ORIGINAL CONTRIBUTION



# Crop Coefficients of Some Selected Crops of Andhra Pradesh

K. Chandrasekhar  $Reddy^1 \cdot S$ . Arunajyothy<sup>2</sup> · P. Mallikarjuna<sup>2</sup>

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Abstract Precise information on crop coefficients for estimating crop evapotranspiration  $(ET_c)$  for regional scale irrigation planning is a major impediment in many regions. Crop coefficients suggested based on lysimeter data by earlier investigators have to be locally calibrated to account for the differences in the crop canopy under given climatic conditions. In the present study crop coefficients were derived based on reference crop evapotranspiration  $(ET<sub>0</sub>)$ estimated from Penman–Monteith equation and lysimeter measured  $ET_c$  for groundnut, paddy, tobacco, sugarcane and castor crops at Tirupati, Nellore, Rajahmundry, Anakapalli and Rajendranagar centers of Andhra Pradesh respectively. Crop coefficients derived were compared with those recommended by FAO-56. The mean crop coefficients at different stages of growth were significantly different from those of FAO-56 curve though a similar trend was observed. A third order polynomial crop coefficient model has therefore been developed as a function of time (days after sowing the crop) for deriving suitable crop coefficients. The crop coefficient models suggested may be adopted to estimate crop evapotranspiration in the study area with reasonable degree of accuracy.

Keywords Reference crop evapotranspiration · Crop coefficient  $\cdot$  Crop evapotranspiration  $\cdot$ Polynomial model

## Introduction

Accurate estimation of crop water requirement is an important aspect of agricultural planning. The water requirement varies widely from crop to crop and also during the period of growth of individual crops. Water use efficiency which is essentially governed by crop evapotranspiration  $(ET_c)$  can be improved by proper irrigation planning, scheduling and decision making on a regional scale based on estimated  $ET_c$ , which in turn depends on the crop coefficient  $(K_c)$ . ET<sub>c</sub> is calculated by multiplying reference evapotranspiration  $(ET_0)$  with  $K_c$  to account for the differences in the crop canopy under given climatic conditions. The FAO-56 [[1\]](#page-7-0) reported crop coefficients at different stages of growth for various agricultural crops and suggested the adjustment for different wetting frequencies, climatic, agronomic and water management conditions. However, it has been emphasized in the literature that there is a strong need for local calibration of crop coefficients under given climatic conditions.

The researchers have [\[2](#page-7-0)] developed crop coefficients for a number of crops grown under different climatic conditions and suggested the use of these values at locations where local data are not available. However, they emphasized the strong need for local calibration of crop coefficients since the climatic conditions encountered in the field differ from the standard conditions. Earlier, the researchers have worked out on crop coefficient values and crop coefficient curves for different crops [[3–5\]](#page-7-0). The investigators have derived crop coefficient curves as a function of day past planting for different crops using fifth order polynomial [[6\]](#page-7-0). Shah and Edling crop coefficients for rice crop for the vegetative, flowering, and yield formation stages using Penman–Monteith (daily)  $ET_0$  and recommended a second order polynomial to moderately fit to the interval-wise  $K_c$ 

 $\boxtimes$  S. Arunajyothy aruna\_jyothy@yahoo.co.in

<sup>1</sup> Department of Civil Engineering, Siddhartha Institute of Engineering and Technology, Andhra Pradesh, India

<sup>2</sup> Department of Civil Engineering, S V U College of Engineering, S V University, Tirupati 517502, Andhra Pradesh, India

<span id="page-1-0"></span>data [\[7](#page-7-0)]. The researchers have developed crop coefficients for wheat and sorghum crops from  $ET_c$  measurements and weather data at Karnal and, observed that  $K_c$  values for these crops at the four crop growth stages are significantly different from those suggested in UN FAO indicating the need for generating these values at the local/regional level [\[8](#page-7-0)]. The values of  $K_c$  have been estimated at different



Fig. 1 Location map of the meteorological centers in Andhra Pradesh

stages for potato crop using lysimeter measured  $ET_c$  at subhumid Kharagpur region and compared stage- wise  $K_c$ values estimated by various methods  $[9]$  $[9]$ . The K<sub>c</sub> value at the maturity stage was found to be considerably higher than the corresponding FAO recommended  $K_c$  value. It was also observed that the Penman–Monteith method is the best method to estimate daily and stag-wise  $K_c$  using the lysimeter measured  $ET_c$ . The investigators have [\[10](#page-7-0)] estimated  $K_c$  in AL- Hassa for the fourth growth stages of wheat crop. Jeetendra Kumar and Singh developed crop. It has been developed by earlier investigators the crop coefficient models for wheat and maize in the Gandak command area in Bihar and a polynomial model was fitted to the  $K_c$  values [[11\]](#page-7-0). Alkaeed et al. emphasized the need for local calibration of  $K_c$  by indicating the necessary adjustment of  $K_c$  to the field conditions under the environmental effects [\[12](#page-7-0)]. The researchers have developed crop coefficients and relationships for cotton, sorghum and millet crops  $[13]$  $[13]$ . It was also reported that  $K_c$  values for cotton crop in the late stage, for sorghum crop in the mid and late stages and for millet crop in all stages were significantly different from FAO suggested  $K_c$  values.

The present study compares the crop coefficients computed using  $ET_0$ , estimated from Penman–Monteith equation and, lysimeter measured  $ET_c$  with those recommended

Meteorological center	Longitude $(^0E)$	Latitude $\rm ^{(0}N)$	Altitude. m	Mean daily relative humidity, %	Mean daily temperature, $\rm ^{\circ}C$	Mean daily wind velocity. kmph	Mean daily sunshine hours, h	Mean daily vapour pressure, mm of Hg	Mean annual rainfall, mm
Tirupati	$79^{\circ}05'$	13°05′	161.0	59.5	28.2	7.9	6.8	17.6	1100
Nellore	79°59'	$14^{\circ}22'$	19.0	77.3	25.6	6.3	7.3	20.3	1170
Rajahmundry	$81^\circ 46'$	$17^{\circ}00'$	14.0	70.9	27.8	6.3	7.1	20.4	1160
Anakapalli	$83^{\circ}01'$	17°38'	25.0	71.9	27.9	4.6	7.1	20.6	1190
Rajendranagar	78°23'	$17^{\circ}19'$	536.0	61.8	26.2	7.3	8.0	14.9	920

Table 1 Brief description of the meteorological centers

Table 2 Crop details and period of data

Meteorological center	Crop	Crop varieties	Crop season	Crop period, days	Period of data	Training period	Testing period
Tirupati	Groundnut	KDR3, TMV2, JL24, K134, TPT <sub>1</sub>	July–Nov	130	1992-1998	1992-1996	1997-1998
Nellore	Paddy	<b>BULKH/9, NLR9672,</b> NLR9674, NLR27999, IR50, NLR33635. NLR9673	Sep-Jan	140	1983, 1987, 1988. 1994, 1996, 1997, 2002	1983, 1987, 1988. 1994, 1996	1997, 2002
Rajahmundry	Tobacco	JAYASHRE, NLS5, HEMA, MULTIPLE, 1158	Nov-Mar	110	1990-1998	1990-1995	1996-1998
Anakapalli	Sugarcane	CO419, CO7602	Mar–Feb	320	1981-1986	1981-1984	1985-1986
Rajendranagar	Castor	<b>ARUNA</b>	Jun–Nov	135	1978-1993	1978-1988	1989-1993

<span id="page-2-0"></span>

Fig. 2 Comparison of  $K_c$  curve derived from PMM ET<sub>0</sub> and lysimeter measured  $ET_c$  with that of FAO-56 curve

by FAO-56. It also attempts to develop crop coefficient models for different crops in the study area for estimating  $ET_c$  with reasonable degree of accuracy.

#### Materials and Methods

The lysimeter measured  $ET_c$  and the climatic data during the crop period at Tirupati (Rayalaseema region), Nellore, Rajahmundry and Anakapalli (Coastal region) and Rajendranagar (Telangana region) meteorological centers in Andhra Pradesh collected from the India Meteorological Department (IMD), Pune, India were used in the data analysis and model development. The data was divided into training and testing sets for the purpose of model development and its verification respectively. The closeness of the statistical structure in terms of mean, variance and skewness of the calibration and validation data sets was ensured while making the division. The location of the meteorological centers is shown in Fig. [1](#page-1-0) and a brief description of these centers is presented in Table [1.](#page-1-0) The crop details and the period of data collected are given in Table [2](#page-1-0).

The crop coefficients for various crops were calculated as the ratio of lysimeter measured  $ET_c$  to  $ET_0$  estimated from Penman–Monteith equation and compared with the adjusted  $K_c$  values. The adjusted FAO-56  $K_c$  curve was constructed with mean values at different crop growth stages after suitably modifying the table values of crop coefficients for average wetting events and climatic conditions using the following expressions.

$$
K_{c \text{ ini}} = K_{c \text{ ini (FAO)}} + [(I - 10)/(40 - 10)]
$$
  
\n
$$
\times [K_{c \text{ ini (heavy wetting)}} - K_{c \text{ ini (light wetting)}}]
$$
  
\n
$$
K_{c \text{ mid}} = K_{c \text{ mid (FAO)}}
$$
  
\n
$$
+ [0.04(u_2 - 2) - 0.004(RH_{min} - 45)](h/3)^{0.3}
$$
  
\n
$$
K_{c \text{ end}} = K_{c \text{ end (FAO)}}
$$
  
\n
$$
+ [0.04(u_2 - 2) - 0.004(RH_{min} - 45)](h/3)^{0.3}
$$

A polynomial  $K_c$  model as a function of x (number of days from sowing of the crop) is expressed as:

$$
K_c = C_1 x + C_2 x + C_3 x^2 + \dots
$$

where  $C_1$ ,  $C_2$ ,  $C_3$ ,... are empirical constants.

The  $K_c$  models were developed using calibration data set and verified using validation data set. The performance of  $K_c$  models is verified by comparing  $ET_c$  computed from  $ET_0$  estimated from Penman–Monteith equation and  $K_c$ , calculated using the models developed with that of lysimeter measured  $ET_c$  using the validation data set. The validity of the models is evaluated based on numerical and graphical performance indicators. The numerical performance indicators include correlation coefficient, RMSE [\[14](#page-7-0)], and efficiency coefficient [\[15](#page-7-0)]. The scatter and comparison plots are graphical indicators.

<span id="page-3-0"></span>

Fig. 3 Variation of daily  $K_c$  values

## Results and Discussion

The daily crop coefficients calculated at different stages of growth were compared with mean adjusted values as recommended in FAO-56 manual by fitting the mean curve with the trend similar to the one recommended in FAO-56 as shown in Fig. [2.](#page-2-0) It may be noted that the table values suggested in FAO-56 were adjusted to the climatic conditions and wetting frequencies of the study area for the construction of the FAO-56  $K_c$  curve. The variation of  $K_c$ at different stages of crop growth (Fig. [2](#page-2-0)) indicates that FAO-56 mostly overestimates daily  $K_c$  values at all stages of groundnut crop at Tirupati and of tobacco crop at Rajahmundry. It almost coincides with the proposed mean daily K<sub>c</sub> curve of castor crop at Rajendranagar at initial and development growth stages but overestimates at mid and late stages. It underestimates at initial, development and mid stages and overestimates at late stage of sugarcane crop at Anakapalli. It almost coincides with mean daily  $K_c$ at all stages of paddy crop at Nellore. A significant deviation of the curve (Fig. [2](#page-2-0)) at most of the stages of crop growth of crops selected for the present study from that suggested by FAO-56 may be due to different agronomic, soil, climate and water management conditions. This suggests the need for the development of  $K_c$  models at the centers in order to reasonably estimate  $ET_c$  in the study area.

The variation of  $K_c$  with time during crop period is shown in Fig. [3](#page-3-0). Differences in leaf anatomy, stomata characteristics, aerodynamic properties and albedo caused  $ET_c$  of different crops to differ under the same climatic conditions. It may be observed from these plots that  $K_c$ values showed an increasing trend with the advancement in the crop growth up to physiological development and after

**Table 3** Polynomial regression  $K_c$  models

that started declining. A dual third order polynomial model each for raising and falling trends of  $K<sub>c</sub>$  curve was therefore fitted to the data as presented in Table 3.

It may be noted that the variation of  $K_c$  with crop canopy and other crop parameters is not dealt with in the present study because of limited crop data available. However, the empirical coefficients in the model may, to a certain extent, implicitly take care of the effect of various crop parameters for the commonly grown crops and their varieties in the study area. The  $ET_c$  has been estimated using  $K_c$  values obtained from these models and compared with  $ET_c$  measured. Figures [4](#page-5-0) and [5](#page-6-0) respectively present the scatter diagrams and comparison plots between measured  $ET_c$  and estimated  $ET_c$ . The performance indicators in the  $ET_c$  estimates are given in Table [4](#page-7-0). The values of  $R^2$ and EC indicate that  $ET_c$  values estimated using the  $K_c$ models developed are fairly good. The RMSE found is also low. The slope (m) and intercept (c) respectively close to one and zero of scatter plots and, closeness of computed  $ET_c$  with  $ET_c$  measured in the comparison plots, indicate the satisfactory performance of the models. Therefore, the  $K_c$  models proposed may be adopted in the reasonable  $ET_c$ estimation for the crops commonly grown in the study area.

#### Conclusion

The crop coefficient values, computed for various crops using lysimeter measured  $ET_c$  and, Penman–Montieth  $ET_0$ were compared with adjusted  $K_c$  values suggested in FAO-56 manual. These values deviated significantly from the adjusted FAO-56 values. A third order polynomial model has been developed to determine  $K_c$  values at different stages of growth for the crops commonly grown in the



x number of days after sowing of the crop

<span id="page-5-0"></span>Fig. 4 Scatter plots of daily  $ET_c$  observed with  $ET_c$ estimated. A Training period, B testing period



<span id="page-6-0"></span>

Fig. 5 Comparison of daily  $ET_c$  observed with  $ET_c$  estimated during testing period

<span id="page-7-0"></span>



study area. The  $ET_c$  values computed using  $K_c$  estimated from the models proposed are comparable with those lysimeter measured  $ET_c$ . The  $K_c$  models proposed for different crops in the study area may therefore be adopted in the  $ET_c$  estimates with reasonable degree of accuracy.

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