

Determining the daytime Earth's shortwave fluxes from DSCOVR



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Objectives of the project

- Produce global daytime mean fluxes from radiances observed by NISTAR and EPIC (Su et al., 2018, 2020, 2021)
 - Determine the global daytime mean SW and LW anisotropic factors (Su et al., 2018)
 - Use EPIC cloud composite data for scene identification (Khlopenkov et al., 2017), and for evaluating EPIC cloud product (Yang et al., 2019)
- Evaluate the global climate models using the high-temporal-resolution fluxes (Carlson et al., 2019, 2021, Feldman et al., 2021, Lacis et al., 2021)
- Calibrate EPIC visible channels using MODIS, VIIRS, and invariant targets (Doelling et al., 2019, Haney et al., 2016, 2021)

Global daytime mean radiances from NISTAR and EPIC

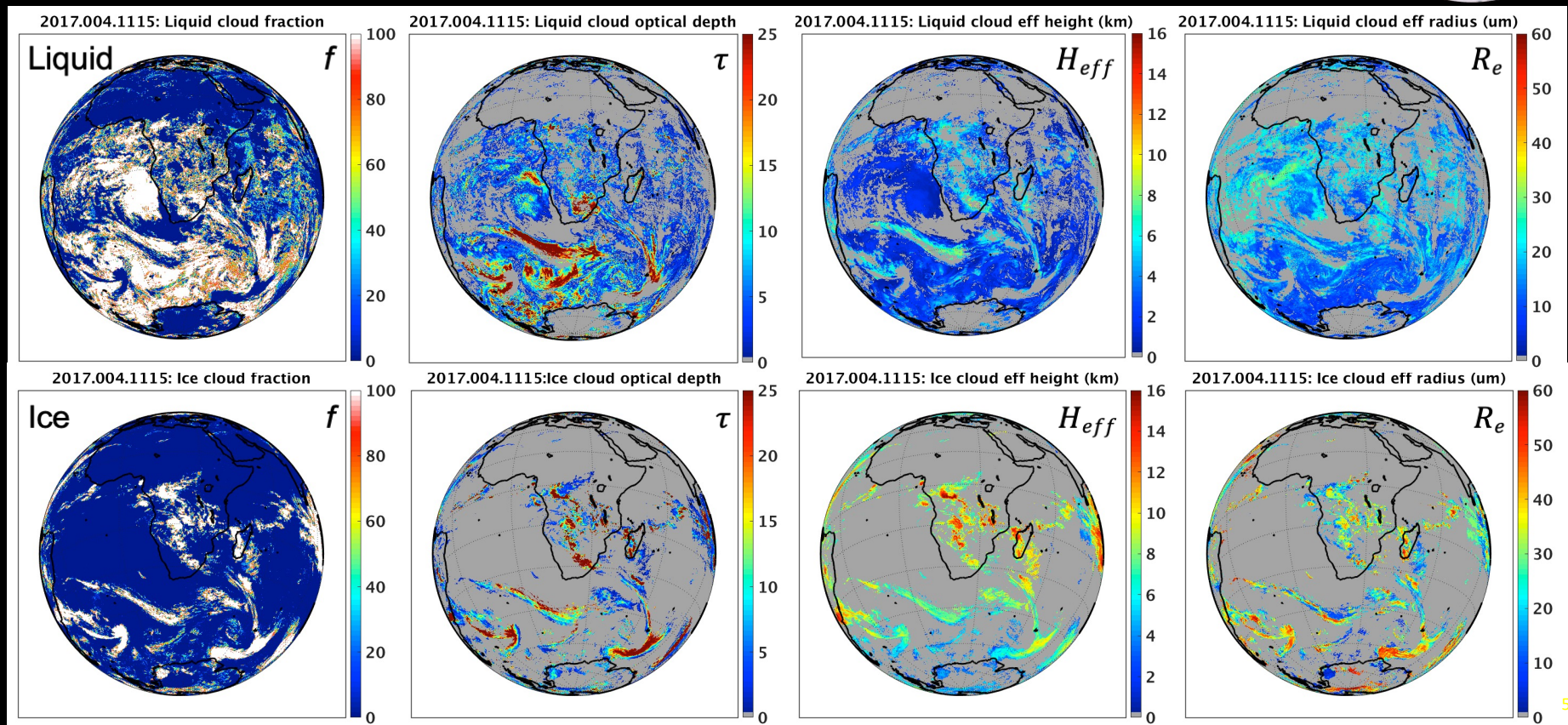
- NISTAR provides continuous broadband radiance measurements for the shortwave and total channels from the sunlit side of the Earth as a single pixel.
- EPIC provides 10 narrow band spectral images of the entire sunlit side of the Earth using a 2048x2048 pixel CCD (Charge Coupled Device) detector.
 - Use the EPIC narrowband channels of blue, green, and red to derive the shortwave (SW) broadband reflectance (Su et al., 2018).
 - Narrowband to broadband (NB2BB) regression coefficients are developed based upon collocated MODIS and CERES data for all-sky conditions separately for ocean and non-ocean surfaces using corresponding MODIS channels.
 - Apply these relationships to EPIC 443, 551, and 680nm channels to derive EPIC broadband radiance (I_e^{bb}) for each pixel.
 - EPIC pixel-level broadband SW radiances are averaged to calculate the global daytime mean shortwave radiance.

Anisotropy of the TOA radiance field must be considered when converting radiances to fluxes

$$F(\theta_0) = \frac{\pi I_o(\theta_0, \theta, \phi)}{R(\theta_0, \theta, \phi)}$$

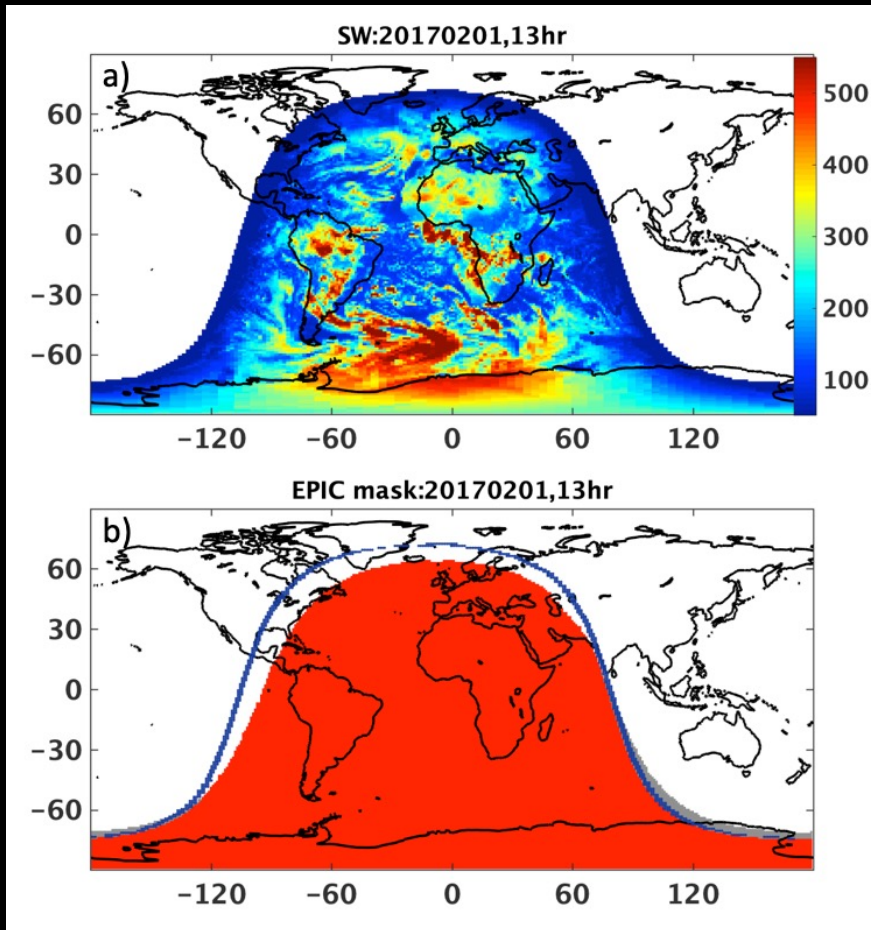
- Using the scene-type dependent CERES empirical angular distribution models (ADMs, Su et al. 2015);
- Scene type is defined based upon many variables: surface type, cloud fraction, cloud optical depth, cloud phase, wind speed, etc.;
- Low spatial resolution of EPIC imagery (20x20 km²) and its lack of infrared channels diminish its capability to identify clouds and to accurately retrieve cloud properties;
- To determine the scene type for each EPIC pixel, we take advantage of the cloud property retrievals (Minnis et al. 2008, 2021) from multiple imagers on low Earth orbit (LEO) satellites and on geostationary (GEO) satellites;
- Cloud property retrievals from these LEO/GEO imagers are optimally merged together to provide a seamless global composite product at 5-km resolution.

Global composite data are then remapped into the EPIC field of view by convolving the high-resolution cloud properties with the EPIC point spread function to produce the EPIC composite: an example of 11:15 UTC, 4 Jan. 2017



Comparison between EPIC and CERES SYN fluxes

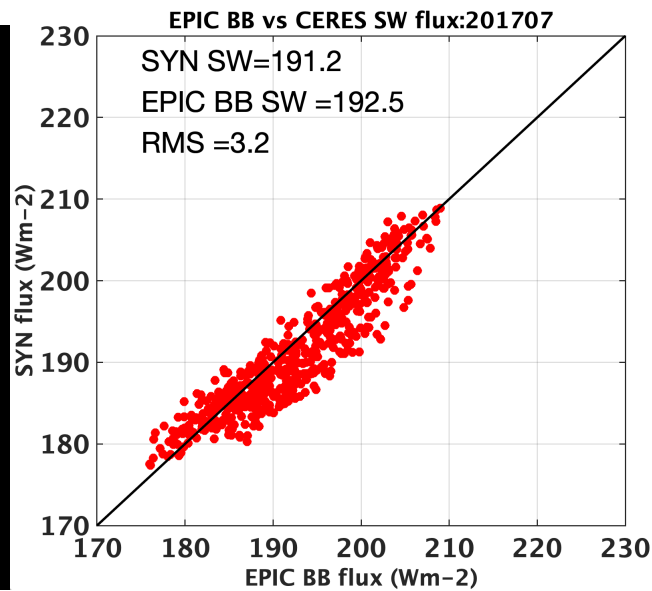
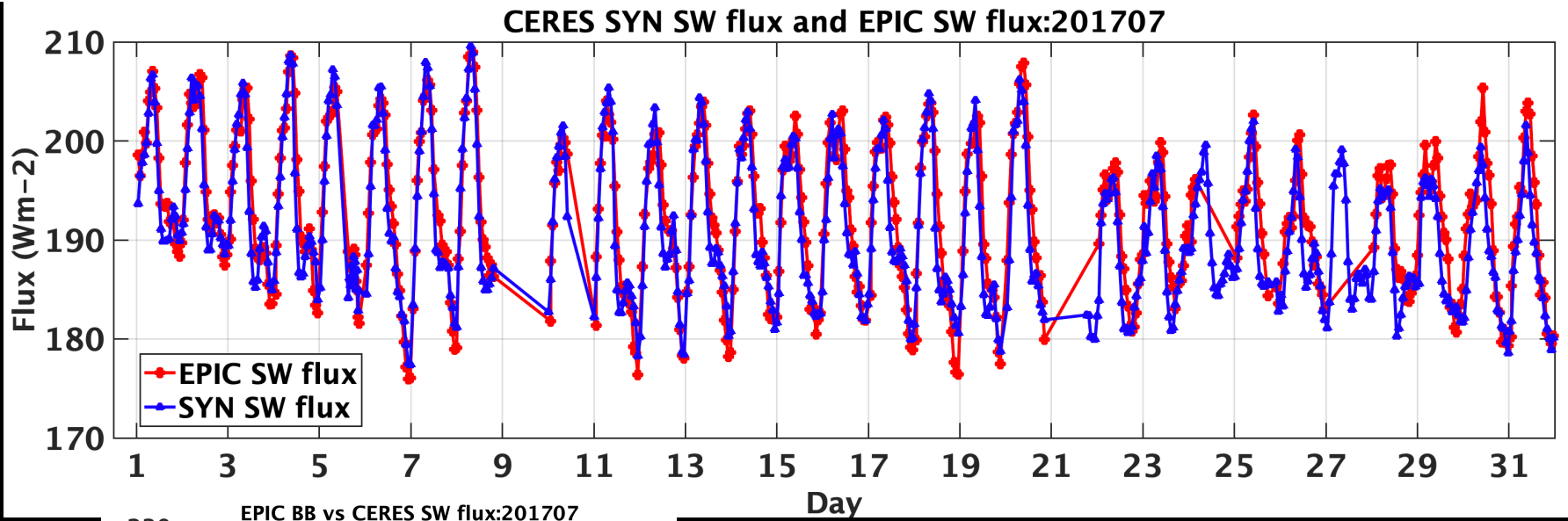
Daytime SW
flux from
CERES SYN



EPIC view mask:
Red: Daytime areas
within EPIC view
Grey: Nighttime
areas within EPIC
view
Blue line: terminator
boundary

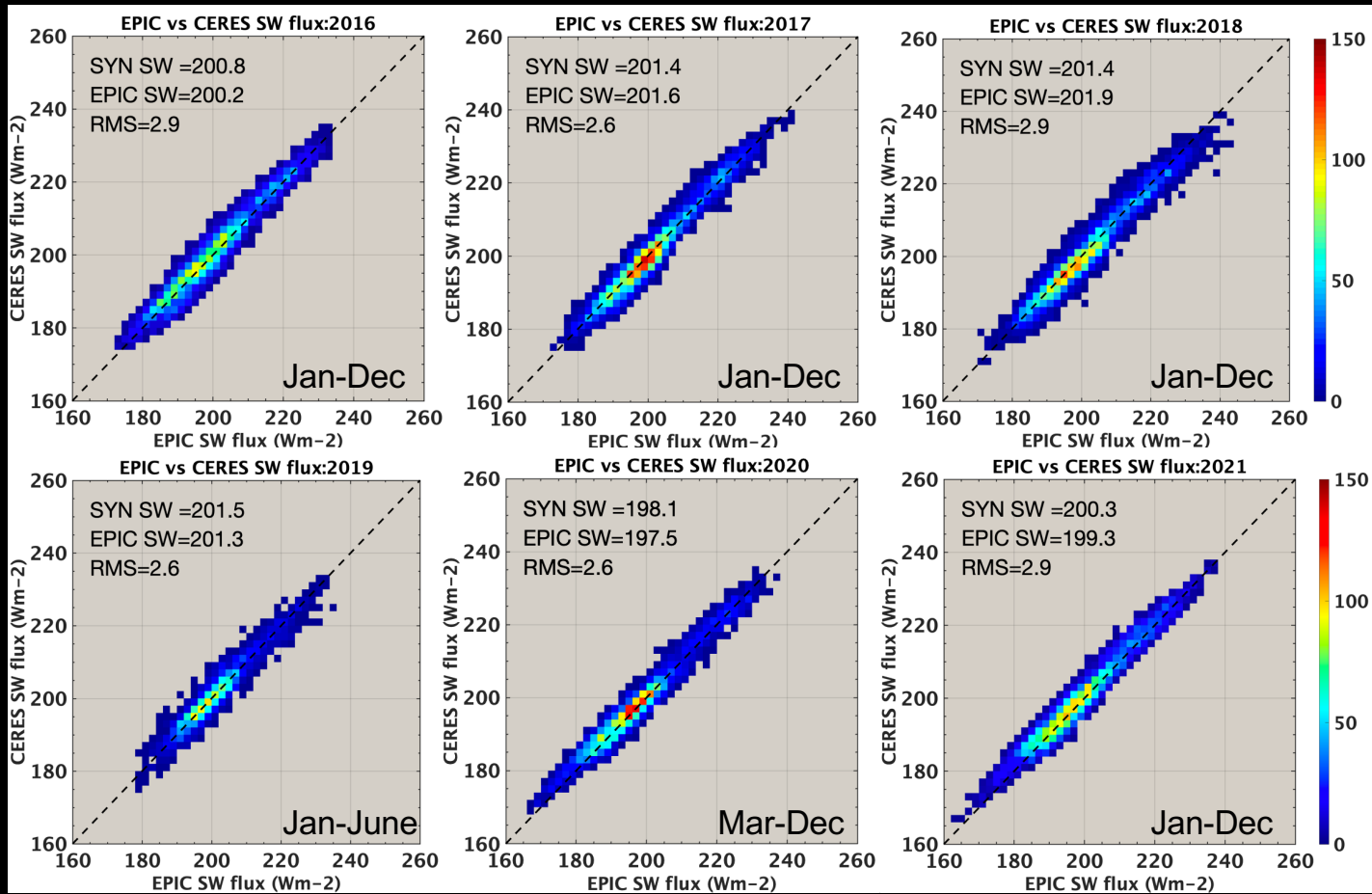
- CERES synoptic product (SYN) also provides hourly TOA SW and LW fluxes;
- To compare the hourly SYN data with EPIC flux, only consider the daytime SYN grid boxes that are visible to EPIC, and these data are weighted by $\cos(\text{latitude})$:

$$\overline{F_{syn}} = \frac{\sum F_j \cos(lat_j) \omega_j}{\sum \cos(lat_j) \omega_j}$$



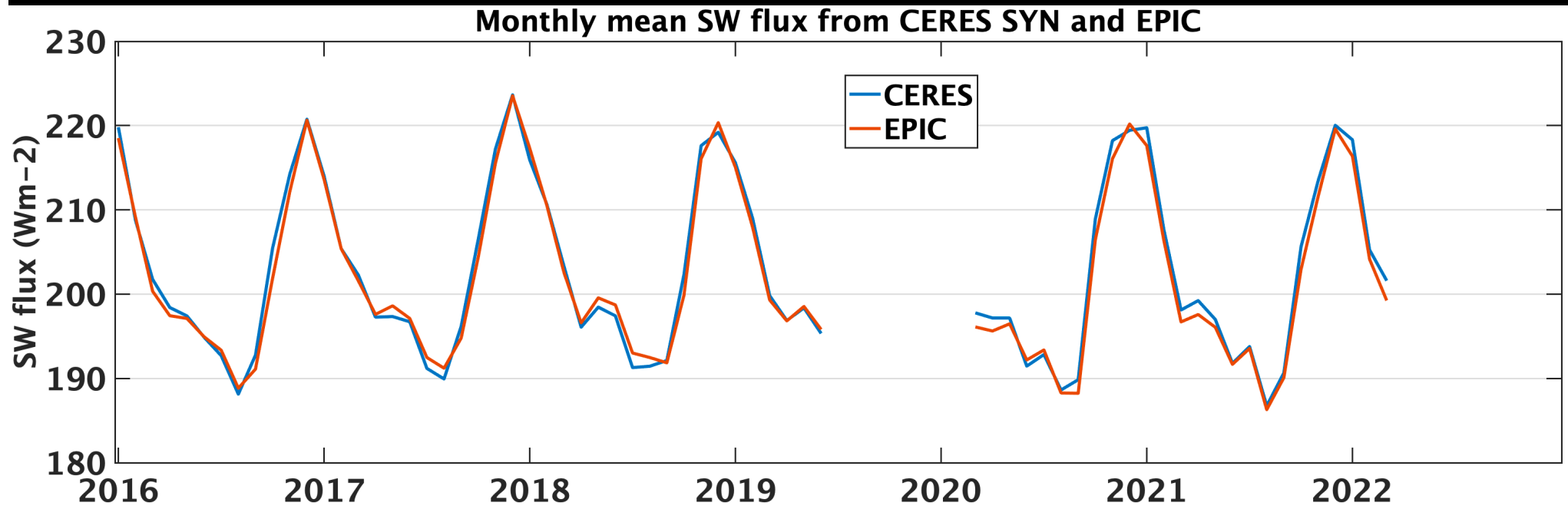
Global daytime SW flux comparison between CERES and EPIC

Hourly gridded CERES synoptic (SYN) SW fluxes are integrated over the areas that are visible to EPIC/NISTAR.



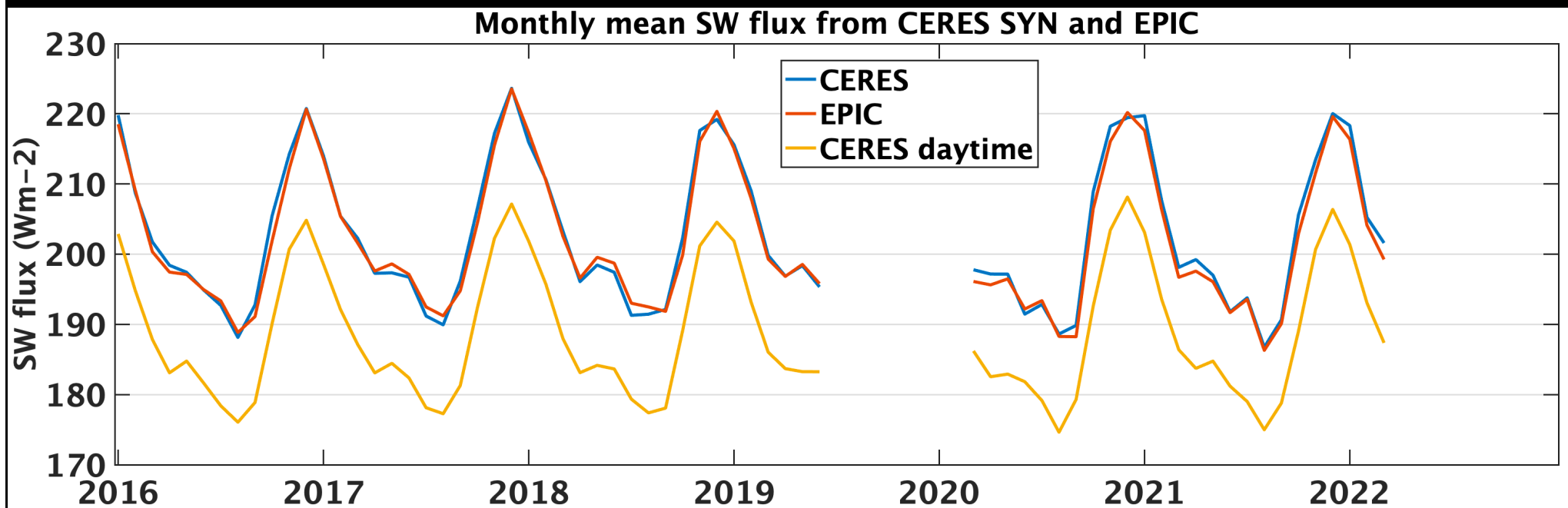
Monthly daytime mean SW fluxes from EPIC and CERES

- Multi-year mean EPIC SW flux is 202.1 Wm⁻²
- Multi-year mean CERES SYN SW flux is 202.6 Wm⁻²
- RMS error is 1.3 Wm⁻²



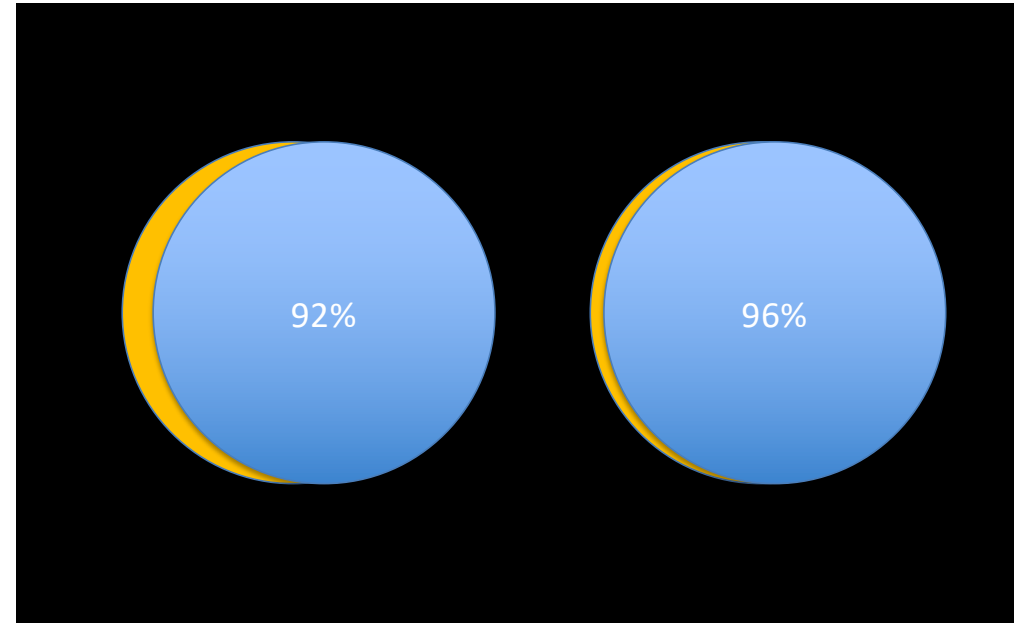
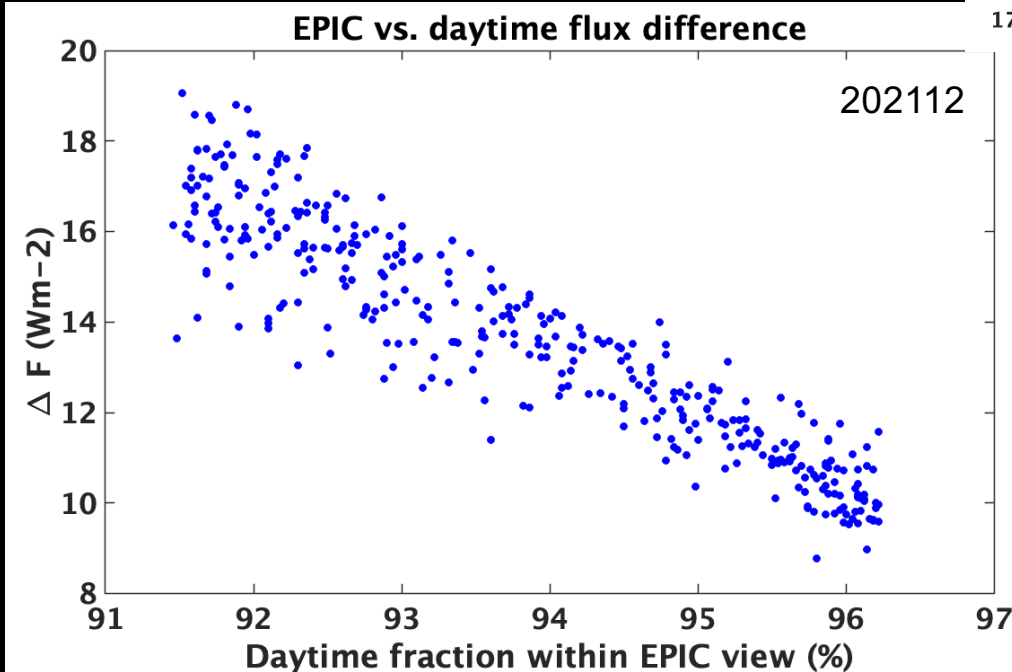
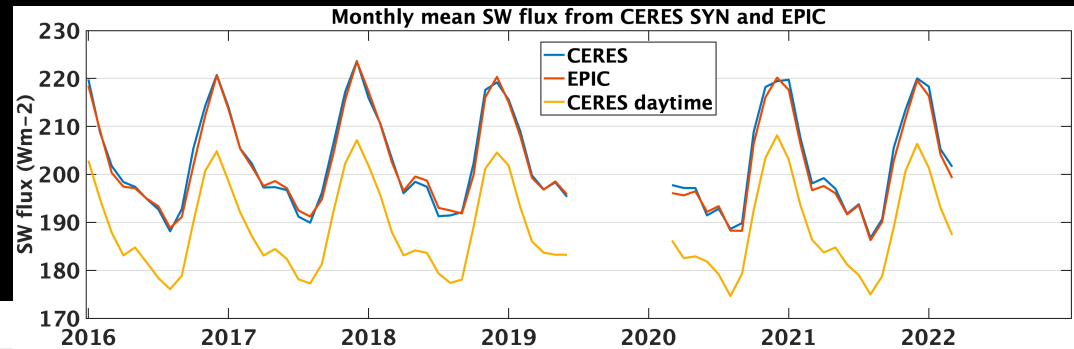
DSCOVR's elliptical Lissajous orbit does not observe the entire daytime portion of the Earth

- Fluxes averaged over the daytime portion of the Earth that are visible from DSCOVR orbit are greater than fluxes averaged over the entire daytime portion of the Earth

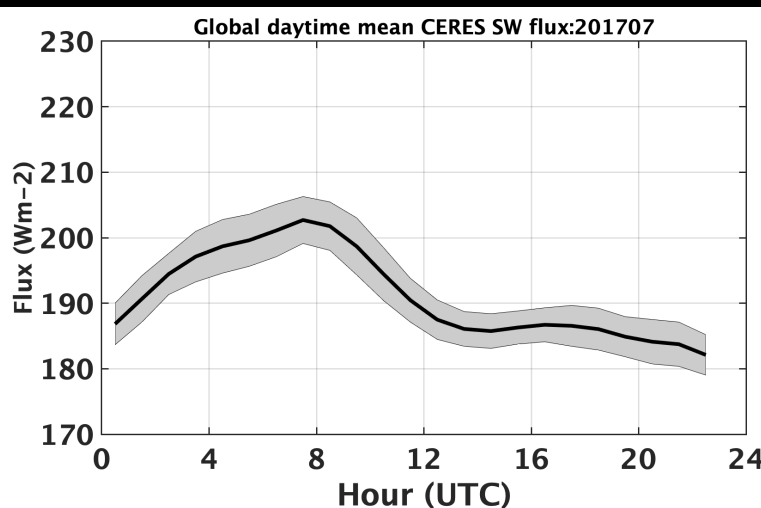
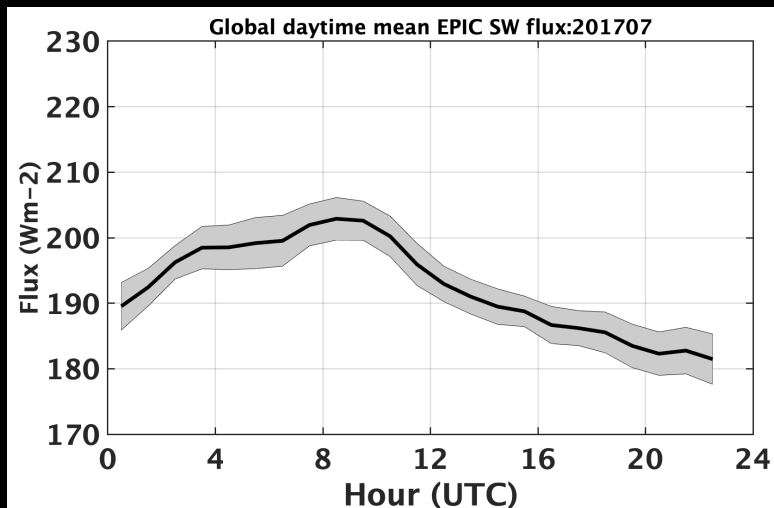
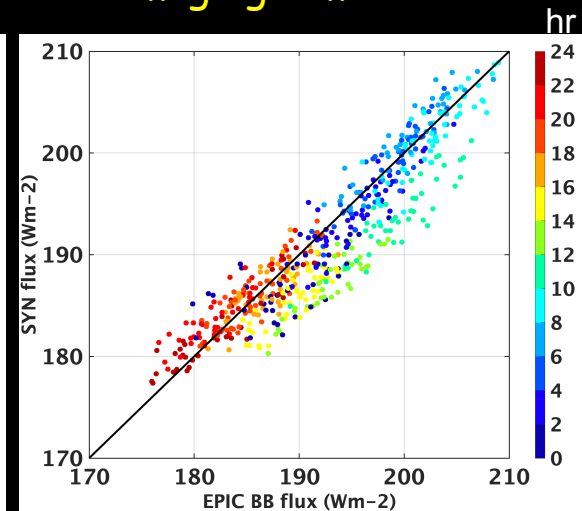
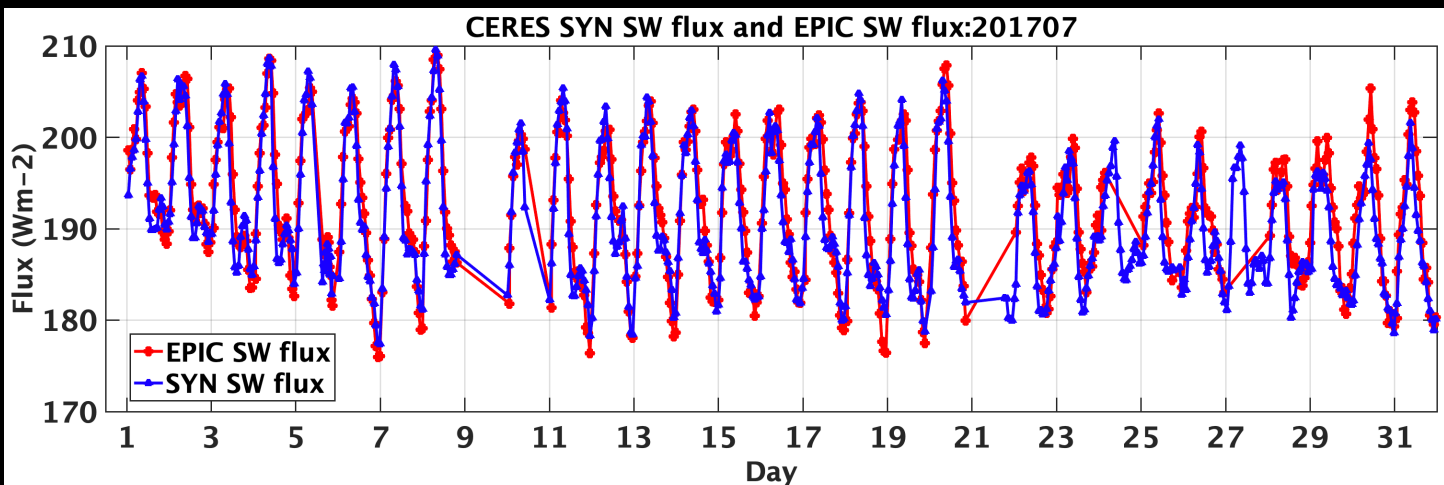


Flux differences between EPIC view and entire daytime view depend on the portion of daytime fraction within the EPIC view

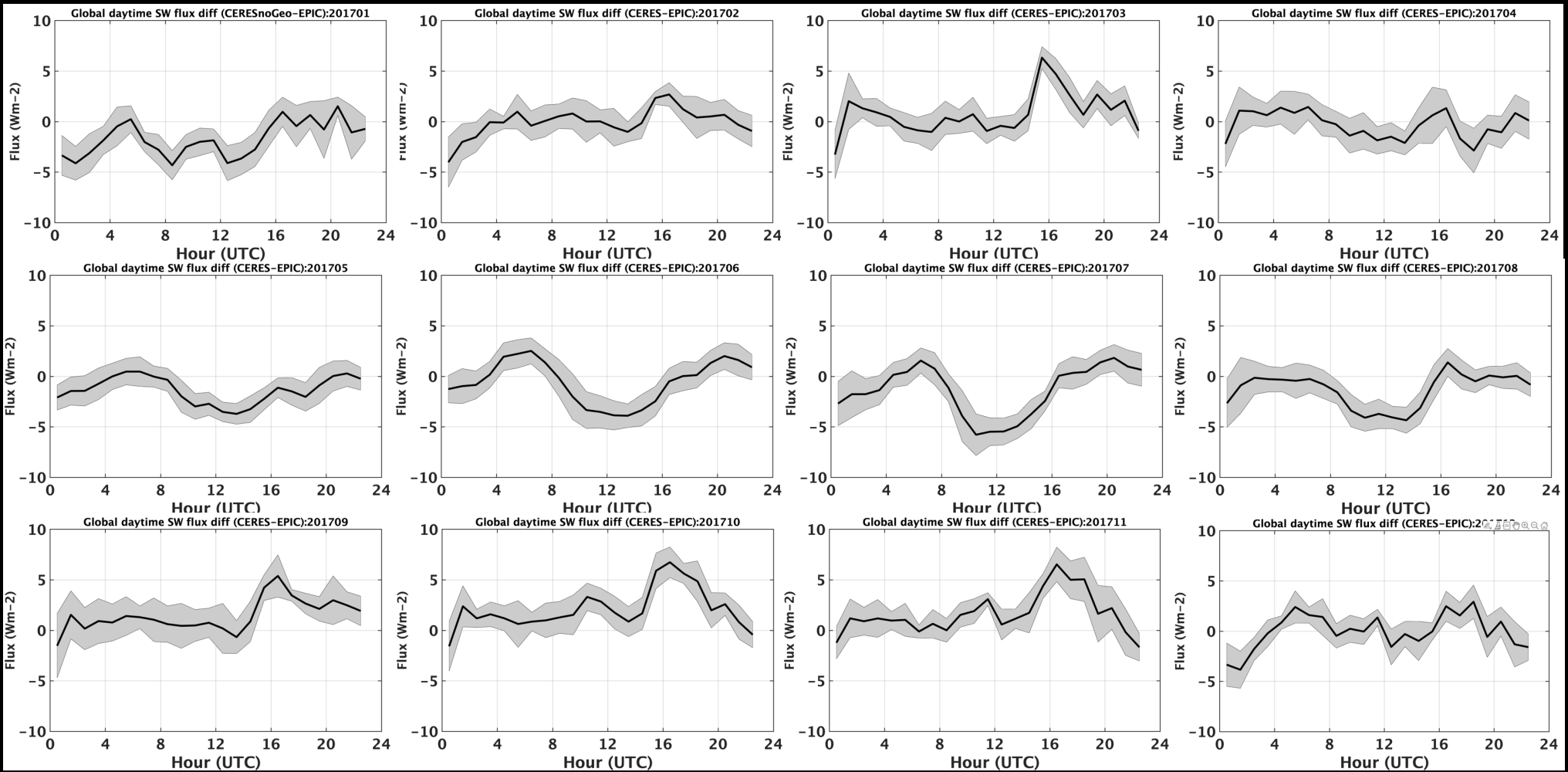
$$\Delta F = \text{CERES over EPIC view} - \text{CERES daytime}$$



Comparison of SW flux between CERES SYN and EPIC at different imaging time

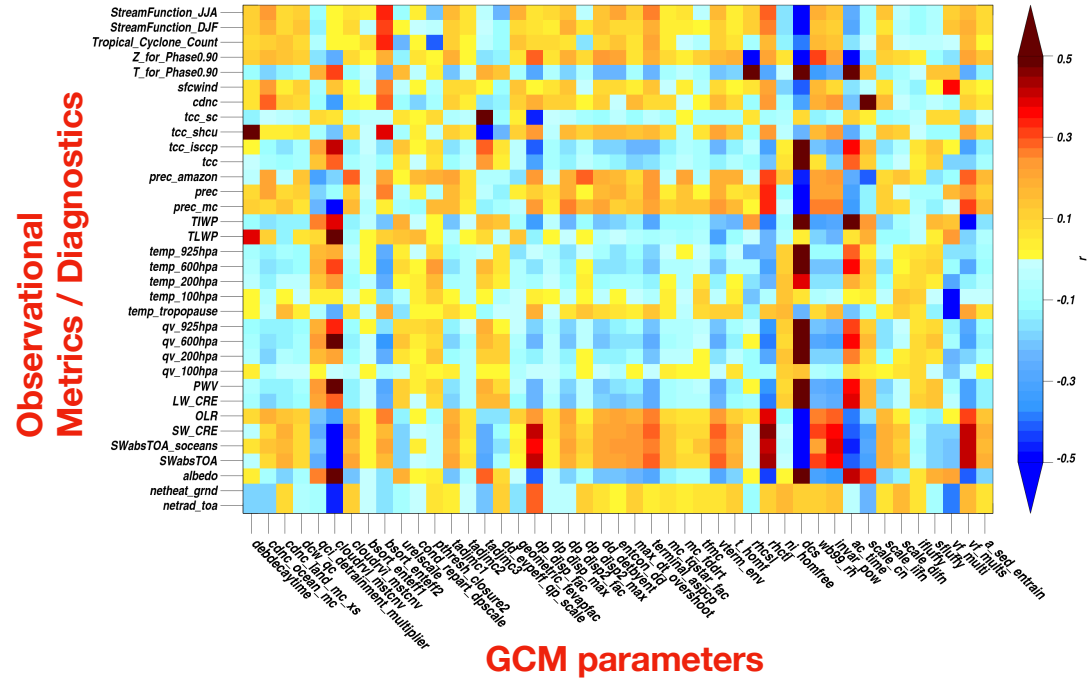
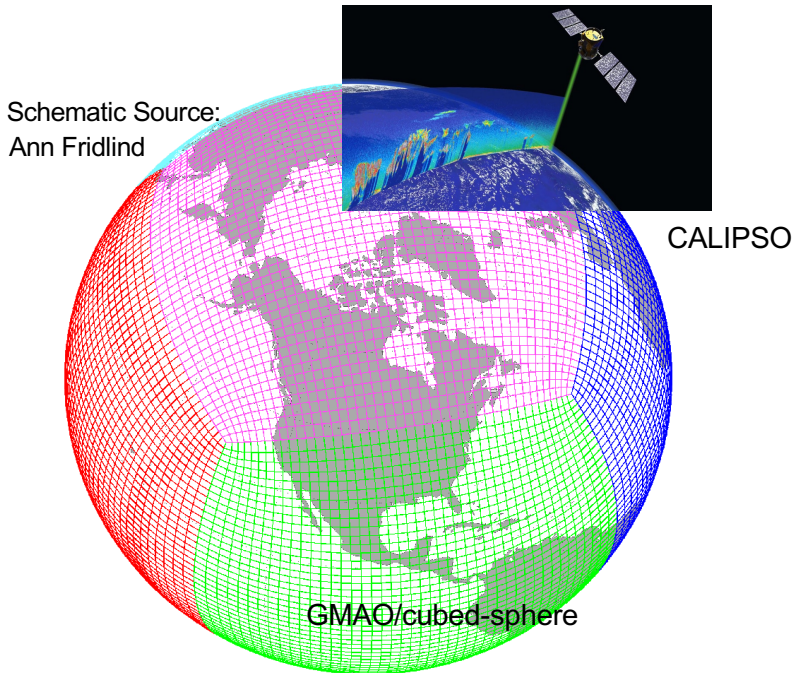


Using EPIC quasi-hourly fluxes to evaluate the diurnal cycle



Evaluating Machine Learning (ML)-Calibrated Climate Model

Global satellite data → input into ML multi-parameter optimization framework → output: globally tuned GISS GCM variants + “power map” showing connections between all 45 model parameters and ~35 diagnostics



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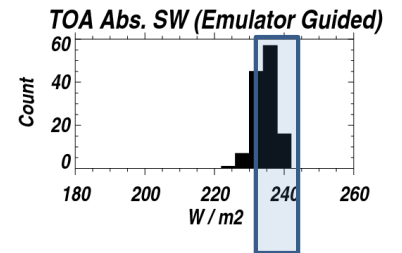
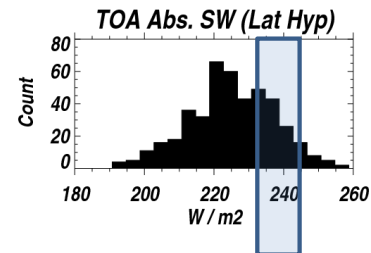
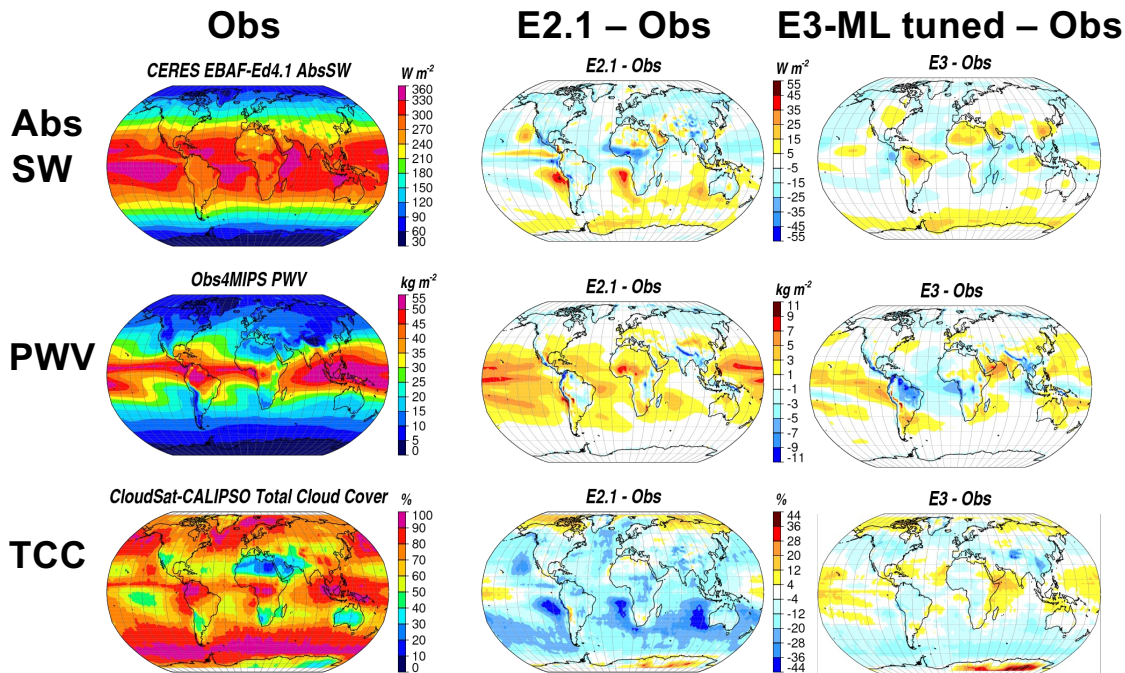


LEAP

**ML Work Led by: Greg Elsaesser,
Marcus van Lier-Walqui (NASA-
GISS Clouds-Convection Group)**

Evaluating Machine Learning (ML)-Calibrated Climate Model

Global satellite data → input into ML multi-parameter optimization framework → output: globally tuned GISS GCM variants



ML Emulator (top right) generates GCM parameter variants closer to observations & in radiative balance, an improvement over variants derived using Latin Hypercube Sampling (top left). (left) Global bias map for one ML-GCM member compared to non-ML GCM (E2.1) for select obs.

One project task : To what extent do improved global GISS-GCM climatologies imply improved radiation and cloud variability on short timescales?



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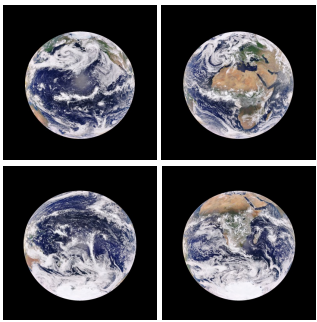


LEAP

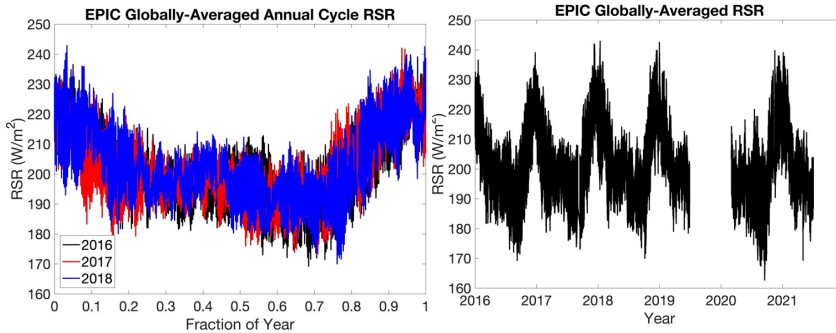
ML Work Led by: Greg Elsaesser, Marcus van Lier-Walqui (NASA-GISS Clouds-Convection Group)

Testing Climate Model TOA Reflected SW radiation across Time-Scales

High-frequency RSR measurements from the EPIC/NISTAR record reveal the path the Earth system takes to from diurnal fluctuations in RSR to long-term RSR stability.

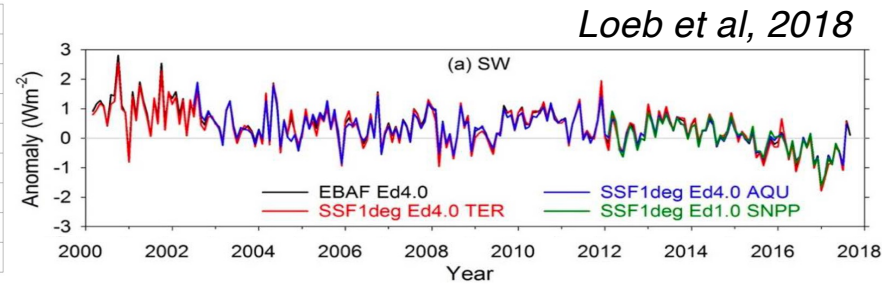


Sub-Diurnal



Seasonal

Interannual



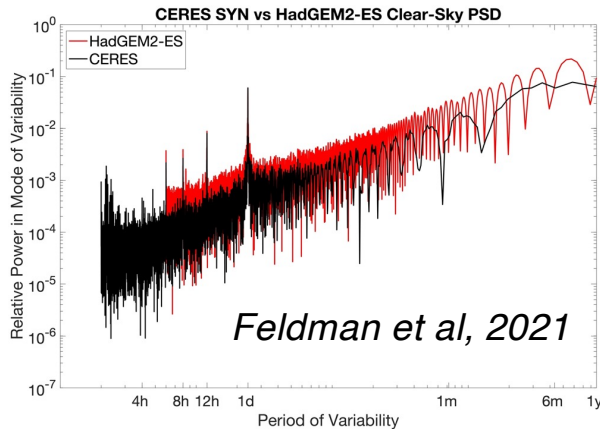
Loeb et al, 2018

Decadal

This path can be described by a red-noise process:

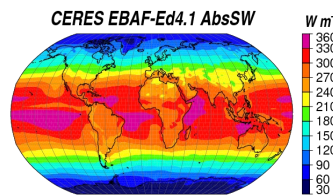
$$P(f) = Af^\alpha$$

CMIP5 and CMIP6 models overestimate alpha

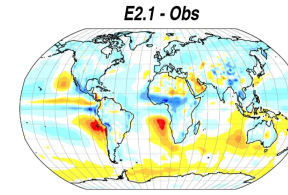


Feldman et al, 2021

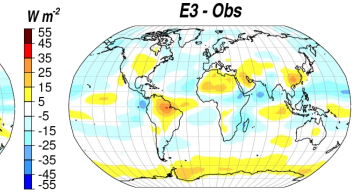
Obs



E2.1 – Obs



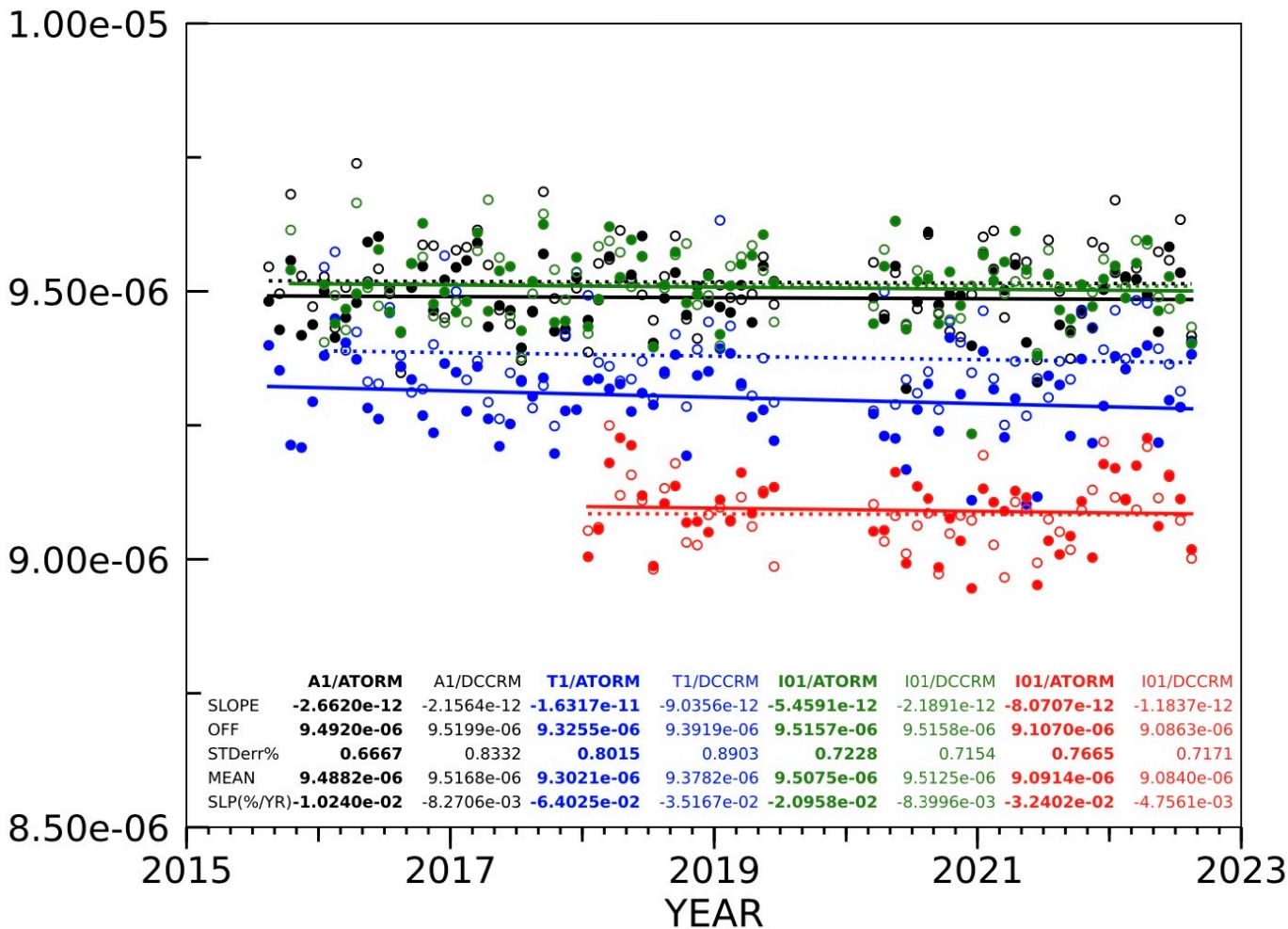
E3-ML tuned – Obs



GISS PPE produces better RSR, does it still overestimate alpha?
 If it does, RSR stability pathway not constrained by tuned models.
 If realistic alpha, tuned models should use EPIC/NISTAR stability pathway.

Climate Model Testing Led by: Dan Feldman, LBNL

DSCOVN EPIC Band 7 (0.68 μm) version 3



Sensor Legend

Terra-MODIS C6.1

Aqua-MODIS C6.1

NPP-VIIRS C2

N20-VIIRS C2.1

Ray-Match Legend

All-sky Tropical Ocean —

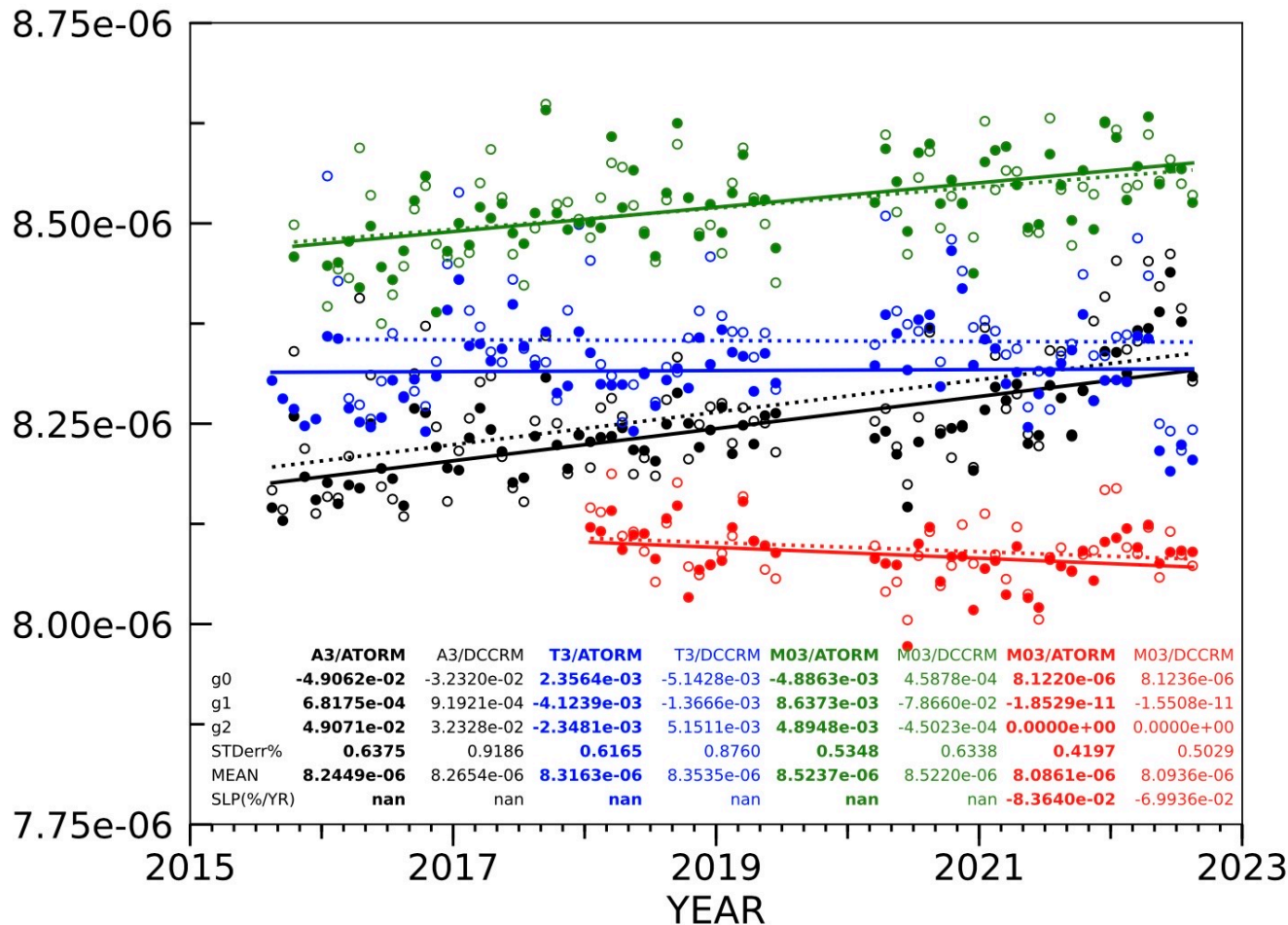
Deep Convective Cloud

Updates since DSCOVN STM 2021

- Extend the timeline from February 2021 to August 2022
- Use the latest NPP C2 and N20 C2.1 VIIRS collections which have all known trends removed
- Add Terra-MODIS reference
- Note that MODIS is in forward processing mode since 2016 (could have residual trends)

all trends <0.2% over 7-years
except based on Terra-MODIS

DSCOVN EPIC Band 5 (0.443 μm) version 3



Sensor Legend

Terra-MODIS C6.1

Aqua-MODIS C6.1

NPP-VIIRS C2

N20-VIIRS C2.1

Ray-Match Legend

All-sky Tropical Ocean —

Deep Convective Cloud

Updates since DSCOVN STM 2021

- Notice that the EPIC trend comparison with MODIS and VIIRS is inconsistent (also shown in the Frontiers paper). Still investigating.
- The extension of Feb 2021 till Aug 2022 did not change the inconsistent trends
- Having the longer timelines invalidated the asymptotic fits of the Frontiers paper
- Band 6 trends are more consistent with MODIS and VIIRS

Summary

- Produced EPIC cloud composite and EPIC SW flux from January 2016 to March 2022.
- EPIC SW fluxes agree very well with CERES SYN SW fluxes, despite the viewing geometries of EPIC differ significantly from CERES.
- Caution not to use EPIC flux to study interannual variability, as the magnitude of EPIC flux is also sensitive to the percentage of daytime area visible to EPIC.
- EPIC SW flux dataset provides unique diurnal information to evaluate diurnal fluxes of CERES SYN and climate model.

Publications

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2. Conor Haney, David Doelling, Wenying Su, Rajendra Bhatt, Arun Gopalan and Benjamin Scarino, Radiometric Stability Assessment of the DSCOVR EPIC Visible Bands using MODIS, VIIRS, and Invariant Targets as Independent References, *Frontiers Remote Sens.*, 10.3389/frsen.2021.765913, 2021.
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11. Wenying Su, L. Liang, D. R. Doelling, P. Minnis, D. Duda, K. Khlopenkov, M. Thieman, N. G. Loeb, S. Kato, F. P. J. Valero, H. Wang, and F. Rose. Determining the shortwave radiative flux from earth polychromatic imaging camera. *J. Geophys. Res.*, 123, doi:10.1029/2018JD029390, 2018.
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