

Better cloud calibration leads to improved realism in global atmospheric simulation

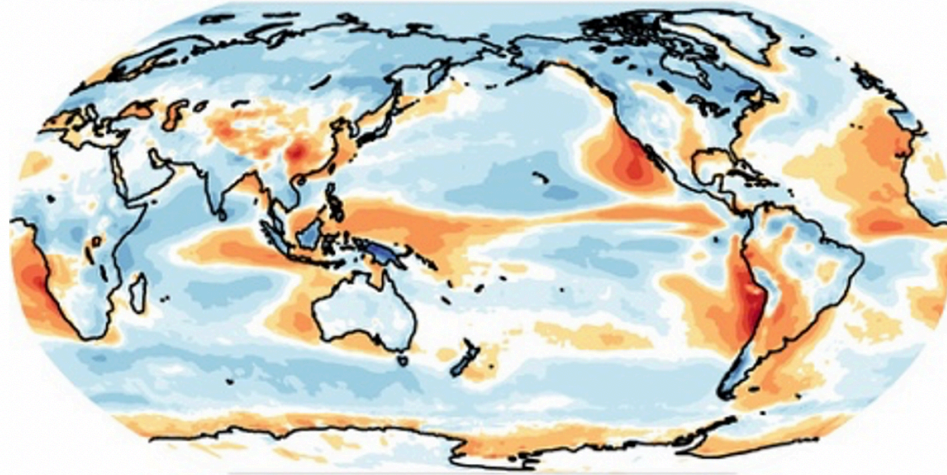
Po-Lun Ma

March 9, 2020

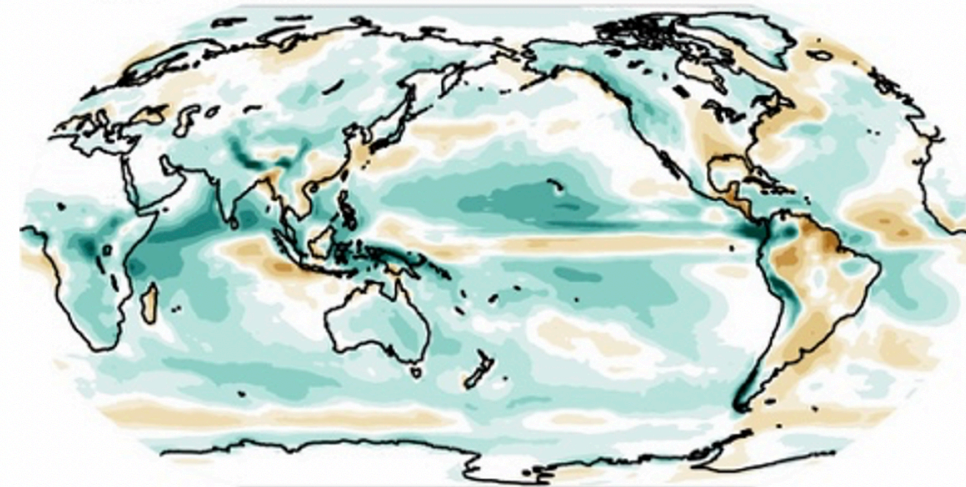
Biases in EAMv1

SWCRE

(a) EAMv1 - CERES-EBAF V2.3 (2000-2013)
avg = -2.17



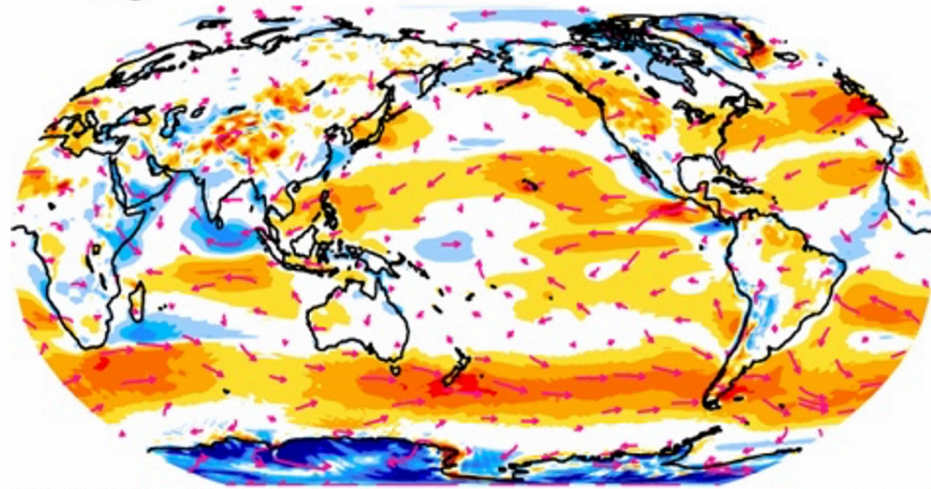
(a) EAMv1 - GPCP V2.1 (1979-2009)
avg = 0.40



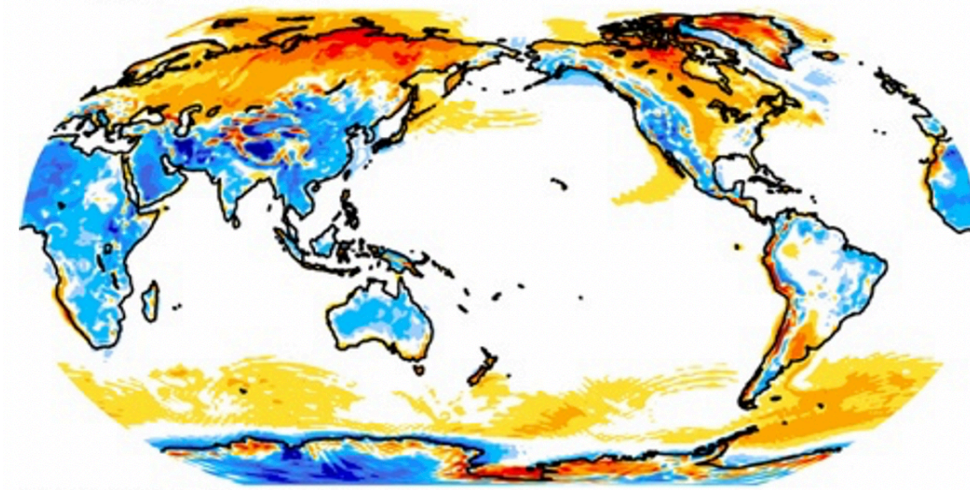
Precipitation

Surface winds

(a) EAMv1 - MERRA-2 (1996-2005)
avg = 0.326



(a) EAMv1 - ERA5 (1996-2005)
avg = 0.048



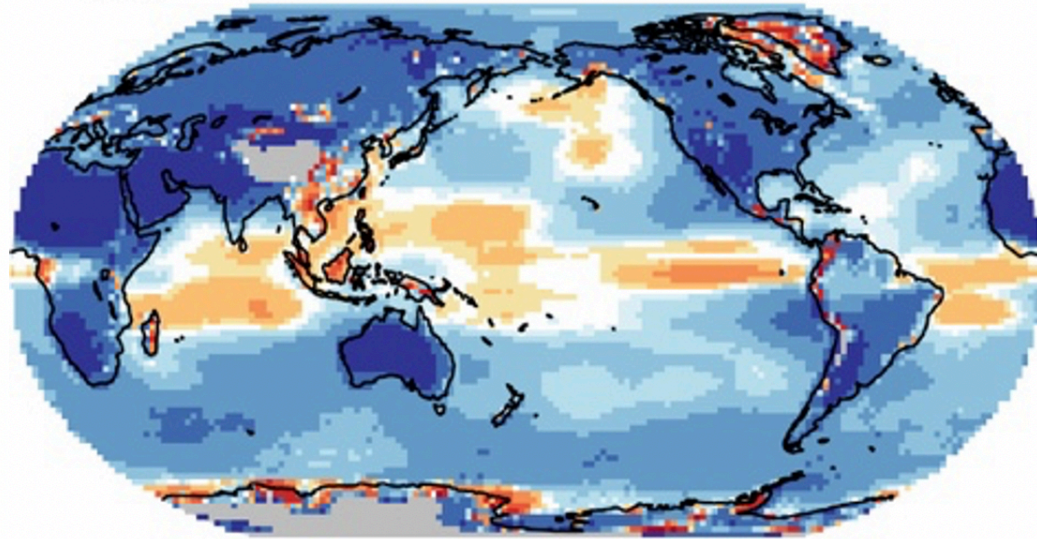
Surface temperature

PBL diagnostics provides insights into low cloud bias

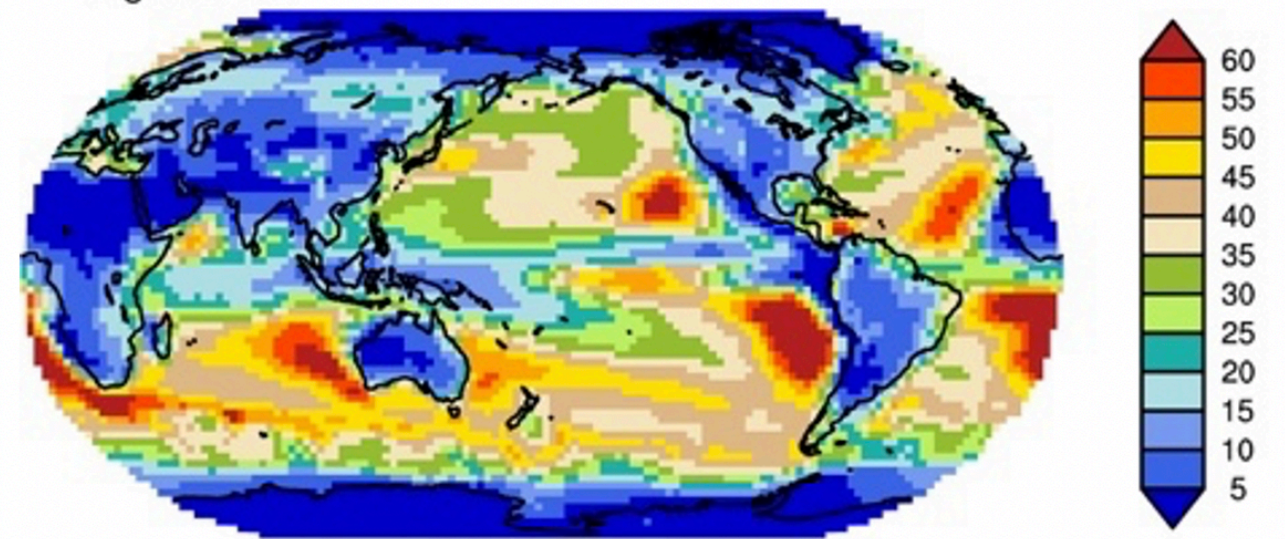
EIS

Decoupling frequency

(a) EAMv1 - ERA5 (1996-2005)
avg = -1.63

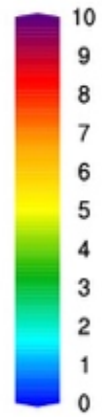
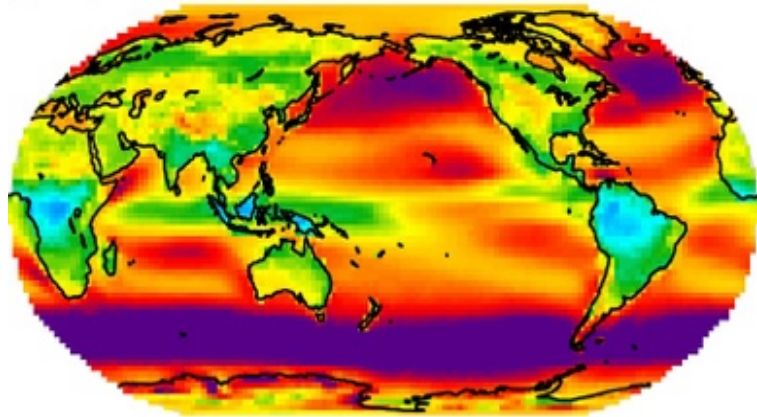


(a) EAMv1
avg = 26.20

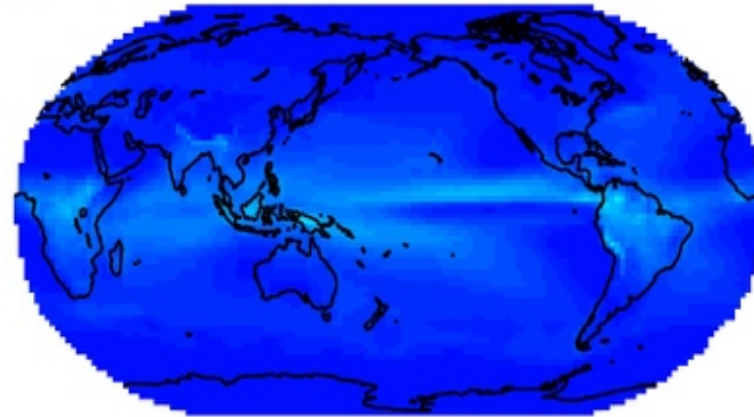


Neglecting subgrid winds might contribute to precipitation bias

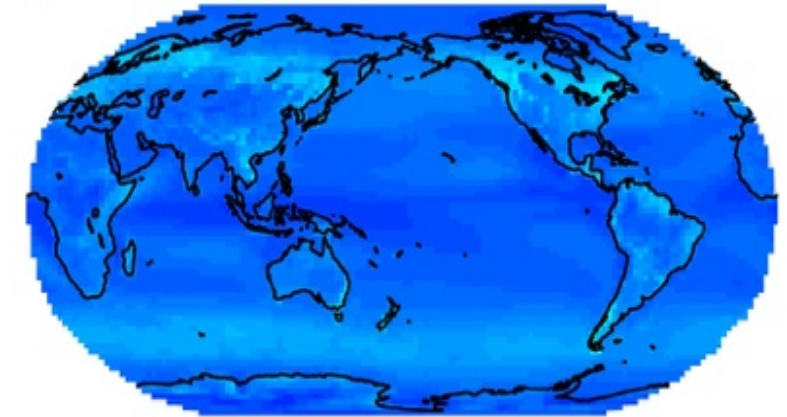
(a) Large scale wind avg= 6.64 m·s⁻¹



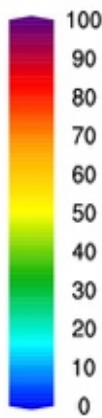
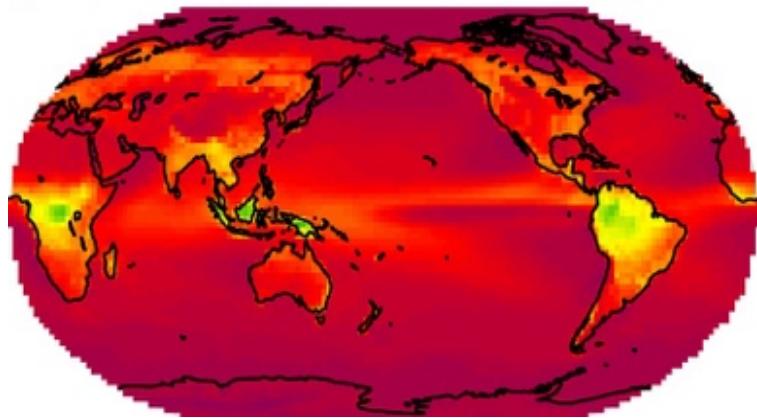
(b) ZM gust wind avg= 0.29 m·s⁻¹



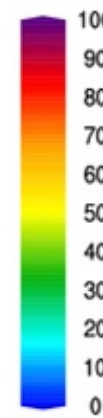
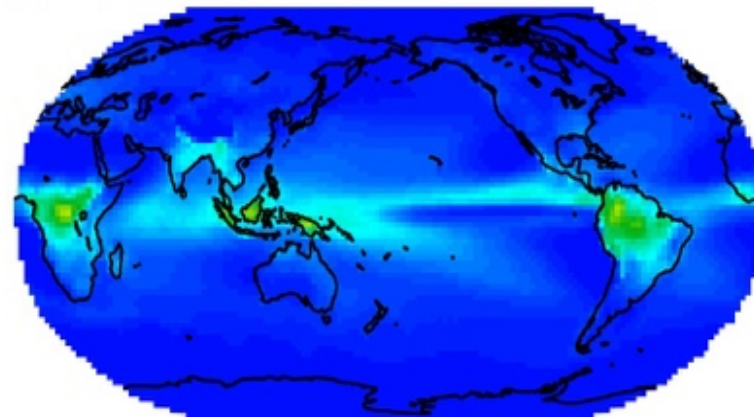
(c) CLUBB gust wind avg= 0.69 m·s⁻¹



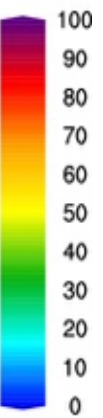
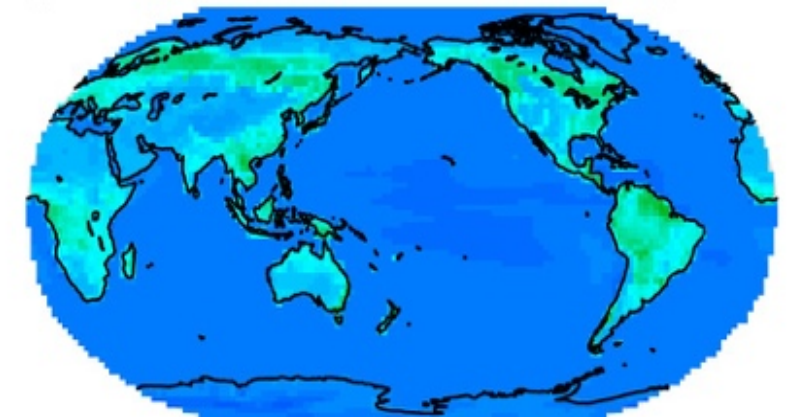
(d) Large scale wind fraction avg=85.35 %



(e) ZM gust wind fraction avg= 4.82 %



(f) CLUBB gust wind fraction avg= 9.84 %

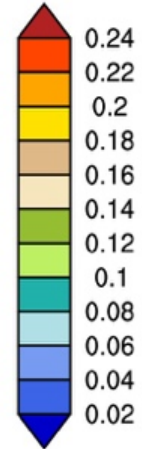
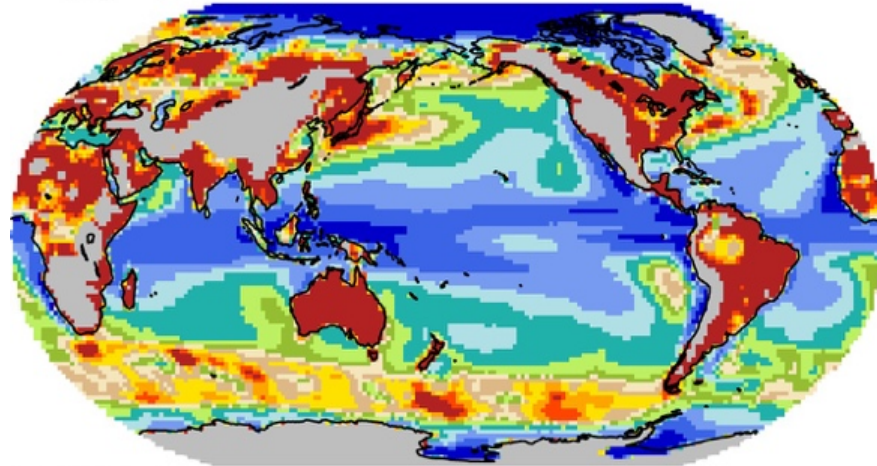


EAMv1 vs. subsequent changes

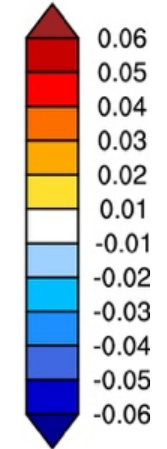
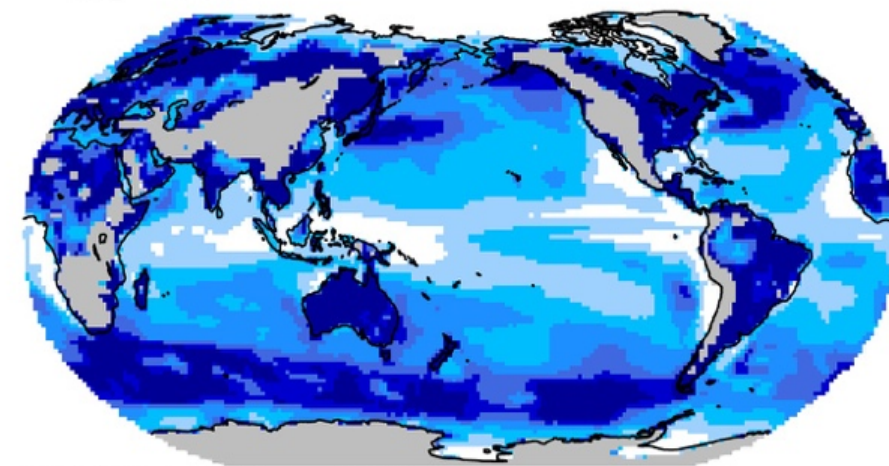
- **EAMv1**: Standard EAMv1 model
- **EAMv1_CLUBB**: EAMv1 + CLUBB tunings + skewness
- **EAMv1_SGV**: EAMv1+ ZM and CLUBB gustiness over land and ocean, subgrid temperature
- **EAMv1_MP**: EAMv1 + MG2 tunings
- **EAMv1_ZM**: EAMv1 + ZM tunings
- **EAMv1P**: EAMv1 + all changes

Skewness

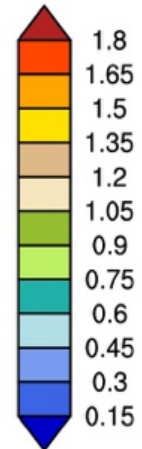
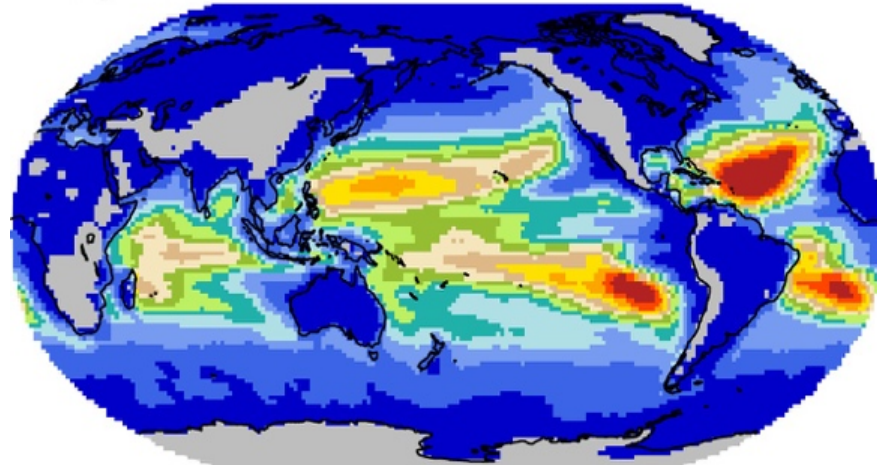
(a) EAMv1
avg = 0.132



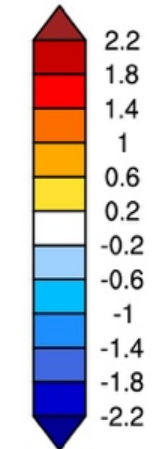
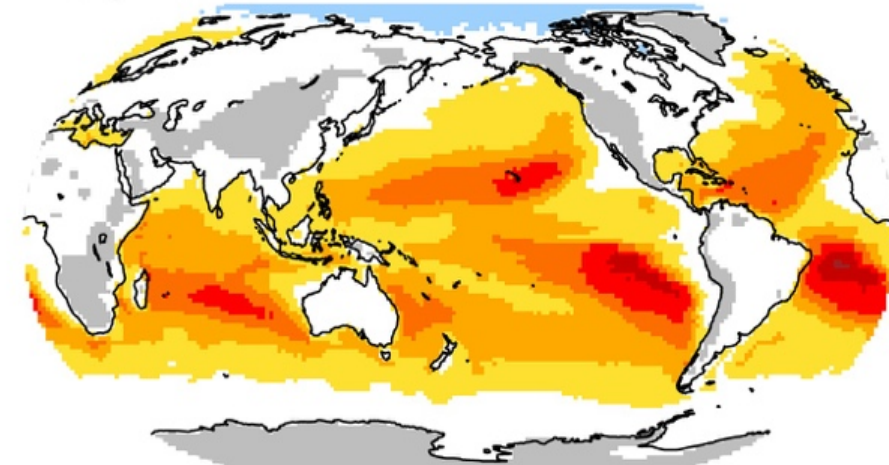
(b) EAMv1_CLUBB - EAMv1
avg = -0.041



(c) EAMv1
avg = 0.442



(d) EAMv1_CLUBB - EAMv1
avg = 0.445



CLUBB Changes	Description	EAMv1	EAMv1P
C1	Coefficient for $\overline{w'^2}$ damping at low Sk_w	1.335	2.4
C1b	Coefficient for $\overline{w'^2}$ damping at high Sk_w	1.335	2.8
C1c	Coefficient for Sk_w dependency of C1*	1.0	0.75
C6rtb	Coefficient for $\overline{w'q_t'}$ damping at high Sk_w	6.0	7.5
C6rtc	Coefficient for Sk_w dependency of C6rt*	1.0	0.5
C6rthlb	Coefficient for $\overline{w'\theta_l'}$ damping at high Sk_w	6.0	7.5
C6rthlc	Coefficient for Sk_w dependency of C6rthl*	1.0	0.5
C8	Coefficient for $\overline{w'^3}$ damping	4.3	5.2
C11	Coefficient for $\overline{w'^3}$ damping at low Sk_w	0.80	0.7
C11b	Coefficient for $\overline{w'^3}$ damping at high Sk_w	0.35	0.2
C11c	Coefficient for Sk_w dependency of C11*	0.5	0.85
C14	Coefficient for $\overline{u'^2}$ and $\overline{v'^2}$ damping	1.06	2.0
C_k10	Ratio of eddy diffusivity of momentum to heat	0.30	0.35
gamma_coef	The width of the Gaussian PDF at low Sk_w	0.32	0.12
gamma_coefb	The width of the Gaussian PDF at high Sk_w	0.32	0.28
gamma_coefc	Coefficient for Sk_w dependency of the Gaussain PDF width	5.0	1.2
mu	Fractional entrainment rate	1.e-3	5.e-4
wpxp_l_thresh	Eddy length scale threshold for damping C6 and C7	60	100

MG2 Changes	Description	EAMv1	EAMv1P
cld_sed	Liquid droplet sedimentation adjustment	1.0	1.8
ice_sed_ai	Ice droplet fall speed parameter	500	1200
micro_mg_accre_enhan_fac	Liquid cloud accretion adjustment	1.5	1.75
micro_mg_berg_eff_factor	WBF process adjustment	0.1	0.7
prc_exp1	Exponent of liquid droplet number concentration in autoconversion	-1.2	-1.4
so4_sz_thresh_icenuc	Aitken model sulfate aerosol size threshold for homogeneous ice nucleation	0.05e-6	0.8e-6
wsubmin	Minimum subgrid vertical velocity used for liquid droplet nucleation	0.2	0.001

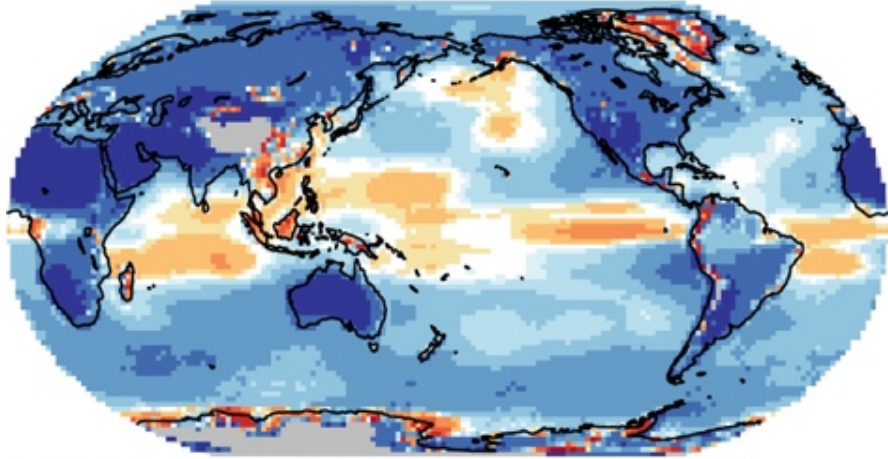
ZM Changes	Description	EAMv1	EAMv1P
alfa	Downdraft mass flux fraction adjustment	0.1	0.14
c0_lnd	Coefficient for convective cloud water to rain over land	0.007	0.002
c0_ocn	Coefficient for convective cloud water to rain over land	0.007	0.002
dmpdz	Parcel fractional mass entrainment rate	-0.7e-3	-1.2e-3
dp1	Deep convective cloud fraction parameter	0.045	0.018
ice_deep	Ice particle radius detrained from deep convection	16.e-6	14.e-6
mx_bot_lyr_adj	Adjustment for searching the maximum moist static energy	2	1

Aerosol changes	Description	EAMv1	EAMv1P
seasalt_emis_scale	Adjustment for sea spray aerosol mobilization	0.85	0.60
dust_emis_fact	Adjustment for dust mobilization	2.05	2.8

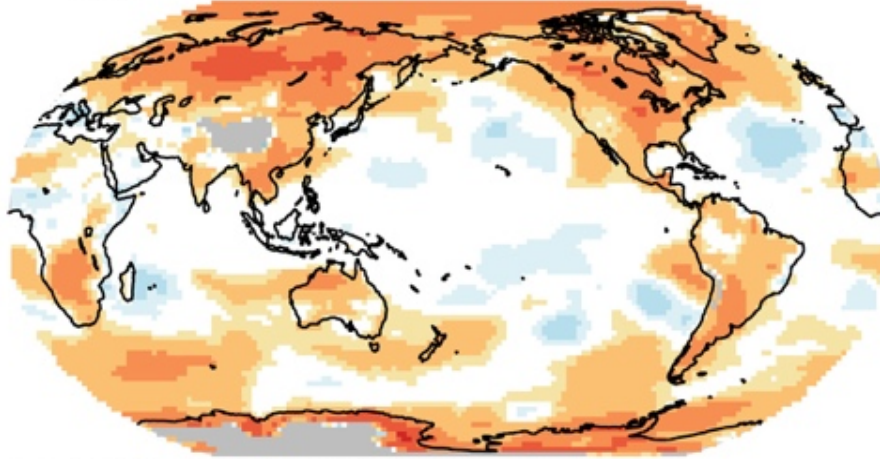
Estimated Inversion Strength

Wood and Bretherton (2006)

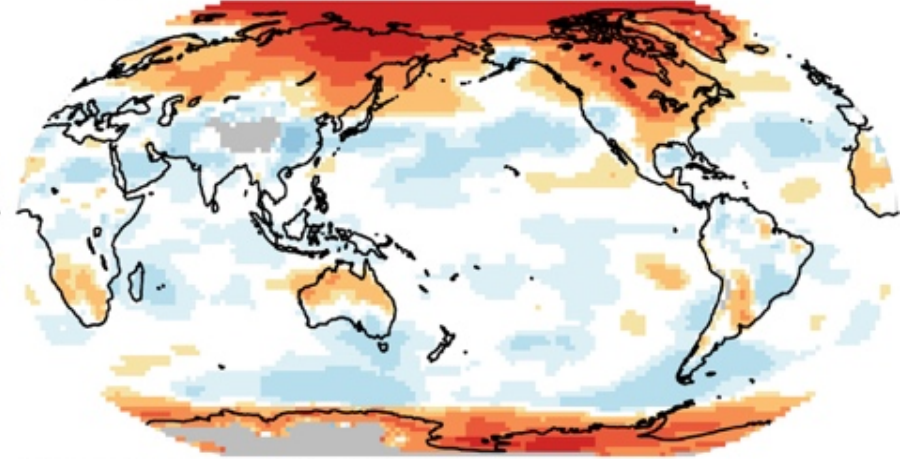
(a) EAMv1 - ERA5 (1996-2005)
avg = -1.63



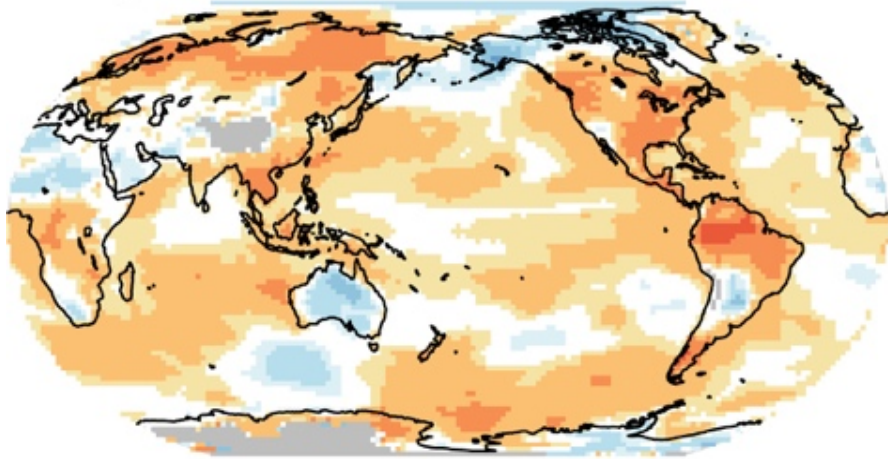
(b) EAMv1_CLUBB - EAMv1
avg = 0.18



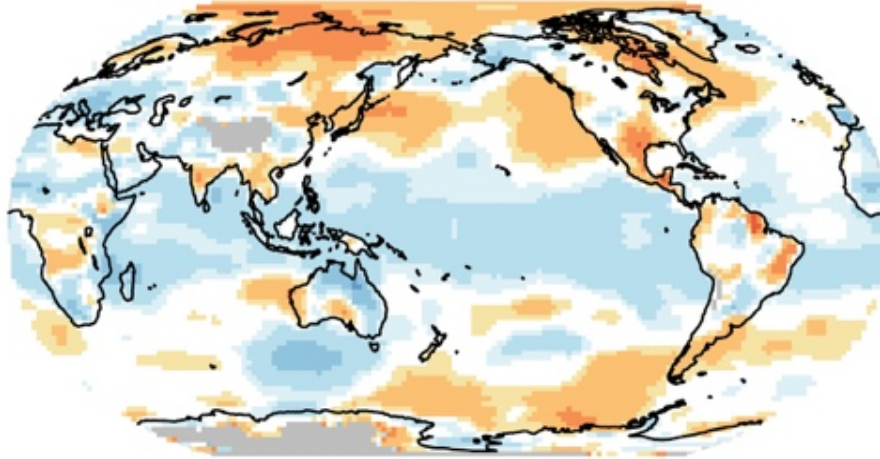
(c) EAMv1_MP - EAMv1
avg = 0.11



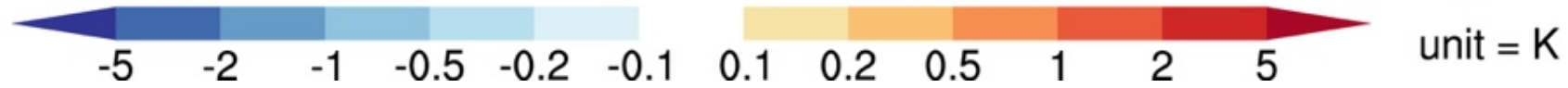
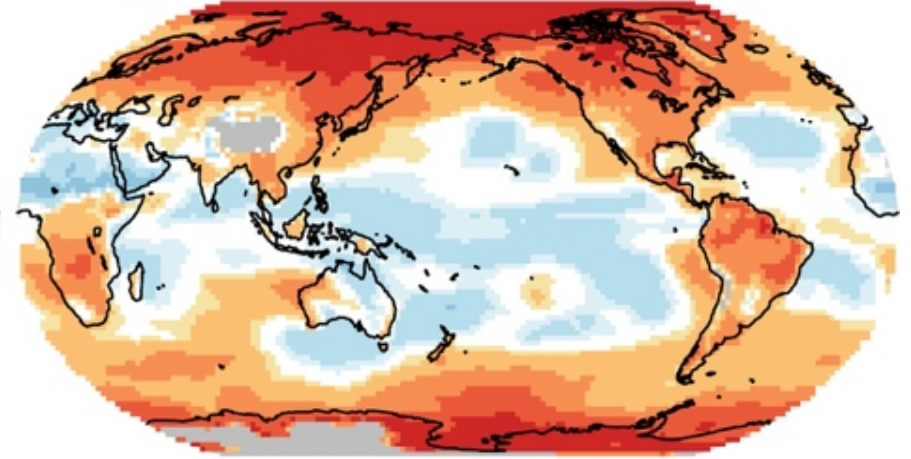
(d) EAMv1_SGV - EAMv1
avg = 0.18



(e) EAMv1_ZM - EAMv1
avg = -0.04



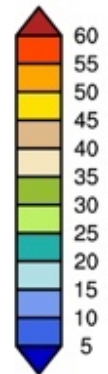
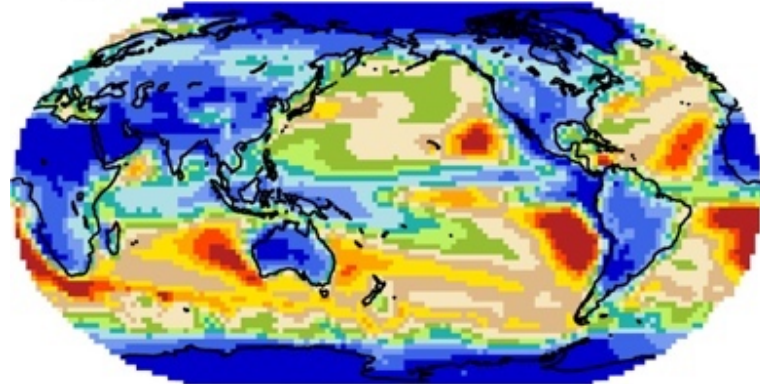
(f) EAMv1P - EAMv1
avg = 0.38



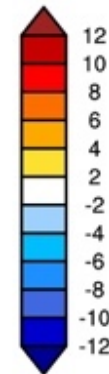
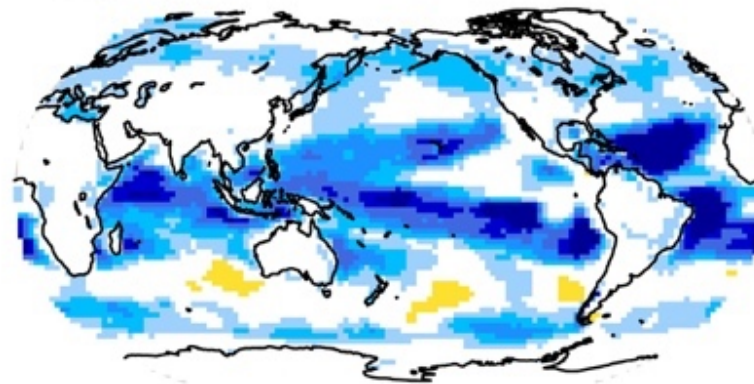
Frequency of decoupled PBL

Jones et al. (2011)

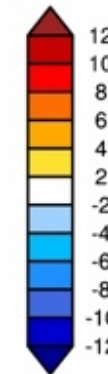
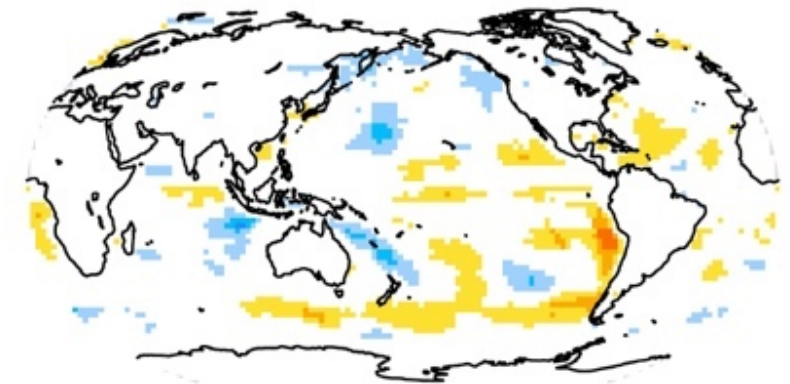
(a) EAMv1
avg = 26.20



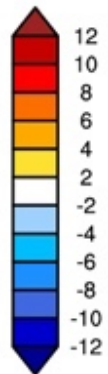
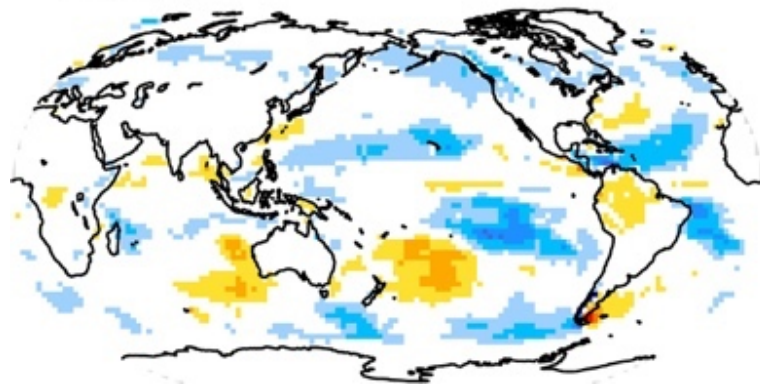
(b) EAMv1_CLUBB - EAMv1
avg = -3.30



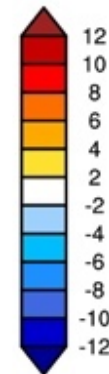
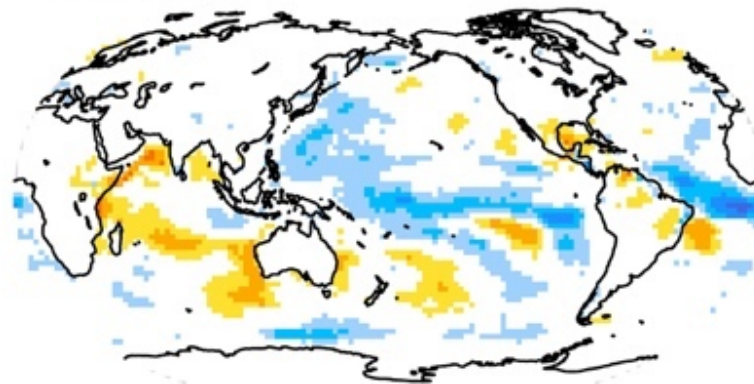
(c) EAMv1_MP - EAMv1
avg = 0.18



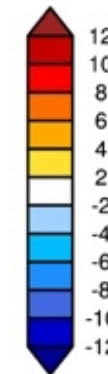
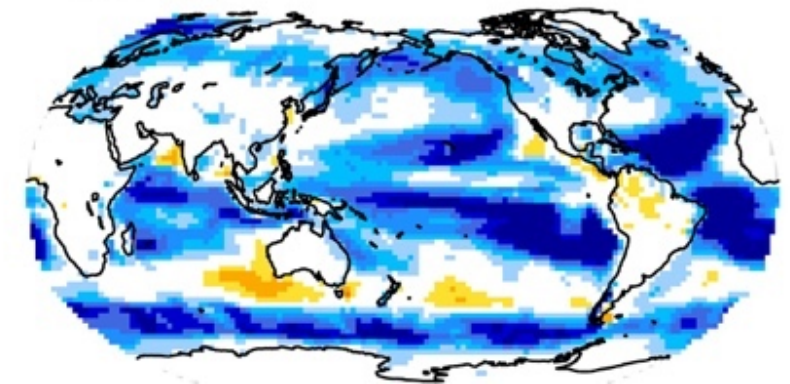
(d) EAMv1_SGV - EAMv1
avg = -0.52



(e) EAMv1_ZM - EAMv1
avg = -0.29



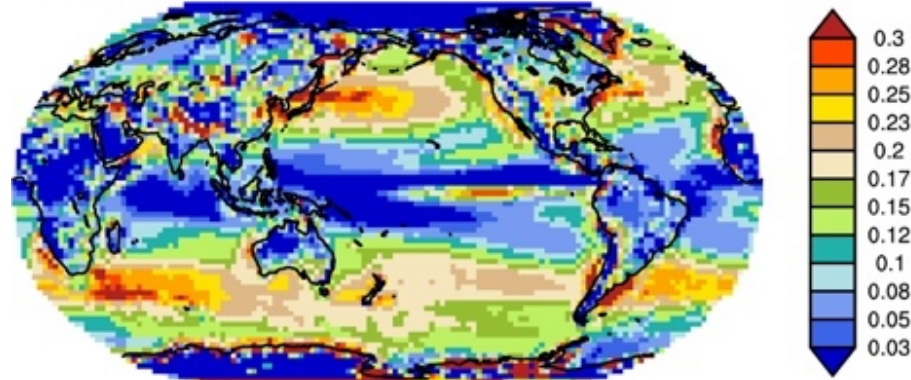
(f) EAMv1P - EAMv1
avg = -4.15



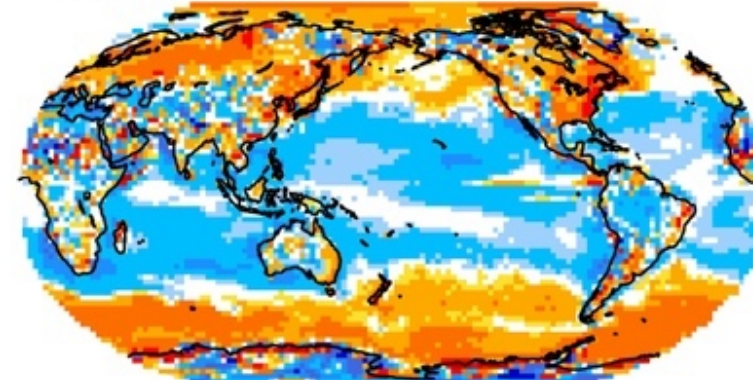
Cloud-top Entrainment Efficiency

Bretherton et al. (2007)

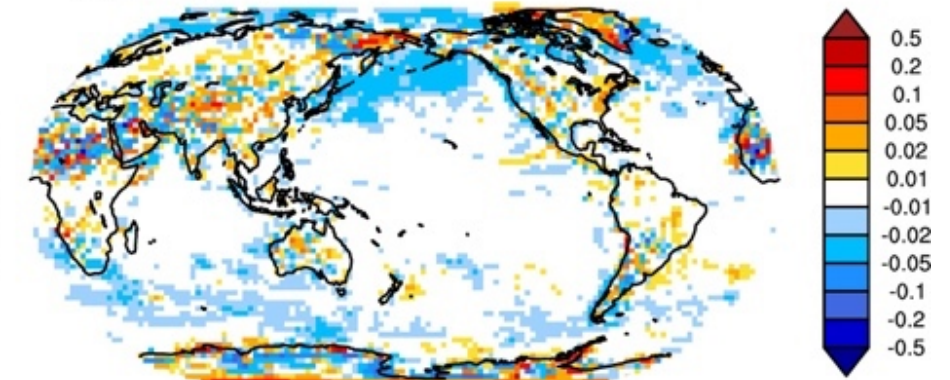
(a) EAMv1
avg = 0.113



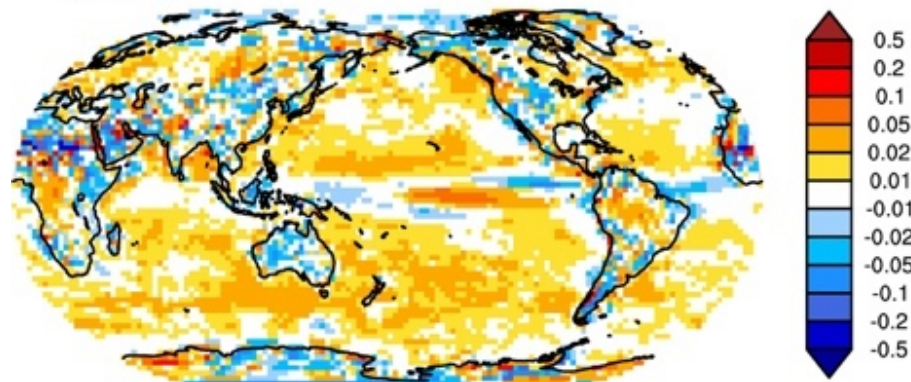
(b) EAMv1_CLUBB - EAMv1
avg = 0.000



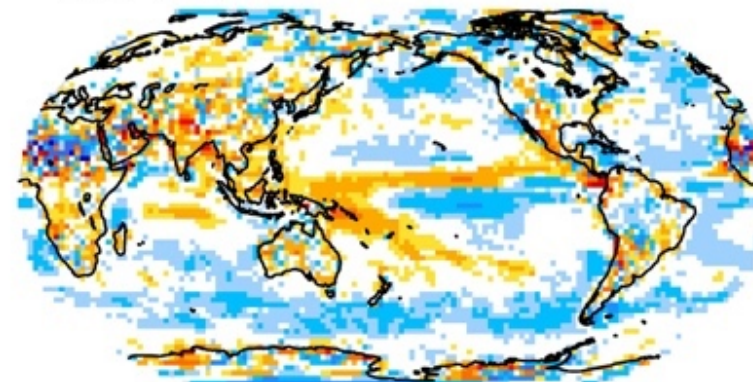
(c) EAMv1_MP - EAMv1
avg = -0.003



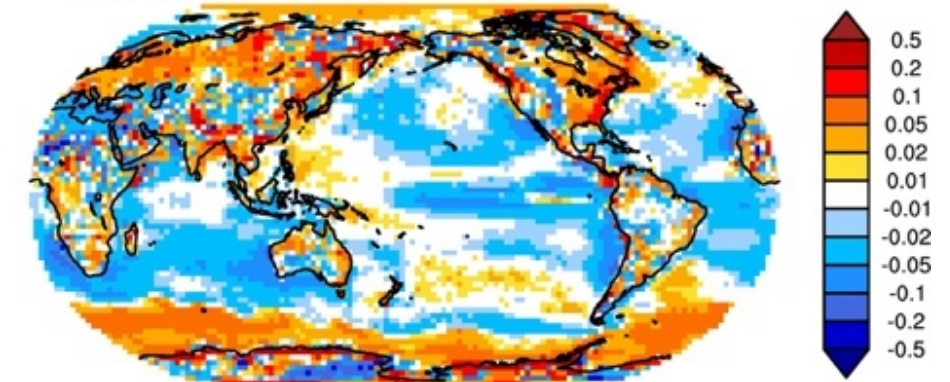
(d) EAMv1_SGV - EAMv1
avg = 0.007



(e) EAMv1_ZM - EAMv1
avg = -0.001



(f) EAMv1P - EAMv1
avg = 0.000



$$A = w_e \Delta b z^i / w_*^3$$

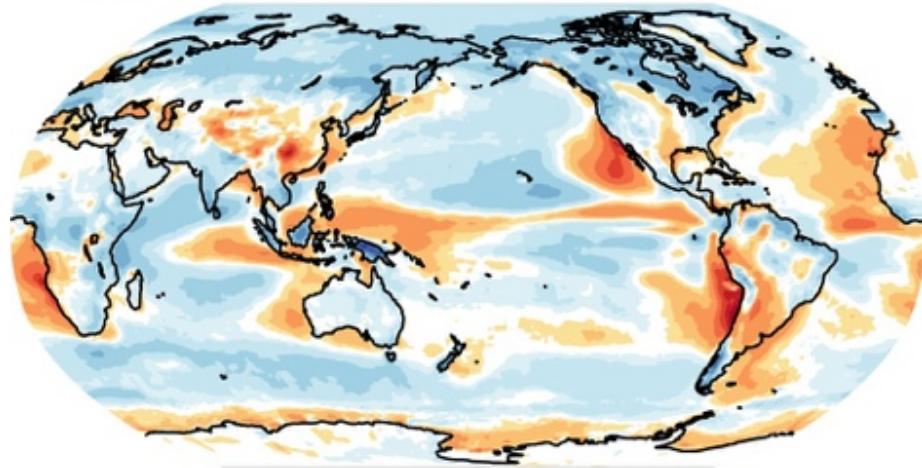
w_e : entrainment rate computed by differencing the resolved vertical motion and change of inversion height (Z_i)

Δb : virtual potential temperature jump scaled into buoyancy jump ($\Delta b = g \frac{\Delta \theta_v}{\theta_{ref}}$); $\theta_{ref} = 300$ K

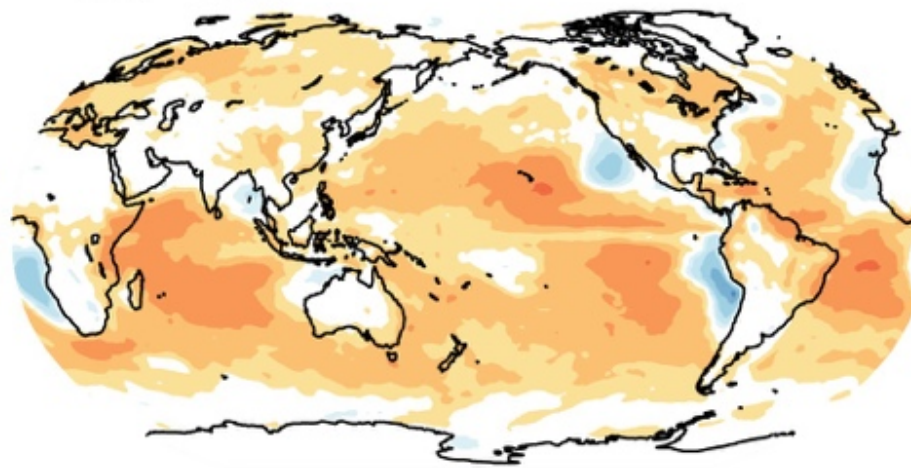
w_* : convective velocity ($w_* = (2.5 \int_0^{Z_i} \overline{w' b'} dz)^{1/3}$) that measures the buoyancy integrated over the boundary layer where b' is the buoyancy perturbation

Shortwave CRE shows significant improvements

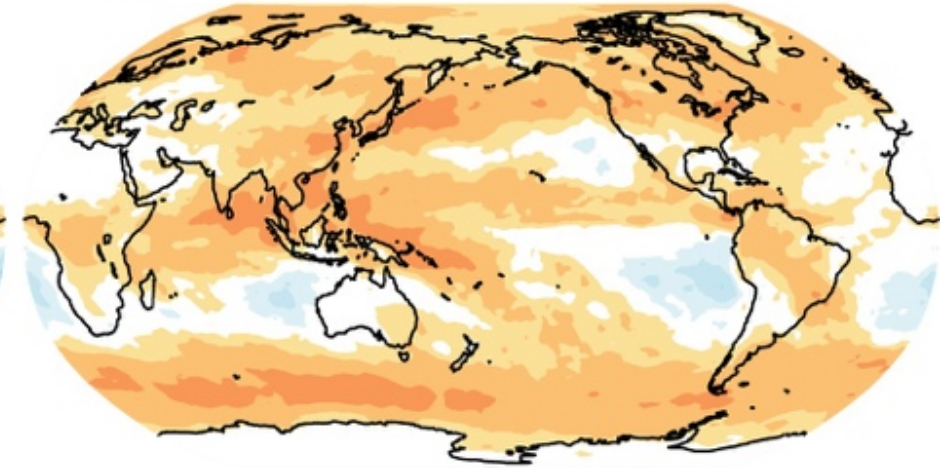
(a) EAMv1 - CERES-EBAF V2.3 (2000-2013)
avg = -2.17



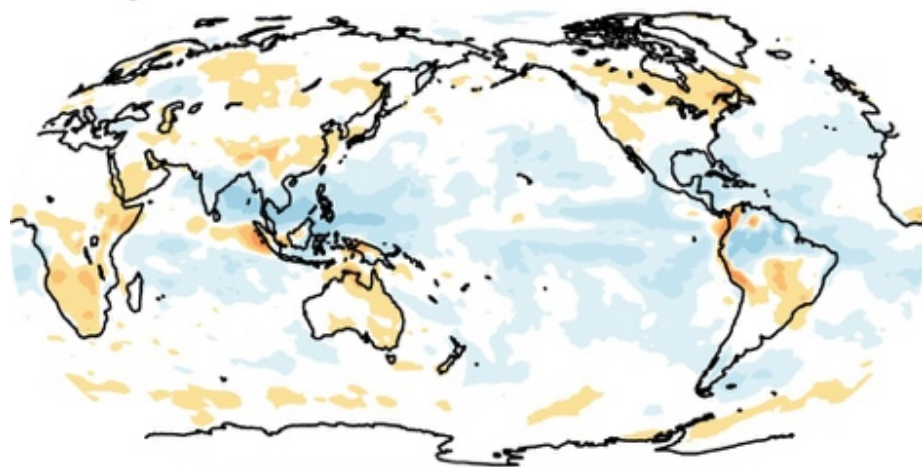
(b) EAMv1_CLUBB - EAMv1
avg = 3.94



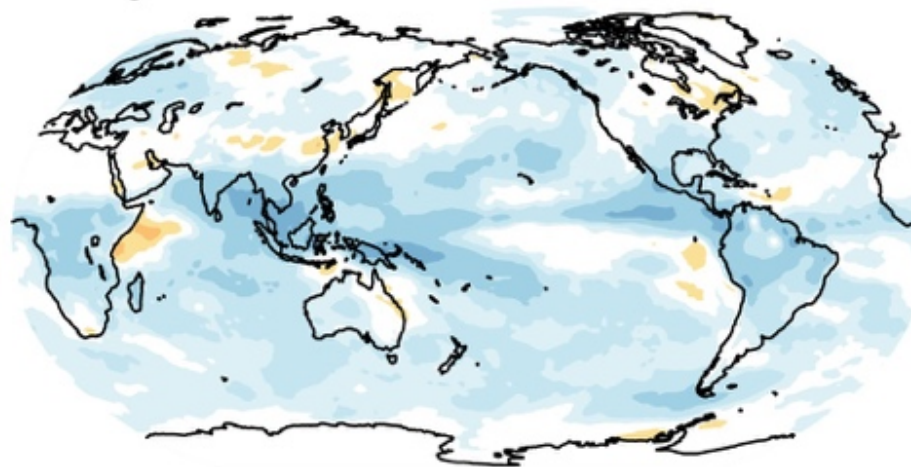
(c) EAMv1_MP - EAMv1
avg = 4.20



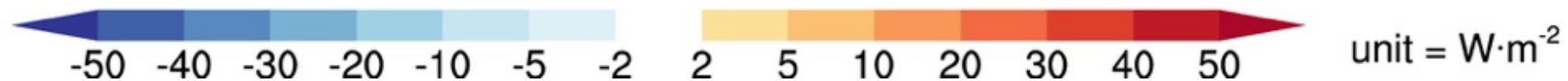
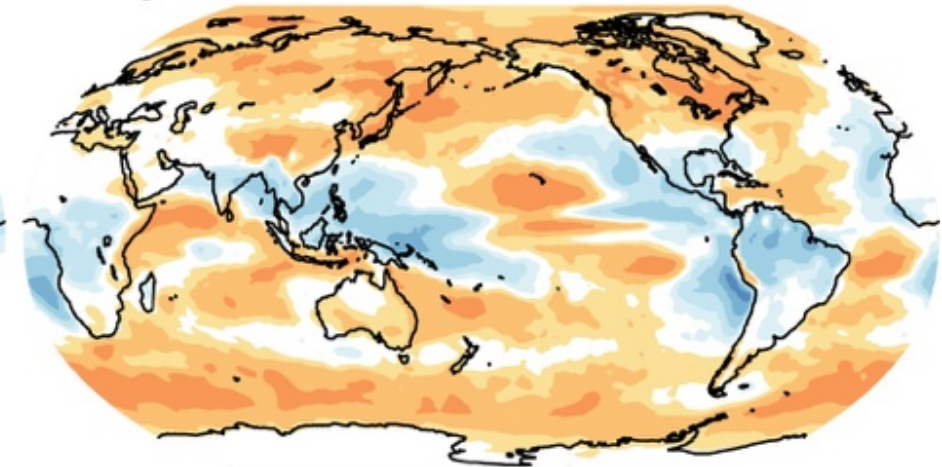
(d) EAMv1_SGV - EAMv1
avg = -0.98



(e) EAMv1_ZM - EAMv1
avg = -4.84

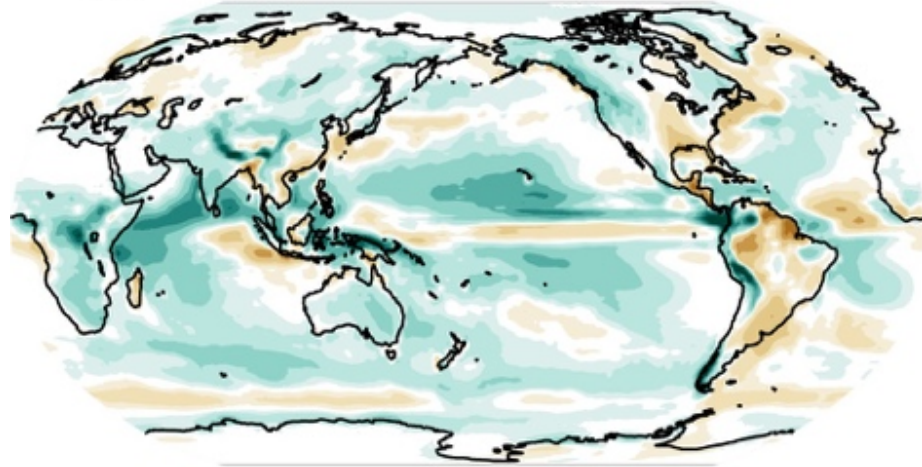


(f) EAMv1P - EAMv1
avg = 2.04

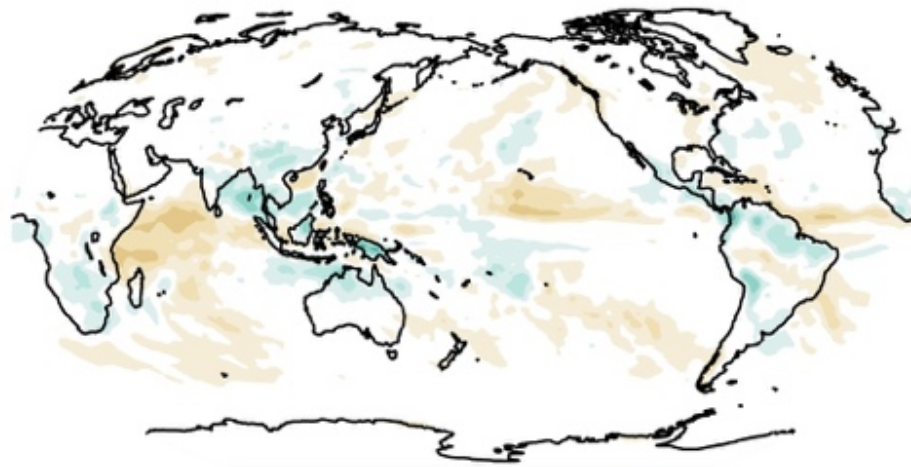


Precipitation improvements (associated with circulation improvements)

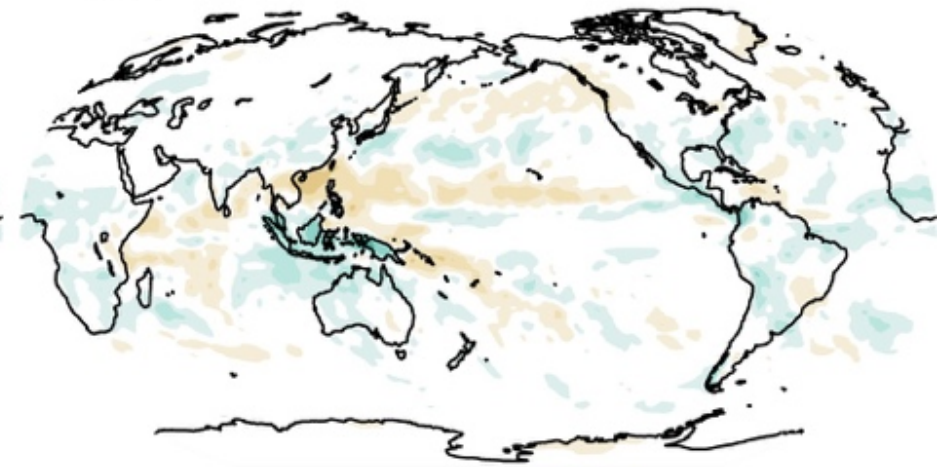
(a) EAMv1 - GPCP V2.1 (1979-2009)
avg = 0.40



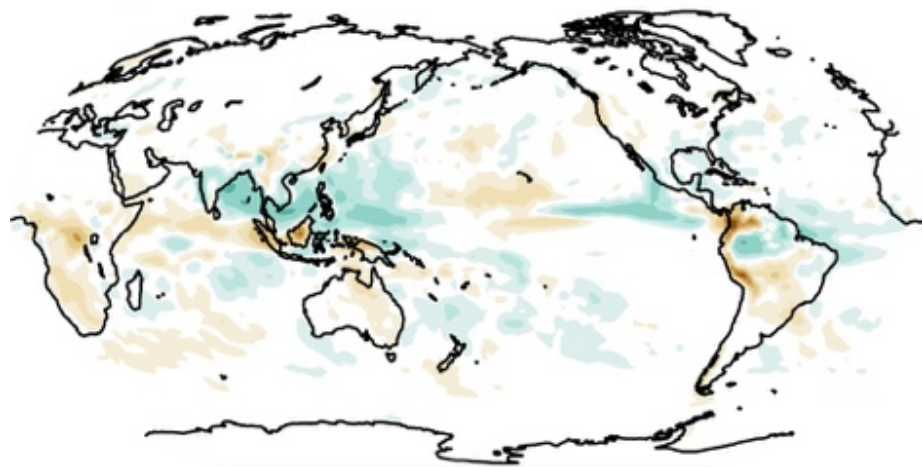
(b) EAMv1_CLUBB - EAMv1
avg = -0.05



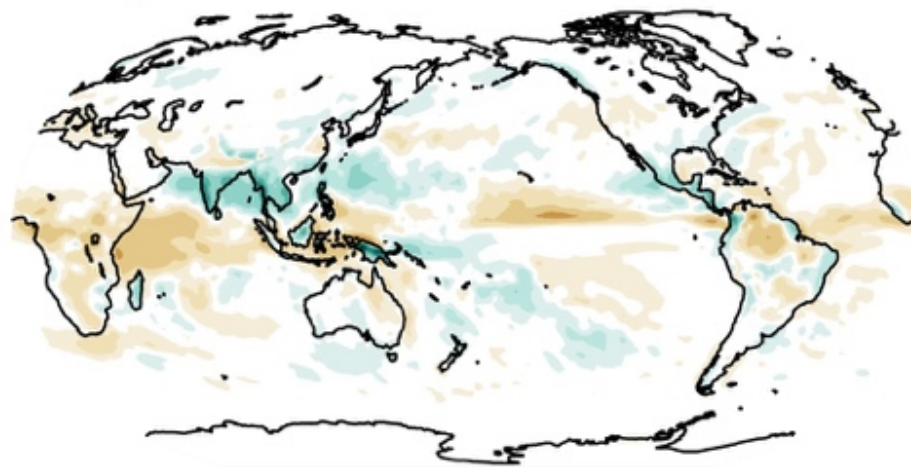
(c) EAMv1_MP - EAMv1
avg = 0.03



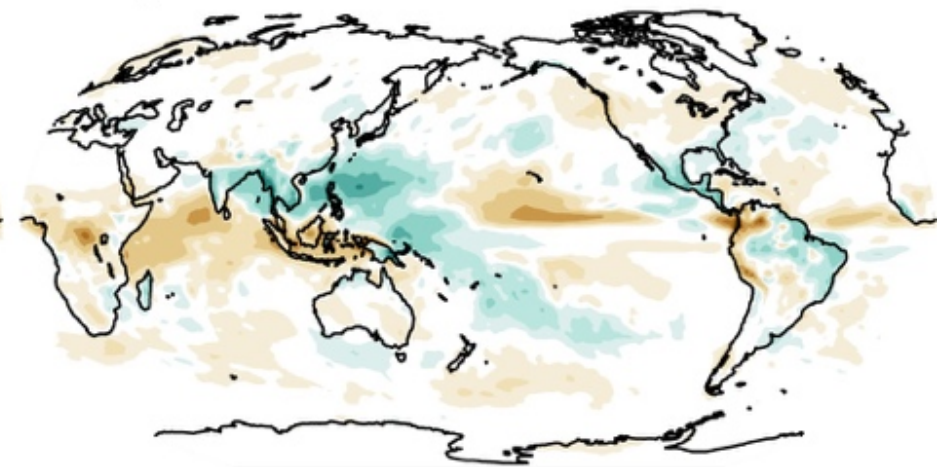
(d) EAMv1_SGV - EAMv1
avg = 0.02



(e) EAMv1_ZM - EAMv1
avg = -0.05



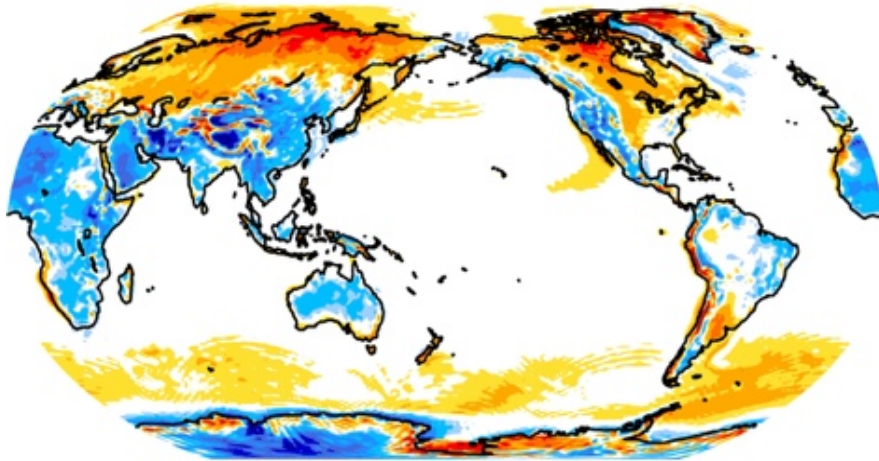
(f) EAMv1P - EAMv1
avg = -0.06



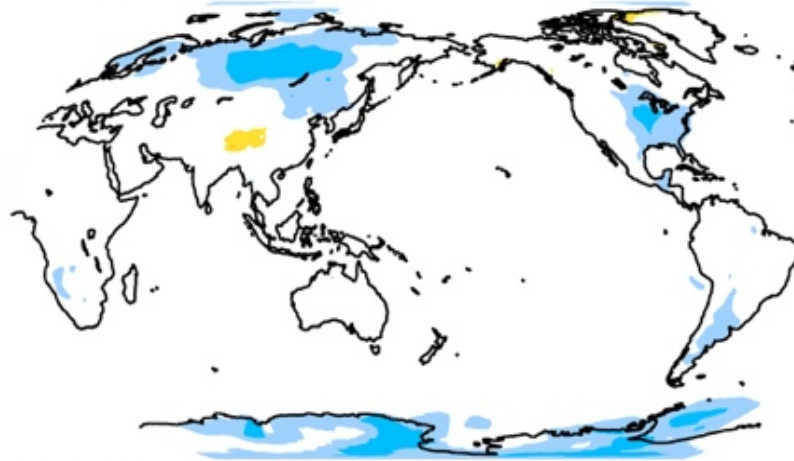
unit = mm·day⁻¹

Surface temperature

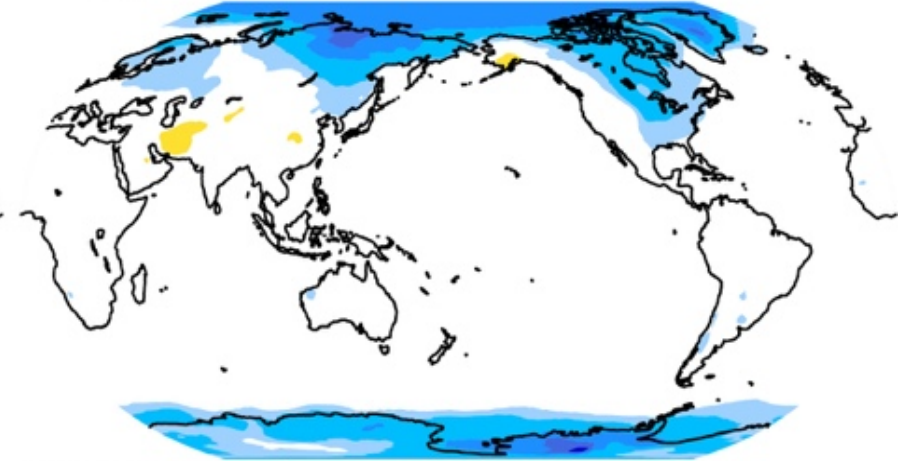
(a) EAMv1 - ERA5 (1996-2005)
avg = 0.048



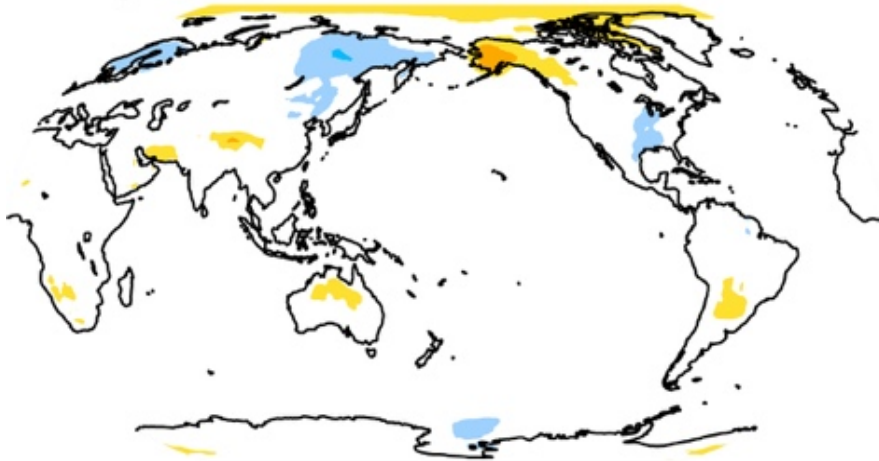
(b) EAMv1_CLUBB - EAMv1
avg = -0.151



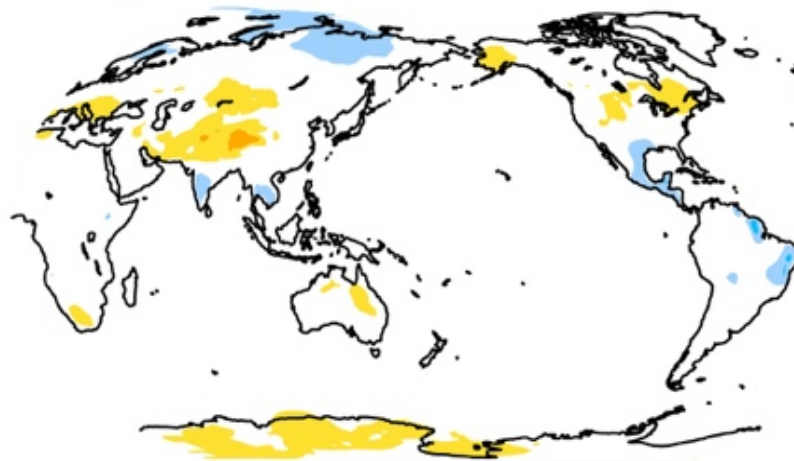
(c) EAMv1_MP - EAMv1
avg = -0.238



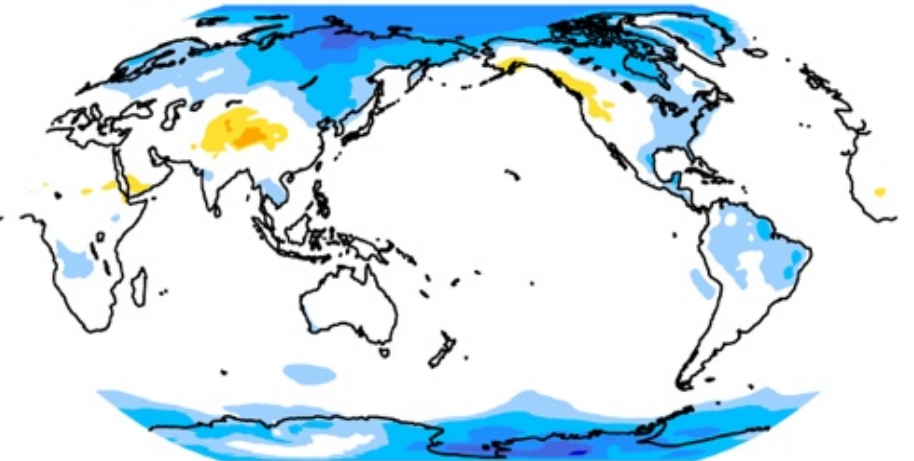
(d) EAMv1_SGV - EAMv1
avg = 0.010



(e) EAMv1_ZM - EAMv1
avg = 0.037

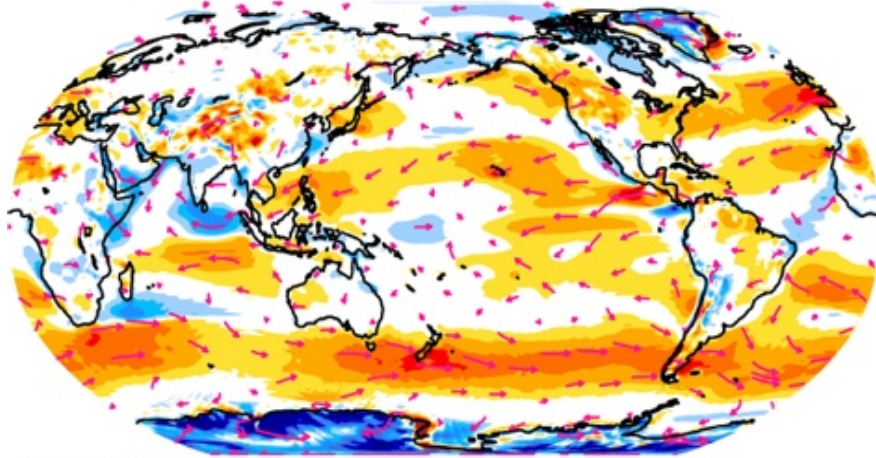


(f) EAMv1P - EAMv1
avg = -0.298

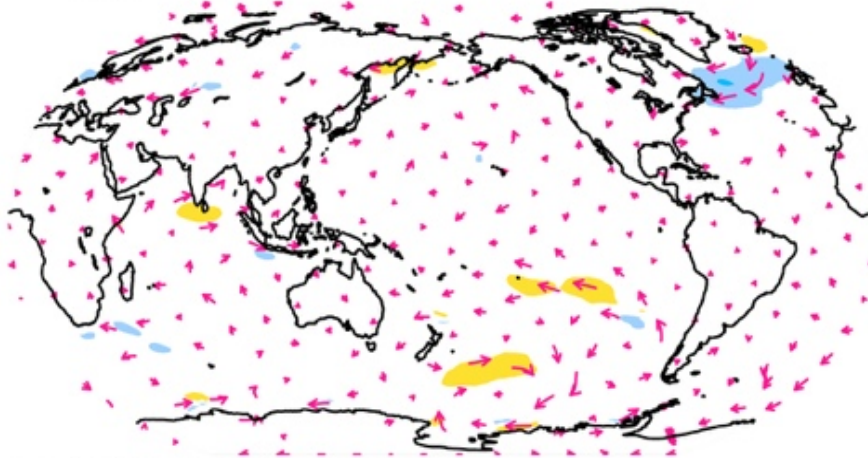


Surface wind

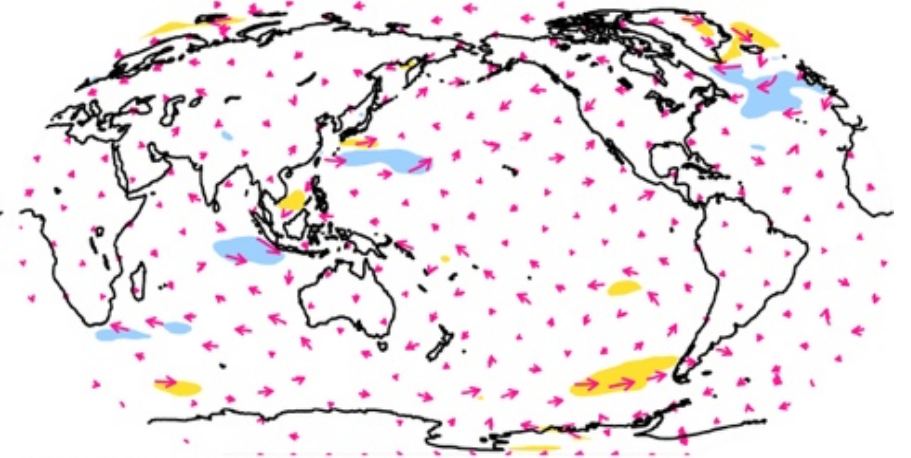
(a) EAMv1 - MERRA-2 (1996-2005)
avg = 0.326



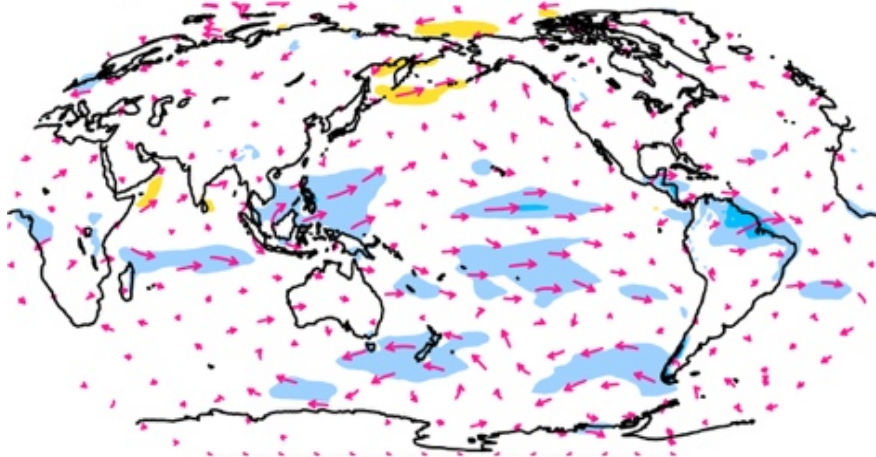
(b) EAMv1_CLUBB - EAMv1
avg = 0.001



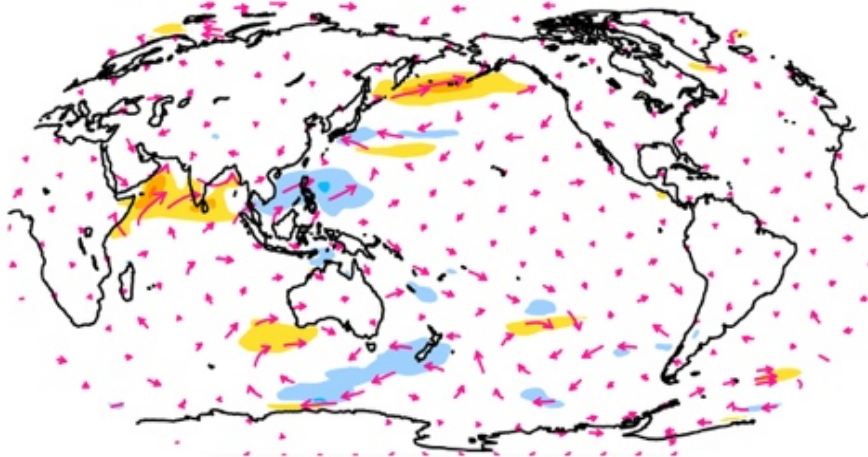
(c) EAMv1_MP - EAMv1
avg = -0.007



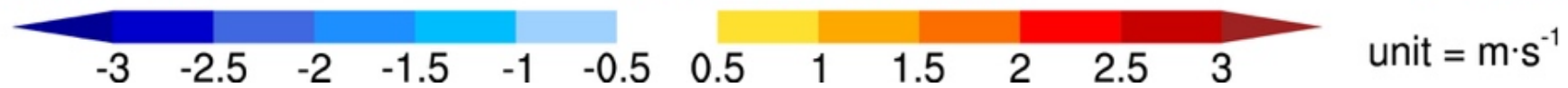
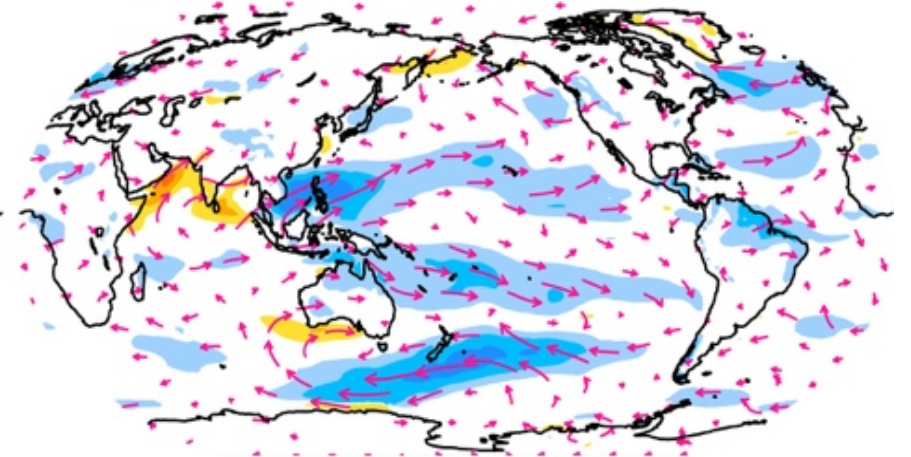
(d) EAMv1_SGV - EAMv1
avg = -0.191



(e) EAMv1_ZM - EAMv1
avg = -0.020

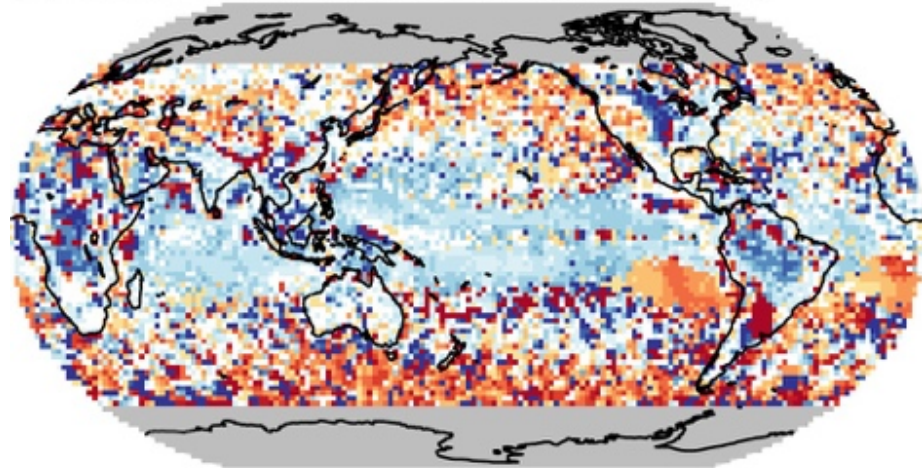


(f) EAMv1P - EAMv1
avg = -0.286

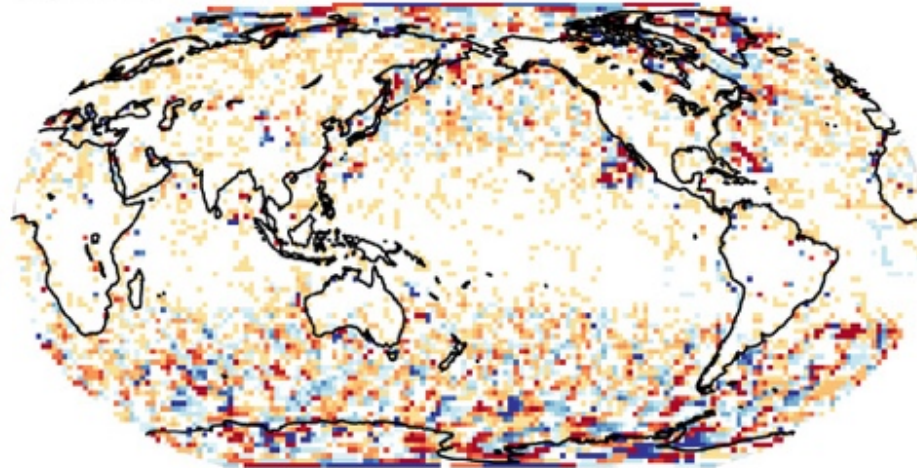


Precipitation timing

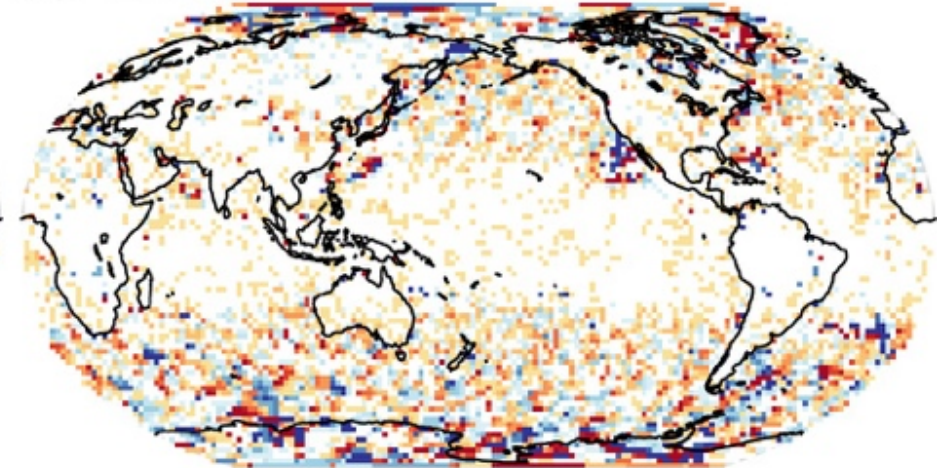
(a) EAMv1 - CMORPH V1.0 (1999-2008)



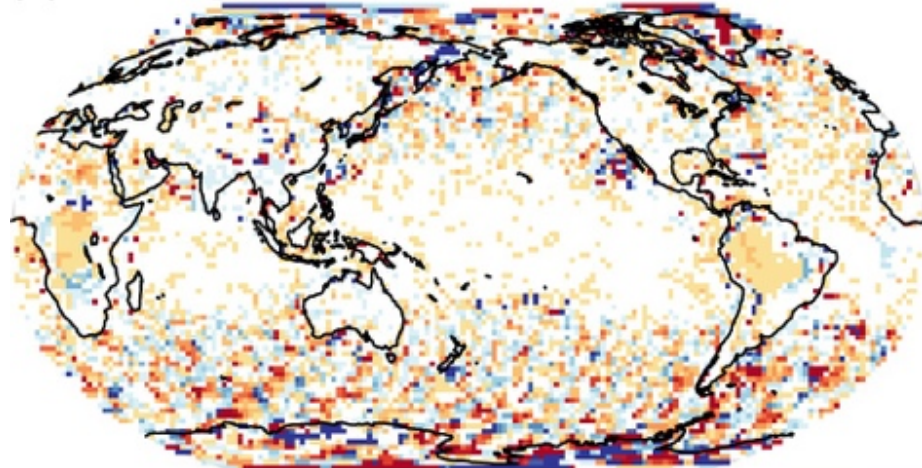
(b) EAMv1_CLUBB - EAMv1



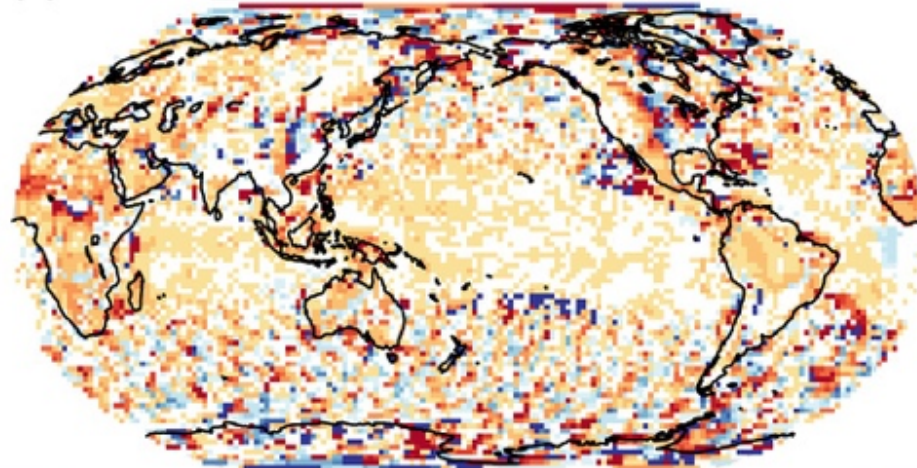
(c) EAMv1_MP - EAMv1



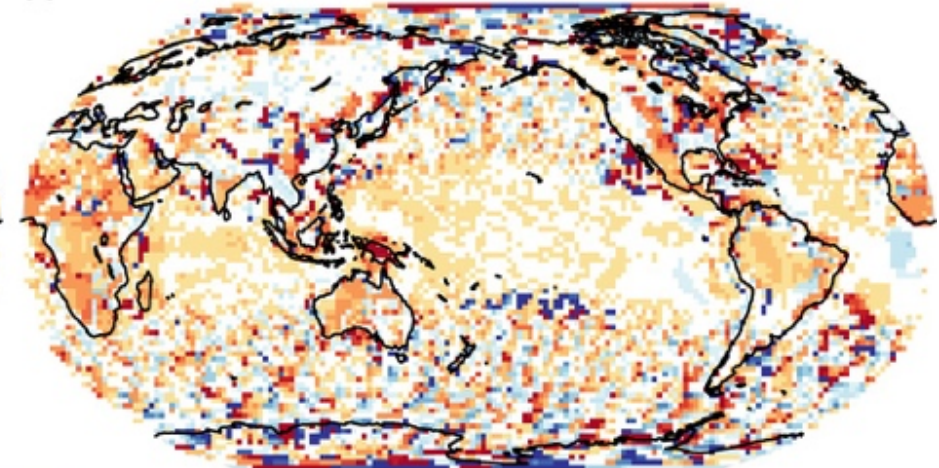
(d) EAMv1_SGV - EAMv1



(e) EAMv1_ZM - EAMv1

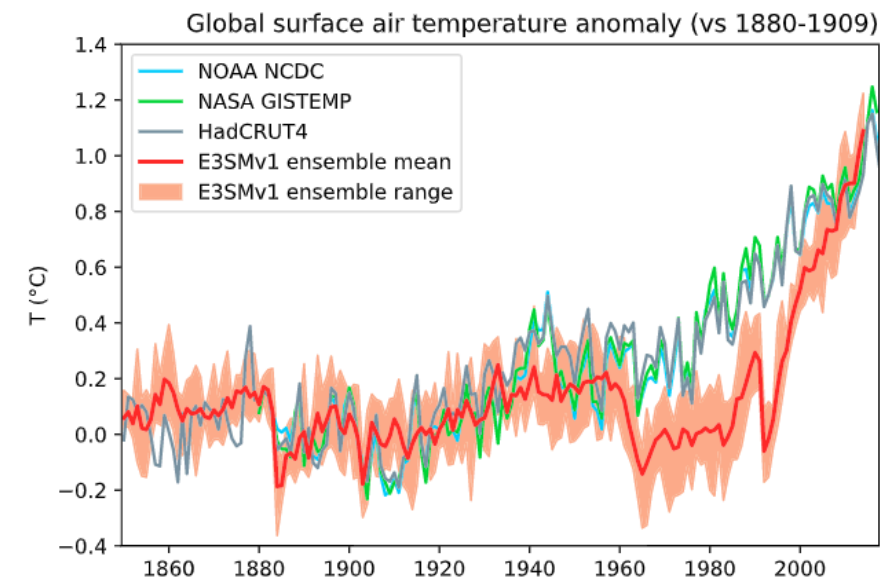
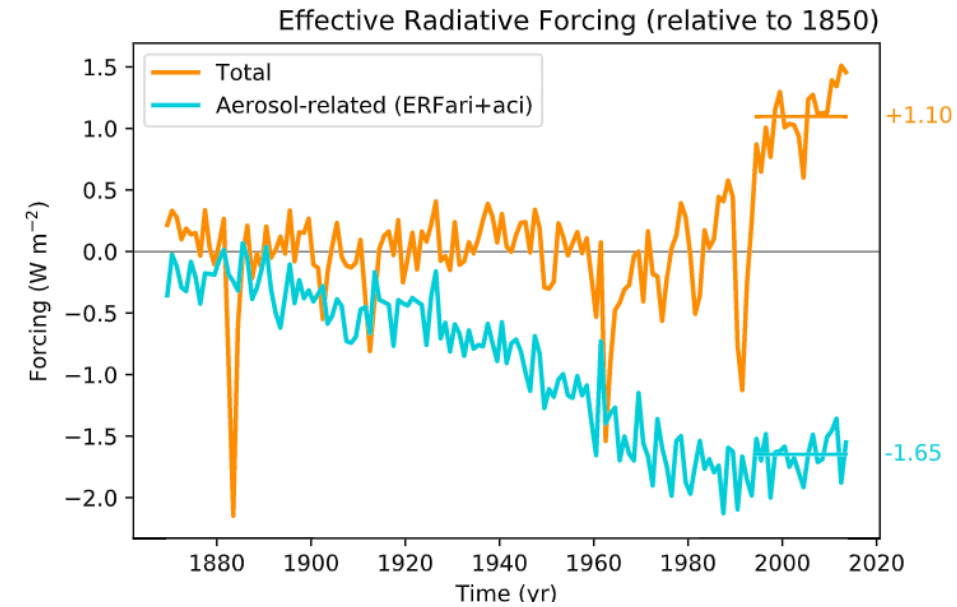
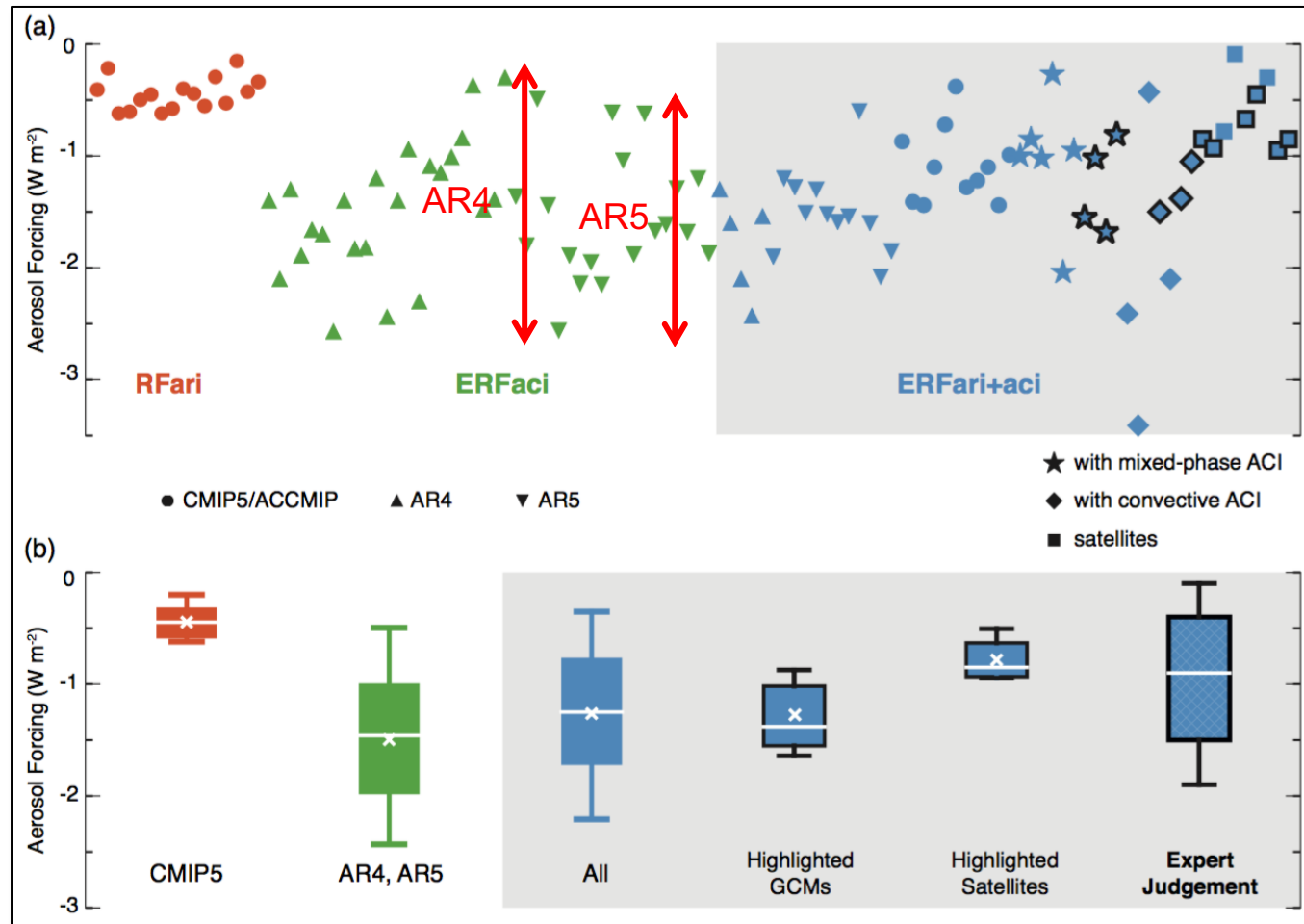


(f) EAMv1P - EAMv1



Role of aerosols in Earth's energy budget is a major source of uncertainty for earth system models and a significant issue for E3SMv1

IPCC AR5



Golaz et al., 2019

Convective Mixing (S+D)

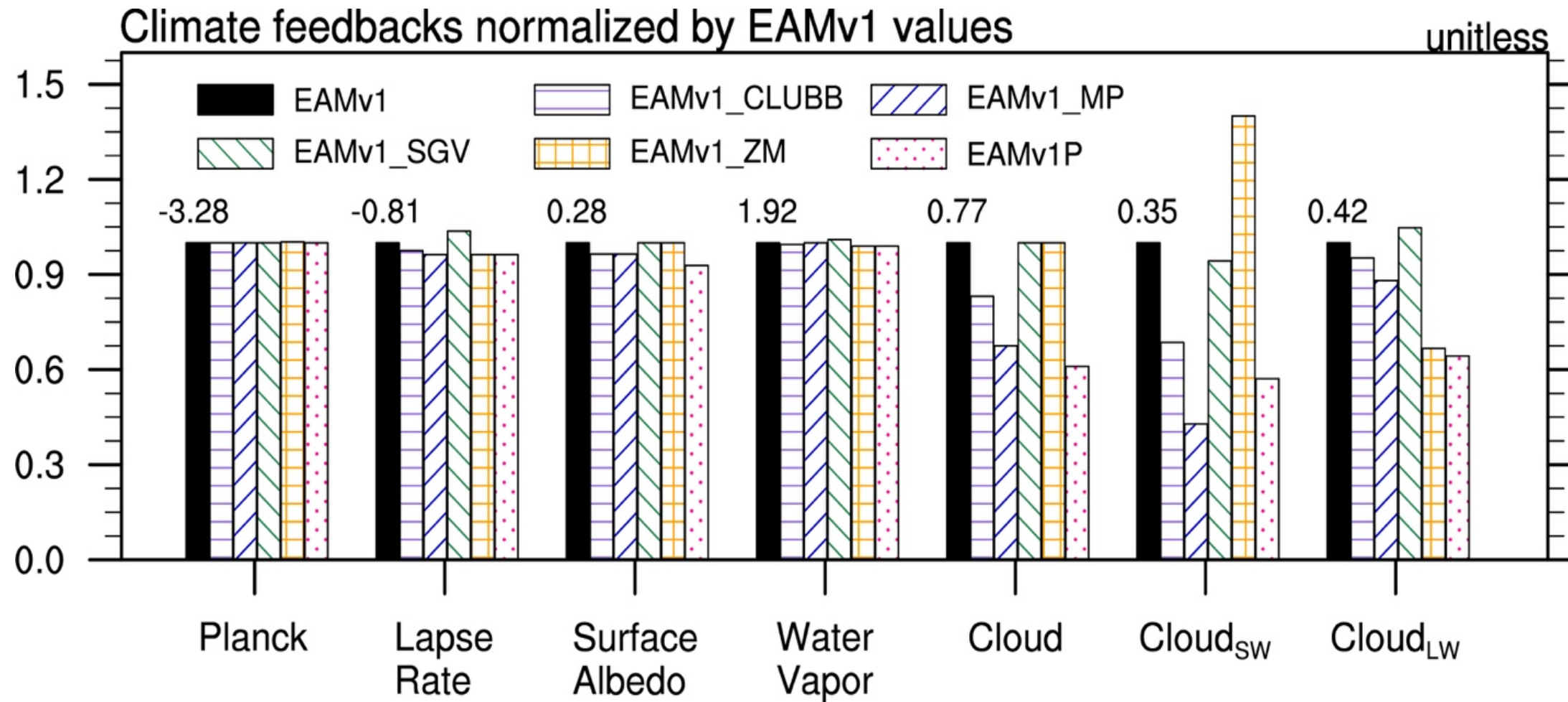
Sherwood et al. (2014)

	EAMv1	EAMv1_CLUBB	EAMv1_MP	EAMv1_SGV	EAMv1_ZM	EAMv1P
S	0.40	0.40	0.41	0.41	0.38	0.38
D	0.21	0.21	0.20	0.20	0.19	0.17
LTMI (S+D)	0.61	0.61	0.61	0.61	0.57	0.55

Aerosol effects on CREs

	EAMv1	EAMv1_CLUBB	EAMv1_MP	EAMv1_SGV	EAMv1_ZM	EAMv1P
RFaci,sw	-1.53	-1.63	-0.95	-1.63	-1.62	-0.91
RFaci,lw	0.52	0.56	0.22	0.56	0.42	0.06
RFaci	-1.01	-1.07	-0.73	-1.07	-1.20	-0.85

Feedback decomposition



Summary

- This study develops a new model configuration with improved fidelity using a model calibration strategy that focuses on clouds.
- Governed by understanding of the physical mechanisms, the recalibration significantly improves the simulated clouds and precipitation, reducing common and longstanding biases across cloud regimes.
- With improved clouds, the atmosphere manifests itself to reduce biases in many aspects and shows minimal or no degradation in other aspects.
- Cloud and precipitation responses to aerosol and surface temperature perturbations are significantly weaker in the recalibrated model.
- This is a sensitivity study.