



# An Updated CLUBB PDF Closure Scheme to Improve Low Cloud Simulation in CAM6

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Acknowledgement: Te Li, Zhun Guo, Ben Yang, Yifei Xu, Xiaomen Han, Jianning Sun

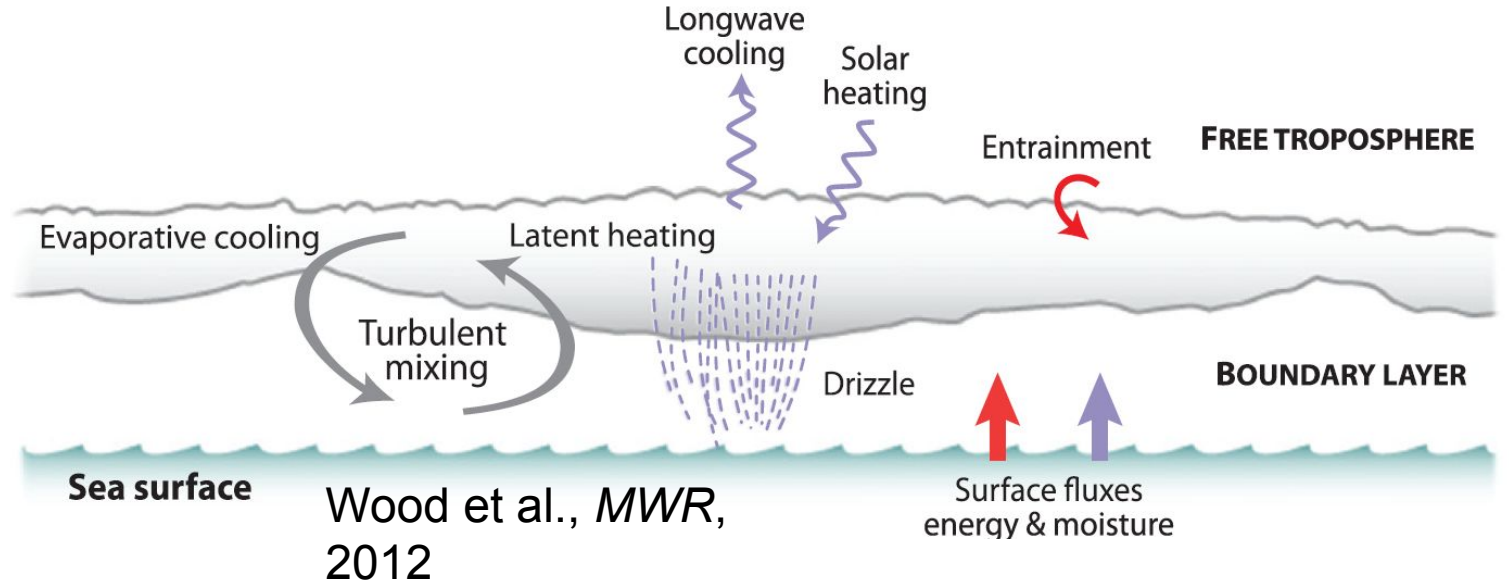
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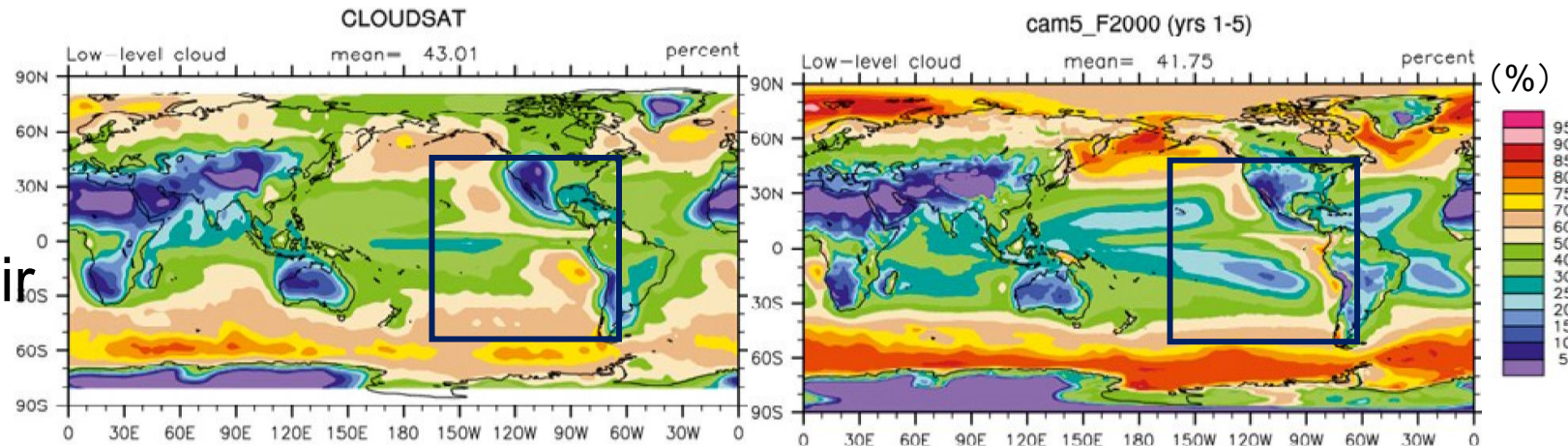
# Challenges in marine low cloud simulation



- Low clouds are regarded as the most significant source of uncertainties in cloud feedback and climate sensitivity



- Low clouds simulation depends on small-scale turbulent processes and their interaction with radiation.

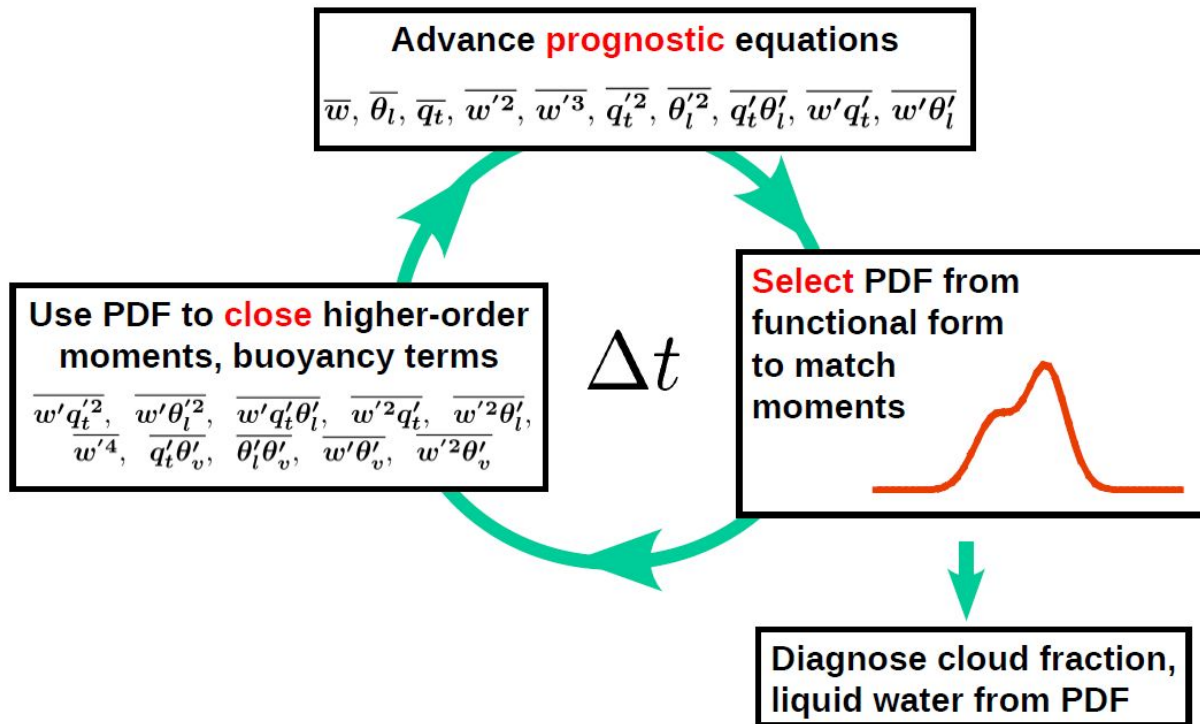


Bogenschutz et al., *JC*, 2013

# Cloud Layers Unified by Binormals (CLUBB)



- CLUBB: an **assumed PDF**, higher-order turbulence closure parameterization.
- **Assumed PDF**: a **double Gaussian functional form** of the joint PDF of vertical velocity ( $w$ ), total water mixing ratio ( $q_t$ ) and liquid water potential temperature ( $\theta_l$ )
- A **unified treatment** of **boundary layer turbulence**, **shallow convection**, and **cloud macrophysics**

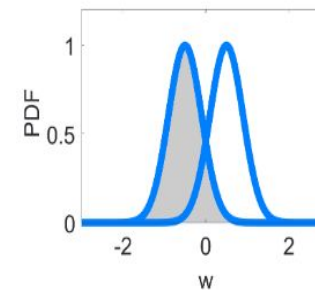


$$P(\widehat{w}, \tilde{q}_t, \tilde{\theta}_l)$$

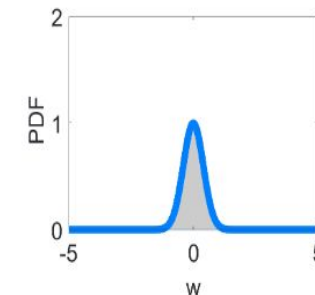
$$= aG_1(\widehat{w}_1, \tilde{\theta}_{l1}, \tilde{q}_{t1}, \tilde{\sigma}_{w1}, \tilde{\sigma}_{\theta_{l1}}, \tilde{\sigma}_{q_{t1}})$$

$$+ (1-a)G_2(\widehat{w}_2, \tilde{\theta}_{l2}, \tilde{q}_{t2}, \tilde{\sigma}_{w2}, \tilde{\sigma}_{\theta_{l2}}, \tilde{\sigma}_{q_{t2}})$$

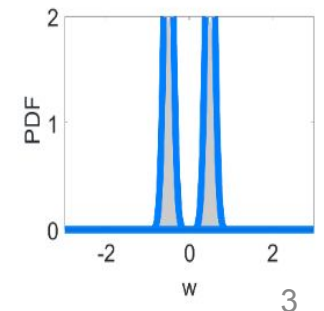
**mixing function**



**mean**



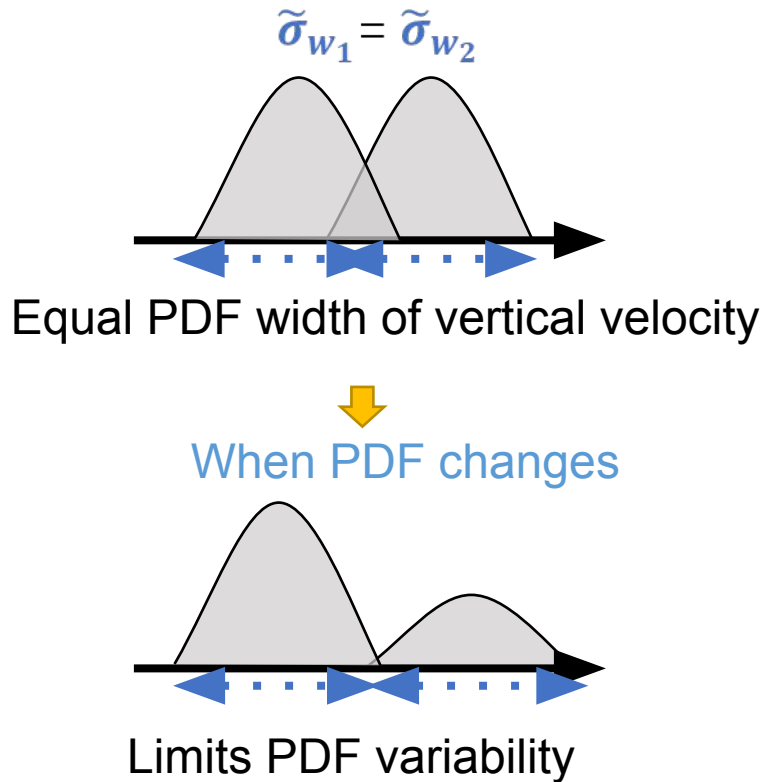
**standard deviation**



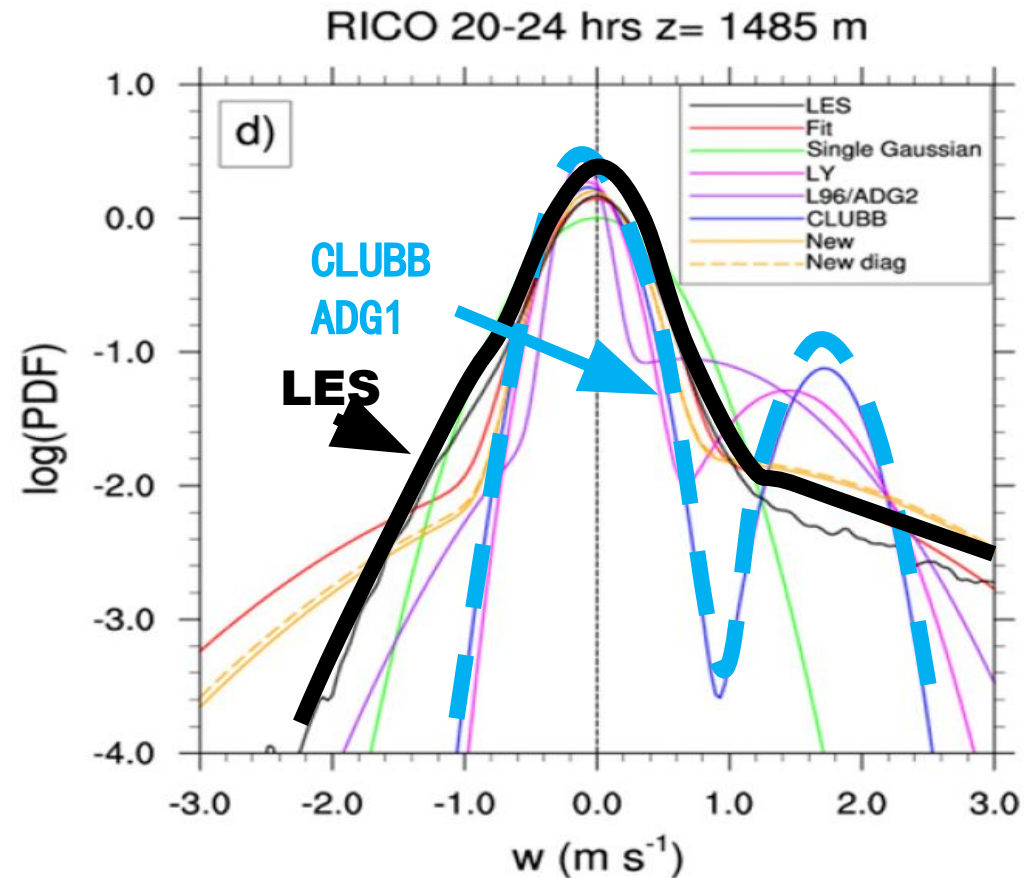
# Problems with the default CLUBB PDF closure scheme



- Default PDF closure scheme in CAM6 (Analytic Double Gaussian 1, ADG1): **equal width** for the two individual Gaussian PDFs of  $w$  (Larson et al., *JAS*, 2002)



- ADG1 produces **double peaks** in  $w$ -PDF.



Fitch, *JAS*, 2019

# Updating the unequal width PDF closure scheme



## Unequal width of $w$ (Fitch, JAS, 2019)

$$\tilde{\sigma}_{w_1} = \begin{cases} 1 & \text{if } |K - 3| < 0.5 \\ 1.26|K - 3|^{0.28} & \text{if } |K - 3| \geq 0.5 \end{cases}$$

$$\tilde{\sigma}_{w_2} = 1 - \frac{0.4|Sk_w|}{\sqrt{0.3 + Sk_w^2}}$$

- The relationship between kurtosis ( $K$ ) and skewness ( $Sk_w$ )

$$K = \begin{cases} 1.48Sk_w^2 + 3, & \text{if } Sk_w < 1.4 \\ 3.84Sk_w^2 + 3, & \text{if } Sk_w \geq 1.4 \end{cases} \quad K = \frac{\overline{w'^4}}{\overline{w'^2}^2}$$

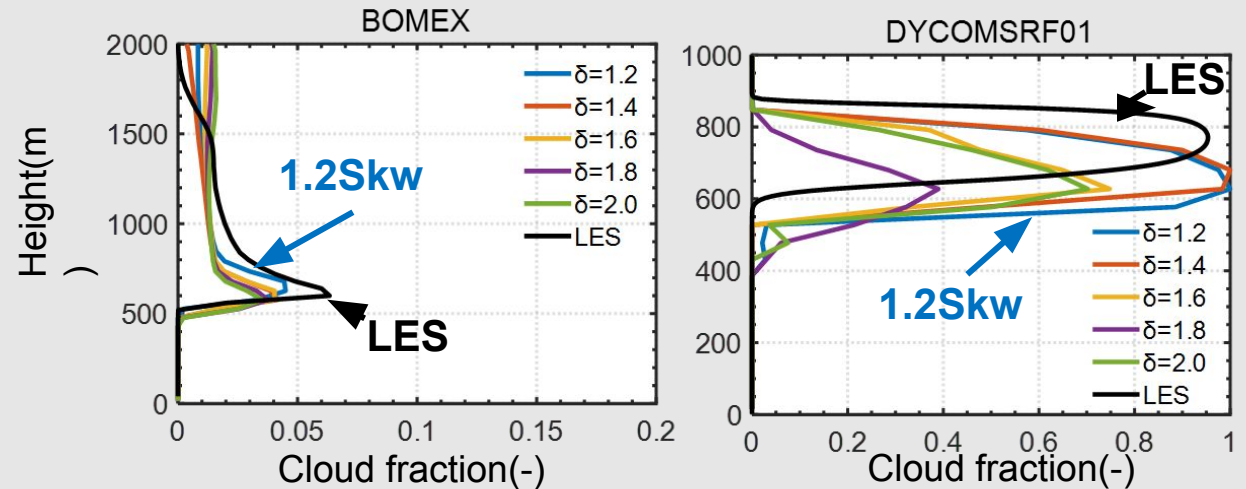
## Updating $q_t$ and $\theta_l$ width

- The first Gaussian PDF widths are modified to match  $w$  width modification

$$\sigma_{r_{t1}}^2 = \frac{\alpha_{r_t}}{\alpha_{r_t}'^2} wf_1 \times 1.2Sk_w$$

$$\sigma_{\theta_{l1}}^2 = \frac{\alpha_{\theta_l}}{\alpha_{\theta_l}'^2} wf_1 \times 1.2Sk_w$$

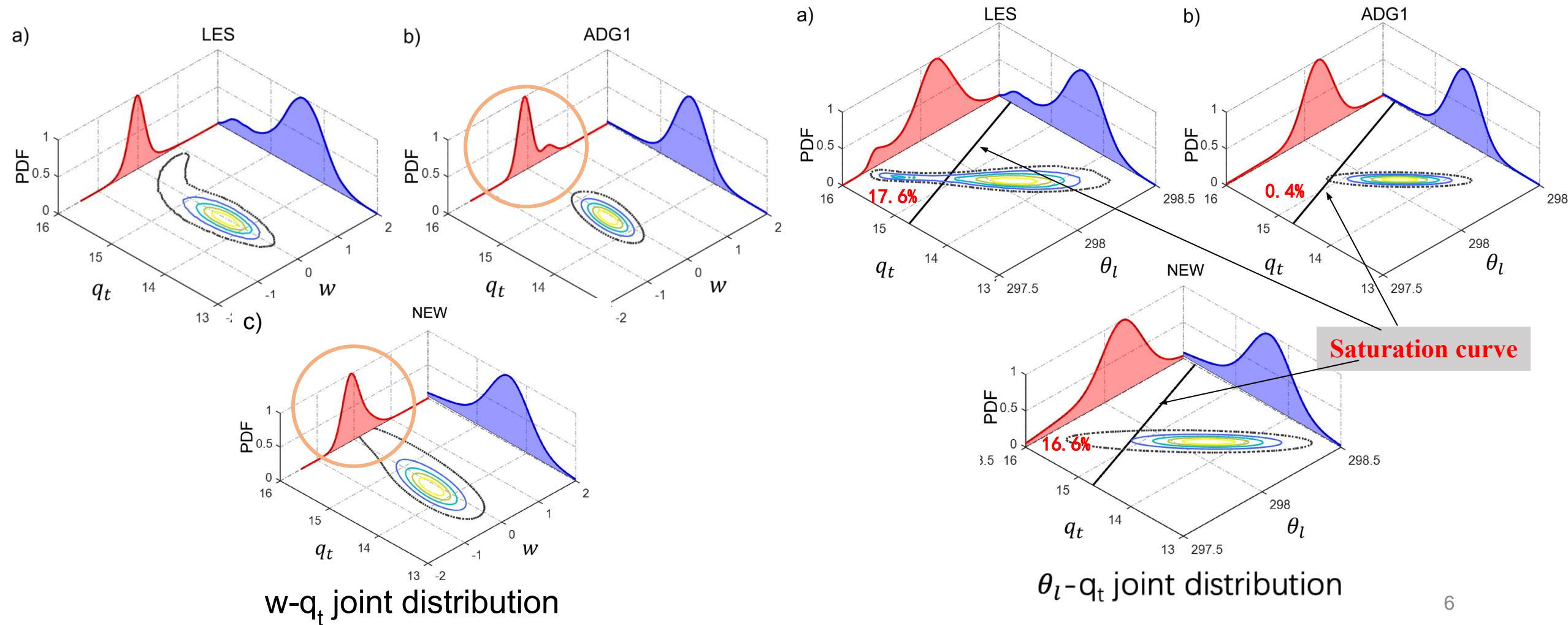
## Single column simulations



# Evaluating the new PDF closure scheme



- NEW agrees better with the LES in simulating the  $w$ -PDF distribution, and the saturation area



# CAM6 AMIP experiment



- The 6-year experiments are performed, the last 5-year results are analyzed
- Prescribed climatological SST and sea ice were used in these experiments

ADG1

CLUBB default **equal width** PDF closure scheme

NEW

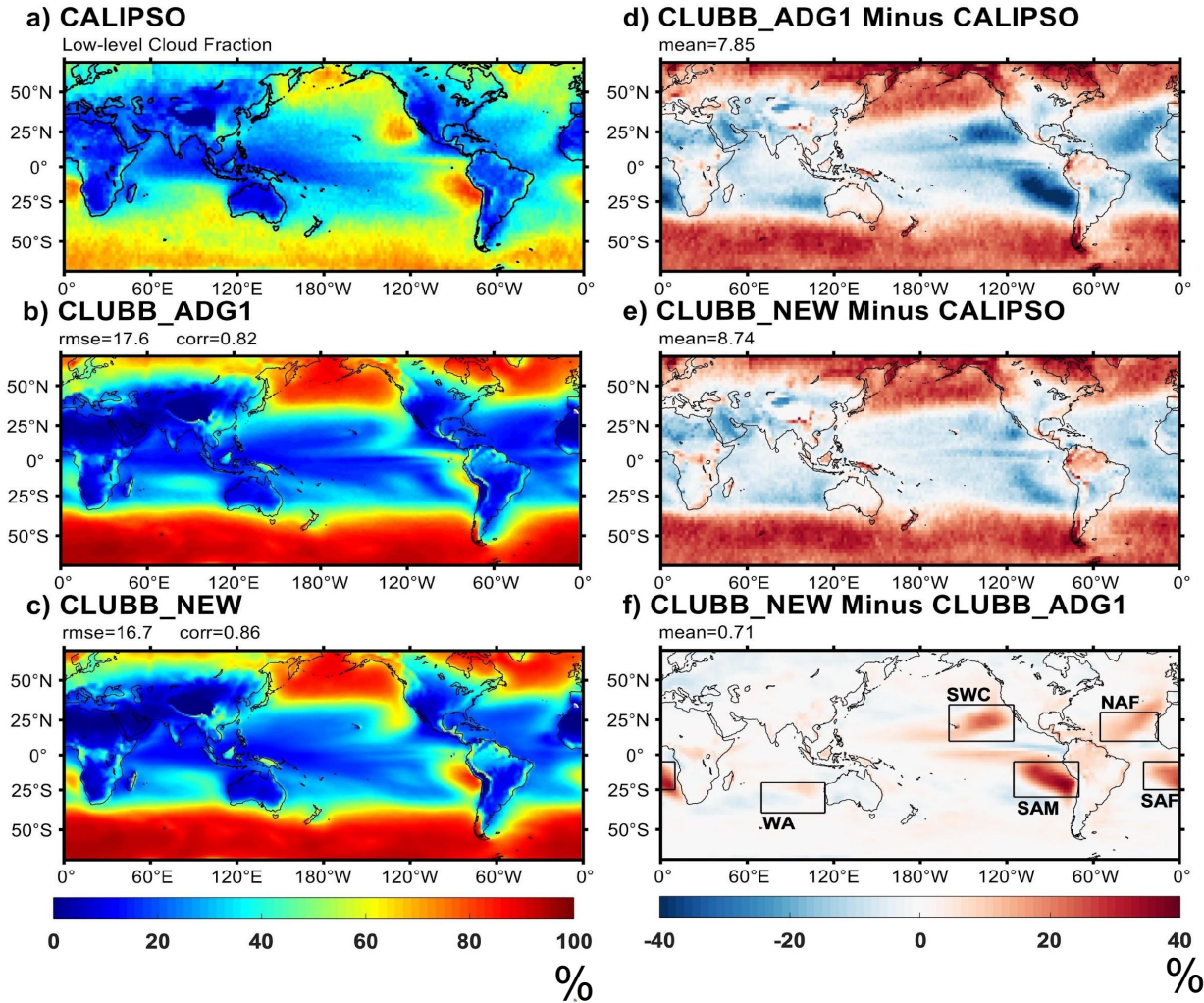
New **unequal width** PDF closure scheme

Group	Name	Resolution	SST setting	
Present day	ADG1	0.9°*1.25°, 32 lev	AMIP	
	NEW	0.9°*1.25°, 32 lev	AMIP	→ Low cloud fraction
SST+4K	ADG1+4k	0.9°*1.25°, 32lev	AMIP+4k	
	NEW+4k	0.9°*1.25°, 32lev	AMIP+4k	→ cloud feedback

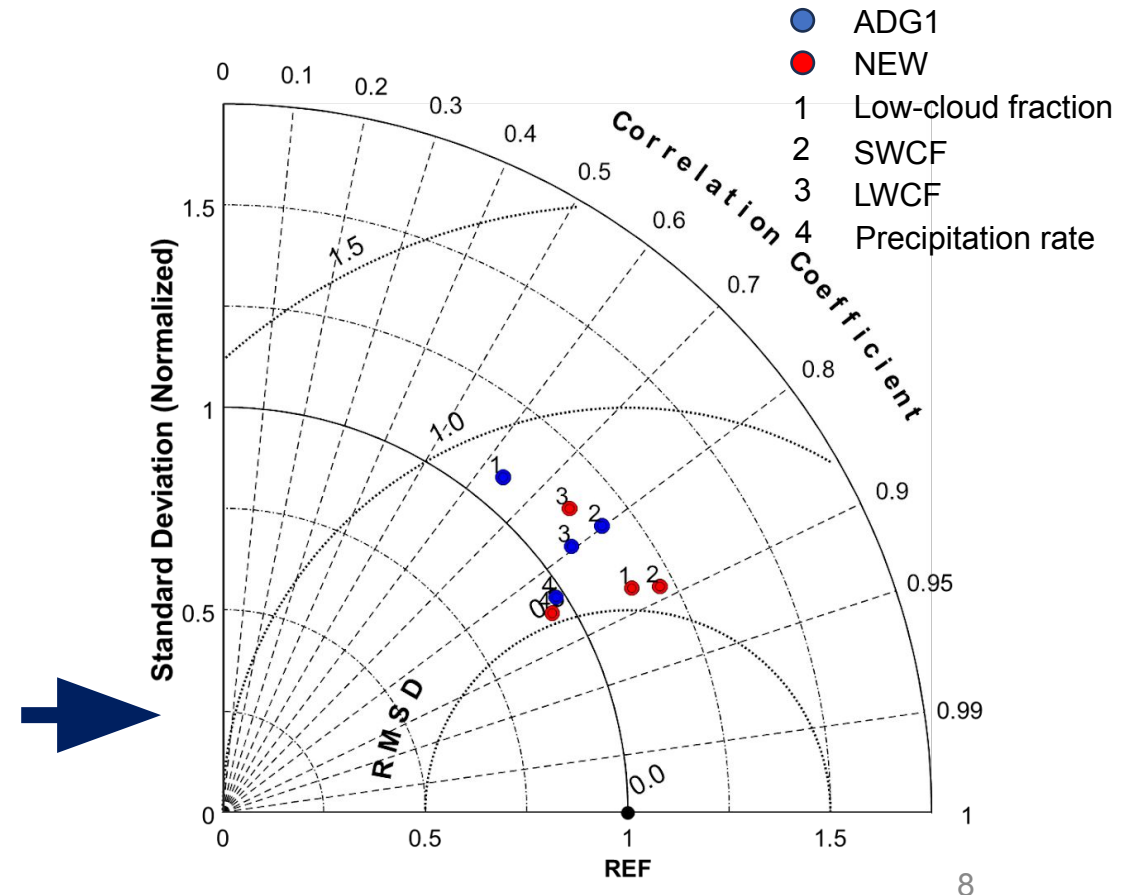
# Improvement in the low cloud simulation



- The new PDF closure scheme improves low cloud fraction by 20~30% in most stratocumulus-to-cumulus transition regions.



## Five Sc-Cu Regions

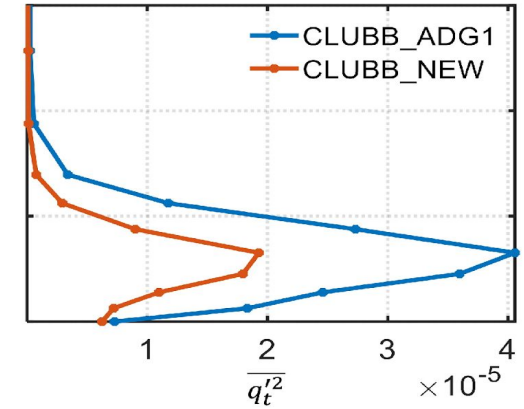
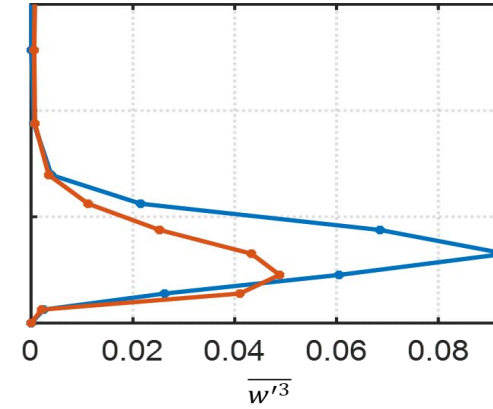
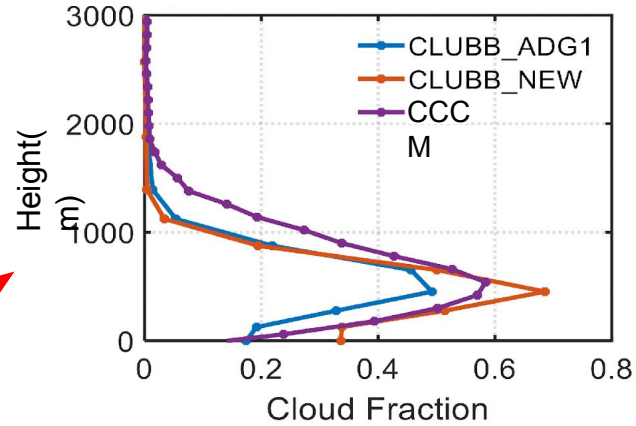




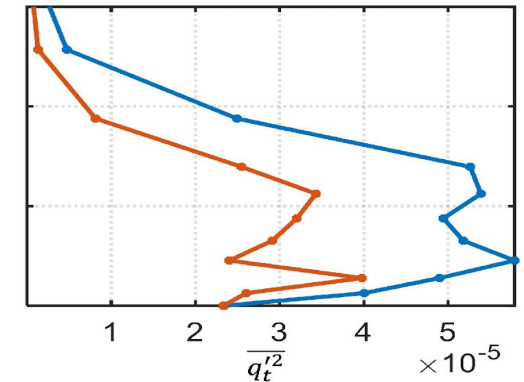
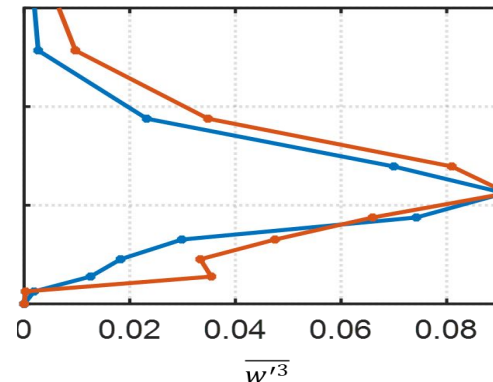
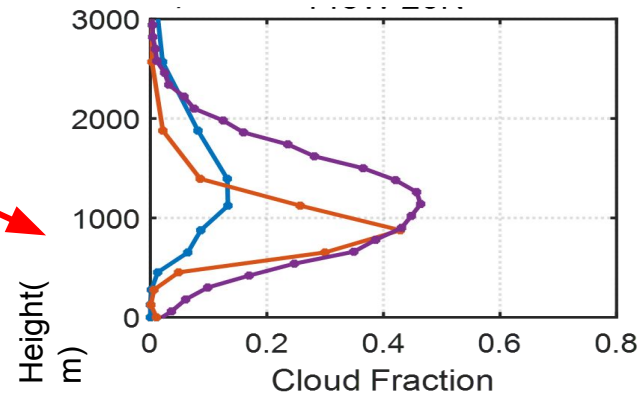
# Changes in the turbulence statistics moment



## Stratocumulus (128W, 32N)



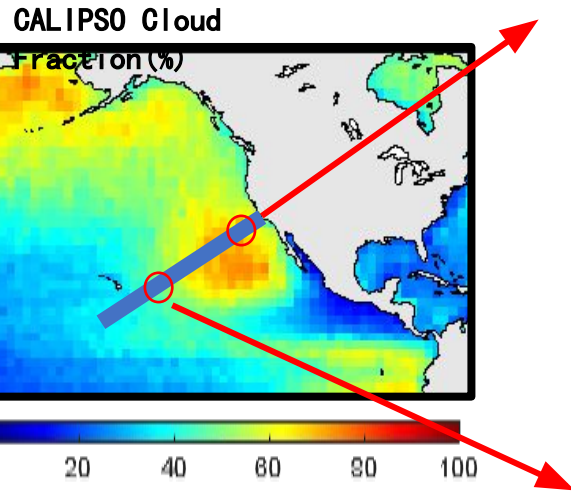
## Shallow cumulus (145W, 20N)



Stratocumulus:  
smaller  $\overline{w^{13}}$

Shallow cumulus:  
larger  $\overline{w^{12}}$

Both cloud types:  
smaller  $\overline{q_t^{12}}$



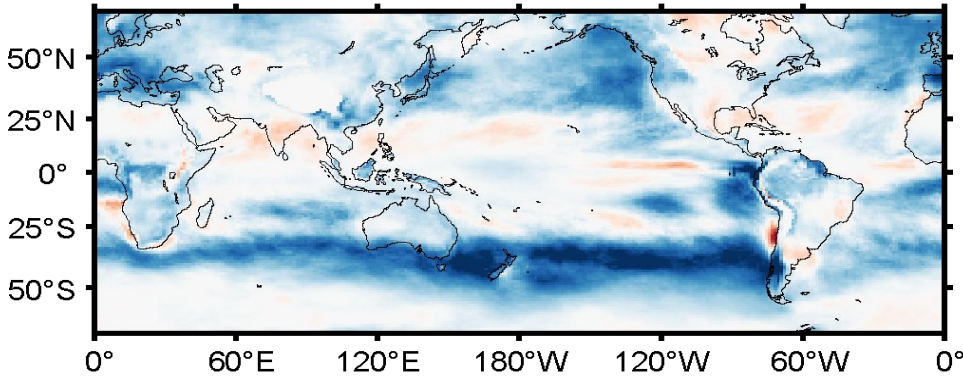
Li T. et al.,  
*JAMES*, 2023

# Impact on cloud feedback

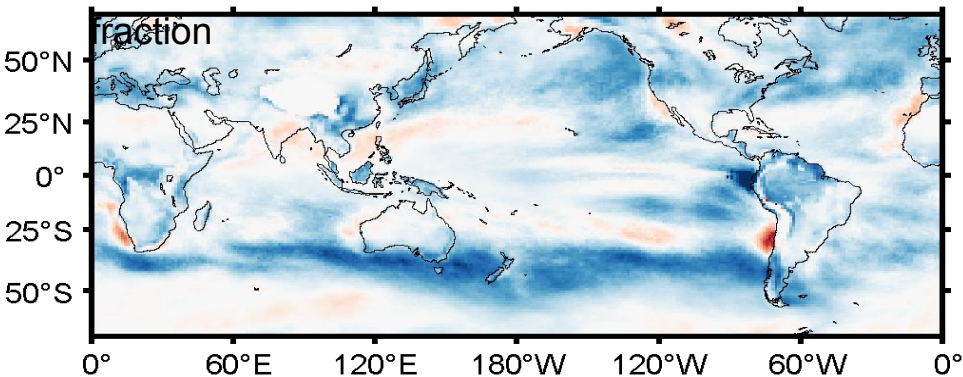


- The new scheme simulates **weak positive low cloud feedback**, as it simulates **less increase in skewness** in +4K experiment

**ADG1+4k minus ADG1**  
Difference in low cloud fraction



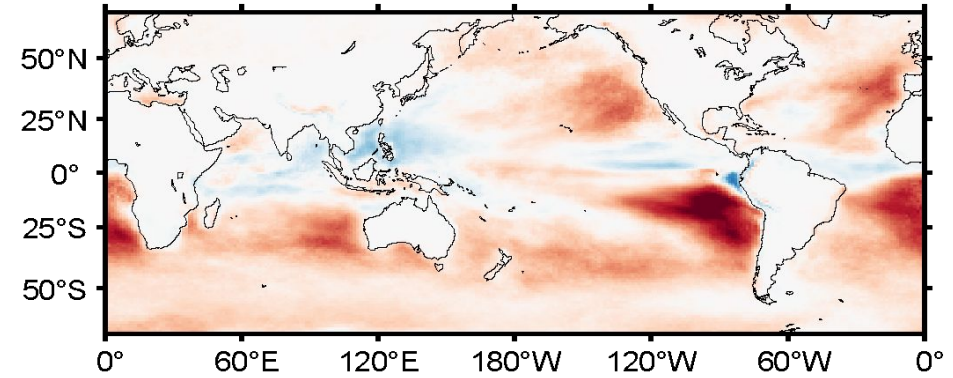
**NEW+4k minus NEW**  
Difference in low cloud fraction



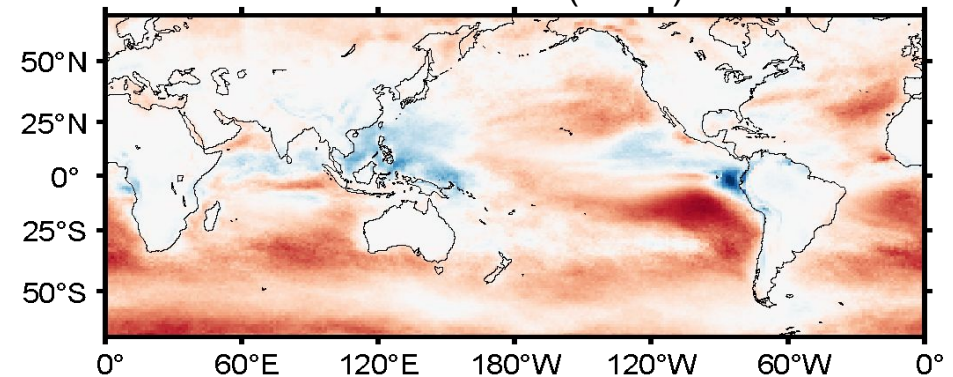
SST increase leads to increase in skewness, and further increase in shallow convection



**ADG1+4k minus ADG1**  
Difference in skewness of  $w$  (<1km)



**NEW+4k minus NEW**  
Difference in skewness of  $w$  (<1km)



# Summary



- A new **unequal width PDF closure** is adopted in CLUBB, and is found to increase low cloud fraction **by 20~30% in most Sc-to-Cu transition regions**
- The new closure scheme simulates **more symmetric turbulence** in **stratocumulus** and **stronger turbulent transport** in **shallow cumulus**. Furthermore, the updated closure scheme enhances the cloud fraction near the cloud base by **interacting with the microphysical scheme**
- The new scheme simulates **weaker positive low cloud feedback**, despite simulated stronger low cloud fraction in the present day, as it simulates **less increase in skewness in the +4k experiment**.

Li, T., Wang, M., Guo, Z., Yang, B., Xu, Y., Han, X., & Sun, J., 2022: An updated CLUBB PDF closure scheme to improve low cloud simulation in CAM6, *JAMES*, 14, <https://doi.org/10.1029/2022MS003127>

**Thanks! Questions/comments?**



# CLUBB: a unified treatment of cloud and turbulence processes



- Cloud Layers Unified by Binormals (CLUBB) is an **assumed PDF higher-order turbulence closure** parameterization.
- CLUBB unify the treatment of boundary layer turbulence, shallow convection, and cloud macrophysics .

- CLUBB adopts a double Gaussian functional form of the joint PDF(P) of vertical velocity ( $w$ ), total water mixing ratio ( $q_t$ ) and liquid water potential temperature ( $\theta_l$ ).

$$P(\hat{w}, \tilde{q}_t, \tilde{\theta}_l)$$

$$= aG_1(\hat{w}_1, \tilde{\theta}_{l1}, \tilde{q}_{t1}, \tilde{\sigma}_{w1}, \tilde{\sigma}_{\theta_{l1}}, \tilde{\sigma}_{q_{t1}})$$

$$+ (1 - a)G_2(\hat{w}_2, \tilde{\theta}_{l2}, \tilde{q}_{t2}, \tilde{\sigma}_{w2}, \tilde{\sigma}_{\theta_{l2}}, \tilde{\sigma}_{q_{t2}})$$

