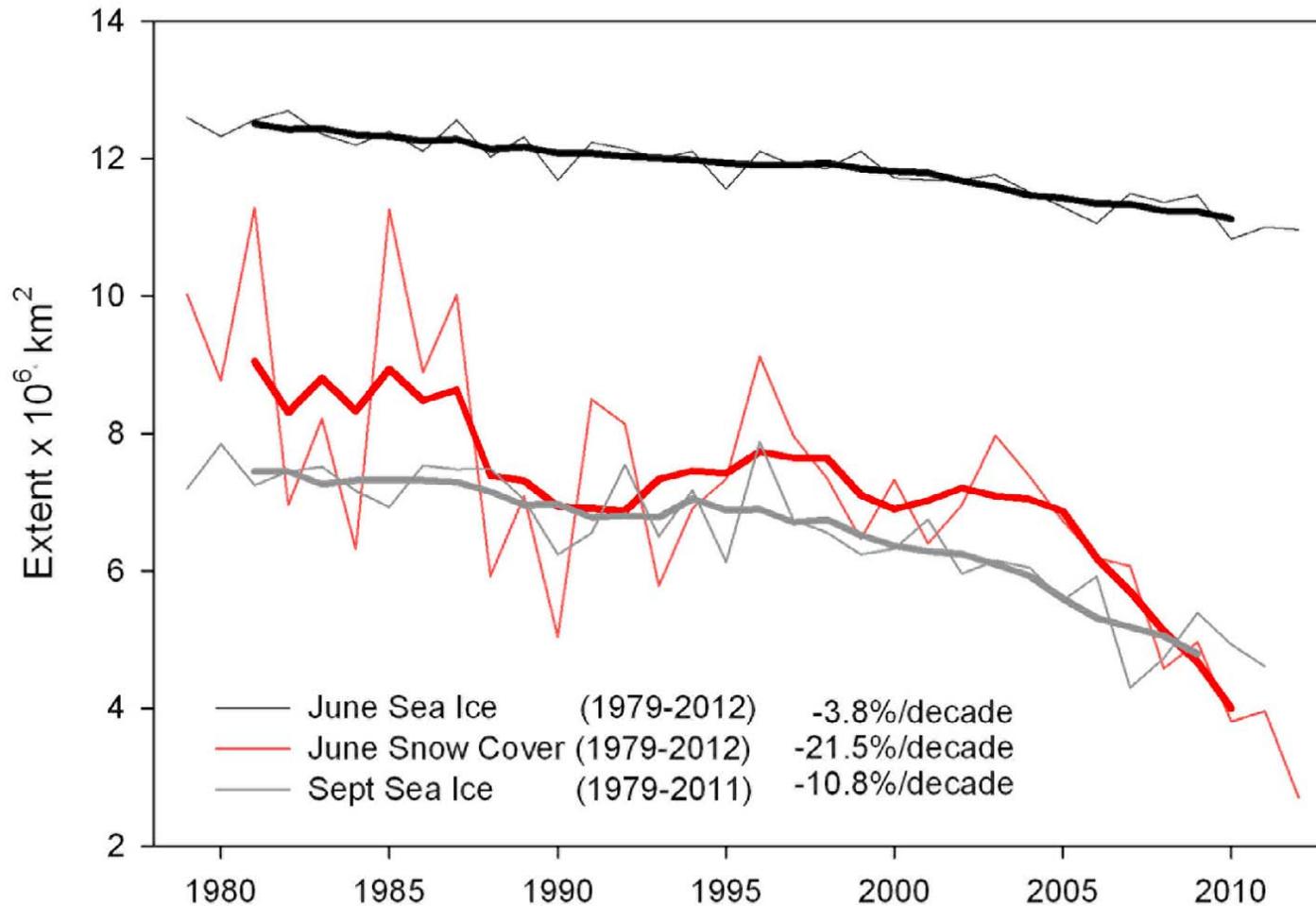


By contrast:  
Probability of snowfall and mean snowfall decrease  
substantially



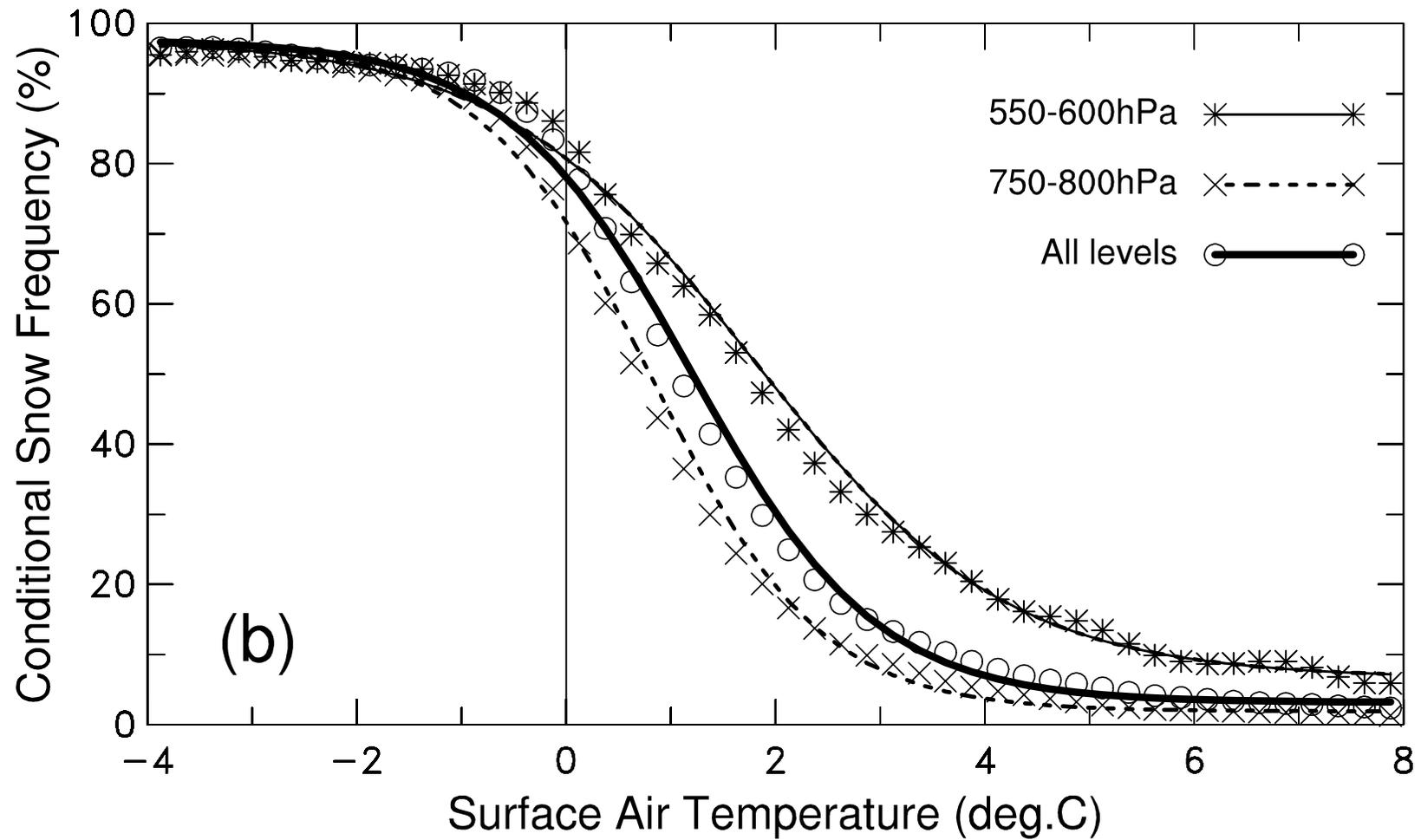
Big decrease in area under curve to left of  
rain-snow transition temperature

# Rapidly changing snow cover in Northern Hemisphere

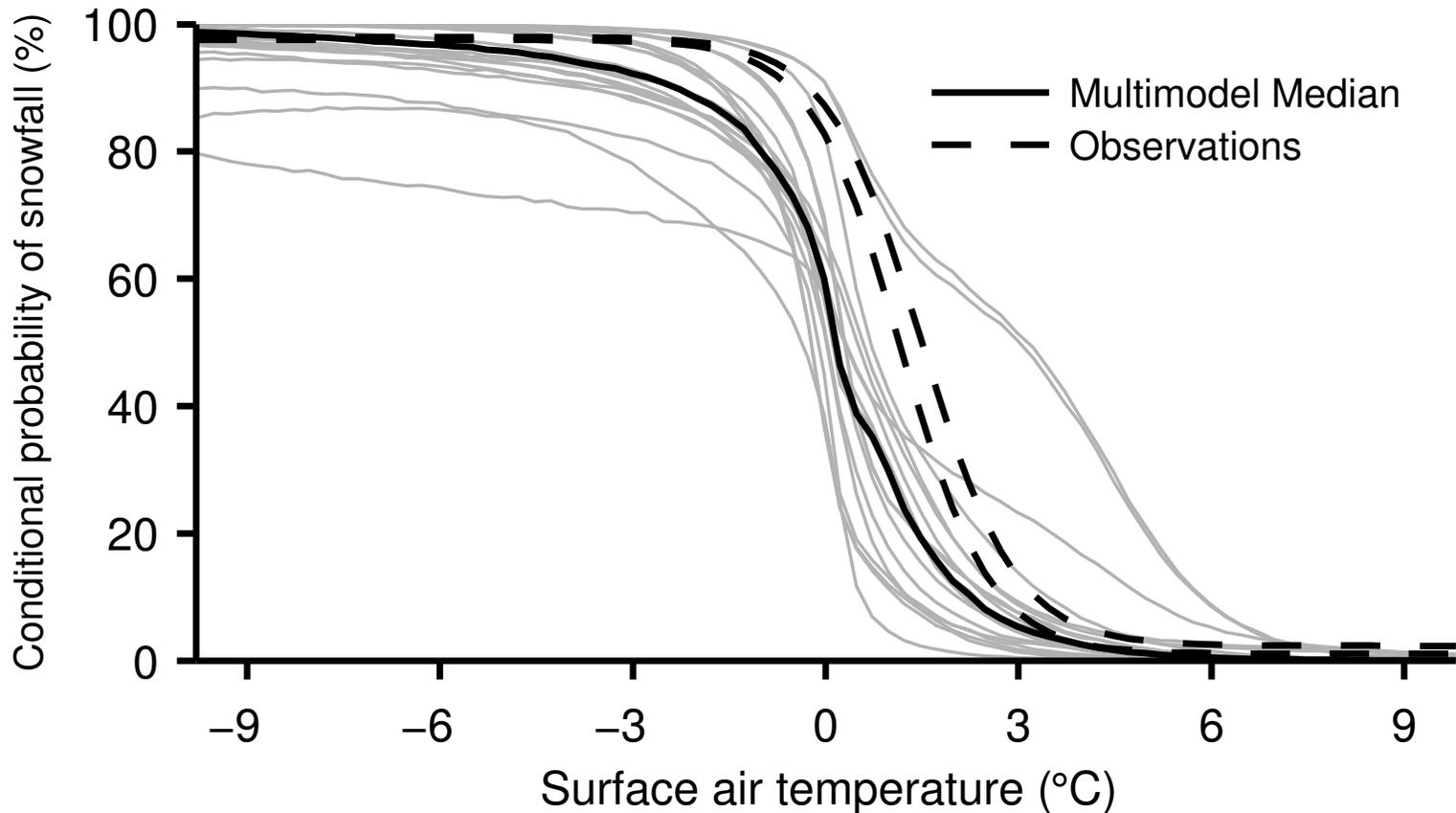


**Figure 2.** Time series of Northern Hemisphere June snow cover (NOAA snow chart CDR) and sea ice extent (NASA TEAM) for 1979–2012 (1979–2011 for sea ice). Thick line denotes 5-yr running mean.

# Probability of snowfall given that precipitation occurs

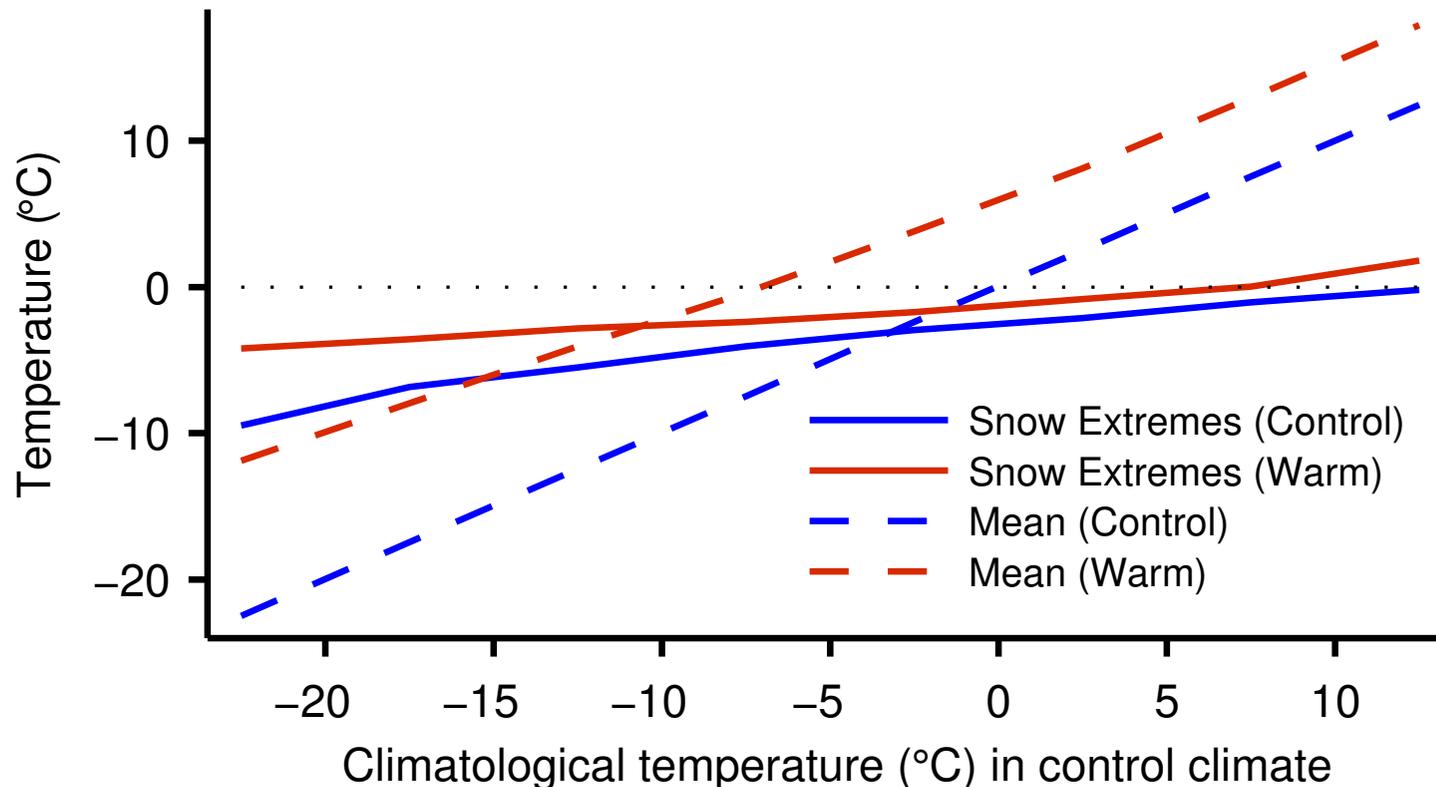


# Rain-snow transition in climate models (CMIP5) versus observations



- 3-hourly observed (Dai 2008): 2 curves depending on whether mixed counted as snow
- Daily accumulations in multimodel median (black) and individual models (gray); snowfall taken to occur if precipitation is 50% solid

Intuition: snowfall extremes occur when temperatures close to freezing (otherwise too cold to snow heavily)



Note snowfall extremes remain at roughly same temperature (with same humidities) as climate changes - unlike rainfall extremes

## Quiz: World record daily snowfall

Where?

How much (inches of depth)?

# World record (probably): 75.8 inches in 24 hours

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MONTHLY WEATHER REVIEW

FEBRUARY 1953

## RECORD SNOWFALL OF APRIL 14-15, 1921, AT SILVER LAKE, COLORADO

J. L. H. PAULHUS

U. S. Weather Bureau, Washington, D. C.

[Manuscript received January 27, 1953]

### ABSTRACT

A snowfall of 87 inches in 27½ hours on April 14-15, 1921, was reported at Silver Lake, Colo. This snowfall, if correctly measured, exceeds others generally accepted as being record values for the United States. Consequently it is important to determine the reliability of the observation. There is no evidence to indicate that the measurement was any less reliable than that of other heavy snowfalls, and it appears that a snowfall of this magnitude is meteorologically possible. The Silver Lake snowfall is therefore acceptable as the highest known recorded value for the United States.

# Changes in precipitation extremes: some aspects are well understood!

- Theory
- Climate models
- Observed trends

# Theory: factors controlling intensity of precipitation extremes

Precipitation rate

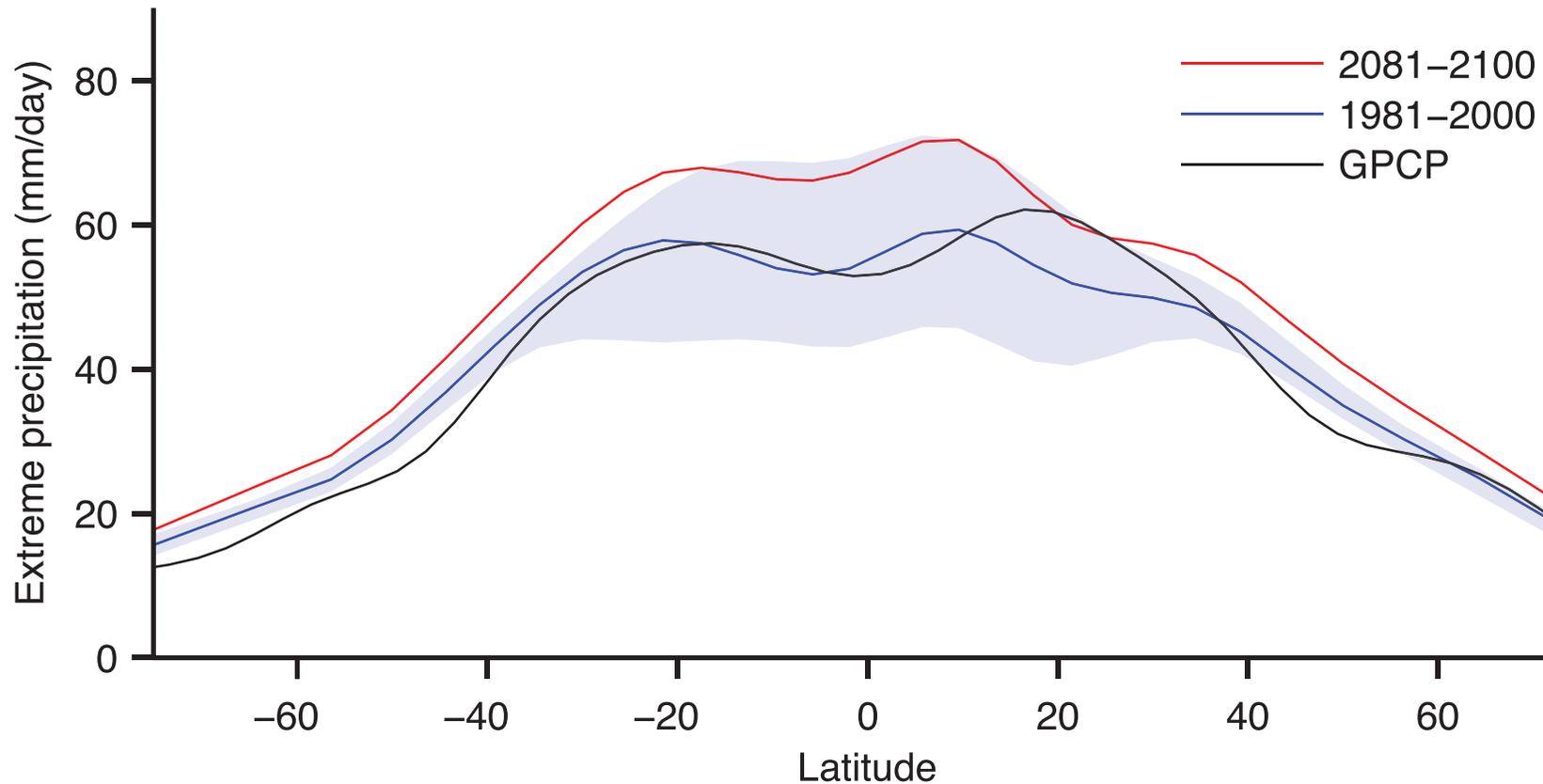
Saturation specific humidity

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

Vertical velocity

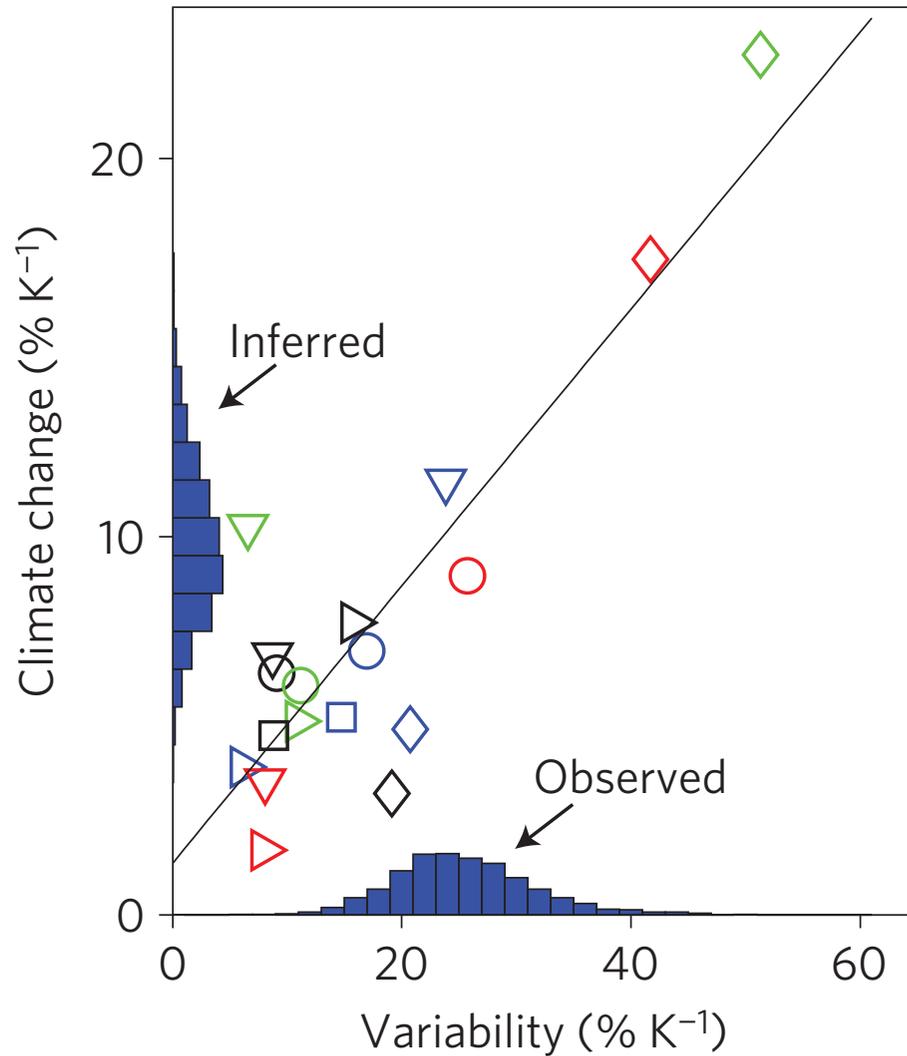
Moist adiabatic derivative

# Growth of precipitation extremes with warming in simulations with climate models

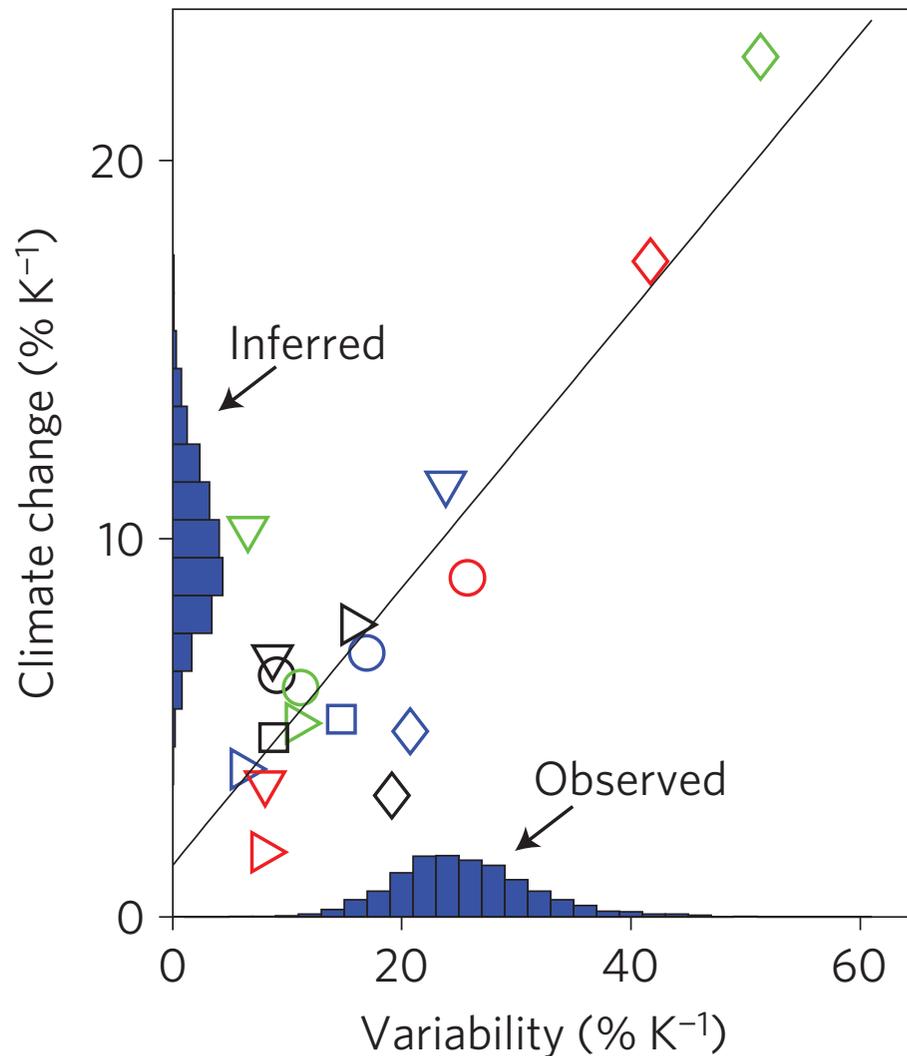


CMIP3 multi-model mean 99.9th percentile of daily precipitation (20c3m to A1B) and current observations (GPCP)

# Problem: Response of tropical precipitation extremes varies widely between models



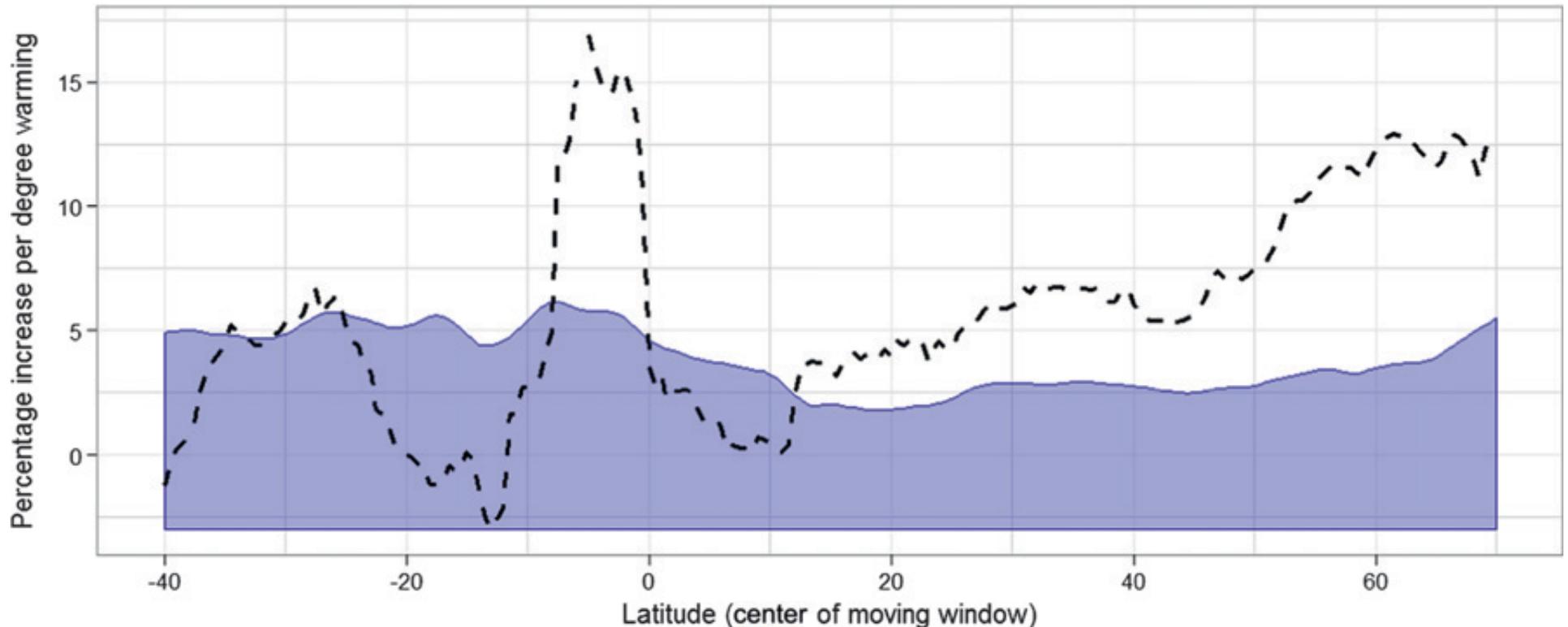
# Problem: Response of tropical precipitation extremes varies widely between models



Use observed  
variability to constrain:  
 $10 \pm 4\%/K$   
(O’Gorman, Nature Geo. 2012)

(see also Muller, O’Gorman, Back 2011)

# Observed trends in annual-maximum precipitation over land



Sensitivity (%) of annual maximum precipitation per kelvin warming of global near-surface temperature (1900-2009; records > 30 years), with light blue shading indicating the upper 97.5% confidence bound

Intuition: snowfall extremes occur when temperatures close to freezing  
(otherwise too cold to snow heavily)

