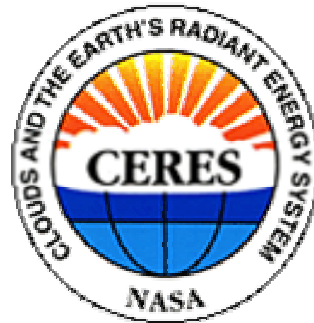


TOA Radiative Flux Estimation From CERES Angular Distribution Models

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Hampton, VA



Contributors: K. Loukachine, S. Kato, N. M. Smith, Arvind Gambheer

May 6, 2003

TOA Flux Group Activities

Sept 2002 – May 2003

ADM Publications:

- i) ADM paper (Part I) describing CERES/TRMM SW, LW & WN ADMs (*J. Appl. Meteor.*, 42, 240-265, 2003).
- ii) Part II summarizing TRMM ADM validation results (accepted with minor revisions).
- iii) Paper on use of neural networks for TOA flux estimation - (Konstantin Loukachine; accepted with minor revisions).
- iv) Paper comparing theoretical and empirical retrievals of TOA albedo from ice clouds using POLDER data (Wenbo Sun; in preparation).

May 2003 – Sept 2003

Development and validation of Terra ADMs based on 2 years of CERES/Terra RAP measurements.

Terra ADM Development

- ❑ Terra ADMs will be based on 2 years of CERES measurements.
- ❑ Increase angular resolution of ADMs (goal: 2° or 5°).
- ❑ Increase the number of scene types.
- ❑ Testing new 1°-resolution clear land+desert ADMs.
- ❑ New Snow and sea-ice ADMs.
- ❑ Use of “continuous” LW ADM scene types.
- ❑ Neural network scheme to improve TOA flux estimates for footprints with excessive “no retrievals”.
- ❑ Validation: Extend alongtrack instantaneous TOA flux consistency tests.

Terra SW ADMs – Clear Ocean

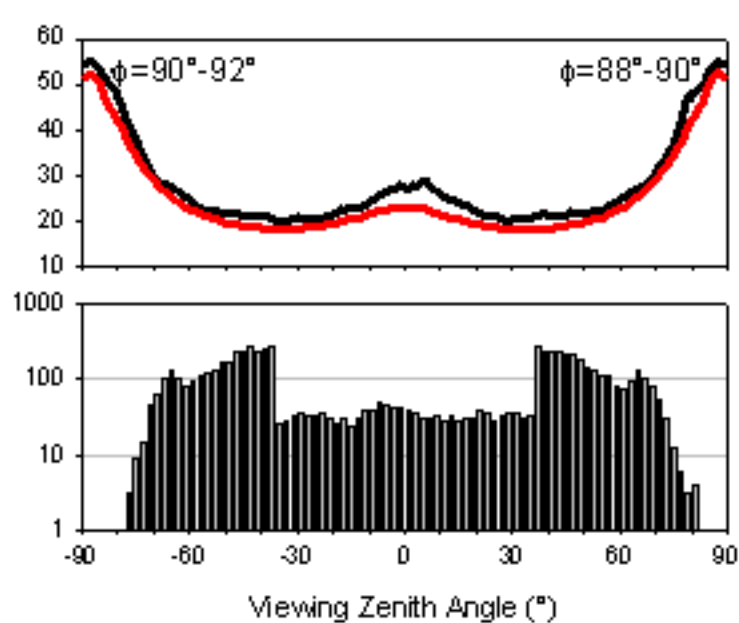
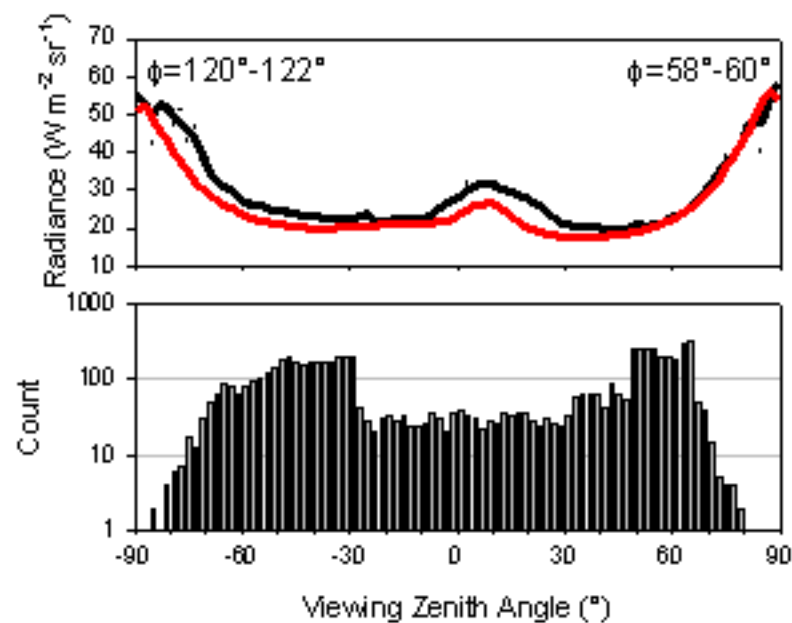
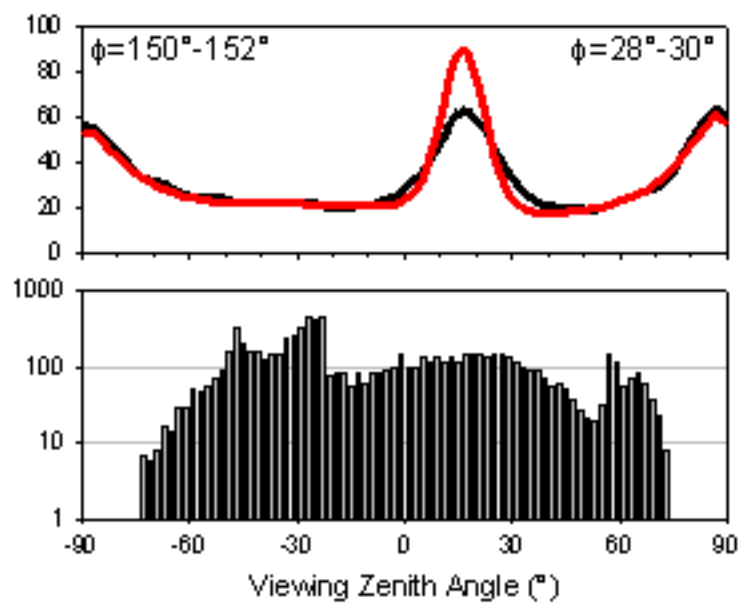
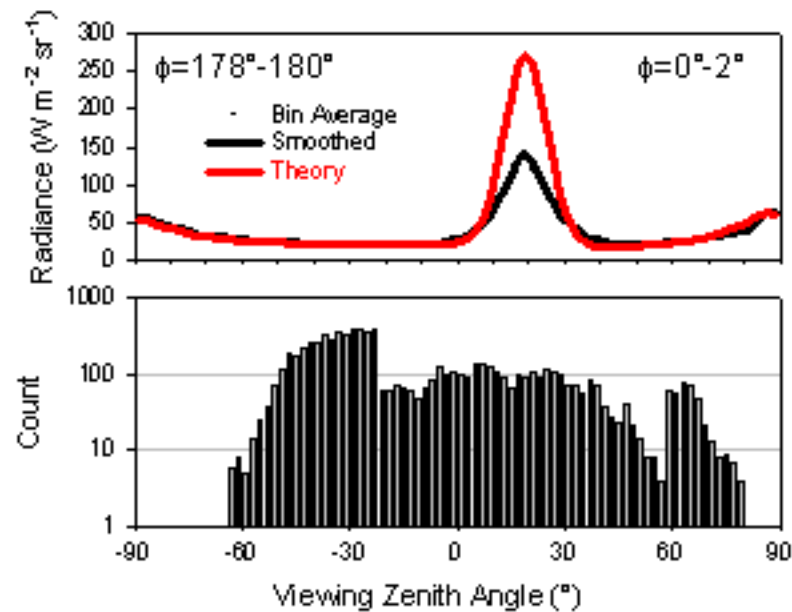
Terra SW ADMs – Clear Scenes

Clear Ocean:

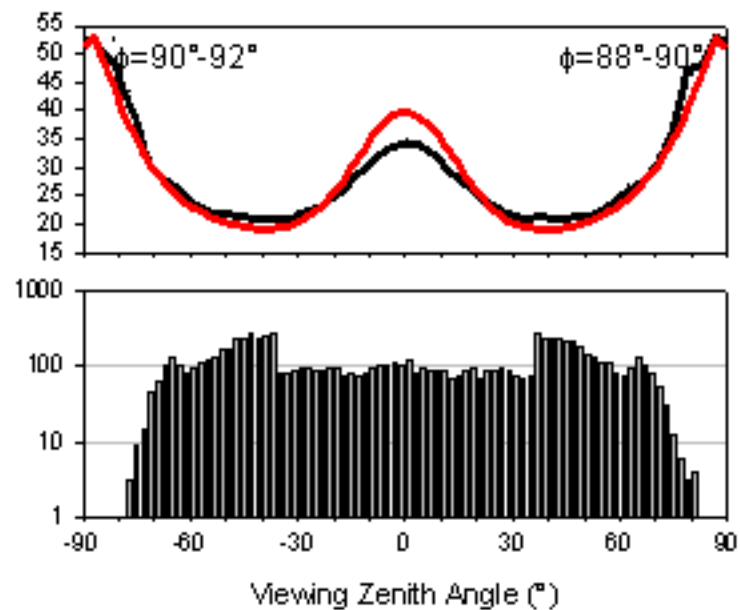
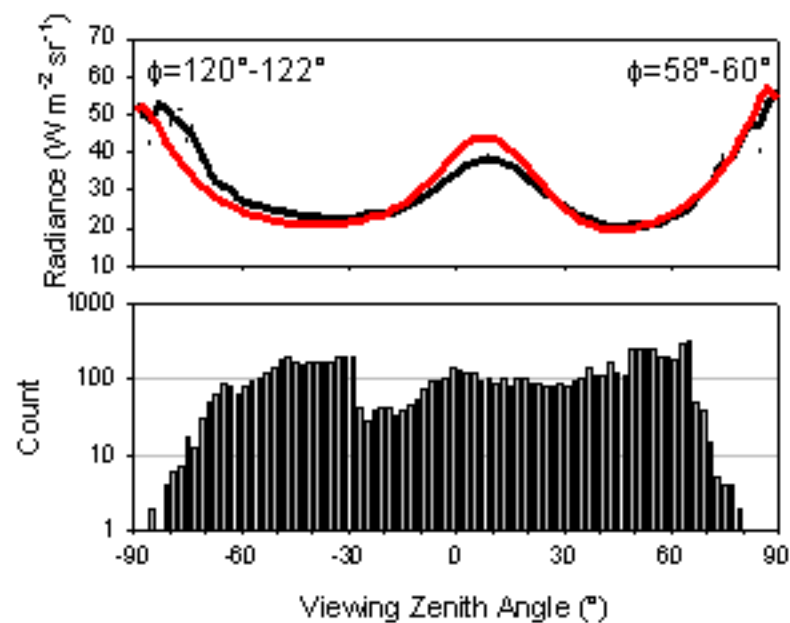
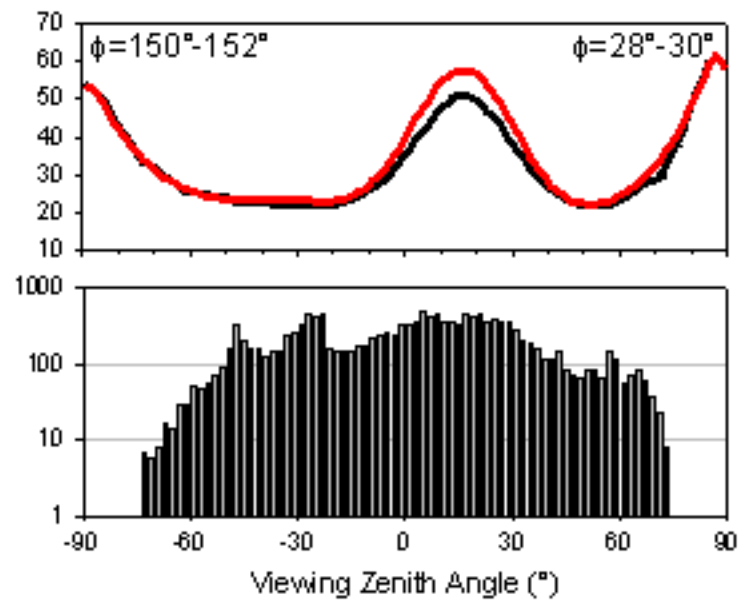
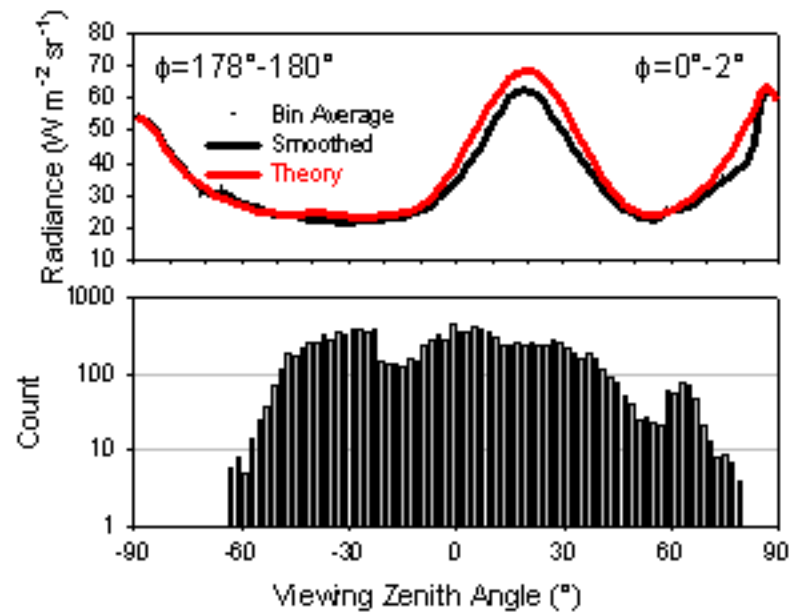
Similar approach as for CERES/TRMM but with 2° angular bin resolution. Wind speed dependent empirical ADMs + theoretical correction for aerosol optical depth variations.

- * 6 bins of wind speed (0-12 m s⁻¹ in steps of 2 m s⁻¹)
- * 45 solar zenith angle bins (0-90 deg in steps of 2 deg)
- * 45 viewing zenith angle bins (0-90 deg in steps of 2 deg)
- * 90 relative azimuth angle bins (0-180 deg in steps of 2 deg)

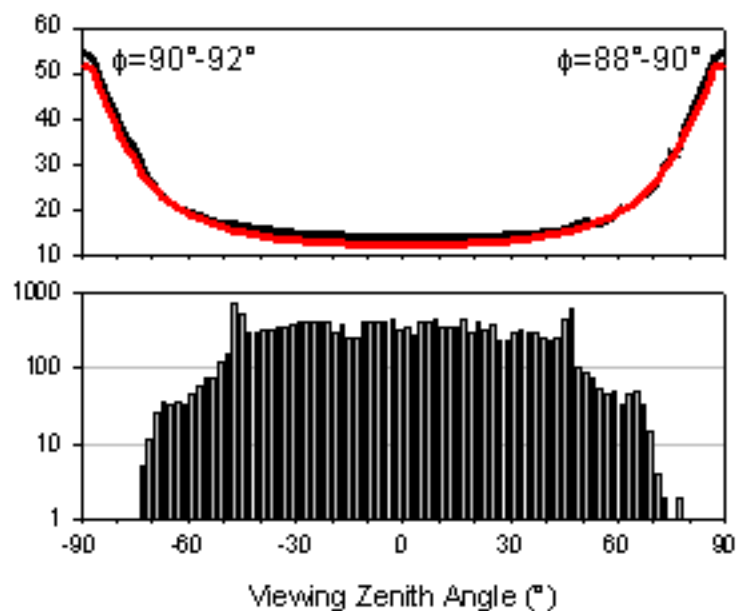
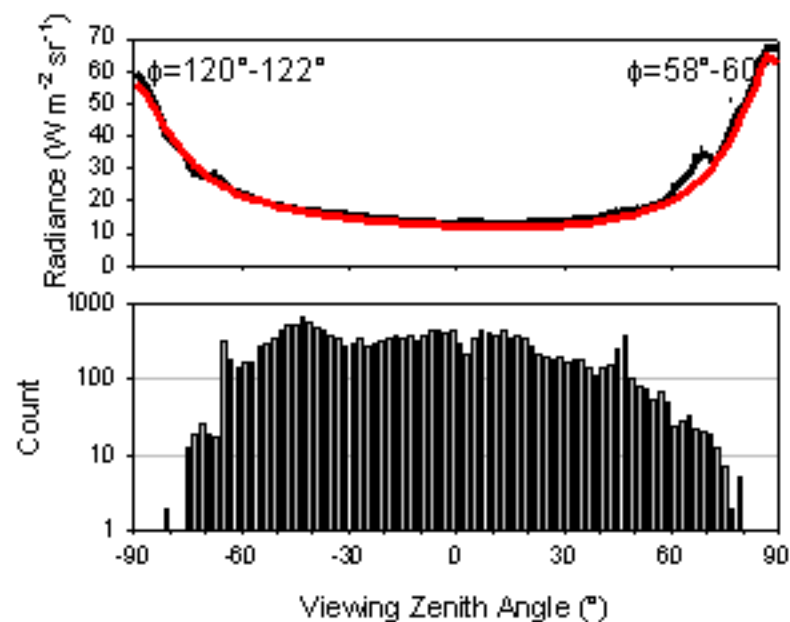
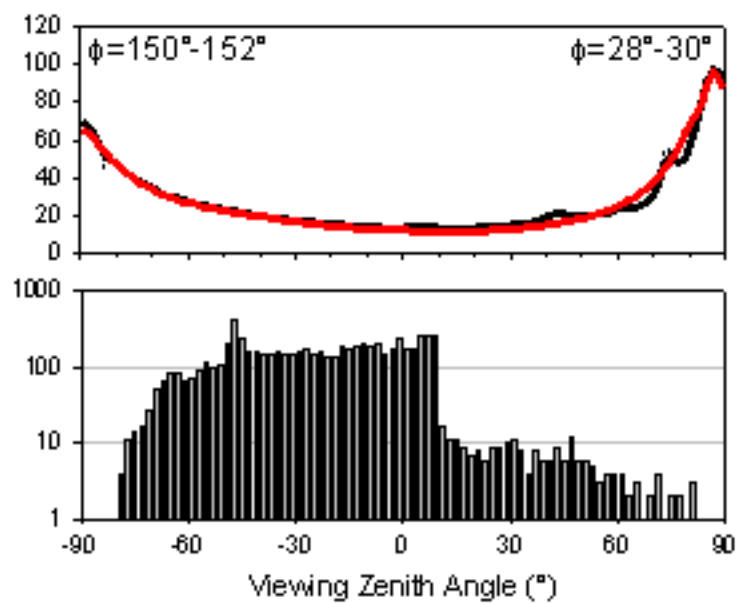
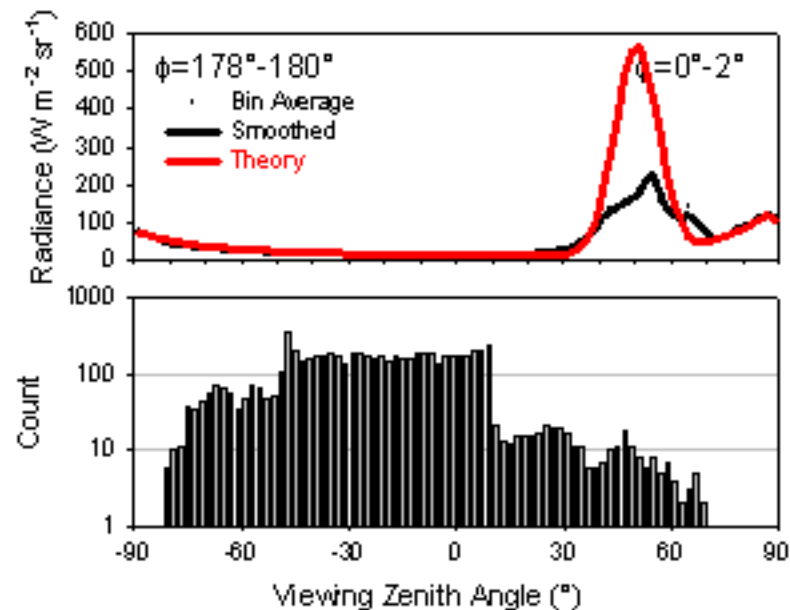
Clear Ocean ($ws=0 - 2 \text{ m s}^{-1}$; $\theta_o=18^\circ-20^\circ$)



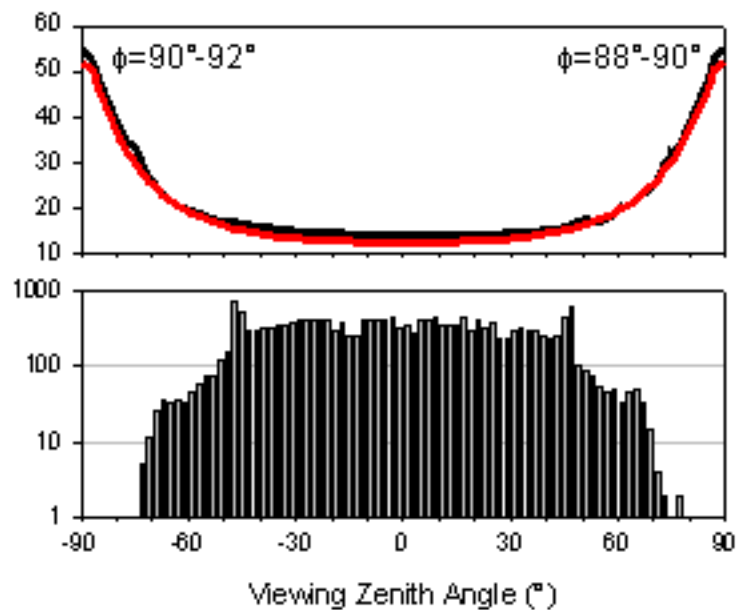
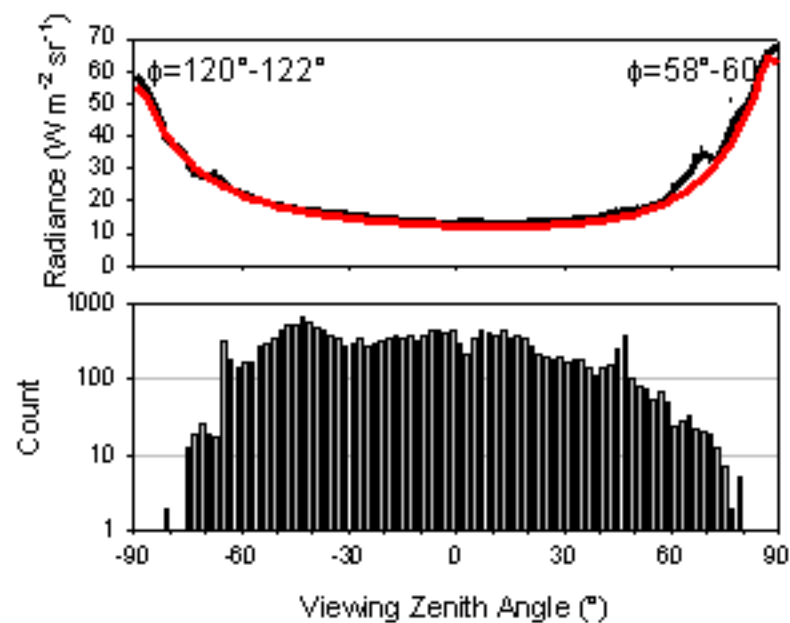
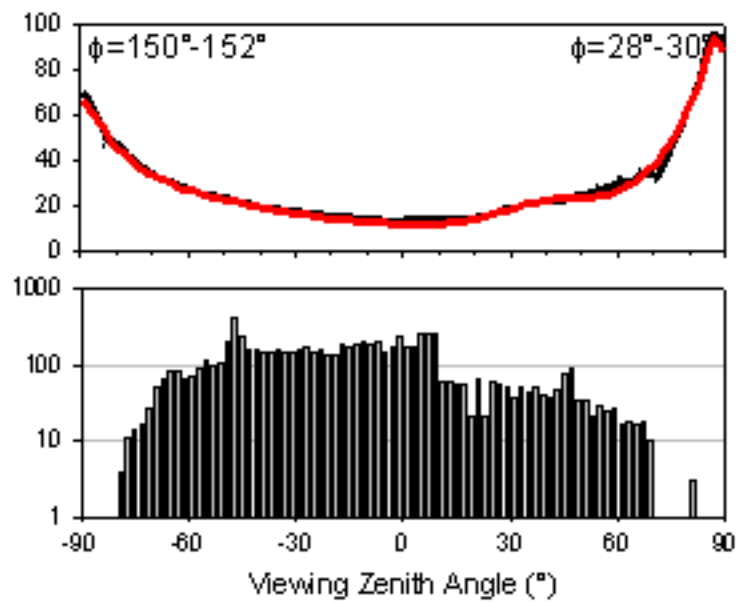
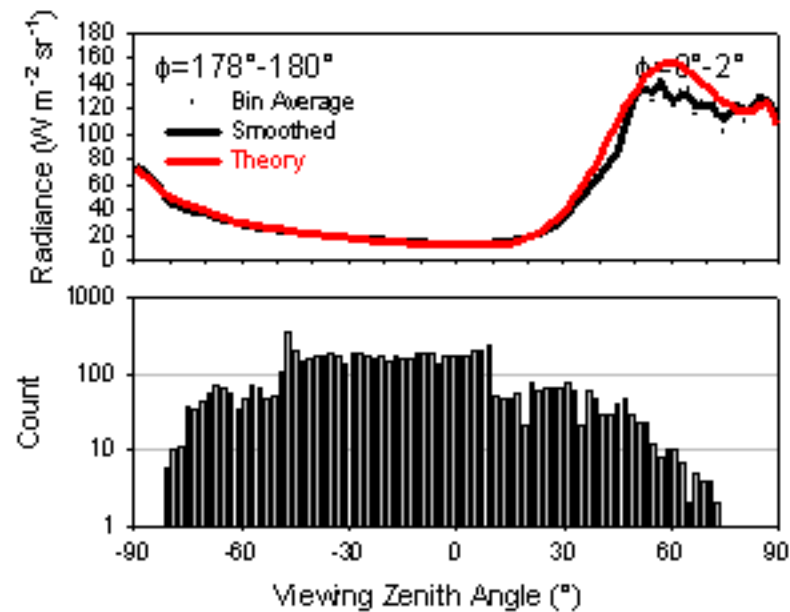
Clear Ocean ($ws=4 - 6 \text{ m s}^{-1}$; $\theta_o=18^\circ-20^\circ$)



Clear Ocean ($ws=0 - 2 \text{ m s}^{-1}$; $\theta_o=48^\circ-50^\circ$)



Clear Ocean ($ws=4 - 6 \text{ m s}^{-1}$; $\theta_o=48^\circ-50^\circ$)

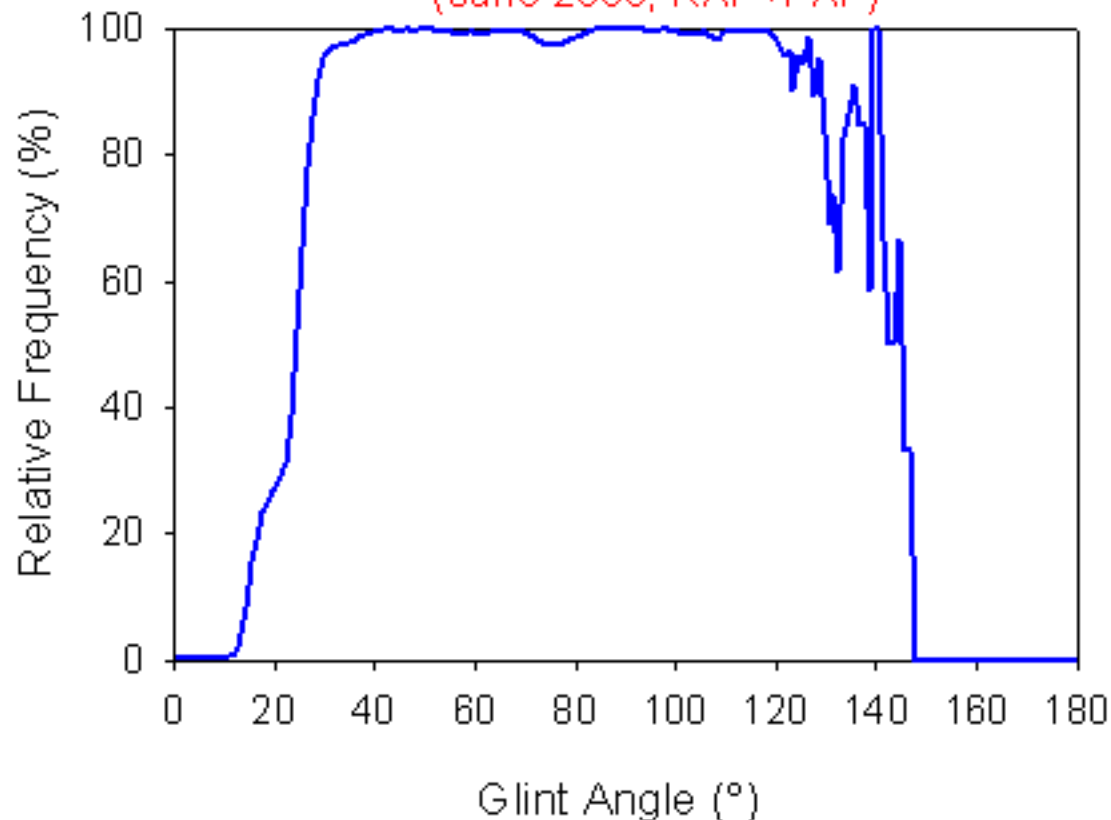


Glint avoidance?

To determine whether or not to perform a retrieval for a given measurement, the standard deviation of the ADM anisotropic factors in the vicinity of the measurement (i.e. surrounding w_s , θ_o , θ , and ϕ bins) must be less than 0.05.

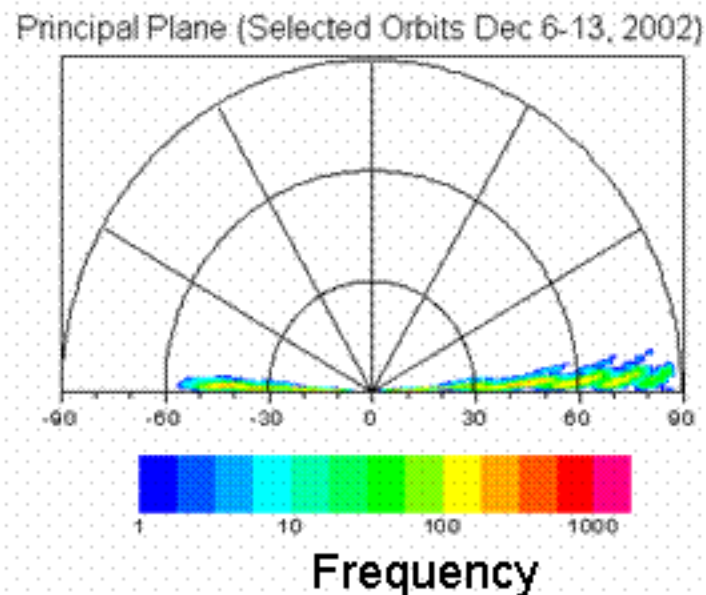
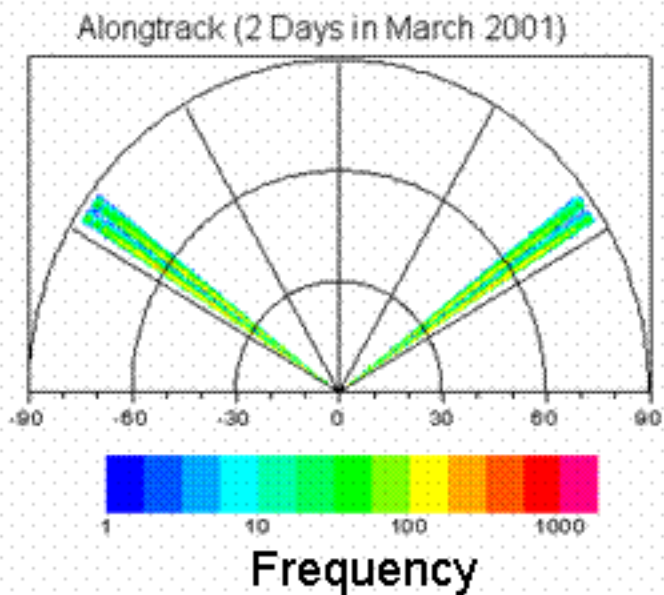
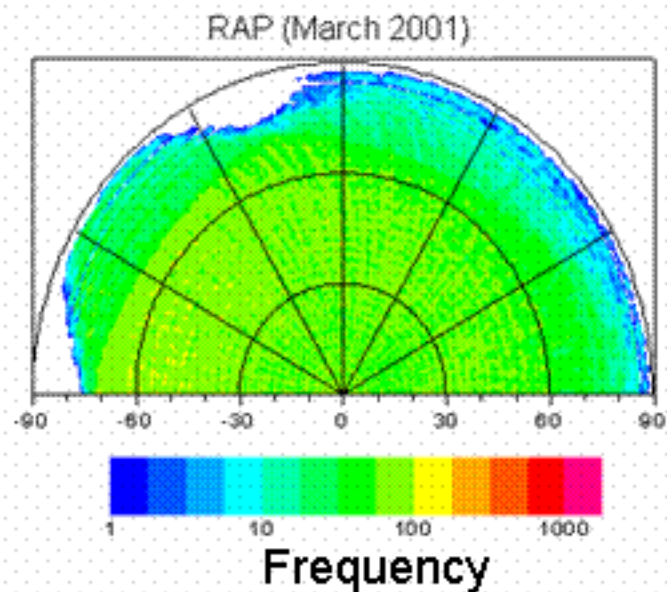
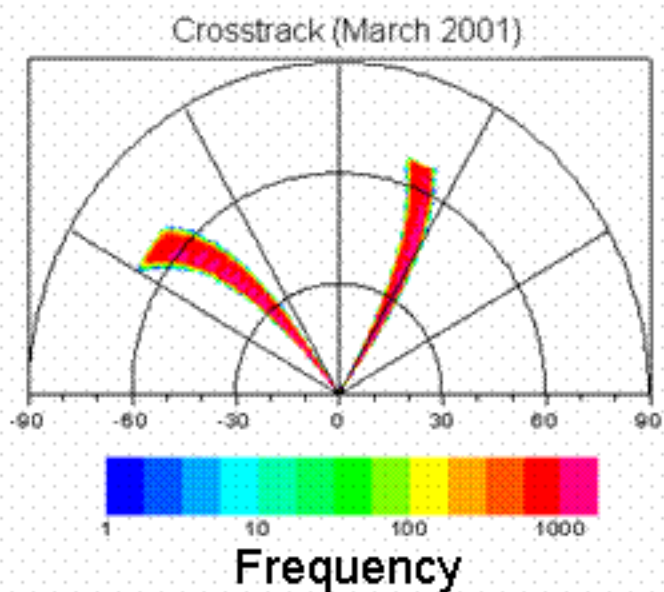
Otherwise, use ADM mean flux value as default.

Clear Ocean SW Radiance-to-Flux Conversion Frequency
(June 2000; RAP+FAP)

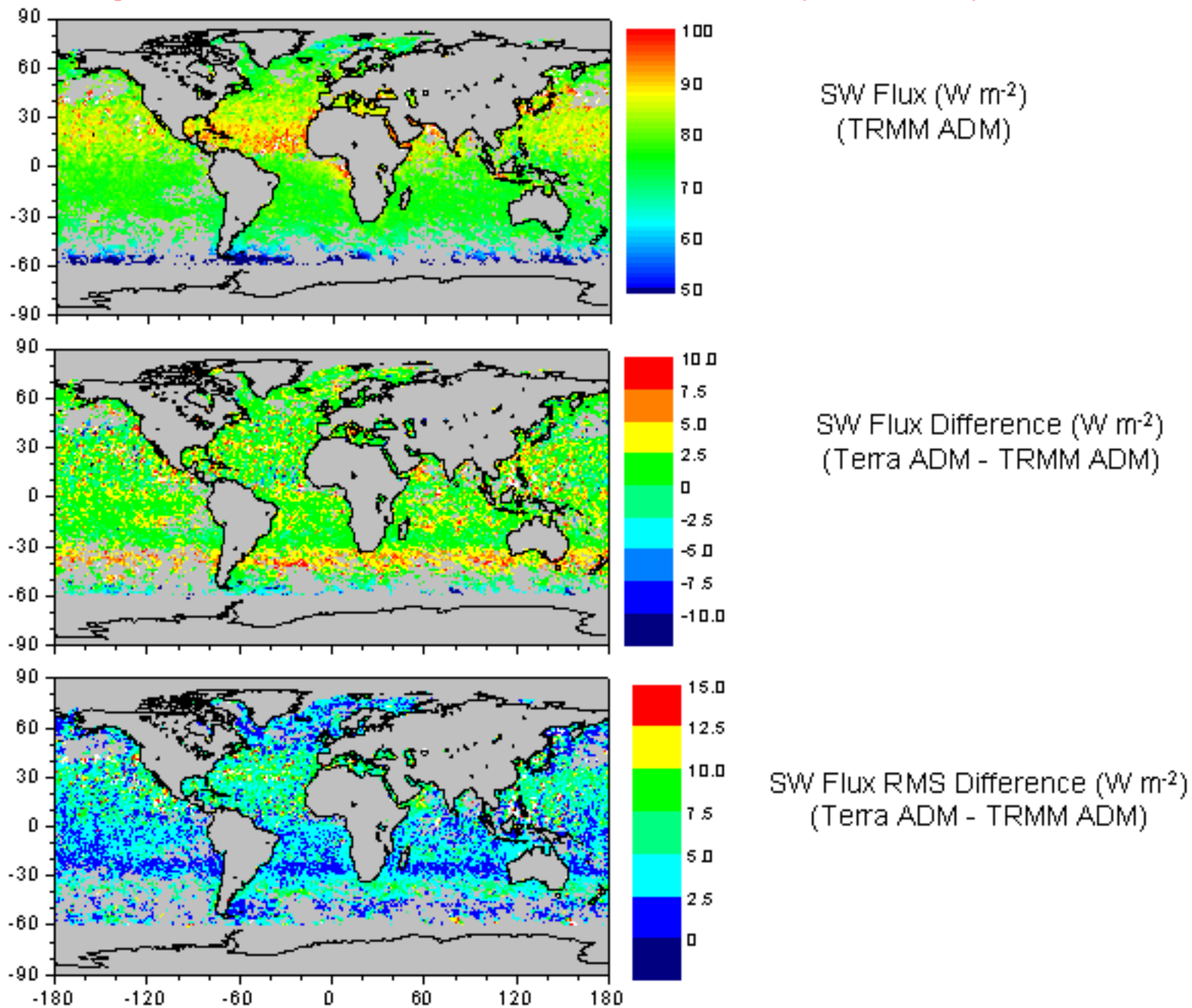


- 74% of all clear FOVs inverted
- Otherwise use ADM Direct Integration value

Sampling For Different CERES Scan Modes ($\theta_0=40^\circ-41^\circ$)

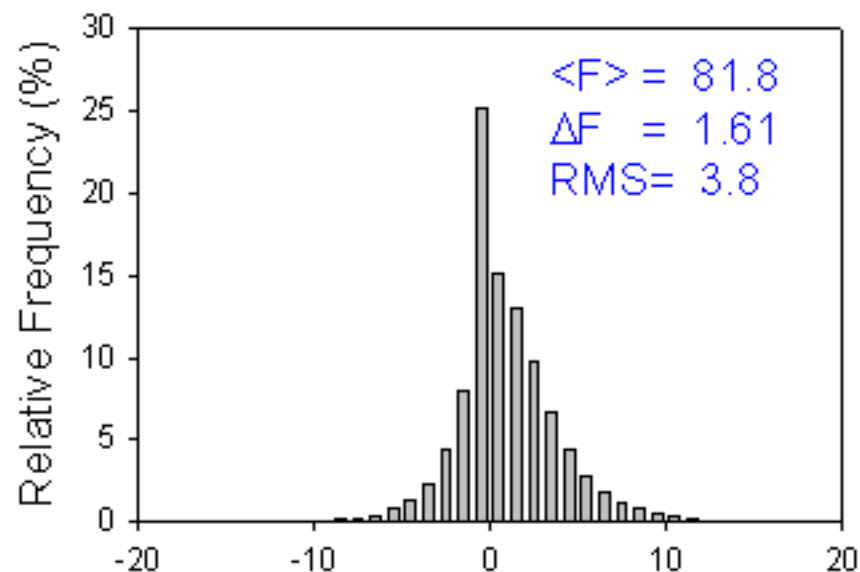


Clear-Sky Ocean SW TOA Flux: Terra, June 2000 (RAP+FAP)

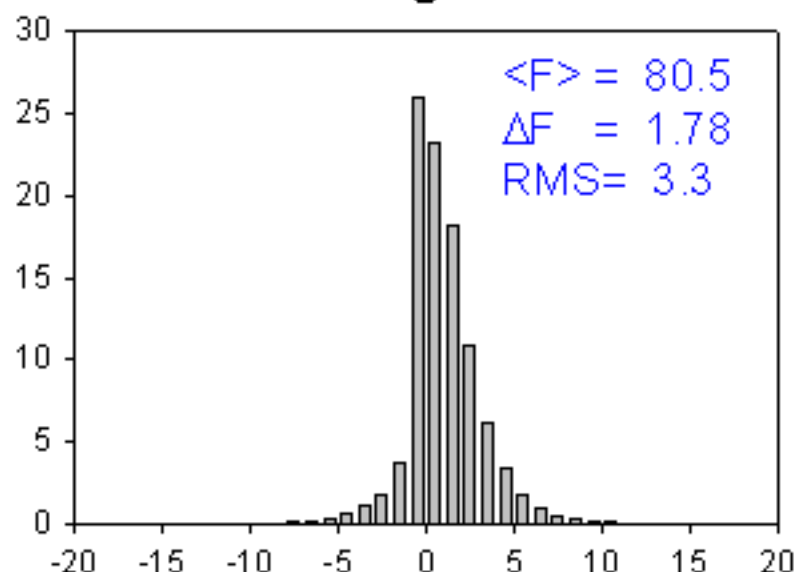


Clear Ocean SW TOA Flux Differences (June, 2000; RAP+FAP)

Instantaneous



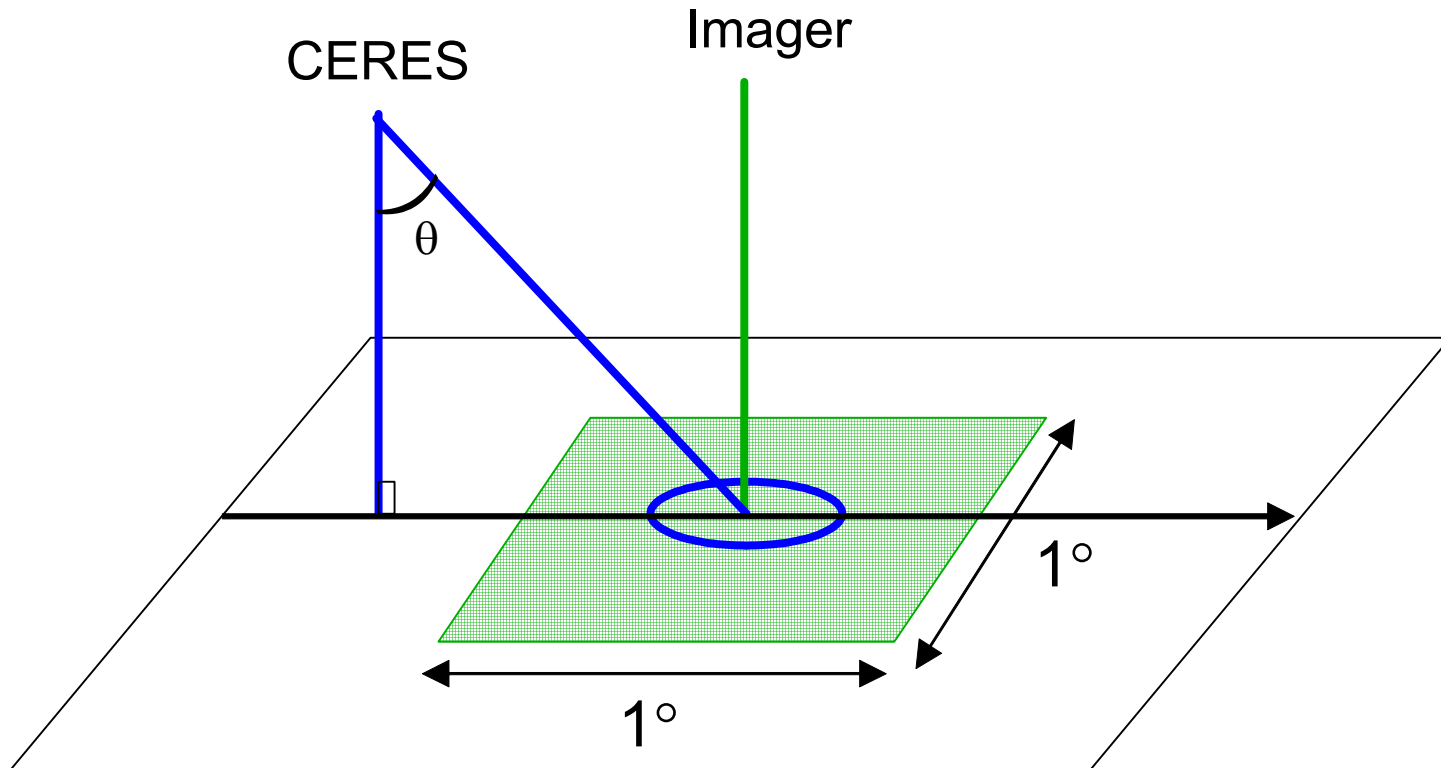
1°-Regional



Flux(Terra ADM) - Flux(TRMM ADM) ($W m^{-2}$)

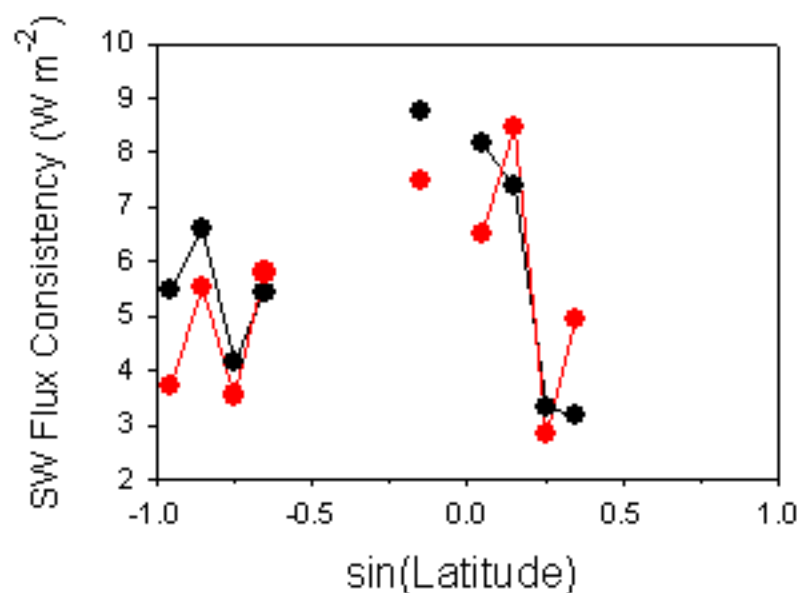
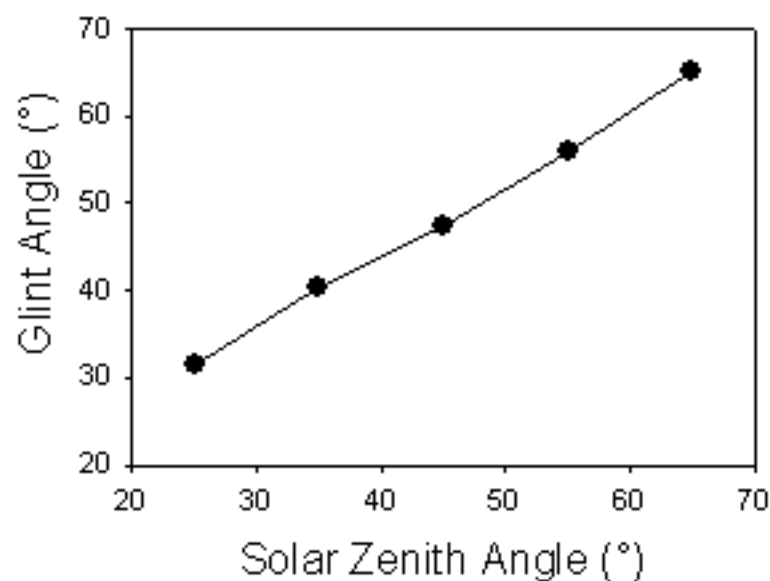
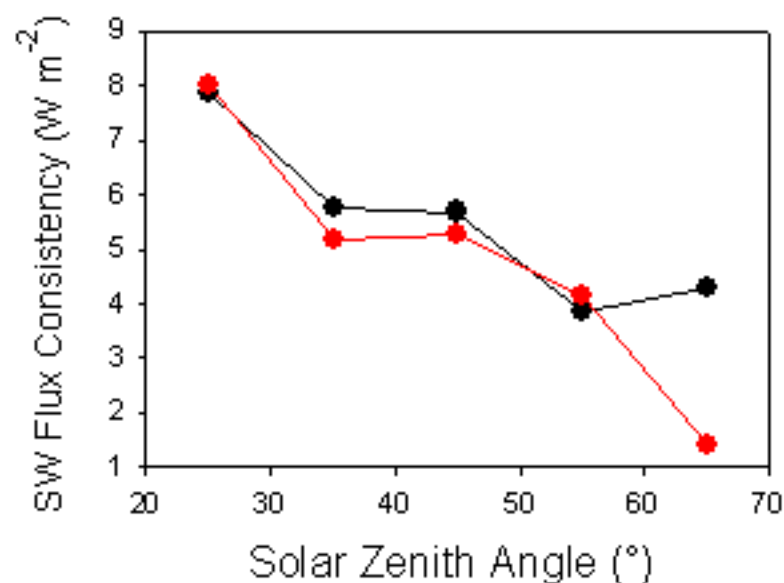
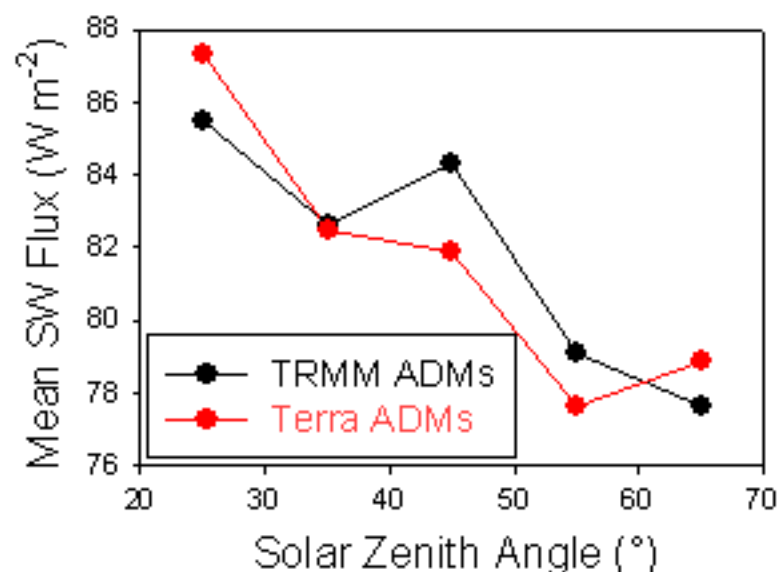
1° Regional Instantaneous TOA Flux Consistency Test

Objective: Compare ADM-derived TOA fluxes over 1° regions from different viewing geometries. Are TOA fluxes consistent?



Instantaneous SW TOA Flux Consistency Tests: 1° Regions (F(Nadir) vs F(60° $\theta \le 70^\circ$); November to April, 2000, 2001)

Clear Ocean



Terra SW ADMs – Clouds Over Ocean

Terra SW ADMs – Clouds Over Ocean

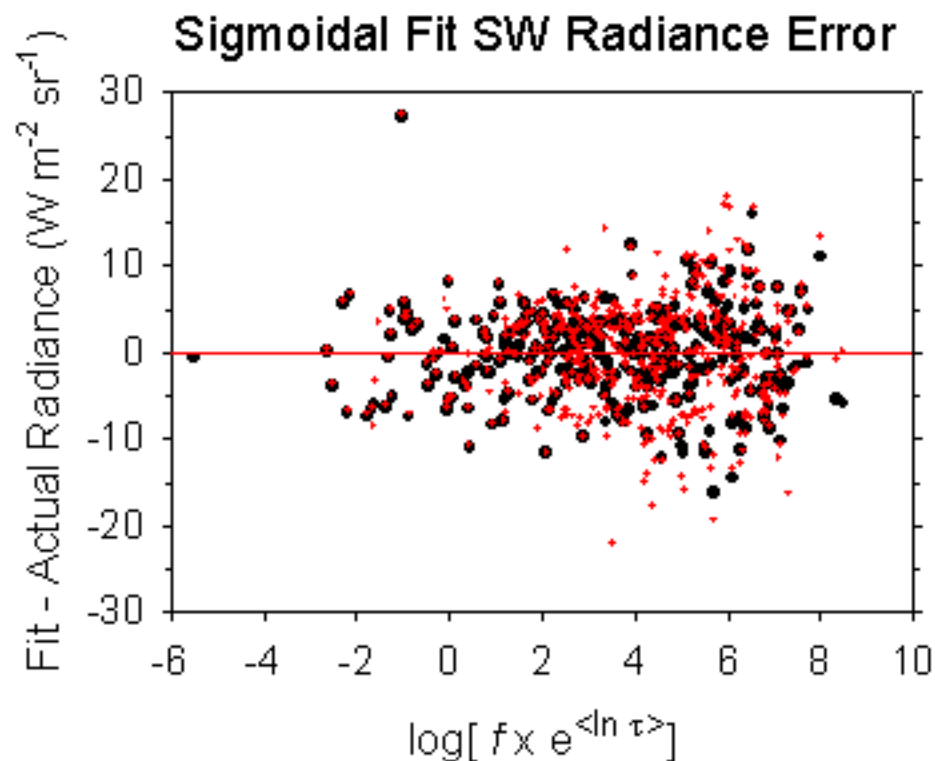
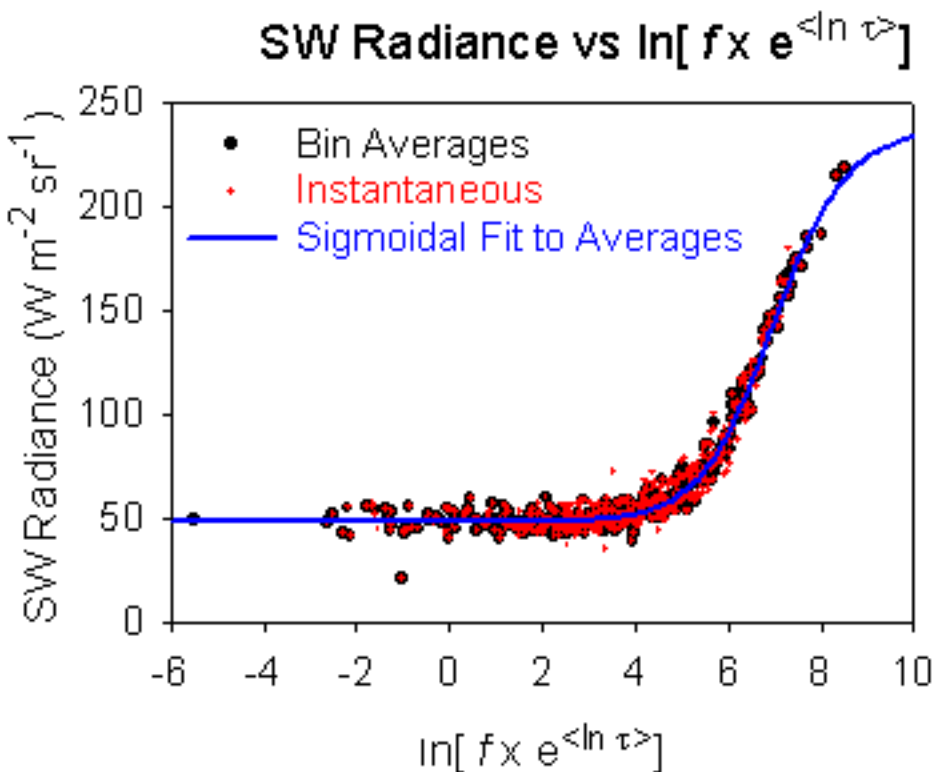
Clouds over Ocean:

“Continuous” ADMs using sigmoidal fit approach for 3 cloud phase categories:

- i) Liquid Water (Phase < 1.01)
- ii) Mixed Phase ($1.01 \leq \text{Phase} \leq 1.75$)
- iii) Ice (Phase > 1.75)

Uncertainties in Sigmoidal SW Radiance Fits

(Liquid Water Clouds; $\theta_0=34^\circ-36^\circ$; $\theta=50^\circ-52^\circ$; $\phi=6^\circ-8^\circ$; TRMM+Terra RAPS+Alongtrack)



| | | | |
|---------|---|-------|--|
| Avg Rad | = | 70.5 | $\text{W m}^{-2} \text{sr}^{-1}$ |
| Bias | = | 0.038 | $\text{W m}^{-2} \text{sr}^{-1}$ (0.05%) |
| Stdev | = | 5.26 | $\text{W m}^{-2} \text{sr}^{-1}$ (7.5%) |

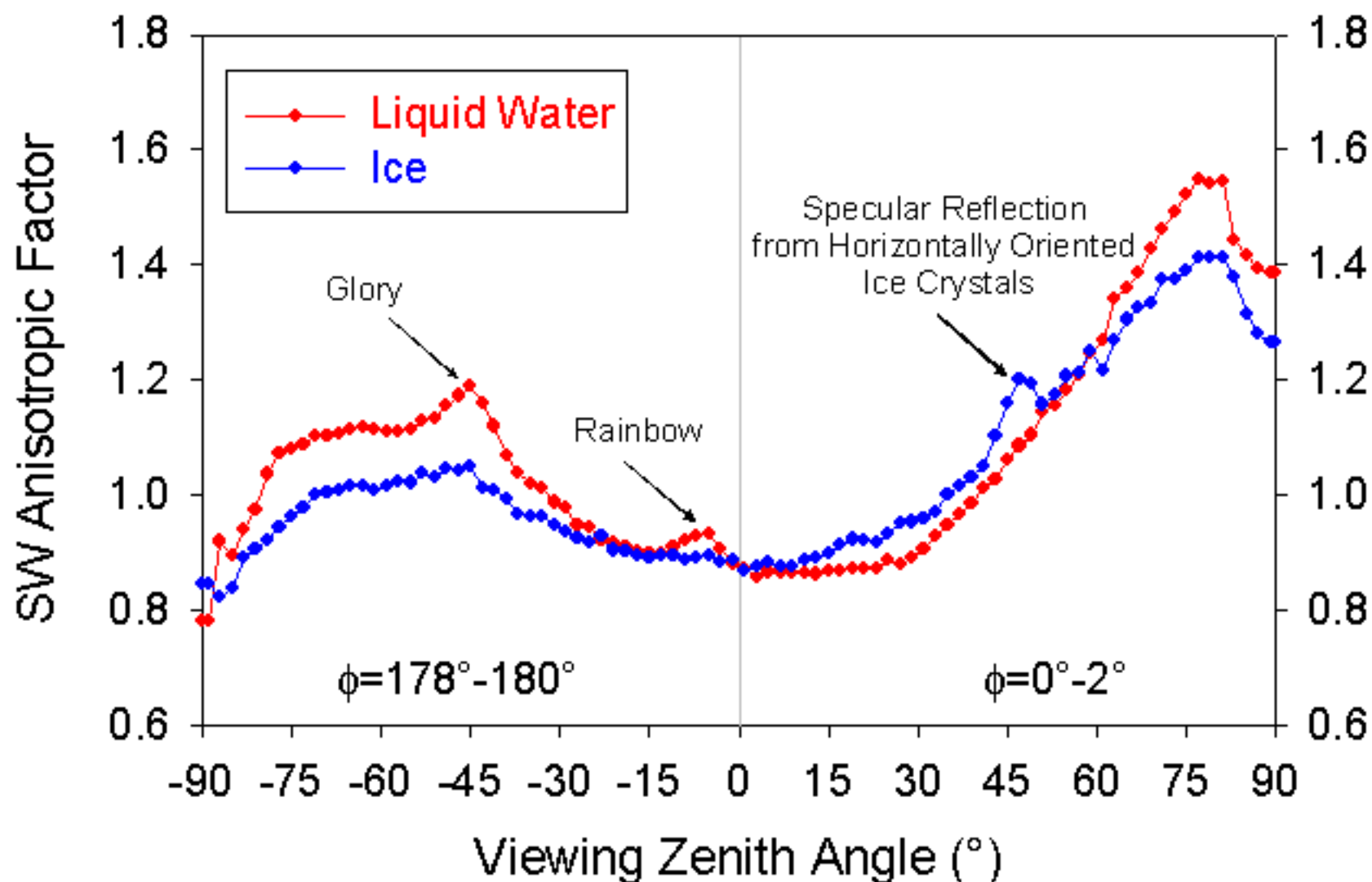
Five Parameter Sigmoid

$$I = I_o + \frac{a}{\left[1 + e^{-\left(\frac{x-x_o}{b}\right)} \right]^c}$$

where, $x = \ln(f \times e^{\langle \ln \tau \rangle})$

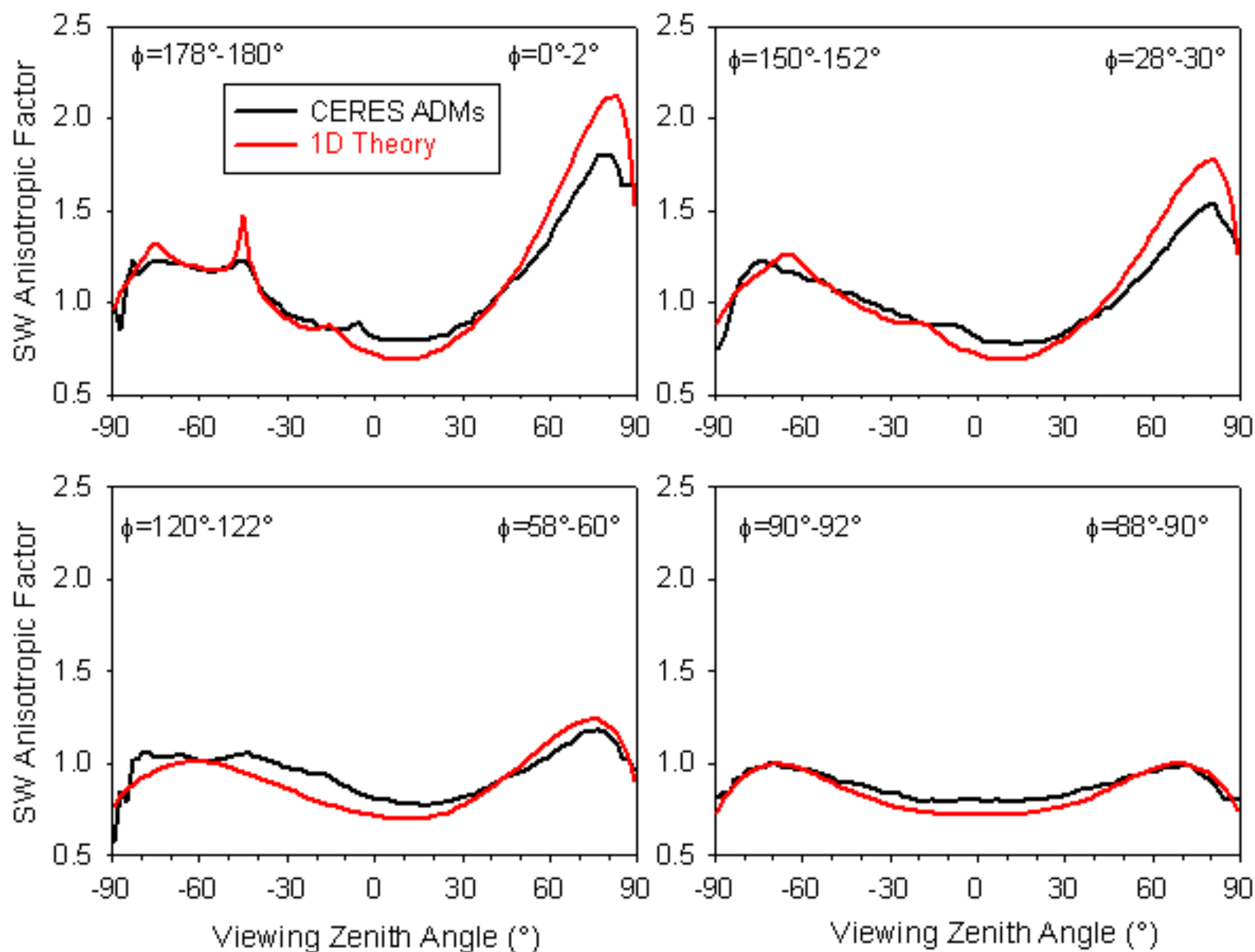
$x_o, I_o, a, b, c =$ coefficients of fit

CERES/Terra ADM Anisotropic Factors in the Principal Plane ($\theta_0=44^\circ-46^\circ$; Ocean; $f e^{<Int>} = 7.5$; November 2000 - August 2001)

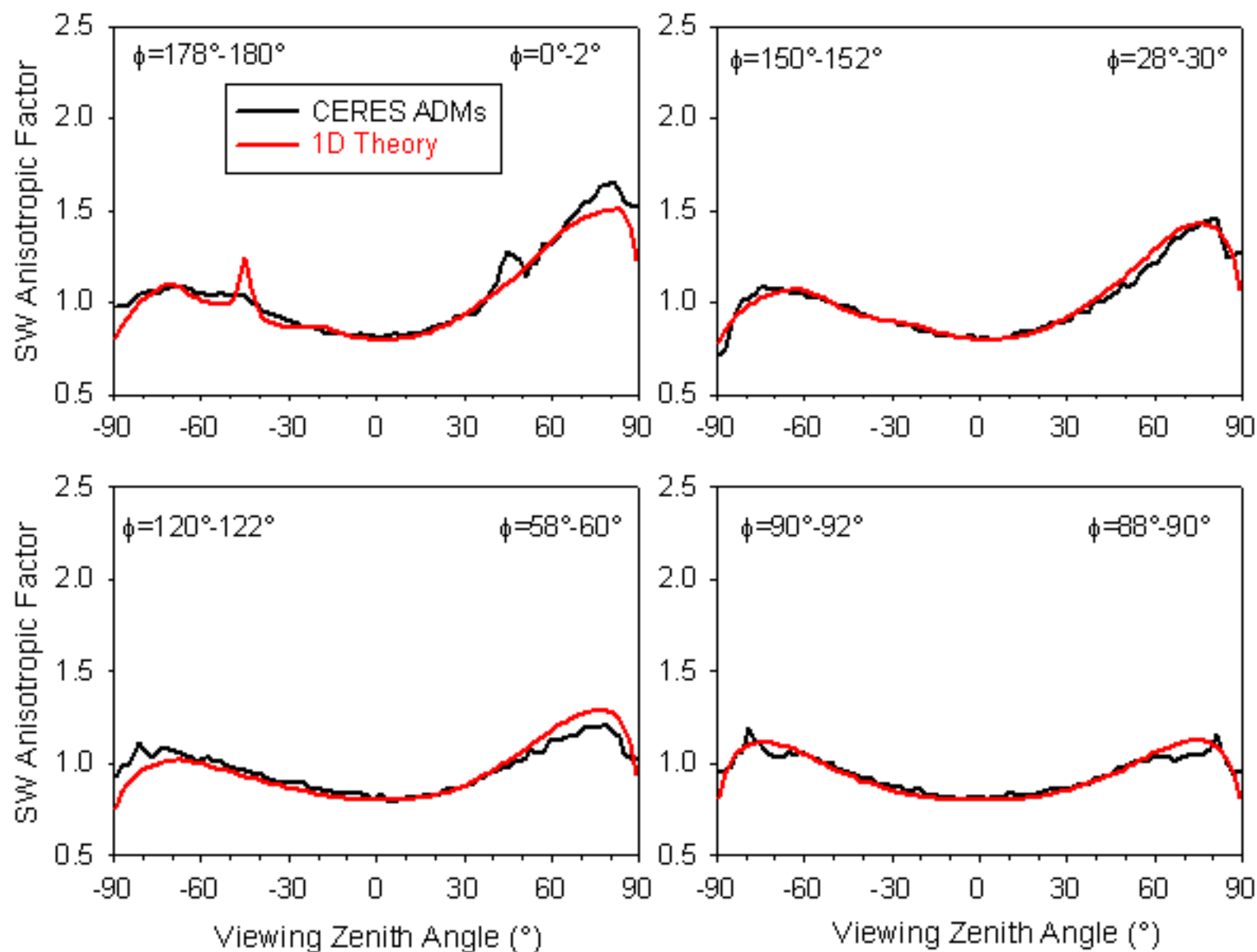


CERES/Terra ADM Anisotropic Factors

(Liquid Water Clouds; Ocean; $\theta_0=44^\circ-46^\circ$; $f e^{<ln\tau>} = 5$)



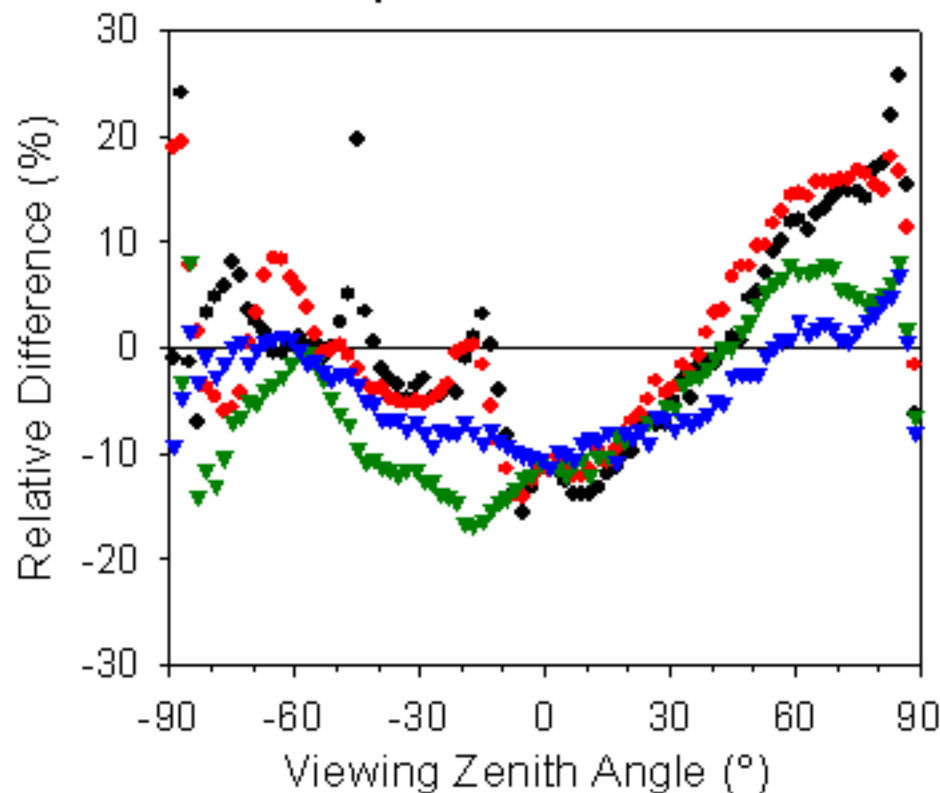
CERES/Terra ADM Anisotropic Factors (Ice Clouds; Ocean; $\theta_0=44^\circ-46^\circ$; $f e^{<ln\tau>} = 5$)



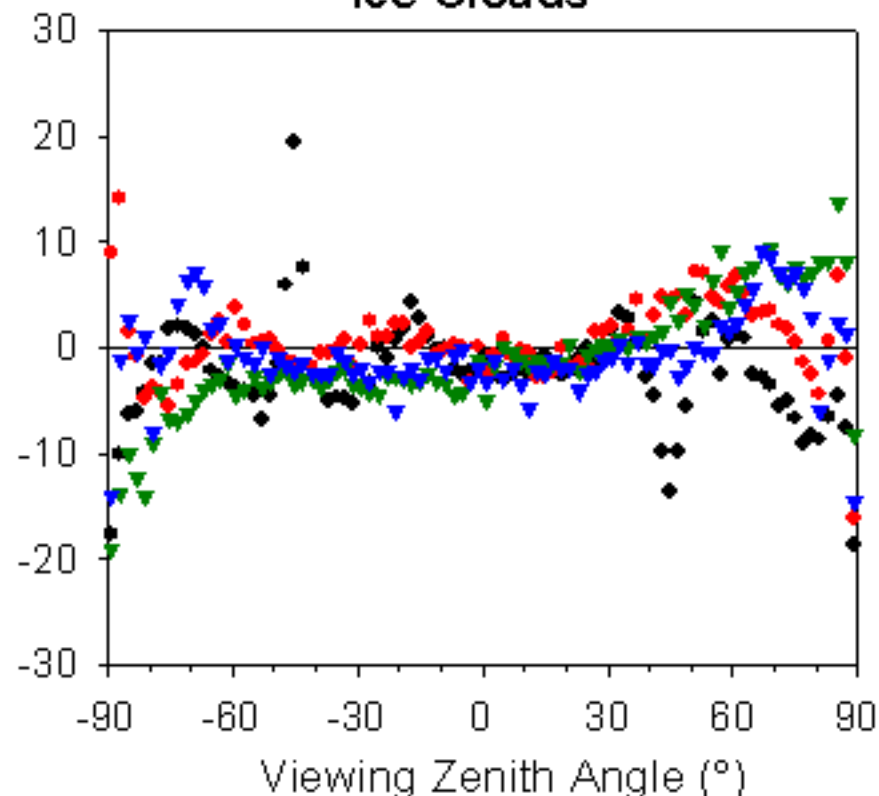
Theory vs CERES SW ADMs

(Ocean; $\theta_0=44^\circ-46^\circ$; $f e^{<ln\tau>} = 5$)

Liquid Water Clouds

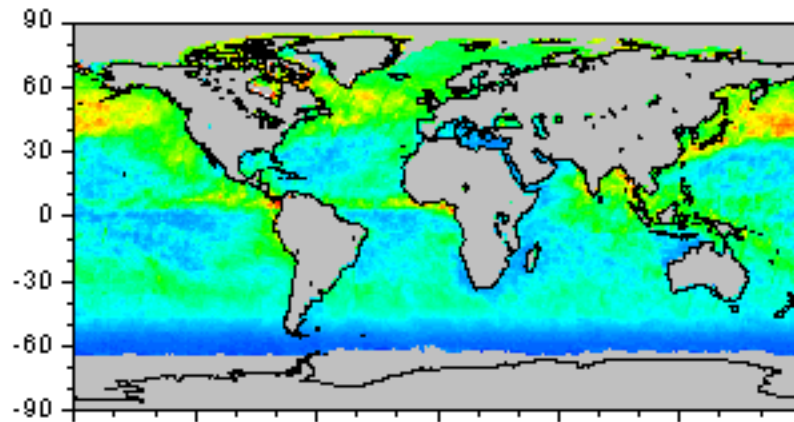


Ice Clouds

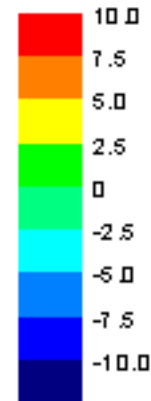
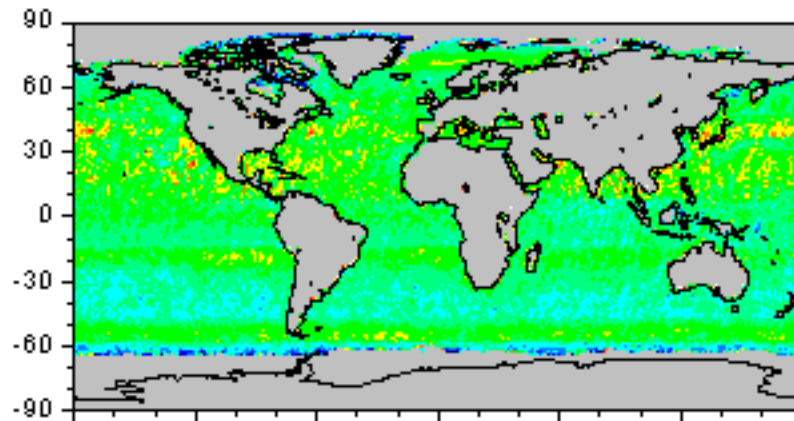


- $\phi=178^\circ-180^\circ$; $\phi=0^\circ-2^\circ$
- ♦ $\phi=150^\circ-152^\circ$; $\phi=28^\circ-30^\circ$
- ▼ $\phi=120^\circ-122^\circ$; $\phi=58^\circ-60^\circ$
- ▼ $\phi=90^\circ-92^\circ$; $\phi=88^\circ-90^\circ$

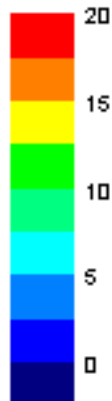
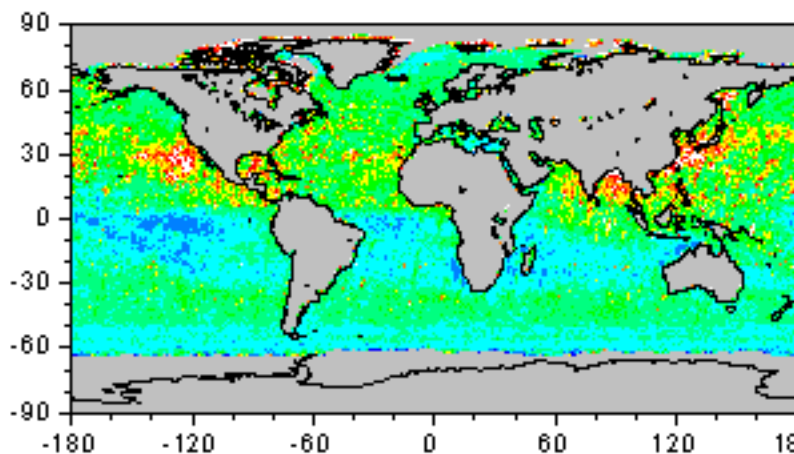
All-Sky Ocean SW TOA Flux: Terra, June 2000 (RAP+FAP)



SW Flux ($W m^{-2}$)
(TRMM ADM)

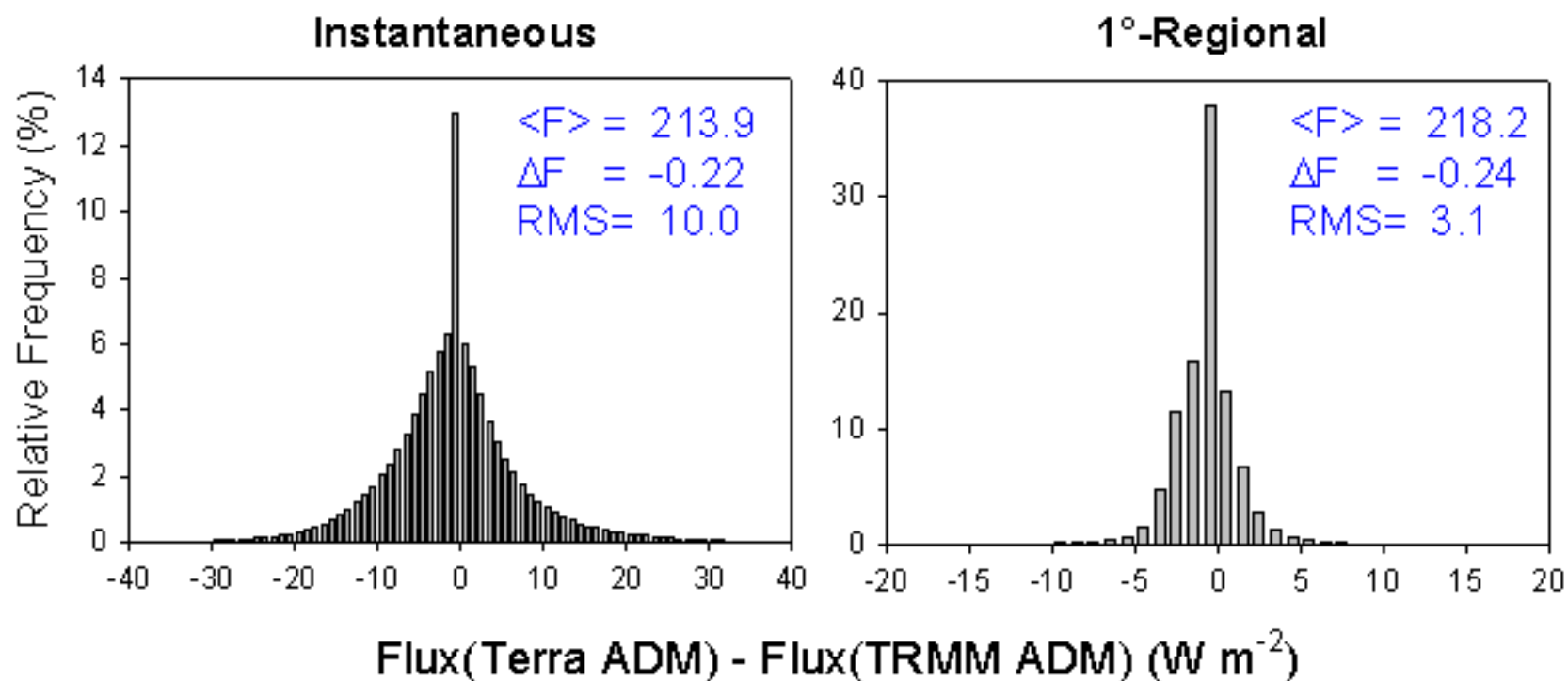


SW Flux Difference ($W m^{-2}$)
(Terra ADM - TRMM ADM)

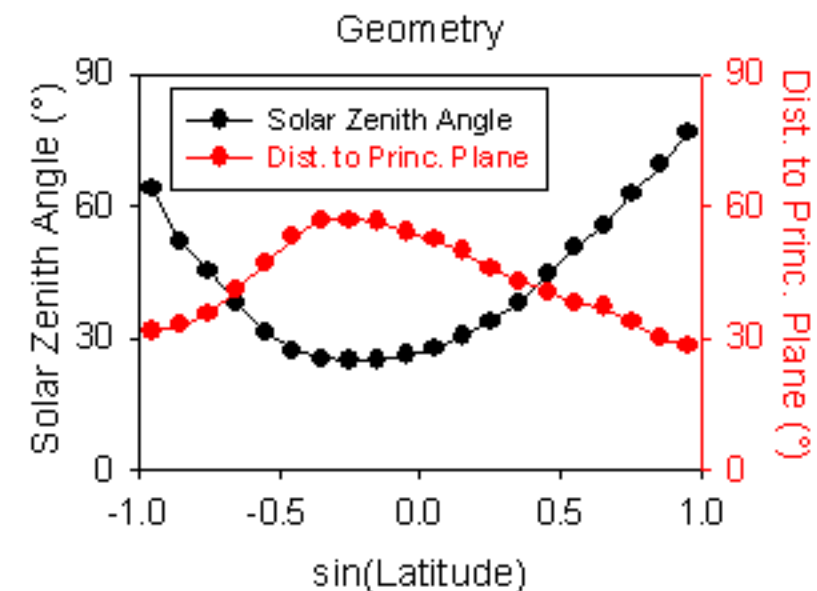
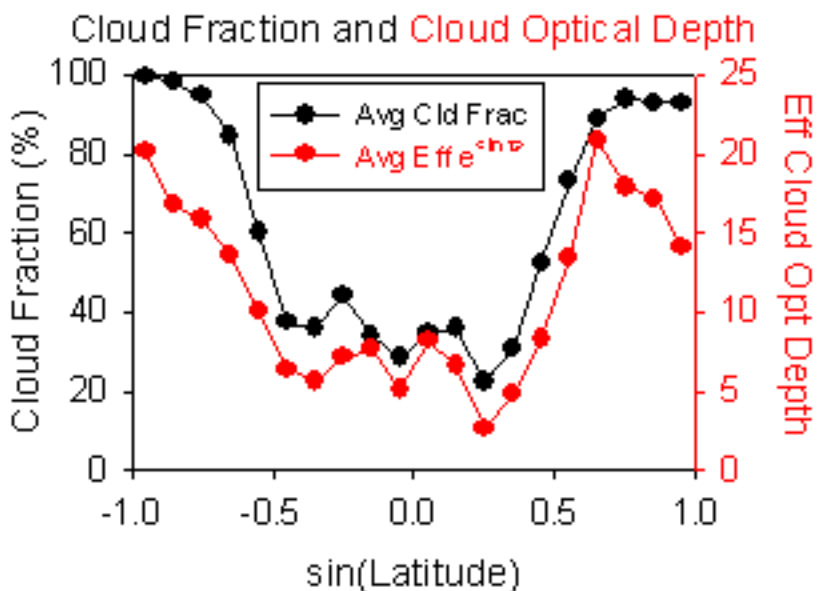
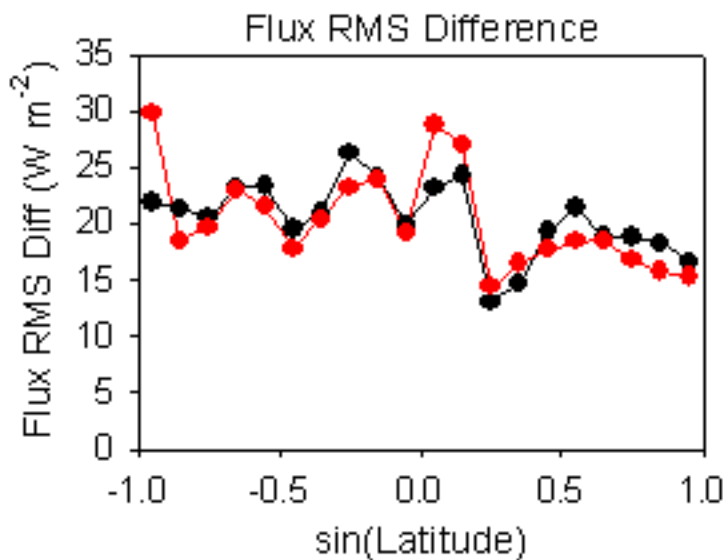
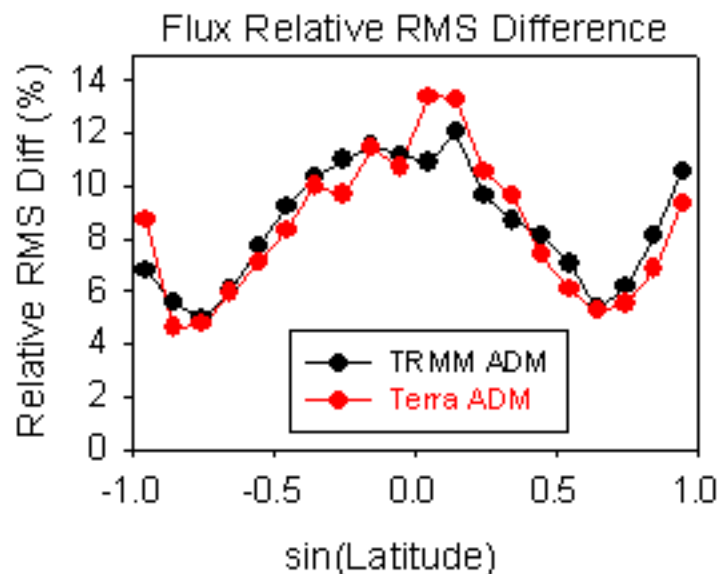


SW Flux RMS Difference ($W m^{-2}$)
(Terra ADM - TRMM ADM)

All-Sky Ocean SW TOA Flux Differences (June, 2000; RAP+FAP)



All-Sky Ocean Instantaneous SW TOA Flux Consistency Tests: 1° Regions
 (F(Nadir) vs F($60^\circ < \theta \leq 70^\circ$); November to April, 2000, 2001)



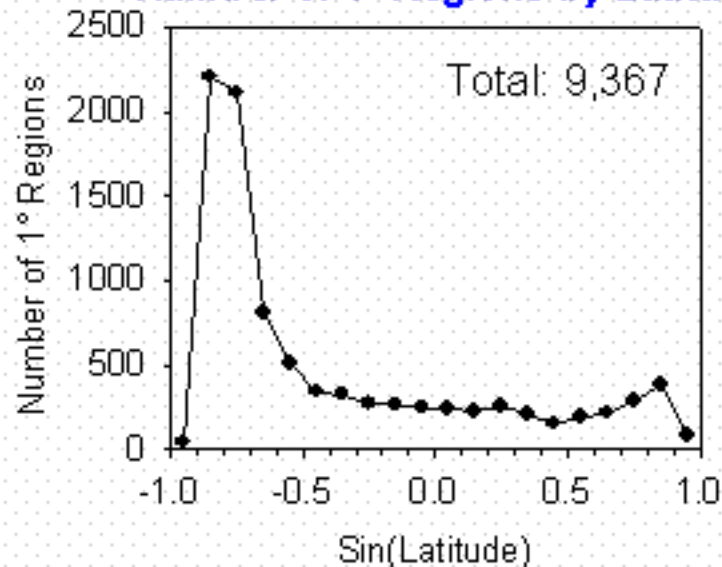
Instantaneous TOA Flux Consistency by “Cloud Type”

Separate 1°-regions comprised of CERES FOVs that are:

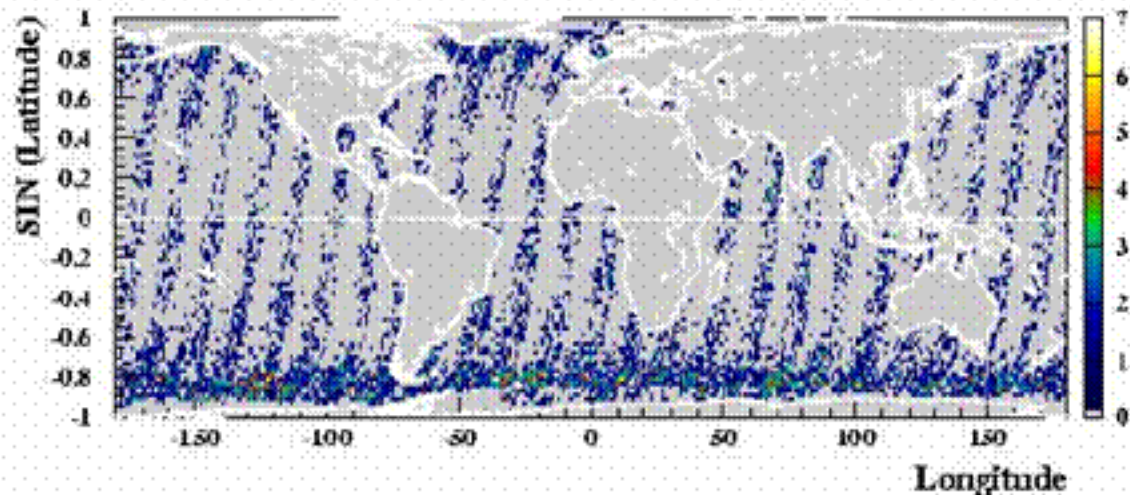
1. Single Layer Water (Overcast)
2. Single Layer Water ($f \leq 50\%$)
3. Single Layer Water ($f > 50\%$)
4. Single Layer Ice ($e^{\langle \ln \tau \rangle} < 10$)
5. Single Layer Ice ($10 \leq e^{\langle \ln \tau \rangle} \leq 50$)
6. Single Layer Ice ($e^{\langle \ln \tau \rangle} > 50$)
7. Single Layer Mixed
8. Multilayer

Frequency of 1° Regions by Latitude and “Cloud Type”

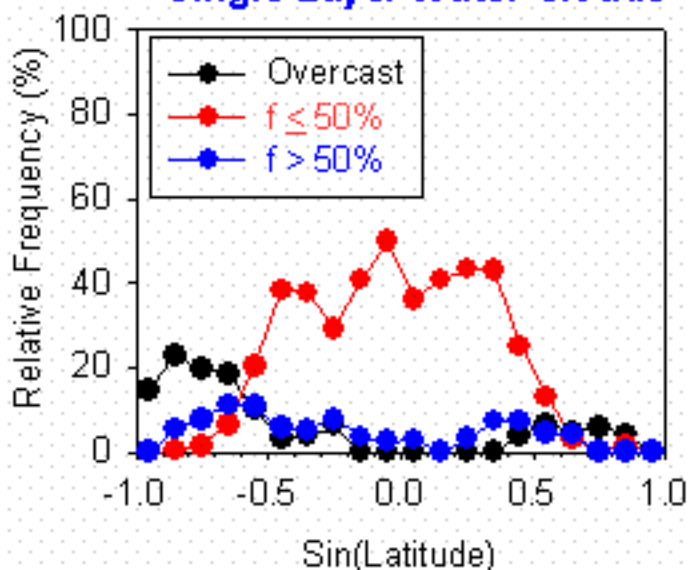
Number of 1° Regions by Latitude



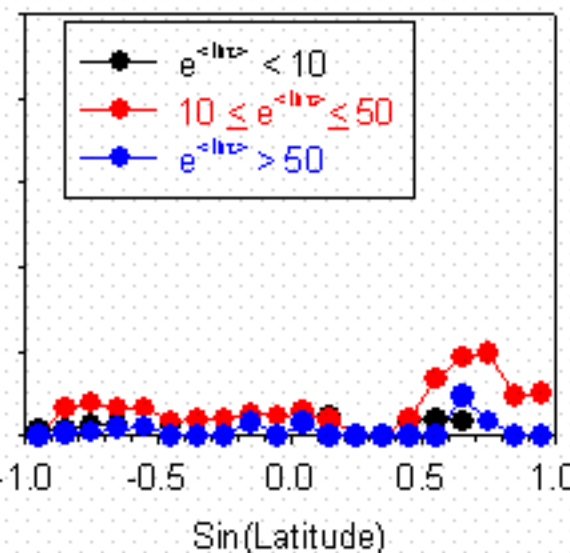
Frequency of 1° Regions: Nov 2000-April 2001



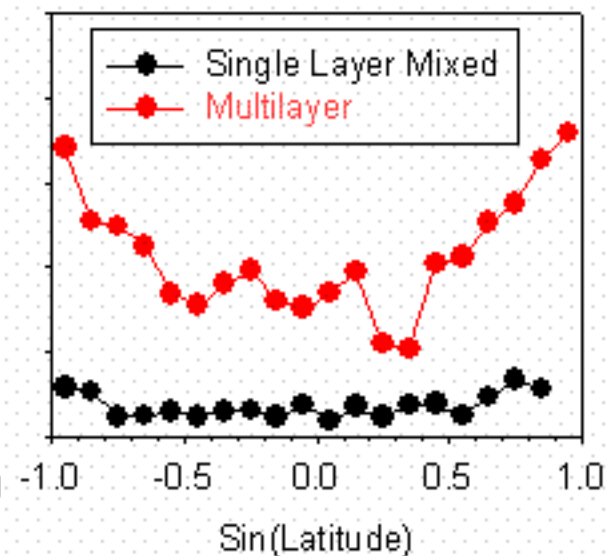
Single Layer Water Clouds



Single Layer Ice Clouds



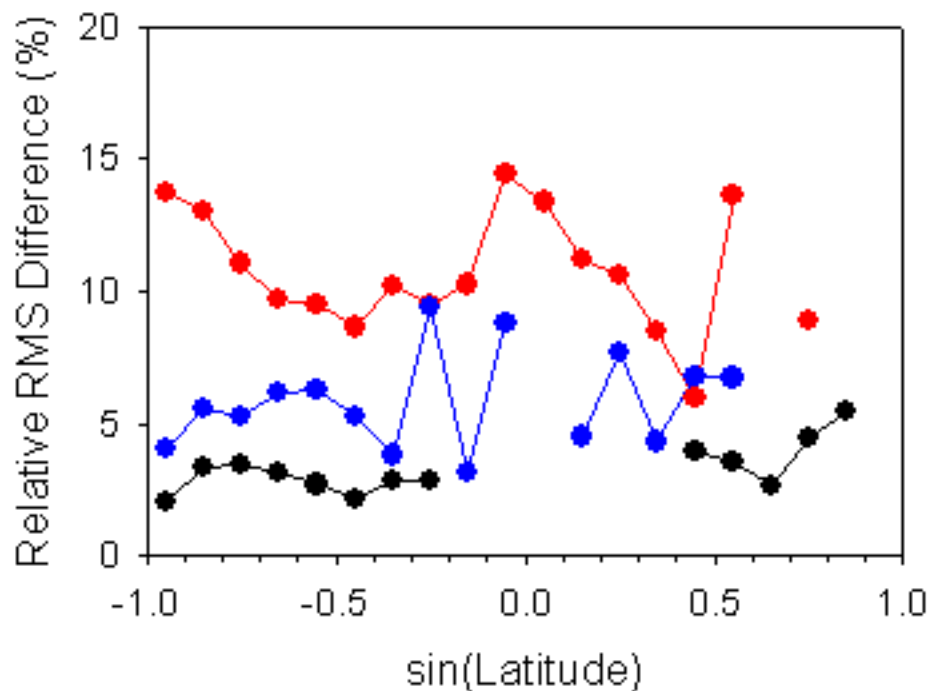
Single Layer Mixed+Multilayer



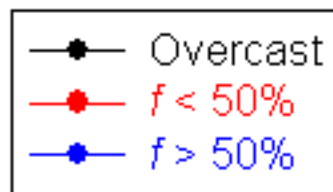
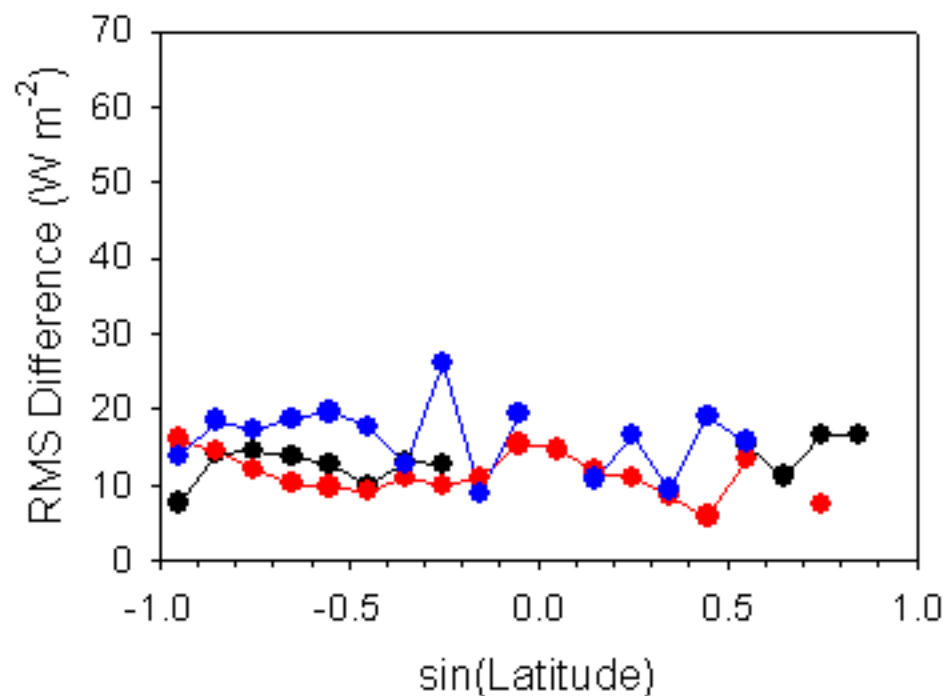
Instantaneous SW TOA Flux Consistency Tests: 1° Regions
($F(\text{Nadir})$ vs $F(60^\circ < \theta \leq 70^\circ)$; November to April, 2000, 2001)

Single Layer Water Clouds Over Ocean

Flux Relative RMS Difference

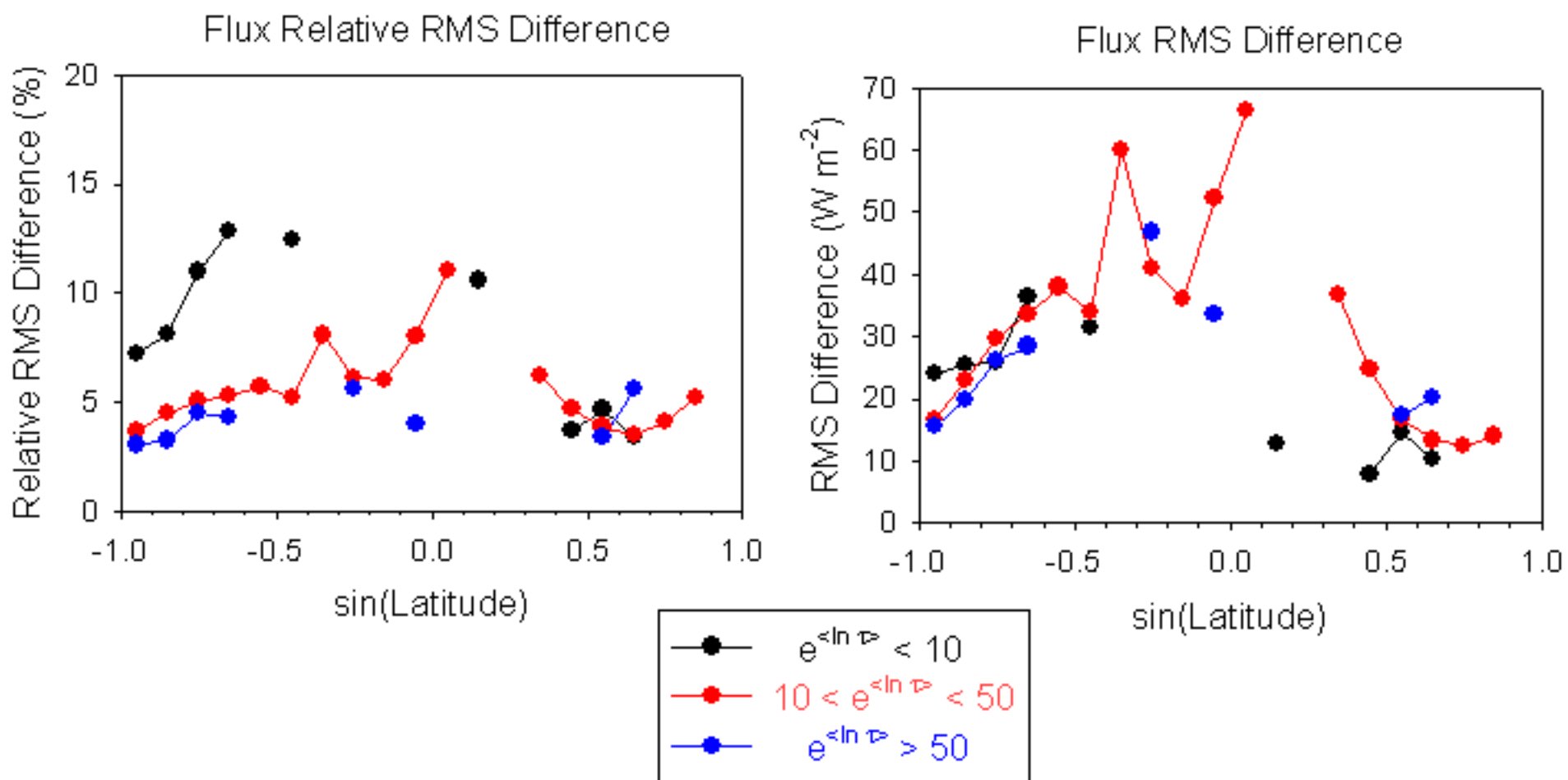


Flux RMS Difference



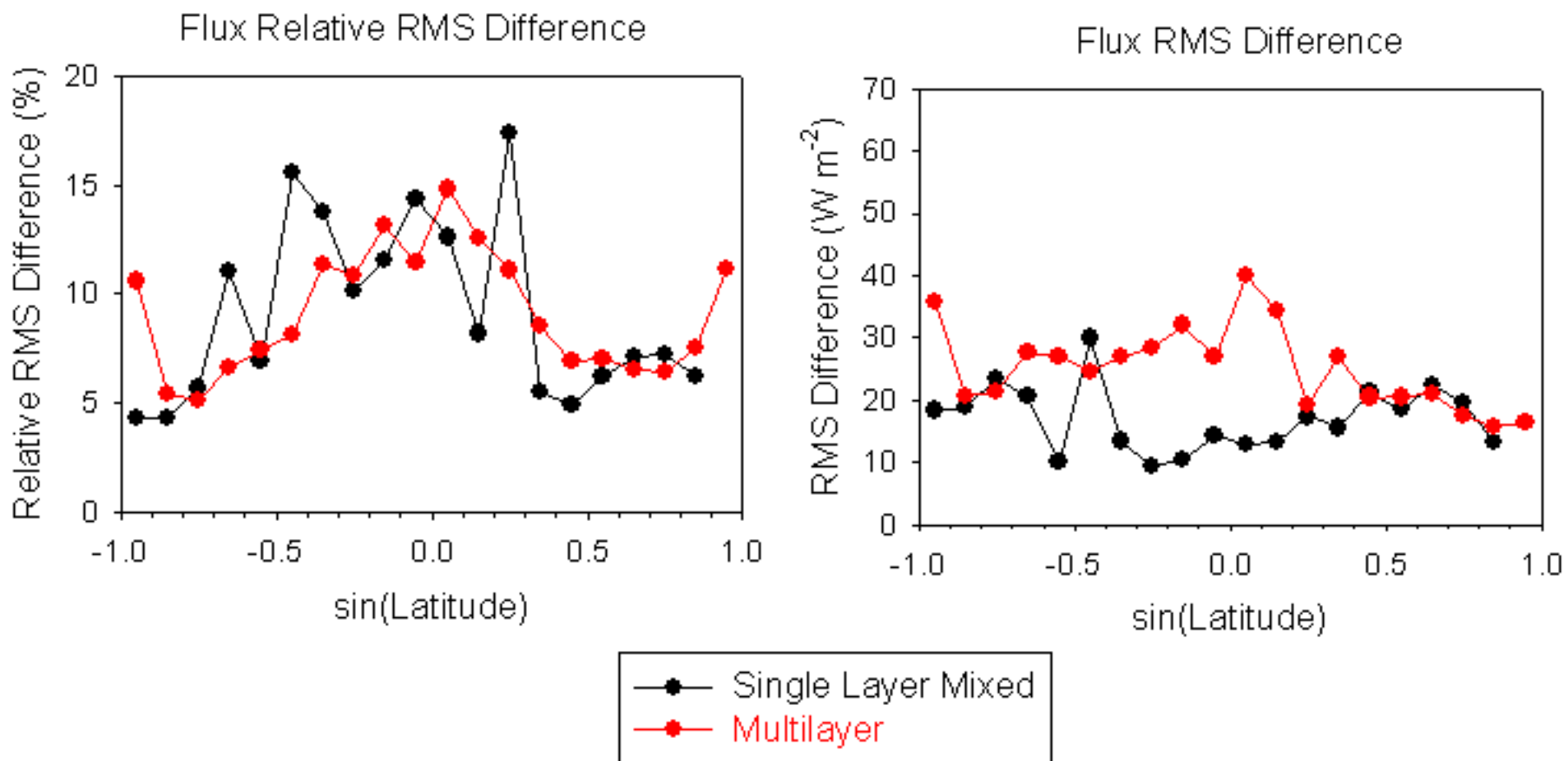
Instantaneous SW TOA Flux Consistency Tests: 1° Regions
(F(Nadir) vs F($60^\circ < \theta \leq 70^\circ$); November to April, 2000, 2001)

Single Layer Ice Clouds Over Ocean



Instantaneous SW TOA Flux Consistency Tests: 1° Regions
(F(Nadir) vs F($60^\circ < \theta \leq 70^\circ$); November to April, 2000, 2001)

Single Layer Mixed and Multilayer Clouds Over Ocean



Terra SW ADMs – Clear Land & Desert

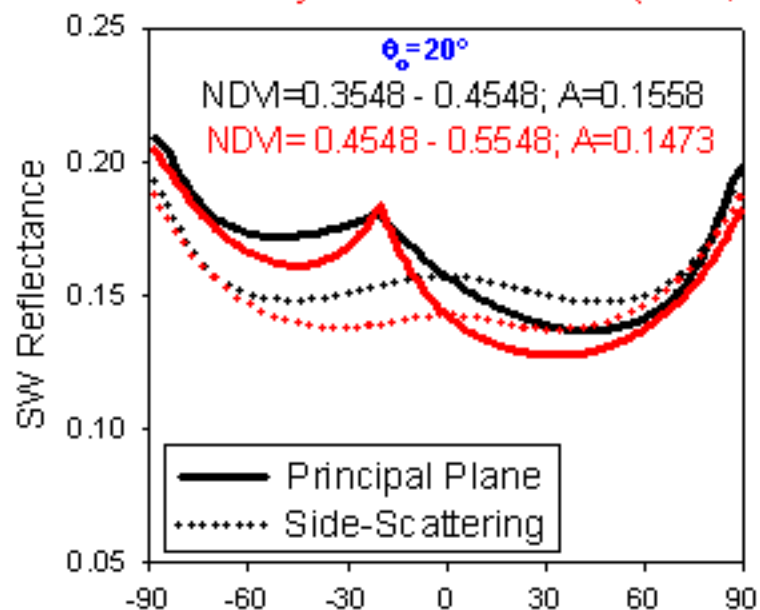
Terra SW ADMs – Clear Land & Desert

- Collect one month of clear land CERES reflectances over $\approx 1^\circ$ equal-area regions. Stratify by solar zenith angle and TOA NDVI.
- If sampling over angle is sufficient, use an 8-parameter nonparametric fit (from Ahmad and Deering, 1992) to produce brdf and ADM for the $\approx 1^\circ$ region.

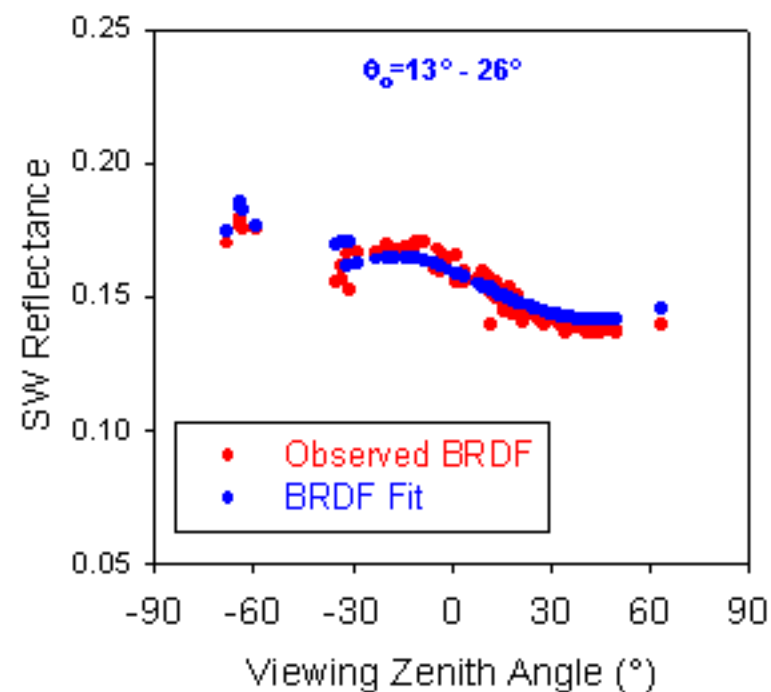
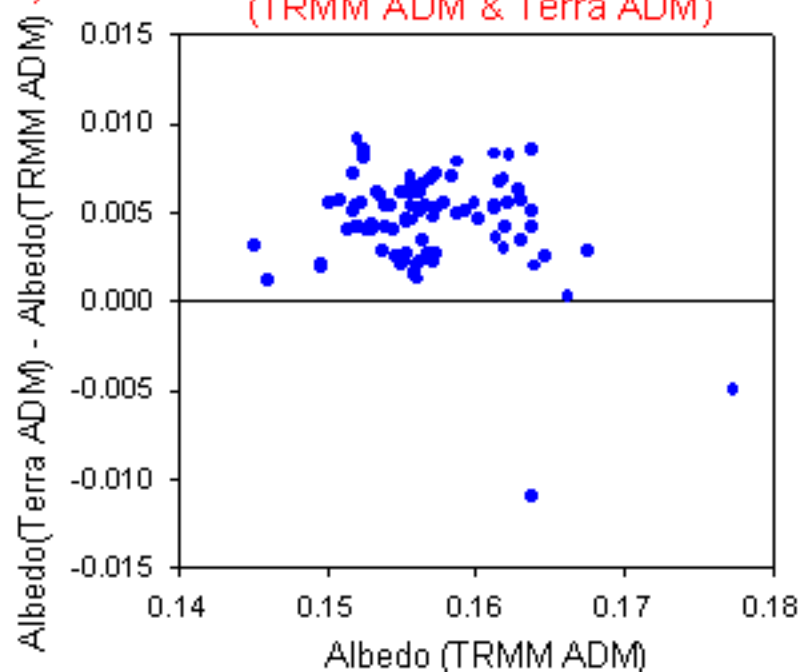
$$r(\mu, \phi, \mu_o) = \frac{1}{4} \frac{\omega}{\mu + \mu_o} \left\{ 1 - \exp \left[-\tau \left(\frac{1}{\mu} + \frac{1}{\mu_o} \right) \right] \right\} \cdot \left\{ P(\alpha) [1 + B(\alpha')] \right\} + \frac{1}{4} \frac{\omega}{\mu + \mu_o} \cdot \left[H^{(0)}(\mu) H^{(0)}(\mu_o) (1 - e(\mu + \mu_o)) - b(1 - \omega) \mu \mu_o + b(1 - \mu^2)^{1/2} \cdot (1 - \mu_o^2)^{1/2} H^{(1)}(\mu) H^{(1)}(\mu_o) \cos \phi \right] - \frac{1}{4} \frac{\omega}{\mu + \mu_o} P'(\alpha) + \left(d_o + \frac{d_1}{\mu + \mu_o} \right)$$

- Multiple scattering based on Chandrasekhar's RT solution for semi-infinite medium.
- "Hot-spot" modeled using empirical term (Hapke, 1986).

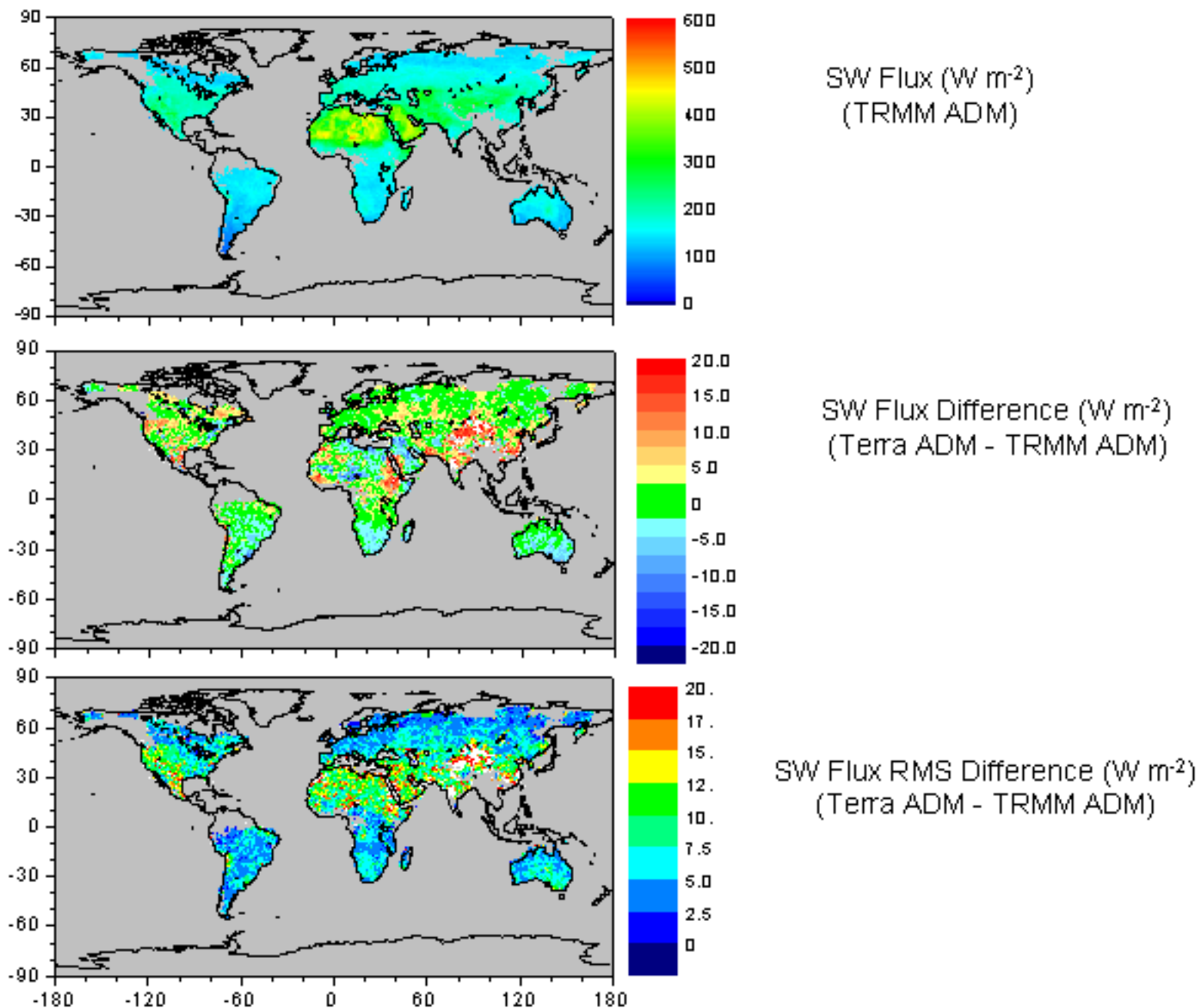
BRDF in Vicinity of SGP ARM Site (June, 2000)

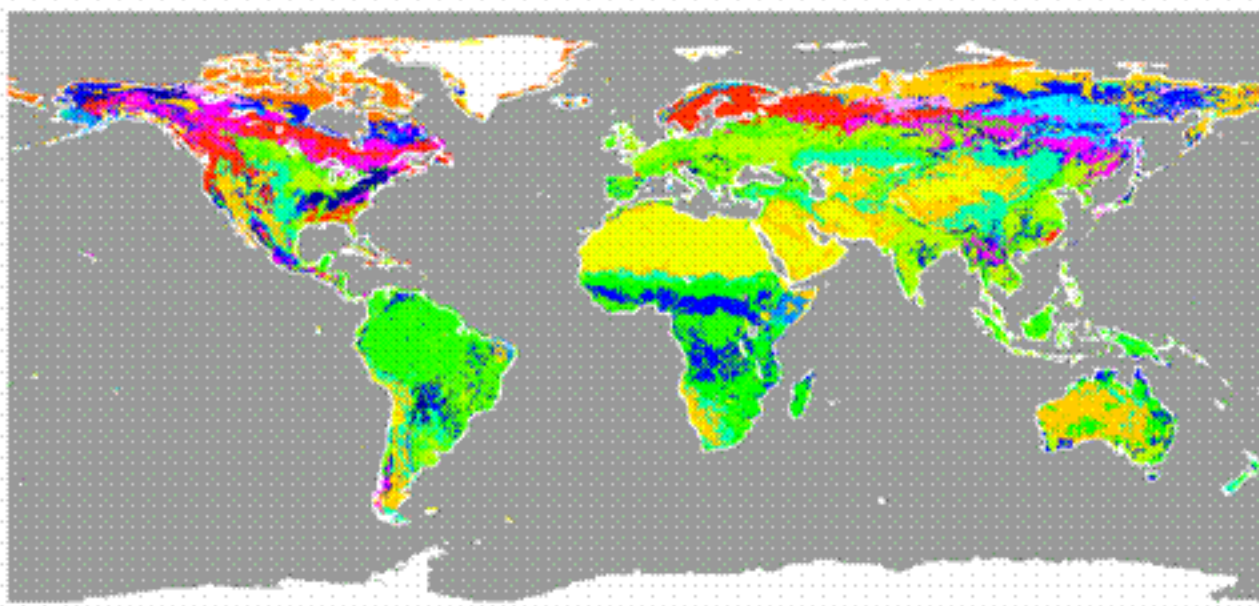


Instantaneous Albedos
(TRMM ADM & Terra ADM)

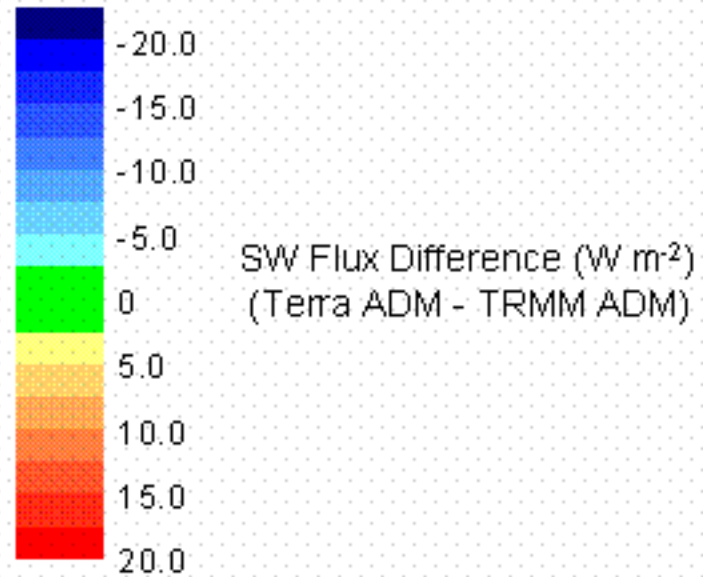
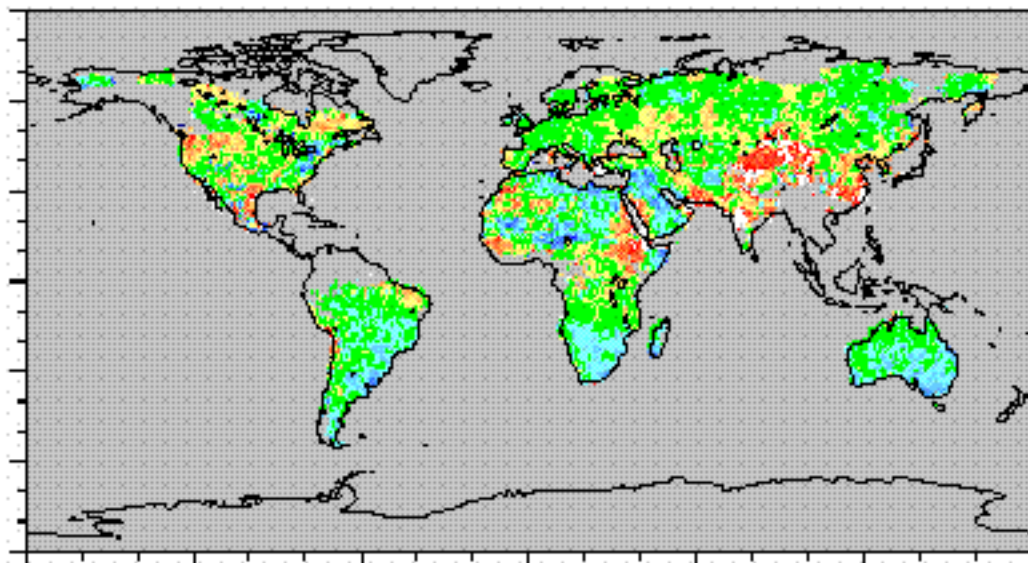


Clear Land SW TOA Flux: Terra, June 2000 (RAP+FAP)

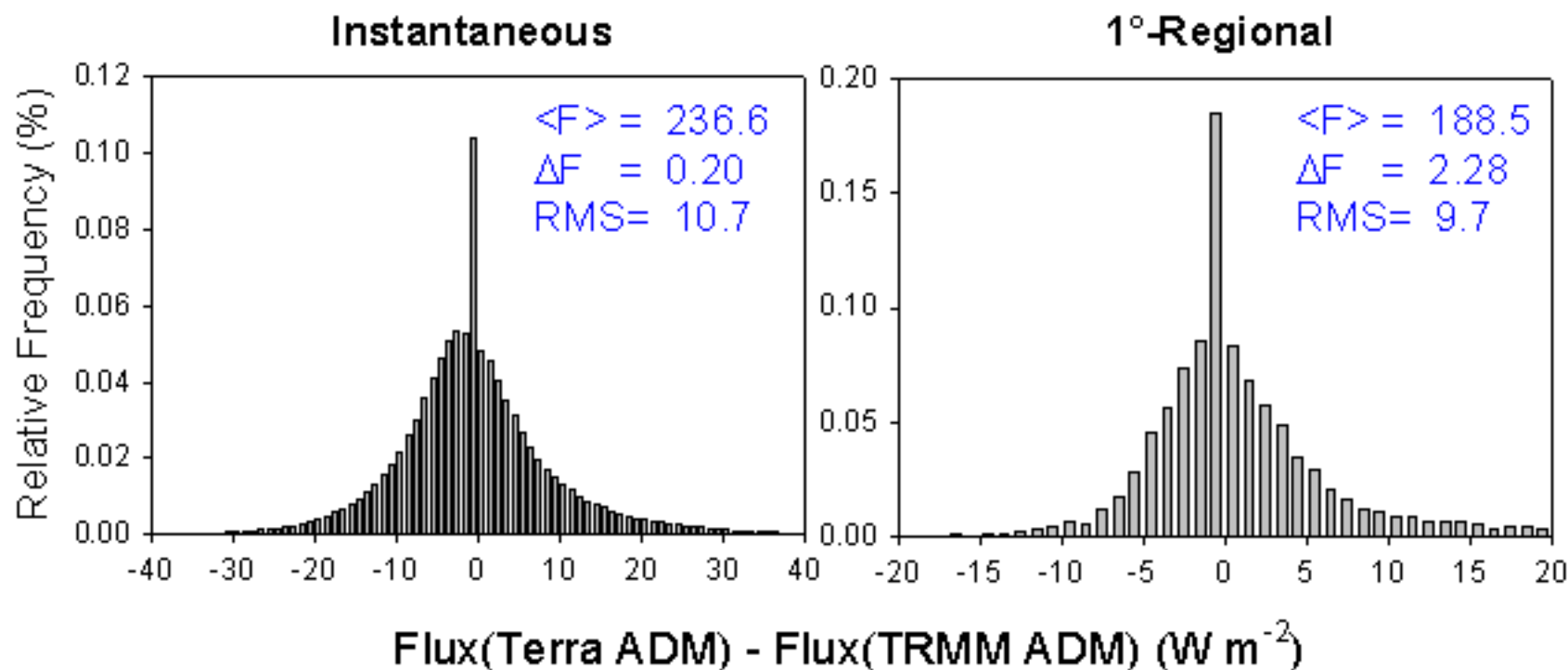




- Evergreen Needleleaf Forest
- Evergreen Broadleaf Forest
- Deciduous Needleleaf Forest
- Deciduous Broadleaf Forest
- Mixed Forest
- Closed Shrublands
- Open Shrublands
- Woody Savannas
- Savannas
- Grasslands
- Permanent Wetlands
- Croplands
- Urban
- Cropland/Natural Vegetation Mosaic
- Snow and Ice
- Barren/Desert
- Water Bodies
- Tundra



Clear Land SW TOA Flux Differences (June, 2000; RAP+FAP)



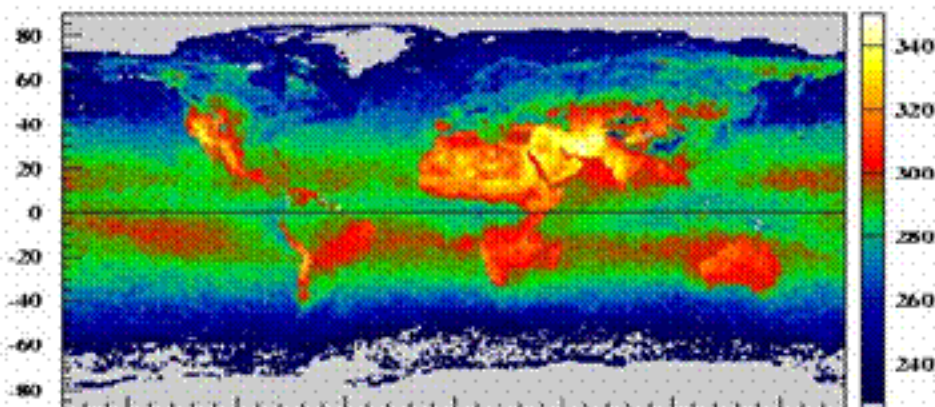
Terra LW ADMs – Clear Ocean, Land & Desert

See Manalo-Smith ADM WG Presentation

Longwave and Window ADM Scene Types for Clear Scenes

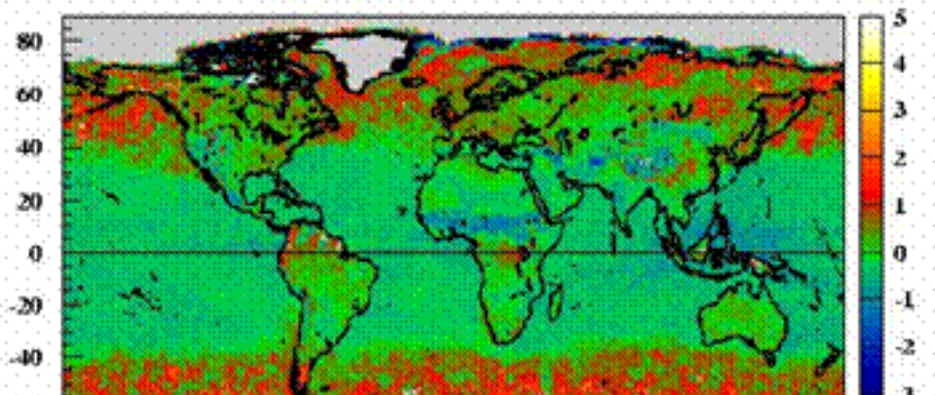
| Scene Type Parameters | TRMM | Terra |
|-----------------------------|--|---|
| Surface Type | Ocean Land Desert | Ocean Forest, Cropland/Grass, Savanna, Bright Desert, Dark Desert |
| Precipitable Water | Intervals (Percentile) ≤33 33 – 66 ≥ 66 | Intervals (cm) ≤1 1 - 3 3 - 5 > 5 |
| Vertical Temperature Change | Intervals (Percentiles) Inversion ($\Delta T < 0$) 0-25 25-50 50-75 >75 | Intervals ($^{\circ}\text{C}$) < 15 15 – 30 30 – 45 > 45 |
| Skin Temperature | | Intervals ($^{\circ}\text{K}$) < 270 270 – 290 290 – 310 310 – 330 > 330 |

Clear-Sky LW TOA Flux: Terra, 422 Days (RAP+FAP)



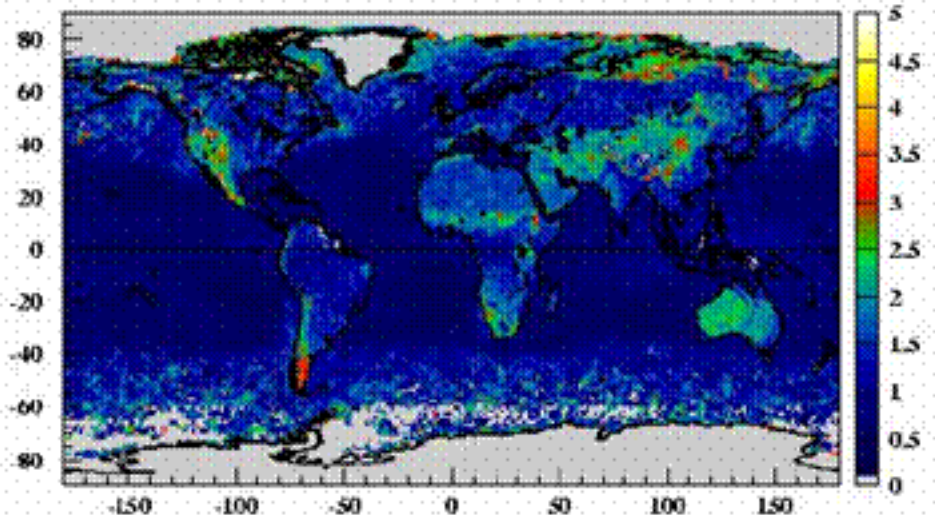
LW Flux ($W m^{-2}$)
(TRMM ADM)

Mean = $298.62 W m^{-2}$



LW Flux Difference ($W m^{-2}$)
(Terra ADM - TRMM ADM)

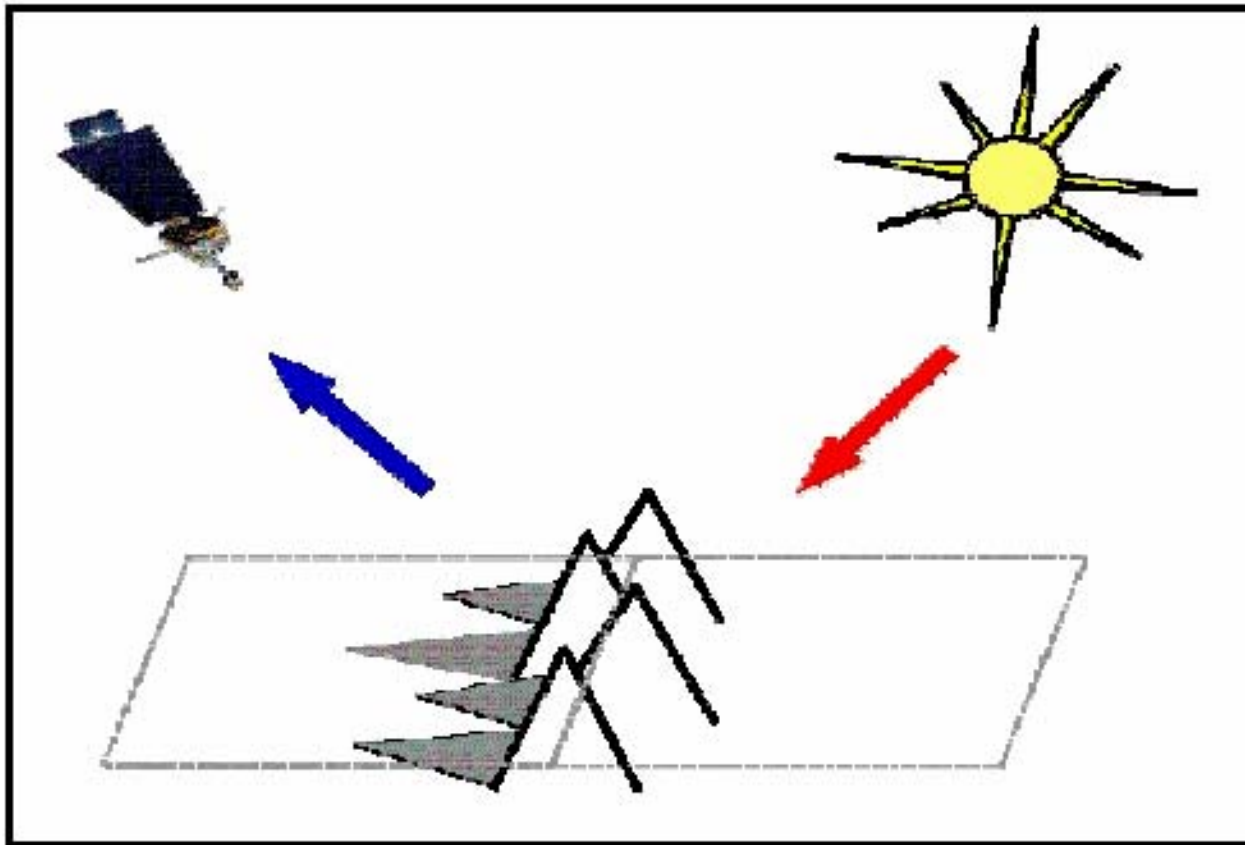
Mean Difference = $-0.118 W m^{-2}$



LW Flux RMS Difference ($W m^{-2}$)
(Terra ADM - TRMM ADM)

RMS = $1.507 W m^{-2}$

Azimuthally-Dependent LW ADMs – Clear Land



Notice that the unlit side can be cooler because of shadowing.

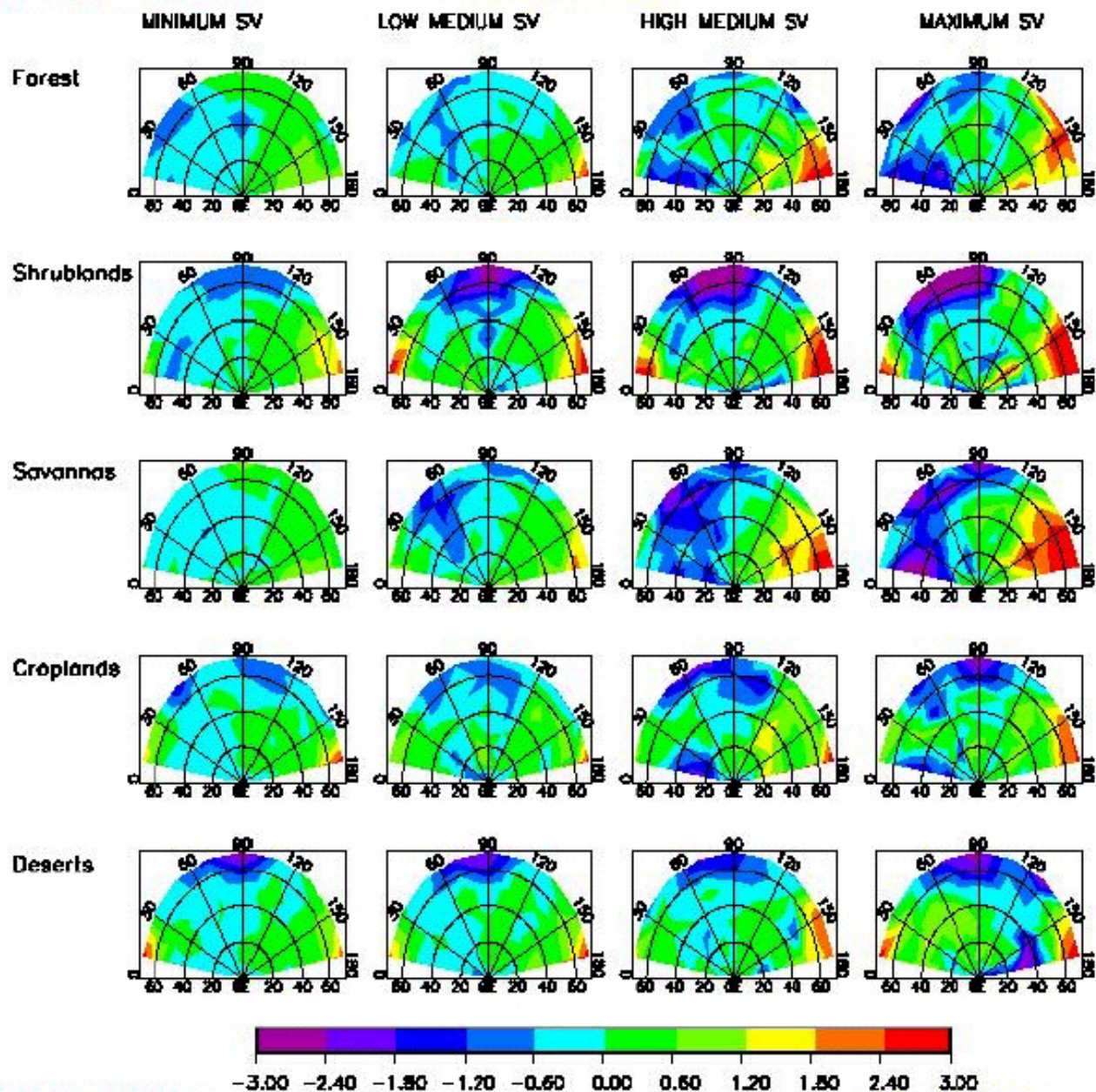
Forward scatter
Colder temperature measured

Back scatter
Warmer temperature measured

See Arvind Gambheer ADM WG Presentation

SV = Surface Variability

TRMM (LW RAD)



CLEAR & LCT-2

37 S to 37 N

Terra LW ADMs – Clouds Over Ocean

Terra LW ADMs – Clouds Over Ocean

-For Intervals of:

- i) precipitable water (4 intervals)
- ii) skin temperature (5 intervals)
- iii) surface-cloud temp difference (5 intervals)

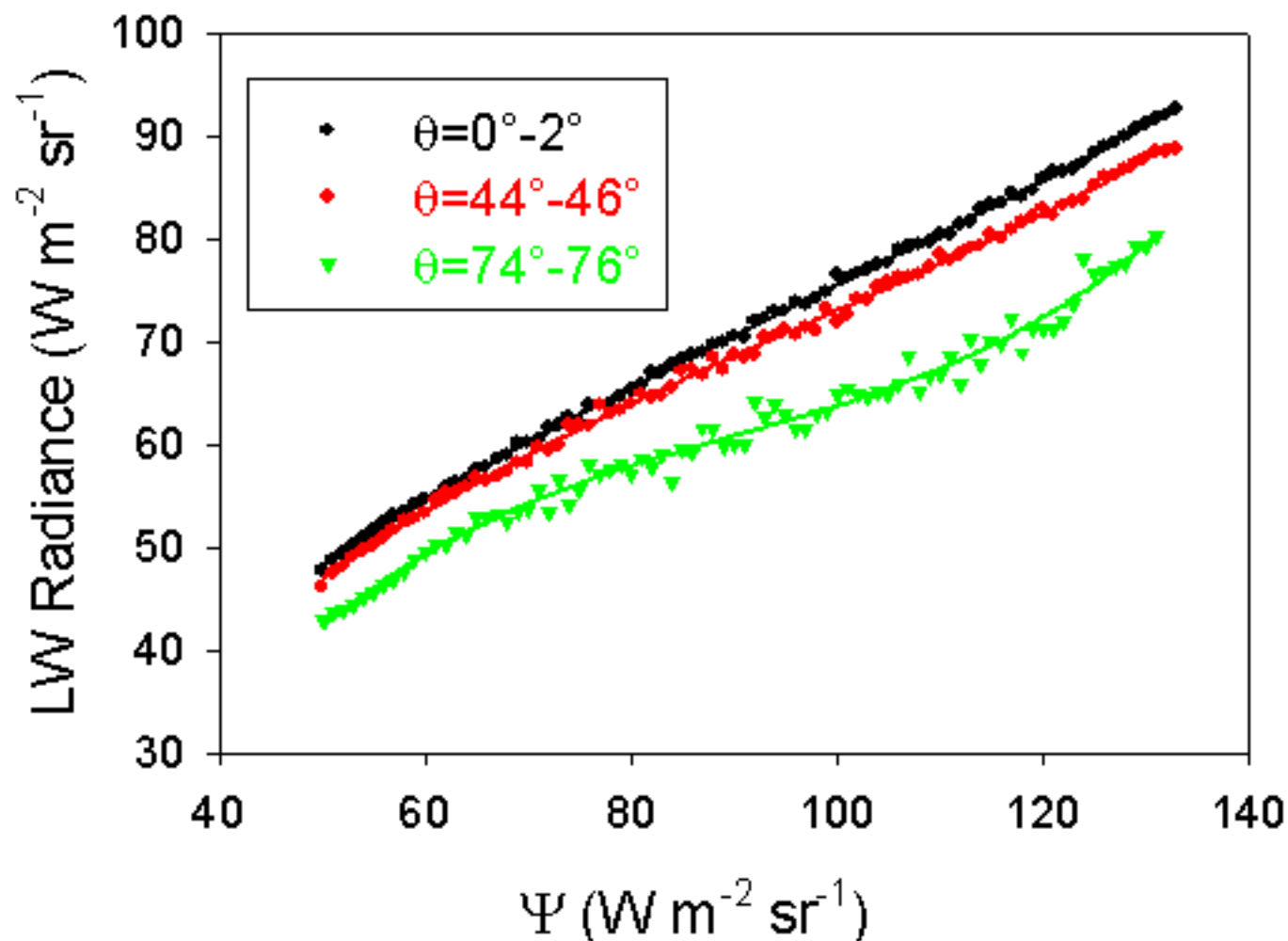
Derive functional fits between in 2° viewing zenith angle bins between CERES LW radiances and the parameter ψ defined by:

$$\psi(\Delta w, \Delta z_t; f, \epsilon_s, T_s, \epsilon_c, T_c) = (1 - f)\epsilon_s B(T_s) + \sum_{j=1}^2 \left(\epsilon_s B(T_s) [1 - \epsilon_{c_j}(\theta)] + \epsilon_{c_j}(\theta) B(T_{c_j}) \right) f_j$$

$$\epsilon_c(\theta) = 1 - e^{\tau_a / \cos \theta}; \quad f = f_1 + f_2$$

LW Radiance vs Ψ

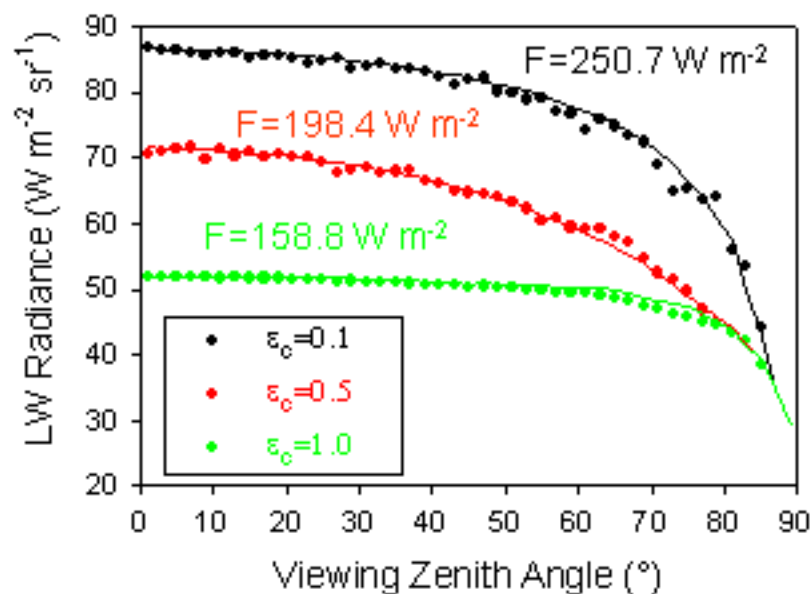
($290^\circ\text{K} < T_s < 295^\circ\text{K}$; $55^\circ\text{K} < T_s - T_c < 60^\circ\text{K}$)



$$\psi(\Delta w, \Delta z_i; f, \epsilon_s, T_s, \epsilon_c, T_c) = (1-f)\epsilon_s B(T_s) + \sum_{j=1}^4 \left(\epsilon_s B(T_s)(1-\epsilon_{c_j}) + \epsilon_{c_j} B(T_{c_j}) \right) f_j$$

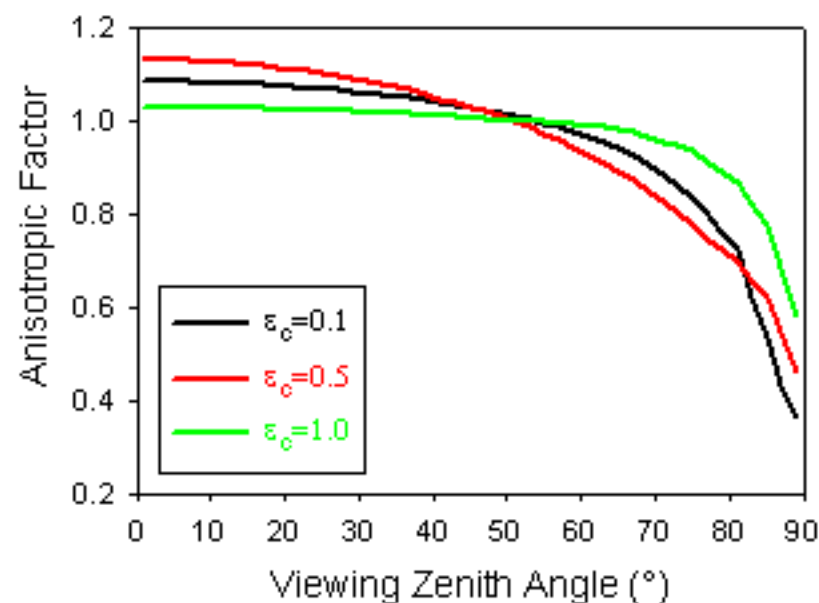
LW Radiance vs θ

($\neq 1.0$; $290^\circ\text{K} < T_S < 295^\circ\text{K}$; $55^\circ\text{K} < T_S - T_C < 60^\circ\text{K}$)

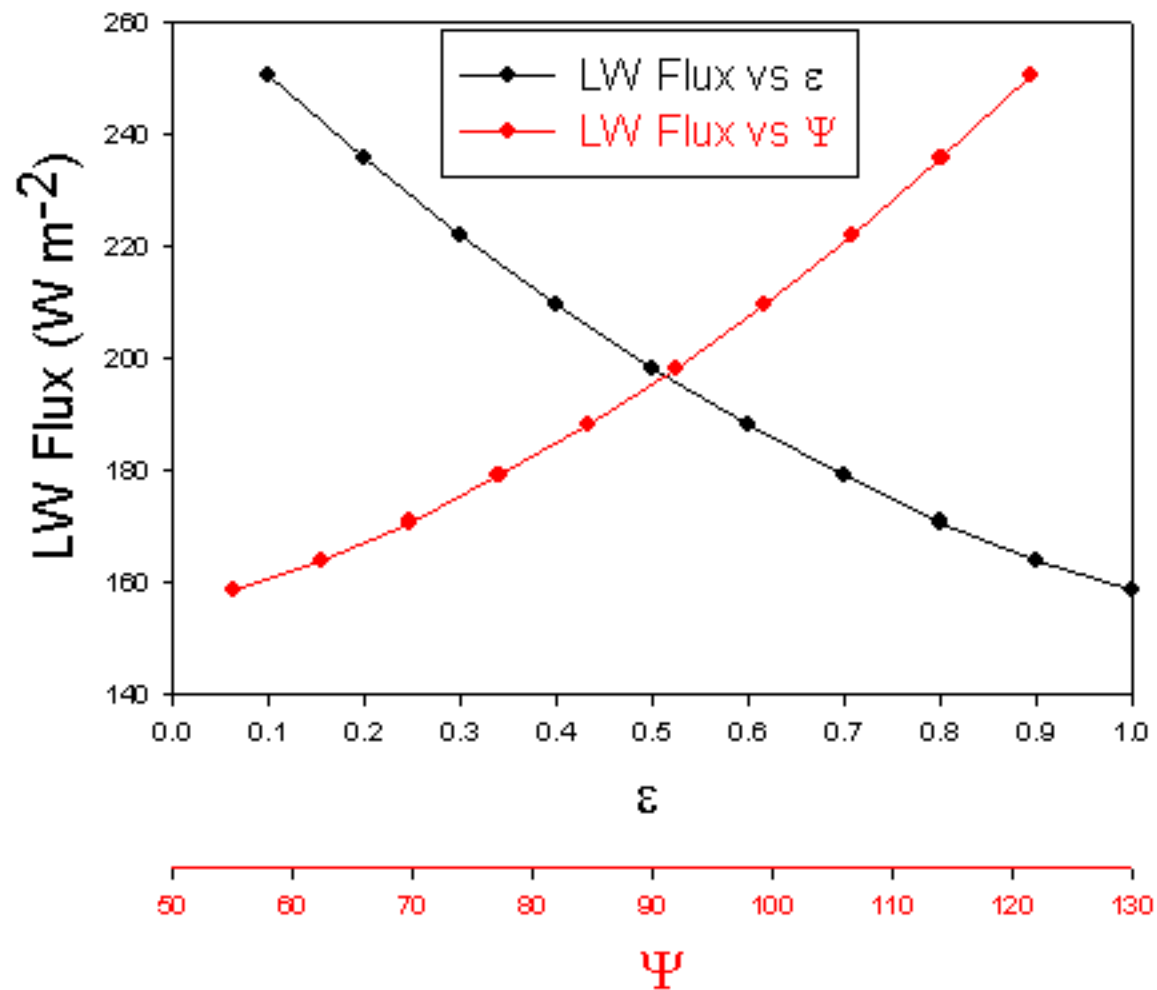


LWADM vs θ

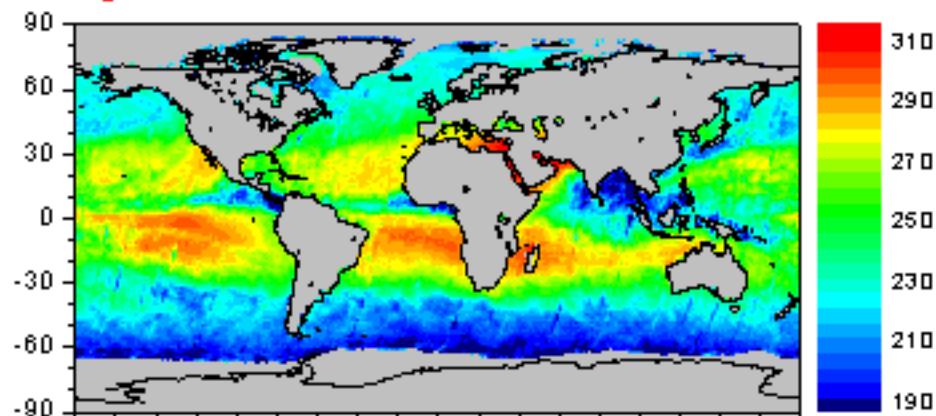
($\neq 1.0$; $290^\circ\text{K} < T_S < 295^\circ\text{K}$; $55^\circ\text{K} < T_S - T_C < 60^\circ\text{K}$)



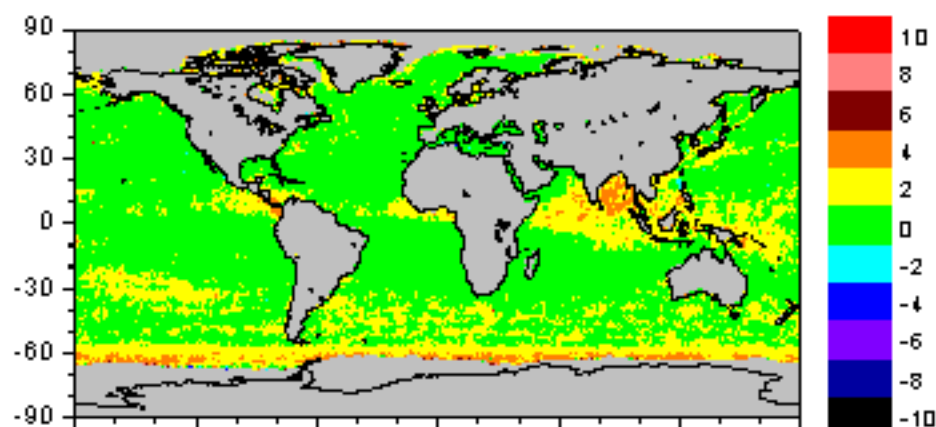
LW Flux vs Cloud Emissivity and Ψ
($f=1.0$; $290^{\circ}\text{K} < T_s < 295^{\circ}\text{K}$; $55^{\circ}\text{K} < T_s - T_c < 60^{\circ}\text{K}$)



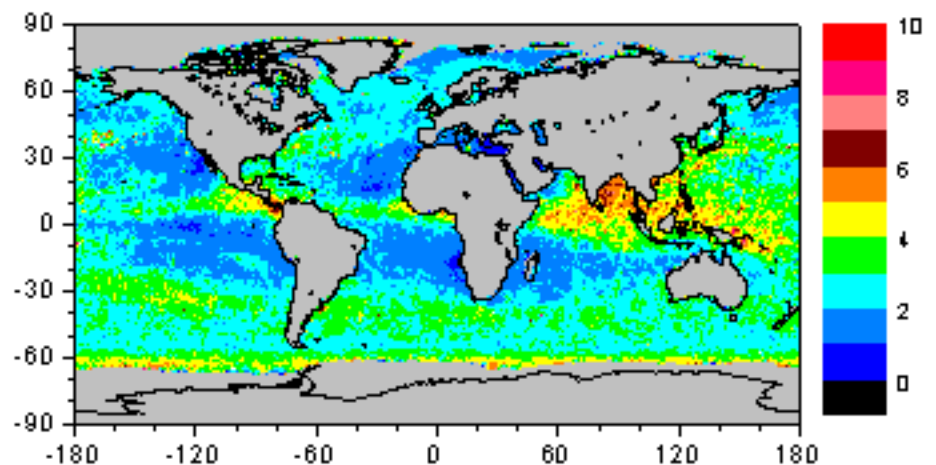
All-Sky Ocean LW TOA Flux: Terra, June 2000 (RAP+FAP)



LW Flux ($W m^{-2}$)
(TRMM ADM)



LW Flux Difference ($W m^{-2}$)
(Terra ADM - TRMM ADM)

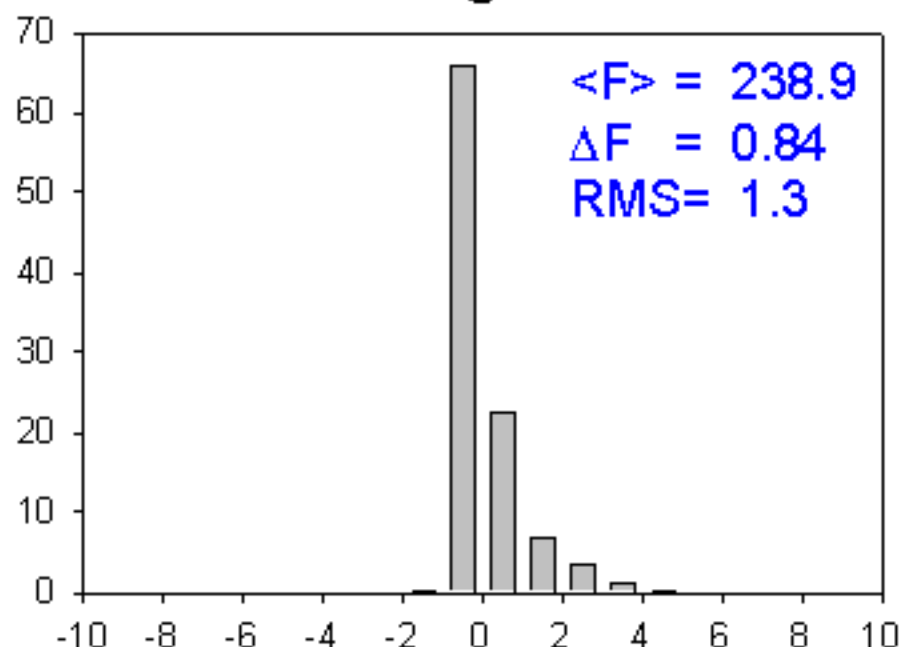
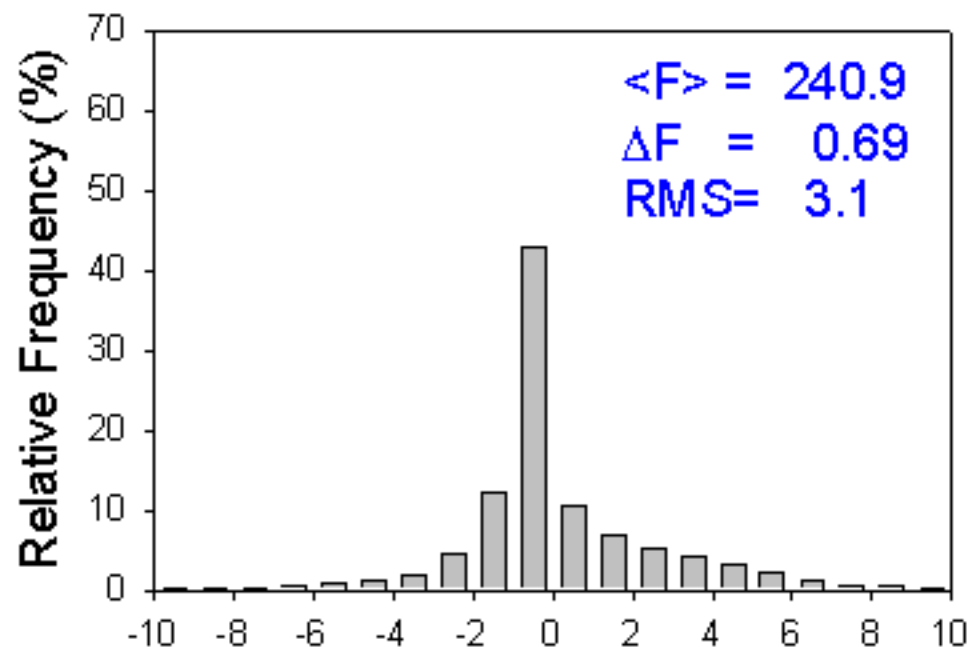


LW Flux RMS Difference ($W m^{-2}$)
(Terra ADM - TRMM ADM)

All-Sky Ocean LW TOA Flux Differences (June, 2000; RAP+FAP)

Instantaneous

1°-Regional



Flux(Terra ADM) - Flux(TRMM ADM) ($W m^{-2}$)

Snow, Sea Ice & Fresh Snow

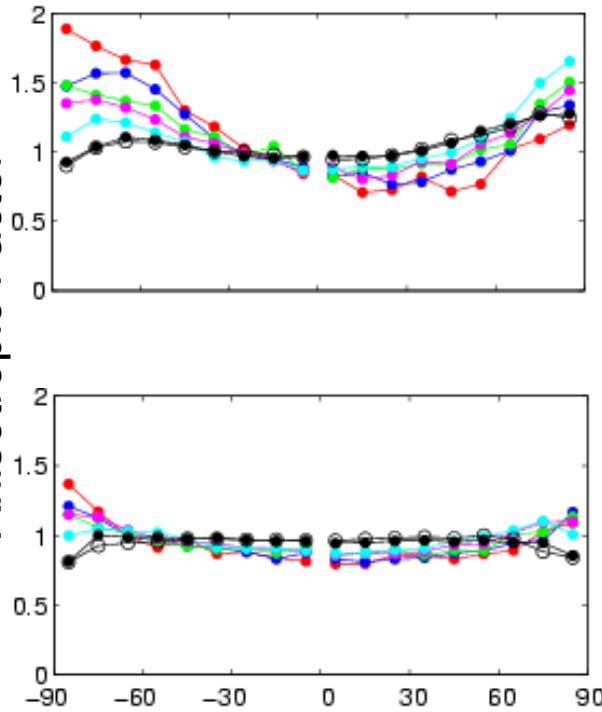
Terra SW & LW ADMs – Snow, Sea-Ice

| | Shortwave | Longwave |
|--------------------------------------|--|---|
| Permanent Snow SW (8) LW (132) | Cloud Fraction (6) Cloud (2) | Cloud Fraction (6) Tsfc (6) Tsfc-Tcld (5) |
| Fresh Snow SW(23) LW(132) | Cloud Fraction (6) Snow Fraction (6) Snow (2), Cloud (2) | Cloud Fraction (6) Tsfc (6) Tsfc-Tcld (5) |
| Sea Ice SW (23) LW (132) | Cloud Fraction (6) Ice Fraction (6) Ice (2), Cloud (2) | Cloud Fraction (6) Tsfc (6) Tsfc-Tcld (5) |

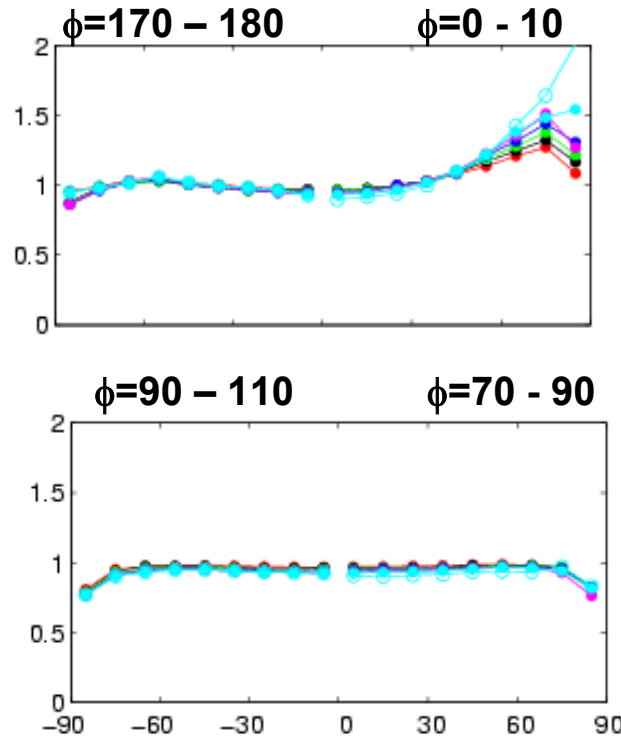
See Seiji Kato ADM WG Presentation

Sample SW ADMs: $\theta_0 = 55^\circ - 60^\circ$

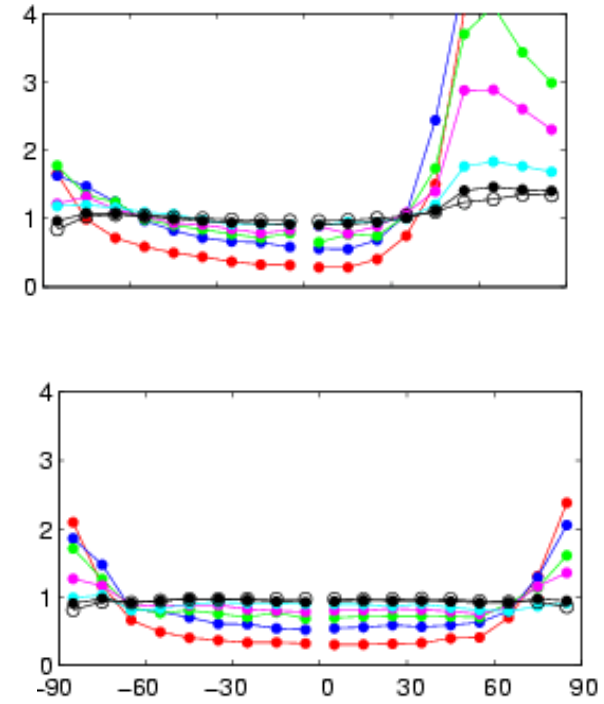
Fresh Snow



Permanent Snow



Sea Ice



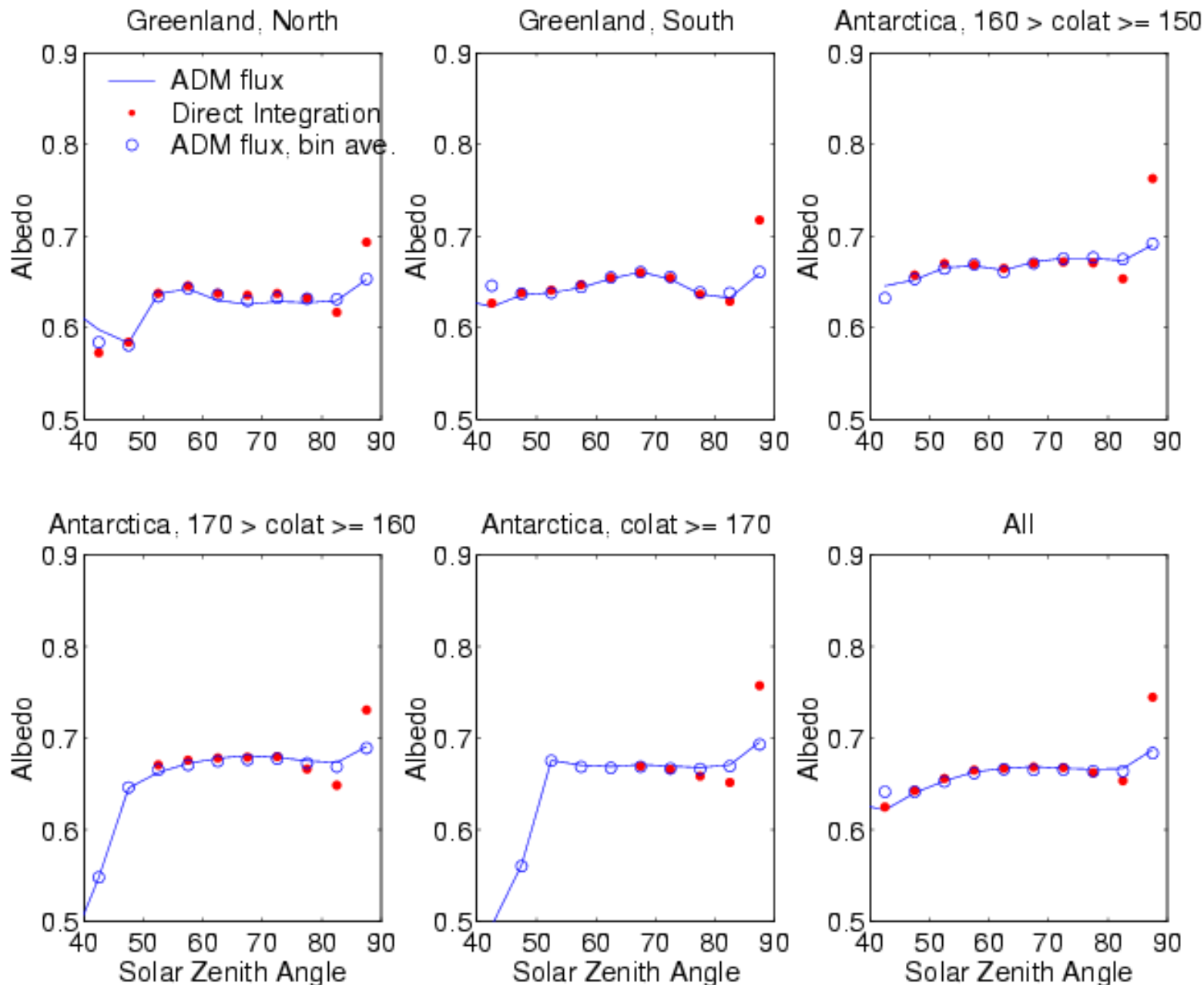
Viewing Zenith Angle ($^\circ$)

- Snow $\leq 1\%$
- $1\% < \text{Snow} \leq 25\%$
- $25\% < \text{Snow} \leq 50\%$
- $50\% < \text{Snow} \leq 75\%$
- $75\% < \text{Snow} \leq 99\%$
- $99\% < \text{Bright Snow}$
- $99\% < \text{Dark Snow}$

- Cloud Fraction < 0.001
- $0.001 \leq \text{Cloud Fraction} < 0.250$
- $0.250 \leq \text{Cloud Fraction} < 0.500$
- $0.500 \leq \text{Cloud Fraction} < 0.750$
- $0.750 \leq \text{Cloud Fraction} < 0.999$
- $0.999 \leq \text{Cloud Fraction}, \tau \leq 10$
- $0.999 \leq \text{Cloud Fraction}, \tau > 10$

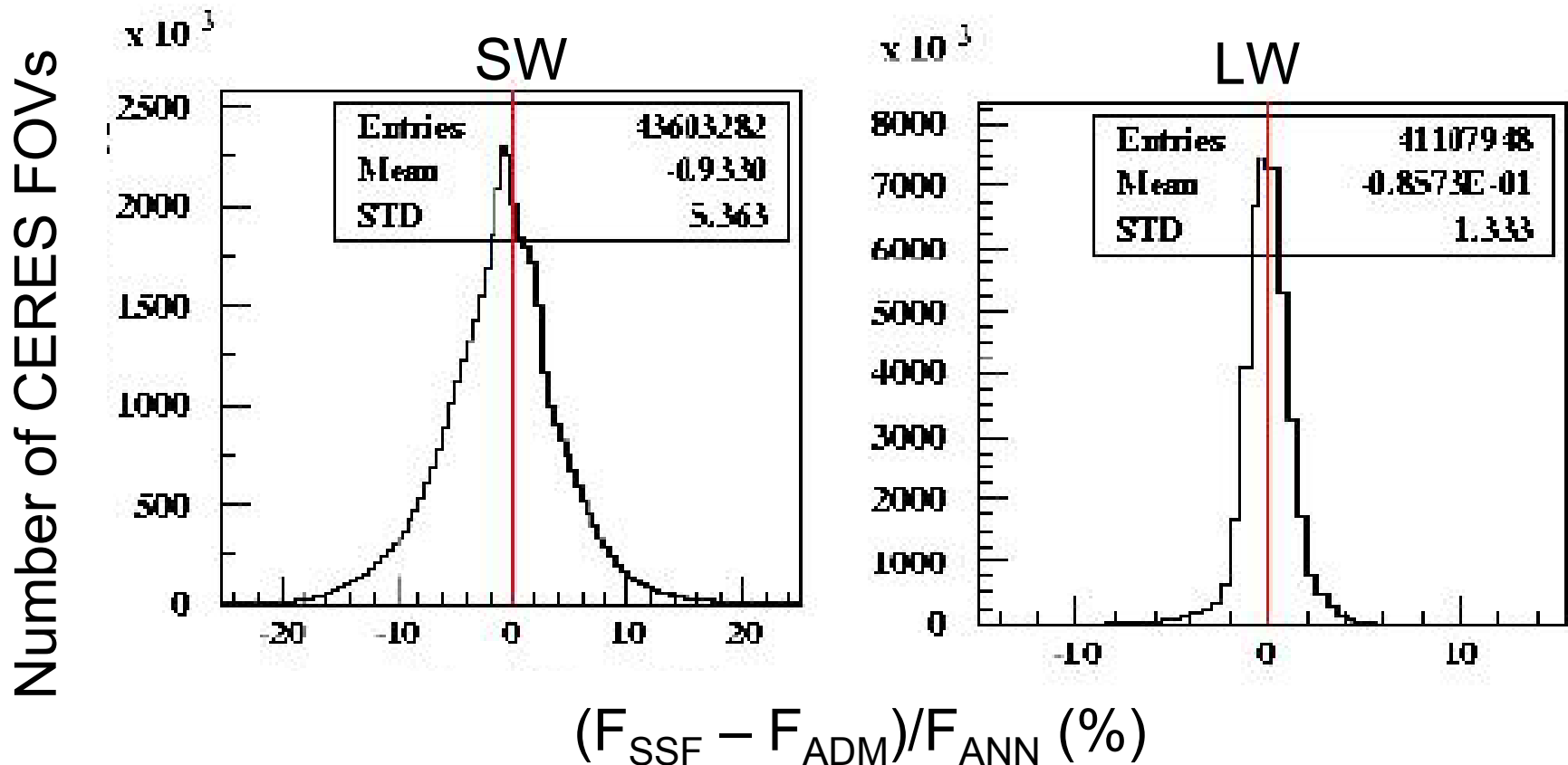
- Ice $\leq 1\%$
- $1\% < \text{Ice} \leq 25\%$
- $25\% < \text{Ice} \leq 50\%$
- $50\% < \text{Ice} \leq 75\%$
- $75\% < \text{Ice} \leq 99\%$
- $99\% < \text{Bright Ice}$
- $99\% < \text{Dark Ice}$

TOA Albedo Direct Integration Tests: Snow



Use of Neural Network Scheme to Predict TOA Fluxes

- Determine TOA fluxes when imager information is unavailable or too many pixels have no cloud retrieval.
- Train neural network with TRMM ADMs to predict TOA fluxes using only CERES SW, LW & WN radiances and ECMWF parameters.



See Konstantin Loukachine ADM WG Presentation

Conclusions

- Early results from Terra ADMs look promising. Improvement over TRMM ADMs especially outside of Tropics.
- Final Terra ADMs expected to be completed in September, 2003.
- More work needed to evaluate quality of 1°-resolution SW clear land ADMs and fits for ocean LW ADMs.
- SW and LW ADMs yet to be developed for clouds over land and desert.