# **Use of PNUTGRO model for optimization of sowing date and plant spacing to maximize yield of groundnut (***Arachis hypogaea* **L.)**

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*Lkkj & ihuVxzk s ¼ih- ,u- ;w- Vh- th- vkj- vk s-½ ekW Lkkj My dh izkekf.kdrk fl) djus ds fy, 1987* **-** *90 ds*  दौरान आनंद, गजरात में क्षेत्रीय प्रयोग किए गए हैं। इस मॉडल का उपयोग मँगफली की फीनोलॉजी, बढोतरी, विकास और पैदावार का पूर्वानुमान लगाने के लिए किया गया है। मूँगफली के प्रतिरूपित पुष्पन, पेगिंग, फली बनने और फली पकने की तिथियों, पर्णी क्षेत्रफल सुचकांक) (एल. ए. आई.) जैवभार, शैलिंग का प्रतिशत तथा पैदावार की तुलना तीन पद्धतियों नामतः जी. ए. यू. जी. 10, जी. ए. यू. जी. 2 और आर. आें. **-** 33 **-** 1 से प्राप्त *gq, iszf{kr ekuksa ds lkFk dh xbZ gSA izfr:fir ?kVukØe ls iq"iu ds fy, ,d fnu deh rFkk ik¡p fnu dh*  <sub>.</sub><br>बढ़त का, पेगिगं के लिए 2 से 6 दिनों की बढ़त, फली बनने के लिए 3 दिन की कमी तथा 6 दिनों की बढ़त *dk vkSj Qyh idus d s fy, 6 fnu dh deh rFkk 5 fnu rd dh c<+r dk varj ik;k x;k gSA okLrfod ekuksa dh rqyuk esa bl ekWMy ls i.kh Z {k s=Qy lwpdkad 91-8 ls 105-8 izfr'kr vkSj 'kSfyax dk izfr'kr 81-5 ls 109- 8 ik;k x;k gSA bl ekWMy ls ew¡xQyh dh iSnkokj izsf{kr ekuk sa dh rqyuk esa 88-5 ls 112-7 izfr'kr rd ikbZ xbZ gSA bl ekWMy ls izkIr ifj.kkek sa d s vk/kkj ij ij yxkrkj pkj Qlyk sa vkSj \_rqvk sa ds laca/k esa ew¡xQyh dh QhuksYkWkth] c<+k srjh] fodkl vkSj iSnkokj ds ckjs esa iwok Zuqeku lark s"ktud ik;k x;k gSA ew¡xQyh dh izsf{kr*  और प्रतिरूपित पैदावार के बीच 11 प्रतिशत की घटबढ़ पाई गई है जिससे पता चलता है कि मॉडल के आधार *ij fd;k x;k iwok Zuqeku lark s"ktud gSA ,y- ,- vkbZ- dks Nk sMdj okLrfod ekuksa vkSj izsf{kr ekuksa esa varj (*डी.) 0.03 और 1.77 के बीच रहा है जिससे मॉडल के संतोषजनक कार्य करने का पता चलता है। प्रतिरूपण *v/;;uk sa d s ifj.kkeksa ls irk pyrk gS fd tc vf/kd o"kkZ gk sus dhs laHkkouk gks rk s ew¡xQyh ds chtksa dh lkekU; nwjh rFkk cqokbZ ds lkekU; le; dh vis{kk chtk sa dks vf/kd ikl&ikl cksdj rFkk cqokbZ yxHkx ,d lIrkg igys djd s ew¡xQyh dh vf/kd iSnkokj izkIr dh tk ldrh gSA* 

**ABSTRACT.** Field experiments were conducted at Anand, Gujarat during 1987-90 to validate the PNUTGRO model. The model was used to predict phenology, growth, development and yield of groundnut. The simulated flowering, pegging, pod formation and pod maturity dates, leaf area index (LAI), biomass, shelling % and pod yield of groundnut were compared with the observed values for three cultivars *viz*., GAUG 10, GAUG 2 and Ro-33-1. The simulated phenological events showed a deviation of  $-1$  to  $+5$  days for flowering,  $+2$  to  $+6$  days for peg formation,  $-3$  to  $+6$  days for pod formation and –6 to +5 days for pod maturity of the crop. The model estimated leaf area index within 91.8 to 105.8% and shelling percentage within 81.5 to 109.8% of the actual values. The model simulated the pod yields within 88.5 to 112.7% of the observed values. The results obtained with the model for the four consecutive crops and seasons revealed satisfactory prediction of phenology, growth, development and yield of groundnut. The percent error between observed and simulated pod yield was 11% which indicated satisfactory prediction by the model. The degree of agreement (d) ranged between 0.03 and 1.77 except for LAI indicating satisfactory performance of the model.

Results of simulation studies indicated that when there is a possibility of high rainfall higher pod yield can be achieved by adopting closer spacing and early sowing (one week earlier than normal date of sowing) compared to normal spacing and date of sowing.

**Key words –** Validation, Growth, Yield, Groundnut, PNUTGRO model, Simulation.

#### **1. Introduction**

Groundnut (*Arachis hypogaea* L.) is cultivated in India in diverse agroclimatic environments characterized by spatial and temporal variations in rainfall and by soils of various water retention capacities (Singh *et al*., 1994). The crop is often subject to various patterns and intensities of water deficits during the season causing year-to-year variation in its production.

System approach nowadays becomes important tool in agricultural research, as conventional field experiments



**Figs. 1 (a-d).** Weekly weather data of Anand for the standard weeks 26-46 during 1987-90

are costly and time consuming. The PNUTGRO model developed by Boote *et al*. (1986 and 1987) effectively predicts growth and yield of groundnut. This model dynamically responds to daily weather inputs, soil water deficits, cultural practices and cultivar choice. It also considers crop carbon balance – inputs from photosynthesis, its conversion into crop tissue and carbon losses due to growth and development. Management options of the model include prediction of growth and yield of groundnut in response to date of sowing, spacing, etc. This model was selected for the validation of growth and yield of groundnut in Gujarat.

It is needed to evaluate the performance of the models, because models in its original conception related to temperate environments, where the climatic conditions that simulate crop growth and development are very different from Indian environment. The agro-ecological variability is also high in our country, thus it is essential that before the models put in use for the prediction of growth and yield in India, it needs to be validated against crop performance under field conditions.

PNUTGRO model was validated by many modelers in the world. But in India, very few modelers evaluated the performance of the model under varying weather conditions. Singh *et al*. (1994) conducted multilocational trials in groundnut and evaluated the model for its response to date of sowing and row spacing. Kaur and Hundal (1999) forecasted groundnut yield using the PNUTGRO model in Punjab.

Crop simulation models are increasingly used to evaluate the variations in management options and associated yield response. Jones (1993) concluded that crop simulation models can be put in use in research yield forecast and taking strategic and tactical decision making. In the present study, the main focus was on optimizing farm management strategies using PNUTGRO model particularly by altering date of sowing and population.

## **2. Methodology**

Field experiment was conducted at Gujarat Agricultural University, Anand (72° 55′ N and 23° 35′ E, 48 m a.m.s.l.). The soil at Anand is deeper (2 m) and has a higher water retention capacity (300 mm) in the root zone. Three varieties of groundnut, *viz.*, GAUG 10, GAUG 2 and Ro-33-1 were chosen and model performance was evaluated for the period 1987-90.

#### **TABLE 1**

**Observed and simulated phenology of groundnut** 



O – Field observed, D – S-O

S – Model simulated, S. D. – Standard deviation

Meteorological data for the crop growing period (June – November) for 1987-90 were collected from the agromet observatory, Anand, Gujarat. Daily weather data on solar radiation  $(MJ \text{ m}^{-2} \text{ day}^{-1})$ , maximum temperature  $({}^{\circ}C)$ , minimum temperature  $({}^{\circ}C)$  and rainfall (mm) were collected and utilized for the study. Weather data are presented in Figs. 1 (a-d).

Information on latitude of the site, soil profile properties, planting date, planting depth, population, fertilizer application and amount were used in the model. Regular crop management practices were followed and data were collected from the field experiments conducted during the period 1987-90. 12 data sets comprising three varieties for four years (1987-90) were collected to compare observed and predicted values. Data on crop phenology, LAI, biomass and yield were compared with model predicted values.

The groundnut crop was sown on  $2<sup>nd</sup>$  or  $3<sup>rd</sup>$  of July with a spacing of  $30 \times 10$  cm (*i.e.*, 33.3 plants m<sup>-2</sup>). The cultivars *viz.*, GAUG 10, GAUG 2 and Ro-33-1 normally take 120, 100 and 110 days respectively, to reach physiological maturity.

### **3. Model calibration**

Before using any model in an area, it is necessary to calibrate that model for that area (Jagtap *et al.*, 1993 and Dent and Blackie, 1979). The PNUTGRO model requires variety specific genetic coefficients. The file, GENETICS PN9. of the model was used for the purpose. This file defines cultivar sensitivity to daily weather inputs at different growth stages. The PNUTGRO model includes 11 phenological coefficients and 12 growth coefficients (Kaur and Hundal, 1999). The values of these 23 genetic coefficients were calibrated to validate growth and development of groundnut.

In addition to validation, *i.e*., comparison of both simulated and observed values, the model performance was also evaluated by statistical measures like coefficient of determination  $(R^2)$ . Wilmott (1982) pointed out that the main problem of this analysis is that the magnitude of  $R^2$ is not consistently related to the accuracy of prediction where accuracy is the degree to which model predictions approach the magnitude of their observed values.

In this case test criteria are separated into two groups, *viz*., summary measures and difference measures. Summary measures include the mean of observed and





(b) Days to peg formation



(c) Days to peg maturity (d) Leaf area index (LAI)











(e) Biomass (t ha<sup>-1</sup>) (f) pod yield (t ha<sup>-1</sup>)



Figs. 2 (a-f). Relationship between observed and simulated parameters (days to flowering, days to peg formation, days to pod maturity, leaf area index, biomass and pod yield) of groundnut (broken line – regression line).



**Observed and simulated growth and yield of groundnut** 



LAI – Leaf area index  $D - S-O$ <br>O – Field observed  $S.D - Sta$ 

S – Model simulated

S.D – Standard deviation

simulated values, the standard deviation of observed values and simulated values. In addition, a degree of agreement (*d*) (Wilmott, 1982) was calculated as follows :

$$
d = \left[ \sum_{i=1}^{n} (P_i - O_i)^2 / \sum_{i=1}^{n} (|P_i| + |O_i|)^2 \right], 0 \le d \le 1
$$

where,  $P_i$  and  $O_i$  are the predicted and observed values,

 $P_i^{\prime} = P_i - P$  and  $Q_i^{\prime} = Q_i - Q$ 

While summary measures describe the quality of simulation, difference measures try to locate and quantify errors. The latter includes mean absolute error (MAE), the mean bias error (MBE), the root mean square error (RMSE) and per cent error (PE) (Wilmott, 1982). They are calculated as below :

$$
MAE = \sum_{i=1}^{n} (P_i - O_i) / n
$$
  
\n
$$
MBE = \sum_{i=1}^{n} (P_i - O_i) / n
$$
  
\n
$$
RMSE = \sqrt{\sum_{i=1}^{n} (Pi - Oi)^2 / n}
$$
  
\n
$$
PE = RMSE / \overline{O}
$$

MAE and RMSE indicate the magnitude of the average error. MBE describe the direction of the error bias. PE less than 10% indicates matching of predicted and observed values, more than 10% and less than 25% indicates matching of predicted and observed values fairly. PE more than 25% indicates predicted and observed values do not match.

### **4. Application of model**

In order to study the crop yield response to different dates of sowing and plant densities, yields were simulated with the following sets of treatments using historic weather data. Effect of date of sowing and spacing was simulated for high and low rainfall years, *i.e*., 1990 and 1987, respectively.



### **5. Results and discussion**

The model predicted growth characters *viz.*, crop phenology, LAI, biomass and yield of groundnut in close

#### **TABLE 3**

 **Summary measures and difference measures for the data sets of groundnut**



\* mean of 12 values PE – Percent Error S.D. (O) – Standard deviation (observed) MBE – Mean Bias Error<br>S.D. (S) – Standard deviation (simulated) RMSE – Root Mean Square Error

 $S.D. (S)$  – Standard deviation (simulated)

MAE – Mean Absolute Error *d* – degree of agreement

association with field observed values. They are described under the following heads:

deviation between observed and simulated phenological stages of groundnut was within the range of variation encountered in field observations for these parameters.

# 5.1. *Crop phenology*

The data on days to flowering, peg formation, pod formation and pod maturity (both observed and simulated) are presented in Table 1 and in Figs. 2 (a-c). The results indicated that the model simulated the time of flowering closely to that of observed values in all the 4 years. The simulated days varied from  $-1$  to  $+5$  days in all the years. The variation in weather parameters during the trial is attributed to this deviation. The simulated days varied more in 1988 than other years. The lowest variation was observed in 1990 as rainfall was the highest among all the other years.

There was no much difference between observed and simulated values on time of peg formation. The model predicted the time of pegging 2-6 days late in all 4 years. The variation in predicted days for pegging was the maximum in 1989 and lowest in 1987 when compared with other years.

The time of pod formation was predicted by the model closely with observed values. However, there is a variation of  $-3$  to 6 days, which are within allowable limits. The variation in predicted days for pod formation was the maximum during 1990 when compared with other years. The lowest variation was observed in 1987. There is a –6 to +5 days variation in the simulated pod maturity. The variation in the predicted days for pod maturity was the maximum during 1989 when compared with the other years. The variation was the lowest during 1987. Thus the

### 5.2. *Crop growth and yield*

The data on LAI, biomass at maturity, pod shelling % and pod yield (both observed and simulated) are presented in Table 2 and in Figs. 2 (d-f). The maximum LAI ranged from 3.3 to 5.9 for different varieties and years. The model simulated maximum LAI was significantly correlated  $(R^2 = +0.9)$  with the observed maximum LAI at harvest. The model estimated the maximum LAI to be within the range of 91.8 – 105.8% of the observed LAI. The variation was the maximum in 1990 and minimum in 1987.

The data revealed that the model predicted the biomass yield closely with observed values. However, there was deviation of  $-9.3$  to  $+12.6%$  to that of observed values in all the four years. The variation in the predicted biomass at maturity was the maximum in 1990 with that of observed values. Model predicted pod shelling % closely to that of observed values. Shelling percentage, an important yield attribute ranged from 60.22 to 72.11% with a deviation of  $-8.5$  to  $+9.8\%$  to that of observed values. The variation was the maximum in 1987 and minimum in 1990 due to variation in weather parameters.

The model predicted pod yield ranged between 683 to 2470 kg/ha in all the four years. The model simulated pod yield ranged within 88.5-112.7% of the observed values. Simulated pod yield was significantly correlated  $(R<sup>2</sup> = +0.93)$  with the observed pod yield. Highest yield

### **TABLE 4**

**Simulated pod yield of groundnut cultivars against date of sowing and spacing during 1987 and 1990** 



\* Treatment details are given in Application of model

was observed in 1990 due to favourable weather conditions and more rainfall in particular than other years and the model also predicted this.

The summary and difference measures for the data sets of groundnut are presented in Table 3. In this study, the degree of agreement (*d*) ranged between 0 and 0.6 except for LAI. Higher *d* for LAI is due to the fluctuations in the simulated and observed values approaching zero. Negative MBE occurs in the case of LAI as almost model predictions are lesser than observed values. The PE values indicate that the model predicted phenology, growth, yield and development of groundnut satisfactorily except for LAI. This perhaps needs further validation and correction of the model, mostly for LAI. Similar results have been reported by Shivsharan *et al*. (2003) and Shivsharan *et al*. (2003a).

# 5.3. *Model application*

The sensitivity analysis (simulating date of sowing and spacing) option available in the model allowed to evaluate management strategies or to make tactical or strategic decisions by modifying the default values in the planting and field conditions. The results are presented in Table 4.

The results indicated that by adopting a closer spacing of  $25 \times 10$  cm than normal  $(30 \times 10$  cm) and carrying out sowing one week earlier than normal date would be beneficial because of higher population and favourable weather conditions in 1990. The model also predicted that when there is a delay of one week of sowing to that of normal and when wider spacing is followed, pod yields were drastically reduced. This is applicable even for a good rainfall year, *i.e*., for 1990.

But in the year 1987, when a very low rainfall of 283 mm was received, adopting closer spacing and advancing the date of sowing drastically reduced the pod yield. In such low rainfall year, normal date of sowing and spacing would give better yield than closer spacing and advancing the date of sowing.

Thus crop management options by altering the date of sowing and spacing based on long range/medium range rainfall forecast and adopting proper management practices would help to increase the pod yield of groundnut. Such area specific suggestion can be included in the Agromet Advisory Service bulletin of India Meteorological Department and disseminated among the farmers.

# **6. Conclusion**

The following conclusions are drawn :

(*i*) PNUTGRO model well responded to all varieties in all the years under varying weather conditions.

(*ii*) The results obtained with the model for the four consecutive crop seasons revealed satisfactory predictions of crop phenology, growth and yield of groundnut and hence the model can be used for forecasting groundnut yield in and around Anand region of Gujarat state.

(*iii*) The summary and difference measures indicate that model performed satisfactorily in the prediction of growth and yield of groundnut.

(*iv*) The model can also be applied for making strategic farm management decisions.

(*v*) Using long range seasonal rainfall forecast and the tactical decision developed through the model, it could be possible to advise the farming community for better utilization of resources through Agromet advisory bulletins. Closer spacing and early sowing (one week earlier than normal date of sowing) compared to normal spacing and date of sowing may be advised under normal to excess rainfall condition.

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