

# Understanding Temperature Distributions from a Dynamical Perspective

IMSI Confronting Global Climate Change

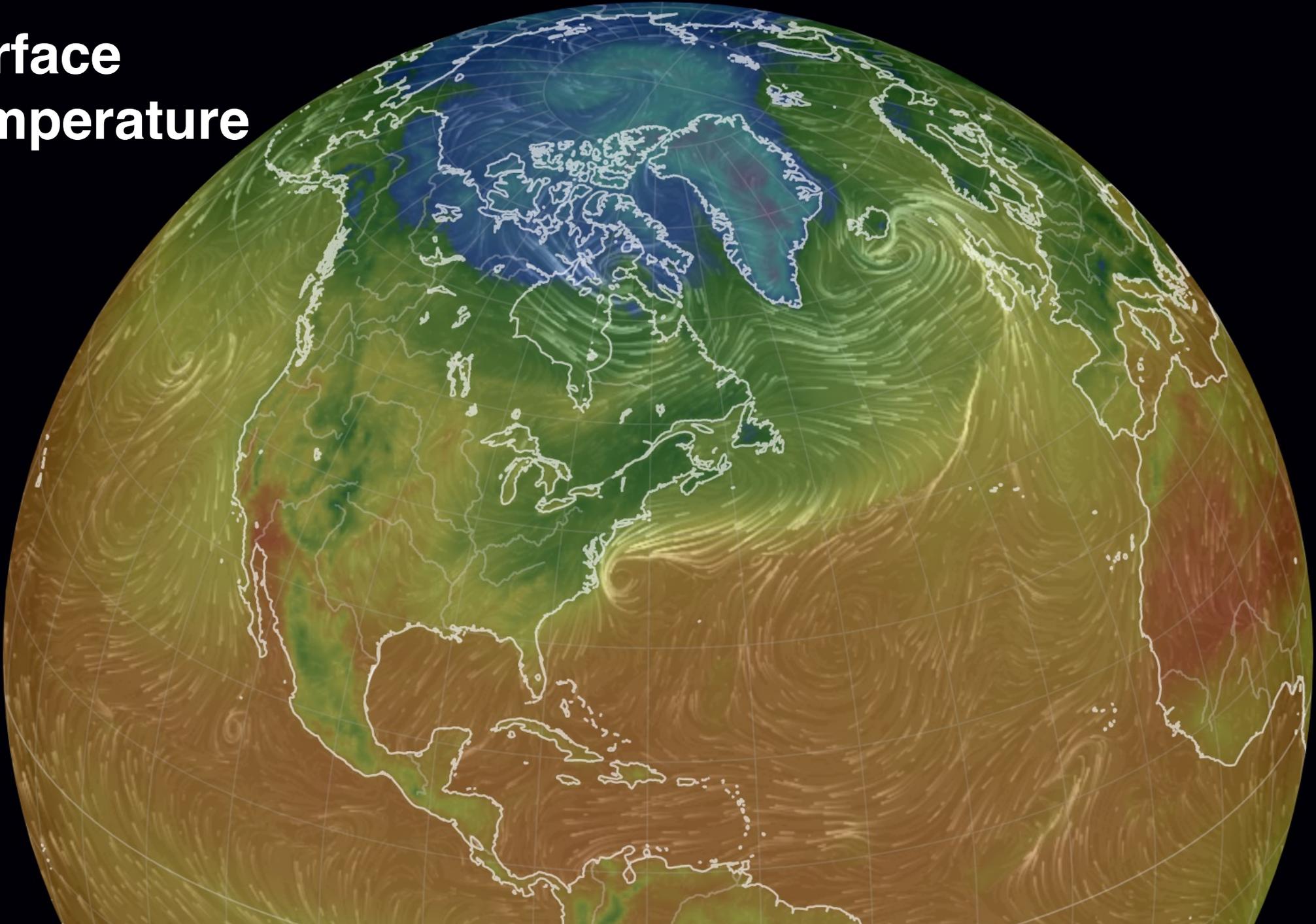
Climate and Weather Extremes

October 4, 2022

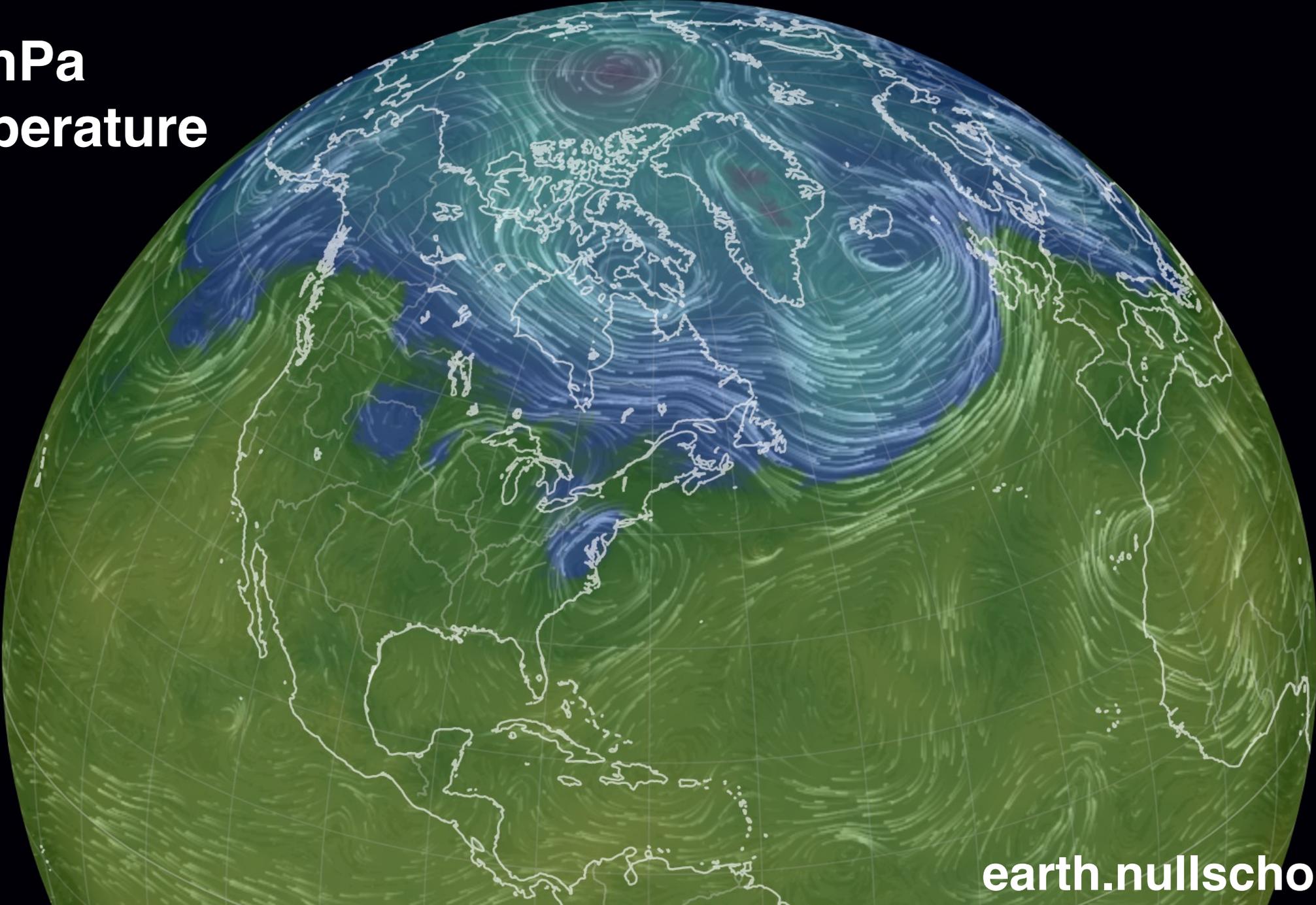
Marianna Linz

with Gang Chen, Boer Zhang, Heng Quan, and Todd Mooring

# Surface Temperature



**700 hPa  
Temperature**



- 1) What processes set the shape of temperature distributions?
- 2) What changes might we expect in the future?

Begin with the equation that describes the evolution of any tracer:

$$\frac{\partial \theta}{\partial t} = -\mathbf{v} \cdot \nabla \theta + \dot{\theta}$$

Local tendency
advection
everything else

It can be shown that, with a first order Taylor expansion:

$$\left\langle \frac{\partial \theta}{\partial t} \right\rangle^e \approx - \left\langle \mathbf{v} \cdot \nabla \theta \right\rangle^e - \left\langle \frac{\theta - \theta_0}{\tau} \right\rangle^e$$

Local tendency
Advection
First order Taylor expansion of

at temperature quantile e
at temperature quantile e
everything else, evaluated at

at temperature quantile e
at temperature quantile e
temperature quantile e

Assume that the distribution is not changing much over the time-period of interest

$$\left\langle \frac{\partial \theta}{\partial t} \right\rangle^e = - \langle \mathbf{v} \cdot \nabla \theta \rangle^e - \left\langle \frac{\theta - \theta_0}{\tau} \right\rangle^e$$

Small compared to other terms, even though there is a trend

Rearrange to obtain

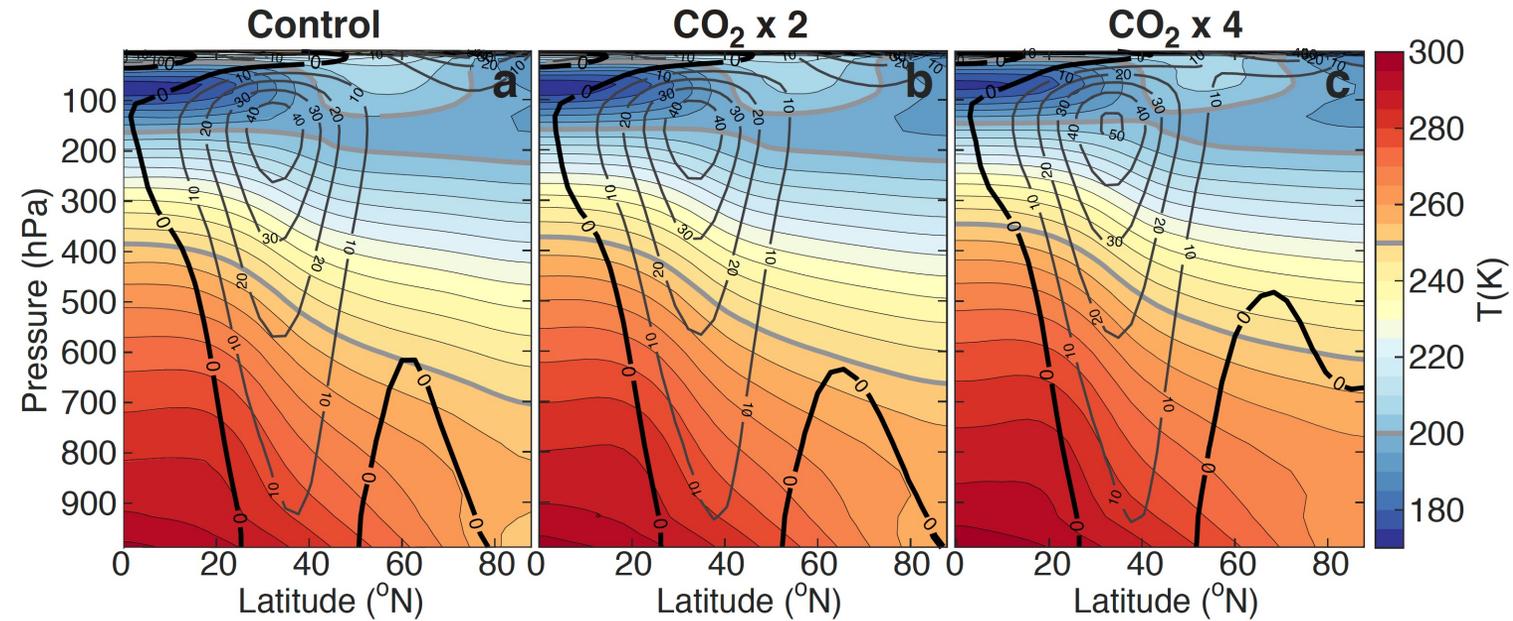
$$\langle \theta \rangle^e = -\tau \langle \mathbf{v} \cdot \nabla \theta \rangle^e + \theta_0$$

Temperature at a quantile can be expressed as a linear function of the temperature advection at that quantile

# Apply this to an idealized aquaplanet model with full radiation

Idealized model: solves equations of motion + thermodynamic equation. Includes a full radiative transfer treatment and a simple treatment of moisture

No clouds; when air is saturated, the moisture just falls out as rain

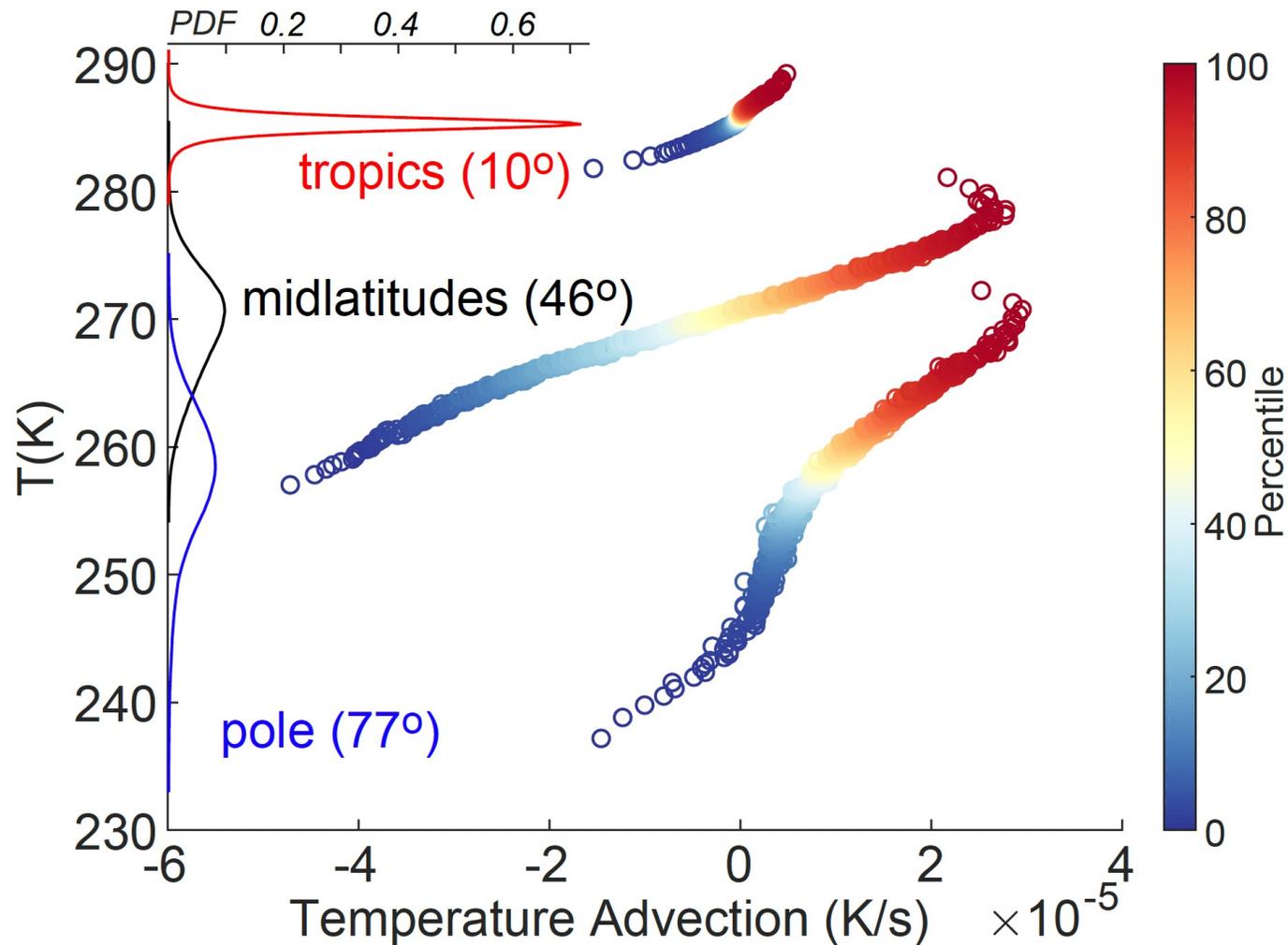


*No continents*

*No hemispheric asymmetry*

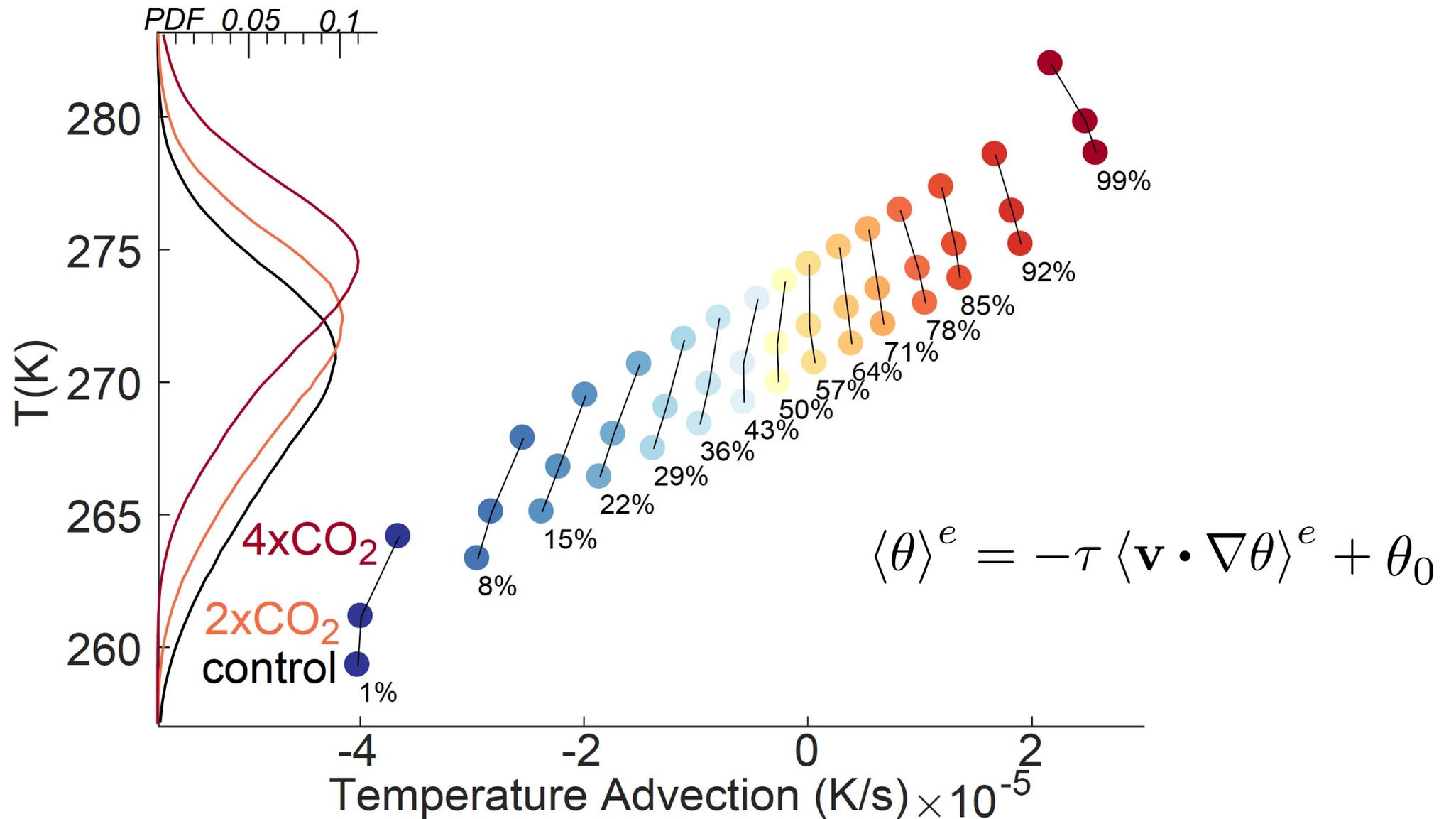
*Every point at the same latitude is equivalent  
= large sample size for statistics*

# Clear relationship between temperature and horizontal temperature advection



$$\langle \theta \rangle^e = -\tau \langle \mathbf{v} \cdot \nabla \theta \rangle^e + \theta_0$$

# Warming does not affect all quantiles equally

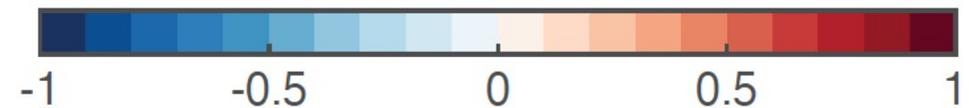
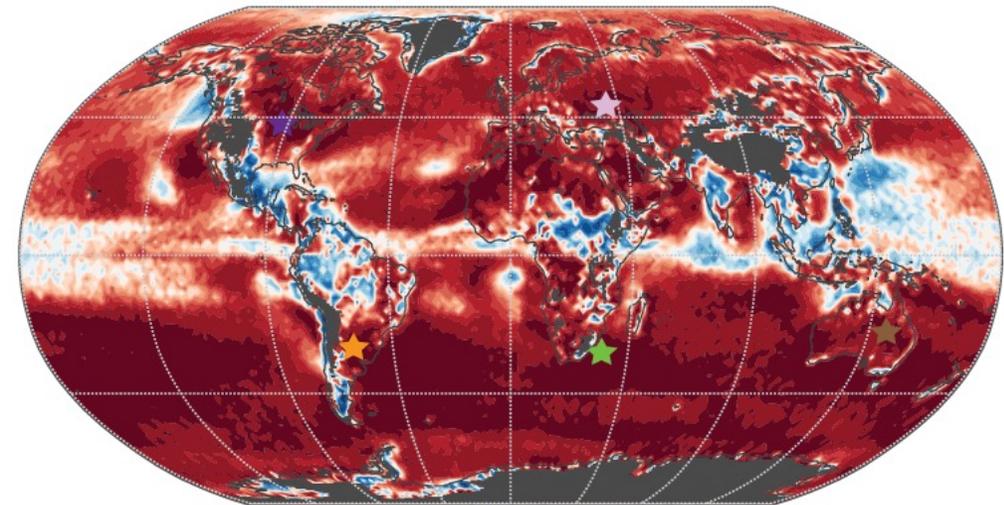
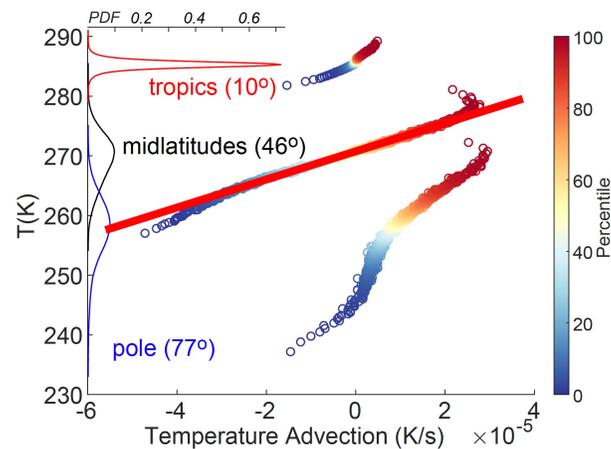


How well does this apply more generally?

*Where can horizontal temperature advection explain the shape of the temperature distribution?*

Linear least squares r values for JJA (better in DJF) for the fit between temperature at a given quantile and temperature advection at that temperature quantile

$$\langle \theta \rangle^e = -\tau \langle \mathbf{v} \cdot \nabla \theta \rangle^e + \theta_0$$

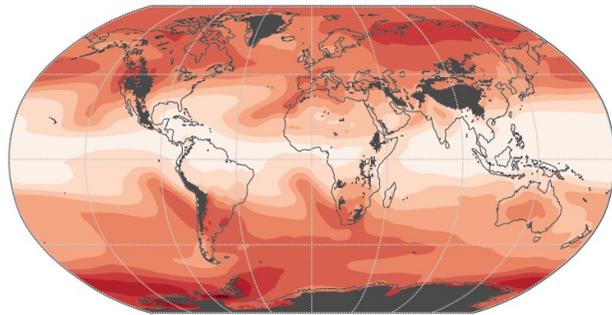


# How much does advection matter for variance?

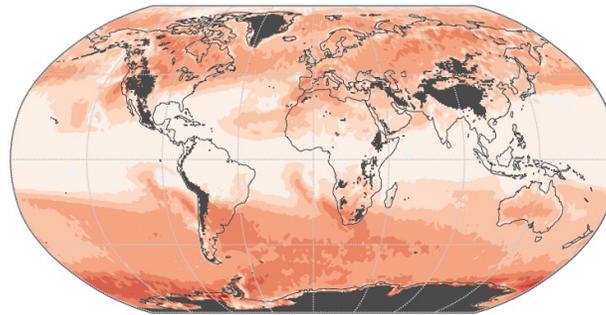
$$\sigma_{-\mathbf{v} \cdot \nabla T}^2 = \left( \frac{1}{2} \cdot (T_w + T_c) \right)^2 = \left( \frac{1}{2} \cdot \tau \cdot ((-\mathbf{v} \cdot \nabla T)_w + (-\mathbf{v} \cdot \nabla T)_c) \right)^2$$

Follows from Tamarin-Brodsky et al. 2020

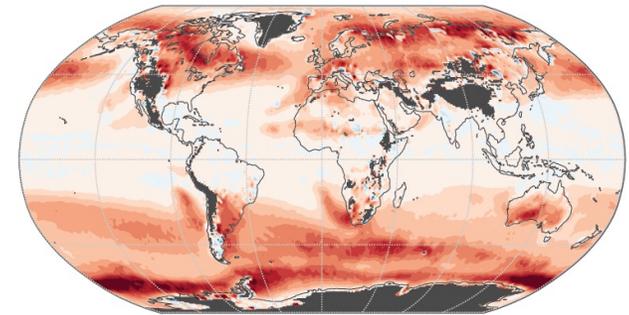
**a**  $T$  standard deviation



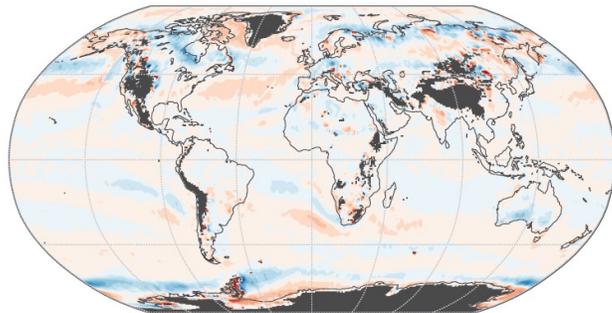
**b**  $-\mathbf{v} \cdot \nabla T$  contribution



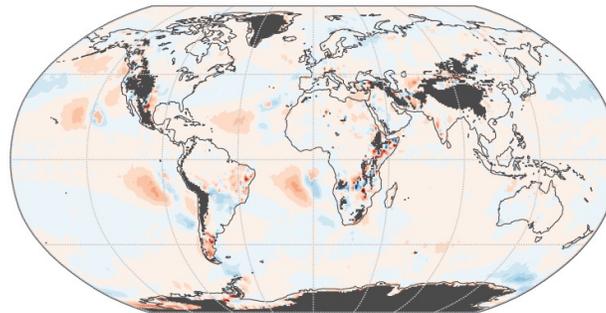
**c**  $-\mathbf{v}' \cdot \nabla \bar{T}$  contribution



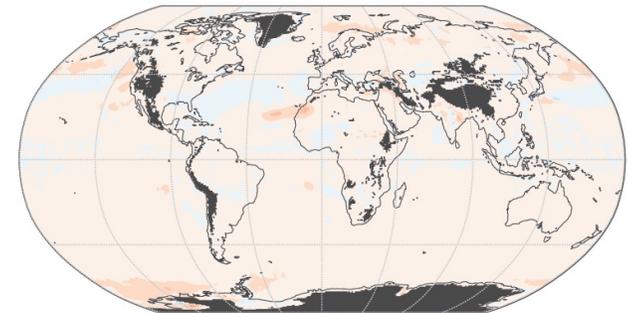
**d**  $-\mathbf{v}' \cdot \nabla T'$  contribution



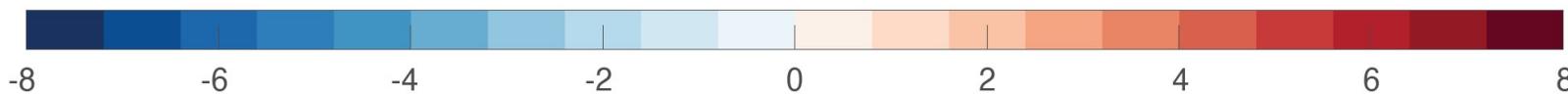
**e**  $-\bar{\mathbf{v}} \cdot \nabla T'$  contribution



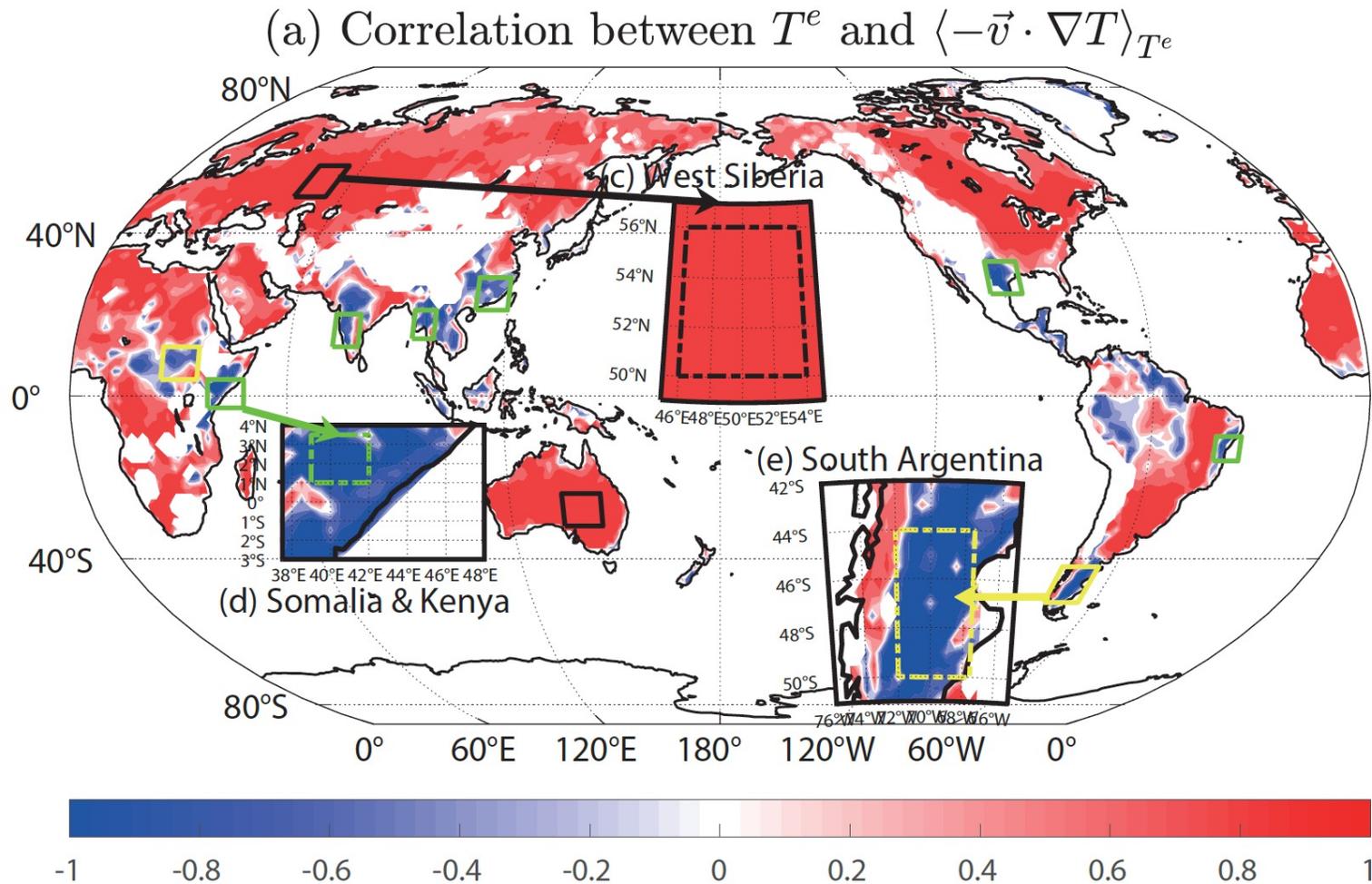
**f**  $-\bar{\mathbf{v}} \cdot \nabla \bar{T}$  contribution



Standard Deviation (K)



# What about places where correlation is not positive? What else is going on?



# An expression for the temperature budget at each percentile that includes more processes

Based on equivalent potential temperature, which is conserved in moist adiabatic processes

$$\underbrace{\left(\frac{p_0}{p}\right)^{\frac{R_d}{c_p}} \langle -\vec{v} \cdot \nabla T \rangle_{Te}}_1 + \underbrace{\frac{L_v}{c_p} \langle -\vec{v} \cdot \nabla q \rangle_{Te}}_2 + \underbrace{\left(\frac{p_0}{p}\right)^{\frac{R_d}{c_p}} \langle -\omega \frac{\partial T}{\partial p} + \omega \frac{\kappa T}{p} \rangle_{Te}}_3 + \underbrace{\frac{L_v}{c_p} \langle -\omega \frac{\partial q}{\partial p} \rangle_{Te}}_4 + \underbrace{R_{Te}}_5 = 0,$$

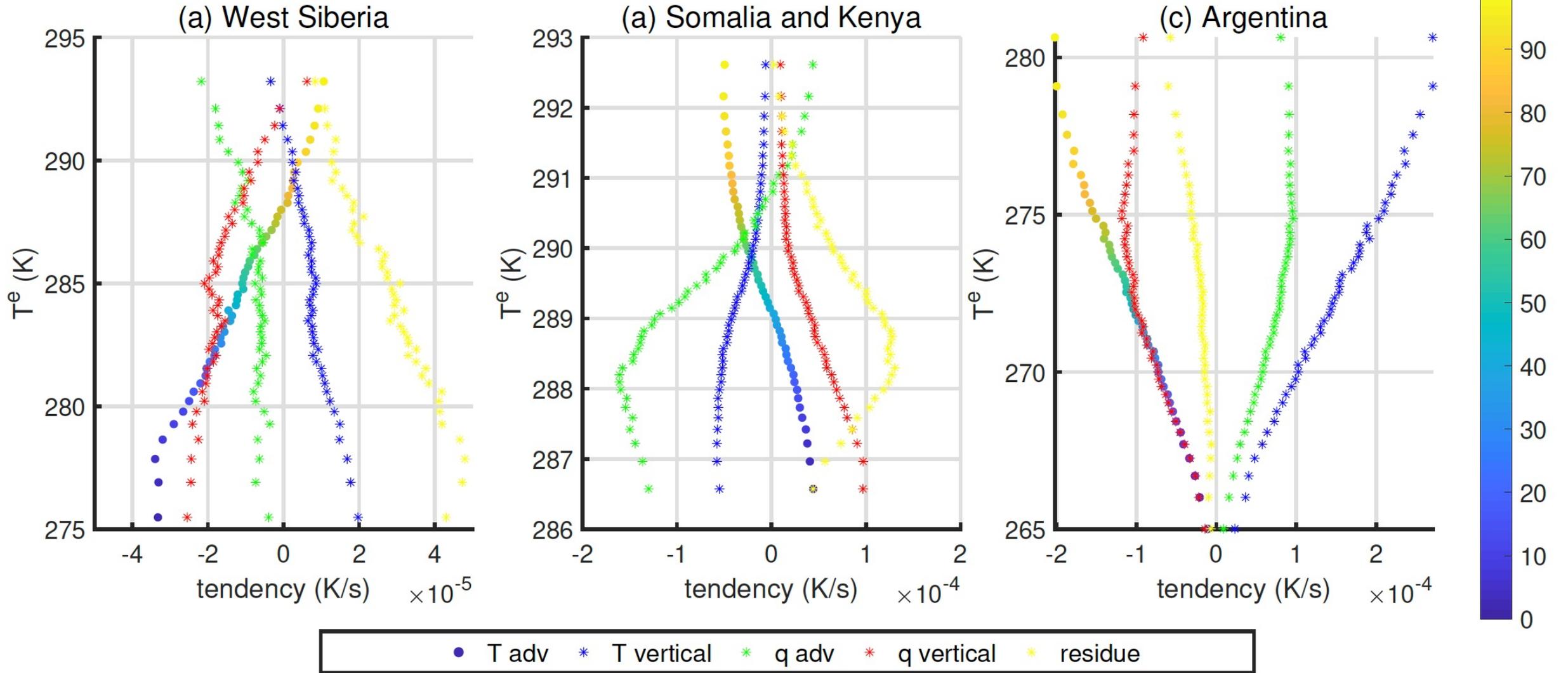
Horizontal temperature advection

Vertical temperature advection

Residual is still **everything else**, but everything else is much more limited. Radiation and sensible heat flux (not latent heat because we use equivalent potential temperature)

$$\underbrace{\left(\frac{p_0}{p}\right)^{\frac{R_d}{c_p}} \langle -\vec{v} \cdot \nabla T \rangle_{T^e}}_1 + \underbrace{\frac{L_v}{c_p} \langle -\vec{v} \cdot \nabla q \rangle_{T^e}}_2 + \underbrace{\left(\frac{p_0}{p}\right)^{\frac{R_d}{c_p}} \langle -\omega \frac{\partial T}{\partial p} + \omega \frac{\kappa T}{p} \rangle_{T^e}}_3 + \underbrace{\frac{L_v}{c_p} \langle -\omega \frac{\partial q}{\partial p} \rangle_{T^e}}_4 + \underbrace{R_{T^e}}_5 = 0,$$

$T^e$  vs different terms (conditional mean value)

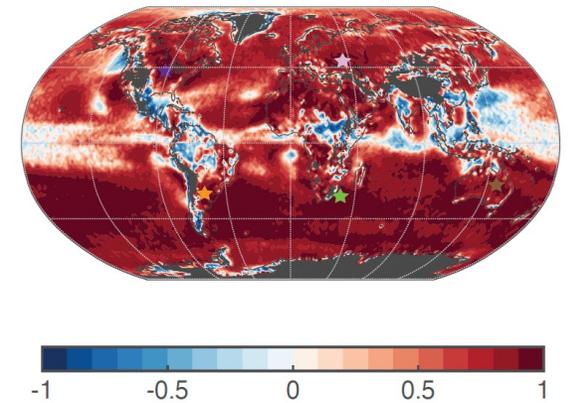


## Summary of Part I:

We derive a new expression for examining the temperature distribution

We use a very simple treatment to understand the contribution of horizontal temperature advection. Most places it's large.

We include moisture to look at places where it likely matters

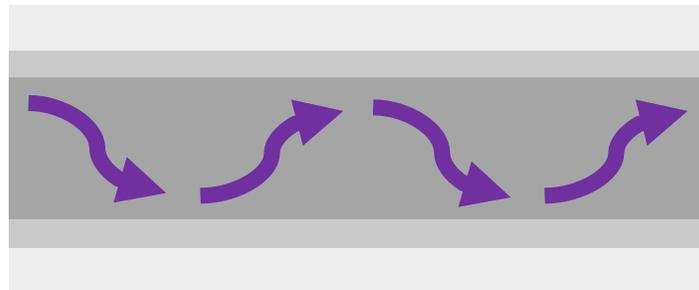


## Part II: Are midlatitude heatwaves caused by quasi-resonant amplification (QRA) of Rossby waves?

- Rossby waves (RWs):  $\mathcal{O}(10^3 - 10^4 \text{ km})$

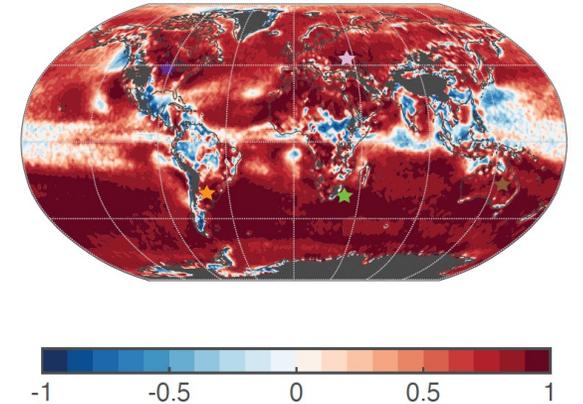
- Barotropic vorticity eqn:

- Waveguide:

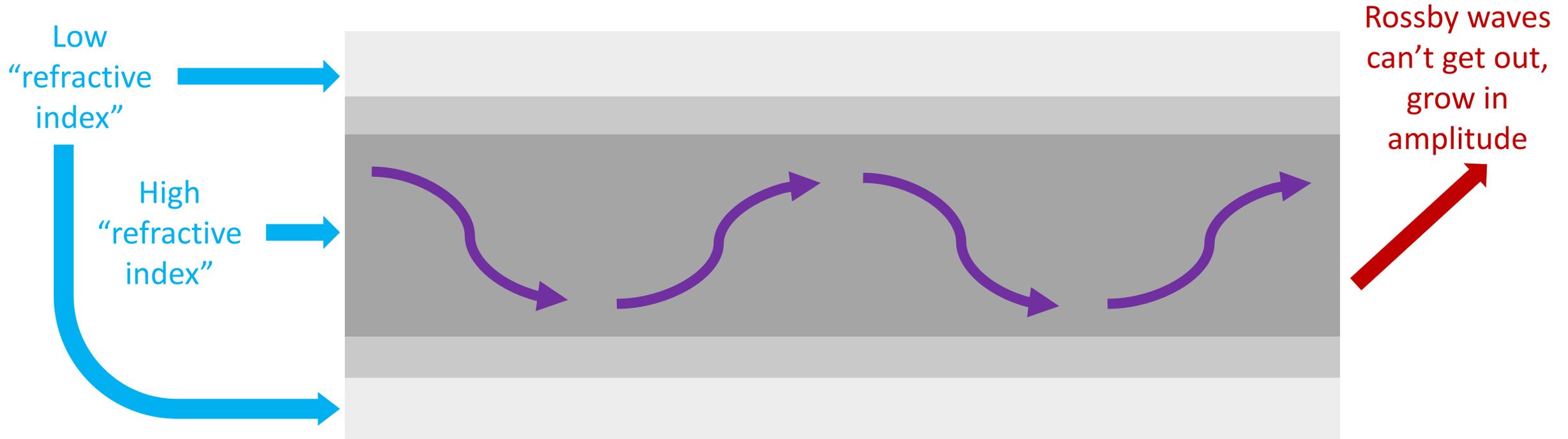


- Importance: (*Petoukhov et al. 2013*)

1. Waveguide + forcing  $\rightarrow$  trapped stationary RW
2. Large-amplitude RW  $\rightarrow$  surface extreme weather



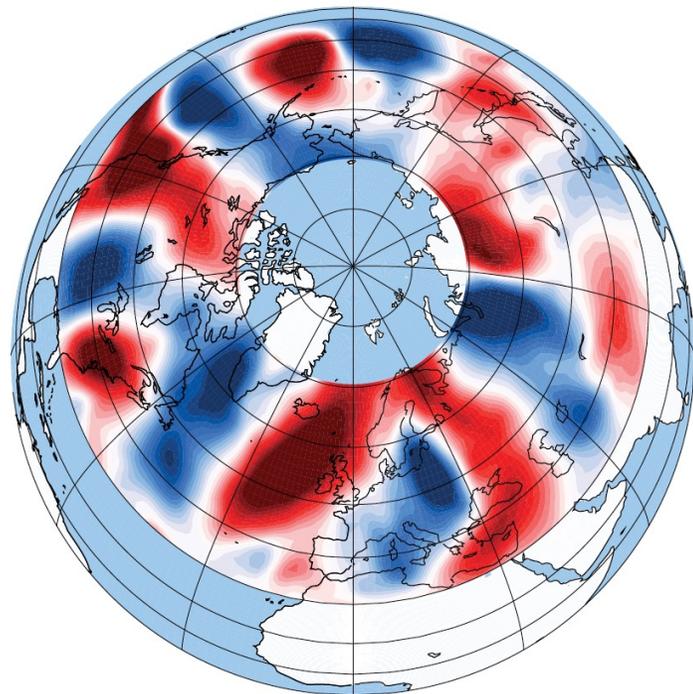
# Quasi-Resonant Amplification of Rossby Waves



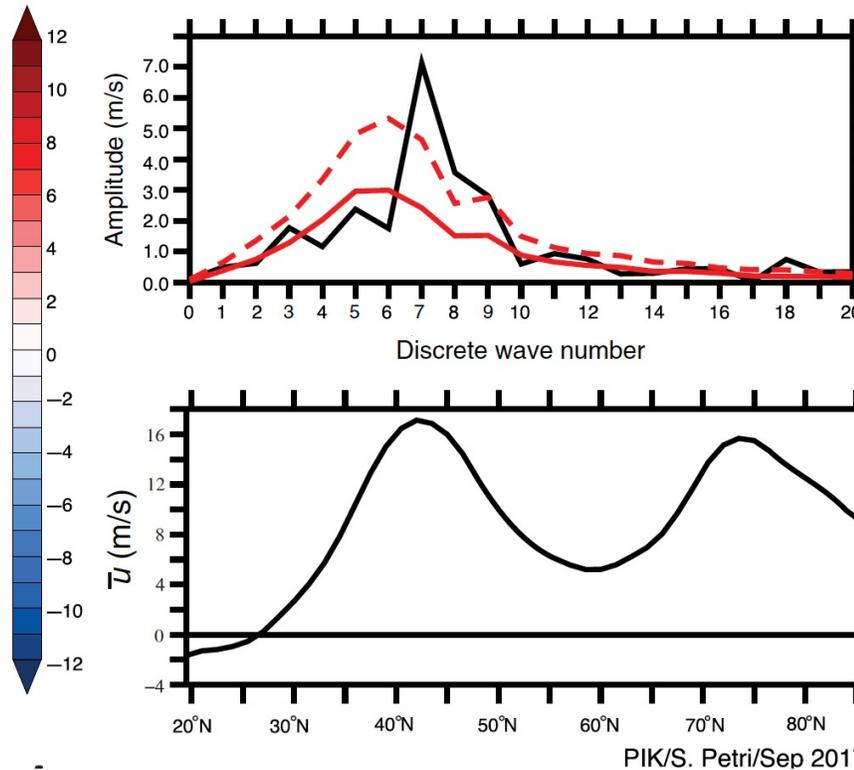
# Heat waves may be associated with double jet structures

**B**

**July/August 2003**



Meridional wind speed (m/s)



PIK/S. Petri/Sep 2017

# And the details of the double jet have been used to look at future changes in heat waves

SCIENCE ADVANCES | RESEARCH ARTICLE

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CLIMATOLOGY

## Projected changes in persistent extreme summer weather events: The role of quasi-resonant amplification

Michael E. Mann<sup>1\*</sup>, Stefan Rahmstorf<sup>2,3</sup>, Kai Kornhuber<sup>2</sup>, Byron A. Steinman<sup>4</sup>, Sonya K. Miller<sup>1</sup>, Stefan Petri<sup>2</sup>, Dim Coumou<sup>2,5</sup>

Persistent episodes of extreme weather in the Northern Hemisphere summer have been associated with high-amplitude quasi-stationary atmospheric Rossby waves, with zonal wave numbers 6 to 8 resulting from the phenomenon of quasi-resonant amplification (QRA). A fingerprint for the occurrence of QRA can be defined in terms of the zonally averaged surface temperature field. Examining state-of-the-art [Coupled Model Intercomparison Project Phase 5 (CMIP5)] climate model projections, we find that QRA events are likely to increase by ~50% this century under business-as-usual carbon emissions, but there is considerable variation among climate models. Some predict a near tripling of QRA events by the end of the century, while others predict a potential decrease. Models with amplified Arctic warming yield the most pronounced increase in QRA events. The projections are strongly dependent on assumptions regarding the nature of changes in radiative forcing associated with anthropogenic aerosols over the next century. One implication of our findings is that a reduction in midlatitude aerosol loading could actually lead to Arctic de-amplification this century, ameliorating potential increases in persistent extreme weather events.

Does this mechanism actually hold?

- *Does the waveguide cause heat waves?*

- LOTS of assumptions in the *Petoukhov et al. 2013* theory
- Most important equation:

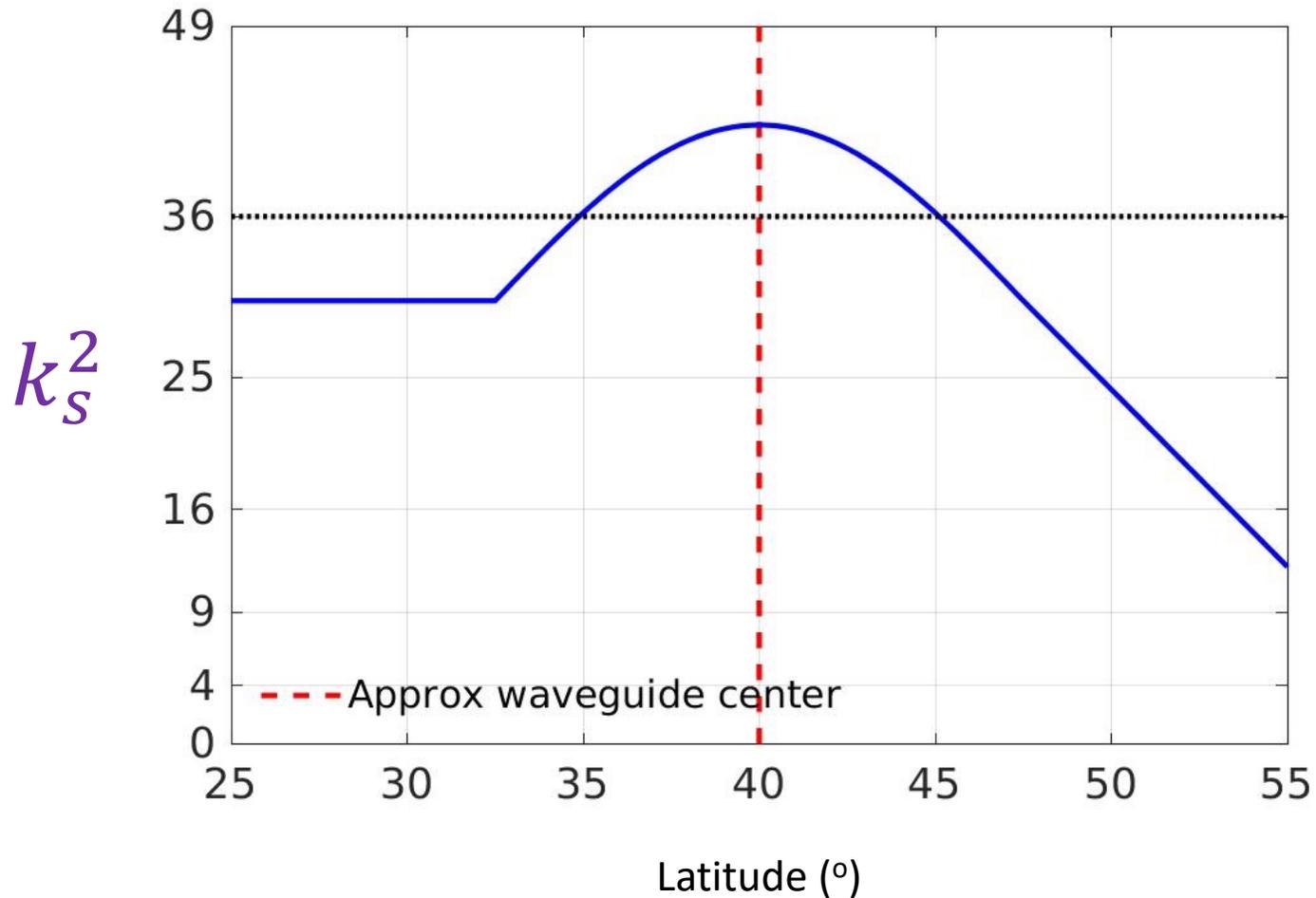
$$a^2 l^2 = k_s^2 - k^2$$

Diagram illustrating the equation  $a^2 l^2 = k_s^2 - k^2$  with arrows pointing to the variables:

- $a$ : Earth radius
- $l$ : Meridional wavenumber
- $k_s$ : Stationary wavenumber (function of U)
- $k$ : Dimensionless zonal wavenumber (specified)

- Need  $l^2 > 0$  to propagate  $\rightarrow k_s^2$  maxima can trap waves

# Simple example stationary wavenumber profile



$$a^2 l^2 = k_s^2 - k^2$$

Should trap  $k=6$ , but not waves  $k \leq 5$  or  $k \geq 7$

# Testing quasi-resonant amplification

- Plan
  1. Make idealized GCM climate with  $k=6$  waveguide
  2. Attempt to force  $k=6$  wave
  3. Compare to *Petoukhov et al. 2013*
- Model improvements
  1. Zonally symmetric  $T_{eq}$
  2. Flat topography
  3. Specified heating to excite wave

# We create a mean state that has a wave-6 waveguide

Idealized GCM: simple physics, realistic mean flow

Following *Chang 2006* + related works:

1. GFDL spectral dynamical core (T42,  $\sim 2.8^\circ$  Gaussian grid)

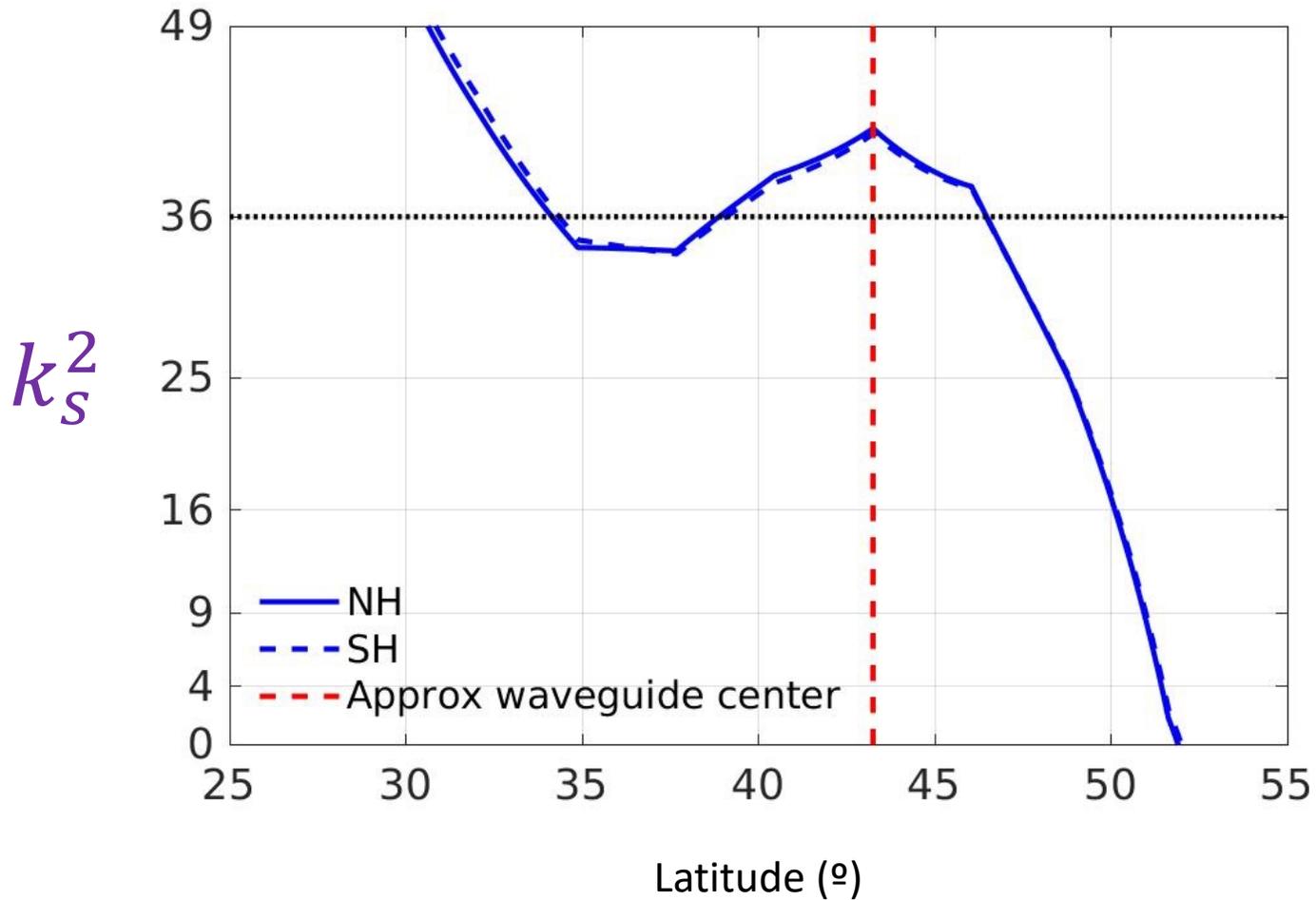
2. Simple physics

$$\text{Heating} \quad \left. \frac{\partial T}{\partial t} \right|_Q = \frac{T_{eq} - T}{\tau_Q} \quad \text{Friction} \quad \left. \frac{\partial \vec{u}}{\partial t} \right|_F = -\frac{\vec{u}}{\tau_F}$$

3. Realistic mean flow

$$\underbrace{T_{eq}^{i+1}}_{\text{New } T_{eq}} = \underbrace{T_{eq}^i}_{\text{Old } T_{eq}} - \frac{1}{3} \underbrace{(\bar{T}^i - T_{target})}_{T \text{ error when model runs w/ old } T_{eq}}$$

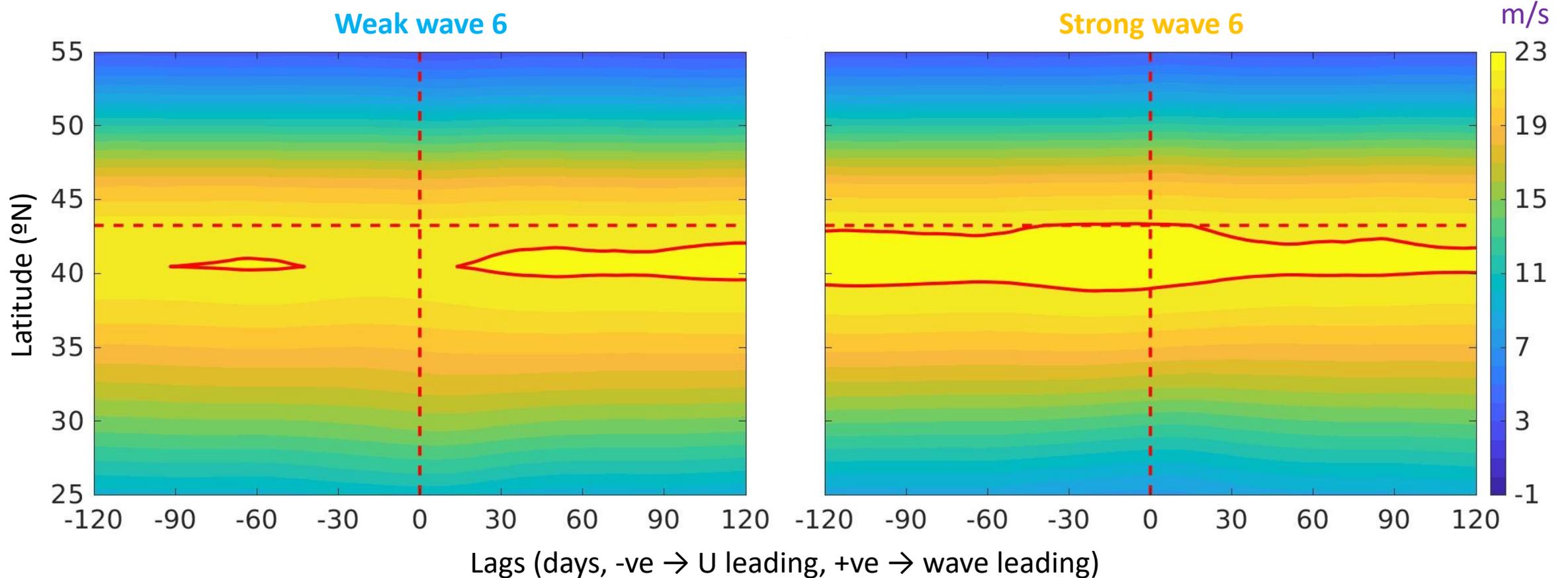
# Yes, we can create a waveguide



- U evaluated at 300 hPa
- 2700-day means

# The zonal jet varies with wave 6 amplitude ...

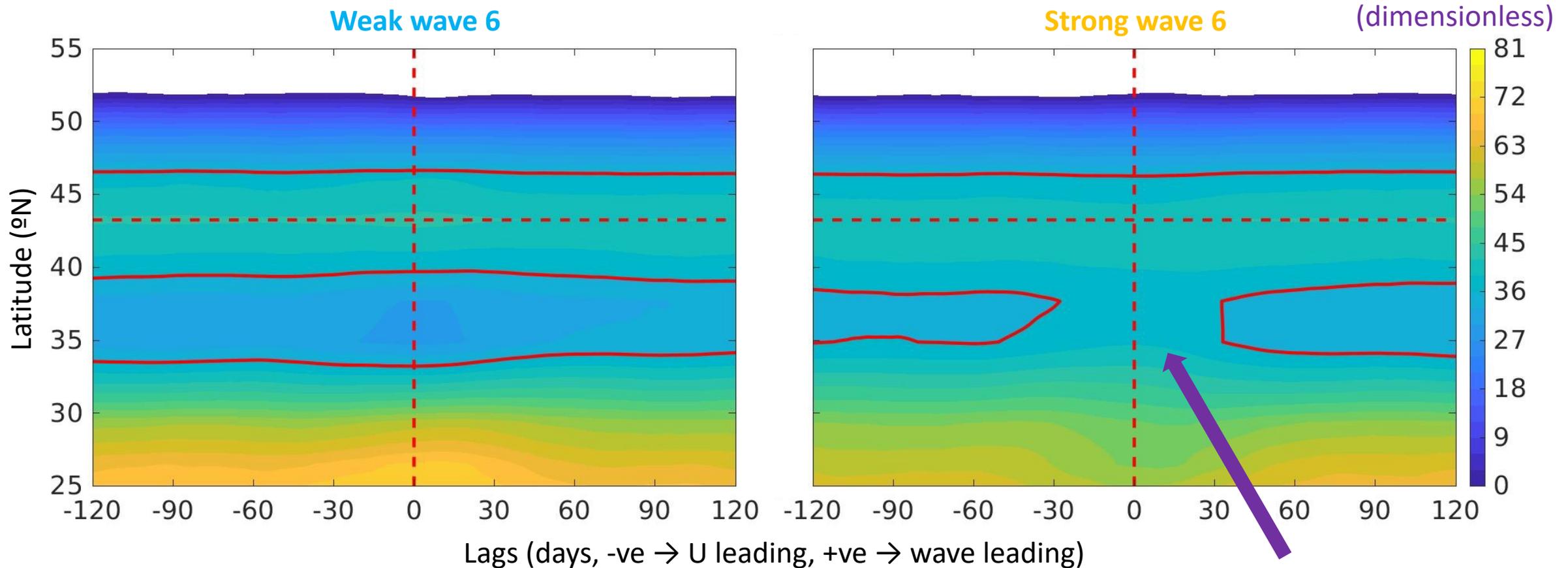
- Composites over 41 30-day means apiece, based on 300 hPa v



Red solid contour → 22 m/s

... as do the waveguide properties (?!)

- Plotted quantity is  $k_s^2$



Red solid contour  $\rightarrow k_s^2 = 36 \rightarrow a^2 l^2 = 0 \rightarrow$  waveguide edge

Waveguide is broken

## Summary of Part II:

We recreate the conditions that are theoretically favorable for Rossby wave quasi-resonant amplification in an idealized model

The strongest wave-6 occurs when the waveguide is broken (for  $\sim$  a month on either side of the event!)

QRA does not actually work in a simple model

## Conclusions

We derive a new expression for examining the temperature distribution – like using composite analysis for every location and every quantile

Midlatitude temperature distributions are reasonably well explained by horizontal temperature advection  
- This makes QRA plausible

QRA doesn't seem to work even in a simple model.

## References:

Linz, M., Chen, G., Zhang, B., & Zhang, P. (2020). A framework for understanding how dynamics shape temperature distributions. *Geophysical Research Letters*, 47, e2019GL085684. <https://doi.org/10.1029/2019GL085684>

Zhang, B., Linz, M., & Chen, G. (2022). Interpreting Observed Temperature Probability Distributions Using a Relationship between Temperature and Temperature Advection, *Journal of Climate*, 35(2), 705-724. <https://journals.ametsoc.org/view/journals/clim/35/2/JCLI-D-20-0920.1.xml>

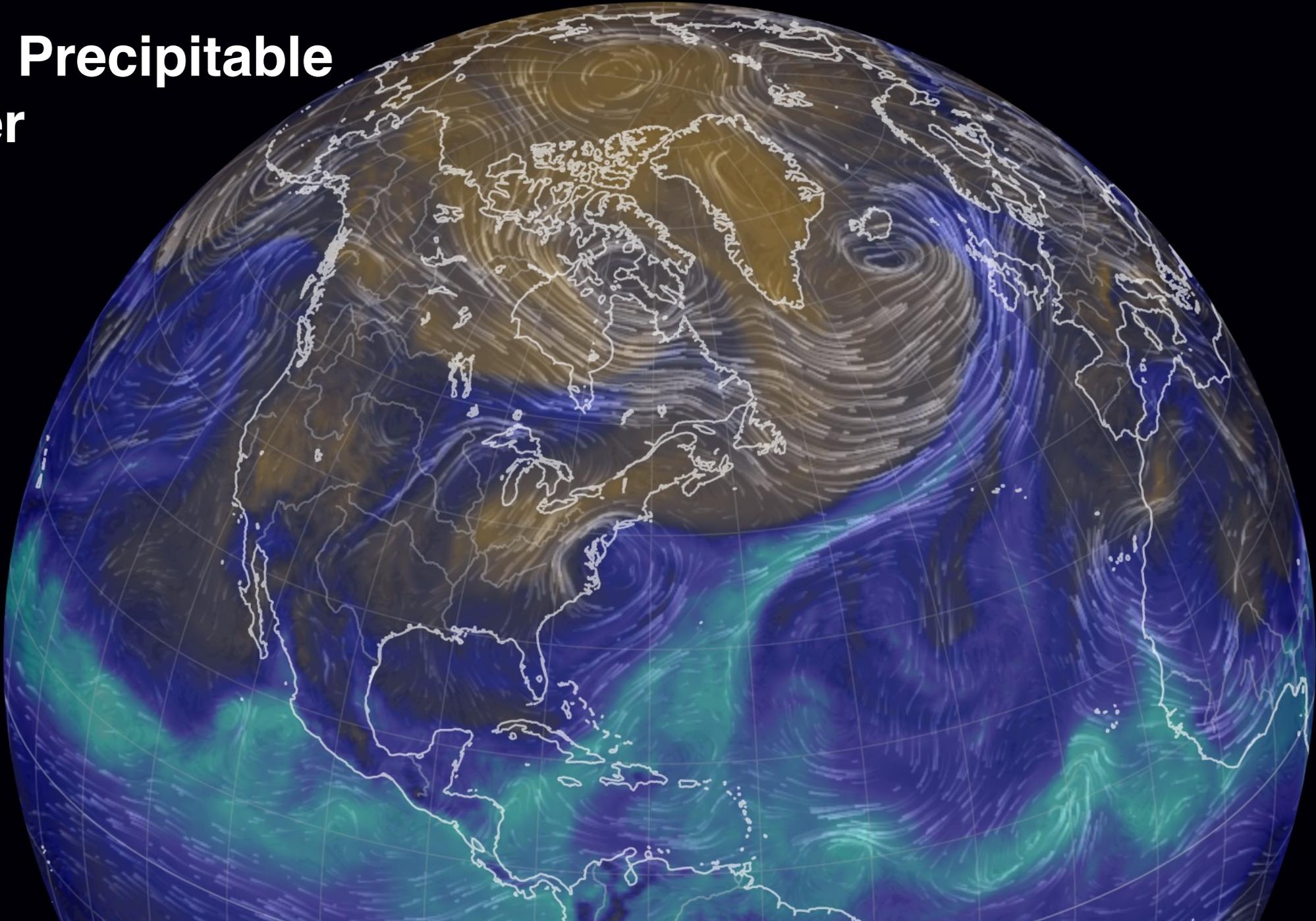
Quan, H., Linz, M., Zhang, B., Chen, G., and Bourguet, S.: How Do Different Processes Shape Temperature Probability Distributions? A Percentile-averaged Temperature Tendency Decomposition. Submitted to *Journal of Climate*

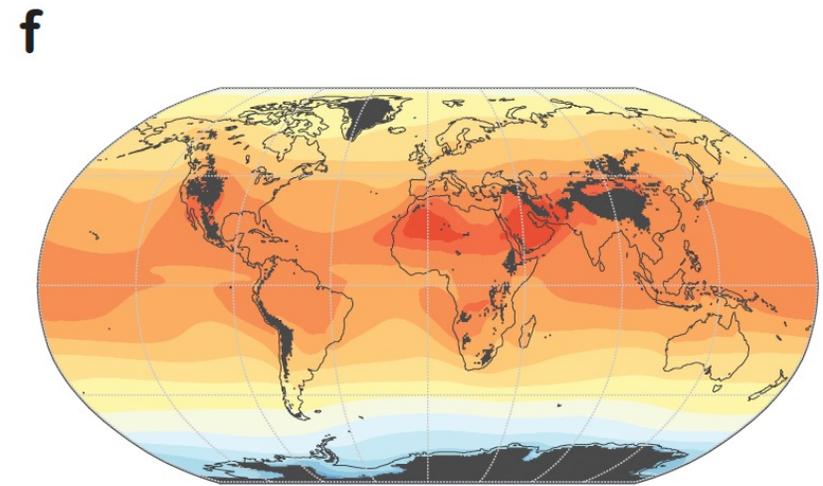
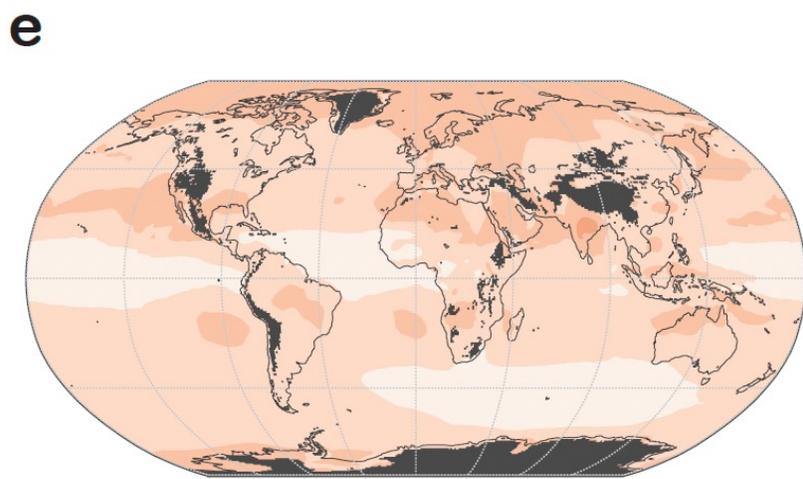
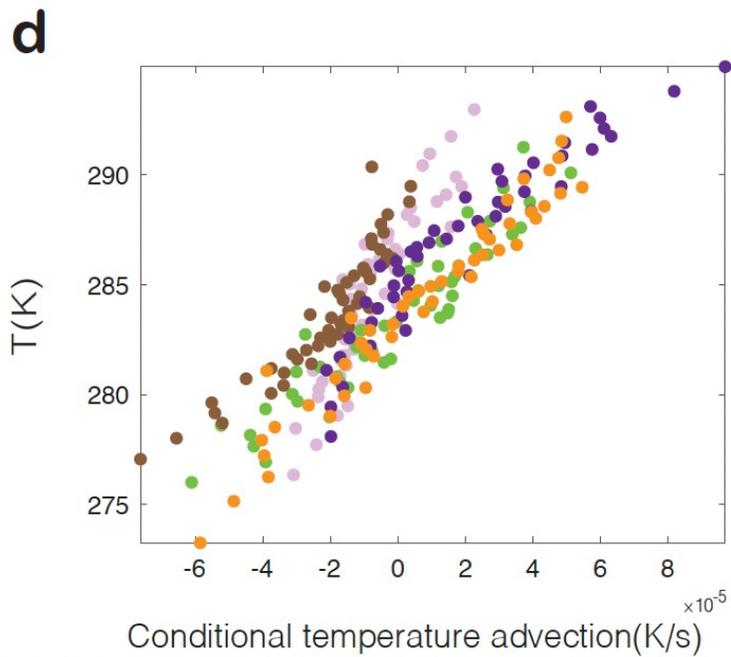
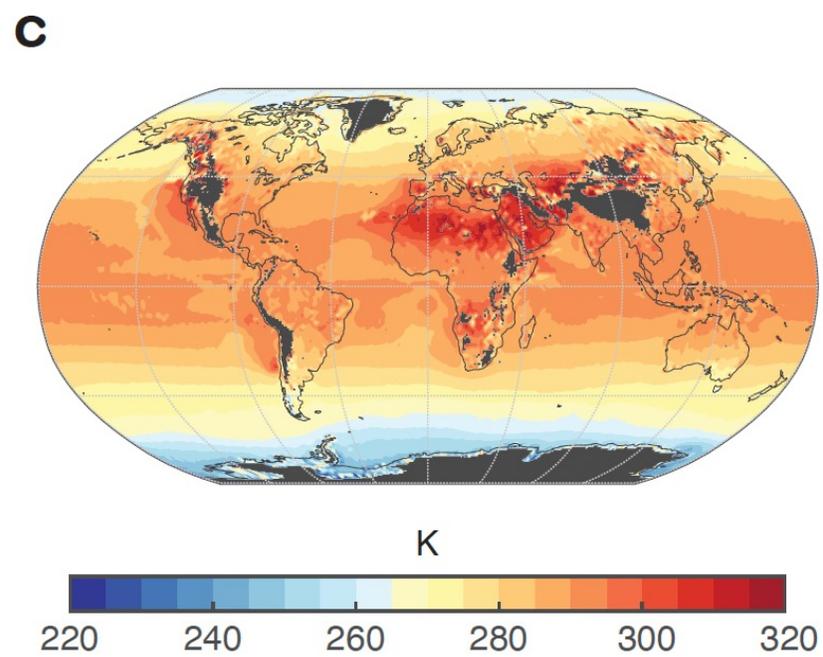
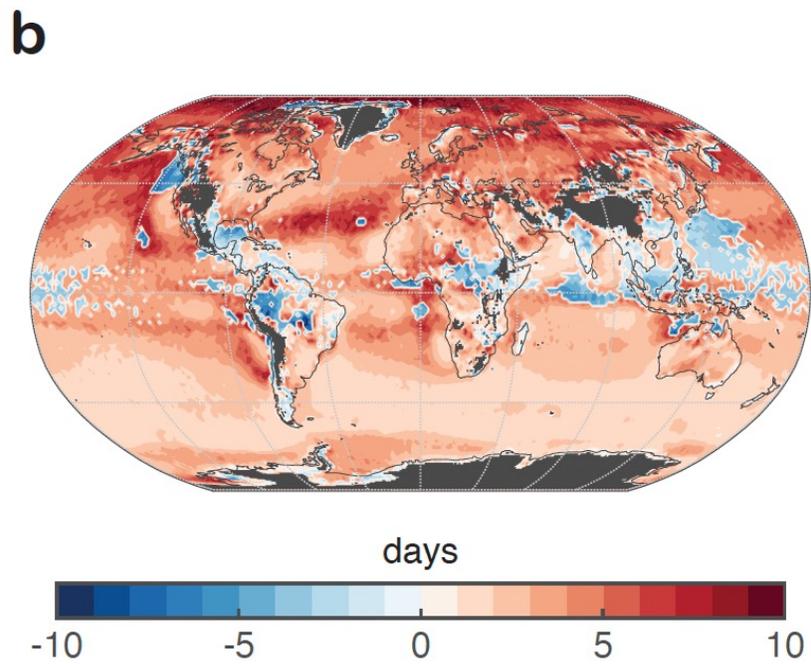
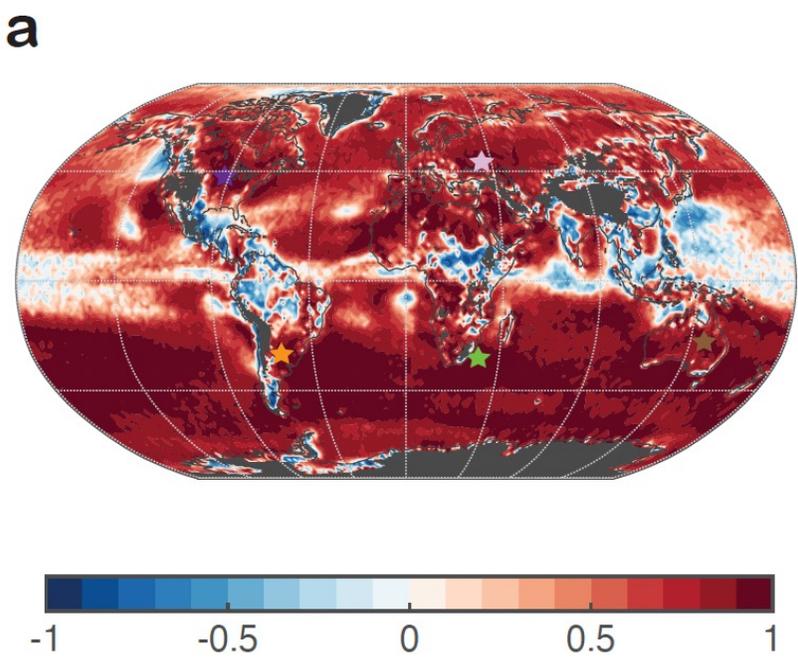
Mooring, T. and Linz, M. An Examination of Quasiresonant Amplification of Rossby Waves in an Idealized Climate Model. in prep. (will be submitted in November)

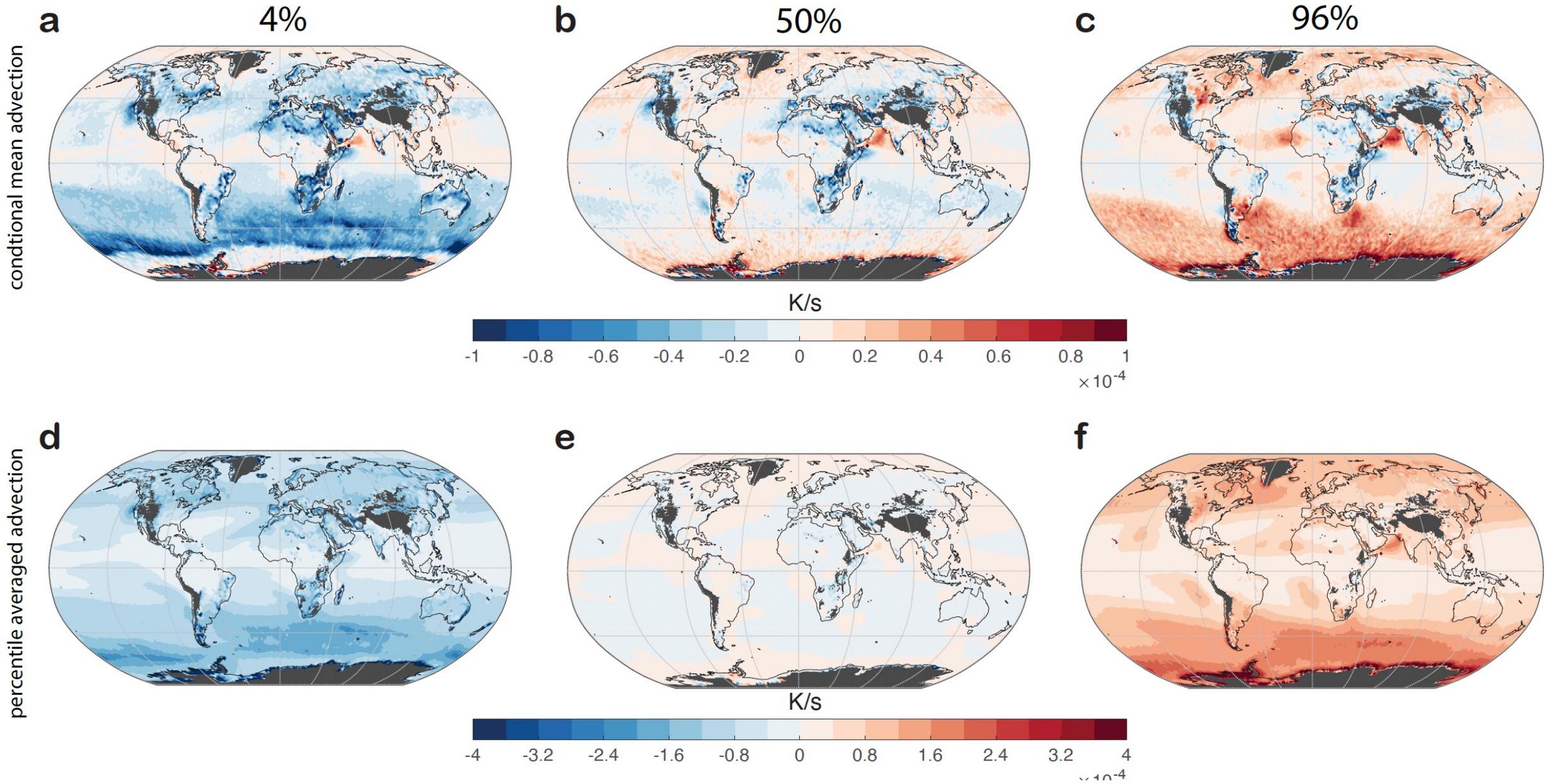
Tamarin-Brodsky, T., et al. Changes in Northern Hemisphere temperature variability shaped by regional warming patterns *Nature Geoscience* 2020



# Total Precipitable Water

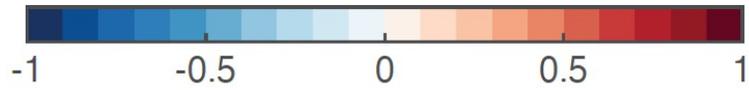
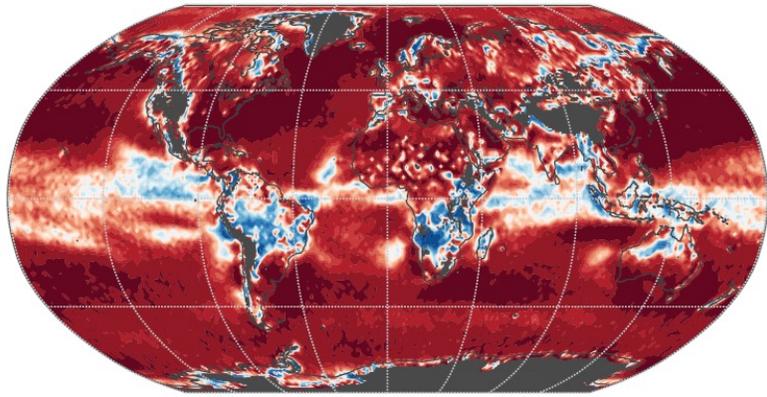




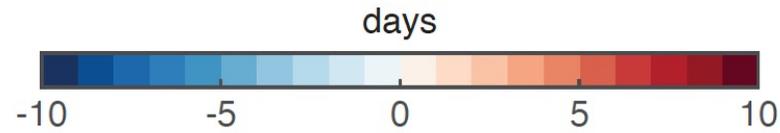
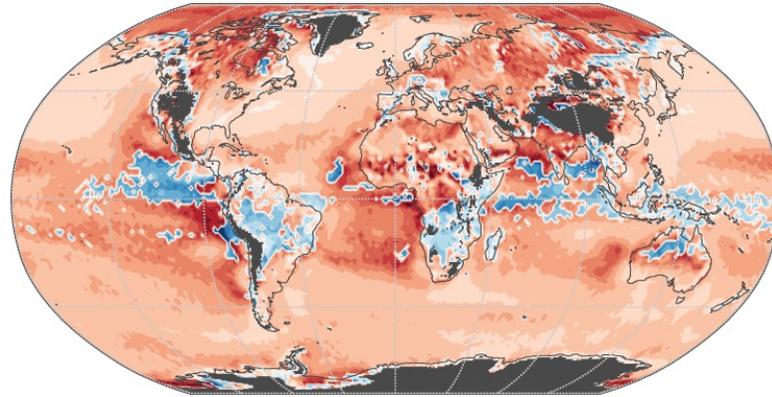


$$\langle \theta \rangle^e = -\tau \langle \mathbf{v} \cdot \nabla \theta \rangle^e + \theta_0$$

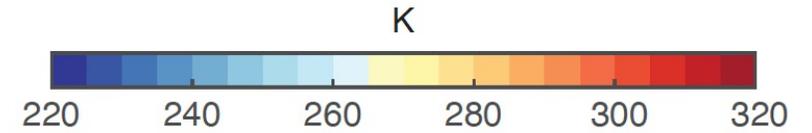
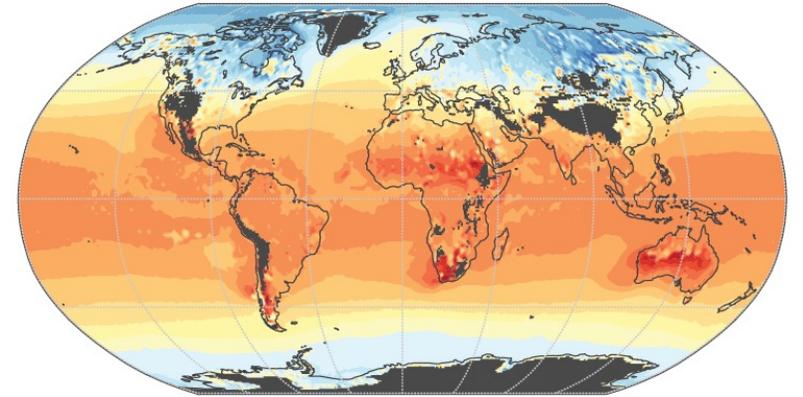
**a**



**b**



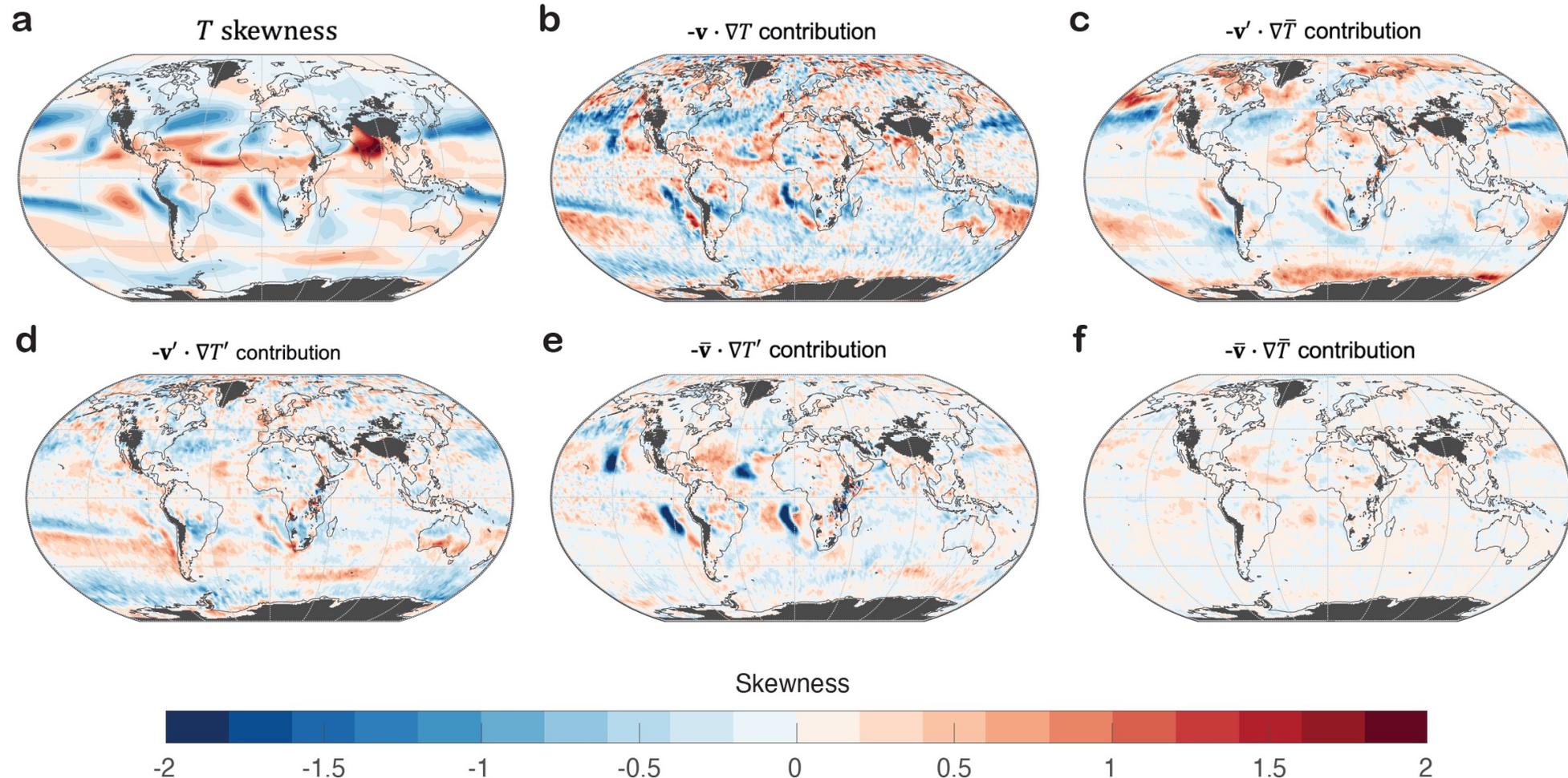
**c**



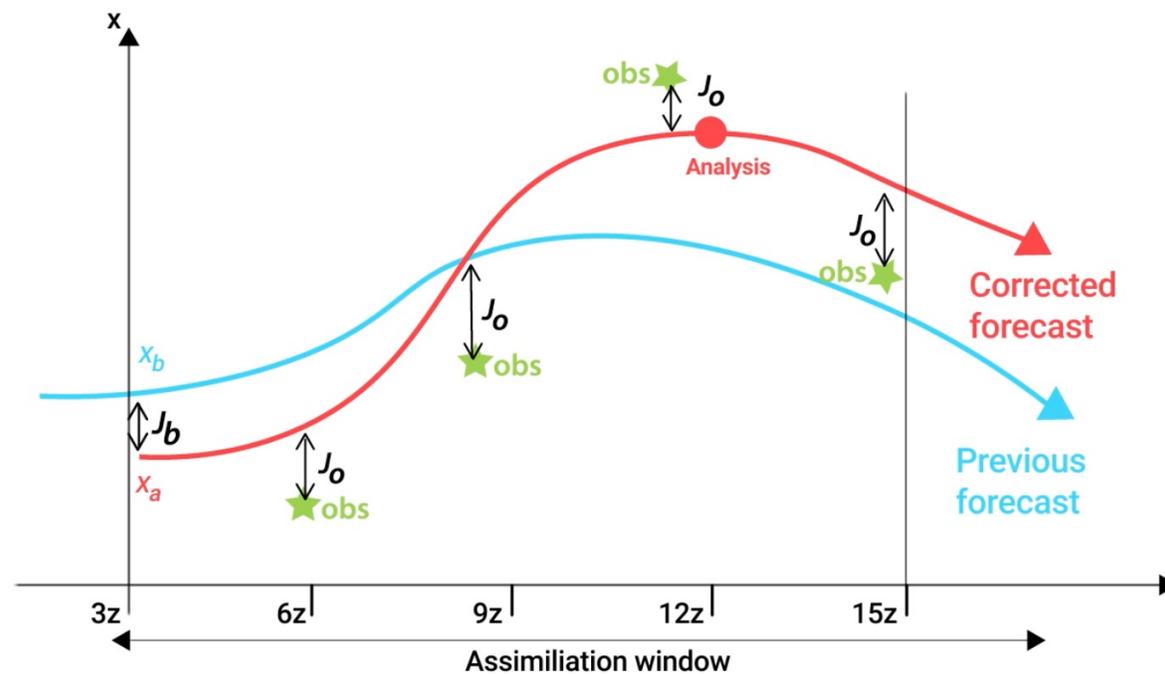
# How much does advection matter for skewness?

$$S_{-\mathbf{v} \cdot \nabla T} = \frac{T_w - T_c}{\frac{1}{2}(T_w + T_c)} = \frac{\tau \cdot ((-\mathbf{v} \cdot \nabla T)_w - (-\mathbf{v} \cdot \nabla T)_c)}{\sigma_T}$$

Follows from Tamarin-Brodsky et al. 2020



## 4D-Var data assimilation method



*Schematic of state of the art assimilation from ECMWF.*

**150 million** model values (like temperature) are adjusted during this process.

[https://www.ecmwf.int/assets/elearning/da/da\\_1/story\\_html5.html](https://www.ecmwf.int/assets/elearning/da/da_1/story_html5.html)