

Available online at www.sciencedirect.com

Environmental Modelling & Software

Environmental Modelling & Software 21 (2006) 1042-1054

www.elsevier.com/locate/envsoft

Parameterization of a crop growth and development simulation model at sub-model components level. An example for winter wheat (*Triticum aestivum* L.)

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Received 2 June 2004; received in revised form 5 May 2005; accepted 9 May 2005 Available online 18 July 2005

Abstract

Dynamic simulation models are frequently used for assessing agronomic and environmental effects of different management practices, under various pedo-climatic conditions. CropSyst is a suitable cropping systems simulation model for such applications. However, available CropSyst crop parameters for winter wheat, one of the most important cereals in the world, are limited. In this work we show that it is possible to parameterize separate sub-model components by using existing experimental data and literature.

The experiments, carried out in northern Italy between 1986 and 2001, quantified the dynamics of aboveground biomass (AGB), plant nitrogen (N) concentration (PNC) and N uptake (UPTK) by means of periodical measurements.

The relative root mean square error (calculated by dividing the root mean square error by the average of observations) obtained after model calibration and validation on an independent data set was, respectively, in the range 9–30% and 17–32% for AGB, 10% and 6–40% for PNC, 8–28% and 9–24% for UPTK. AGB was frequently underestimated. Despite the limited accuracy of simulations, we argue that calibrated crop parameters are adequate for scenario analysis as most differences between years and fertilization levels were reproduced by the model and final AGB and cumulative UPTK were also correctly simulated.

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Keywords: Plant nitrogen concentration; Nitrogen uptake; Aboveground biomass; CropSyst; Crop growth rate; Temperature response function

1. Introduction

Simulation models are nowadays widely applied in agriculture to make predictions about the agronomical, environmental and economic consequences of the complex interactions between crop management, soil and atmosphere (e.g. Acutis et al., 2000; Bechini et al., 2003; Donatelli et al., 2002; Gömann et al., 2005; Johnsson et al., 2002; Lewis et al., 2003; Rossing et al.,

1997; Sousa and Pereira, 1999; Ten Berge et al., 2000; Wise and Cacho, 2005; Wolf et al., 2003).

Because models allow the simulation of stochastic scenarios (Badini et al., 1997; Acutis et al., 2000; Peralta and Stöckle, 2001; Bechini et al., 2003), they can be useful in the estimation of probabilities associated with the occurrence of events. Processes requiring scenario simulations in many intensive agricultural areas include the environmental impact of rural development plans, of manure and fertilizer management, and of agrotechniques involving the use of agrochemicals. CropSyst (Stöckle et al., 2003) is a cropping system simulation model which is distributed free of charge and provides: a platform for simulating crop rotations, an automatic

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management events scheduler, the possibility to run multiple simulations in connection with a Geographical Information System. All of the aforementioned characteristics make CropSyst particularly suitable for scenario simulations (Peralta and Stöckle, 2001; Bechini et al., 2003); other models simulate crop growth processes with more detail but have lower or no flexibility in specifying routine management techniques (e.g. SUCROS, Goudriaan and van Laar, 1994).

Realistic and accurate sets of crop parameters needed to correctly apply the models should be obtained from crop-specific field conditions. Such model parameters have been already published for several cultivated species in Italy (Donatelli et al., 1997; Giardini et al., 1998; Bellocchi et al., 2002; Bocchi et al., 2003; Confalonieri and Bechini, 2004; Confalonieri and Bocchi, in press).

Wheat (*Triticum aestivum* L.) is one of the most important cereals both in Italy and globally (FAOSTAT data, 2004). Despite the fact that wheat crop simulation models are now widely applied in monitoring and planning agricultural resources, CropSyst parameters for wheat are limited in the sense that they refer to older model versions (Giardini et al., 1998), to specific pedoclimatic environments (Stöckle et al., 1994; Pannkuk et al., 1998), and sometimes lack the complete list of crop parameters.

Considering the difficulty of performing serious, long-term experimental studies to set up and update species- and cultivar-specific sets of crop parameters, possible approaches for the estimation of crop model parameters include: (i) parameterize the models at species levels or, in the best cases, for sub-species groups (e.g. maturity classes for cereals such as rice, wheat and corn or plant morpho-physiological types for rice); (ii) recover, assess and use data collected for other purposes to derive the maximal amount of information for crop parameterization. Within this second approach, we may also consider specific sub-model components to determine the values of the main crop parameters.

The present study was performed: (i) to set up crop parameters required by CropSyst for winter wheat simulation; (ii) to assess the plausibility of reaching this objective through the integration of information recovered from relatively limited existing experimental data sets and from available literature; (iii) to highlight the potentials and the limitations of CropSyst as a tool for scenario analyses with winter wheat.

2. Material and methods

2.1. Experimental data

Experimental data were collected in 4 experiments (Table 1 and 2) carried out between 1986 and 2002 in

The data set:	The data sets used in this work	work								
Experiment no.	Experiment Location Latitude, Years no. longitude, altitude	Latitude, longitude, altitude	Years	Sowing date	Treatments	Experimental design	Replicates	Measured variables	No. of samples	Replicates Measured No. of Sample size variables samples
-	S. Angelo Lodigiano	S. Angelo 45°15′N, Lodigiano 9°22′E, 73 m a.s.l.	1986—1987 20/10/1986 1987—1988 25/10/1987		3 N levels (0, 140, 210 kg N ha ⁻¹)	Complete randomized block	3	AGB ^c PNC ^d	9	$0.180 \text{ m}^2 (0.18 \text{ m} \times 1.0 \text{ linear m})$
7	S. Angelo Lodigiano	45°15′N, 9°22′E, 73 m a.s.l.	1989—1990 02/11/1989 1990—1991 16/11/1990	02/11/1989		Split-plot (plot: species; subplot: cultivars)	4	AGB ^c PNC ^d	15	0.180 m² (0.18 m \times 1.0 linear m)
3	Lodi	45°19'N, 9°28'E, 80 m a.s.l.	1996—1997 14/10/1996	14/10/1996		Split-plot (plot: species; subplot: cultivars)	ĸ	AGB ^c PNC ^d	∞	$0.180 \text{ m}^2 (0.18 \text{ m} \times 1.0 \text{ linear m})$
4	S. Angelo Lodigiano	45°15′N, 9°22′E, 73 m a.s.l.	2001—2002 16/11/2001		9 N levels (0, 50, $100^{a} \times 0$, 40, 80^{b} kg N ha^{-1})	Split-split-plot (plot: preseeding fertilization; subplot: top-dressing fertilization; sub-subplot: cultivars)	3	AGB^c	S	$0.216 \text{ m}^2 \text{ (0.18 m} \times 1.2 \text{ linear m)}$

^a Pre-seeding fertilization.

b Top-dressing fertilization.

 $^{\circ}$ AGB = aboveground biomass.

Table 2 Characteristics of the soils

Experiment	Location	Years	Soil layer (m)	Sand $(g kg^{-1})$	Clay $(g kg^{-1})$	$\begin{array}{c} \text{Silt} \\ (g \ kg^{-1}) \end{array}$	pH (water)	C.E.C. ^a (cmol kg ⁻¹)	$SOM^b (g kg^{-1})$
1	S. Angelo	1986-1987	0.00-0.40	550	30	420	6.2	10.0	26
			0.40 - 0.60	580	20	400			18
			0.60 - 0.80	540	30	430			15
			0.80 - 1.00	550	30	420			14
1	S. Angelo	1987-1988	0.00-0.20	630	40	330	6.7	13.0	15
			0.20 - 0.40	650	40	310			15
			0.40 - 0.60	700	40	260			9
			0.60 - 0.80	600	50	350			8
			0.80 - 1.00	540	30	130			6
2	S. Angelo	1989-1990	0.00-0.20	540	90	370	5.9	12.0	18
			0.20 - 0.40	670	160	170			17
			0.40 - 0.60	580	20	400			11
			0.60 - 0.80	540	30	430			9
			0.80 - 1.00	550	30	420			8
2	S. Angelo	1990-1991	0.00-0.20	700	50	250	6.7	10.9	11
			0.20 - 0.40	710	80	210			7
			0.40 - 0.60	620	50	330			10
			0.60 - 0.80	550	30	420			8
			0.80 - 1.00	520	20	460			5
3	Lodi	1996-1997	0.00-0.30	720	100	180	6.5	10.0	15
			0.30 - 0.50	650	130	220			13
			0.50 - 1.00	540	190	270			10
4	S. Angelo	2001-2002	0.00 - 0.20	690	150	160	6.4	9.0	13
	-		0.20 - 0.40	650	150	200			15
			0.40 - 0.60	550	40	410			11
			0.60 - 0.80	520	20	460			6
			0.80 - 1.00	540	30	430			7

^a C.E.C. = cation exchange capacity.

2 locations in northern Italy. This area is characterized by a moderate continental climate, with a mean annual temperature of about 13 °C; the absolute minimum temperature occurs between January and February and the absolute maximum between July and August. Total precipitation (about 800 mm year⁻¹) is relatively well distributed and the average wind speed is about 1.5 m s⁻¹.

For all the experiments considered, the soils had high phosphorus and low potassium content. Daily meteorological data (rainfall, maximum and minimum air temperatures, global solar radiation) were collected with automatic weather stations near the fields. Plant samples were dried in oven at 70 °C (until constant weight) to determine the aboveground biomass (AGB).

The first experiment was carried out with the aim of verifying the effects of nitrogen (N) fertilization on winter wheat (cv. Gemini) growth. The second experiment had the purpose of describing the spring dynamics of biomass accumulation and forage quality of five species [winter wheat, Italian ryegrass (Lolium multiflorum Lam.), barley (Hordeum vulgare L.), rye (Secale cereale L.), triticale (Triticum × Secale)]. Two cultivars were used for each species (Pandas and Centauro for wheat). AGB samples were collected every 10 days until

head emergence [Decimal Code (DC) 55], every 3 days between earing and late milk maturity (DC77) and every 10 days between late milk maturity and physiological maturity (DC89). The third experiment was conducted to study the spring dynamics of forage quality and biomass accumulation of winter wheat, barley and Italian ryegrass. Two cultivars were grown for each species (Eridano and Soissons for wheat). The fourth experiment was carried out to compare the effects of N fertilization on the growth of three wheat cultivars (Guadalupe, Enesco and Eureka). In this experiment, aboveground plant biomass accumulation was measured only for the optimal N treatment. Plant sample size for AGB measurements was determined by using the following method. An elementary sub-sample size (S) was chosen (0.20 linear $m = 0.036 \text{ m}^2$). Nine biomass samples of size αS (with α integer from 2 to 10) were weighted, recording separately the values for each elementary sub-sample. For each sample the mean weight of the α sub-samples and its standard deviation were calculated. The means and the standard deviations were plotted against α . The minimum sample size for the experiment corresponded to the value of α with stable means and reasonably low standard deviations.

^b SOM = soil organic matter.

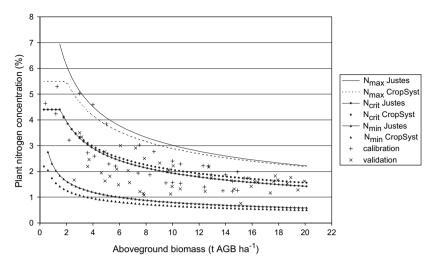


Fig. 1. Plant nitrogen concentration versus accumulated aboveground biomass: data used in this study for calibration and validation, and comparison between the maximum, critical and minimum nitrogen dilution curves proposed by Justes et al. (1994) and calculated by CropSyst with our parameters set.

Overall, 80 average measurements of AGB and 75 of plant N concentration (PNC) were available in the data set (Fig. 1), covering a wide range of growth stages, biomasses and N concentrations. The experimental data were analyzed with the software CoLiDaTa (Confalonieri and Scaglia, 2002), which automatically applies many statistical tests for the validation of analytical data. In particular, the Grubbs's test (Grubbs, 1969; ISO 5725-2, 1994) was used to discard outliers.

2.2. Simulation model

CropSyst (Stöckle et al., 2003) is a multi-year, multicrop, daily time step cropping systems simulation model developed to evaluate the effects of different pedoclimatic and management conditions on crop growth and on environmental impact.

Crop development is simulated through thermal time accumulation, by computing the growing degree days (GDDs), using $T_{\rm b}$ (base temperature; °C) as a lower threshold and $T_{\rm cutoff}$ (°C; optimum temperature for thermal time accumulation) as an upper threshold. Photoperiodical effects for long-day plants between emergence and flowering are implemented by multiplying GDDs by $f_{\rm photo}$, a dimensionless variable: $f_{\rm photo} = (L - L_{\rm if})/(L_{\rm ins} - L_{\rm if})$ where L is daylength (h), $L_{\rm if}$ (h) is daylength to inhibit flowering (no development occurs when daylength is below $L_{\rm if}$), $L_{\rm ins}$ (h) is daylength for insensitivity (above $L_{\rm ins}$ the maximum development rate occurs). $f_{\rm photo}$ equals 0 below $L_{\rm if}$ and 1 above $L_{\rm ins}$.

The potential daily AGB production (AGB_P) is calculated as the minimum of the values computed with Eqs. (1) and (2) proposed, respectively, by Tanner and Sinclair (1983) and by Monteith (1977):

$$AGB_{PT} = \frac{K_{BT}T_{P}}{VPD} \tag{1}$$

where AGB_{PT} (kg m⁻² day⁻¹) is the crop potential transpiration-dependent biomass production, T_P (kg m⁻² day⁻¹) is crop potential transpiration, VPD (kPa) is the daytime mean atmospheric vapor pressure deficit and K_{BT} (kPa kg kg⁻¹) is a biomass-transpiration coefficient, which corresponds to the water use efficiency (WUE: aboveground biomass accumulated/water transpired) multiplied by the VPD.

$$AGB_{iPAR} = RUE \times iPAR \times T_{lim}$$
 (2)

where AGB_{iPAR} (kg m⁻² day⁻¹) is the intercepted PAR-dependent biomass production, RUE_{PAR} (kg MJ⁻¹) is the PAR use efficiency, iPAR (MJ m⁻² day⁻¹) is the daily amount of crop-intercepted photosynthetically active radiation and T_{lim} is a factor which describes the effect of temperature on radiation-dependent biomass accumulation, calculated as:

$$T_{\text{lim}} = \begin{cases} 0 & T_{\text{m}} < T_{\text{b}} \\ \frac{T_{\text{m}} - T_{\text{b}}}{T_{\text{opt}} - T_{\text{b}}} & T_{\text{b}} \le T_{\text{m}} \le T_{\text{opt}} \\ 1 & T_{\text{m}} > T_{\text{opt}} \end{cases}$$
(3)

where $T_{\rm m}$ (°C) is the average air daily temperature and $T_{\rm opt}$ (°C) is the optimum temperature for growth.

The Eq. (2) is necessary because of the instability of Eq. (1) at low values of VPD. Water and nitrogen limitations are then applied to AGB_P to calculate actual daily AGB production. Water limited growth (AGB_T) is calculated by multiplying AGB_P for the ratio of actual to potential transpiration; subsequently, actual daily AGB production is calculated by applying the concept

of critical nitrogen concentration (Stöckle and Debaeke, 1997) to AGB_T.

Leaf area growth is calculated on the basis of Eq. (4):

$$LAI = \frac{SLA \times AGB}{1 + p \times AGB} \tag{4}$$

where LAI (m² m⁻²) is the green leaf area index, AGB is the accumulated aboveground biomass (kg m⁻²), SLA (m² kg⁻¹) is the mean of specific leaf area values measured at early growth stages and p is an empirical partitioning coefficient.

CropSyst uses the following equations to identify the maximum, critical and minimum nitrogen concentrations from emergence to flowering for the aboveground part of the plant:

$$N_{\text{max}} = \min(N_{\text{max}_e}, a_{\text{max}} A G B^{-b})$$
 (5)

$$N_{\text{crit}} = \min(0.8N_{\text{max}_e}, a_{\text{crit}} \text{AGB}^{-b})$$
 (6)

$$N_{\min} = \min(0.4N_{\max}, a_{\min}AGB^{-b})$$
 (7)

where

$$a_{\text{max}} = \frac{N_{\text{max}_e}}{2^{-b}} \tag{8}$$

$$a_{\rm crit} = \frac{0.8N_{\rm max_e}}{1.5^{-b}} \tag{9}$$

$$a_{\min} = \frac{0.4 N_{\max_{e}}}{0.5^{-b}} \tag{10}$$

and $N_{\rm max}$, $N_{\rm crit}$ and $N_{\rm min}$ (%) are, respectively, the plant maximum, critical and minimum nitrogen concentrations; $N_{\rm max_e}$ (%) is the plant maximum nitrogen concentration during early growth, AGB (kg ha⁻¹) is the aboveground plant biomass; $a_{\rm max}$, $a_{\rm crit}$, $a_{\rm min}$ represent thresholds at which plant nitrogen concentrations begin to decrease, and b=0.4. For the period between flowering and physiological maturity, maximum and minimum nitrogen concentrations decrease linearly to "maximum nitrogen concentration at maturity" ($N_{\rm max_m}$) and "minimum nitrogen concentration at maturity" ($N_{\rm min_m}$) input parameters.

2.3. Model parameterization and validation

CropSyst version 3.02.23 (January 8, 2002) was used. Potential evapotranspiration was calculated by using the Priestley—Taylor equation; the default value used (1.26) was already applied in the same area for rice simulation (Confalonieri and Bocchi, in press); the aridity factor

was set to 0.030 (default). Soil water redistribution was simulated with the cascade sub-model.

Due to the relatively limited amount of available data, calibration of crop parameters was carried out without distinctions among cultivars. Far from being correct for a subsequent experimental application of CropSyst, this approach is in our opinion coherent with the purpose of deriving a set of crop parameters for scenario simulations at species level.

Data from the second and fourth experiments were used for the calibration of crop parameters, while data from the first and third were used for validation. During the first experiment, cultivar Gemini was grown; for the second, data collected for Centauro and Pandas cultivars were averaged, as in the third experiment for the cultivars Soissons and Eridano; for the fourth experiment, only data collected for the cultivar Eureka were used. We were not interested in specifically calibrating most of the crop N parameters, because an extensive work on N dilution curves for winter wheat has been already carried out by Justes et al. (1994): for this reason, we included only non-N limited treatments in the calibration data set. All experiments fulfilled this requirement; the second experiment was chosen for calibration because it is the one with the highest number of AGB measurements; experiment no. 3 was used for validation, having measurements of PNC, while no. 4 was used for calibration (no measurements of PNC available). Nitrogen simulation was activated for all the simulations, using the parameterization of nitrogen transformations set up by Confalonieri et al. (2001) on similar soils.

The calibration of crop parameters was carried out separately for each simulation module, i.e. crop phenology (thermal time, photoperiod) and crop growth (water- and radiation-dependent growth, nitrogen-dependent growth). We underline that CropSyst is not a modular simulator, but we reproduced simple model components in a spreadsheet, to calculate specific rate equations outside the model. This procedure was intended to avoid problems derived from a "black-box" calibration (carried out on the whole simulation model) where the error in one parameter value could be compensated by errors in other parameter values and, despite reasonable simulation results, the parameterization obtained could be inaccurate and unrealistic.

2.3.1. Crop development – thermal time and photoperiod modules

With two exceptions, all the parameters were calibrated on the basis of our experimental data set. Thermal time required for emergence was taken from literature, because we did not have recorded emergence dates; phenologic sensitivity to water stress was left to the default value because our data set did not include situations that allowed calibration of this parameter. $T_{\rm b}$, $T_{\rm cutoff}$, $L_{\rm if}$ and $L_{\rm ins}$ were calibrated using the Microsoft

Excel Solver (Flystra et al., 1998), such that the coefficient of variation (CV) among the GDDs required from emergence to flowering and from emergence to physiological maturity, was minimized (following Bonhomme et al., 1994).

2.3.2. Crop growth — water- and radiation-dependent growth modules

From our experience and a previous sensitivity analysis carried out with the same model (Confalonieri and Bechini, 2004), we decided, for the less important parameters, to set several of them at their default values and to take others from literature. We calibrated RUE_{PAR}, by isolating the calculation of radiationdependent biomass from the calculation of transpirationdependent biomass. To do this, because CropSyst is not a modular model, we decided to separately reproduce the two sub-models for the calculation of AGB_{iPAR} and AGB_{PT}, by calculating Eqs. (1) and (2) in a spreadsheet. These equations were used to simulate daily AGB accumulation for the period between the closed canopy stage (full radiation interception) and flowering: in this period, AGB_{iPAR} depends only on solar radiation, RUEPAR and air temperature. Because CropSyst uses the minimum of AGB_{iPAR} and AGB_{PT} as the potential daily AGB production, the periods in which AGB_{iPAR} was lower than AGBPT were selected. The Microsoft Excel Solver was then used to calibrate RUE_{PAR}, with the objective of minimizing the difference between measured and calculated AGB increments. We further improved the goodness of simulations for the whole crop growing period by calibrating $K_{\rm BT}$, SLA, $T_{\rm opt}$, leaf duration and p, within reasonable ranges drawn from the literature.

2.3.3. Crop growth — N-dependent growth module

In accordance with Eq. (9), $N_{\rm max_e}$ was calculated as $\alpha_{\rm crit}/0.8$, with $\alpha_{\rm crit} = 4.4\%$ (critical N concentration during early stages, with AGB < 1.55 t DM ha⁻¹; Justes et al., 1994). Moreover, $N_{\rm min_m}$ was set as the minimum concentration reached with AGB of 14 t DM ha⁻¹ (Justes et al., 1994). $N_{\rm max_m}$ was calibrated by using our experimental data. We further calibrated the empirical parameters "N uptake adjustment" and "N availability adjustment" to reduce the errors in the simulations of PNC.

The agreement between measured and simulated values of accumulated AGB, PNC and accumulated UPTK was expressed by using several of the indices proposed by Loague and Green (1991) and recently reviewed by Fila et al. (2003): the relative root mean square error (RRMSE, ranges from 0 to $+\infty$, optimum = 0%), the coefficient of determination (CD, ranges from 0 to $+\infty$, optimum = 1, indicates whether the model reproduces the trend of measured values or not), the modelling efficiency (EF, ranges from $-\infty$ to 1, optimum = 1, if positive, indicates that the model is

a better predictor than the average of measured values), the coefficient of residual mass (CRM, ranges from $-\infty$ to $+\infty$, optimum = 0, if positive indicates model underestimation). The parameters of the linear regression equation between measured and predicted values were also calculated with the least squares method; because these data are not independent (Donatelli et al., 2003), no conclusions were drawn about their statistical significance.

3. Results and discussion

3.1. Calibration of crop model parameters

Calibrated crop model parameters are shown in Table 3.

3.1.1. Crop development modules

With the values of -1 °C and 20 °C for $T_{\rm b}$ and $T_{\rm cutoff}$, a coefficient of variation of 6% among the GDDs to reach physiological maturity was obtained for the three data sets used for calibration. The calibrated values for $T_{\rm b}$ and $T_{\rm cutoff}$ are coherent with what reported by Porter and Gawith (1999) (optimal temperatures for development between sowing and emergence, around anthesis and during grain filling of 22.0, 21.0 and 20.7 °C, respectively; minimum temperatures of 1.9 °C for leaf growth and of -1 °C for leaf initiation) and by Slafer and Rawson (1995) (0 °C for $T_{\rm b}$ -development during early stages). In general, however, values of $T_{\rm b}$ reported in the literature (Porter and Gawith, 1999) are greater than the value calibrated in this work and highly variable for the last part of the crop cycle.

3.1.2. Crop growth — water- and radiation-dependent growth modules

The calibrated value of the optimum temperature for growth $(T_{\text{opt}} = 19 \, ^{\circ}\text{C})$ is equal to the one reported by Slafer and Rawson (1995) for wheat shoot growth. The calibrated value for RUE_{PAR} (3.1 g MJ⁻¹) is in good agreement with values reported by many authors. Kiniry et al. (1989), in a review about radiation use efficiency, report values for wheat RUEPAR ranging from 2.6 to 3.1 g MJ^{-1} , with an average value of 2.8 g MJ^{-1} . Yunusa et al. (1993) obtained a value of 2.93 g MJ^{-1} from continuous measurements during the vegetative growing period. This work was also cited by Sinclair and Muchow (1999) as an accurate measurement of potential RUE_{PAR}, because most of the other works reviewed by them are related to spot measurements or to absorbed PAR measurements: none of them can be used with the modelling approach of CropSyst. In other papers about wheat simulations with CropSyst, RUEPAR was maintained at the default value of 3 g MJ⁻¹ (Stöckle et al., 1994; Pannkuk et al., 1998) while Giardini et al.

Table 3
Crop model parameters for winter wheat: their values and source of information (C: calibrated parameters; D: CropSyst default values; L: derived from literature)

Parameter	Source	Value	Units
Thermal time accumulation			
Degree days emergence	L^a	100	°C-days
Degree days peak LAI	C	550	°C-days
Degree days begin flowering	C	564	°C-days
Degree days begin grain filling	C	715	°C-days
Degree days physiological maturity	C	1352	°C-days
Base temperature (T_b)	C	-1	$^{\circ}\mathrm{C}$
Cutoff temperature (T_{cutoff})	C	20	$^{\circ}\mathrm{C}$
Phenologic sensitivity to water stress	D	0.5	_
Photoperiod			
Photoperiod simulation	_	Activated	_
Day length photoperiod to inhibit flowering	C	10	h
Day length photoperiod for insensitivity	C	18	h
Morphology			
Specific leaf area (SLA)	C	25	$\mathrm{m^2kg^{-1}}$
Fraction of maximum LAI at physiological maturity	D	0.5	_
Maximum rooting depth	D	1.6	m
Stem/Leaf partition coefficient (p)	C	1.5	$\mathrm{m}^2\mathrm{kg}^{-1}$
Leaf duration	C	1000	°C-days
Extinction coefficient for solar radiation (k)	D	0.48	_
ET crop coefficient at full canopy	$\Gamma_{\rm p}$	1.15	_
Growth			
Photosynthetic pathway	_	C3	_
Light to above ground biomass conversion (RUE _{PAR})	C	3.1	$ m g~MJ^{-1}$
Optimum mean daily temperature for growth (T_{opt})	C	19	$^{\circ}\mathrm{C}$
Aboveground biomass-transpiration coefficient (K_{BT})	C	5.8×10^{-3}	$kPa kg kg^{-1}$
Maximum water uptake	D	10	mm day ⁻¹
Leaf water potential at the onset of stomatal closure	D	-1300	$\rm Jkg^{-1}$
Wilting leaf water potential	D	-2000	$ m Jkg^{-1}$
Actual to potential transpiration ratio that limits leaf area growth	D	0.95	_
Actual to potential transpiration ratio that limits root growth	D	0.5	_
Nitrogen-dependent growth			
Nitrogen uptake adjustment	C	0.06	_
Nitrogen availability adjustment	C	0.16	_
Maximum N concentration during early growth (N_{max_e})	L^{c}	0.055	kg N kg AGB ⁻¹
Maximum N concentration at maturity $(N_{\text{max}_{\text{m}}})$	C	0.015	kg N kg AGB ⁻¹
Minimum N concentration at maturity (N_{\min})	L^{c}	0.007	$kg N kg AGB^{-1}$

AGB = aboveground biomass.

(1998) used a value of 3.5 g MJ⁻¹. Measurements of radiation use efficiency normally derive from field experiments only rarely carried out in non-limiting temperature conditions, while the RUE_{PAR} used by CropSyst is a potential value (temperature limitation is applied separately). For this reason, the calibrated value was considered correct, although it lies at the upper limit of the range of values discussed.

The calibrated value for $K_{\rm BT}$ (5.8 × 10⁻³ kPa kg kg⁻¹, Table 3) is hardly comparable with values from literature, because the water use efficiency (WUE) is usually calculated by dividing yield by transpired (or evapotranspired) water. However, CropSyst uses the

VPD – corrected WUE (Tanner and Sinclair, 1983; Amir and Sinclair, 1991, 1996). Our selected value is that which was calibrated by Stöckle et al. (1994) and reported by Amir and Sinclair (1991, 1996).

The default extinction coefficient for solar radiation (k = 0.48) is in good agreement with the value of 0.49 ± 0.018 calculated by Abbate et al. (1997) for spring wheat and with the value of 0.45 used by Stöckle et al. (1994) for winter wheat and by Donatelli et al. (1997) for durum wheat.

The calibrated value of SLA (25 m² kg⁻¹) is consistent with the one assumed by Sinclair and Amir (1992) for a model with a fixed value of this parameter.

^a Pannkuk et al. (1998).

^b Allen et al. (1998).

^c Justes et al. (1994).

No measured data of LAI were available in our data sets; therefore, it was not possible to carry out a proper model evaluation of leaf area simulations. Nonetheless, we checked that the simulated maximum LAI never exceeded the value of $9 \text{ m}^2 \text{ m}^{-2}$, a reasonable maximum threshold for this crop (Bindraban, 1999; Olesen et al., 2002); this, together with the goodness of AGB simulations, affords confidence in the calibrated value for the empirical Stem/Leaf partition coefficient (p = 1.5).

3.1.3. Crop growth - N-dependent growth module

The coefficients of the nitrogen dilution equations used by CropSyst and by Justes et al. (1994) show small differences, and therefore the resulting curves are very similar; CropSyst's equation only slightly underestimates $N_{\rm max}$ and $N_{\rm min}$ (Fig. 1). This confirms the suitability of the value of $N_{\rm max_m}$ (5.5%). The calibrated $N_{\rm max_m}$ value (1.5%) is equal to the CropSyst default.

3.1.4. Model performance

With respect to the calibration data set, the good agreement between measured and simulated AGB and PNC is shown in Figs. 2 and 3 and in Table 4. The model was accurate in the simulation of AGB accumulation (Fig. 2b and c), with the exception of S. Angelo Lodigiano – 1989 (Fig. 2a). AGB is clearly underestimated for early growth until the beginning of June, when lodging decreased the measured AGB. The underestimation in 1989-1990 cannot be corrected by further modifying the parameters involved with AGB accumulation (e.g. by using a lower value for $T_{\rm opt}$ or a higher value for RUE_{PAR} and/or K_{BT}) because these parameters are already set to the most extreme values found in the literature. Moreover, a comparison of the results obtained (for 2 years) with a more extended weather data set for the same location (including relative humidity and wind speed data) has shown that the use of Penman—Monteith equation to estimate the reference evapotranspiration did not improve AGB simulations. This might indicate that the use of the Priestley-Taylor equation did not cause a significant underestimation of transpiration and therefore of AGB accumulation (Eq. (1)). The problem of AGB underestimation will be further discussed in the next section.

The agreement between measured and simulated UPTK (kg N ha⁻¹; Table 4) is not always satisfactory because the errors in the simulation of AGB and PNC are in general not compensating each other, yielding similar or higher errors for the simulation of UPTK.

3.2. Validation of crop model parameters

The agreement between measured and simulated values of AGB, PNC and UPTK for the validation

data set is shown in Figs. 2 and 3 and in Table 4. For AGB, the validation has confirmed the applicability of the proposed parameter set, even if there is a systematic underestimation of crop growth rates in spring (linear phase of growth, with average monthly (June) temperatures ranging from 16.2 to 18.1 °C), particularly with respect to the 1986–1987 data (Table 5). For PNC, the model has in general reproduced the trend of measured data with a reasonable approximation of the absolute values; for UPTK the simulations are in most cases acceptable, with a compensation effect in several cases (opposite errors in the simulation of AGB and PNC partially improve the simulations of UPTK).

The underestimation of crop growth rates in spring can possibly be explained by looking at the shape of the relation between average air temperature and radiationdependent biomass accumulation (Eq. (3)). CropSyst adopts a linear relationship, which determines two abrupt transitions at the lower (T_b) and upper (T_{ont}) limits; this does not accurately describe a biological phenomenon (Yin et al., 1995). Compared to a smoothed logistic function (Fig. 4), the linear relationship overestimates T_{lim} for temperatures slightly higher than T_{b} and underestimates for temperatures near T_{opt} . The over- and underestimation of T_{lim} generates over- and underestimation of the crop growth rate when potential transpiration is high (Eq. (2)). For this reason, we compared the logistic function proposed by Yan and Hunt (1999) (Eq. (11)) with the one used by CropSyst, by calculating AGB_{iPAR} in a spreadsheet.

$$T_{\text{lim}} = \left[\left(\frac{T_{\text{m}} - T_{\text{b}}}{T_{\text{opt}} - T_{\text{b}}} \right) \left(\frac{T_{\text{max}} - T_{\text{m}}}{T_{\text{max}} - T_{\text{opt}}} \right)^{\frac{T_{\text{max}} - T_{\text{opt}}}{T_{\text{opt}} - T_{\text{b}}}} \right]^{c}$$
(11)

The parameter c has been set to 1.8 in order to constrain the two functions to the same value at T=0.5 ($T_{\rm opt}+T_{\rm b}$) (Fig. 4). The comparison of the AGB_{iPAR} values calculated using the linear function for $T_{\rm lim}$ (AGB_{Lin}; Eq. (3)) and using the logistic approach (AGB_{Log}; Eq. (11)) has shown a systematic underestimation of AGB_{Lin} during the linear phase of biomass accumulation [$T_{\rm m}>0.5(T_{\rm opt}+T_{\rm b})$]. The use of a logistic instead of a linear function to relate radiation-dependent biomass accumulation and average air temperature could probably reduce the underestimation of simulated crop growth rates in this work.

Finally, although CropSyst uses a single equation of N dilution for all herbaceous crops (i.e. the b parameter used in $N_{\rm max}$, $N_{\rm crit}$ and $N_{\rm min}$ equations is not user-defined and is by default set to 0.4), it should be noted that other authors found different values for it in the $N_{\rm crit}$ curve. Bechini et al. (2001) found a value of 0.76 for Italian ryegrass, while Tei et al. (2001) found a lower value for tomato (0.327). Therefore, although the value used by CropSyst is very similar to the one proposed by

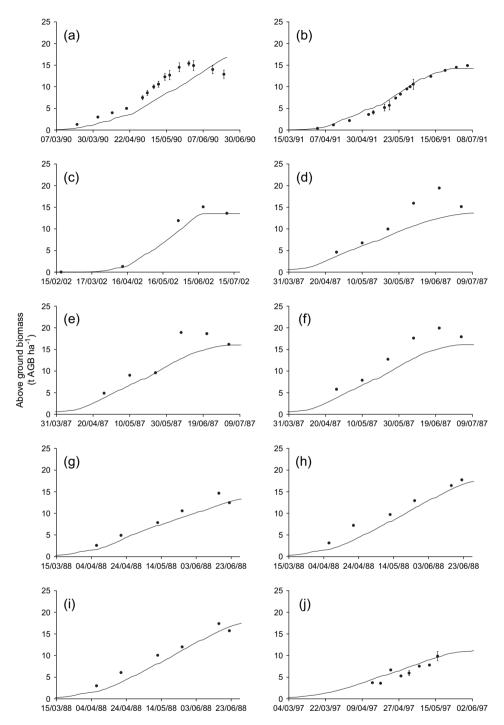


Fig. 2. Measured (points) and simulated (lines) AGB values after calibration (a, b, c) and after validation (d, e, f, g, h, i, j): (a) S. Angelo Lodigiano – 1989–1990; (b) S. Angelo Lodigiano – 1990–1991; (c) S. Angelo Lodigiano – 2001–2002; (d, e and f) S. Angelo Lodigiano – 1986–1987: (d) nitrogen fertilization: 0 kg N ha⁻¹, (e) nitrogen fertilization: 140 kg N ha⁻¹, (f) nitrogen fertilization: 210 kg N ha⁻¹; (g, h and i) S. Angelo Lodigiano – 1987–1988: (g) nitrogen fertilization: 0 kg N ha⁻¹, (h) nitrogen fertilization: 140 kg N ha⁻¹, (i) nitrogen fertilization: 210 kg N ha⁻¹; (j) Lodi – 1996–1997. The vertical bars indicate the standard deviation of measured data.

Justes et al. (1994) for wheat and to the values proposed by other authors for other crops (e.g. 0.37 for maize, Plénet and Lemaire, 1999), a possible improvement of CropSyst would be to give the user the option of changing this parameter.

3.3. Model adequacy for scenario simulations

Model performance was not always satisfactory, and therefore this crop parameter set cannot be used for applications requiring very good simulation accuracy.

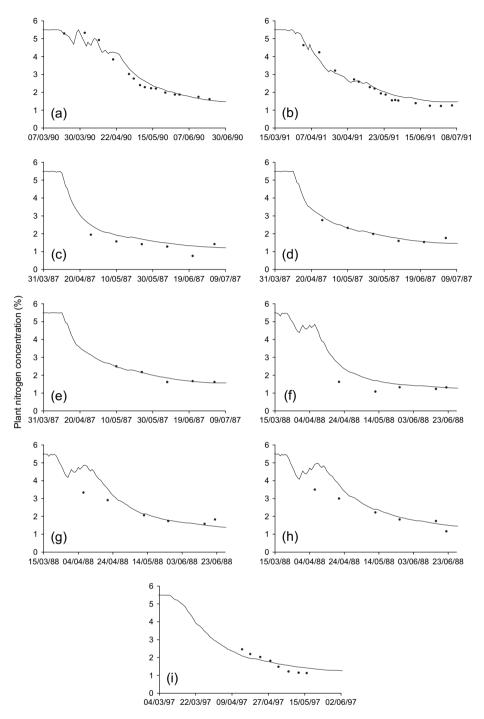


Fig. 3. Measured (points) and simulated (lines) PNC values after calibration (a, b) and after validation (c, d, e, f, g, h, i): (a) S. Angelo Lodigiano 1989–1990; (b) S. Angelo Lodigiano 1990–1991; (c, d and e) S. Angelo Lodigiano 1986–1987: (c) 0 kg N ha⁻¹, (d) 140 kg N ha⁻¹, (e) 210 kg N ha⁻¹; (f, g and h) S. Angelo Lodigiano 1987–1988: (f) 0 kg N ha⁻¹, (g) 140 kg N ha⁻¹, (h) 210 kg N ha⁻¹; (i) Lodi 1996–1997.

However, when used for comparing scenarios, the model is required to reproduce the ranking of real values and to correctly simulate simple and synthetic variables across a range of simulations. For this purpose, we evaluated the overall model performance by calculating the indices of agreement between measured and simulated values of AGB and UPTK (for the last sampling date) in order to

describe the goodness of the results when yearly or seasonal statistics are compiled with the model (biomass produced, cumulative N uptake). The results (Table 4) can be considered satisfactory. Moreover, the Spearman correlation coefficient (data not normally distributed) between measured and simulated values on a merged set of all our data (across years, locations and treatments) is

Table 4
Indices of agreement between measured and simulated values of aboveground biomass (AGB), plant N concentration (PNC), aboveground plant nitrogen uptake (UPTK), during calibration and validation

Variable	Process	Location	Sowing year	Treatment	RRMSE	EF	CRM	CD	Slope	Intercept	R^2
AGB	Calibration	S. Angelo	1989	Optimal N	30	0.57	0.21	1.26	0.92	-1.28	0.80
			1990		9	0.98	-0.06	0.89	0.93	0.97	0.99
			2001		15	0.96	0.10	0.87	0.91	-0.15	0.98
	Validation	S. Angelo	1986	$0 \text{ kg N} \text{ ha}^{-1}$	32	0.49	0.28	0.79	0.93	-0.56	0.87
				$140 \ {\rm kg} \ { m N} \ { m ha}^{-1}$	26	0.59	0.20	0.84	1.09	-2.68	0.85
				210 kg N ha^{-1}	24	0.62	0.22	1.00	1.09	-2.20	0.95
			1987	$0 \text{ kg N} \text{ ha}^{-1}$	26	0.69	0.23	0.91	0.61	1.76	0.96
				140 kg N ha^{-1}	22	0.75	0.22	1.21	0.76	0.84	0.98
				210 kg N ha^{-1}	19	0.83	0.17	1.31	0.81	-0.38	0.97
		Lodi	1996	Optimal N	17	0.69	-0.12	0.87	0.93	-0.56	0.84
PNC	Calibration	S. Angelo	1989	Optimal N	10	0.95	-0.03	0.86	0.90	0.00	0.96
		Č	1990	•	10	0.95	-0.05	0.82	0.88	0.00	0.97
	Validation	S. Angelo	1986	0 kg N ha^{-1}	27	0.17	-0.21	2.11	0.58	0.85	0.66
				140 kg N ha^{-1}	8	0.86	-0.01	1.42	0.94	0.08	0.92
				$210 \text{ kg N} \text{ ha}^{-1}$	6	0.91	-0.01	0.84	0.88	0.26	0.92
			1987	$0 \text{ kg N} \text{ ha}^{-1}$	40	-7.67	-0.28	11.63	1.97	-0.92	0.54
				140 kg N ha^{-1}	26	0.32	-0.11	3.09	1.89	-1.70	0.98
				$210 \text{ kg N} \text{ ha}^{-1}$	25	0.56	-0.17	2.25	1.53	-0.75	0.96
		Lodi	1996	Optimal N	16	0.70	-0.02	0.42	0.46	0.94	0.98
UPTK	Calibration	S. Angelo	1989	Optimal N	28	-0.29	0.25	2.14	0.92	-38.65	0.74
		-	1990	Î	8	0.95	-0.07	1.13	1.04	4.75	0.97
	Validation	S. Angelo	1986	0 kg N ha^{-1}	10	0.75	0.08	1.02	0.62	37.00	0.94
				$140 \ { m kg \ N ha^{-1}}$	20	0.52	0.17	0.84	0.69	26.91	0.90
				210 kg N ha^{-1}	13	0.79	0.09	0.69	0.79	33.08	0.94
			1987	$0 kg N ha^{-1}$	23	0.72	0.03	0.26	0.53	52.55	0.94
				140 kg N ha^{-1}	20	0.54	0.20	1.36	0.72	4.22	0.99
				210 kg N ha^{-1}	24	0.40	0.22	1.50	0.95	-35.28	0.91
		Lodi	1996	Optimal N	9	0.19	0.02	0.28	0.32	66.67	0.25
AGB		For the last sampling da	ite		7	0.73	0.03	0.75	0.74	3.51	0.79
UPTK		or caon data			20	0.48	0.13	1.06	0.77	22.88	0.71

equal to 0.94, 0.97 and 0.89 for AGB, PNC and UPTK, respectively, all highly significant (n = 71; P < 0.001). These results show that this set of crop parameters can be already used for scenario simulations in the study area

because seasonal outputs (total biomass produced at harvest, cumulative N uptake) are simulated with sufficient accuracy and because the ranking of measured and simulated values is approximately the same.

Table 5
Measured and simulated mean daily crop growth rates related to average air temperature during the linear growth phase

Figure	Dataset	Period	Mean daily crop (t AGB ha ⁻¹ day		Percent model error (%)	Average air temperature (°C)	
			Measured	Simulated			
2a	S. Angelo 1989-90	30/4-23/5	0.30	0.18	39	16.7	
2b	S. Angelo 1990-91	17/5-30/5	0.31	0.24	21	18.1	
2c	S. Angelo 2001–02	12/4-29/5	0.22	0.18	20	16.2	
2f	S. Angelo 1986–87	10/5-7/6	0.35	0.22	37	16.4	
2i	S. Angelo 1987–88	21/4-26/5	0.12	0.15	-26	17.1	
2j	Lodi 1996–97	28/4-16/5	0.26	0.17	37	17.1	

Percent model error is positive in case of underestimation, negative for overestimation.

^a AGB is aboveground biomass.

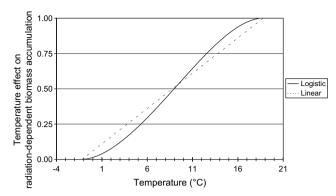


Fig. 4. Comparison of the relationship between average air temperature and the effect on radiation-dependent biomass accumulation proposed by CropSyst (linear) and by Yan and Hunt (1999) (logistic).

4. Conclusions

The cropping systems simulation model CropSyst could be satisfactorily parameterized for winter wheat by using existing experimental data collected for purposes other than modelling and the wide range of available literature. The set of crop parameters obtained allowed reasonable estimates of aboveground biomass, plant nitrogen concentration and plant nitrogen uptake at different times during spring crop growth, for various locations/years/treatments in northern Italy. The simulated values were characterized by different estimation errors (in the range 6-40%). A systematic underestimation of aboveground biomass could not be corrected without the use of unreasonable model inputs. Ranking of model results was similar to that of measured values; in particular, crop response to model inputs (radiation, temperature, N fertilizer application) was correctly simulated.

This suggests that the proposed set of crop parameters, while still sub-optimal, can be used for scenario simulations in the study area and in similar locations. Also, this work shows how the increasing need of realistic model parameters can be partly satisfied by properly combining calibration of separate simulation modules, existing data sets collected during traditional agronomic experiments and extensive literature review.

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