

Satellite Based Downward Long Wave Radiation by Various Models in Northeast Asia

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ABSTRACT

Satellite-based downward long wave radiation measurement under clear sky conditions in Northeast Asia was conducted using five well-known physical models (Brunt 1932, Idso and Jackson 1969, Brutsaert 1975, Satterlund 1979, Prata 1996) with a newly proposed global R_{ld} model (Abramowitz et al. 2012). Data from two flux towers in South Korea were used to validate downward long wave radiation. Moderate resolution imaging spectroradiometer (MODIS) atmospheric profile products were used to develop the R_{ld} models. The overall root mean square error (RMSE) of MODIS R_{ld} with respect to two ecosystem-type flux towers was determined to be $\approx 20 \text{ W m}^{-2}$. Based on the statistical analyses, MODIS R_{ld} estimates with Brutsaert (1975) and Abramowitz et al. (2012) models were the most applicable for evaluating R_{ld} for clear sky conditions in Northeast Asia. The Abramowitz R_{ld} maps with MODIS T_a and e_a showed reasonable seasonal patterns, which were well-aligned with other biophysical variables reported by previous studies. The MODIS R_{ld} map developed in this study will be very useful for identifying spatial patterns that are not detectable from ground-based R_{ld} measurement sites.

Key words: Downward long wave radiation, Moderate resolution imaging spectroradiometer, Air temperature, Vapor pressure, Brutsaert, Abramowitz

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1. INTRODUCTION

Downward long wave radiation (R_{ld}) is one of the most essential components of global scale energy budget research (Duarte et al. 2006). In principle, it substantially influences net radiation and evapotranspiration (ET), which are critical factors in understanding surface energy distribution, hydrological cycles and water resource management at various scales (Niemelä et al. 2001; Bastiaanssen et al. 2005; Allen et al. 2007; Choi et al. 2008; Ryu et al. 2008). The R_{ld} is mainly generated by sunlight absorption by carbon dioxide, ozone molecules and cloud water droplets in the atmosphere, along with the absorption of upward thermal radiation emitted by the surface (Idso and Jackson 1969; Mölders et al. 2008). R_{ld} can be measured directly using a pyrgeometer (Duarte et al. 2006). However, this instrument is expensive, difficult to use, and not fully incorporated into the suite of

normal atmospheric sensors in automated weather stations (Duarte et al. 2006; Choi et al. 2008; Kruk et al. 2010). For this reason, radiative models established using easily measurable data (i.e., air temperature and actual vapor pressure) have been commonly used to obtain R_{ld} .

Many models that cover both clear and cloudy skies exist from complex radiative transfer models to simple empirical models (Duarte et al. 2006). Radiative transfer models include low resolution atmospheric transmittance (LOWTRAN) (Kneizys et al. 1983), moderate resolution atmospheric transmittance (MODTRAN) (Berk et al. 1998), Streamer (Key and Schweiger 1998), and Monte-Carlo code for the physically correct tracing of photons in cloudy atmospheres (MYSTIC) (Mayer et al. 1998). These models may describe the emission and absorption processes of R_{ld} in the atmosphere more precisely than simpler models. A recently introduced model for R_{ld} estimation using artificial neural networks based on the nonlinearity between long wave radiation and satellite-driven

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brightness temperatures is notable compared to other models (Liu et al. 1997). Even if complicated models can estimate R_{ld} more accurately, they require more data, such as temperature, humidity profiles and aerosols that are not often available at the sites (Duarte et al. 2006).

Simple models are therefore more readily applicable to local temperature and humidity atmospheric profiles characteristics (Prata 1996; Kjaersgaard et al. 2007; Choi et al. 2008; Kwon and Choi 2011). Brutsaert's (1975) and Prata's (1996) equations, which are based on the Stefan-Boltzman law with different physical parameterizations of the emissivity term, are typically used to estimate R_{ld} under relatively homogeneous climate and topography conditions (Prata 1996; Sridhar and Elliott 2002; Duarte et al. 2006; Kjaersgaard et al. 2007; Choi et al. 2008; Ryu et al. 2008; Jang et al. 2009).

R_{ld} estimations from specific local sites are not sufficient for larger scale representations due to the spatiotemporal heterogeneity of R_{ld} (Kjaersgaard et al. 2007). A remote sensing technique has been a promising tool to address this issue. Diak et al. (2000) employed the satellite data retrieved from a geostationary operational environmental satellite (GOES) to estimate R_{ld} under all sky conditions for agricultural applications. Wang and Liang (2009) employed linear and nonlinear models to estimate instantaneous clear-sky R_{ld} using a moderate resolution imaging spectroradiometer (MODIS). In addition, Bisht and Bras (2010) employed MODIS data to estimate R_{ld} in Southern Great Plains.

The main objective of this study is to build a map of downward long wave radiation (R_{ld}) for Northeast Asia. To accomplish this goal the most appropriate R_{ld} equation for clear sky conditions was sought from among six well-known empirical or physical equations (Brunt 1932; Idso and Jackson 1969; Brutsaert 1975; Satterlund 1979; Prata 1996; Abramowitz et al. 2012). Data from two South Korean flux tower measurements were used to validate the downward long wave radiation spatial distributions.

2. MATERIALS AND METHODS

2.1 Study Site and Ground Measurement Data

Two flux tower sites in South Korea were selected to validate the MODIS-based R_{ld} algorithm. The two flux tower sites, Seolmacheon (SMK) and Cheongmicheon Farmland (CFK), are located in the mid-western area of the Korean Peninsula (Table 1 and Fig. 1). The dominant land covering the SMK site is mixed forest and the elevation from sea level is 293 m. Several oak species and some maple trees are commonly found in this area. The average canopy height is approximately 15 m. The tree ages range from 20 - 40 years. The radiation components were measured at a height of 18.05 m above the ground using a Kipp and Zonen CNR1 radiometer (Kipp and Zonen, Netherlands), while the air temperature and vapor pressure were measured at a height of 19 m above the ground using eddy covariance instruments (SAT-540 ultrasonic anemometer, KAIJO, Japan and

Table 1. Site descriptions of two flux towers in South Korea.

ID	Sites	Latitude/Longitude	Land cover	Altitude (m)	Canopy height (m)	Age (year)
SMK	Seolmacheon	37.94°N/126.95°E	Mixed forest	293	15	20 - 40
CFK	Cheongmicheon	37.16°N/126.65°E	Rice paddy	141	1	Annual plant

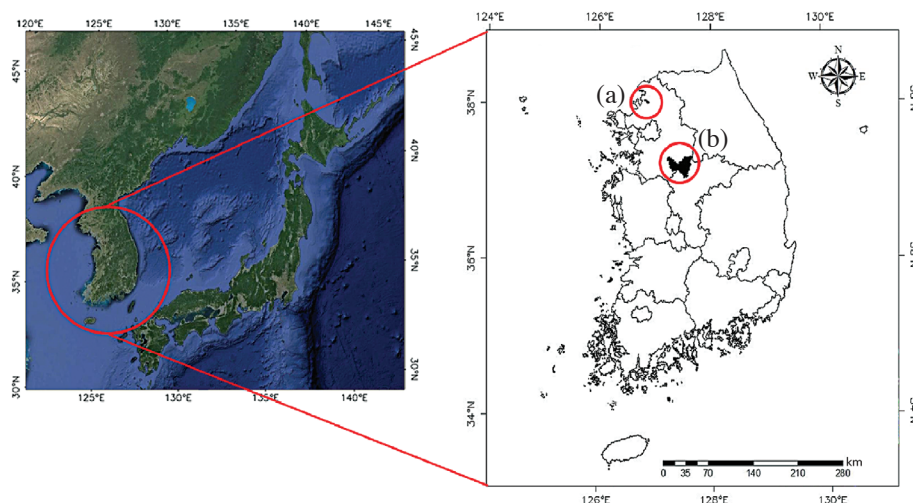


Fig. 1. Study area. (a) SMK site, (b) CFK site.

LI-7500 open-path, LI-COR, USA, respectively). Both sets of measurements were acquired at 30 minute intervals on average. The CFK site is located on farmland with complex land coverage and an elevation of 141 m. The average canopy height is approximately 1 m. The radiation components were measured at a height of 10 m above the ground using a Net radiometer (CRN2, Kipp and Zonen, Netherlands), while the air temperature and vapor pressure were measured at a height of 10 m above the ground using an eddy covariance system (RM81000 3D sonic anemometer, RMYoung, USA and KH20 hygrometer, Campbell Sci., USA, respectively). Both sets of measurements were acquired at 30 minute intervals on average. The flux tower measurements include key meteorological variables, such as radiation and precipitation with continuous flux variables such as water and energy.

2.2 Satellite Data

MODIS has been widely used for energy balance studies because it provides a solid guideline on spatiotemporally continuous information over the surface of the Earth (Tang and Li 2008; Jang et al. 2009). MODIS data from the Terra spacecraft (10:30 overpass) were used to estimate R_{ld} using equations. Among all existing MODIS products provided by the National Aeronautics and Space Administration (NASA), the atmospheric profile product MOD07, which includes air and dew point temperatures, was selected for this study. The spatial resolution of MOD07 is 25 km². It provides instantaneous geophysical variables with intermediate resolution, such as latitude, longitude, air and dew-point temperature, surface pressure, total precipitable water vapor, solar zenith angle, and brightness temperature (Seemann et al. 2003). From among these datasets, air temperature and dew-point temperature retrieved from 2008 data were used in this study. To select the number of clear sky days used for R_{ld} models, we counted the number of 1 km² clear pixels within a 25 km² pixel in the MOD07 atmospheric profile product (Ryu et al. 2008). The data points considered to be “perfect” clear sky days (having 25 clear pixels) were only selected for the analysis. The long wave radiation was then retrieved

from the air and dew-point temperatures at the bottom of the valid layer among twenty vertical atmospheric pressure levels. The Clausius-Clapeyron equation was used to calculate the actual water vapor pressure described as

$$e_a = 6.108 \times \exp^{[17.27 \times T_d / (T_d + 237.3)]} \quad (1)$$

where e_a is MODIS-driven actual water vapor pressure at screen level (hPa), and T_d is the dew point temperature (°C).

2.3 Downward Long Wave Radiation (R_{ld}) Models

The general form of the R_{ld} equation is:

$$R_{ld} = \varepsilon_a \sigma T_a^4 \quad (2)$$

where ε_a is the atmospheric emissivity, σ is the Stefan-Boltzman constant ($W m^{-2} K^{-4}$), and T_a is the air temperature (K). R_{ld} modeling was dependent mainly on how to calculate ε_a , which is typically determined by the T_a and e_a near the land surface (Choi et al. 2008). The five clear sky-based models for R_{ld} derived from the observed radiation flux and transfer theory were selected (Table 2). We adopted a new global R_{ld} model from Abramowitz et al. (2012). Their developed equation is described as:

$$f(e, T) = 3.1e + 2.84T - 522.5 \quad (3)$$

where e is the actual vapor pressure (hPa) and T is the air temperature (K). The main property of the Abramowitz R_{ld} model is that cloudy variables might be redundant in estimating all-sky R_{ld} if a functional frame of $R_{ld} = f$ (temperature, surface vapor pressure) is reasonably chosen.

3. RESULTS AND DISCUSSION

3.1 Spatio-Temporal Variations of R_{ld} in Northeast Asia

The spatio-temporal variations of instantaneous R_{ld} based on the Abramowitz model with MODIS input data

Table 2. The six R_{ld} models with original parameters.

Downward Longwave Radiation	References
$R_{ld} = (0.605 + 0.048e_a^{1/2})\sigma T_a^4$	Brunt 1932
$R_{ld} = \{1 - 0.26 \exp[-7.77 \times 10^{-4}(273 - T_a)^2]\} \sigma T_a^4$	Idso and Jackson 1969
$R_{ld} = 1.24(e_a/T_a)^{0.14} \sigma T_a^4$	Brutsaert 1975
$R_{ld} = \{1.08 [1 - \exp(-e_a^{T_a/2016})]\} \sigma T_a^4$	Satterlund 1979
$R_{ld} = (1 - [1 + 46.5(e_a/T_a)] \exp\{-[1.20 + 139.5(e_a/T_a)]^{1/2}\}) \sigma T_a^4$	Prata 1996
$R_{ld} = 3.1e_a + 2.84T_a - 522.5$	Abramowitz et al. 2012

Note: T_a : air temperature (K) and e_a : actual vapor pressure (hPa).

in Northeast Asia are presented in Fig. 2. We can observe that the overall R_{ld} values in the growing season (from May to October) are higher (more red) than in the non-growing season. Because the most important factors regulating R_{ld} values are the air temperature and water vapor pressure, as described in the model equations, it is easy to explain the appearance of the high R_{ld} numbers in the “hot and humid” growing season. This seasonal R_{ld} pattern in Northeast Asia was very similar to other biophysical variables such as LAI, evapotranspiration (ET), net radiation, and gross primary production (GPP) in previous reports (Kang et al. 2003; Hwang et al. 2008; Hwang et al. 2013).

One annual survey on the variation in R_{ld} revealed more interesting facts. First, R_{ld} values were highest in the southern coastal region from January to April and from October to December. The highest values gradually transitioned to the mid-western coastal region in May, June, July, August, and September. In contrast, the majority of the lower R_{ld} numbers were distributed around the mid-eastern high

mountainous areas throughout the year, although there was a minor change. The differences in R_{ld} values between the mid-eastern area and southwestern coastal region reached up to 400 W m^{-2} in September and October. The possible cause for this variation may have been the low level of turbulent Yellow Sea flux (Na et al. 1999). However, further study is required beyond the scope of this paper.

Satellite R_{ld} maps successfully described the geophysical information for the high regions. In fact, the information presented in the above paragraph would not exist if we employed only the ground-measured methods. This is because the Sorak Mountain altitude is 1708 m, among other reasons. R_{ld} values in the mountainous region were well-resolved (from $\approx 100 - 300 \text{ W m}^{-2}$) in all twelve figures using satellite measurements. We could reasonably match that figure with the altitude morphology of Northeast Asia. The blue color location closely overlapped with most Korean mountains in this figure; that is, R_{ld} decreased as the altitude increased. Halla Mountain on Jeju Island (a large island located in the

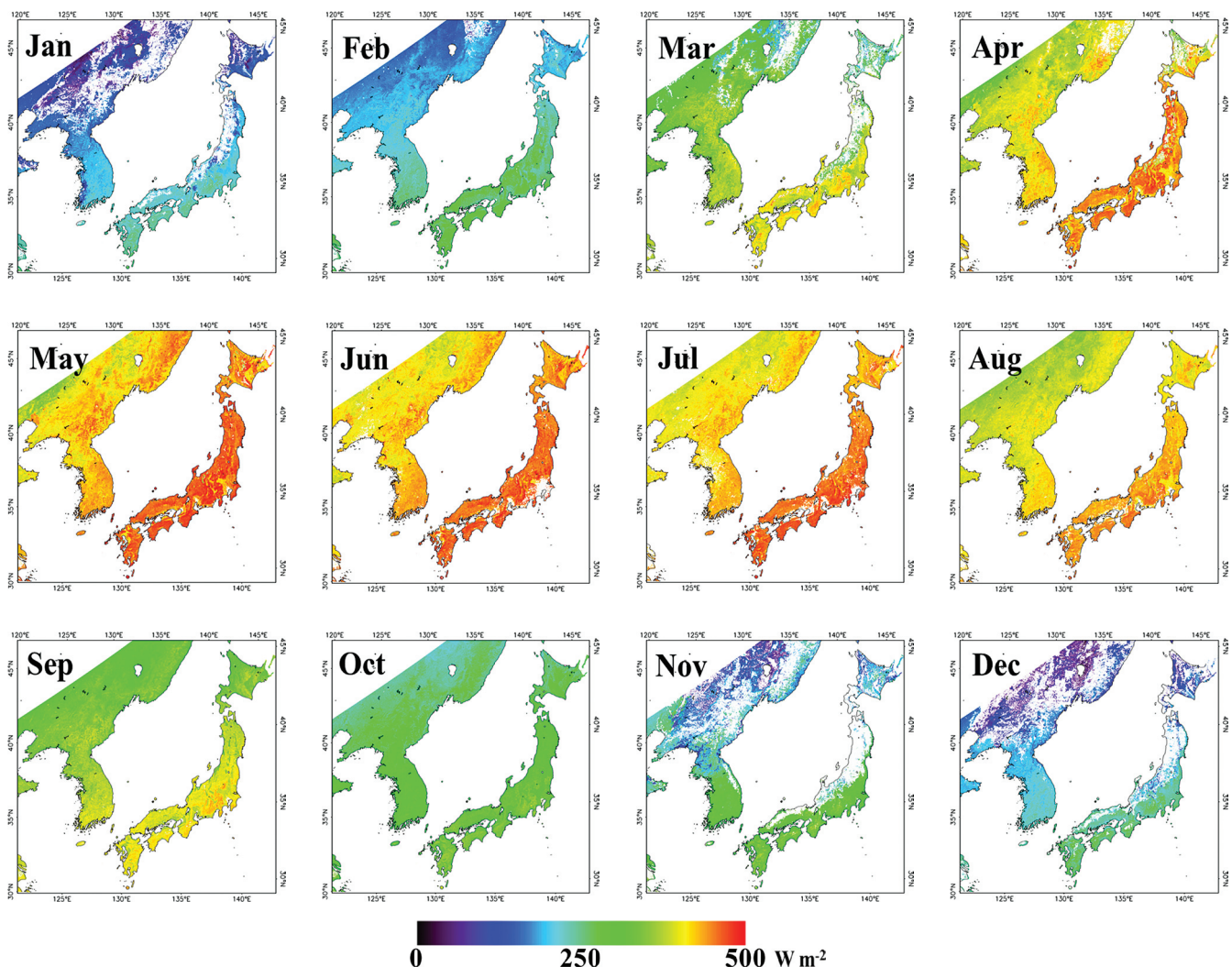


Fig. 2. Spatial distributions of R_{ld} based on Abramowitz's equation with MODIS input data.

southern part of Korea) is the highest mountain in South Korea at a height of 1950 m. Unfortunately, severe cloud contamination hampered obtaining meaningful R_{ld} images from the entire Jeju Island in November and December. Even though Halla Mountain is the highest mountain in Korea, R_{ld} values were indicated as lower in the mid-eastern mountainous regions during spring and fall. The low latitude of Jeju Island and the warm Tsushima current seemed to disturb the hydrophysical resolution changes around the mountain, swamping the mountain R_{ld} values with values from the surroundings. Regardless of these drawbacks, the highest R_{ld} values were observed in the southern coastal areas with a low altitude, which was consistent with the study by Yang et al. (2010) on the Tibetan Plateau. Nevertheless, the maps in Fig. 2 successfully demonstrate seasonal variation as a function of altitude elevation.

3.2 R_{ld} from Flux Towers

In Fig. 3 and Table 3a, the MODIS T_a and e_a results are compared with ground-measured values from two flux towers located at Seolmacheon (SMK) and Cheongmicheon (CFK) sites. The MODIS-retrieved T_a values agreed well with the flux tower measurements. The regression slope, R^2 , bias, and root mean square error (RMSE) values were

0.90, 0.91, -3.29, and 4.27 at the SMK site, and 0.95, 0.94, -0.49, and 1.99 at the CFK site, respectively. In the case of actual vapor pressure (e_a), the regression slope, intercept, R^2 , Bias, and RMSE were 0.67, 2.70, 0.84, -1.20, and 3.31 at the SMK site. A relatively small regression slope (0.67) and high intercept position (2.70) resulted in overestimation of e_a at small values and an underestimation of e_a for large values at this site. The MODIS-retrieved e_a resulted in an overall overestimation at the CFK site with the regression slope, intercept, R^2 , bias, and RMSE values of 0.93, 4.74, 0.72, 4.29, and 4.96, respectively. The error magnitudes were generally similar to those in previous studies (Bisht et al. 2005; Ryu et al. 2008; Bisht and Bras 2010).

Ryu et al. (2008) compared MODIS air temperature (T_a) and actual vapor pressure (e_a) from the Terra satellite with flux tower measurements. They reported an RMSE of 2.9°C (T_a) and 4.0 hpa (e_a) at Gwangneung. Using Aqua satellite data the RMSE of T_a was 2.6°C and 3.2 hpa of e_a . As shown by the data, the magnitude of the experimental errors generally corresponded to previous studies (Bisht et al. 2005; Ryu et al. 2008; Bisht and Bras 2010). One intriguing point is that the SMK site yielded a smaller “inter-instrumental” difference (i.e., RMSE) in T_a and a larger difference in e_a compared to the CFK site. The CFK site is located in a flat area as a possible explanation for this observation. This

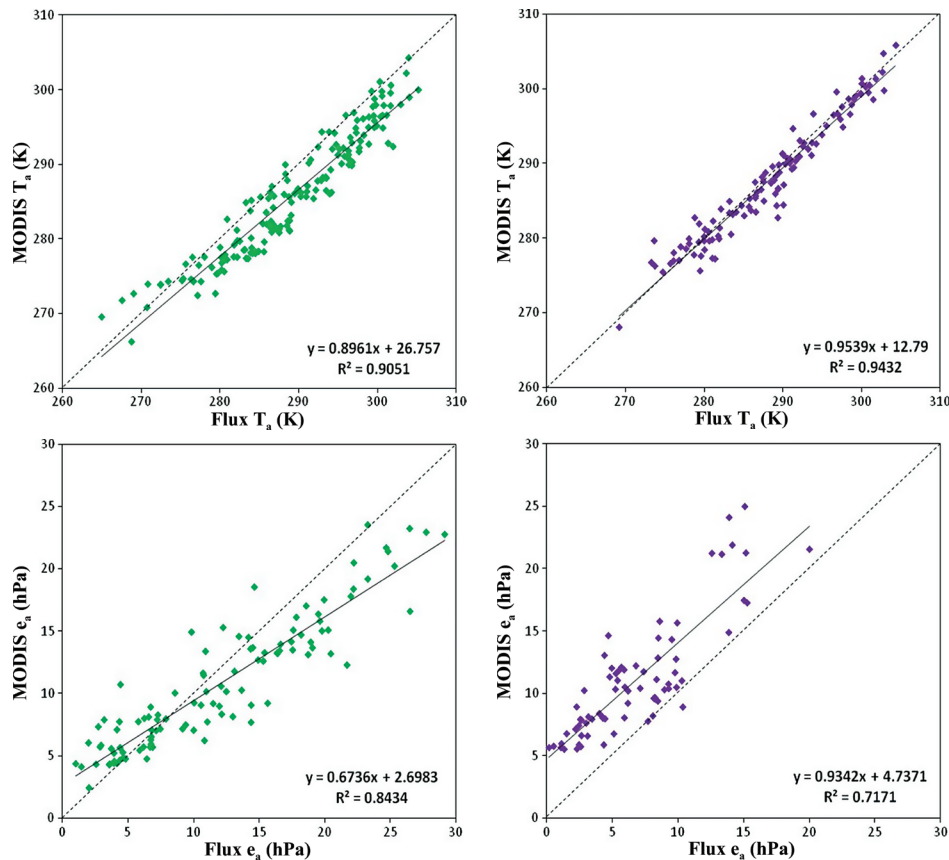


Fig. 3. Comparisons between observed and estimated meteorological variables.

Table 3. Validations of MODIS-retrieved T_a , e_a , and R_{ld} with flux tower measured data.
(a) Input variables (T_a , e_a)

Parameters		SMK	CFK
T_a (K)	A	0.90	0.95
	B	26.76	12.79
	R ²	0.91*	0.94*
	Bias	-3.29	-0.49
	RMSE	4.27	1.99
e_a (hPa)	A	0.67	0.93
	B	2.70	4.74
	R ²	0.84*	0.72*
	Bias	-1.20	4.29
	RMSE	3.31	4.96

(b) R_{ld} estimations

MODIS R_{ld} models		SMK	CFK
Brunt	A	0.81	0.91
	B	40.14	8.00
	R ²	0.86*	0.91*
	Bias	-16.23	-22.30
	RMSE	28.85	28.30
Brutsaert	A	0.91	0.99
	B	11.75	14.65
	R ²	0.87*	0.92*
	Bias	-13.22	-15.71
	RMSE	26.70	23.87
Idso and Jackson	A	0.77	0.77
	B	60.03	32.37
	R ²	0.82*	0.77*
	Bias	-6.04	-44.78
	RMSE	27.25	53.30
Prata	A	0.82	0.92
	B	44.38	12.08
	R ²	0.86*	0.91*
	Bias	-8.74	-14.65
	RMSE	25.36	22.70
Satterlund	A	0.81	0.84
	B	58.23	45.92
	R ²	0.86*	0.90*
	Bias	2.09	-5.24
	RMSE	23.72	19.27
Abramowitz	A	0.67	0.79
	B	114.71	78.62
	R ²	0.88*	0.93*
	Bias	-17.03	10.79
	RMSE	31.71	20.70

Note: (1) $Y = Ax + B$ ($X =$ Ground measured data; $Y =$ MODIS input variables.)

(2) Data points in GDK = 326 and HFK = 260.

(3) *: Significant at the 0.05 probability level.

enables less position-to-position variation in the temperature due to the temperature-invariant atmosphere, while the mountainous area experiences more variation in the average vapor pressure caused by the irregular and location-dependent water supply.

Figure 4 and Table 3b compare the MODIS R_{ld} results using five well-known models (Brunt 1932, Idso and Jackson 1969, Brutsaert 1975, Satterlund 1979, Prata 1996) with ground-measured values from two flux towers. Overall good agreement between the MODIS R_{ld} and measured data were observed. The R² values ranged from 0.82 - 0.86 at the SMK site, and 0.77 - 0.91 at the CFK site, respectively. The regression slope (A) values ranged from 0.82 for the Idso and Jackson model to 0.87 for the Brutsaert model at the SMK site, and 0.77 for the Idso and Jackson model to 0.92 for the Brutsaert model at the CFK site, respectively. In all of the above cases the CFK site showed better correlation between measurement methods presumably because it contains flat terrain that influences the downward long wave absorption compared to the forest-dominant SMK site. A positive bias value (i.e., overestimation) was observed in two cases (2.09 W m⁻² at the SMK site from the Satterlund model, and 10.79 W m⁻² at the CFK site from the Abramowitz model) among all five equations at two flux tower sites. That is, MODIS values were generally lower than ground-measured data values, which was quite predictable considering remote-sensing interference factors such as clouds and meso/macro scale air circulation (Duarte et al. 2006; Choi et al. 2008; Tang and Li 2008).

In general, the Brutsaert model was determined to be the most applicable model considering statistical errors, A, B, and R² values, which were well-supported by several previous studies (Sridhar and Elliott 2002; Duarte et al. 2006; Kjaersgaard et al. 2007; Choi et al. 2008; Choi 2013). In the case of the Satterlund model the statistical errors were slightly lower than those from the Brutsaert and Prata models. However, the difference was less than 10%. On the contrary, B, and R² values were substantially larger and the values were smaller than those from two other models at two sites (Table 3). In addition, the Prata model showed good but slightly less agreement for the same criteria. Sridhar and Elliott (2002) demonstrated that the Brutsaert model performed better than the Anderson (1954) and Idso (1981) models, whereby the RMSE and mean absolute error (MAE) values of the Brutsaert model ranged from 27.2 - 41.4, and 20.1 - 33.1 W m⁻². Note that their RMSE values correspond to those in the present study (\approx 20 W m⁻²). Duarte et al. (2006) evaluated seven R_{ld} equations for clear sky conditions using 279 days of ground-measured data from an experimental site at Ponta Grossa, Brazil. Best results were achieved with the Brutsaert model: the Bias, RMSE, MAE (W m⁻²), A and B of linear regression, and R² values of the Brutsaert model were 12.9, 15.4, 13.5, 0.9, 42.73, and 0.92, respectively; these results are also close to the numbers we observed in

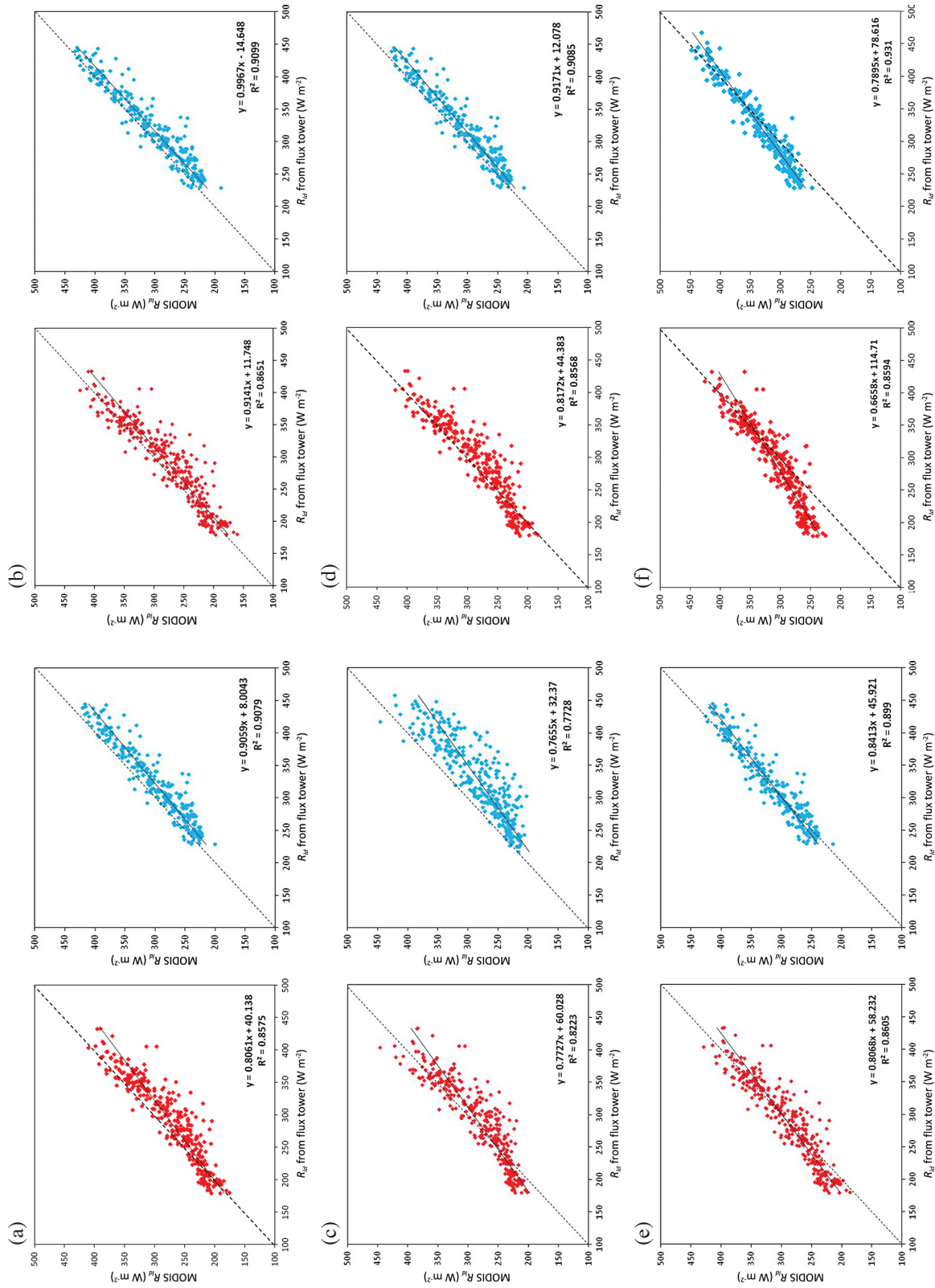


Fig. 4. Validation results for each R_{td} model (a) Brunt model (b) Bruisaert model (c) Idso & Jackson model (d) Satterlund model (e) Prata model (f) Abramowitz model.

this work. Kjaersgaard et al. (2007) compared twenty R_{ld} models for clear sky conditions using ground-measured air temperatures and water vapor pressure at screen height. The RMSEs ranged from 30 - 45 $W m^{-2}$ for clear sky days. They determined that four models (Brunt 1932; Swinbank 1963; Brutsaert 1975; Prata 1996) were superior in performance to sixteen other models tested in their study. Most recently, Choi et al. (2008) tested five models for clear sky conditions, thereby demonstrating that the Brunt (1932) and Brutsaert (1975) models performed the best at eleven studied sites in Florida, USA. Based on our observations as well as on numerous aforementioned case studies, it is reasonable to acknowledge the relevance of the Brutsaert model in atmospheric long wave radiation studies.

For the present study, we evaluated a new R_{ld} calculation using the Abramowitz model and compared it with ground-measured R_{ld} from the two flux tower sites in South Korea. The Abramowitz model provided reasonable R_{ld} results compared with the other models. The R^2 values were 0.88 at the SMK site, and 0.93 at the CFK site, respectively. The regression slope A values were 0.67 at the SMK site, and 0.79 at the CFK site, respectively. The Bias and RMSE were -17.03 and 31.71 $W m^{-2}$ at the SMK site, and 10.79 and 20.70 $W m^{-2}$ at the CFK site, respectively. For these results the Abramowitz model demonstrated the best performance compared to the other models (Choi 2013). Choi (2013) estimated point-based daytime R_{ld} by various physical or empirical models at two Korean regional flux sites and introduced performances of the Abramowitz model. The bias and RMSE were -9.5 and 29.6 $W m^{-2}$ at the Gwangneung (GDK) site, and 1.3 and 28.5 $W m^{-2}$ at the Haenam (HFK) site, respectively. The regression slope and intercept values were relatively lower and higher, respectively, than the other model. While Choi (2013) conducted only point-scaled R_{ld} , we performed satellite-based (gridded-scaled) R_{ld} spatial mapping. For this reason, we conducted by this study a first step to determining the applicability of grid-scaled various R_{ld} models, including the Abramowitz model, for spatial analysis in Northeast Asia.

4. CONCLUSIONS

Six R_{ld} models for clear sky conditions were tested using MODIS input variables and climate data sets from two flux towers sites in this study. Before we evaluated the performance of these models, we validated the MODIS T_a and e_a with ground-measured data from flux towers. MODIS T_a and e_a in clear sky conditions agreed well with ground-measured data at two flux tower sites in South Korea. This result indicates that R_{ld} can be estimated with remote sensing-based T_a and e_a with reasonable accuracy, whereas a ground measurement of R_{ld} was not possible. The average RMSE of MODIS R_{ld} was determined to be $\approx 20 W m^{-2}$ compared to the measured R_{ld} at the flux towers sites. MODIS-retrieved

R_{ld} 's based on six common equations were compared at two sites in South Korea. Based on the optimized regression slope, interception, R^2 , bias, and RMSE values, MODIS R_{ld} estimates using Brutsaert (1975) and Abramowitz et al. (2012) models were the most applicable for describing R_{ld} for clear sky conditions in South Korea, and the Abramowitz equation performed slightly better. Based on these results, we developed Abramowitz R_{ld} maps with MODIS T_a and e_a . The seasonal patterns of R_{ld} values agreed well with other biophysical variables reported by previous studies. Spatial distribution of R_{ld} successfully depicted the geophysical phenomena, such as the latent heat, which could not be solely explained by statistical analysis with climate datasets from flux tower sites. We strongly believe that the MODIS R_{ld} map developed in this study will be very useful for estimating with reasonable accuracy other hydrological cycle and energy balancing components.

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