



CERES Science Team Meeting  
April 27-29, 2010, Newport News VA

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# Using CERES in Developing Shortwave Radiation Budget Algorithms from ABI on GOES-R

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*Honqing Liu*, DELL/QSS, Inc.

and

the GOES-R Algorithm Working Group  
Radiation Budget Application Team



# Algorithm Working Group (AWG) Radiation Budget Team Members

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## AWG RB Team Chair : Istvan Laszlo

- SW Radiation Budget Products
  - **Istvan Laszlo (NESDIS) (Lead)**
  - Hongqing Liu (DELL/QSS)
  - Fred G. Rose (NASA/LaRC)
  - Rachel T. Pinker (UMD/AOSC)
  - Hye-Yun Kim (IMSG)
- LW Radiation Budget Products
  - **Hai-Tien Lee (UMD/CICS) (Lead)**
  - Arnold Gruber (UMD/CICS)
- Validation (ground) data
  - **Ellsworth G. Dutton (OAR/ESRL) (Lead)**
  - John A. Augustine (OAR/ESRL)
- Software Development
  - Aiwu Li (was Peter Keehn) (IMSG)
- Independent Reviewers
  - P. Stackhouse (NASA/LaRC)
  - S-K. Yang (NOAA/NWS)
  - C-Z. Zou (NOAA/NESDIS)



# Outline

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- Background
  - GOES-R & the Advanced Baseline Imager
  - Products
  - Requirements
- Algorithms/Methods
  - CERES in algorithm development
- Validation data sets
  - CERES in evaluation
- Validation Results



# Background: GOES-R & ABI

- **Geostationary Operational Environmental Satellite-R Series (GOES-R)**

- follow-on satellite system to the existing GOES-I/M and NOP series satellites
- 3-axis stabilized with on-orbit lifetime of 15 years (5 years of storage and 10 years of operational)
- two spacecraft (75W and 137W)
- improved spacecraft and instrument technologies
- launch date: 2015 (planned)

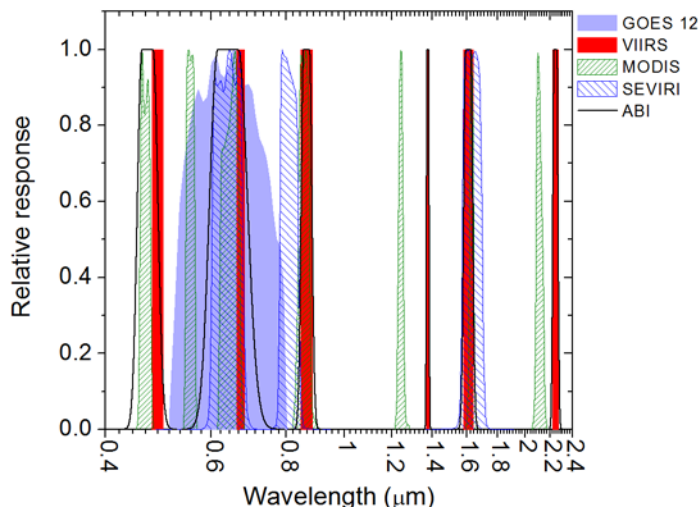
- **Advanced Baseline Imager (ABI)**

- 16-band, two-axis scanning passive radiometer with star sensing
- measures emitted and solar reflected radiance simultaneously in all spectral bands
- **first imager with onboard calibration of solar reflective channels on a US geostationary platform!**

## ABI channels

Channel ID	Wavelength Microns	Hor. Res.	Upper and lower 50% response points (in microns)	Noise @ Ref.	Max. Level
1	0.47	1km	0.45±0.01 - 0.49±0.01	300/1	100 %
2	0.64	0.5km	0.59±0.01 - 0.69±0.01	300/1	100 %
3	0.865	1km	0.8455±0.01 - 0.8845±0.01	300/1	100 %
4	1.378	2km	1.3705±0.005 - 1.3855±0.005	300/1	100 %
5	1.61	1km	1.58±0.01 - 1.64±0.01	300/1	100 %
6	2.25	2km	2.225±0.01 - 2.275±0.01	300/1	100 %
7	3.90	2km	3.80±0.05 - 4.00±0.05	0.1 K	400 K
8	6.185	2km	5.77±0.03 - 6.6±0.03	0.1 K	300 K
9	6.95	2km	6.75±0.03 - 7.15±0.03	0.1 K	300 K
10	7.34	2km	7.24±0.02 - 7.44±0.02	0.1 K	320 K
11	8.5	2km	8.3±0.03 - 8.7±0.03	0.1 K	330 K
12	9.61	2km	9.42±0.02 - 9.8±0.03	0.1 K	300 K
13	10.35	2km	10.1±0.1 - 10.6±0.1	0.1 K	330 K
14	11.2	2km	10.8±0.1 - 11.6±0.1	0.1 K	330 K
15	12.3	2km	11.8±0.1 - 12.8±0.1	0.1 K	330 K
16	13.3	2km	13.0±0.06 - 13.6±0.06	0.3 K	305 K

# Background: GOES-R & ABI



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  - 16-band, two-axis scanning passive radiometer with star sensing
  - measures emitted and solar reflected radiance simultaneously in all spectral bands
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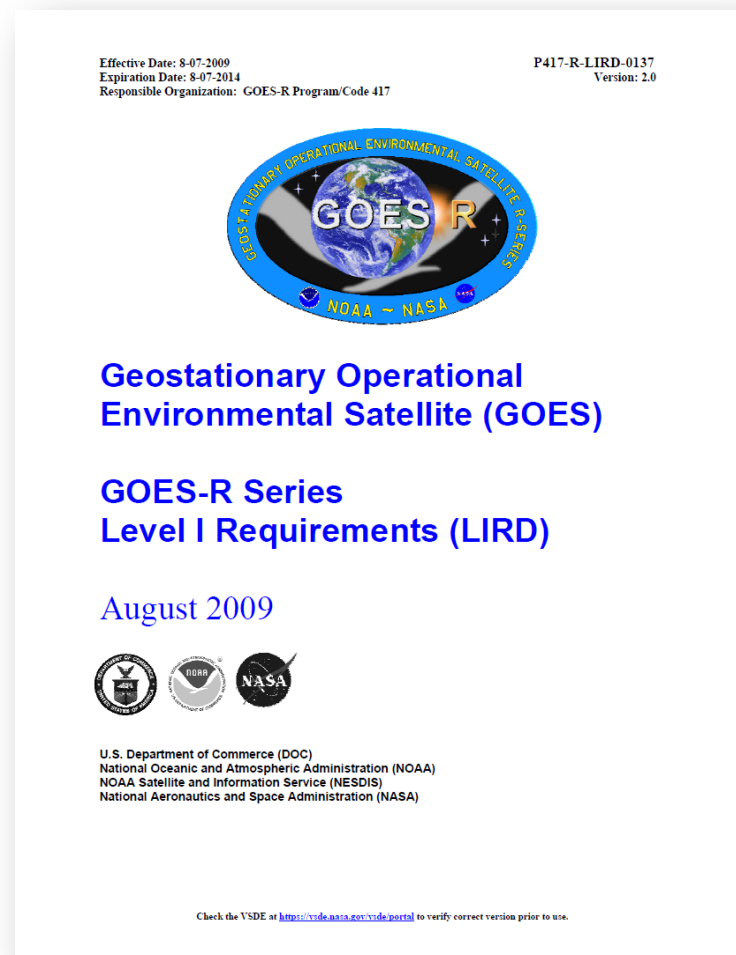


# Background: RB Products

## Radiation Products:

1. Downward SW Radiation: Surface (DSR)
2. Reflected SW Radiation: TOA (RSR)
3. Absorbed SW Radiation: Surface (ASR)
4. Upward LW Radiation: TOA
5. Downward LW Radiation: Surface
6. Upward LW Radiation: Surface

**Only DSR & RSR are discussed in this presentation**





# Requirements - DSR

Product Measurement Precision	Vendor Allocated Ground Latency	Refresh Rate/Coverage Time Option (Mode 3)	Measurement Accuracy	Measurement Range	Mapping Accuracy	Horizontal Resolution	Geographic Coverage	Name
100 W/m <sup>2</sup> for low and high values (100 and 1000 W/m <sup>2</sup> ) and 130 for mid values (350 W/m <sup>2</sup> )	3236 sec	60 min	± 85 W/m <sup>2</sup> at high value (1000 W/m <sup>2</sup> ), ± 65 W/m <sup>2</sup> at mid value (350 W/m <sup>2</sup> ), and ±110 W/m <sup>2</sup> at low value (100 W/m <sup>2</sup> )	0 – 1500 W/m <sup>2</sup>	1 km	5 km	M	Downward Shortwave Radiation: Surface
100 W/m <sup>2</sup> for low and high values (100 and 1000 W/m <sup>2</sup> ) and 130 for mid values (350 W/m <sup>2</sup> )	3236 sec	60 min	± 85 W/m <sup>2</sup> at high value (1000 W/m <sup>2</sup> ), ± 65 W/m <sup>2</sup> at mid value (350 W/m <sup>2</sup> ), and ±110 W/m <sup>2</sup> at low value (100 W/m <sup>2</sup> )	0 – 1500 W/m <sup>2</sup>	2 km	25 km	C	Downward Shortwave Radiation: Surface
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M - Mesoscale

C – CONUS

FD – Full Disk



# Requirements - RSR

Product Measurement Precision	Vendor Allocated Ground Latency	Refresh Rate/Coverage Time Option (Mode 3)	Measurement Accuracy	Measurement Range	Mapping Accuracy	Horizontal Resolution	Geographic Coverage	Name
65 W/m <sup>2</sup> at high value(>500 W/m <sup>2</sup> ); 65 W/m <sup>2</sup> at typical value/ midpoint (200-500 W/m <sup>2</sup> ); 35 W/m <sup>2</sup> at low end of range (<200 W/m <sup>2</sup> )	3236 sec	60 min	55 W/m <sup>2</sup> at high value(>500 W/m <sup>2</sup> ); 45 W/m <sup>2</sup> at typical value/ midpoint (200-500 W/m <sup>2</sup> ); 25 W/m <sup>2</sup> at low end of range (<200 W/m <sup>2</sup> )	0 – 1300 W/m <sup>2</sup>	2 km	25 km	C	Reflected Shortwave Radiation: TOA
65 W/m <sup>2</sup> at high value(>500 W/m <sup>2</sup> ); 65 W/m <sup>2</sup> at typical value/ midpoint (200-500 W/m <sup>2</sup> ); 35 W/m <sup>2</sup> at low end of range (<200 W/m <sup>2</sup> )	3236 sec	60 min	55 W/m <sup>2</sup> at high value(>500 W/m <sup>2</sup> ); 45 W/m <sup>2</sup> at typical value/ midpoint (200-500 W/m <sup>2</sup> ); 25 W/m <sup>2</sup> at low end of range (<200 W/m <sup>2</sup> )	0 – 1300 W/m <sup>2</sup>	4 km	25 km	FD	Reflected Shortwave Radiation: TOA

C – CONUS

FD – Full Disk

**Product qualifiers:** daytime with SZA ≤ 75°; quantitative out to LZA = 70° and qualitative beyond

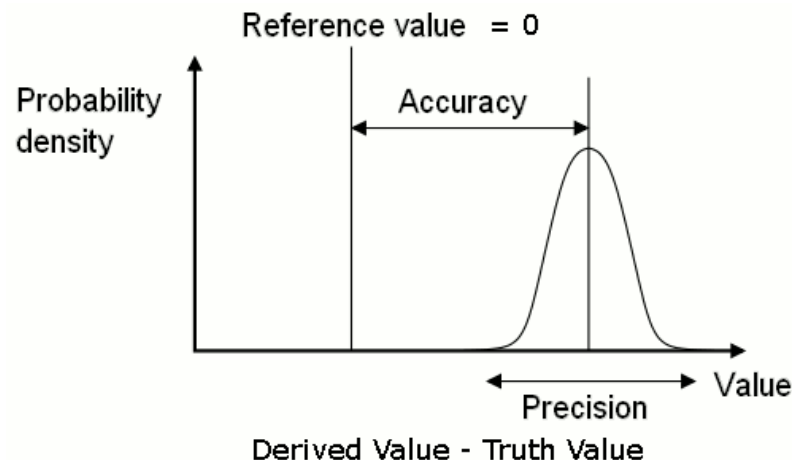




# Accuracy and Precision

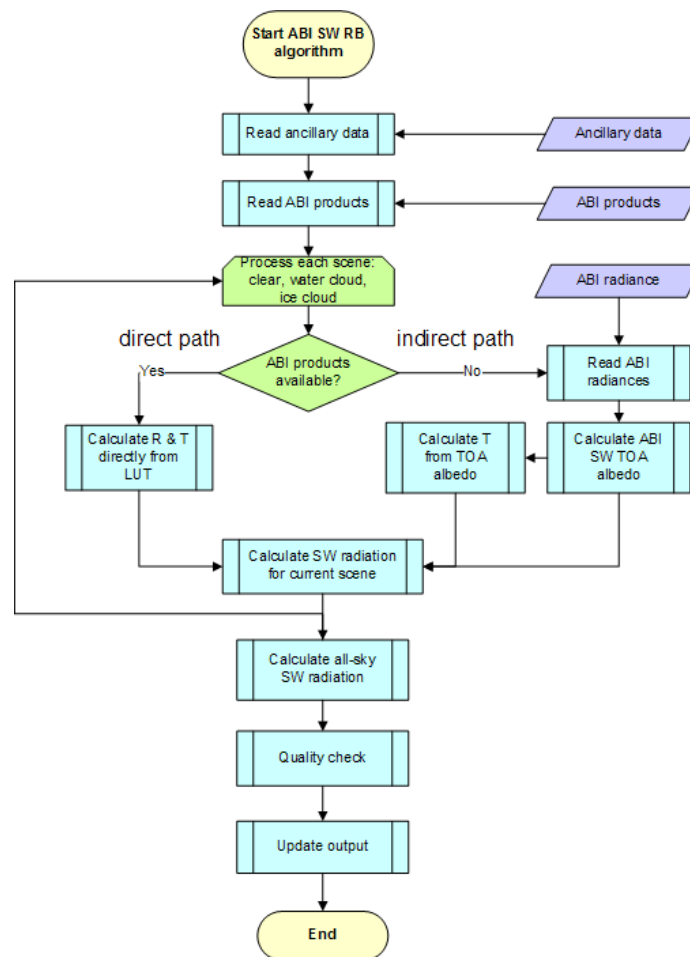
## GOES-R AWG Definitions

- **GOES-R Series Ground Segment (GS) Project Functional and Performance Specification (F&PS) (ATTACHMENT 2 DG133E-09-CN-0094 Version 2.0 - Modification 0003, July 1, 2009):**
- **Product Measurement Accuracy** - defined as the systematic difference or bias between the derived parameter and truth.
  - It is determined by computing the absolute value of the average of differences between the derived parameter and truth over a statistically significant population of data such that the magnitude of the random error is negligible relative to the magnitude of the systematic error.
- **Product Measurement Precision** - the one-sigma standard deviation of the differences
  - between the derived parameters and their corresponding truth over the same population of data used to compute the product measurement accuracy.

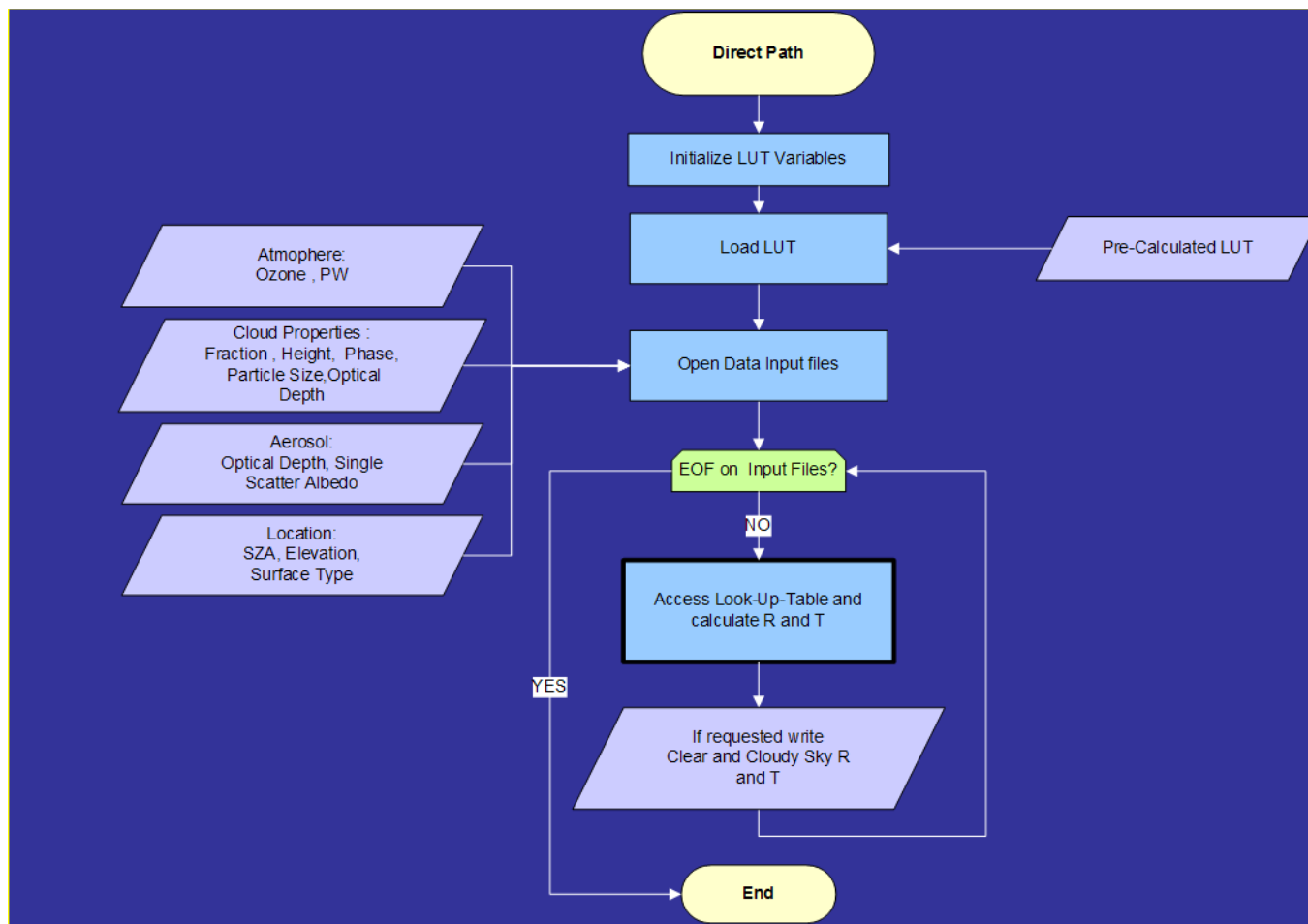


# DSR & RSR Algorithm

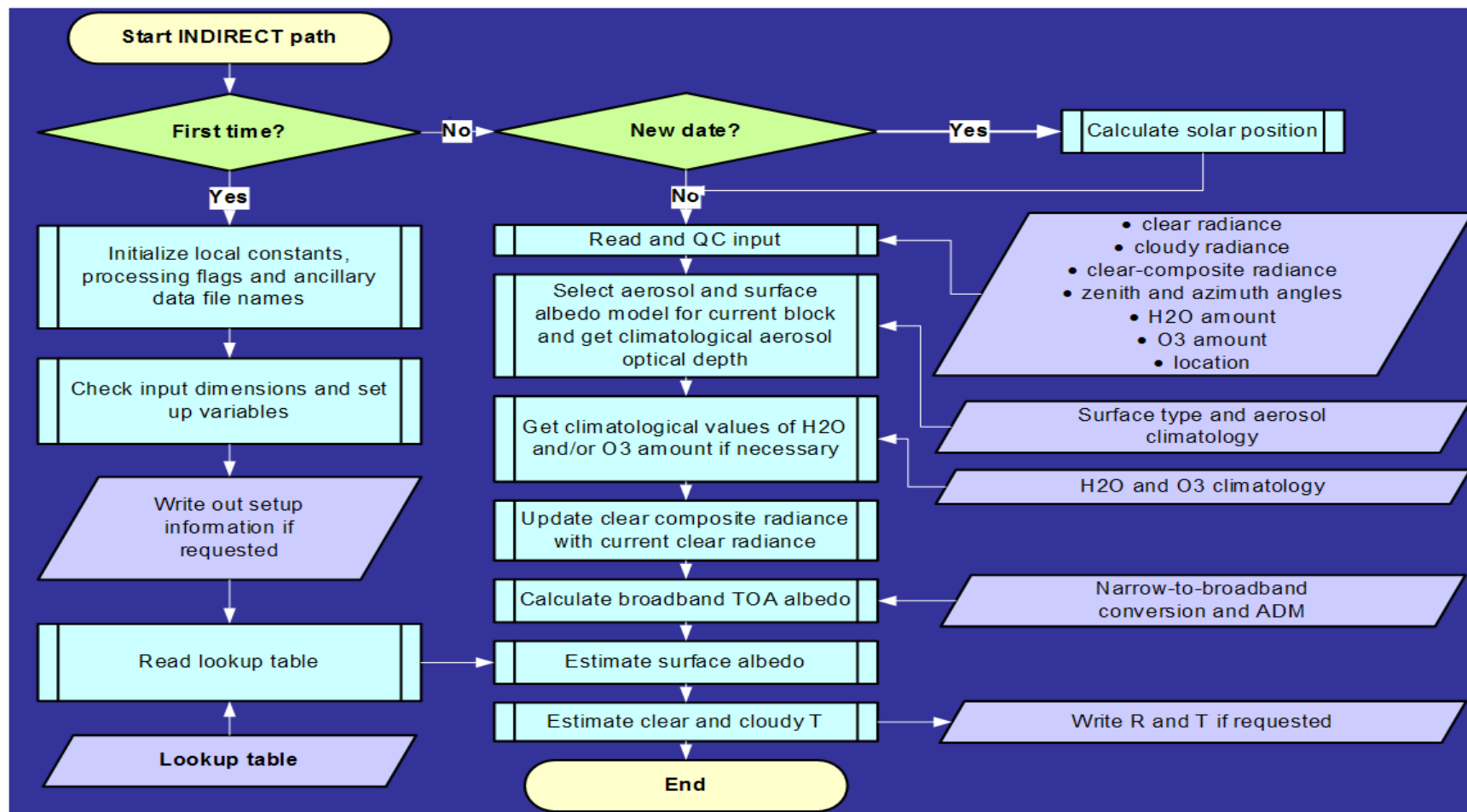
- Two independent algorithms performing physically-based retrieval of reflectances and transmittances by using LUT representation of RTM
- Direct Path Algorithm (DPA)**
  - uses GOES-R products (AOD, COD, surface albedo, etc.) as inputs, and thus
  - more consistent with other ABI products
  - used when all atmospheric & surface inputs available
  - RTM version proven with CERES
  - straightforward computation with low latency
  - Disadvantage:* some inputs (e.g., AOD over bright surface) are not available everywhere
- Indirect Path Algorithm (IPA)**
  - uses ABI reflectances in multiple channels for RSR
  - estimates DSR & RSR by comparing satellite-estimated broadband TOA albedo to calculated ones
  - used when NOT all inputs needed in DPA available
  - proven in GEWEX/SRB and has been tested in an operational environment (NOAA/GSIP)
  - Disadvantage:* broadband TOA albedo is not directly measured; it requires spectral and angular corrections, which introduce (additional) uncertainties



# Direct Path Algorithm



# Indirect Path Algorithm





# Algorithm Validation: Test Data

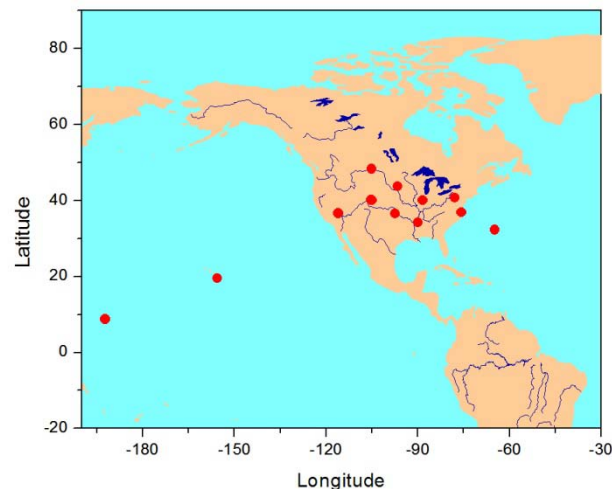
- **Collocated satellite and model data from CERES/ARM Validation Experiment (CAVE) over SURFRAD, ARM, BSRN stations**
  - CERES TOA upward SW radiation (RSR)
  - Cloud optical depth, phase, particle size, height retrieved from VIRS/MODIS imager data
  - Aerosol optical depth and single scattering albedo retrieved from VIRS/MODIS imager data or MATCH model
  - Total precipitable water from GEOS assimilation products
  - Surface albedo retrieved from CERES TOA SW data
  - Total column ozone are taken from TOMS retrievals
  - 15-minute average surface data
- **period: 01/1998-08/1998 and 03/2000-06/2006**
- **used for evaluating direct & indirect path retrievals independently**
- **Moderate Resolution Imaging Spectroradiometer (MODIS) measurements and retrievals over 13 (SURFRAD & CMDL) stations**
  - observation geometry (MOD/MYD03)
  - L1b SW narrowband reflectance at 1KM resolution (MOD/MYD021KM)
  - Location, surface height, geometry (MOD/MYD03)
  - L2 Aerosol optical depth (MOD/MYD04), single scatter albedo (0.95)
  - L2 Cloud optical depth, size, phase, height (MOD/MYD06)
  - L2 Total precipitable water, ozone (MOD/MYD07, CERES CRS, TOMS/OMI)
  - L2 Cloud and snow mask (MOD/MYD35)
  - L2 Surface albedo (MCD43, CERES)
- **period: 03/2000–06/2006 (Terra); 07/2002-02/2005 (Aqua)**
- **used primarily for evaluating hybrid algorithm (combination of direct and indirect algorithms)**



# MODIS data “sites”

Station Code	Longitude	Latitude	Elevation (m)	Network
BON	-88.37	40.05	213	SURFRAD
DRA	-116.02	36.63	1007	SURFRAD
FPK	-105.10	48.31	634	SURFRAD
GWN	-89.87	34.25	98	SURFRAD
PSU	-77.93	40.72	376	SURFRAD
SXF	-96.62	43.73	473	SURFRAD
TBL	-105.24	40.13	1689	SURFRAD
COV	-75.71	36.90	30	COVE
E13	-97.48	36.61	318	ARM
BER	-64.77	32.30	60	GMD
BOU	-105.01	40.05	1584	GMD
KWA	167.72	8.76	10	GMD
MLO	-155.58	19.54	3397	GMD

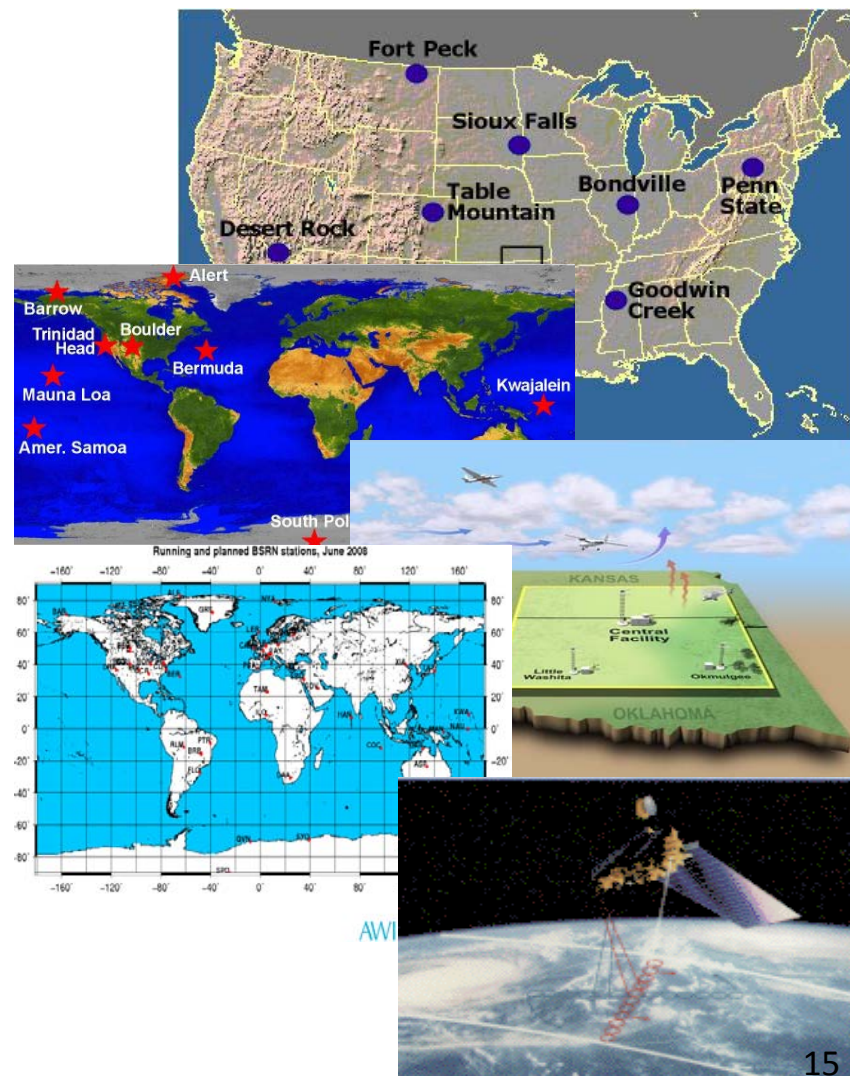
- Proxy MODIS data over 13 ground stations:
- seven SURFRAD sites (BON, DRA, FPK, GWN, PSU, SXF, TBL);
- CERES Ocean Validation Experiment (COVE) site,
- Atmospheric Radiation Measurement Project (ARM) site (E13)
- four Global Monitoring Division (GMD) sites (BER, BOU, KWA, MLO).





# Algorithm Validation: Truth Data

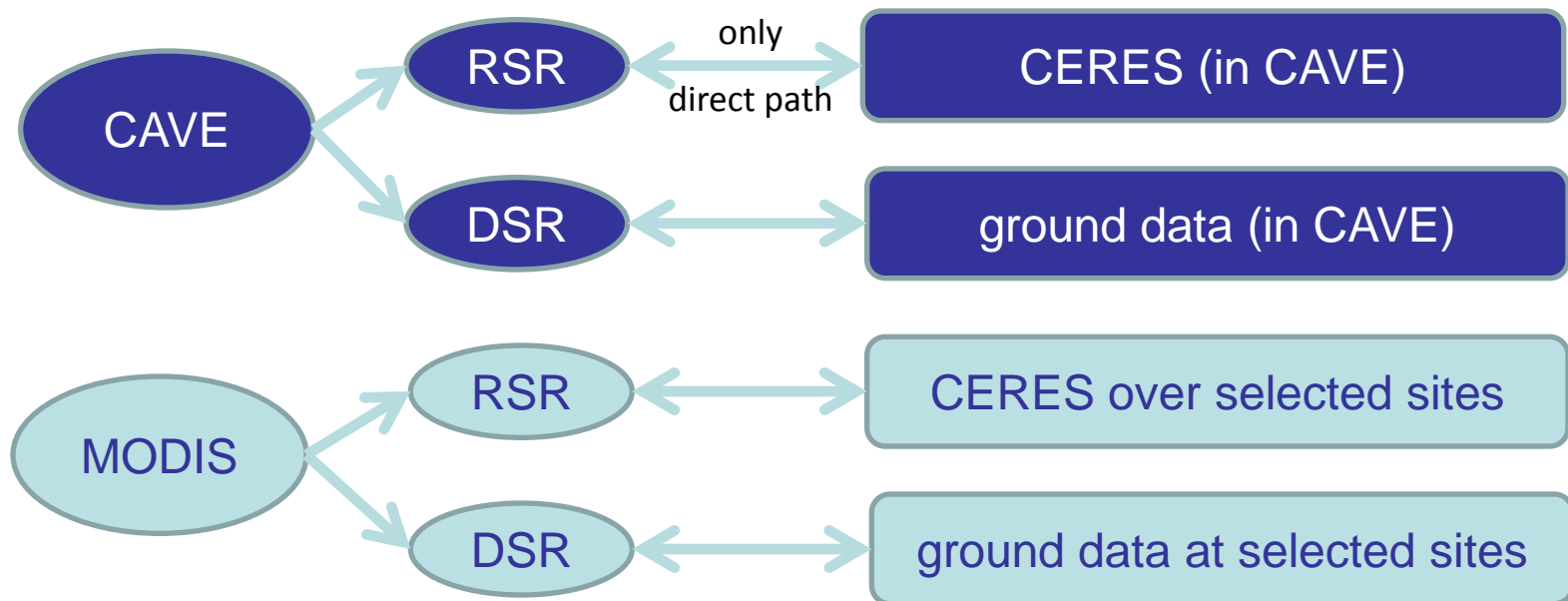
- Surface Radiation Network (SURFRAD)
- Global Network-STAR
- Atmospheric Radiation Measurement (ARM) Program
- Baseline Surface Radiation Network (BSRN)
- **Cloud and the Earth's Radiation Energy System (CERES)** – both TOA and surface (derived fluxes)





# Algorithm Validation: Test Methods

- Retrieve DSR & RSR using test datasets
- Collocate in space and time with satellite and ground “truth”
  - CAVE input: already done in CAVE (Thank you SARB Team!)
  - MODIS input: matchup in time guided by CAVE; centered on site
- Generate comparative statistics
  - Bias, RMS, correlation, accuracy and precision, histogram

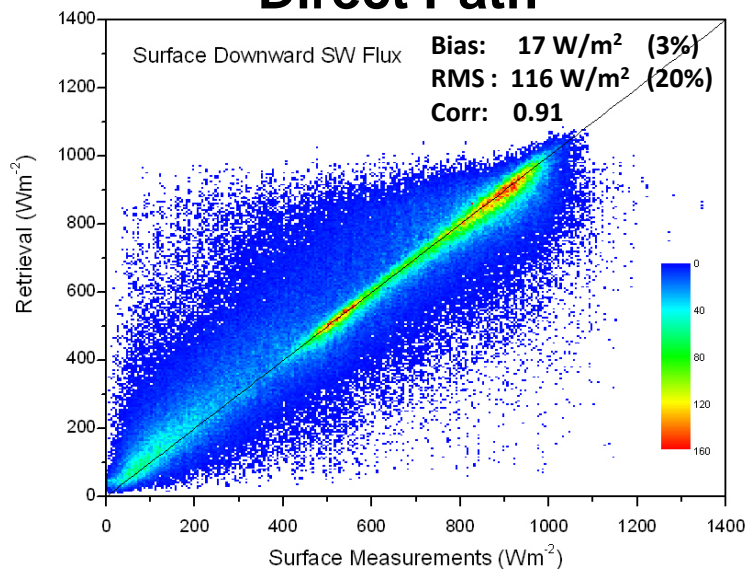




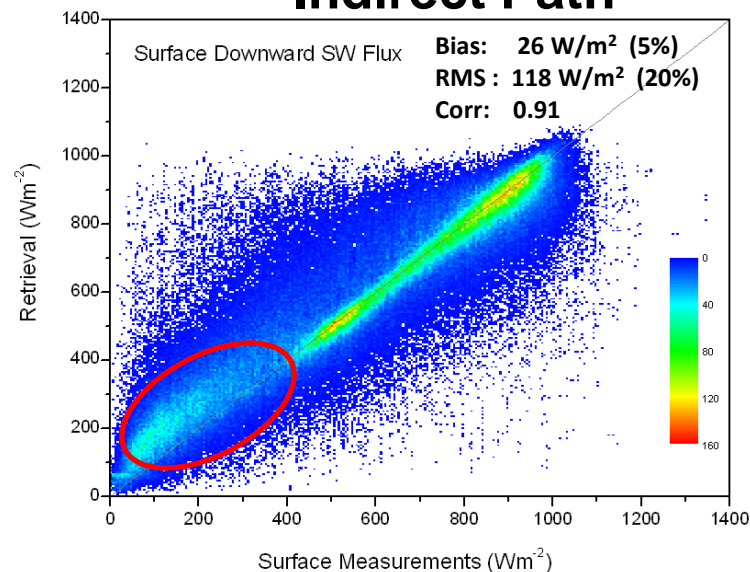
# Validation Results

## CERES/CAVE Dataset - DSR

### Direct Path



### Indirect Path



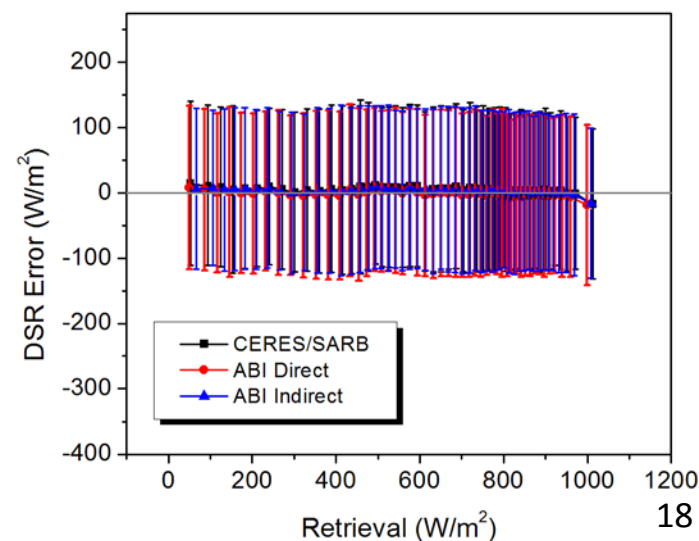
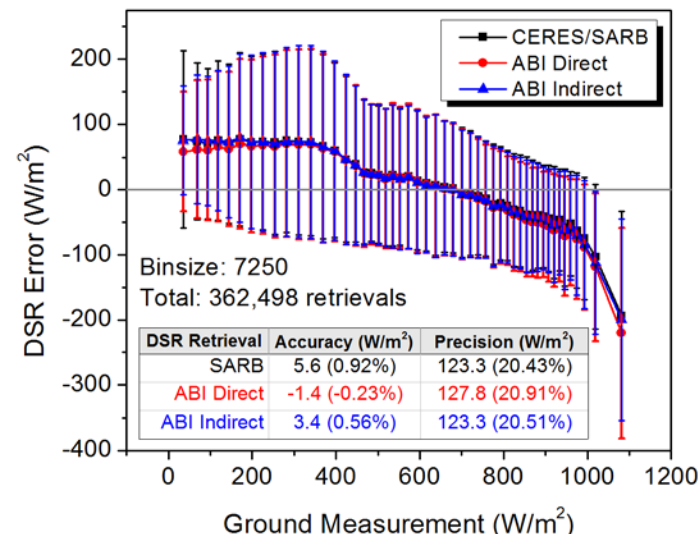
- ABI retrievals from CAVE data (from 52 sites and from ~7 years)
  - Direct Path Algorithm: atmosphere and surface inputs
  - Indirect Path Algorithm: broadband TOA albedo input
- Scatter in both paths are similar



# Validation Results

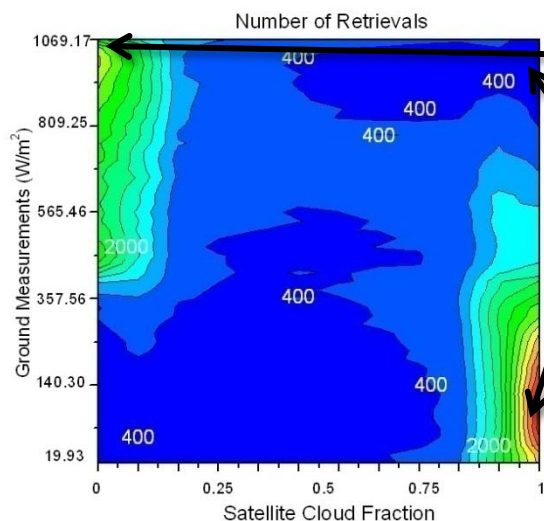
## CERES/CAVE Dataset – DSR (2)

- Top: accuracy/precision vs. ground observations
  - symbols: bias
  - whiskers: 1- $\sigma$  standard deviation
  - Accuracy is a function of “true” flux
    - over (under) estimation at low (high) value
  - ABI algorithm does not perform equally well for all ranges of “true” fluxes
- Bottom: accuracy/precision vs. retrieval
  - error of a given estimate
  - maybe more relevant for users
  - no obvious dependence (except in last bin)
- CERES/SARB retrievals show similar pattern



# Validation Results

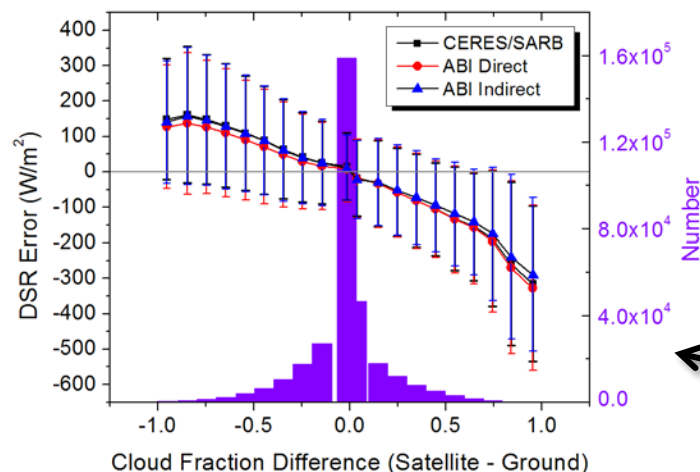
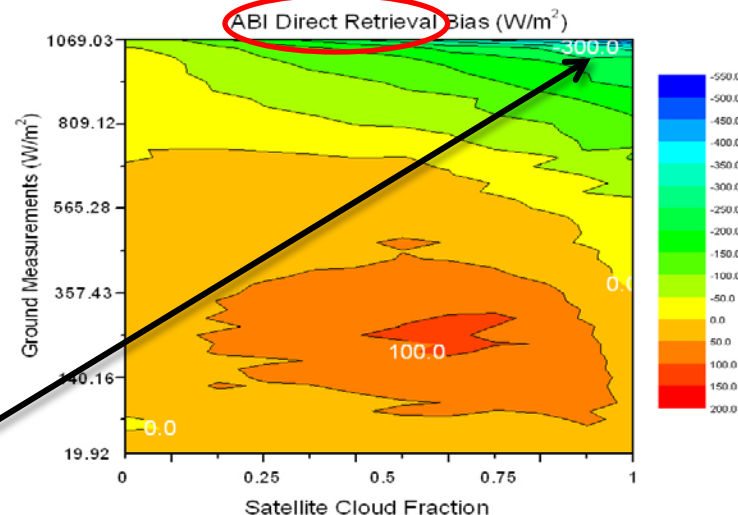
## CERES/CAVE Dataset – DSR (3)



many clear & overcast ...

... but there are some overcast cases with large insolation ...

... large negative bias

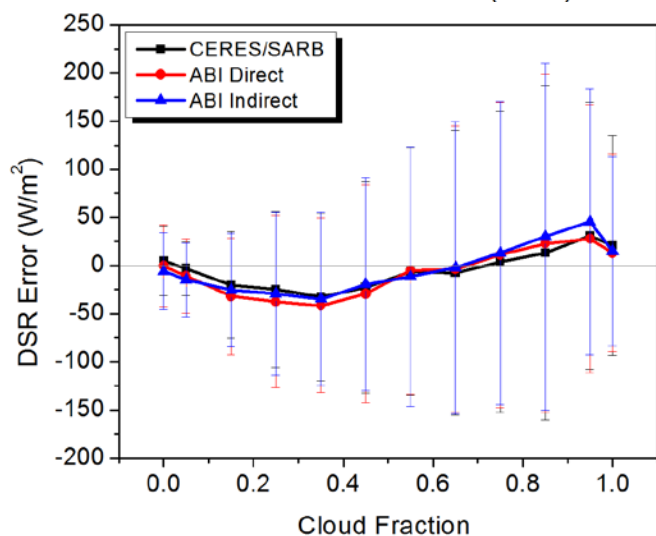
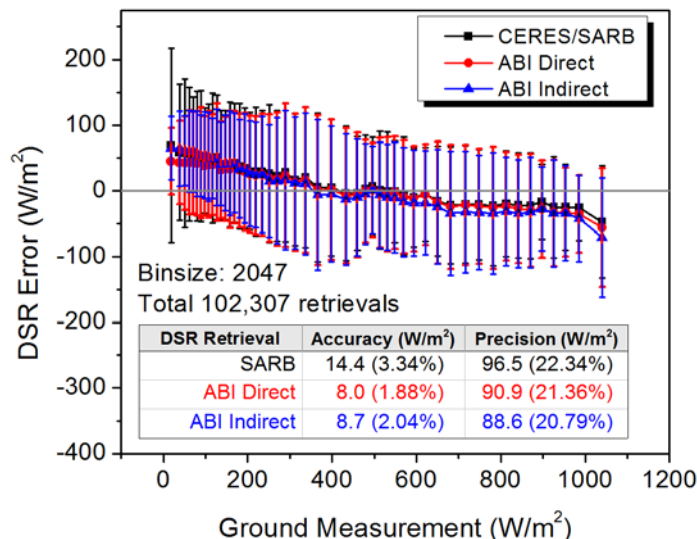


- pattern for CERES/SARB is similar
- large fraction of observed dependence “error vs. ground” plot is explained by inconsistent satellite and ground cloud fractions
- negative (positive) cloud fraction difference leads to over (under) estimation of DSR



# Validation Results

## CERES/CAVE Dataset – DSR (3)

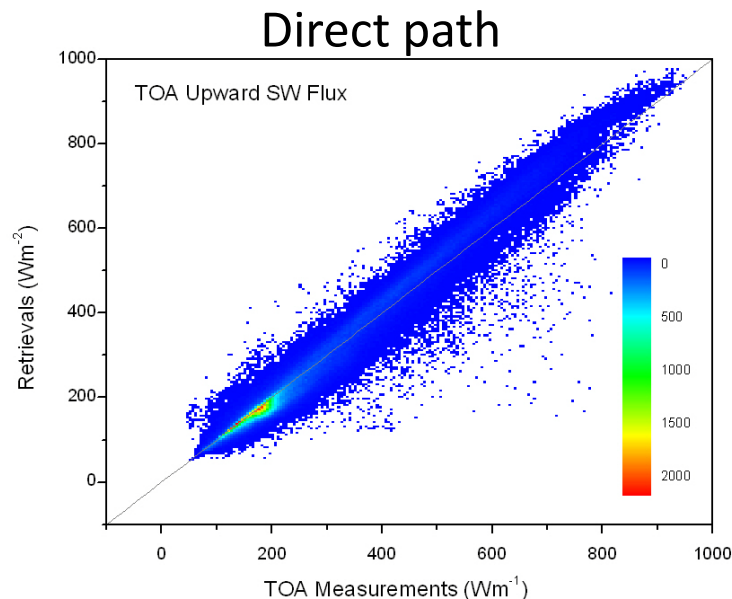


- subsetting: satellite-ground cloud fraction difference  $< |0.01|$
- dependence of error on ground value is reduced (especially at high value)
- overall bias increased – indicates cancellation of errors in the total sample
- dependence of DSR error on cloud fraction (CF) when satellite and ground CF agree
- error is smallest for clear and overcast skies, and for CF 0.65
- negative error for  $0.0 < CF < 0.65$
- positive error for  $0.65 < CF < 1.0$
- std generally increases with CF up to  $\sim 0.85$  CF, decreases afterward



# Validation Results

## CERES/CAVE Dataset – RSR



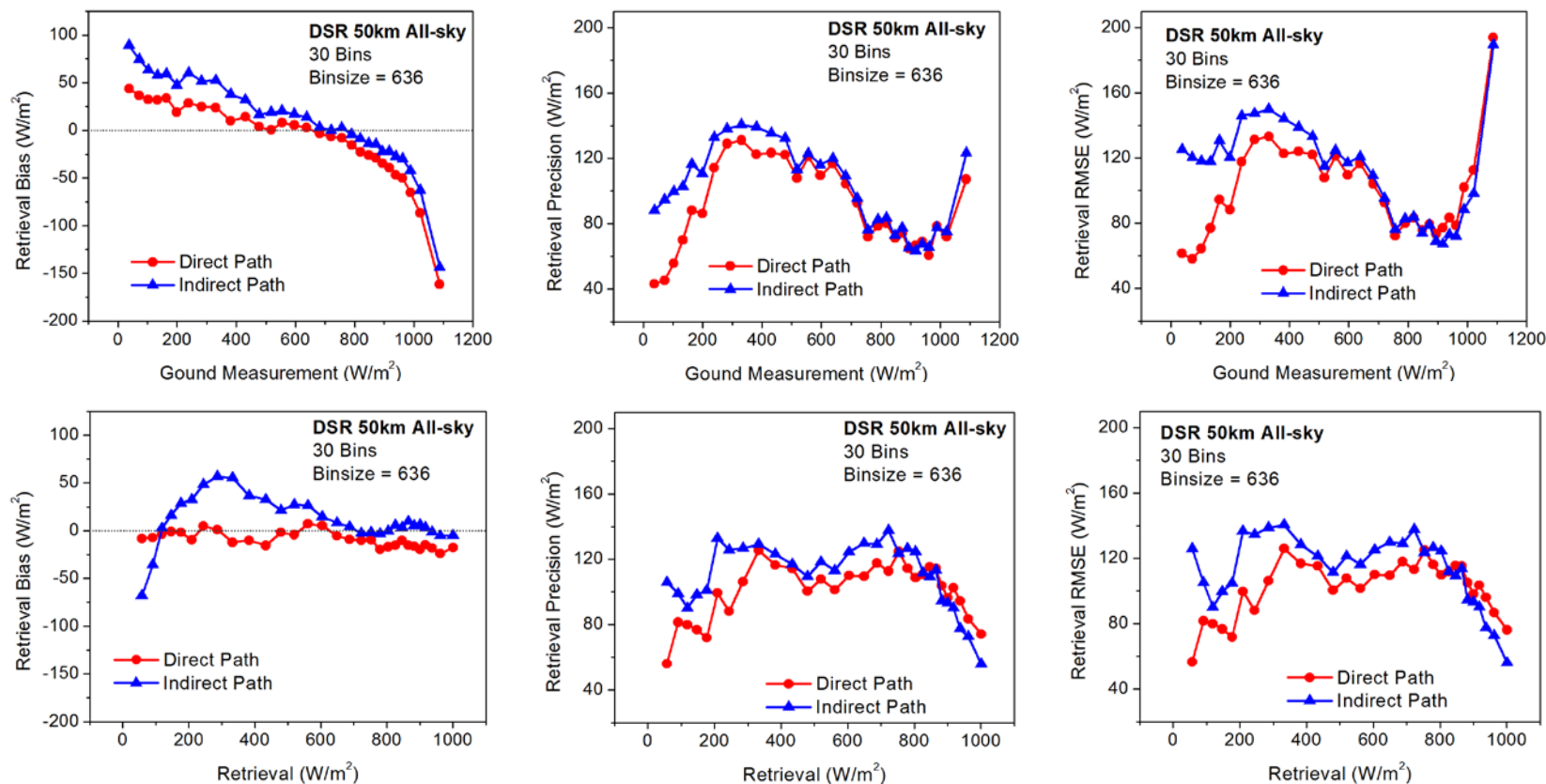
Bias:  $-0.9 \text{ W/m}^2$  (-0.3%)  
RMS :  $30 \text{ W/m}^2$  (11%)  
Corr: 0.986

- small bias and rms error
- Only DPA results shown since IPA used CERES TOA value as input
  - IPA assumed “perfect” narrow-to-broadband conversion and ADM!



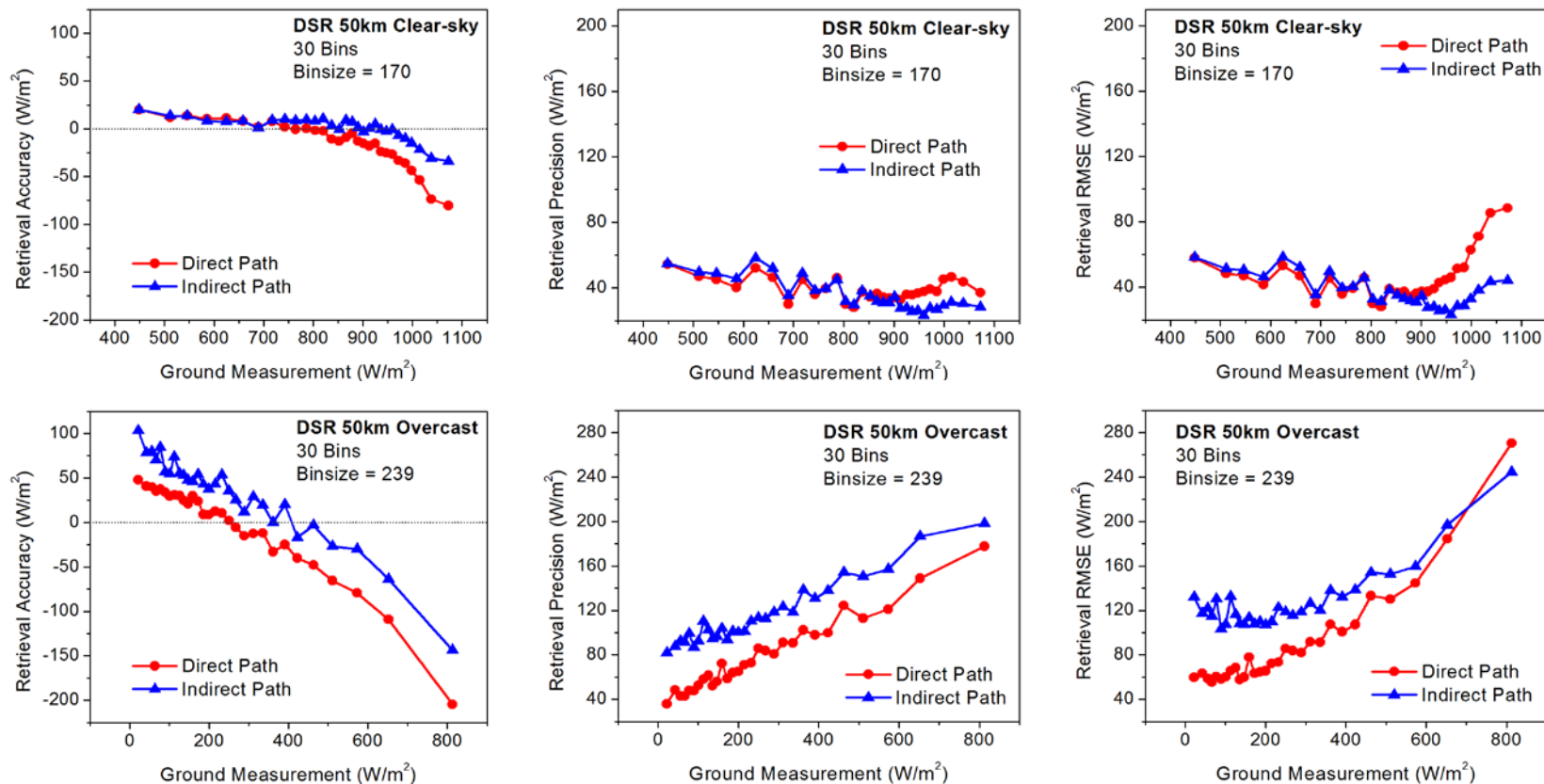
# Validation Results

## MODIS data – DSR (1)



- bias vs. ground/retrieval pattern from DPA is similar to that with CAVE input
- IPA has larger bias and std than DPA at low DSR – larger error in overcast sky (next slide)

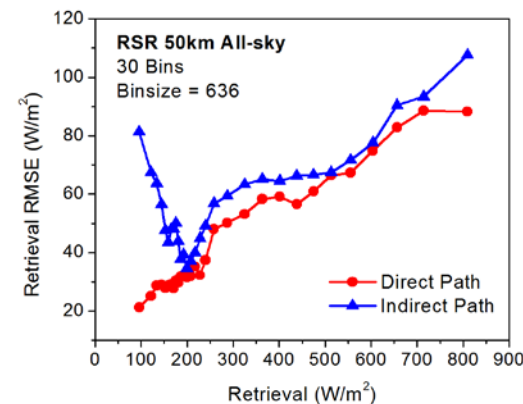
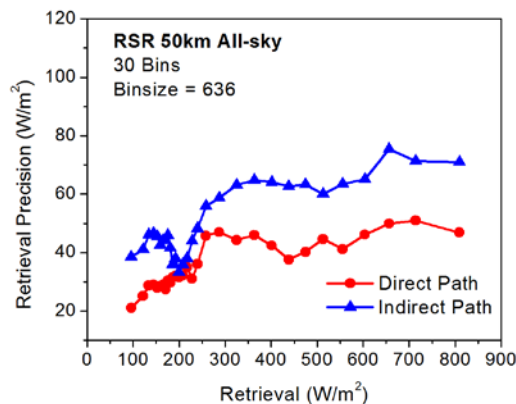
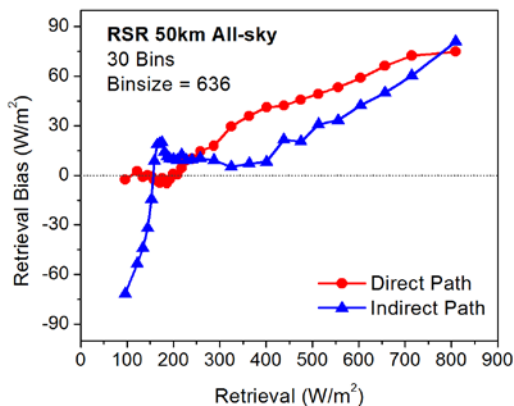
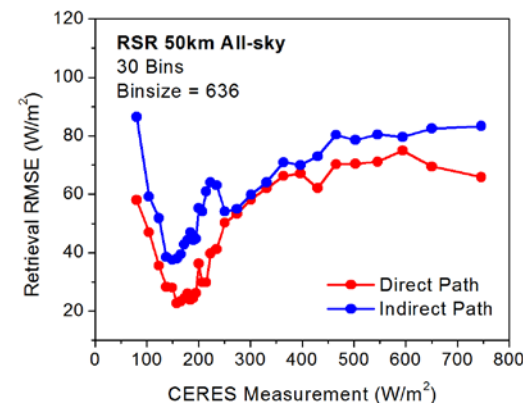
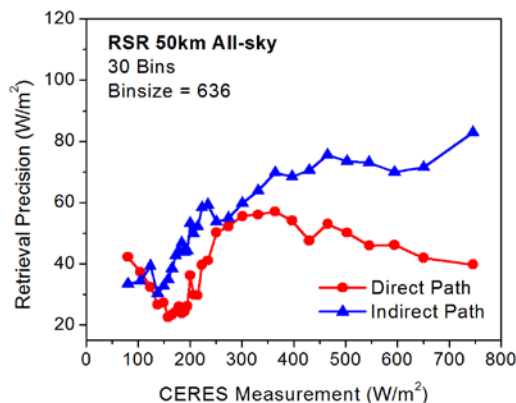
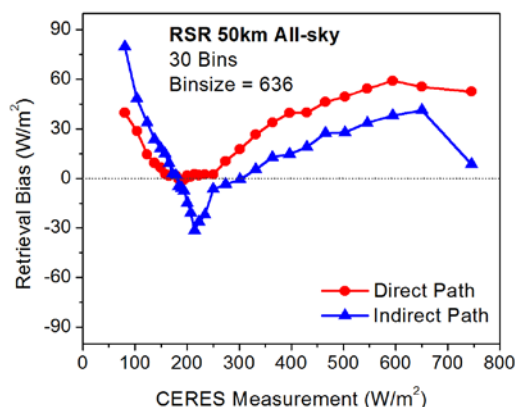
# Validation Results MODIS data – DSR (2)



- clear sky: accuracy, precision and RMSE in DPA and IPA are similar at low DSR
- clear sky: IPA has smaller error than DPA at high DSR
- overcast sky: std in IPA is larger than in DPA; IPA bias is larger(smaller) than DPA bias below (above)  $\sim 400 W/m^2$  DSR

# Validation Results

## MODIS data – RSR (1)

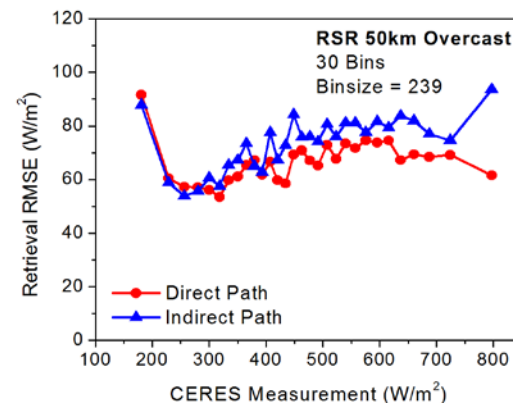
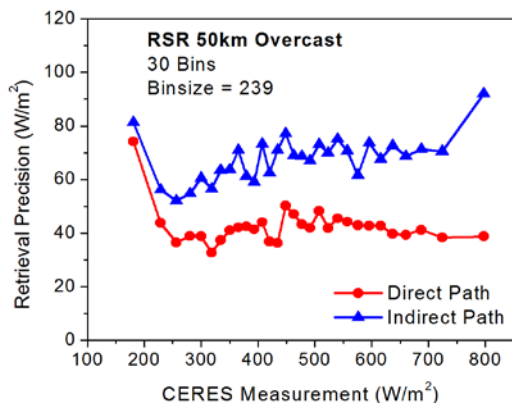
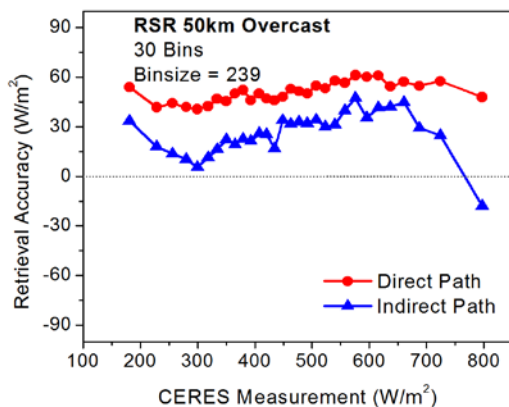
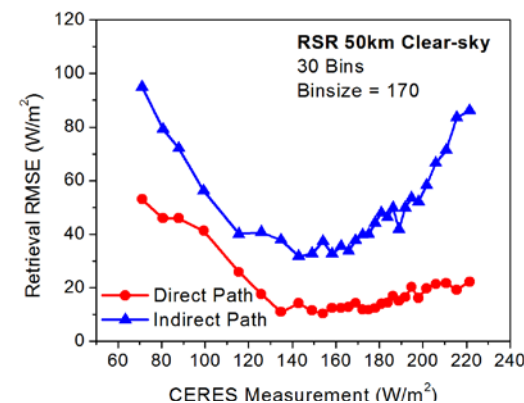
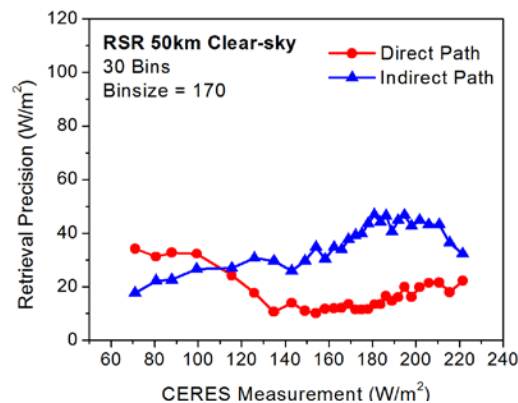
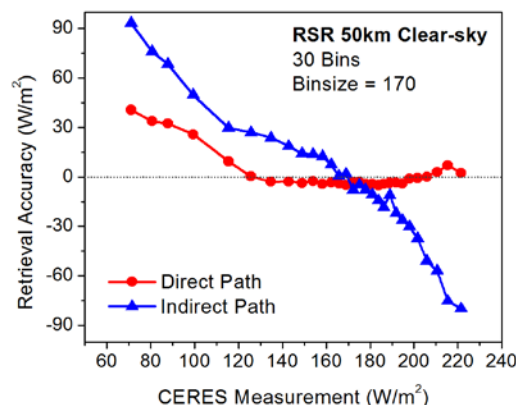


- bias/std/rmse are functions of RSR for both types of plots – even IPA bias strongly depends on retrieval
- DPA bias is larger than that from IPA at mid-large RSR



# Validation Results

## MODIS data – RSR (2)



- clear IPA bias > overcast IPA bias at low & high RSR
- overcast std > clear std; IPA std > DPA std
- clear IPA RMSE > clear DPA RMSE; overcast DPA and IPA RMSEs are similar at low RSR



# Validation Results

## MODIS Dataset – Summary Table

	DSR			RSR		
	All Sky	Clear	Overcast	All Sky	Clear	Overcast
Number of Retrievals	19103	5111	7195	19103	5111	7195
Direct Path Algorithm						
Accuracy (bias) (W/m <sup>2</sup> )	-9.34 (-1.6%)	-13.88 (-1.7%)	-6.70 (-2.6%)	20.08 (6.9%)	2.97 (1.8%)	50.90 (10.9%)
Precision ( $\sigma$ ) (W/m <sup>2</sup> )	102.23 (17.6%)	46.67 (5.7%)	101.49 (38.9%)	45.46 (15.6%)	23.05 (14.0%)	43.38 (9.3%)
RMSE (W/m <sup>2</sup> )	102.66 (17.6%)	48.69 (5.9%)	101.71 (38.9%)	49.70 (17.0%)	23.24 (14.1%)	66.88 (14.4%)
Indirect Path Algorithm						
Accuracy (bias) (W/m <sup>2</sup> )	10.71 (1.8%)	0.78 (0.1%)	29.16 (11.2%)	10.57 (3.6%)	-3.73 (-2.3%)	25.79 (5.5%)
Precision ( $\sigma$ ) (W/m <sup>2</sup> )	114.37 (19.6%)	39.30 (4.8%)	129.84 (49.7%)	61.11 (20.9%)	56.28 (34.1%)	69.59 (14.9%)
RMSE (W/m <sup>2</sup> )	114.86 (19.7%)	39.31 (4.8%)	133.06 (51.0%)	62.02 (21.2%)	56.40 (34.1%)	74.21 (15.9%)