



## Original Research Article

## Evaluation of reference evapotranspiration methods for the northeastern region of India

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## ABSTRACT

The study planned to identify a suitable alternative to the FAO-56 Penman-Monteith (FAO56PM) equation for calculating reference evapotranspiration ( $ET_0$ ) from chosen temperature and radiation based models utilizing monthly meteorological data from 30 destinations in diverse agro-ecological regions of the Northeast (NE) India i.e., Assam Bengal Plain (ABP), eastern Himalaya (EH), and the northeastern hilly (NEH) region. Radiation-based IRMAK3 most appropriate in the ABP (weighted root mean square deviation, WRMSD=0.17 mm d<sup>-1</sup>,  $r^2=0.98$ , for Nagrakata), and TURC model being in the first three rank of most of the sites, with the lowest error and highest correlation in NEH (WRMSD=0.10 mm d<sup>-1</sup>,  $r^2=0.92$ , for Shillong), and EH (WRMSD=0.23 mm d<sup>-1</sup>,  $r^2=0.95$ , for Gangtok). Findings reveal that IRMAK3 and TURC models performed equally well and were observed to be the best among selected models for the majority of stations followed by FAO24 Blaney-Criddle (FAO24BC), and 1957MAKK. Pair-wise regression equations were developed for preferred FAO56PM  $ET_0$  estimates to  $ET_0$  estimates by alternative methods. Cross-correlation of eighteen chosen methods demonstrated that the five equations (i.e. four radiation- and one temperature-based) performed exceptionally well when contrasted with the FAO56PM model, thus being advised for assessing  $ET_0$  under limiting data conditions as have yielded a better estimate of  $ET_0$  with a small error.

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## 1. Introduction

Evapotranspiration is the integrated process of evaporation and transpiration and is affected by meteorological variables, crop characteristics, and management practices, as well as environmental characteristics.  $ET_0$  is the water evaporated from a reference surface, and was presented to quantify evaporative demand of the atmosphere, independent of the crop growth parameters and management practices (Allen, Pereira, Raes, & Smith, 1998; Zotarelli, Dukes, Romero, Migliaccio, & Morgan, 2010).

$ET_0$  is a highly nonlinear variable controlling varieties of issues in water management, hydrology, agriculture, irrigation scheduling, and proper planning of available fresh water resources. Among the different components of the hydrological cycle, a precise approximation of evapotranspiration is perhaps most difficult due to its complex interactions with the soil–plant–atmosphere system.

The reliable estimation of  $ET_0$  is essential to estimate the net irrigation requirement, regional water resources planning, and management and to model the climate change effect. The direct approach to quantify  $ET_0$  is using lysimeter measurement, or it could be indirectly calculated using the energy balance approach (or empirical models). However, the lysimetric approach is time-consuming and requires precise instrumentation. The indirect approach (methods) is based on site specific meteorological data, altitude, and latitude. The FAO56PM method is the most suitable indirect approach for accurate estimation of  $ET_0$  and evaluation of other empirical models (Allen et al., 1998; Berti, Tardivo, Chiaudani, Rech, & Borin, 2014; Djaman et al., 2015; Lima et al., 2013; Pandey, Pandey, & Mahanta, 2014; Pereira, Allen, Smith, & Raes, 2015; Tabari et al., 2013; Widmoser, 2009).

The FAO Irrigation & Drainage Paper No. 56, (Allen et al., 1998), and ASCE Task Committee on Standardized Evapotranspiration Calculations (ASCE-EWRI, 2005) recommended that the FAO56PM method could be used as a standard equation to calculate  $ET_0$ . The FAO56PM method was validated against lysimeter measured data in diverse climatic conditions worldwide and reported the best method for  $ET_0$  estimation (Allen et al., 2005; ASCE-EWRI, 2005; DehghaniSanij, Yamamoto, & Rasiyah, 2004; Ghamarnia, Mousabeyg, Amiri, & Amirkhani, 2015; Itenfisu, Elliott, Allen, & Walter, 2003; Jain, Nayak, & Sudheer, 2008; Mohan & Arumugam, 1996; Xu, Peng, Ding, Wei, & Yu, 2013). Additionally, the FAO56PM now widely used as reference methods in the field of agronomy, irrigation water management, and other related fields for research purpose (Alexandris, Kerkides, & Liakatas, 2006).

The FAO56PM accounts for aerodynamic as well as physiological parameters, which requires several meteorological parameters such as air temperature, relative humidity, solar radiation or sunshine hour and mean wind speed at 2 m height. The accessibility of required information to utilize FAO56PM is poor under Indian conditions, particularly in NE, India because at most meteorological stations, the necessary information to utilize FAO56PM is not accessible, or if accessible then they have missing records this may be because of defective sensors or low upkeep.

The  $ET_0$  estimation equations can be grouped in view of their data necessities as temperature based, radiation based, mass exchange based, and combination based. The execution of the particular  $ET_0$  estimation method varies with climatic conditions and accessibility of meteorological information, and the data

prerequisites change from method to method (Jensen et al., 1990).

To overcome data inadequacy issue, The FAO Revised and Improved Procedure for Crop Water Requirements (Smith et al., 1991) suggested that empirical methods be standardized for new destinations utilizing the FAO56PM model. Performance Assessment of the different  $ET_0$  estimation methods is a challenging task. Jensen, Burman, and Allen (1990) ranked FAO56PM the best, followed by Kimberly Penman (Wright, 1982), and FAO24 Radiation (FAO24RD) (Doorenbos & Pruitt, 1977) regarding predictive power, in comparison with lysimeter based study. Steiner, Howell, and Schneider (1991) assessed Penman (Penman, 1963), FAO56PM, Jensen–Haise (JH) (Jensen et al., 1990), and Priestley–Taylor (PT) (Priestley & Taylor, 1972) models against lysimeter measured  $ET_0$  under the climate of Southern Great Plains. Findings showed that the FAO56PM was the best to an approximation of  $ET_0$ , and well over the whole range of measured values. Yoder, Odhiambo, and Wright (2005) evaluated eight different  $ET_0$  equations under climatic conditions of southern United States and concluded that TURC (Turc, 1961) may be an attractive alternative to FAO56PM model while Hargreaves (HAR) (Hargreaves & Samani, 1985) is not suitable for selected sites. Nandagiri and Kovoov (2006) assessed the performance of seven different  $ET_0$  methods across the climatic conditions of India and reported the TURC is the best option under humid conditions. Suleiman and Hoogenboom (2007) compared the PT and FAO56PM under humid climate. Their outcomes demonstrated that the utilization of FAO56PM for calculating  $ET_0$  would enhance the irrigation efficiency in Georgia, particularly in the mountainous and coastal areas. Fooladmand, Zandilak, and Ravanan (2008) compared different types of Hargreaves equations for 14 weather stations in the south of Iran taking FAO56PM as standard. The results support HAR equation is a better option under humid climate and low wind conditions. Tabari, Grismer, and Trajkovic (2013) compared 31 different  $ET_0$  equations including developing two new radiation based equation (similar to that of Irmak et al. (2003)) in the northern, Iran (humid environment) considering FAO56PM as standard. Results revealed that developed equation performed better than other selected equations hence radiation-based model were the suitable option to estimate  $ET_0$ .

George and Raghuwanshi (2012) evaluated six different  $ET_0$  models for four sites in India to identify the best and the worst performing methods at each location. The FAO24RD method identified as close agreement with FAO56PM for the humid site. Xu et al. (2013) evaluated PT, HAR, and TURC models for humid East China and reported TURC is a suitable choice for the region. Djaman et al. (2015) evaluated sixteen  $ET_0$  methods against FAO56PM under Sahelian conditions in the Senegal River Valley and reported temperature–humidity based (Valiantzas1, Valiantzas, 2013), and solar radiation based (Valiantzas2, Valiantzas, 2013) over performed other selected methods are the suitable alternative of FAO56PM. Zhao et al. (2014) developed linear regression between two temperature-based models and standard FAO56PM. Good agreements were observed between the developed models and standard FAO56PM.

In spite of the advancement in studies identified with assessments of generally utilized  $ET_0$  methods under humid conditions (Bogawski & Bednorz, 2014; Chen, Gao, Xu, Guo, & Ren, 2005;

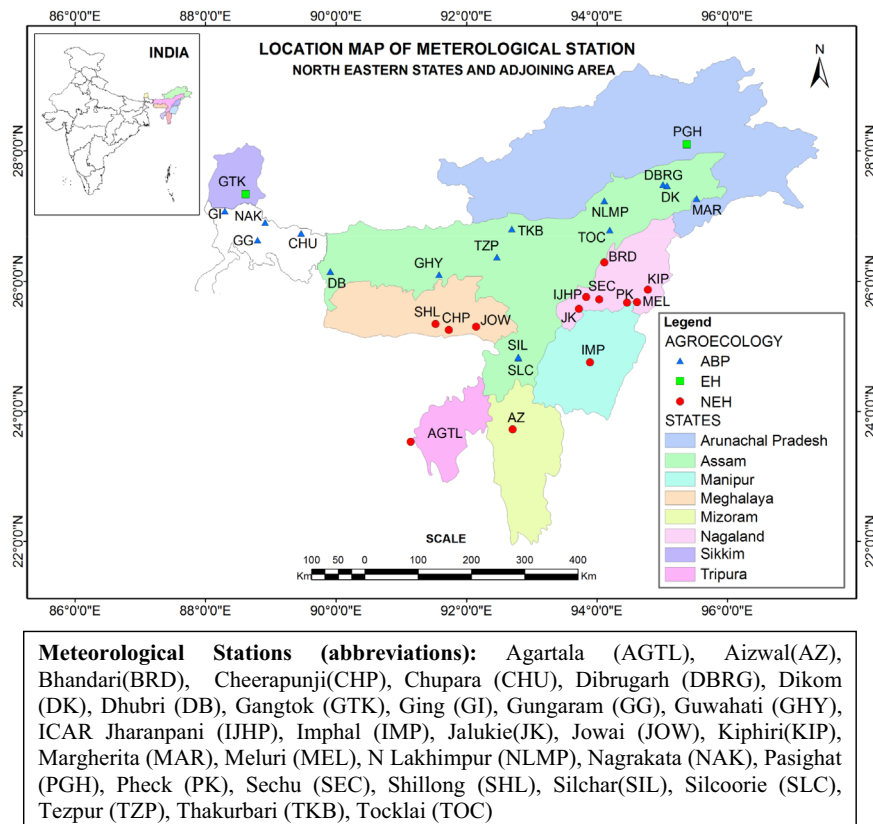


Fig. 1. Location map of North Eastern region of India, showing different states, agro-ecological regions and selected meteorological stations.

Jensen et al., 1990; Pandey et al., 2014; Sentelhas, Gillespie, & Santos, 2010; Trajkovic, 2007), a generalization of the particular model has restricted worldwide pertinence because of their regional climatic reliance. Numerous studies under different climate conditions proposed that regional calibration of temperature and radiation based models can improve their performance (Irmak, Irmak, Allen, & Jones, 2003; Trajkovic, 2005; Xu & Singh, 2001, 2002).

Various limits exist in the accessibility of climate information under the NE, India conditions, for example, scarce data recording stations, missing information. The present examination has been doing to figure out a suitable alternative to the FAO56PM model for the main stations of the region and after that to determine most appropriate according to the agro-ecological region of NE India (Fig. 1). Past studies completed in the study region (for two destinations) was centered on assessing different  $ET_0$  models against the FAO56PM, for example, with pan evaporation based model (Jhajharia, DebBarma, & Agrawal, 2004a), with TURC, JH, and PT (radiation-based models) (Jhajharia, DebBarma, & Agrawal, 2004b), and with HAR (temperature models) (Pandey, Radheshyam, & Hibu, 2009). Pandey et al. (2014) carried out parametric adjustment of temperature based Hargreaves' model to enhance its execution. In any case, none of those above studies gives a general outline of the area. So in the present study, an exertion was made to judge ordinarily utilized  $ET_0$  methods and to recognize a suitable method that can be used for a point scale estimation of  $ET_0$  over NE locale. The findings, are likely to help in diminishing the error associated with  $ET_0$  estimation, and the recognized models in this study could be utilized as part of further examinations in the related field, for example, irrigation planning and management, climate change studies, and water resource planning.

## 2. Materials and methods

### 2.1. About study area

NE, India falls under the humid subtropical ecosystem, characterized by a significant amount of rainfall throughout the year, with humid summers, severe monsoons, and mild winters. NE physio graphically may classify into three agro-ecological regions, namely ABP, EH, and NEH (Purvachal) as per Sehgal, Mondal, Mondal, and Vadivelu (1990). Selected meteorological stations along with abbreviation for present investigation according to agroecological regions are depicted in Fig. 1.

### 2.2. Data availability

In applying various evapotranspiration equations, data (1980–2010 for most of the stations) were collected from different India meteorological stations, Tea Research Association, and an Indian council of agricultural research stations situated in various locations in eight states of in NE region of India (Fig. 1). Some of the stations having a limitation of either sunshine or wind speed data, in this condition missing values were estimated by developing regression equations among the observed values and the global data set ( $1^\circ$  latitude by  $1^\circ$  longitude grid) obtained from the climatology resource for agro-climatology (<http://power.larc.nasa.gov/>). The quality check and integrity of different data was performed as recommended by Allen (1996).

## 3. Methodology

### 3.1. Selection of $ET_0$ methods

Various  $ET_0$  estimation techniques taking into account

**Table 1**  
Details of selected methods for evaluation and input parameters in each method including their references.

Equations (abbreviation)	Reference(s)	Formula	Parameters
<b>Radiation-based</b>			
Caprio (CP)	Caprio (1974)	$ET_0 = (0.01092708T + 0.0060706)R_s$	$R_s, T$
Irmak	Irmak et al. (2003)	$ET_0 = -0.611 + 0.149 \times R_s + 0.079 \times T$ (IRMAK1)	$R_s, T$
(IRMAK1, IRMAK2, IRMAK3)	Tabari et al. (2011)	$ET_0 = -0.642 + 0.174 \times R_s + 0.0353T$ (IRMAK2) $ET_0 = -0.478 + 0.156 \times R_s - 0.0112 \times T_{max} + 0.0733 \times T_{min}$ (IRMAK3)	$T_{max}, T_{min}$
McGuinness–Bordne (MGB)	McGuinness and Bordne (1972)	$ET_0 = (0.005T - 0.0838)R_s$	$R_s, T$
Ritchie (RT)	Jones and Ritchie (1990), Valipour (2015)	$ET_0 = R_s \alpha [(0.002322T_{max} + 0.001548T_{min} + 0.11223)]$	$R_s, T_{max}, T_{min}$
Jensen–Haise (JH)	Jensen et al. (1990)	$ET_0 = 0.408 \times C_T \times (T - T_X) \times K_T \times R_a \times TD^{0.5}$	
Turc (TURC)	Turc (1961), Xu, Singh, Chen, and Chen (2008)	$ET_0 = \alpha_T 0.013 \frac{T}{T+15} \left( \frac{23.8856R_s + 50}{\lambda} \right)$	$R_s, T$
Modified Turc (MODTURC)	Trajkovic and Kolakovic (2009b)	$ET_0 = C_u \times 0.013 \times (23.88 \times R_s + 50) \times T \times (T + 15)^{-1}$ Where $C_u = -0.0211 \times U_2^2 + 0.1109 \times U_2 + 0.9004$	$R_s, T, U_2$
Makkink (1957MAKK)	Makkink (1957)	$ET_0 = 0.61 \frac{\Delta}{\Delta + \gamma} \frac{R_s}{2.45} - 0.12$	$R_s, T$
Priestley–Taylor (PT)	Priestley and Taylor (1972)	$ET_0 = 1.26 \frac{\Delta}{\Delta + \gamma} \times \frac{R_n - G}{\lambda}$	$T, T_{max}, T_{min}$ $n, RH, \varphi, E$
FAO24-Radiation (FAO24RD)	Doorenbos and Pruitt (1977)	$ET_0 = a + b \left[ \frac{\Delta}{\Delta + \gamma} \times R_s \right]$	$R_s, T$
<b>Temperature based</b>			
Hargreaves (HAR)	Hargreaves, and Samani (1985)	$ET_0 = 0.0023(TD)^{0.5}(T + 17.8)R_a$	$R_a, T, T_{max}, T_{min}$
Hargreaves1 (HAR1)	Droogers and Allen (2002)	$ET_0 = 0.408 \times 0.0030(T + 20)(TD)^{0.4}R_a$	$R_a, T, T_{max}, T_{min}$
Hargreaves2 (HAR2)	Droogers and Allen (2002)	$ET_0 = 0.408 \times 0.0025(T + 16.8)(TD)^{0.5}R_a$	$R_a, T, T_{max}, T_{min}$
FAO24-Blaney-Criddle (FAO24BC)	Allen and Pruitt (1986)	$ET_0 = a + bP(0.46T + 8.13)(1 + 0.0001E)$	$T, n, RH_{min}$ $\varphi, u_2, E$
Thornthwaite (TH)	Thornthwaite (1948)	$ET_0 = 16 \left( 10 \frac{T}{T} \right)^i$	$T, \varphi$
Baier–Robertson (BR)	Baier and Robertson (1965)	$ET_0 = 0.157T_{max} + 0.158(TD) + 0.109R_a - 5.39$	$R_a, T_{max}, T_{min}$

Note:  $ET_0$ ,  $R_n$ ,  $R_s$ ,  $G$ ,  $\Delta$ ,  $\gamma$ ,  $u_2$ ,  $T$  are same those defined in the FAO56PM,  $T_{max}$ =maximum air temperature(°C),  $T_{min}$ =minimum air temperature (°C),  $TD=T_{max} - T_{min}$  (°C),  $E$ =elevation (m),  $RH$ =mean relative humidity(%),  $n$ =actual duration of sunshine hour(h),  $RH_{min}$ =minimum relative humidity(%),  $\varphi$ =latitude(rad),  $R_a$ =extra-terrestrial radiation( $MJ m^{-2} d^{-1}$ ),  $\lambda$ =latent heat transfer= $2.45(MJ kg^{-1})$ ,  $U_2$ =long-term mean annual wind speed at 2 m ( $m s^{-1}$ ),  $C_T$ ,  $C_u$ ,  $T_X$ ,  $K_T$ ,  $\alpha$ ,  $a$ ,  $b$ ,  $\alpha_T$ ,  $P$ ,  $i$ ,  $l$  are the empirical coefficients.

distinctive data prerequisites are available in the literature. The point of interest interpretation of frequently utilized methods can be found as a part of Jensen et al. (1990), Allen et al. (1998), and in the manual of "REF-ET for Windows" (Reference Evapotranspiration Calculator programming) (Allen, 2000). As to avoid recurrence of already available literature on  $ET_0$  estimation, simply the name and abbreviations of the particular method, references, formula, and data prerequisites have been said in Table 1. For this study, 18 methods were shortlisted keeping in perspective their data prerequisites and performance under humid environment. All the shortlisted methods alongside references and other details appear in Table 1.

### 3.2. Standardized $ET_0$ estimation

The reference  $ET_0$  values were estimated using FAO56PM for each of the stations. The FAO56PM is a hypothetical grass reference based model that have following characteristics: mean height of vegetation ( $h$ )=0.12 m, measurement of temperature, humidity, and wind at the height of 2 m, latent heat transfer ( $\lambda$ )= $2.45(MJ kg^{-1})$ , bulk surface resistance of  $70 s m^{-1}$ , and albedo=0.23. The final form of the FAO56PM equation for daily or monthly time step is defined as (Allen et al., 1998)

$$ET_0 = \frac{0.408\Delta(R_n - G) + \gamma \frac{900}{T+273} u_2 (e_s - e_a)}{\Delta + \gamma(1 + 0.34u_2)} \quad (1)$$

where  $ET_0$ =reference evapotranspiration ( $mm d^{-1}$ ),  $R_n$ =net radiation ( $MJ m^{-2} d^{-1}$ ),  $(e_s - e_a)$ =difference between the

saturation vapor pressure  $e_s$  (kPa) and the actual vapor pressure  $e_a$  (kPa),  $\Delta$ =slope of the saturation vapor pressure–temperature curve ( $kPa °C^{-1}$ ),  $\gamma$ =psychrometric constant( $kPa °C^{-1}$ ),  $u_2$ =wind speed at 2 m height( $m s^{-1}$ ),  $T$ =mean daily air temperature (°C),  $G$ =monthly soil heat flux density( $MJ m^{-2} d^{-1}$ ). All the intermediate parameters were computed following Allen et al. (1998).

Month to month  $ET_0$  was ascertained utilizing "REF-ET for Windows" Version 3.1.16 software (Allen, 2000). For other applicable methods (not recorded in "REF-ET for Windows") Micro-soft Excel software was utilized.

The values estimated from different equations were compared with the reference value obtained from FAO56PM at the respective station. The performance of equations was evaluated by utilizing several statistical measures.

### 3.3. Comparison of the performance of different $ET_0$ methods

The performances of different selected methods were evaluated against standard FAO56PM. The various error indices used for evaluation of performance are mentioned below:

#### 3.3.1. Index of agreement ( $d$ )

$$d = 1 - \frac{\sum_{i=1}^N (ET_{Eq,i} - ET_{FAO56PM,i})^2}{\sum_{i=1}^N (|ET_{Eq,i} - \overline{ET_{FAO56PM,i}}| + |ET_{FAO56PM,i} - \overline{ET_{FAO56PM,i}}|)^2} \quad (2)$$

where  $ET_{FAO56PM} = ET_0$  estimated using FAO56 PM ( $mm d^{-1}$ );

$ET_{Eq}=ET_0$  values utilizing other selected equation ( $\text{mm d}^{-1}$ ) and  $N$ =the total number of observations.

3.3.2. Mean absolute error (MAE)

$$MAE = \frac{\sum_{i=1}^N |ET_{FAO56PM,i} - ET_{Eq,i}|}{N} \tag{3}$$

3.3.3. Standard error of estimate (SEE)

The SEE is computed following the equation suggested by Ir-mak, Allen, and Whitty (2003) as

$$SEE = \sqrt{\frac{1}{N(N-2)} \left[ N \sum_{i=1}^N ET_{Eq,i}^2 - \left( \sum_{i=1}^N ET_{Eq,i} \right)^2 - \frac{\left[ N \sum_{i=1}^N ET_{FAO56PM,i} \times ET_{Eq,i} - \left( \sum_{i=1}^N ET_{FAO56PM,i} \right) \left( \sum_{i=1}^N ET_{Eq,i} \right) \right]^2}{\sum_{i=1}^N ET_{FAO56PM,i}^2 - \left( \sum_{i=1}^N ET_{FAO56PM,i} \right)^2} \right]} \tag{4}$$

3.3.4. The root mean square difference (RMSD)

$$RMSD = \sqrt{\frac{\left[ \sum_{i=1}^N ET_{FAO56PM,i} - ET_{Eq,i} \right]^2}{N}} \tag{5}$$

Linear regression fitting between the  $ET_0$  estimates by the FAO56PM and comparison equation ( $ET_{Eq}$ .) as follows;

$$ET_{FAO56PM} = s \cdot ET_{Eq} \tag{6}$$

where  $s$  is regression line slope. The measurement unit of MAE, SEE, and RMSD is  $\text{mm d}^{-1}$  while  $d$  is dimensionless.

The fitting regression line through the origin is based on an assumption of zero mean residual, is advantageous in comparing equations as both theoretical approaches origin simultaneously when actual values of  $ET_0$  is zero (Trajkovic & Kolakovic, 2009a).

This approach was utilized to an examination of the reliability of fit between  $ET_0$  estimates, by comparison, equation, and the FAO56PM. The regression coefficients were utilized to correct  $ET_0$  estimates. Afterward, adjusted root mean square deviation (ARMSD) was calculated as follows;

$$ARMSD = \sqrt{\frac{\left[ \sum_{i=1}^N ET_{FAO56PM,i} - s \times ET_{Eq,i} \right]^2}{N}} \tag{7}$$

where ARMSD is adjusted, root mean square deviation in  $\text{mm d}^{-1}$ . The ARMSD indicates precision in assessing  $ET_0$  without a consistent predisposition. Utilizing both RMSD and ARMSD are the effective methodology to evaluate the predictive power of un-adjusted  $ET_0$ , and ease of revising the coefficients of the specific comparison equation to a reference value to improve statistical fitness. Based on indices mentioned above, weighted RMSD (WRMSD) may be formulated as follows (Jensen et al., 1990):

$$WRMSD = 0.67 \times RMSD + 0.33 \times ARMSD \tag{8}$$

**Table 2**  
Station wise ranking measures of first three selected equations against FAO56PM (reference equation) in the ABP region.

St.	$ET_0$ equations (in order of ranking)	Variability measures ( $\text{mm d}^{-1}$ )		Ranking measure ( $\text{mm d}^{-1}$ )		St.	$ET_0$ equations (in order of ranking)	Variability measures ( $\text{mm d}^{-1}$ )		Ranking measure ( $\text{mm d}^{-1}$ )	
		Mean	SD	WRMSD	MAE			Mean	SD	WRMSD	MAE
CHU	<b>FAO56PM</b>	3.00	0.69			NLMP	<b>FAO56PM</b>	2.99	0.74		
	IRMAK3	3.20	0.62	0.34	0.24		IRMAK3	3.05	0.59	0.30	0.22
	MODTURC	3.21	0.57	0.34	0.24		MODTURC	3.15	0.57	0.39	0.28
	1957MAKK	2.74	0.52	0.45	0.32		FAO24BC	2.96	0.60	0.43	0.37
DBRG	<b>FAO56PM</b>	3.00	0.65			NAK	<b>FAO56PM</b>	3.00	0.72		
	IRMAK3	2.94	0.57	0.24	0.18		IRMAK3	3.01	0.58	0.17	0.14
	MODTURC	3.08	0.53	0.30	0.24		IRMAK2	2.92	0.47	0.45	0.38
DK	<b>FAO56PM</b>	2.67	0.69			SIL	<b>FAO56PM</b>	3.45	0.64		
	FAO24BC	2.70	0.59	0.40	0.33		TURC	3.60	0.56	0.31	0.17
	1957MAKK	2.46	0.48	0.43	0.32		IRMAK3	3.21	0.53	0.40	0.28
	IRMAK3	2.96	0.71	0.45	0.35		FAO24RD	3.71	0.69	0.44	0.27
DB	<b>FAO56PM</b>	2.95	0.69			SLC	<b>FAO56PM</b>	3.26	0.70		
	IRMAK3	2.97	0.54	0.21	0.17		IRMAK3	3.22	0.56	0.30	0.23
	FAO24RD	3.22	0.59	0.45	0.31		MODTURC	3.37	0.55	0.38	0.30
	TURC	3.26	0.50	0.49	0.31		1957MAKK	2.93	0.48	0.57	0.39
GI	<b>FAO56PM</b>	2.55	0.61			TZP	<b>FAO56PM</b>	3.00	0.73		
	IRMAK3	2.52	0.63	0.23	0.18		IRMAK3	3.04	0.59	0.21	0.16
	IRMAK2	2.42	0.57	0.23	0.20		IRMAK2	2.90	0.53	0.40	0.34
	1957MAKK	2.36	0.48	0.14	0.24		FAO24RD	3.30	0.71	0.51	0.34
GG	<b>FAO56PM</b>	3.18	0.68			TKB	<b>FAO56PM</b>	2.94	0.76		
	IRMAK3	3.20	0.66	0.43	0.35		FAO24BC	2.98	0.57	0.38	0.34
	1957MAKK	2.99	0.75	0.45	0.34		IRMAK3	3.15	0.65	0.40	0.31
	FAO24BC	3.27	0.84	0.45	0.38		1957MAKK	2.74	0.48	0.45	0.34
GHY	<b>FAO56PM</b>	3.12	0.77			TOC	<b>FAO56PM</b>	2.88	0.27		
	IRMAK3	3.09	0.59	0.30	0.22		IRMAK3	2.95	0.59	0.29	0.24
	FAO24BC	2.86	0.71	0.46	0.34		FAO24BC	2.86	0.62	0.34	0.26
	1957MAKK	2.86	0.52	0.53	0.37		1957MAKK	2.67	0.55	0.44	0.32
MAR	<b>FAO56PM</b>	2.80	0.73								
	FAO24BC	2.72	0.62	0.30	0.24						
	IRMAK3	3.02	0.67	0.38	0.28						
	IRMAK2	2.98	0.55	0.44	0.33						

Note: St.=stations, SD=standard deviation.



**Table 3**

Station wise ranking measures of first three selected equations against FAO56PM (reference equation) in the NEH region.

St.	$ET_0$ equations (in order of ranking)	Variability measures ( $\text{mm d}^{-1}$ )		Ranking measure ( $\text{mm d}^{-1}$ )		St.	$ET_0$ equations (in order of ranking)	Variability measures ( $\text{mm d}^{-1}$ )		Ranking measure ( $\text{mm d}^{-1}$ )	
		Mean	SD	WRMSD	MAE			Mean	SD	WRMSD	MAE
AGTL	FAO56PM	3.85	0.68			JOW	FAO56PM	2.72	0.74		
	FAO24RD	4.01	0.76	0.40	0.29		TURC	2.87	0.70	0.23	0.14
	TURC	3.68	0.58	0.42	0.27		RT	2.89	0.80	0.24	0.16
	FAO24BC	4.12	0.71	0.43	0.30		FAO24BC	2.56	0.80	0.29	0.23
AZ	FAO56PM	3.55	0.69			KIP	FAO56PM	3.48	0.85		
	TURC	3.47	0.61	0.24	0.15		IRMAK1	3.52	0.73	0.17	0.14
	IRMAK2	3.00	0.53	0.28	0.22		FAO24BC	3.53	0.88	0.20	0.15
	RT	3.71	0.72	0.28	0.18		TURC	3.41	0.80	0.23	0.12
BRD	FAO56PM	2.97	0.86			MEL	FAO56PM	3.50	0.83		
	FAO24BC	2.97	0.91	0.24	0.20		FAO24BC	3.56	0.87	0.21	0.16
	MODTURC	2.87	0.68	0.30	0.20		IRMAK1	3.55	0.71	0.21	0.17
	TURC	3.14	0.75	0.32	0.21		TURC	3.45	0.79	0.23	0.11
CHP	FAO56PM	2.52	0.41			PK	FAO56PM	3.28	0.73		
	IRMAK3	2.44	0.46	0.23	0.17		FAO24BC	3.23	0.75	0.15	0.11
	TURC	2.63	0.47	0.25	0.18		IRMAK1	3.34	0.64	0.20	0.17
	IRMAK2	2.37	0.40	0.26	0.19		TURC	3.22	0.70	0.24	0.16
IJHP	FAO56PM	2.85	0.92			SEC	FAO56PM	3.33	0.80		
	FAO24BC	2.93	1.03	0.26	0.19		FAO24BC	3.28	0.81	0.20	0.15
	TURC	2.98	0.79	0.31	0.24		IRMAK1	3.39	0.69	0.26	0.19
	FAO24RD	2.99	1.12	0.39	0.27		TURC	3.27	0.73	0.28	0.18
IMP	FAO56PM	3.12	0.71			SHL	FAO56PM	2.66	0.63		
	IRMAK3	3.08	0.60	0.27	0.20		TURC	2.69	0.61	0.10	0.07
	TURC	3.37	0.58	0.39	0.25		1957MAKK	2.52	0.48	0.33	0.26
	MODTURC	3.39	0.61	0.43	0.32		IRMAK3	2.51	0.59	0.34	0.24
JK	FAO56PM	3.15	0.79								
	FAO24BC	3.24	0.85	0.23	0.16						
	TURC	3.23	0.70	0.30	0.18						
	RT	3.41	0.82	0.40	0.27						

Note: St.=stations, SD=standard deviation.

**Table 4**

Station wise ranking measures of first three selected equations against FAO56PM (reference equation) in the EH region.

St.	$ET_0$ equations (in order of ranking)	Variability measures ( $\text{mm d}^{-1}$ )		Ranking measure ( $\text{mm d}^{-1}$ )	
		Mean	SD	WRMSD	MAE
GTK	FAO56PM	2.85	0.61		
	TURC	2.63	0.66	0.32	0.23
	FAO24RD	2.98	0.80	0.34	0.24
	IRMAK3	2.68	0.70	0.35	0.28
PGH	FAO56PM	3.05	0.66		
	TURC	3.18	0.66	0.23	0.15
	IRMAK3	2.89	0.63	0.26	0.18
	FAO24RD	3.23	0.73	0.32	0.21

Note: St.=stations, SD=standard deviation.

The weighted RMSD speaks to the capacity of different models with anticipating  $ET_0$  unequivocally amid every one of the months. Additionally, it likewise shows the limit of adjustment using a linear multiplier.

### 3.4. Ranking of alternative $ET_0$ equations

The ranking of the equation depended on WRMSD and MAE. The WRMSD was chosen as the useful ranking measure in light of the fact that this demonstrates the ability of the specific equation to estimate  $ET_0$  during all months. MAE is a suitable index to quantify normal error extent (Willmott & Matsuura, 2005). Both chosen error measurements, particularly prescribed for climatic variables adequacy assessment (Chai & Draxler, 2014). The final ranking was figured utilizing an average of WRMSD and MAE i.e. the best model is the one that has the most minimal value acquired by the mean of WRMSD and MAE.

## 4. Results

Month to month  $ET_0$  values was estimated for every single chose station as portrayed in Fig. 1. For every site, every tested model was compared with the FAO56PM model utilizing WRMSD, and MAE. The initial three positioned model for every station was chosen initially taking into account the most minimal of the average of WRMSD and MAE and after that the highest  $r^2$  value. Tables 2–4 present the ranking measures values of WRMSD MAE. Tables 5–7 depict regression equations and performance measures values of  $d$ ,  $r^2$ , SEE, for first three selected equations for each station.

### 4.1. Composite regional results

For each of the three regions, recognized methods had MAE values less than  $1.0 \text{ mm d}^{-1}$ , recommending that all shortlisted equations give a good estimate of FAO56PM. Over the region, IRMAK3 was distinguished as a most suitable option of FAO56PM with performance indices ( $SEE=0.07 \text{ mm d}^{-1}$ ,  $d=0.98$ , and  $r^2=0.98$ ). The TURC was another reasonable decision for NE, India with performance indices ( $SEE=0.08 \text{ mm d}^{-1}$ ,  $d=0.99$ , and  $r^2=0.92$ ). Detail region specific insightful analysis as takes after.

#### 4.1.1. ABP Region

The mean monthly  $ET_0$  values estimated by first five judged methods and standard FAO56PM are depicted in Fig. 2. Statistical indices of mean monthly  $ET_0$  estimated by first three ranked methods (only top three ranked models discussed herewith) against PMFAO56 summarized in Table 2 for all the selected locations. According to Table 2, all the first three ranked equations showed the values of different error measures lower than  $1.0 \text{ mm d}^{-1}$  it means all first three methods could be used for reliable  $ET_0$  estimation. Within the region station-wise analysis (Tables 2, 5, and Fig. 2), suggesting that the

**Table 5**  
Station wise performance measures of developed models for first three ranked equations against FAO56PM (reference equation) in the ABP region.

St.	Equation calibrated (X)	Developed regression equation $ET_0=aX+b$	Performance measures			St.	Equation calibrated (X)	Developed regression equation $ET_0=aX+b$	Performance measures		
			SEE (mm d <sup>-1</sup> )	d	r <sup>2</sup>				SEE (mm d <sup>-1</sup> )	d	r <sup>2</sup>
CHU	IRMAK3	0.839X+0.67	0.19	0.95	0.90	NLMP	IRMAK3	0.743X+0.81	0.23	0.95	0.85
	MODTURC	0.787X+0.84	0.17	0.94	0.91		MODTURC	0.695X+1.07	0.25	0.91	0.80
	1957MAKK	0.708X+0.60	0.10	0.91	0.90		FAO24BC	0.66X+0.97	0.35	0.89	0.66
DBRG	IRMAK3	0.774X+0.61	0.15	0.96	0.93	NAK	IRMAK3	0.795X+0.62	0.07	0.98	0.98
	MODTURC	0.69X+1.0	0.19	0.94	0.87		IRMAK2	0.546X+1.2	0.26	0.86	0.69
	FAO24RD	0.776X+0.91	0.21	0.92	0.88		1957MAKK	0.62X+0.84	0.15	0.88	0.90
DK	FAO24BC	0.638X+1.01	0.13	0.88	0.66	SIL	TURC	0.793X+0.85	0.21	0.94	0.84
	1957MAKK	0.581X+0.93	0.14	0.89	0.88		IRMAK3	0.777X+0.52	0.18	0.92	0.88
	IRMAK3	0.88X+0.63	0.28	0.90	0.82		FAO24RD	0.996X+0.26	0.26	0.93	0.85
DB	IRMAK3	0.764X+0.71	0.13	0.97	0.94	SLC	IRMAK3	0.734X+0.81	0.21	0.94	0.85
	FAO24RD	0.783X+0.88	0.23	0.91	0.85		MODTURC	0.675X+1.15	0.27	0.91	0.75
	TURC	0.683X+1.24	0.19	0.88	0.86		1957MAKK	0.625X+0.88	0.19	0.85	0.84
GI	IRMAK3	0.948X+0.09	0.23	0.96	0.86	TZP	IRMAK3	0.781X+0.69	0.13	0.97	0.95
	IRMAK2	0.844X+0.26	0.23	0.94	0.83		IRMAK2	0.641X+0.96	0.25	0.90	0.77
	1957MAKK	0.744X+0.45	0.14	0.93	0.91		FAO24RD	0.878X+0.65	0.31	0.91	0.81
GG	IRMAK3	0.63X+1.18	0.22	0.93	0.88	TKB	FAO24BC	0.653X+1.05	0.28	0.91	0.76
	1957MAKK	0.742X+0.61	0.19	0.95	0.93		IRMAK3	0.789X+0.83	0.25	0.93	0.85
	FAO24BC	0.758X+0.84	0.38	0.93	0.79		1957MAKK	0.608X+0.95	0.15	0.90	0.91
GHY	IRMAK3	0.72X+0.82	0.18	0.95	0.90	TOC	IRMAK3	0.712X+0.89	0.16	0.95	0.92
	FAO24BC	0.84X+0.23	0.28	0.93	0.84		FAO24BC	0.726X+0.76	0.21	0.95	0.88
	1957MAKK	0.64X+0.77	0.13	0.89	0.93		1957MAKK	0.667X+0.74	0.15	0.92	0.92
MAR	FAO24BC	0.789X+0.5	0.22	0.95	0.87						
	IRMAK3	0.861X+0.60	0.23	0.94	0.88						
	IRMAK2	0.651X+1.15	0.29	0.89	0.73						

Note: St.=stations,  $ET_0$  (mm d<sup>-1</sup>), X=regressed  $ET_0$  Eq. (calibrated method).

IRMAK3 model had the lowest error measures at 11 sites out of 15 selected sites. The lowest values of different statistical measures were observed at NAK ( $WRMSD=0.17$  mm d<sup>-1</sup>,  $MAE=0.14$  mm d<sup>-1</sup>,  $SEE=0.07$  mm d<sup>-1</sup>,  $d=0.98$ , and  $r^2=0.98$ ), while highest at GG ( $WRMSD=0.43$  mm d<sup>-1</sup>,  $MAE=0.35$  mm d<sup>-1</sup>,  $SEE=0.22$  mm d<sup>-1</sup>,  $d=0.93$ , and  $r^2=0.88$ ).

The FAO24BC model followed as it is ranked first in MAR ( $WRMSD=0.30$  mm d<sup>-1</sup>,  $MAE=0.24$  mm d<sup>-1</sup>,  $SEE=0.22$  mm d<sup>-1</sup>,  $d=0.95$ , and  $r^2=0.87$ ) and TKB ( $WRMSD=0.38$  mm d<sup>-1</sup>,  $MAE=0.34$  mm d<sup>-1</sup>,  $SEE=0.28$  mm d<sup>-1</sup>,  $d=0.91$ , and  $r^2=0.76$ ). It was ranked second at TOC (Table 2).

The MODTURC ranked second at four sites. The different assessment measures are ( $WRMSD=0.34$  mm d<sup>-1</sup>,  $MAE=0.24$  mm d<sup>-1</sup>,  $SEE=0.17$  mm d<sup>-1</sup>,  $d=0.94$ , and  $r^2=0.91$  for CHU), ( $WRMSD=0.30$  mm d<sup>-1</sup>,  $MAE=0.24$  mm d<sup>-1</sup>,  $SEE=0.25$  mm d<sup>-1</sup>,  $d=0.91$ , and  $r^2=0.85$  for NLMP), and ( $WRMSD=0.38$  mm d<sup>-1</sup>,  $MAE=0.30$  mm d<sup>-1</sup>,  $SEE=0.27$  mm d<sup>-1</sup>,  $d=0.91$ , and  $r^2=0.75$  for SLC).

Another promising equation in the region is 1957MAKK it secured the third rank at 6 sites (Table 2). The lowest values of different goodness of fit measures ( $WRMSD=0.24$  mm d<sup>-1</sup>,  $MAE=0.24$  mm d<sup>-1</sup>,  $SEE=0.24$  mm d<sup>-1</sup>,  $d=0.93$ , and  $r^2=0.91$  for GI), and highest at SLC ( $WRMSD=0.57$  mm d<sup>-1</sup>,  $MAE=$

**Table 6**  
Station wise performance measures of developed models for first three ranked equations against FAO56PM (reference equation) in the NEH region.

St.	Equation calibrated (X)	Developed regression equation $ET_0=aX+b$	Performance measures			St.	Equation Calibrated (X)	Developed regression equation $ET_0=aX+b$	Performance measures		
			SEE (mm d <sup>-1</sup> )	d	r <sup>2</sup>				SEE (mm d <sup>-1</sup> )	d	r <sup>2</sup>
AGTL	FAO24RD	1.001X+0.16	0.22	0.93	0.81	JOW	TURC	0.847X+0.61	0.17	0.94	0.95
	TURC	0.737X+0.84	0.29	0.90	0.74		RT	1.066X-0.021	0.19	0.98	0.98
	FAO24BC	0.99X+0.31	0.33	0.93	0.90		FAO24BC	1.036X-0.027	0.19	0.97	0.94
AZ	TURC	0.835X+0.50	0.18	0.97	0.91	KIP	IRMAK1	0.849X+0.56	0.11	0.99	0.98
	IRMAK2	0.729X+0.54	0.11	0.95	0.96		FAO24BC	1.06X+0.001	0.18	0.99	0.95
	RT	1.018X+0.09	0.16	0.97	0.95		TURC	0.913X+0.23	0.19	0.98	0.94
BRD	FAO24BC	1.02X-0.064	0.24	0.98	0.93	MEL	FAO24BC	1.014X+0.01	0.19	0.98	0.95
	MODTURC	0.778X+0.56	0.15	0.97	0.95		IRMAK1	0.829X+0.65	0.14	0.98	0.96
	TURC	0.835X+0.65	0.20	0.96	0.93		TURC	0.916X+0.25	0.21	0.98	0.93
CHP	IRMAK3	0.994X-0.070	0.20	0.93	0.81	PK	FAO24BC	1.051X-0.12	0.13	0.99	0.97
	TURC	1.038X+0.018	0.19	0.93	0.83		IRMAK1	0.853X+0.53	0.16	0.98	0.93
	IRMAK2	0.887X+0.130	0.16	0.92	0.82		TURC	0.911X+0.23	0.22	0.97	0.90
IJHP	FAO24BC	1.086X-0.17	0.22	0.98	0.95	SEC	FAO24BC	0.977X+0.02	0.19	0.98	0.94
	TURC	0.816X+0.651	0.22	0.97	0.92		IRMAK1	0.821X+0.66	0.20	0.97	0.91
	FAO24RD	1.61X-0.321	0.28	0.97	0.93		TURC	0.865X+0.38	0.24	0.96	0.89
IMP	IRMAK3	0.780X+0.64	0.21	0.96	0.88	SHL	TURC	0.933X+0.20	0.08	0.95	0.92
	TURC	0.771X+0.953	0.17	0.93	0.91		1957MAKK	0.713X+0.62	0.17	0.93	0.87
	MODTURC	0.794X+0.903	0.22	0.92	0.87		IRMAK3	0.852X+0.23	0.25	0.93	0.82
JK	FAO24BC	1.034X-0.024	0.19	0.98	0.95						
	TURC	0.819X+0.64	0.25	0.96	0.87						
	RT	0.995X+0.27	0.20	0.96	0.94						

Note: St.=stations,  $ET_0$  (mm d<sup>-1</sup>), X=regressed  $ET_0$  Eq. (calibrated methods).

**Table 7**  
Station wise performance measures of developed models for first three ranked equations against FAO56PM (reference equation) in the EH region.

St.	Equation calibrated (X)	Developed regression equation $ET_0=aX+b$	Performance measures		
			SEE (mm d <sup>-1</sup> )	d	r <sup>2</sup>
GTK	TURC	1.04X - 0.34	0.14	0.96	0.95
	FAO24RD	1.23X - 0.55	0.24	0.95	0.91
	IRMAK3	1.05X - 0.31	0.27	0.94	0.85
PGH	TURC	0.962X + 0.24	0.16	0.97	0.94
	IRMAK3	0.939X + 0.02	0.13	0.97	0.96
	FAO24RD	1.065X - 0.061	0.18	0.96	0.93

Note: St.=stations,  $ET_0$  in (mm d<sup>-1</sup>), X=regressed  $ET_0$  Eq. (calibrated methods).

0.39 mm d<sup>-1</sup>,  $SEE=0.19$  mm d<sup>-1</sup>,  $d=0.85$ , and  $r^2=0.84$ ).

All in all, the IRMAK3 equation was closest to FAO56PM with mean deviation ranged from 0.3% to 0.6% of FAO56PM, which is well within the suggested limit of 15% by Hargreaves and Allen (2003) and Allen (1996). The IRMAK3 is the multilinear regression model, which assumes that each input variable has an independent impact on output irrespective the other inputs. The superior performance of IRMAK3 model confirms that radiation and temperature extreme is the dominant factors to drive the  $ET_0$  process while wind speed has a very less impact. Findings of the present investigation are similar to Allen et al. (1998) suggestions that under humid environment wind speed, only reduce the saturation level of the air slightly consequently, wind speed has very less impact on  $ET_0$ . Another interesting model for the region is

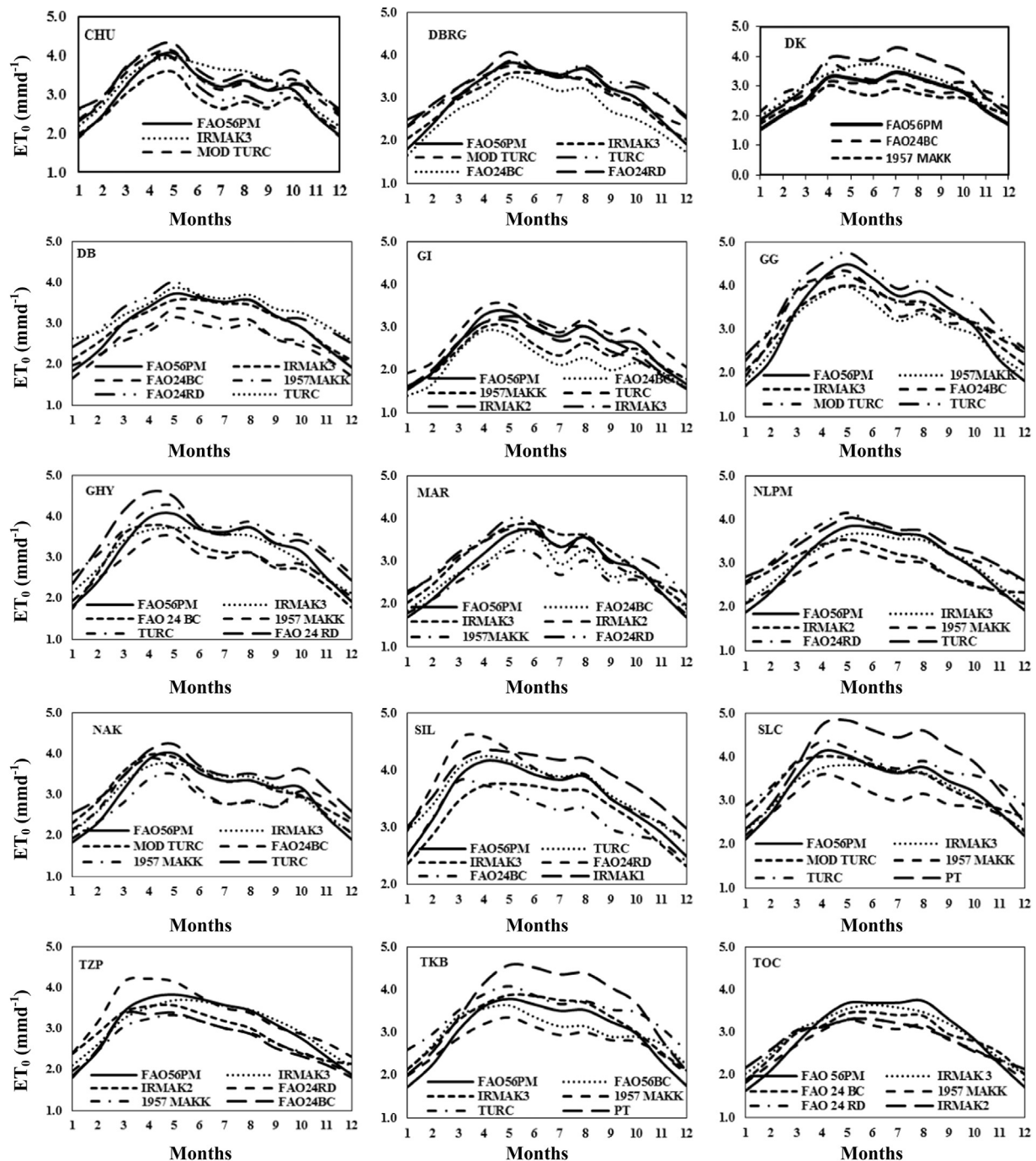


Fig. 2. Station wise intercomparisons of top five ranked methods with FAO56PM for ABP region.



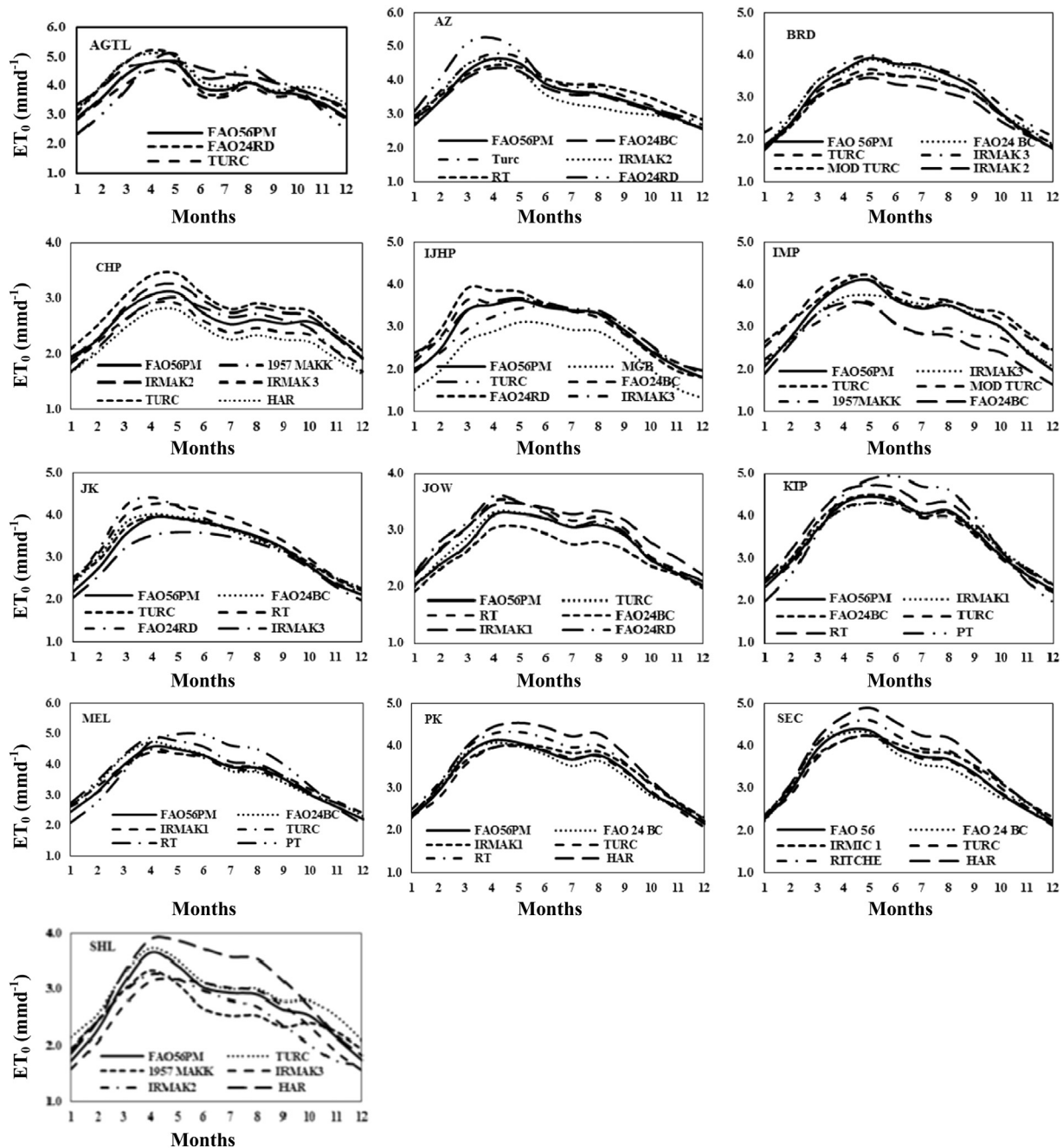


Fig. 3. Station wise intercomparisons of top five ranked methods with FAO56PM for NEH region.

MODTURC showed the potential to quantify  $ET_0$  accurately. In contrast, to IRMAK3, it requires an addition parameter of long-term, average annual wind speed data. It may be due to terrain influence on the wind speed of those particular stations.

The highest underestimation was observed in the case of 1957MAKK model, is another closely following equation to IRMAK3 for the study region. It tended to underestimate consistently reference  $ET_0$ , although the largest underestimation (10.12%) is well within the recommended limit of 15%.

#### 4.1.2. NEH region

The  $ET_0$  assessed in the present study through radiation-based methods are closely associated with FAO56PM (Table 6, and Fig. 3). The different statistical indices of radiation-based methods were superior to of temperature-based methods. Among the radiation-based methods the TURC model was observed to be the best suitable

option at different stations such as AZ ( $WRMSD=0.24 \text{ mm d}^{-1}$ ,  $MAE=0.15 \text{ mm d}^{-1}$ ,  $SEE=0.18 \text{ mm d}^{-1}$ ,  $d=0.97$ ,  $r^2=0.91$ ), JOW ( $WRMSD=0.32 \text{ mm d}^{-1}$ ,  $MAE=0.07 \text{ mm d}^{-1}$ ,  $SEE=0.08 \text{ mm d}^{-1}$ ,  $d=0.99$ , and  $r^2=0.95$ ), SHL ( $WRMSD=0.10 \text{ mm d}^{-1}$ ,  $MAE=0.07 \text{ mm d}^{-1}$ ,  $SEE=0.08 \text{ mm d}^{-1}$ ,  $d=0.99$ , and  $r^2=0.92$ ).

The station wise analysis (Table 3), suggesting that the TURC model ranked second best at (AGTL, CHP, IJHP, IMP, JK). The lowest values of different statistical measures was observed at JK ( $WRMSD=0.30 \text{ mm d}^{-1}$ ,  $MAE=0.25 \text{ mm d}^{-1}$ ,  $SEE=0.22 \text{ mm d}^{-1}$ ,  $d=0.96$ , and  $r^2=0.87$ ), while highest at AGTL ( $WRMSD=0.42 \text{ mm d}^{-1}$ ,  $MAE=0.27 \text{ mm d}^{-1}$ ,  $SEE=0.29 \text{ mm d}^{-1}$ ,  $d=0.90$ , and  $r^2=0.84$ ).

The TURC method ranked third at BRD, KIP, MEL, PK, and SEC (Table 3). The values of different error measures ( $WRMSD=0.32 \text{ mm d}^{-1}$ ,  $MAE=0.21 \text{ mm d}^{-1}$ ,  $d=0.96$ ,  $SEE=0.20 \text{ mm d}^{-1}$ , and  $r^2=0.93$  for BRD), and for KIP ( $WRMSD=0.23 \text{ mm d}^{-1}$ ,  $MAE=0.12 \text{ mm d}^{-1}$ ,

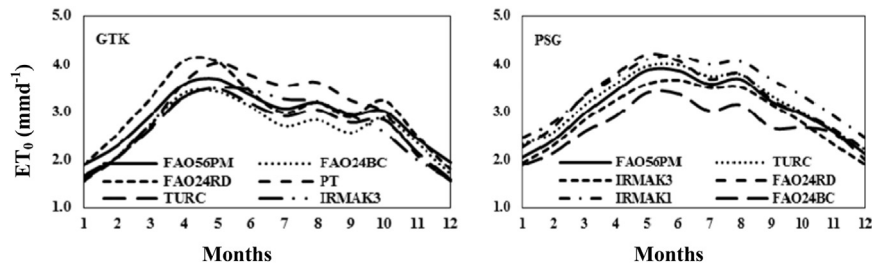


Fig. 4. Station wise intercomparisons of top five ranked methods with FAO56PM for EH region.

$d=0.98$ ,  $SEE=0.19 \text{ mm d}^{-1}$ , and  $r^2=0.95$ ). At MEL, PK error statistics ( $WRMSD=0.23 \text{ mm d}^{-1}$ , and  $0.24$ ,  $MAE=0.11 \text{ mm d}^{-1}$ ,  $0.16 \text{ mm d}^{-1}$ ,  $d=0.98$ , and  $0.97$ ,  $SEE=0.21 \text{ mm d}^{-1}$ , and  $0.22 \text{ mm d}^{-1}$ ,  $r^2=0.95$ , and  $0.97$ , respectively). For SEC site error indices ( $WRMSD=0.28 \text{ mm d}^{-1}$ ,  $MAE=0.18 \text{ mm d}^{-1}$ ,  $d=0.96$ ,  $SEE=0.24 \text{ mm d}^{-1}$ , and  $r^2=0.94$ ).

Another promising equation for the region is FAO24BC, which ranked, first at the stations (BRD, IJHP, JK, MEL, PK, and SEC). Station wise analysis (Tables 3, 6, and Fig. 3), suggesting that the FAO24BC model had the lowest error measures at 6 sites out of 13 selected sites. The lowest values of different statistical measures was observed at PK ( $WRMSD=0.15 \text{ mm d}^{-1}$ ,  $MAE=0.11 \text{ mm d}^{-1}$ ,  $SEE=0.07 \text{ mm d}^{-1}$ ,  $d=0.99$ , and  $r^2=0.97$ ), while highest at BRD ( $WRMSD=0.24 \text{ mm d}^{-1}$ ,  $MAE=0.20 \text{ mm d}^{-1}$ ,  $SEE=0.24 \text{ mm d}^{-1}$ ,  $d=0.98$ , and  $r^2=0.93$ ). It ranked second at KIP ( $WRMSD=0.20 \text{ mm d}^{-1}$ ,  $MAE=0.15 \text{ mm d}^{-1}$ ,  $SEE=0.18 \text{ mm d}^{-1}$ ,  $d=0.99$ , and  $r^2=0.95$ ) and third at AGTL, and JOW (Table 3).

The mean monthly  $ET_0$  values estimated by first five ranked methods stated in Fig. 3. The study showed that the monthly pattern of different methods is not similar. However, TURC method and FAO24BC method showed a similar trend to that of the FAO56PM method. The TURC method slightly underestimates  $ET_0$ , while FAO24BC slightly overestimate the  $ET_0$  values at most of the stations.

Hence, in the NEH region, TURC performed very well, being in the first three ranks at around 90% stations of the region, followed by FAO24BC.

Taking into account our findings, it might construe that the performance of the particular model is by all accounts more subject to the individual model structure instead of model sort (i.e., radiation- or temperature-based). In particular, FAO24BC (a temperature model) and TURC (a radiation model) both performed well and 1957MAKK (radiation based) indicated less encouraging fits. One reason of this may be in a humid climate, radiation and temperature are the primary controlling component of evapotranspiration process.

#### 4.1.3. EH region

Two Stations fall under EH, region i.e. GTK and PSG. TURC was ranked first at both the stations ( $WRMSD=0.32 \text{ mm d}^{-1}$  and  $0.23 \text{ mm d}^{-1}$ ,  $MAE=0.23 \text{ mm d}^{-1}$  and  $0.15 \text{ mm d}^{-1}$ ,  $d=0.96$ , and  $0.97$ , and  $SEE=0.14 \text{ mm d}^{-1}$ , and  $0.16 \text{ mm d}^{-1}$ , respectively). Analysis of results revealed that the other suitable choice for the region is FAO24RD and IRMAK3 in order of ranking (Table 4). Different error statistics for both equations at GTK ( $WRMSD=0.34 \text{ mm d}^{-1}$  and  $0.35 \text{ mm d}^{-1}$ ;  $MAE=0.24 \text{ mm d}^{-1}$ , and  $0.28 \text{ mm d}^{-1}$ ;  $d=0.95$  and  $0.94$ ,  $SEE=0.24 \text{ mm d}^{-1}$ , and  $0.27 \text{ mm d}^{-1}$ , respectively). At PSG site, IRMAK3, was ranked second, and FAO24 RD as third with values of error statistics ( $WRMSD=0.26 \text{ mm d}^{-1}$  and  $0.32 \text{ mm d}^{-1}$ ,  $MAE=0.18 \text{ mm d}^{-1}$ , and  $0.21 \text{ mm d}^{-1}$ ,  $d=0.97$  and  $0.96$ ,  $SEE=0.13 \text{ mm d}^{-1}$ , and  $0.18 \text{ mm d}^{-1}$ ,  $r^2=0.96$  and  $0.93$ , respectively) (Table 4). Hence in EH region, TURC is the best choice followed by FAO24RD and IRMAK3.

Overall, based on present investigation the TURC models is the suitable choice in NEH, and EH regions, and well correlated with

the findings of (Yoder et al., 2005; Irmak et al., 2008; Martinez & Thepadia, 2010), they advocated TURC under limiting data condition when wind speed data is missing.

#### 4.2. Regression equations

Simple regression models developed for top three ranked equations based on  $WRMSD$  and  $MAE$  for all the sites. The execution of the created regression models assessed in regards to the standard error of estimate ( $SEE$ ) and  $r^2$  values obtained in the validation phase through the comparison with FAO56PM. The established regression equations and their associated validation performance statistics are depicted in Table 5 (for ABP region), in Table 6 (for NEH region), and Table 7 (for EH region). As can be seen from Tables 5–7 that the developed regression model performed better than the original form in yielding  $ET_0$  values similar to the FAO56PM. As can be seen from Fig. 2 (for ABP region), Fig. 3 (for NEH region), and Fig. 4 (for EH region), that the month to month intercomparison of region specific stations insightful main five ranked methods with FAO56PM. Findings additionally support that the identified equations can be utilized to foresee the  $ET_0$  values with reasonable precision.

## 5. Discussion

Evapotranspiration is an imperative controlling component in hydrological processes. As of late, McVicar et al. (2012) uncovered that diminishing evaporative demand was globally widespread, and climate change will disturb the hydrological cycle mainly through evapotranspiration. Accurate accounting of  $ET_0$ , particularly in the context of climate change, is, crucial. The execution of 18 different  $ET_0$  methods was tried to recognize a suitable method for assessing and anticipating  $ET_0$  over the considered area.

Among the selected methods, radiation-based methods performed superior regarding producing a similar pattern as generated by the FAO56PM. The IRMAK3, TURC, FAO24BC, and 1957MCK, methods showed higher accuracy. Moreover, FAO24BC (temperature-based) demonstrated the capability to estimate  $ET_0$  with reasonable accuracy. The performance of IRMAK3 found best, in the ABP region at 11 stations out of fifteen stations, followed by FAO24BC and 1957MAKK. The TURC ranked among first three methods for NEH Region, trailed by FAO24BC and IRMAK3. In EH region, TURC ranked first, followed by FAO24RD. The IRMAK3 and TURC methods yielded the highest association based on  $WRMSD$ ,  $MAE$ ,  $SEE$ ,  $d$ , and  $r^2$  among the radiation-based Equations. However, the predictive ability of these two methods is almost similar, as both also secured top ranks at limiting data sites. Among the temperature-based methods, FAO24BC performed the best. However, the HAR equations performed poorly (secured fifth rank only at two locations in the NEH region). All the selected methods showed variability in performance in the selected study region. Findings of results, support that the selected method is more relevant to  $ET_0$  estimation compared to available data, because

simpler methods over performed with sophisticated methods.

The superior execution of the radiation based methods acquired in this study is in good concurrence with the findings in another humid environment, for example, George and Raghuvanshi (2012), Jensen et al. (1990), Tabari et al. (2011) and Yoder et al. (2005). Findings recommend presuming that the radiation-based models are a reasonable decision for ascertaining  $ET_0$  in the study range. The unsuitable execution of the other chose methods, for example, JH found in the present examination corresponding great with the outcomes found in other humid atmospheres as reported (Irmak et al., 2003; Irmak, Irmak, Allen, & Jones, 2003; Trajkovic & Kolakovic 2009a).

The developed regression equations for top three ranked methods can be used for estimates  $ET_0$  with higher accuracy compare to the original equation. Therefore, these equations can aid as a beneficial tool for a reliable estimate.

## 6. Conclusions

This study evaluated the performance of 18  $ET_0$  equations against the FAO56PM equation under the climatic conditions in the NE, India.

Radiation-based equations of IRMAK3, TURC, 1957MAKK, and MODTURC had superior and consistent performance in all the three regions, hence recommended under limiting data conditions in the North East India.

Among the temperature-based equations, the FAO24BC performed satisfactorily, and secured third rank across the category. However, all other selected methods in this category performed poorly.

All in all, the best five equations (i.e. four radiations-one temperature-based) that could be utilized as a suitable option for FAO56PM are ranked as follows: IRMAK3, TURC, FAO24BC, 1957MAKK, and MODTRUC. However, these equations may need calibrations in the comparative new region to signify changes in climatic variables.

In general, the superior performance of radiation based models confirms that the temperature extreme and radiation are the dominant factors to drive  $ET_0$  process in the region while wind speed has a very less impact.

The result in of this study gives helpful data and documentation to choose more exact  $ET_0$  estimations in the region under limiting data conditions. The developed regression models are useful to the precise agricultural water management, regional water resources planning, and other hydrological modeling related studies that can aid in more proficient and viable water resources management.

## References

Alexandris, S., Kerkides, P., & Liakatas, A. (2006). Daily reference evapotranspiration estimates by the "Copais" approach. *Agricultural Water Management*, 82, 371–386.

Allen, R. G., Pereira, L. S., Raes, D., & Smith, M. (1998). *Crop evapotranspiration: Guidelines for computing crop water requirements*. N.Y.: United Nations FAO.

Allen, R. G., & Pruitt, W. O. (1986). Rational use of the FAO Blaney–Criddle formula. *Journal of Irrigation and Drainage Engineering*, 112(2), 139–155.

Allen, R. G. (1996). Assessing integrity of weather data for use in reference evapotranspiration estimation. *Journal of Irrigation and Drainage Engineering*, 122(2), 97–106.

Allen, R. G. (2000). *REF-ET for Windows: Reference evapotranspiration calculator version 3.1.16*. Kimberly: University of Idaho Research and Extension Center ID. Retrieved from (<http://www.kimberly.uidaho.edu/refet/>).

Allen, R. G., Walter, I. A., Elliot, R., Howell, T., Itenfisu, D., & Jensen, M. (2005). *The ASCE standardized reference evapotranspiration equation. Final report*. Phoenix: National Irrigation Symp., ASCE-EWRI. Task Committee Retrieved from (<http://www.kimberly.uidaho.edu/water/asceewri/>).

ASCE-EWRI (2005). The ASCE standardized reference evapotranspiration equation

In: R. G. Allen, I. A. Walter, & R. L. Elliot (Eds.), *Environmental and Water Resources Institute (EWRI) of the American Society of Civil Engineers, ASCE, Standardization of Reference Evapotranspiration Task Committee Final Report* (p. 213). Reston, VA: American Society of Civil Engineers (ASCE).

Baier, W., & Robertson, G. W. (1965). Estimation of latent evaporation from simple weather observations. *Canadian Journal of Plant Science*, 45, 276–284.

Berti, A., Tardivo, G., Chiaudani, A., Rech, F., & Borin, M. (2014). Assessing reference evapotranspiration by the Hargreaves method in north-eastern Italy. *Agricultural Water Management*, 140, 20–25.

Bogawski, P., & Bednorz, E. (2014). Comparison and validation of selected evapotranspiration models for conditions in Poland (Central Europe). *Water Resources Management*, 28(14), 5021–5038.

Caprio, J. M. (1974). The solar thermal unit concept in problems related to plant development and potential evapotranspiration In: H. Lieth (Ed.), *Phenology and seasonality modeling. Ecological Studies* (pp. 353–364). New York: Springer Verlag.

Chai, T., & Draxler, R. R. (2014). Root Mean Square Error (RMSE) or Mean Absolute Error (MAE)?—Arguments against avoiding RMSE in the literature. *Geoscientific Model Development*, 7, 1247–1250.

Chen, D., Gao, G., Xu, C. Y., Guo, J., & Ren, G. (2005). Comparison of the Thornthwaite method and pan data with the standard Penman–Monteith estimates of reference evapotranspiration in China. *Climate Research*, 28, 123–132.

DehghaniSanji, H., Yamamoto, T., & Rasiah, V. (2004). Assessment of evapotranspiration estimation models for use in semi-arid environments. *Agricultural Water Management*, 64, 91–106.

Djaman, K., Balde, A. B., Sow, A., Muller, B., Irmak, S., N'Diaye, M. K., Manneh, B., & Saito, K. (2015). Evaluation of sixteen reference evapotranspiration methods under Sahelian conditions in the Senegal River valley. *Journal of Hydrology: Regional Studies*, 3, 139–159.

Doorenbos, J., & Pruitt, W. O. (1977). *Guidelines for predicting crop water requirements*. Rome: FAO.

Droogers, P., & Allen, R. G. (2002). Estimating reference evapotranspiration under inaccurate data conditions. *Irrigation Drainage Systems*, 16, 33–45.

Fooladmand, H. R., Zandilak, H., & Ravanan, M. H. (2008). Comparison of different types of Hargreaves equation for estimating monthly evapotranspiration in the south of Iran. *Archives of Agronomy and Soil Science*, 54(3), 321–330.

George, B. A., & Raghuvanshi, N. S. (2012). Inter-comparison of reference evapotranspiration estimated using six methods with data from four climatological stations in India. *Journal of Indian Water Resources Society*, 32(3–4), 15–22.

Ghamarnia, H., Mousabeyg, F., Amiri, S., & Amirkhani, D. (2015). Evaluation of a few evapotranspiration models using lysimetric measurements in a semi-arid climate region. *International Journal of Plant and Soil Science*, 5(2), 100–109.

Hargreaves, G. H., & Samani, Z. A. (1985). Reference crop evapotranspiration from temperature. *Applied Engineering in Agriculture*, 1(2), 96–99.

Hargreaves, G. H., & Allen, R. G. (2003). History and evaluation of Hargreaves evapotranspiration equation. *Journal of Irrigation and Drainage Engineering*, 129(1), 53–63.

Irmak, S., Allen, R. G., & Whitty, E. (2003a). Daily grass and alfalfa reference evapotranspiration estimates and alfalfa-to-grass evapotranspiration ratios in Florida. *Journal of Irrigation and Drainage Engineering*, 129(5), 360–370.

Irmak, S., Irmak, A., Jones, J. W., Howell, T. A., Jacobs, J. M., Allen, R. G., & Hoogenboom, G. (2003b). Predicting daily net radiation using minimum climatological data. *Journal of Irrigation and Drainage Engineering*, 129(4), 256–269.

Irmak, S., Irmak, A., Allen, R. G., & Jones, J. W. (2003c). Solar and net radiation-based equations to estimate reference evapotranspiration in humid climates. *Journal of Irrigation and Drainage Engineering*, 129(5), 336–347.

Irmak, S., Irmak, A., Howell, T. A., Martin, D. L., Payero, J. O., & Copeland, K. S. (2008). Variability analyzes of alfalfa-reference to grass reference evapotranspiration ratios in growing and dormant seasons. *Journal of Irrigation and Drainage Engineering*, 134(2), 147–159.

Itenfisu, D., Elliott, R. L., Allen, R. G., & Walter, I. A. (2003). Comparison of reference evapotranspiration calculations as part of the ASCE standardization effort. *Journal of Irrigation and Drainage Engineering*, 129(6), 440–448.

Jain, S. K., Nayak, P. C., & Sudheer, K. P. (2008). Models for estimating evapotranspiration using artificial neural networks, and their physical interpretation. *Hydrological Processes*, 22, 2225–2234.

Evapotranspiration and irrigation water requirements In: M. E. Jensen, R. D. Burman, & R. G. Allen (Eds.), Reston, VA: ASCE.

Jhajharia, D., DebBarma, S., & Agrawal, G. (2004a). Comparison of simpler radiation-based methods with Penman–Monteith under humid climatic conditions of Assam. *Journal of Agricultural Engineering*, 41(4), 32–36.

Jhajharia, D., DebBarma, S., & Agrawal, G. (2004b). Comparison of pan evaporation-based reference evapotranspiration model with Penman–Monteith FAO–56 model. *Journal of Agricultural Engineering*, 41(3), 46–52.

Jones, J. W., & Ritchie, J. T. (1990). Crop growth models. Management of farm irrigation systems In: G. J. Hoffman, T. A. Howel, & K. H. Solomon (Eds.), *ASAE Monograph No. 9* (pp. 63–69). ASAE, St. Joseph, Mich.

Lima, J., Antonino, A., Souza, E., Hammecker, C., Montenegro, S., & Lira, C. (2013). Calibration of Hargreaves–Samani equation for estimating reference evapotranspiration in the sub-humid region of Brazil. *Journal of Water Resource and Protection*, 5 12A1–A5.

Makkink, G. F. (1957). Testing the Penman formula by means of lysimeters. *Journal of Institution of Water Engineers*, 11(3), 277–288.

Martinez, C. J., & Thepadia, M. (2010). Estimating reference evapotranspiration with minimum data in Florida. *Journal of Irrigation and Drainage Engineering*, 136(7), 494–501.



- McVicar, T. R., Roderick, M. L., Donohue, R. J., Li, L. T., Van Niel, T. G., Thomas, ... Dinpashoh, Y. (2012). Global review and synthesis of trends in observed terrestrial near-surface wind speeds: Implications for evaporation. *Journal of Hydrology*, 416–417, 182–205.
- McGuinness, J. L., & Bordne, E. F. (1972). *A comparison of lysimeter derived potential evapotranspiration with computed values*. Washington, DC: Agricultural Research Service, US Department of Agriculture.
- Mohan, S., & Arumugam, N. (1996). Discussion of 'Comparison of methods for estimating REF-ET-Discussion'. *Journal of Irrigation and Drainage Engineering*, 122(6), 361–362.
- Nandagiri, L., & Kovoov, G. (2006). Performance evaluation of reference evapotranspiration equations across a range of Indian climates. *Journal of Irrigation and Drainage Engineering*, 132(3), 238–249.
- Pandey, P. K., Radheshyam, K., & Hibu, C. (2009). Assessing the performance of temperature based evapotranspiration models under the climatic conditions of Umam (Meghalaya) India. *Zeitschrift für Bewässerungswirtschaft*, 44(1), 57–69.
- Pandey, V., Pandey, P. K., & Mahanta, A. P. (2014). Calibration and performance verification of Hargreaves-Samani equation in a humid region. *Irrigation and Drainage*, 63, 659–667.
- Penman, H. L. (1963). *Vegetation and hydrology* (p. 125) Harpenden, England: Commonwealth Bureau of Soils.
- Pereira, L. S., Allen, R. G., Smith, M., & Raes, D. (2015). Crop evapotranspiration estimation with FAO56: Past and future. *Agricultural Water Management*, 147, 4–20.
- Priestley, C. H. B., & Taylor, R. J. (1972). On the assessment of surface heat flux and evaporation using large-scale parameters. *Monthly Weather Review*, 100, 81–92.
- Sehgal, J. L., Mondal, D. K., Mondal, C., & Vadivelu, S. (1990). *Agro-ecological regions of India*. Tech. Bull., NBSS Pub. 24, National Bureau of Soil Survey and Land Use Planning (NBSS&LUP). Nagpur, India: Indian Council of Agricultural Research (ICAR).
- Sentelhas, P. C., Gillespie, T. J., & Santos, E. A. (2010). Evaluation of FAO Penman–Monteith and alternative methods for estimating reference evapotranspiration with missing data in Southern Ontario, Canada. *Agricultural Water Management*, 97, 635–644.
- Smith, M., Allen, R. G., Monteith, J. L., Perrier, A., Pereira, L., & Segeren, A. (1991). *Report of the expert consultation on procedures for revision of FAO guidelines for prediction of crop water requirements*. Rome: Food and Agriculture Organization of the United Nations.
- Steiner, J. L., Howell, T. A., & Schneider, A. D. (1991). Lysimetric evaluation of potential evapotranspiration models for grain sorghum. *Agronomy Journal*, 83, 240–247.
- Suleiman, A. A., & Hoogenboom, G. (2007). Comparison of Priestley–Taylor and FAO56 Penman–Monteith for Daily Reference Evapotranspiration Estimation in Georgia, USA. *Journal of Irrigation and Drainage Engineering*, 133(2), 175–182.
- Tabari, H., Grismer, M. E., & Trajkovic, S. (2013). Comparative analysis of 31 reference evapotranspiration methods under humid conditions. *Irrigation Science*, 31, 107–117.
- Thornthwaite, C. W. (1948). An approach toward a rational classification of climate. *Geographical Review*, 38(1), 55–94.
- Trajkovic, S. (2005). Temperature based approaches for estimation of reference evapotranspiration. *Journal of Irrigation and Drainage Engineering*, 131(4), 316–323.
- Trajkovic, S. (2007). Hargreaves versus Penman–Monteith under Humid conditions. *Journal of Irrigation and Drainage Engineering*, 133(1), 38–42.
- Trajkovic, S., & Kolakovic, S. (2009a). Evaluation of reference evapotranspiration equations under humid conditions. *Water Resources Management*, 23, 3057–3067.
- Trajkovic, S., & Kolakovic, S. (2009b). Wind-adjusted Turc equation for estimating reference evapotranspiration at humid European locations. *Hydrology Research*, 40(1), 45–52.
- Turc, L. (1961). Evaluation des besoins en eau d'irrigation, evapotranspiration potentielle, formule climatique simplifiée et mise a jour. *Annales Agronomique*, 12(1), 13–49 [in French].
- Valiantzas, D. J. (2013). Simplified forms for the standardized FAO–56 Penman–Monteith reference evapotranspiration using limited data. *Journal of Hydrology*, 505, 13–23.
- Valipour, M. (2015). Comparative evaluation of radiation based methods for estimation of potential evapotranspiration. *Journal of Hydrologic Engineering*, 20(5), 04014068.
- Widmoser, P. (2009). A discussion on an alternative to Penman–Monteith equation. *Agricultural Water Management*, 96, 711–721.
- Willmott, C. J., & Matsuura, K. (2005). Advantages of the mean absolute error (MAE) over the root mean square error (RMSE) in assessing average model performance. *Climate Research*, 30, 79–82.
- Wright, J. L. (1982). New evapotranspiration crop coefficients. *Journal of Irrigation and Drainage Engineering*, 108, 57–74.
- Xu, C. Y., & Singh, V. P. (2001). Evaluation and generalization of temperature-based methods for calculating evaporation. *Hydrological Processes*, 15(2), 305–319.
- Xu, C. Y., & Singh, V. P. (2002). Cross comparison of empirical equations for calculating potential evapotranspiration with data from Switzerland. *Water Resources Management*, 16, 197–219.
- Xu, C. Y., Singh, V. P., Chen, Y. D., & Chen, D. (2008). Evaporation and evapotranspiration. Hydrology and hydraulics In: V. P. Singh (Ed.), 1st ed.). Water Resources Publications, LLC.
- Xu, J., Peng, S., Ding, J., Wei, Q., & Yu, Y. (2013). Evaluation and calibration of simple methods for daily reference evapotranspiration estimation in humid East China. *Archives of Agronomy and Soil Science*, 59(6), 845–858.
- Yoder, R. E., Odhiambo, L. O., & Wright, W. C. (2005). Evaluation of methods for estimating daily reference crop evapotranspiration at a site in the humid southeast United States. *Applied Engineering in Agriculture*, 21(2), 197–202.
- Zhao, S., Yang, Y., Zhang, F., Sui, X., Yao, Y., Zhao, N., ... Li, C. (2014). Rapid evaluation of reference evapotranspiration in Northern China. *Arabian Journal of Geosciences*, 8, 647–657.
- Zotarelli, L., Dukes, M. D., Romero, C. C., Migliaccio, K. W., & Morgan, K. T. (2010). *Step by step calculation of the Penman–Monteith evapotranspiration (FAO–56 method)* (p. 12) AE459. Agricultural and Biological Engineering Department, Florida Cooperative Extension Service, IFAS Retrieved from (<http://edis.ifas.ufl.edu/ae459>).