Calibration and validation of FAO-AquaCrop model to estimate the total biomass and yacon root yield

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Abstract: Due to the current water scarcity in the world, it is extremely important to improve the use of this natural and exhaustible resource in agriculture, by contributing to increase agricultural production and sustainability. Several models of crop growth simulation were developed to predict the edaphoclimatic effects on crop yield. These models are calibrated and validated for a given region using the data generated from field experiments. Therefore, the objective of this study was to calibrate and validate the FAO AquaCrop model for yacon (*Smallanthus sonchifolius*) crop in a tropical climate. The experiment was conducted in an experimental area located in the municipality of Ibatiba, state of Espírito Santo (Brazil) during the years of 2013 and 2014. The calibration was done using the Autumn planting and validation with the Winter and Spring plantings. For the statistical analysis, the coefficient of determination, Willmott concordance index, bias for the systematic error, root mean square error and the mean absolute error to test the model performance were used. In general, the FAO AquaCrop model predicted the root yield, total biomass and harvest index with acceptable accuracy, and with deviations of less than 6% for total and root biomass. Late planting of yacon showed a reduction in yield as well as total biomass. **Keywords:** *Smallanthus sonchifolius*, root yield simulation, modelling, agrometeorology

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1 Introduction

The management of water resources demands detailed studies, since fresh water is an indispensable and exhaustible natural resource, with a fundamental role in the development of living beings^[1,2]. Therefore, many agrometeorological models have been developed to assist in water resources planning and decision making, and they are used by several researchers in different parts of the world.

Among them, we can mention CropWat^[3], DSSAT^[4], AquaCrop^[5-7], CropSyst^[8]. In addition, they are widely used for the purposes of agroclimatic zoning and irrigation management,

since the correct management and use to add or supplement the water demand of the crop can result in higher yields^[9,10]. Thus, the use of crop growth models is crucial for the optimization of agricultural practices and, even more importantly, for modeling plant cover variations on an annual scale^[11].

The AquaCrop model, developed by FAO, provides a good balance between robustness, simplicity and precision of the output, and it can be used for a wide variety of crops^[12,13] using few input parameters. Although they are found in the literature on potato studies^[14-16], there is still limited information on modeling with yacon.

Yacon (*Smallanthus sonchifolius*) is a tuberous root-producing plant from the Andes that stores carbohydrates in the form of fructooligosaccharides. This is one of the reasons because yacon is considered a functional food with high nutraceutical potential^[17].

The water demand of the crop has been pointed out as the most determinant factor for the production of tuberous roots^[18]. Therefore, the use of agrometeorological models, aiming to assist in the planning of water resources and the decision making for the fulfillment of crop water demand, can result in higher yields. However, prior to the direct use of any model, calibration activity is fundamental to meet specific characteristics of each crop or variety and efficiently simulate its growth and development in particular pedo-climatic conditions.

Validation is the second fundamental activity before model applicative use; it is performed through model tests calibrated at other sites and/or seasons in order to test the model's ability to simulate climatic fluctuations. Thus, the objective of this study

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was to calibrate and validate the AquaCrop model for yacon crops in a tropical climate.

2 Materials and methods

2.1 Climatic characteristics and location of the experiment

The field experiments were installed and conducted in an agricultural area, in the municipality of Ibatiba (20°17'S, 41°37'W, 837 m in altitude) located in the state of Espírito Santo, Brazil (Figure 1), in a randomized block design, with four replicates.

The treatments were constituted by three planting seasons of yacon in 2013: Autumn (April 20), Winter (July 20) and Spring (September 20). For meteorological monitoring, a meteorological station belonging to the Capixaba Institute for Research, Technical Assistance and Rural Extension - INCAPER located near (10654 m) the experimental area was used. The behavior of the maximum and minimum air temperatures, as well as the precipitation, occurred along the crop cycle in their respective plantations, which can be observed in Figure 2.



Figure 1 Geographic location of the state of Espírito Santo, in Brazil, with emphasis on the municipality of Ibatiba



Figure 2 Maximum and minimum air temperatures and precipitation during the three planting seasons: Autumn, Winter and Spring. Bottom and upper continuous lines refer to lower (Tb) and upper (TB) basal temperatures, respectively

Using the daily data of maximum and minimum air temperatures, potential evapotranspiration was calculated by Thornthwaite method^[19] on a monthly scale, since it uses only average air temperature data as input data, it is inserted into the AquaCrop model, according to Equations (1)-(6).

$$\text{ETP} = 16 \times \left(10 \times \frac{Ti}{I}\right)^a \qquad 0^\circ \text{C} \le T_i \le 26^\circ \text{C} \tag{1}$$

$$ETo = -415.85 + 32.24 \times T_i - 0.43 \times T_i^2 \qquad T_i > 26^{\circ}C \qquad (2)$$

where, ETP is the potential evapotranspiration, mm/mon; T_i is the monthly mean air temperature, °C.

I is the thermal index imposed by the local climate regime, calculated by:

$$I = \sum_{n=1}^{12} (0.2 \times T_i)^{1.514}$$
(3)

$$a = 6.75 \times 10^{-7} \times I^3 - 7.71 \times 10^{-5} \times I^2 + 1.7912 \times 10^{-2} \times I + 0.49239$$
(4)

where, suffix *i* represents the month of the year (i = 1, 2, ..., 12).

After obtaining the ETP value, the correction was performed according to the real number of days and the photoperiod of the month by means of Equations (5) and (6).

$$ETP = ETP \times Cor$$
 (5)

$$\operatorname{Cor} = \left(\frac{ND}{30}\right) \times \left(\frac{N}{12}\right) \tag{6}$$

where, ND is the number of days in the month in question, and N is

the average photoperiod of that month.

2.2 Cultivation practices

The soil was prepared by plowing at 30 cm depth followed by harrowing. The planting method was manual, performed in grooves using rhizophores of approximately 35 g at a depth of 10 cm, obeying the desired spacing. 180 g of tanned bovine manure per plant were placed. Bovine manure contained the following nutrients: 14.21 g/kg N; 4.75 g/kg P; 5.28 g/kg K; 4.29 g/kg Ca and 1.92 g/kg Mg. During the cultivation cycle, conventional sprinkler irrigation was used, maintaining the crop always in the field capacity. The local soil was classified as red-yellow latosol

The local soil was classified as medium texture Red-Yellow Latosol^[20], and the sample was submitted to the CCAE/UFES Soil Laboratory for chemical and physical analysis. A sample collected from 0-20 cm, was analyzed and showed the following characteristics. pH (water): 6.20; Phosphorus Mehlich 1: 53.99 mg/dm³; Potassium: 80.00 mg/dm³; Calcium: 2.12 cmolc/dm³; Magnesium: 0.87 cmolc/dm³; Aluminium: 0.0 cmolc/dm³; Sum of bases: 3.24 cmolc/dm³; CTC effective: 3.24 cmolc/dm³; Total organic carbon: 1.83%; Total nitrogen: 0.15%.

In order to estimate the soil variables, pedotransfer functions (PTF) were used, thus obtaining the saturation humidity, field capacity, permanent wilting point and saturated hydraulic conductivity required for simulation by the AquaCrop model. Using the methodology proposed by Tomasella^[21] were derived

from the soil variables of the present study region were, and presented in Table 1.

 Table 1
 Soil properties used as an input in the AquaCrop model for yacon simulation in Ibatiba-ES

Layers	Depth/m	PWP/%	FC/%	Saturation/%	$K_{sat}/mm \ d^{-1}$
1	0.00-0.20	11.0	26	53	280.8
2	0.20-0-50	11.0	26	53	280.0

Note: PWP: permanent wilting point; FC: field capacity; Ksat: saturation and saturated hydraulic conductivity.

The experimental unit consisted of five planting lines of 8 m, spaced 1.0 m between rows and 0.5 m between plants, totaling 16 yacon plants per planting line, and they were evaluated every 30 d after the emergence. Every 30 d after the emergency, two plants per experimental unit, randomly chosen within the central lines, except for the borders, were collected for evaluation. The total dry mass and root mass data were obtained in a forced air circulation oven at $(70\pm5)^{\circ}$ C until constant mass, and they were converted to biomass by land area, considering the plant density of each plot (2 plants/m²).

2.3 Brief description of the AquaCrop model

The model is based on the soil-plant-atmosphere components of the soil, atmosphere, crop characteristics and crop management^[12,13]. The model calculates the daily water balance and separates its evapotranspiration in evaporation and transpiration, and the transpiration of the crop is linked to the canopy cover (proportional to the extension of the soil cover), while evaporation is proportional to the area of uncovered soil^[22].

AquaCrop simulates the daily production of biomass and the yield of the crops according to the water demand of the crop and the agronomic management^[23]. The details of the simulated processes are provided in a set of three articles^[12,13,24], which were published by Irrigation and Drainage No. 66 'Results of crop yield to water' and the reference manual^[25]. Figure 3 shows the interface of the AquaCrop version 6.0 model used.



Figure 3 Window that illustrates the database system for the simulation of AquaCrop model

2.4 Adjustment of crop parameters

The development of the canopy was measured in terms of growth phases, through leaf area, total biomass and root biomass on monthly basis after the emergence of 80% of the plants. The yacon variables used for the calibration of the AquaCrop model are presented in Table 2. The same values of this set of variables were used to evaluate the performance and robustness of AquaCrop in the Winter and Spring plantings.

 Table 2
 Selected crop variables and values for AquaCrop calibration for yacon

Variables	Value				
Base temperature/°C	12.5				
Upper temperature/°C	34.0				
Relative weed coverage/%	5.0				
Canopy growth coefficient - CGC/%·d ⁻¹	8.5				
Canopy decline coefficient CDC/%·d ⁻¹	1.08				
Soil water depletion threshold for canopy expansion-Upper threshold	25.0				
Soil water depletion threshold for canopy expansion-Upper threshold	55.0				
Shape factor for Water stress coefficient for canopy expansion	3.0				
Soil depletion factor for stomatal control	0.50				
Shape factor for Water stress coefficient for stomatal control	3.0				
Soil water depletion factor for early canopy senescence	0.55				
Cold stress/°C	5.0				
Standard water production WP*/g·m ⁻²	15.0				
Harvest index/%	56.0				
Plant density/plants hm ⁻²	20000.0				
CCo initial coverage cover/%	0.10				
Maximum canopy growth/%	83.0				
Time to maximum canopy coverage (GD)	1135.0				
Time for senescence (GD)	1767.0				
Time to maturity (GD)					
Maximum effective rooting depth/m					

2.5 Parameterization and validation of the model

To determine the performance of the adjustment in the model in the parameterization and validation, the observed values of total dry biomass, root yield and harvest index observed in the field were compared with those simulated by the model. The results are presented and discussed by planting seasons (Autumn, Winter and Spring) in which simulated and observed values of accumulated biomass, root yield and harvest index were compared.

The calibration of the AquaCrop was done through an iterative process that introduced the values that best simulated the primary growth variables of the crop, such as canopy cover, harvest index, total dry matter content and root dry matter content, which occurred in Autumn. The validation of AquaCrop was carried out by plantations in the Winter and Spring. In addition, after the parameters calibrated for the Autumn crop, the conservative and non-conservative parameters, which depend on the cultivar of the crop, were considered constant.

The statistical indexes used were: linear regression analysis and determination coefficient R^2 , Willmott's concordance index $d^{[26]}$, the bias for the systematic error, root mean square error (RMSE) and mean absolute error (MAE) (Equations (7)-(11)).

$$R^{2} = \left| \frac{\sum_{i=1}^{n} (|E_{i} - \overline{E}|)(|O_{i} - \overline{O}|)}{\sqrt{\sum_{i=1}^{n} (E_{i} - \overline{E})^{2}} \sqrt{\sum_{i=1}^{n} (O_{i} - \overline{O})^{2}}} \right|$$
(7)

$$d = 1 - \frac{\sum_{i=1}^{n} (O_{i} - E_{i})^{2}}{\sum_{i=1}^{n} (|E_{i} - \overline{O}| + |O_{i} - \overline{O}|)^{2}}$$
(8)

$$BIAS = \frac{\sum_{i=1}^{i} (O_i - E_i)}{N}$$
(9)

$$RMSE = \left[\frac{\sum_{i=1}^{n} (E_i - O_i)^2}{N}\right]^{1/2}$$
(10)

$$MAE = \frac{\sum_{i=1}^{n} |O_i - E_i|}{N}$$
(11)

where, O_i , E_i , \overline{O} and \overline{E} represent the observed values in the field, the values simulated by AquaCrop, and the average of the values observed and simulated by AquaCrop; N is the number of observations. The entire statistical procedure was performed with the aid of the R program^[27].

3 Results and discussion

In Table 3, the deviations obtained between the values observed and simulated by the AquaCrop model for the three planting seasons in Ibatiba, Espirito Santo, that were done at the end of the experiment, are presented. It is observed that the value calibrated in the Autumn showed a deviation of -8.6% for the HI, while the Winter and Spring plantings, times used to validate the model showed 7.6% and -1.4% of deviation, respectively.

The values of harvest index (HI) obtained in the field tests were similar to those obtained by other authors^[25,28,29] for common potato (*Solanum tuberosum*). Values above 7% in the harvest index for Autumn and Winter plantings are due to climate changes, such as the temperature, since in both dates, there were higher frequencies of minimum temperatures below the lower basal temperature. As observed by Hanks^[30] and Struik and Ewing^[31], HI is sensitive to major changes in climate, in which temperature and photoperiod are the main climatic factors affecting the rate of biomass accumulation, as well as partitions between the leaves, stems, roots and tubers.

Table 3Percentage deviation for harvest index, total biomass and simulated root yield observed for yacon crop at the end of the
experiment, for the three planting seasons, in the region of Ibatiba, Espirito Santo, Brazil, 2013

Planting —		HI			Total Biomass			Root Yield		
	Obs	Sim	Deviation/%	Obs/t·hm ⁻²	Sim/t·hm ⁻²	Deviation/%	Obs/t·hm ⁻²	Sim/t·hm ⁻²	Deviation/%	
Autumn	0.52	0.56	-8.67	17.85	17.21	3.59	9.27	9.74	-5.08	
Winter	0.61	0.56	7.65	13.54	14.04	-3.97	8.30	7.97	3.92	
Spring	0.55	0.56	-1.43	13.63	13.91	2.03	7.61	7.60	0.17	
Note: HI: Harvest Index: Obs. Sim refer to the values observed in the field and simulated by the AguaCrop model										

The total biomass value presented a deviation of 3.5% in the calibration (Autumn). The adjusted model presented satisfactory results in the respective Winter and Spring plantings, with deviations of -3.9% and 2.0%, respectively. It is noteworthy that the Autumn and Spring plantings presented final values of total biomass overestimating the simulated value, being corroborated by the bias (Table 4), with respective values of 0.64 t/hm² and 0.21 t/hm² for the Autumn and Spring plantings.

When the root yield was evaluated, a negative value is observed for the deviation obtained during Autumn planting. These values are corroborated by the systematic error (Table 4), presenting the value of -0.47 t/hm². However, the deviations obtained at the end of the experiment were good, with values below 6.0% for all simulations.

Table 4Results of root mean square error (RMSE), absolutemean error (MAE) and Bias for yacon total biomass and rootyield observed and simulated for three planting seasons in theIbatiba region, ES, Brazil, 2013

Planting	Total	Biomass/t-	hm ⁻²	Root Yield/t·hm ⁻²			
	RMSE	Bias	MAE	RMSE	Bias	MAE	
Autumn	2.50	0.64	2.39	1.22	-0.47	0.74	
Winter	1.30	-0.53	1.18	0.89	0.32	0.60	
Spring	0.82	0.21	0.79	0.71	0.01	0.59	

Although a larger number of days were observed with minimum temperature values below the lower basal temperature (Figure 2) in the Autumn and Winter plantings, the production of both had higher values than the Spring planting. This is due to the increase in the yacon cycle duration during these planting seasons (Autumn and Winter), since the average temperature during the whole cycle was lower than the Spring planting, resulting in an increase in the required days for the end of the cycle and, consequently, for the green leaf area^[32]. The model was able to respond with precision to this increase in the root yield as a function of the increase in the duration of the crop cycle.

In Figure 4, the regression analysis for observed and simulated root yield during the cycle, as well as its coefficient of determination and concordance index at different planting times, is graphically observed. According to the regression analysis, the AquaCrop model overestimated the values of dry root biomass at all planting times, when comparing the entire data set along the cycle, with low dispersion of the data and presenting values of $R^2 > 0.92$.

This shows that the simulation of the model explained more than 92% of the variability of the data observed in the field. In addition, there was high agreement among the data, with d=0.98 in all planting seasons. The good parameterization of the model is due to the availability of soil cover data, which enabled the model to have a good response to the total yacon biomass (Table 3). The transpiration rate of a crop was affected by the canopy cover and, consequently, the accumulation of biomass, thus, the correct simulation of this variable results in a better performance of AquaCrop^[33].

For the error analysis obtained in this experiment, the value of 2.5 and 2.4 t/hm^2 for RMSE and MAE, respectively, for total biomass (Table 4) is observed in the calibration (Autumn) phase. However, for root yield, these errors are reduced to 1.2 and 0.74 t/hm^2 for RMSE and MAE, respectively.

The validation of the model presented lower errors than after the calibration, with a value of 0.82 t/hm^2 of total biomass (RMSE) and 0.71 t/hm^2 of root yield for the Spring planting. These results are close to those found by Montoya^[16] for potato (*Solanum* sp.), which were irrigated maintaining 100% field capacity, with RMSE of 1.32 t/hm². Although the metric statistics express the prediction error of the model, the differences between the RMSE and the MAE values are due to the increase in the penalty obtained by the RMSE error when there are larger differences between the observed and simulated values.

In general, the AquaCrop model presented good results to simulate the root yield in the region of Ibatiba, Espírito Santo, Brazil. By running the model under different planting time scenarios, it is possible to optimize the planting date of the yacon, making AquaCrop a promising tool for predicting yacon root yield cultivated out of season in Ibatiba, as well as to estimate the irrigation need.



Figure 4 Relationship between the observed and simulated values for yacon root yield in Autumn (a), Winter (b) and Spring (c) crops during cycle

4 Conclusions

For the first time, the AquaCrop model was used to simulate yacon total biomass and root yield. AquaCrop version 6.0 adequately simulated the harvest index as well as total biomass and yacon root yield at different planting times, with deviations below 6% for total and root biomass.

The model can be used to mitigate the effects of climate change, evaluating in advance the optimal planting time.

AquaCrop can be used to model yacon production as well as strategic irrigation planning and for agroclimatic zoning.

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