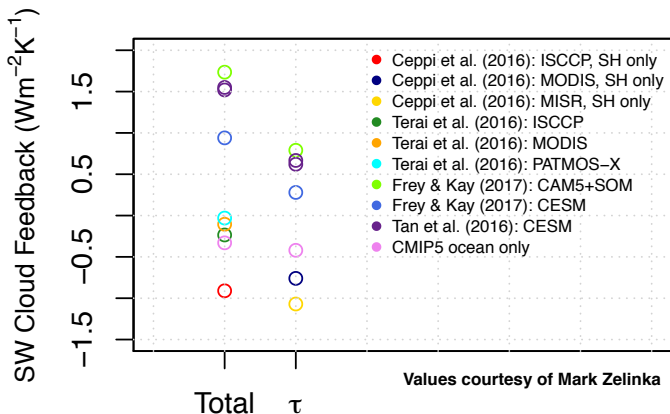


Motivation

There is a large spread in the extratropical shortwave (SW) cloud feedback and the SW cloud optical depth (τ) feedback.



Motivation

- ▶ Unknowns:
 - ▶ What is the sign of the extratropical SW τ feedback?
 - ▶ What physical processes are most important for it?
- ▶ $\tau = f(r_{eff}, \text{water content}, \Delta z)$

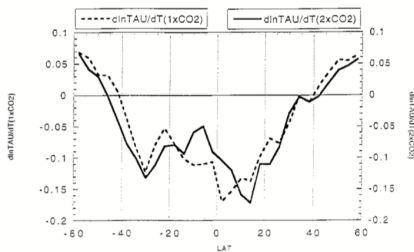
Process	Comment
<i>r_{eff}</i> : Thermodynamic phase shifts	Applies only to cold clouds (below freezing); liquid clouds increase at the expense of ice clouds upon warming; WBF process & ice nucleation are relevant; explains τ increases with temperature; Mitchell et al. (1989), Tsushima et al. (2006), McCoy et al. (2015), Ceppi et al. (2016), Tan et al. (2016), Frey & Kay (2017)
Water content: adiabatic water content	Adiabatic water content increases proportionally to the derivative of the moist adiabat with respect to temperature; explains τ increases with temperature; Betts & Harshvardhan (1987), Tselioudis et al. (1992), Gordon & Klein (2014)
Δz : cloud physical thickness	Due to e.g. convective activity (increase τ), boundary layer decoupling (decrease τ); Tselioudis et al. (1998), Gordon & Klein (2014)

Question

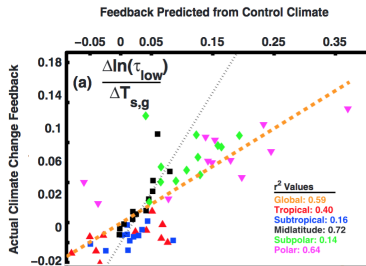
What is the relative importance of
thermodynamic phase shifts to
variations in τ with temperature?

$$\frac{d \ln \tau}{dT}$$

Previous studies have shown that τ variations with temperature ($\frac{d \ln \tau}{dT}$) in the current climate are qualitatively similar to those seen under climate warming \Rightarrow “time-scale invariance” of $\frac{d \ln \tau}{dT}$.



Tselioudis et al. (1998), J. Clim.



Gordon & Klein (2014), JGR

Note:

$\frac{d \ln \tau}{dT} > 0 \Rightarrow$ negative optical depth feedback

$\frac{d \ln \tau}{dT} < 0 \Rightarrow$ positive optical depth feedback

Method

Using MODIS level 3, 1° by 1°, daily dataset:

$$\overline{\ln \tau(T)} = k_i(T) \overline{\ln \tau_i(T)} + k_l(T) \overline{\ln \tau_l(T)}, \quad (1)$$

$$\begin{aligned} \overline{\ln \tau(T)} &= k_i(T) \overline{\ln \tau_i(T)} + (1 - k_i(T)) \overline{\ln \tau_l(T)} \\ &= k_i(T) \left(\overline{\ln \tau_i(T)} - \overline{\ln \tau_l(T)} \right) + \overline{\ln \tau_l(T)} \end{aligned} \quad (2)$$

$$\begin{aligned} \frac{d\overline{\ln \tau}}{dT} &= \frac{dk_i}{dT} \left(\overline{\ln \tau_i(T)} - \overline{\ln \tau_l(T)} \right) + k_i(T) \frac{d\overline{\ln \tau_i}}{dT} - k_i(T) \frac{d\overline{\ln \tau_l}}{dT} + \frac{d\overline{\ln \tau_l}}{dT} \\ &= \underbrace{\frac{dk_i}{dT} \left(\overline{\ln \tau_i(T)} - \overline{\ln \tau_l(T)} \right)}_{\text{thermodynamic phase shifts}} + \underbrace{k_i(T) \frac{d\overline{\ln \tau_i}}{dT}}_{\text{ice}} + \underbrace{k_l(T) \frac{d\overline{\ln \tau_l}}{dT}}_{\text{liquid}} \end{aligned} \quad (3)$$

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Dataset & Results

- ▶ Using MODIS/Aqua level 3, 1° by 1° gridded daily dataset, Dec. 1, 2012 to Nov. 30, 2016
- ▶ T refers to daytime cloud top temperature
- ▶ Considered all clouds (not just restricted to low clouds)
- ▶ Used mean gridcell values, but only those with $\sigma_T < 5$ K criterion to reduce high/low cloud overlap
- ▶ Required grid cells to contain both liquid and ice clouds
- ▶ Regressions performed in 15°C -wide bins
- ▶ F-test to evaluate statistical significance ($>95\%$) of regressions

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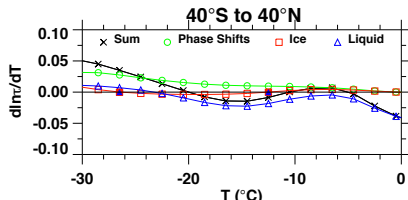
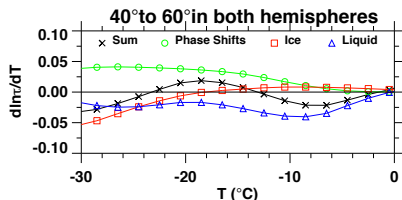
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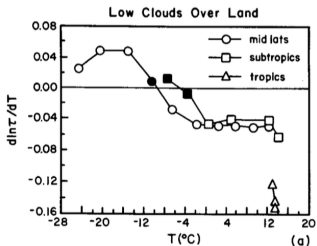
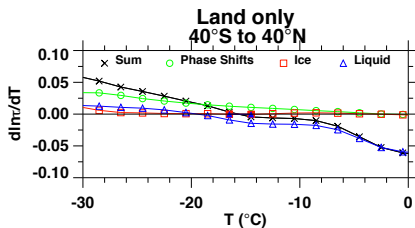
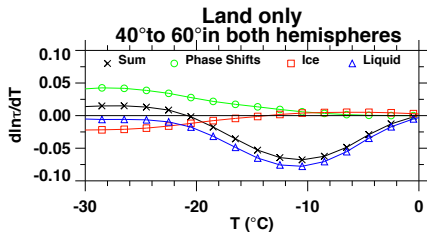
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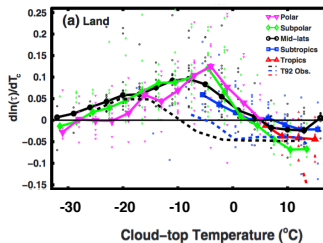
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- ▶ Regressions performed in 15°C-wide bins
- ▶ F-test to evaluate statistical significance (>95%) of regressions



Results: land only

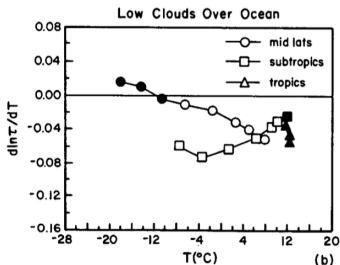
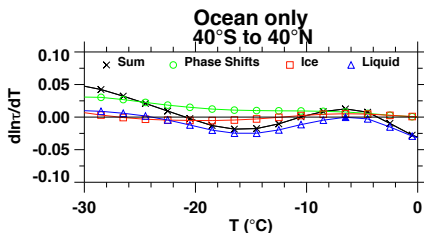
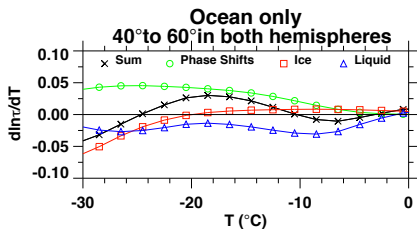


Tselioudis et al. (1992), J. Clim.

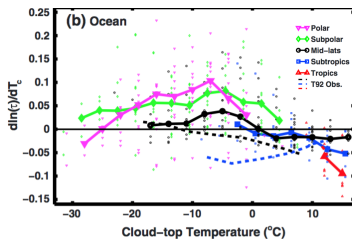


Gordon & Klein (2014), JGR

Results: ocean only



Tselioudis et al. (1992), J. Clim.



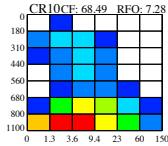
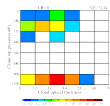
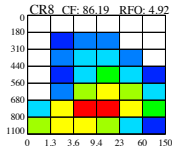
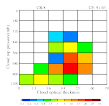
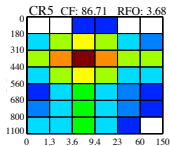
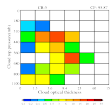
Gordon & Klein (2014), JGR

Question

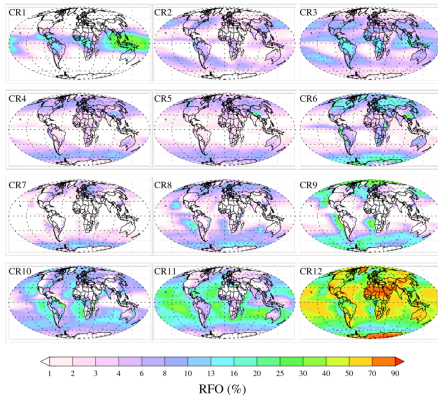
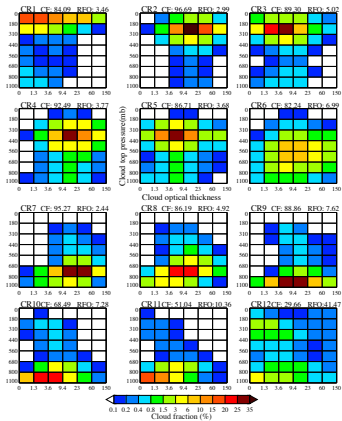
To what extent do dynamical processes influence $\frac{d \ln \tau}{dT}$?

MODIS Cloud Regimes

- ▶ Apply k-means clustering algorithm on MODIS CTP- τ histograms (daily, 1° by 1° , level 3, Dec. 1, 2002 to Nov. 30, 2014) to group histograms into similar “weather states” by assigning each histogram to the nearest centroid in terms of its Euclidean distance.
- ▶ The cloud regimes are the mean centroids after convergence.



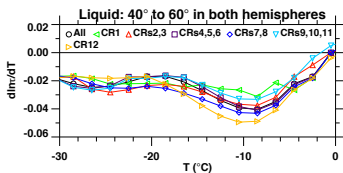
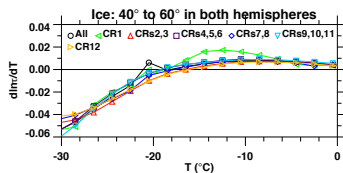
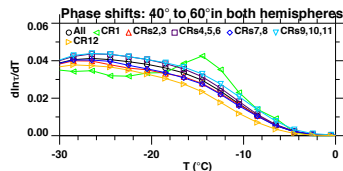
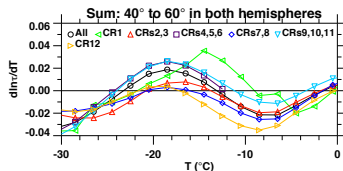
MODIS Cloud Regimes



Results: cloud regimes

Although there are differences in τ - T relationships between the various cloud regimes, the pattern is similar across cloud regimes.

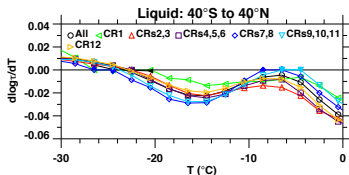
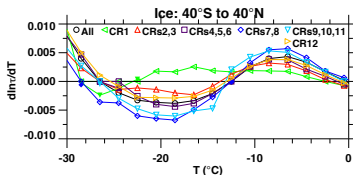
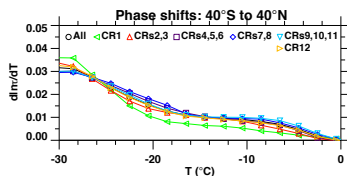
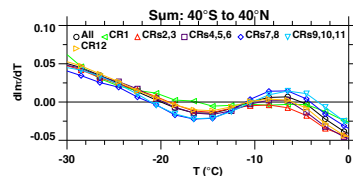
⇒ Thermodynamics are more important than dynamics for $\frac{d \ln \tau}{dT}$



Results: cloud regimes

Although there are differences in τ - T relationships between the various cloud regimes, the pattern is similar across cloud regimes.

⇒ Thermodynamics are more important than dynamics for $\frac{d \ln \tau}{dT}$



Summary

- ▶ Thermodynamic phase changes:
 - ▶ not as important for $\frac{d \ln \tau}{dT}$ as liquid cloud processes
 - ▶ more important for $\frac{d \ln \tau}{dT}$ at colder temperatures
 - ▶ explain why $\frac{d \ln \tau}{dT} > 0$ at colder temperatures over land (vs. adiabatic water content changes)
- ▶ $\frac{d \ln \tau}{dT}$ is too positive in models, implying that the cloud optical depth feedback may be too negative in models
- ▶ Dynamical processes likely do not strongly influence $\frac{d \ln \tau}{dT}$