

EFFECTS OF DAILY NET RADIATION MODEL EXTRACTED FROM MODIS ON DAILY REFERENCE EVAPOTRANSPIRATION

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ABSTRACT

The phenomenon of evapotranspiration (ET) has long been recognized as a key process and plays an essential role in the exchange of energy and mass between the hydrosphere, atmosphere and biosphere. This is one of the important parameters in the model study of global climate change. Our study aimed to clarify the following issues using net radiation R_n model derived from satellite data (Modis) to calculate the daily reference evapotranspiration ET_o over Vietnam terrain. To achieve that goal, 3 daily average net radiation models R_{nd} have been used: (1) net radiation model derived from satellite data (Modis), R_{ndRS} . (2) Net radiation model of the FAO-56 Penman-Monteith, R_{ndFAO} and (3) net radiation model of ASCE-EWRI according Irmak, R_{ndIR} . Three methods for calculating daily reference evapotranspiration ET_o are the FAO-56 Penman-Monteith (FAO-56 PM), Priestley-Taylor (PT), and the method of multiple regression proposed by Irmak (IR) at the Institute of the Environment and Water Resources of the of American Society of Civil Engineers (ASCE-EWRI). The study results showed that using the model R_{ndRS} can be replaced alternative model R_{ndFAO} in FAO-56 PM method with Root Mean Square Error, RMSE = 5.04%, Mean Absolute Error, MAE = 3.85%, and the correlation coefficient between ET_o_FAO (R_{ndFAO}) and ET_o_FAO (R_{ndRS}), $R^2 = 0.8206$.

1. INTRODUCTION

The phenomenon of evapotranspiration (ET) has long been recognized as a key process and plays an essential role in the exchange of energy and mass between the hydrosphere, atmosphere and biosphere. Land surface evapotranspiration, ET is the process of converting volumes of water from ground surface (evaporation) and vegetation (transpiration) into the atmosphere. Actual ET estimates are important in modeling the water balance in the basin, serving management and agricultural irrigation in the weather forecast. However, it is difficult to directly measure ET; and in most applications, ET is estimated using theoretical-experimental models. Reliable quantitative ET is not only a critical task for water resource management, but also a challenge for scientists.

Net radiation (R_n) is the amount of solar energy that vegetation, water and ground absorb, and is a strong driving force in the process of evaporation of water as an unlimited resource. Therefore, the accuracy of R_n affect reliability ET determined from the different models, for example combined model FAO-56 Penman-Monteith (FAO-56 PM) [1, 2, 7]; and the other surface energy balance models [2, 5, 7]. R_n normally is not be measured directly at the weather station due to restrictions on economic and technical condition. R_n primarily estimated from the theoretical-experimental equations [1, 2, 5, 7]. The equations have

substantially different requirements for their inputs as calibration parameters, methods used to calculate the parameters of atmospheric turbidity, emission coefficient, and net long waves radiation. The climate variables commonly used in the R_n model including short-wave solar radiation, R_s ; air temperature, actual vapor pressure and cloud cover fraction.

To evaluate and compare the effect of daily net radiation extracted from the Modis satellite data (R_{ndRS}) [1, 2, 3, 13, 15] to the results of reference evapotranspiration (ET_o), the paper also refers to daily net radiation of the FAO-56 PM (R_{ndFAO}) [1, 2, 11] and daily net radiation as a function of Irmak's multiple regression (R_{ndIR}) [1, 5, 15]. At the same time, the three ET_o methods are used: 1 / FAO-56 PM method (ET_o_FAO) [1, 2.7], 2 / Priestley- Taylor method (ET_o_PT) [6, 8, 11] and 3 / Irmak's multiple regression method (ET_o_IR) [1, 5, 14].

2. MATERIALS AND METHODS

2.1 Input Data

Input materials include:

- Modis image acquisition date was on November 10, 2008 at 03:40:05, GTM (10:40:05, Hanoi local time (Table 1). Modis image geometry has been corrected in the Vietnam Datum System VN-2000. Some Modis products were taken to use: the surface temperature Ts; aerosol; land-surface emissivity coefficient of channels 31, 32.

- Digital Elevation Model, DEM of 90m resolution.

- The field data from 14 meteorological stations on the North Vietnam such as solar radiation incoming to land surface R_s , air temperature T_a , wind speed, pressure (by DEM) were collected in Table 2. Incoming solar radiation R_s of 14 meteorological stations were calculated by experimental formula under the number of effective daylight hours n for the North Vietnam in the period of three months. In our experiment, according Modis image acquisition date, incoming solar radiation R_s has been taken for the period of 3 months of September, October and November as follows: $R_s = 0.025 * n + 6.0$

Table 1. Some parameters of Modis image and DEM for North Vietnam

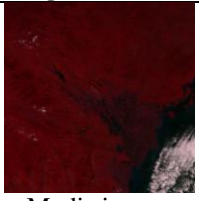
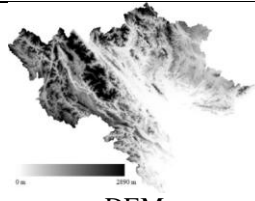
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Sensor	Aqua		
Image level	1A		
RGB image	+		
Spatial resolution	1000 m		

Table 2. Meteorological data acquired at 14 stations on November 10, 2008

No	Station	Height Z (m)	Air temperature (°C)			Wind velocity (m/s)	Pressure (kPa)	Daily incoming solar radiation R_s (from Meteorol. Data) [W/m ² /d]
			T_a	T_{min}	T_{max}			
	1	3	4			5	6	7
1	Ha Giang	123	27.5	13.4	25.4	0.5	100.027	3020.324
2	Lao Cai	93	24	13.8	24.0	0.75	100.343	3008.209
3	Lai Chau	52	23.2	14.0	23.2	0.25	100.776	3000.940
4	Tuyen Quang	219	24.3	15.2	24.3	0.75	99.014	3008.209
5	Lang Son	260	20.9	13.6	20.9	1.5	98.582	3025.170
6	Viet Tri	8	24	16.9	24.0	0.75	101.240	3017.901
7	Son La	627	24	10.5	22.1	1	94.710	3032.440
8	Lang	21	22.1	18.6	23.6	1.25	101.103	3013.055
9	Bai Chay	13	23.6	16.9	23.8	2.25	101.188	3016.690
10	Phu Lien	24	24	16.8	24.0	2.5	101.072	3023.959
11	Hoa Binh	4	24.1	15.2	24.1	1	101.283	3027.594
12	Nam Dinh	1	22.8	17.5	22.8	1.5	101.314	3022.748
13	Hoi Xuan	234	24.4	14.8	24.4	1.5	98.856	2991.248
14	Thanh Hoa	5	23.4	17.0	23.4	2.25	101.272	3015.478

2.2. Methods

2.2.1. Methods for calculating daily reference evapotranspiration

Method 1: FAO-56 Penman-Monteith daily reference evapotranspiration, ETo_FAO

The FAO-56 Penman-Monteith equation (FAO-56 PM) is a grass reference equation that was derived from the ASCE equations by fixing $h = 0.12$ m for clipped grass and by assuming measurement heights of wind and air temperature at $z_w = 2$ m, $z_T = 2$ m, respectively; bulk surface resistance of 70 s m^{-1} , and albedo of 0.23. For 24-hour time steps, FAO-56 Penman-Monteith daily reference evapotranspiration, ETo_FAO [2] is:

$$ETo_FAO = \frac{0.048\Delta(R_{nd} - G) + \gamma \frac{900}{T + 273} U_2 (e_s - e_a)}{\Delta + \gamma(1 + 0.34U_2)} \quad (1)$$

where: ETo_FAO = grass reference evapotranspiration [mm day^{-1}], R_n = net radiation at the crop surface [$\text{MJ m}^{-2} \text{ day}^{-1}$], G = soil heat flux density [$\text{MJ m}^{-2} \text{ day}^{-1}$], T = mean daily air temperature at 2 m height [$^{\circ}\text{C}$], u_2 = wind speed at 2 m height [m s^{-1}], e_s = saturation vapor pressure [kPa], e_a = actual vapor pressure [kPa], $e_s - e_a$ = vapor pressure deficit [kPa], Δ = slope of saturation vapor pressure temperature relationship [$\text{kPa } ^{\circ}\text{C}^{-1}$], γ = psychrometric constant [$\text{kPa } ^{\circ}\text{C}^{-1}$].

Method 2: Priestley-Taylor daily reference evapotranspiration, ETo_PT

Priestley-Taylor reference evapotranspiration, ETo_PT , is in the following form:

$$ETo_PT = a \frac{\Delta}{\Delta + \gamma} \frac{R_{nd}}{\lambda} + b \quad (2)$$

Coefficients a , b in (2) have been calibrated in Priestley-Taylor equation (1972) of 1,26 and 0, respectively; calibrated in Europe (Switzerland), 1984, $a = 0.90$ and $b = 0$; in Asia (Taiwan) $a = 1.00$ and $b = 0$ (Chen, Yen, Lee, Lo, 2005) [3].

Method 3: Irmak (ASCE-EWRI) daily reference evapotranspiration, ETo_IR

Irmak (ASCE-EWRI) used data for many years in the USA and has launched multiple regression to calculate the amount of evaporation, ETo_IR that is a function of average daily net radiation R_n and average daily temperature T_a (Irmak, et al., 2003):

$$ETo_IR = 0.289R_{nd} + 0.023T_a + 0.489 \quad (3)$$

2.2.2. Daily net radiation models, R_{nd}

Model 1: Daily net radiation model in FAO-56 PM method, (R_{ndFAO})

Daily net radiation model in FAO-56 PM method, R_{ndFAO} [1, 2] is in the following presentation:

$$R_{nd} = (1 - \alpha)R_s - f\varepsilon\sigma T_a^4; \quad f = a_1 \frac{R_s}{R_{s0}} + b_1; \quad \varepsilon = a_2 e_a + b_2; \quad T_a = \frac{1}{2}(T_{max} + T_{min});$$

$$R_a = \frac{24(60)}{\pi} G_{SC} \cdot d_r \cdot [\omega_s \sin\phi \sin\delta + \cos\phi \cos\delta \sin\omega_s]; \quad R_{s0} = (0.75 + 2 \cdot 10^{-5} \cdot Z) R_a; \quad R_s = \left(a + b \frac{R_a}{N}\right) R_a \quad (4)$$

where R_{nd} = daily net radiation ($\text{MJ m}^{-2} \text{ day}^{-1}$); $R_{ns} = (1 - \alpha)R_s$ - Incoming net short-wave radiation ($\text{MJ m}^{-2} \text{ day}^{-1}$); R_s = total incoming shortwave radiation that reaches the earth's surface on a given day ($\text{MJ m}^{-2} \text{ day}^{-1}$); $R_{nl} = f\varepsilon\sigma T_a^4$ - outgoing net longwave radiation ($\text{MJ m}^{-2} \text{ day}^{-1}$); α = fraction of solar radiation reflected by the surface. The other parameters can be exactly look for at [1, 2, 8].

Model 2: Daily net radiation model extracted from remote sensing image, (R_{ndRS})

According Bastiaanssen, et al. 1996 [2, 12] instantaneous net radiation at the satellite overpass moment i can be extracted from image data basing on the surface energy balance R_{niRS} as follows:

$$R_{niRS} = R_{ns} + R_{nl} \equiv [(1 - \alpha)R_s] + [R_L^{\downarrow} - R_L^{\uparrow} - (1 - \varepsilon_o)R_L^{\downarrow}] \quad (5a)$$

For calculating daily net radiation, the following integral could be performed (Jackson, et al., 1983) [4] using sine function:

$$R_{ndRS} = \int_0^{DL} R_{max} \sin(\pi \cdot t/DL) = A \cdot R_{iRS} \quad (5b)$$

where R_{max} - Solar radiation at noon (12h); DL - Length of Daytime (from the moment of sunrise to

moment of sunset); t – the argument of the moment of sunrise to the moment i . A is the coefficient.

Model 3: Daily net radiation based on Irmak (ASCE-EWRI) multi-regression, (R_{ndIR})

A multiple regression model of study (Irmak, et al., 2003) at EWRI of ASCE to calculate the average daily net radiation R_{nd} based on maximum and minimum air temperature, T_{max} , T_{min} ; incoming solar radiation R_s measured *in-situ*, and relative distance between the Sun – Earth, d_r on the day of the year, is in the following form [5, 15]:

$$R_{ndIR} = -0.054T_{max} + 0.111T_{min} + 0.462R_s - 49.243d_r + 50.831 \quad (6)$$

For analyzing derived results, following statistical parameters are used: Correlation coefficients, R^2 ; Root mean square error, RMSE; Mean absolute error, MAE; Mean bias error, MBE; Mean ratio, MR.

3. RESULTS AND DISCUSSION

For calculating daily reference evapotranspiration ET_o by three methods as presented in 2^d section, the results of three net daily radiation models such as R_{ndFAO} , R_{ndRS} , and R_{ndIR} described in 2^d section have been taken from [15]. Basing on the equations (1), (2), (3), the reference evapotranspiration of three methods (denote ET_o_{FAO} in *solid lines*, ET_o_{PT} in *dashed lines*, ET_o_{IR} in *dotted lines*) have been calculated and shown in **figure 1**. The graphic presentations of RMSE and MAE of three methods using daily net radiation of remote sensing model (extracted from MODIS) and of IRMAK model in comparison with FAO daily net radiation model are described in **figure 2**. It is clear from figure 1 that:

- For three methods the direct use of R_{ndIR} model proposed by Irmak [5] gives the lowest accuracy in calculation of ET_o (red color in figure 1). For specific region or countries the coefficients of equation (6) need to be calibrated.

- In ET_o_{FAO} method, when using R_{ndFAO} or R_{ndRS} models the results of ET_o are closer each other.

- When using R_{ndFAO} or R_{ndRS} models the results of ET_o_{PT} and ET_o_{RG} are similar each other.

In order to evaluate the effect of remote sensing based daily net radiation on daily reference evapotranspiration, *the internal precision of each method for ET_o using different models R_{nd}* was conducted, basing on analyzing statistical parameters. For this goal the results of $ET_o_{FAO}(R_{ndFAO})$, $ET_o_{PT}(R_{ndFAO})$ and $ET_o_{RG}(R_{ndFAO})$ are considered as the “*standard*” values; remain other results are considered as the “*estimated*”. Statistical parameters are presented in table 3.

Table 3. Internal precision of each method for ET_o using different R_{nd} models

Statistical Parameters	ETo_FAO			ETo_PT			ETo_RG		
	R_{ndFAO}	R_{ndRS}	R_{ndIR}	R_{ndFAO}	R_{ndRS}	R_{ndIR}	R_{ndFAO}	R_{ndRS}	R_{ndIR}
MAE(%)	-	3.85	12.98	-	4.52	16.89	-	3.79	12.56
RMSE(mm/d)	-	0.164	0.430	-	0.238	0.610	-	0.183	0.465
RMSE(%)	-	5.04	13.20	-	6.71	17.18	-	5.02	12.79
MBE(mm/d)	-	-0.112	0.423	-	-0.161	0.600	-	-0.123	0.456
Mean Ratio	1	0.966	1.170	1	0.955	1.169	1	0.966	1.126
R^2	1	0.8206	0.9112	1	0.2588	0.4402	1	0.0323	0.1544
		1	0.9044		1	0.6281		1	0.0926

Some conclusions can be output from table 3:

- In ET_o_{FAO} method, the correlation coefficients R^2 between the ET_o using R_{ndFAO} , R_{ndRS} , R_{ndIR} models are very strong. Specifically, R^2 between $ET_o_{FAO}(R_{ndFAO})$ and $ET_o_{FAO}(R_{ndRS})$, $FAO(R_{ndFAO})$ and $ET_o_{FAO}(R_{ndIR})$, between $ET_o_{FAO}(R_{ndRS})$ and $ET_o_{FAO}(R_{ndIR})$ respectively are 0.8206, 0.9112 and 0.9044. In ET_o_{PT} method the correlation coefficients are lighter and respectively equal to 0.2588, 0.4402, 0.6281. Contrast, in method ET_o_{RG} , these correlation are very weak.

- In all three methods, when R_{ndRS} model used to calculate ET_o , the MAE and RMSE errors are approximately 3 times smaller than the case of using model R_{ndIR} .

- **Important identifying:** R_{ndRS} can be used to replace R_{ndFAO} model for all three methods of determining ET_o_{FAO} , ET_o_{PT} and ET_o_{RG} . Then its influence to MAE (%), RMSE (%) and MBE (%) are less than or approximately equal to 5% (see fig. 2). In particular, ET_o_{FAO} method gives stronger correlation than the other ($R^2 = 0.8206$).

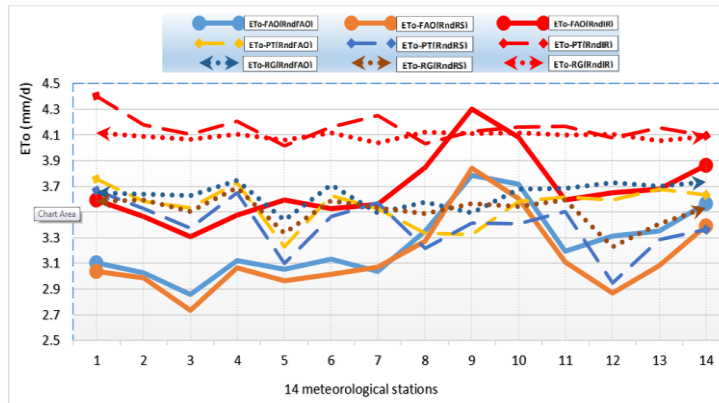


Figure 1. Results of three reference evapotranspiration methods using three models of daily net radiation

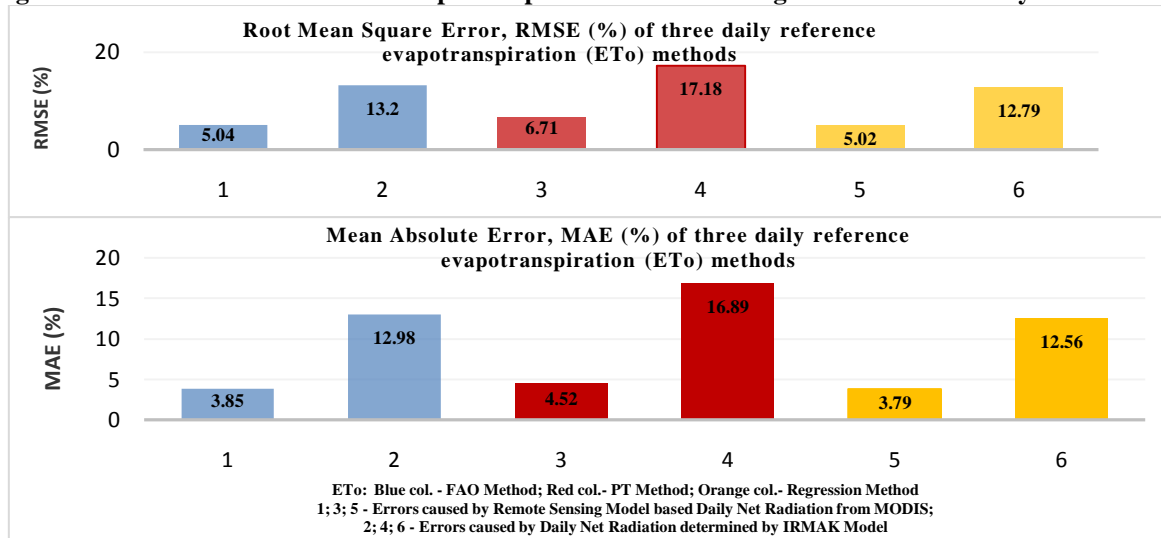


Figure 2. RMSE (on top) and MAE (on bottom) of three daily reference evapotranspiration methods using daily net radiation of remote sensing and IRMAK models in comparison with FAO daily net radiation model (taken from table 3)

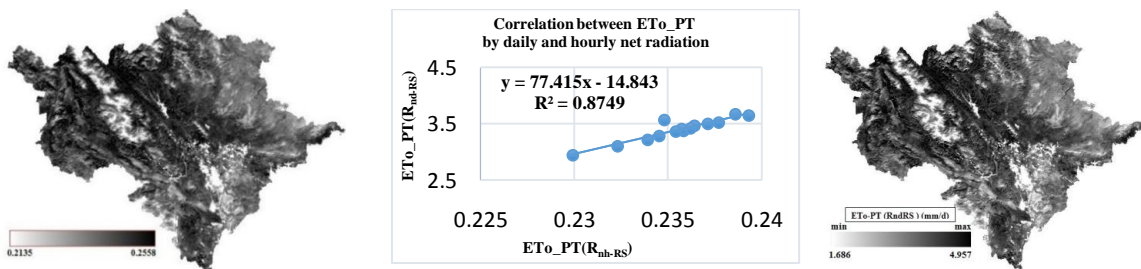


Figure 3. Relationship between daily and hourly reference evapotranspiration ETo based on Priestley-Taylor method (PT) calculated by hourly (R_{nh-RS}) and daily (R_{nd-RS}) net radiation extracted from MODIS image: Hourly reference evapotranspiration $E_{To_PT}(R_{nh-RS})$ in left hand; Daily reference evapotranspiration $E_{To_PT}(R_{nd-RS})$ in right hand; and correlation between $E_{To_PT}(R_{nd-RS})$ and $E_{To_PT}(R_{nh-RS})$ in the middle.

The relationship between hourly and daily reference evapotranspiration ETo calculated by Priestley-Taylor method (E_{To_PT}) using MODIS satellite image for hourly (R_{nh-RS}) and daily (R_{nd-RS}) net radiation is represented in figure 3. Hourly reference evapotranspiration $E_{To_PT}(R_{nh-RS})$ can be look for in [12, 14]. This relationship is very strength ($R = 0.94$; $R^2 = 0.8749$).

4. CONCLUSION

Based on experimental results presented, some conclusions would be outlined as follows:

- For three methods the direct use of R_{ndIR} model proposed by Irmak [5] gives the lowest accuracy in calculation of ETo. For specific region or countries the coefficients of equation (6) need to be calibrated.

- For the same method as ETo_FAO, ETo_PT, ETo_RG, daily net radiation R_{ndRS} extracted from MODIS or R_{ndIR} can be used to replace R_{ndFAO} , when the request errors of MAE (%), RMSE (%) and MBE (%) does not exceed 10% and 20% respectively. Especially in ETo_FAO method, using R_{ndRS} and R_{ndIR} alternative to R_{ndFAO} model, the quantities of reference evapotranspiration ETo are in strong correlation (table 3).

- When using the corresponding R_{ndFAO} , R_{ndRS} , R_{ndIR} models for comparing two ETo_PT, ETo_IR methods with ETo_FAO, the MAE (%), RMSE (%) and MBE (%) errors does not exceed 15%. In other words: we can use ETo_PT and ETo_RG methods alternative to ETo_FAO method, the accuracy of the ETo will decrease less than 15%.

- R_{ndRS} model can be used for ETo_PT and ETo_RG methods to replace R_{ndFAO} model of ETo_FAO method, the accuracy of the ETo would decrease approximately 12%. The MAE (%), RMSE (%) and MBE (%) errors does not exceed 12%. Similarly, for using R_{ndIR} model replaced by R_{ndFAO} in ETo_PT and ETo_RG methods, the accuracy of the ETo would decrease approximately 30%. Other word, the MAE (%), RMSE (%) and MBE (%) errors does not exceed 30%.

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