

# A Dissection of the Surface Temperature Biases in the Community Earth System Model

## Introduction

### Surface Temperature Biases in Climate Models

#### Possible contributors to the Biases

- Albedo feedback
- Water vapor feedback
- Cloud feedback
- Sensible/latent heat fluxes
- Surface dynamics
- Atmospheric dynamics

The present study aims to ...

Quantify the relative contributions of seven radiative (physical: albedo, water vapor, and cloud) and non-radiative (dynamical: sensible/latent heat flux, surface dynamics, and atmospheric dynamics) processes to surface T biases.

## Data

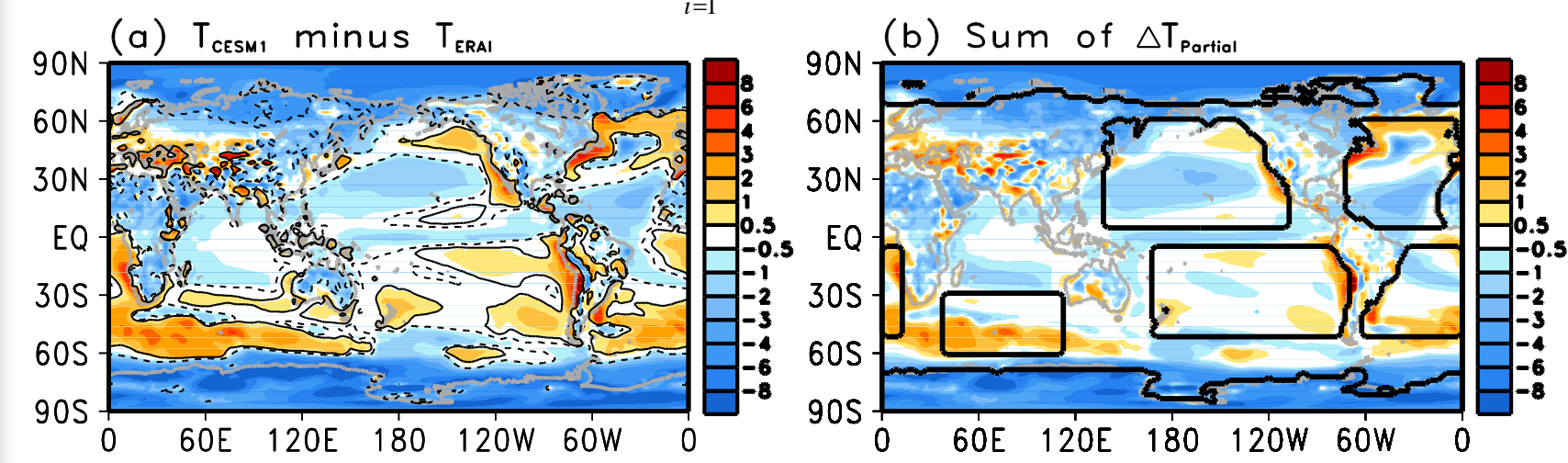
- Observation** : ERA-Interim (1979-present)
- Model** : CESM1 historical climate simulation (1850-2005) from CMIP5
- Used Variables**
  - Solar insolation, surface pressure, surface temperature, surface latent/sensible heat flux, surface downward/upward SW, air temperature, specific humidity, cloud amount, and cloud liquid/ice water
- Analysis period**: Annual mean of 1979-2005

## Partial Temperature Biases

### Difference of TS between CESM1 and ERAI vs. Total TS changes

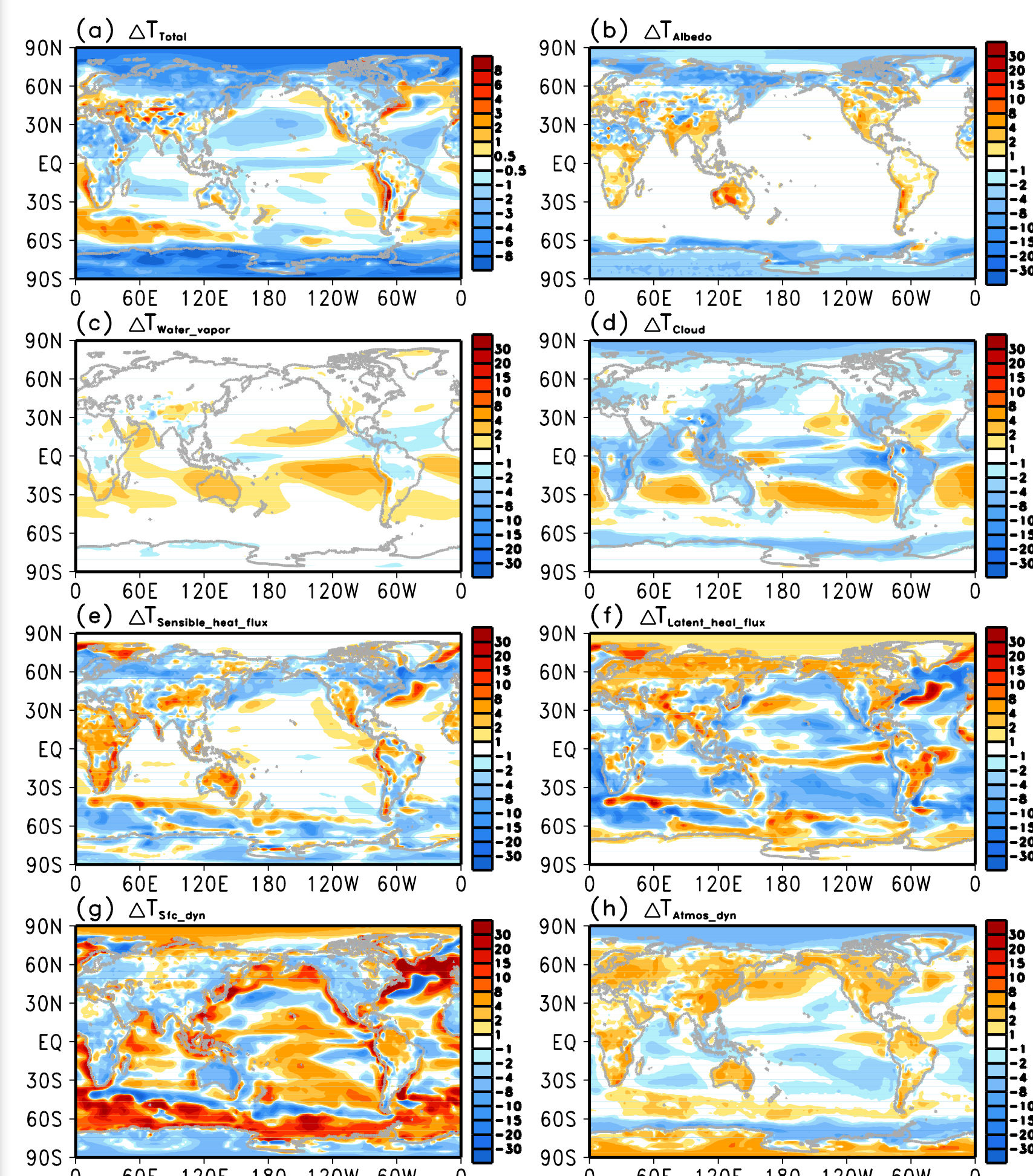
Difference of TS in original data:  $\Delta \bar{T} = \bar{T}(\text{CESM1}) - \bar{T}(\text{ERAI})$

CFRAM-calculated  $\Delta \bar{T} = \sum_{i=1}^7 \Delta \bar{T}_i$



$$\bar{T}(\text{CESM1}) - \bar{T}(\text{ERAI}) \approx \sum_{i=1}^7 \Delta \bar{T}_i$$

### Partial Surface Temperature Biases

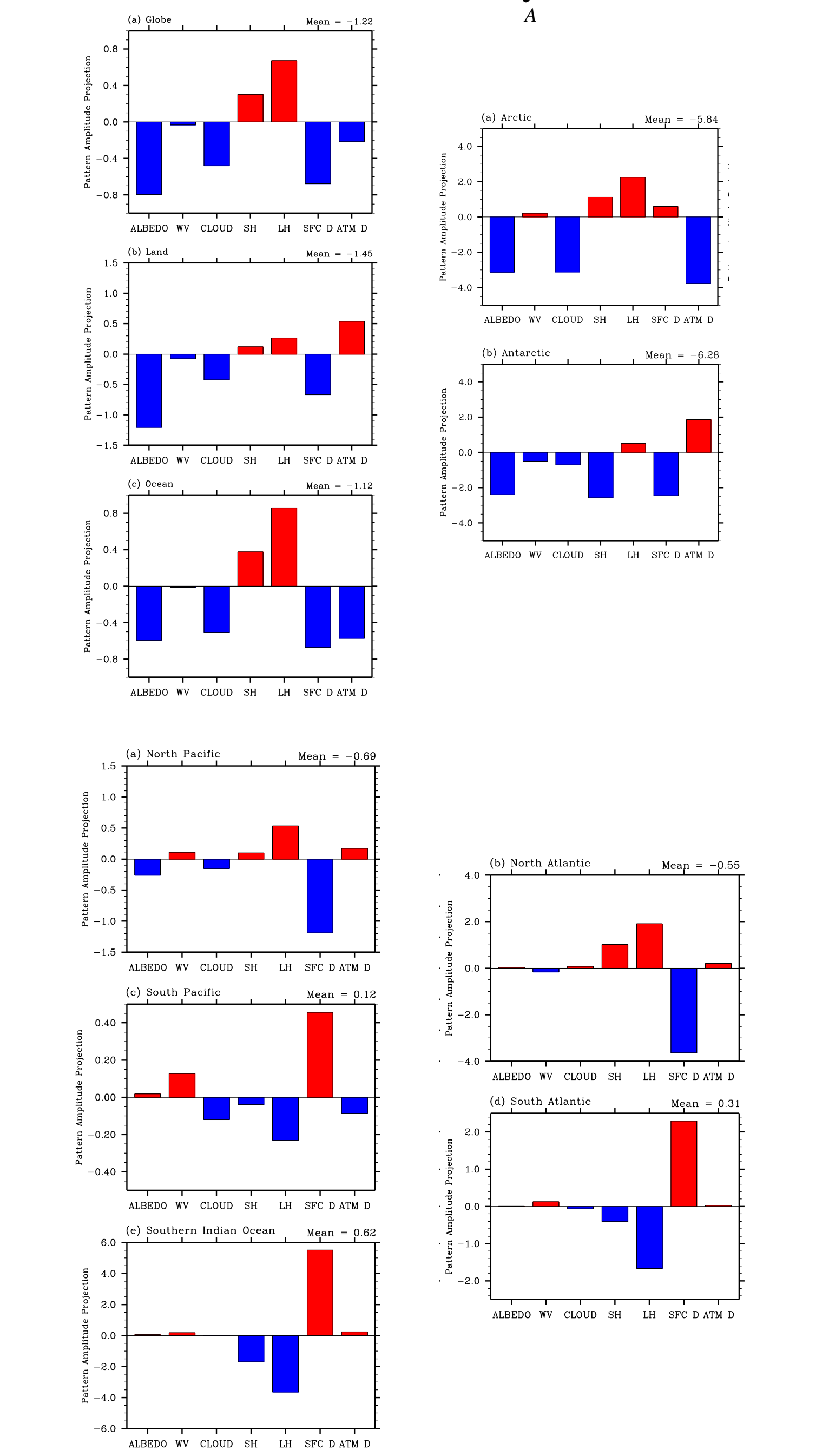


### Quantification of the relative contributions

- Pattern Amplitude Projection (PAP) coefficients

$$\text{PAP}_i = A^{-1} \int_A a^2 \Delta \bar{T}_i \Delta \bar{T} \cos \phi d\lambda d\phi$$

$$A^{-1} \int_A a^2 (\Delta \bar{T})^2 \cos \phi d\lambda d\phi$$



## Methods

### CFRAM Formulation

- The total energy balance at M atmospheric layers and one surface (M+1)<sup>th</sup> layer

$$\bar{\mathbf{R}} = \bar{\mathbf{S}} + \bar{\mathbf{Q}} \leftarrow \text{Energy convergence due to non-radiative dynamical processes}$$

↑ SW radiation flux convergence  
LW radiation flux divergence

- The difference between two climate states

$$\Delta \frac{\partial \bar{E}}{\partial t} = \Delta \bar{\mathbf{S}} + \Delta \bar{\mathbf{R}} + \Delta \bar{\mathbf{Q}} \leftarrow \text{non-radiative}$$

Change in energy storage → negligible

$$\Delta \bar{\mathbf{R}} \approx \Delta \bar{\mathbf{R}}^{(a)} + \Delta \bar{\mathbf{R}}^{(w)} + \Delta \bar{\mathbf{R}}^{(c)} + \frac{\partial \bar{\mathbf{R}}}{\partial T} \Delta \bar{T}$$

$$\Delta \bar{\mathbf{Q}} \approx \Delta \bar{\mathbf{Q}}^{(SH)} + \Delta \bar{\mathbf{Q}}^{(LH)} + \Delta \bar{\mathbf{Q}}^{(sfc\_dyn)} + \Delta \bar{\mathbf{Q}}^{(atmos\_dyn)}$$

Planck feedback matrix  $\left( \frac{\partial \bar{\mathbf{R}}}{\partial T} \right) = \begin{pmatrix} \frac{\partial R_1}{\partial T_1} & \dots & \frac{\partial R_1}{\partial T_{M+1}} \\ \vdots & \ddots & \vdots \\ \frac{\partial R_{M+1}}{\partial T_1} & \dots & \frac{\partial R_{M+1}}{\partial T_{M+1}} \end{pmatrix}$

- Rearranging the terms ...

$$\Delta \bar{T} = \left( \frac{\partial \bar{\mathbf{R}}}{\partial T} \right)^{-1} \left\{ \begin{array}{l} \Delta \bar{\mathbf{S}}^{(a)} \text{ Albedo} \\ \Delta \Delta \bar{\mathbf{S}}^{(w)} \text{ Water vapor} \\ \Delta \Delta \bar{\mathbf{S}}^{(c)} \text{ Cloud} \\ \Delta \Delta \bar{\mathbf{S}}^{(SH)} \text{ Surface dynamics} \\ \Delta \Delta \bar{\mathbf{S}}^{(LH)} \text{ Latent heat flux} \\ \Delta \Delta \bar{\mathbf{Q}}^{(sfc\_dyn)} \text{ Surface dynamics} \\ \Delta \Delta \bar{\mathbf{Q}}^{(atmos\_dyn)} \text{ Atmospheric dynamics} \end{array} \right\}$$

### Decomposition Procedure

#### Define Surface Temperature Bias

Model: CESM1 Surface Temperature  
Observation: ERA-Interim Surface Temperature  
→ Bias in CESM1 = Model - Observation

#### Input for Radiative transfer model

**Surface**  
Solar insolation  
surface pressure  
surface temperature  
surface latent/sensible heat flux  
surface downward/upward SW

**Multi-layer**  
Air temperature  
Specific humidity  
Cloud amount  
Cloud liquid water  
Cloud ice water

#### Energy perturbation terms

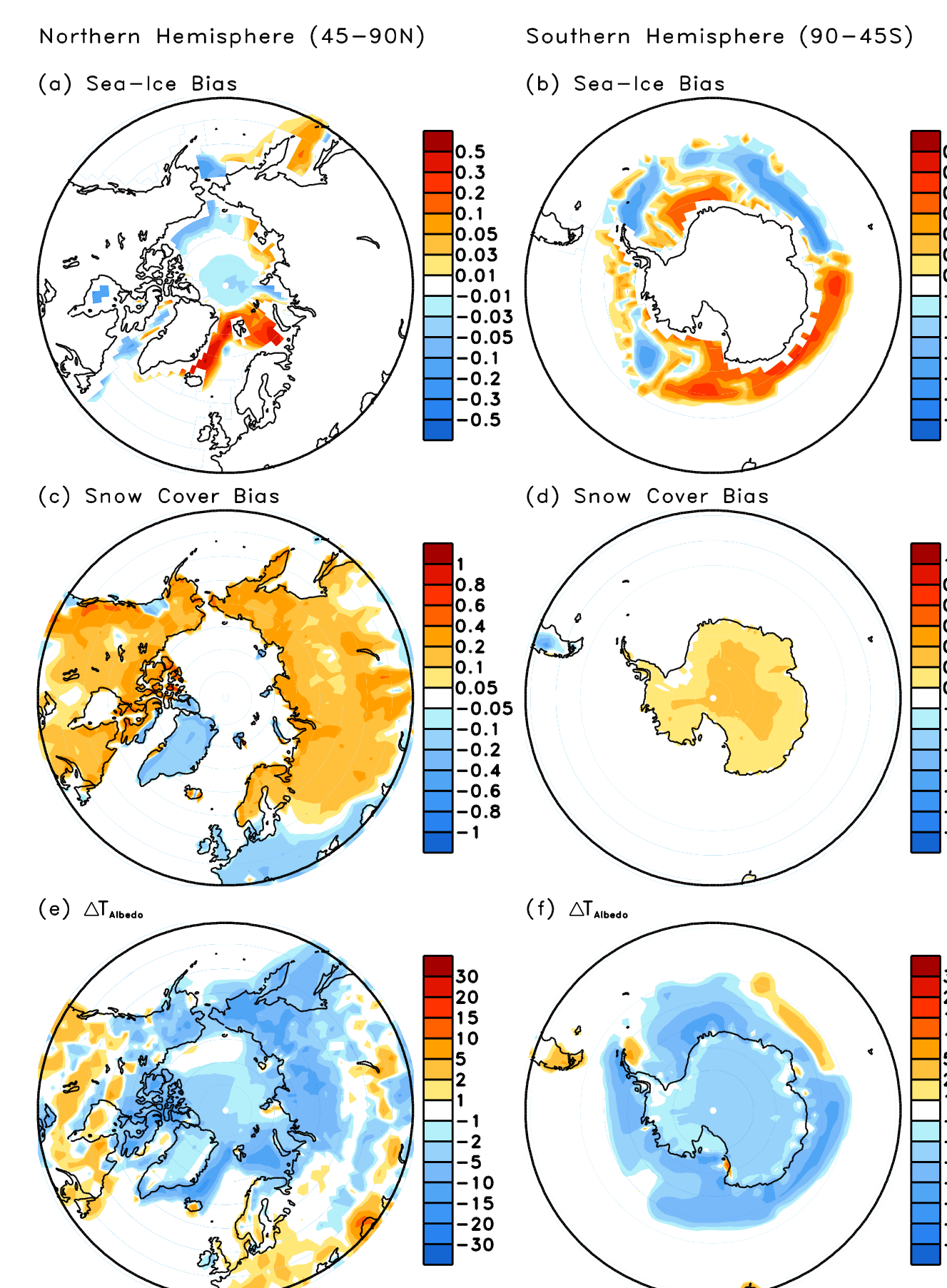
$\Delta \bar{\mathbf{S}}^{(a)}$   $\Delta \Delta \bar{\mathbf{S}}^{(w)}$   $\Delta \Delta \bar{\mathbf{S}}^{(c)}$   
 $\Delta \Delta \bar{\mathbf{S}}^{(SH)}$   $\Delta \Delta \bar{\mathbf{S}}^{(LH)}$   $\Delta \Delta \bar{\mathbf{Q}}^{(sfc\_dyn)}$   $\Delta \Delta \bar{\mathbf{Q}}^{(atmos\_dyn)}$

#### Partial temperature changes

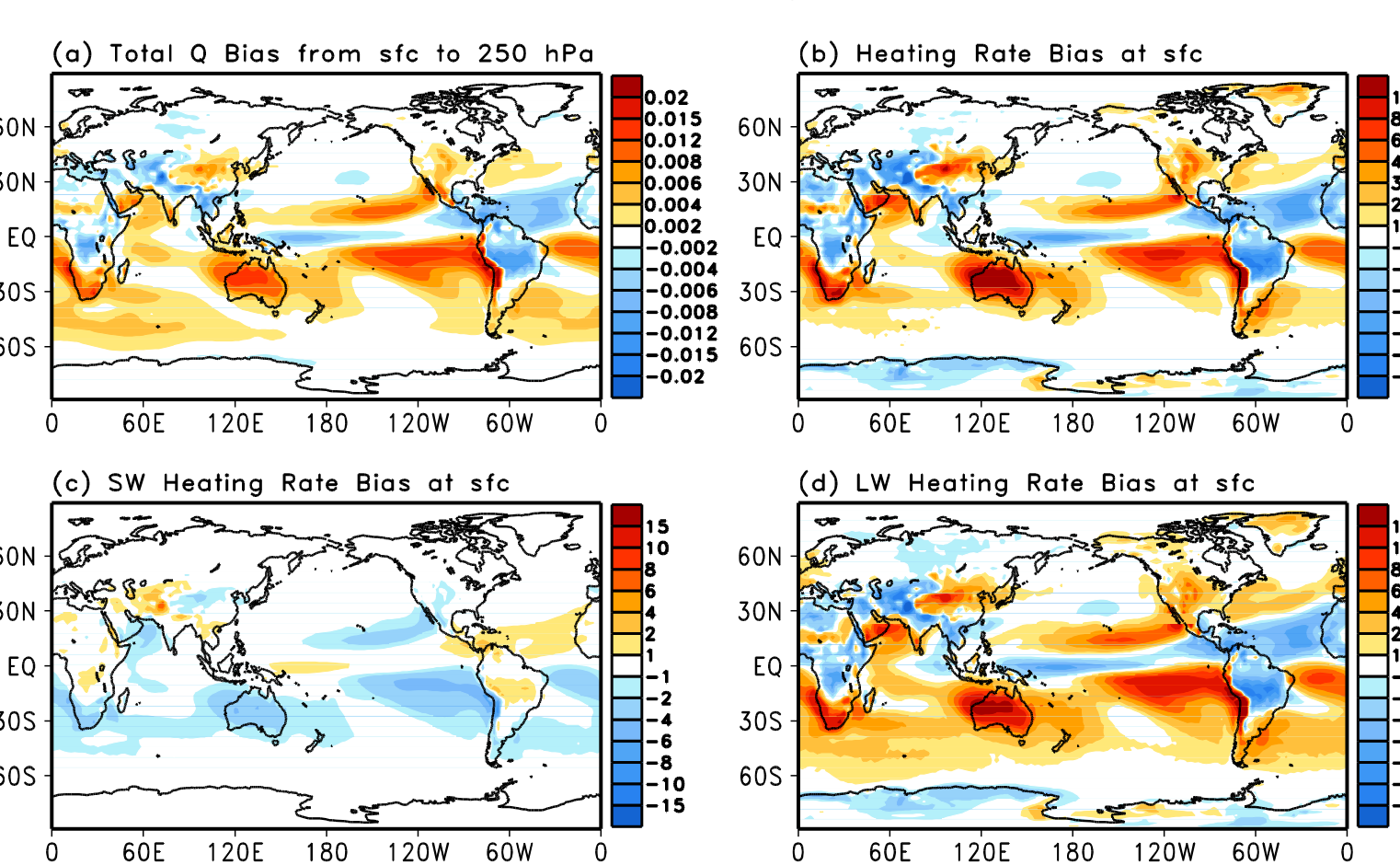
$\Delta \bar{T}^{albedo}$   $\Delta \bar{T}^{water\ vapor}$   $\Delta \bar{T}^{cloud}$   
 $\Delta \bar{T}^{SH}$   $\Delta \bar{T}^{LH}$   $\Delta \bar{T}^{sfc\_dyn}$   $\Delta \bar{T}^{atmos\_dyn}$

## Possible Causes of Partial Temperature Biases

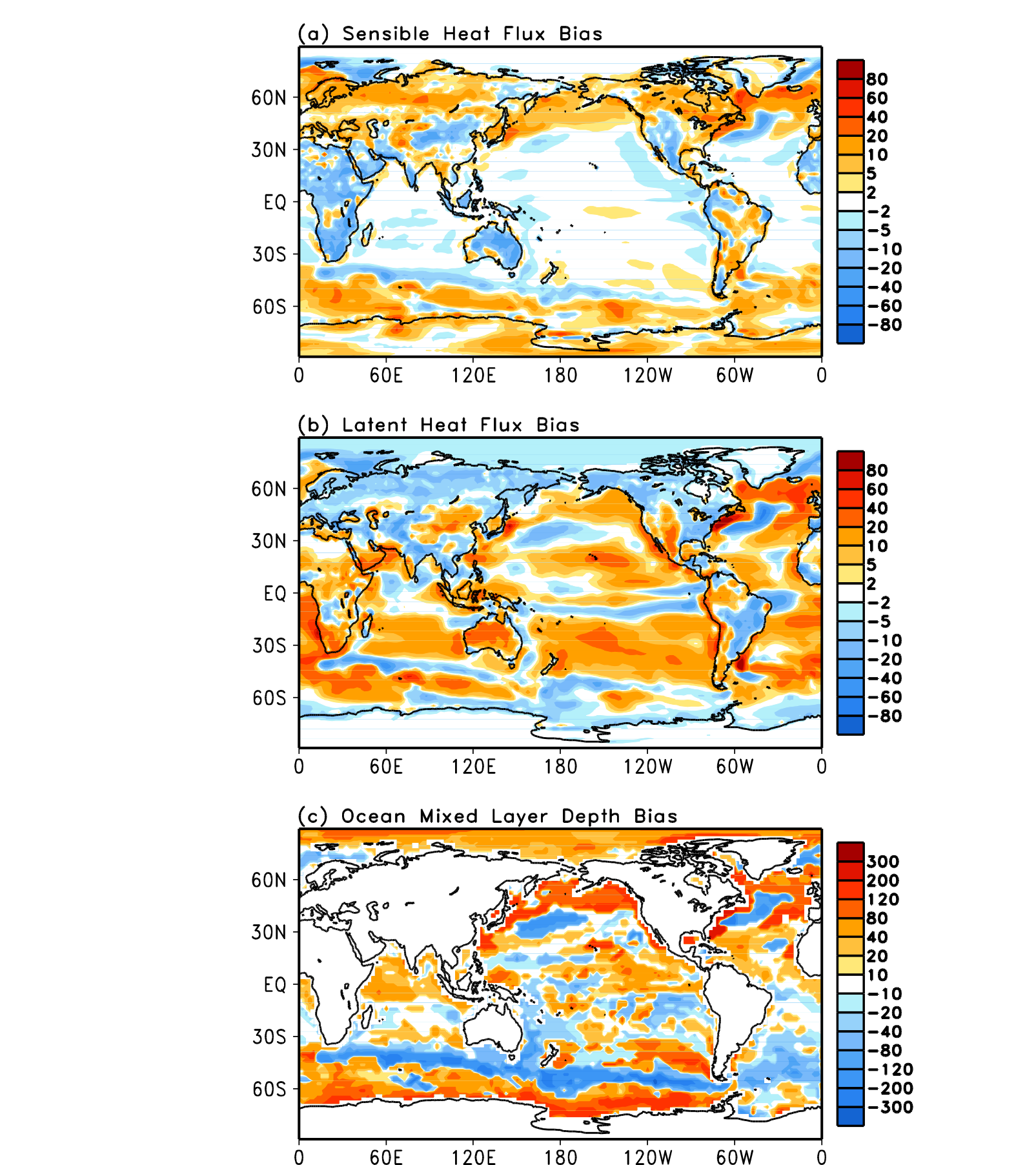
### Sea-ice and snow cover biases



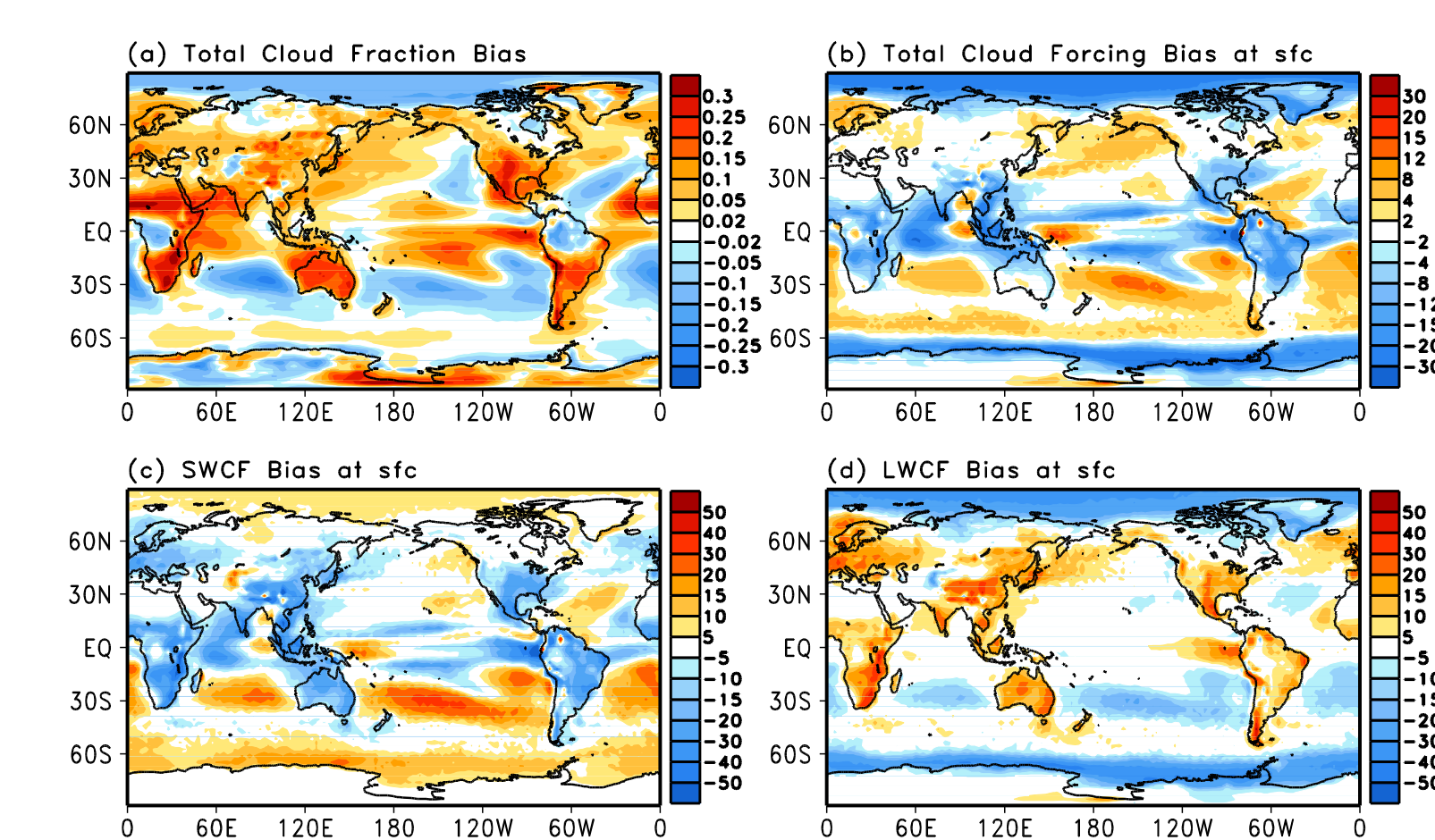
### Specific humidity biases



### SH/LH and ocean mixed layer depth biases



### Cloud biases



## Physics vs Dynamics

- Radiative (physically-induced) energy biases**
  - albedo, water vapor, and cloud
- Non-radiative (dynamically-induced) energy biases**
  - sensible/latent heat flux, surface dynamics, and atmospheric dynamics

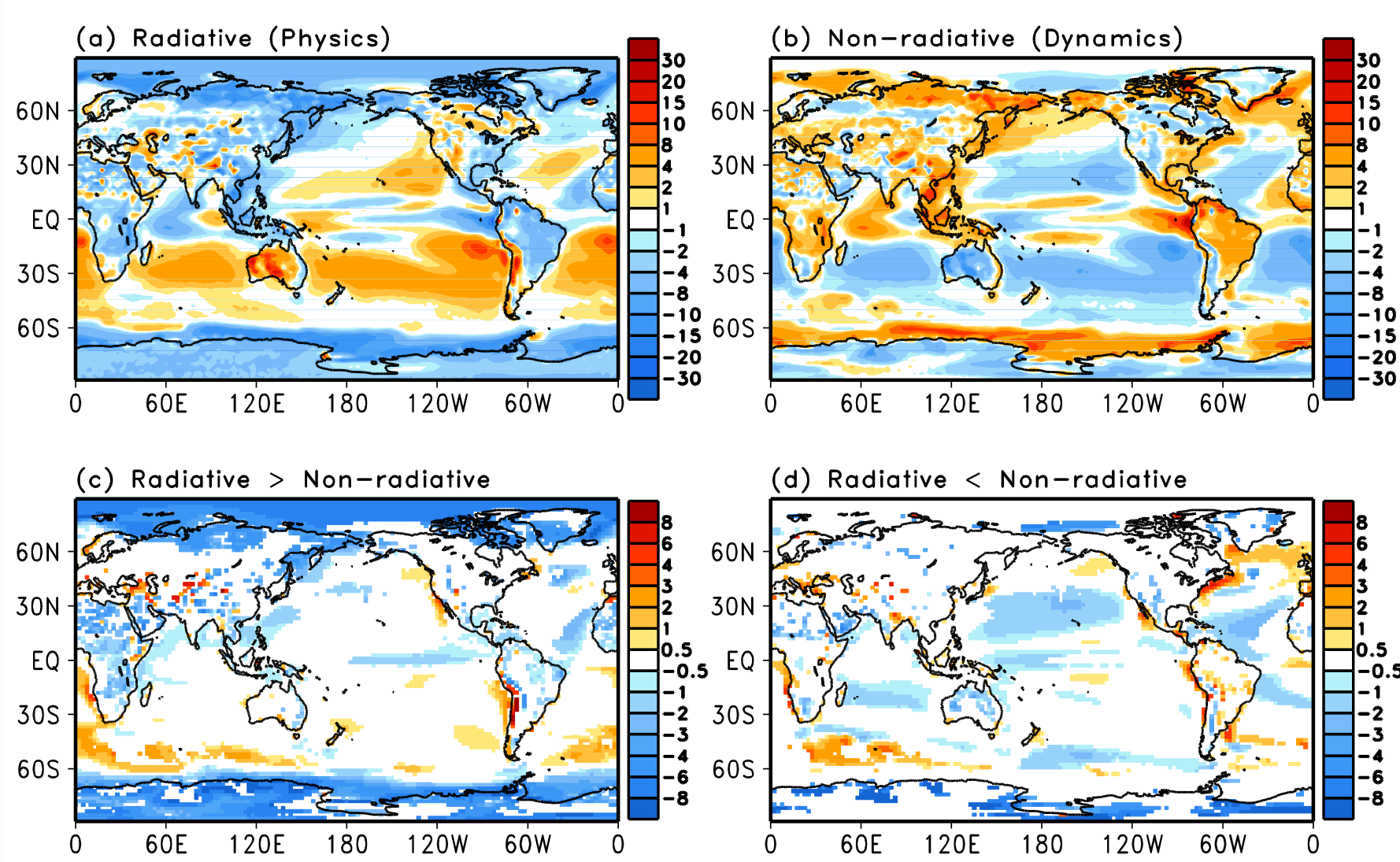


Table 1. The number of total, radiative-origin, and non-radiative-origin grid-points for globe, land, ocean, Arctic, and Antarctica

	Total	Radiative > non-radiative	Radiative < non-radiative
Globe	9,852	6,306 (64.0%)	3,546 (36.0%)
Land	2,969	2,090 (70.4%)	879 (29.6%)
Ocean	6,883	4,216 (61.2%)	2,667 (38.8%)
Arctic	1,194	1,109 (92.9%)	85 (7.1%)
Antarctic	1,203	897 (74.5%)	306 (25.5%)

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