Journal of Agricultural Science, Page 1 of 18. © Cambridge University Press 2012 doi:10.1017/S0021859612000688

# CROPS AND SOILS RESEARCH PAPER The performance of the EU-Rotate\_N model in predicting the growth and nitrogen uptake of rotations of field vegetable crops in a Mediterranean environment

C. NENDEL<sup>1</sup>\*, A. VENEZIA<sup>2</sup>, F. PIRO<sup>2</sup>, T. REN<sup>3</sup>, R. D. LILLYWHITE<sup>4</sup> and C. R. RAHN<sup>4</sup>

<sup>1</sup> Leibniz Centre for Agricultural Landscape Research, Institute of Landscape Systems Analysis, Eberswalder Straße 84, 15374 Müncheberg, Germany

<sup>2</sup> Centro di Ricerca per l'Orticoltura, Via dei Cavalleggeri 25, Casella Postale 48, 84098 Pontecagnano, Italy

<sup>3</sup> College of Resources and Environmental Sciences, China Agricultural University, Beijing 100193,

People's Republic of China

<sup>4</sup> School of Life Sciences, University of Warwick, Wellesbourne, Warwick CV35 9EF, UK

(Received 21 March 2011; revised 27 May 2012; accepted 24 July 2012)

## SUMMARY

The EU-Rotate\_N model was developed as a tool to estimate the growth and nitrogen (N) uptake of vegetable crop rotations across a wide range of European climatic conditions and to assess the economic and environmental consequences of alternative management strategies. The model has been evaluated under field conditions in Germany and Norway and under greenhouse conditions in China. The present work evaluated the model using Italian data to evaluate its performance in a warm and dry environment. Data were collected from four 2-year field rotations, which included lettuce (*Lactuca sativa* L.), fennel (*Foeniculum vulgare* Mill.), spinach (*Spinacia oleracea* L.), broccoli (*Brassica oleracea* L. var. *italica* Plenck) and white cabbage (*B. oleracea* convar. *capitata* var. *alba* L.); each rotation used three different rates of N fertilizer (average recommended N1, assumed farmer's practice N2=N1+0·3×N1 and a zero control N0). Although the model was not calibrated prior to running the simulations, results for above-ground dry matter biomass, crop residue biomass, crop N concentration and crop N uptake were promising. However, soil mineral N predictions to 0·6 m depth were poor. The main problem with the prediction of the test variables was the poor ability to capture N mineralization in some autumn periods and an inappropriate parameterization of fennel. In conclusion, the model performed well, giving results comparable with other bio-physical process simulation models, but for more complex crop rotations. The model has the potential for application in Mediterranean environments for field vegetable production.

## INTRODUCTION

The fate of nitrogen (N) in agricultural systems has been the subject of many investigations over the years, with its contribution to environmental pollution being of major concern (Sutton *et al.* 2011). The production of field vegetables can result in large N surpluses compared with other production systems, due to the greater supply of N to vegetable crops and the large amounts of N-rich crop residues left after harvest (Agostini *et al.* 2010). Leaching is the major pathway for N loss and an important issue in countries where N input is still very high (Ramos *et al.* 2002; Cao *et al.* 2005). However, increasing concerns over the production of greenhouse gases and their effects on the climate has also focussed attention on gaseous N emissions, principally nitrous oxide (Mei *et al.* 2009). In commercial vegetable production, large amounts of N are unavoidably left in the soil after harvest, so research has focused on the improvement of N use efficiency (Zotarelli *et al.* 2009) and on the clarification of detailed N dynamics (Jackson 2000). Many strategies have been proposed to reduce N losses, including changes to cropping sequences (Dusenbury *et al.* 2008), more targeted application of fertilizer (Westerveld *et al.* 2006), precision irrigation

 $<sup>\</sup>ast$  To whom all correspondence should be addressed. Email: nendel@zalf.de



Fig. 1. Crop sequence and length in the four rotations, profiles of site air temperature at a height of 0.5 m and of soil temperature at a depth of 0.1 m and the amount of precipitation during the period.

(Halvorson *et al.* 2008), fertigation (Gallardo *et al.* 2006), the use of organic N sources (Crews & Peoples 2005) and different fertilizer types (Guertal 2009). Soil–fertilizer–plant–water interactions are very complex (Wang *et al.* 2007); therefore, simulation models for agro-ecosystems were developed to further elucidate the fate of N in vegetable production and to compare different management strategies (Cavero *et al.* 1999).

Mediterranean countries share similar growing conditions for vegetable production and farmers' approaches to the use of fertilizer N. Consequently, resulting environmental problems are also comparable (Ramos *et al.* 2002). Modelling approaches have been applied to these vegetable production systems, i.e. in Italy (Lugato *et al.* 2007; Rinaldi *et al.* 2007), Spain (de Paz & Ramos 2004), France (Lafolie *et al.* 1997; Leenhardt *et al.* 1998) and Turkey (Muhammetoglu & Yardimci 2006). Unfortunately, all these approaches use simulation models which were not designed for the specific conditions and peculiarities of vegetable production.

The EU-Rotate\_N simulation model (Rahn *et al.* 2010) was developed to predict N dynamics for vegetable crops across Europe. However, to date this dynamic, process-based model has only been tested against a number of vegetable rotations in Germany and Norway (Rahn *et al.* 2010) and greenhouse crop

rotations in China (Guo *et al.* 2010), but not in warm and dry field environments. To address this issue, the EU-Rotate\_N model was used to estimate the growth and N uptake of crops using data taken from an experiment growing a range of field vegetables in rotation in Italy.

#### MATERIALS AND METHODS

#### Experimental crop rotations

Four 2-year crop rotations were grown at the CRA-ORT experimental station at Pontecagnano, Italy (40°38'N, 14°52'E). Each crop was supplied with three N levels and grown in two different seasons (spring–summer v. autumn-winter seasons) until completion of a four crop rotation. All rotations contained lettuce (Lactuca sativa L.), fennel (Foeniculum vulgare Mill.), spinach (Spinacia oleracea L.) and broccoli (Brassica oleracea L. var. *italica* Plenck) and were irrigated on demand. After the first season, white cabbage (B. oleracea convar. capitata var. alba L.) replaced broccoli due to its disappointing performance over winter (Fig. 1). Crops were chosen to investigate combinations of alternating rooting depths and different seasonal N requirements. Climate data used for modelling were recorded by a weather station on site.

The first crops of rotations 1–3 (broccoli, fennel and lettuce) were transplanted in November 2003, after a crop of broad beans (Vicia faba L.) harvested in early summer; the land was left fallow between harvest and transplanting. White cabbage followed by sunflower (Helianthus annuus L.) had been grown the year before. The first crop of rotation 4 (spinach) was seeded at the end of the year. The second cycle started in April 2004 for lettuce, cabbage, fennel and a late spinach crop, which was delayed by the longer growing season of the preceding fennel crop and then failed partly due to a damaged sprinkler during a hot and windy period. The third cycle started in September 2004, following a 3-month summer fallow period for lettuce, fennel and white cabbage; spinach was sown in early October 2004. The fourth cycle started in March 2005 for cabbage, lettuce and fennel with spinach seeded at the beginning of April. The experiment ended in July 2005. This approach ensured that the same crops were observed twice in spring and twice in the autumnwinter season. Crop residue incorporation to a tillage depth of 0.2 m occurred within 1 week of harvesting.

Three N treatments were used: the average of official national and regional recommendations for the crop (N1), an assumed farmer's common practice rate, i.e.  $N1 + 0.3 \times N1$  (N2) and a zero rate for the control (N0). The farmer's rate for each vegetable species was defined by gathering information from agricultural magazines and agricultural consultants operating in the CRA-ORT area. A split-plot field layout was used, with rotation as the main plot and N rate in subplots of 75 m<sup>2</sup> (5 × 15 m); each treatment was replicated twice with each replicate in a separate block. The N rate for each crop was fixed and applied irrespective of the preceding crop sequence. Ammonium sulphate was used for the base N dressing and ammonium nitrate for top dressing (Table 1).

The site was located in the coastal plain south of Salerno, a major vegetable growing area; the soil was a deep and well-drained loam with mass fractions of 0.43 sand, 0.18 clay and 0.39 silt, 0.035 kg organic matter/kg soil and a C : N ratio of 10. A former citrus orchard, the site had been intensively amended with sunflower stalk mulch before being turned into permanent grassland for 2 years. After being converted into a vegetable field, broad beans were the principal crop grown on it in vegetable rotations. Irrigation was applied with a low-pressure sprinkler system.

Above-ground biomass and its N content were determined by sampling three to seven times for dry matter and two to five times for crop N during the

Table 1. Nitrogen fertilizer application rates for the different fertilizing strategies N0 (control), N1 (recommended rate) and N2 (farmer's practice N1+30%)

	N ra	ntes (kg N	N/ha)	
Crop	N0	N1	N2	Application timing
Broccoli/ cabbage	0	250	325	0·33 at transplanting, 30 and 60 days later
Fennel	0	200	260	0.33 at transplanting, 30 and 60 days later
Spinach	0	150	195	0·50 at transplanting and 30 days later
Lettuce	0	160	208	0.50 at transplanting and 30 days later

growing season with the final sample taken at harvest. A sample consisted of a number of plants varying by species and growth stage. The numbers of plants taken at harvest and transplanting stages were: 5 and 20 plants, respectively, for broccoli; 5 and 30, respectively, for cabbage; 10 and 40 for lettuce and 20 and 100 for spinach. Dry matter was determined by oven drying and subsequent weighing. Above-ground dry matter N concentration was determined using the Kjeldahl method for total N and ionic chromatography on aqueous extracts for nitrate N (ICS 1500, Dionex, Sunnyvale, CA, USA). Nitrogen uptake was calculated from dry matter and N concentration. Soil mineral N was determined twice on soil samples taken at two depths (0-0.3 and 0.3-0.6 m). The first sample was taken at planting before the application of N and the second after harvest. Samples were immediately frozen at -30 °C for storage until analysis. Soil mineral N was extracted using sodium carbonate (1.8 mmol/l) and bicarbonate (1.7 mmol/l) for nitrate and metansulphonic acid (20 mmol/l) for ammonium and analysed in solution using an ICS1500 ionic exchange chromatographer (Dionex, USA), with AS4A-SC and CS-12A columns, respectively.

#### The EU-Rotate\_N simulation model

The dynamic, process-based simulation model EU-Rotate\_N was developed as a tool to optimize N use in horticultural crop rotations across Europe (Rahn *et al.* 2010). In part, it was based on the single season N\_ABLE model (Greenwood *et al.* 1996). EU-Rotate\_N simulates crop—soil interactions in vegetable crop rotations, mainly on a process basis using daily time steps. Nitrogen movement in soil is driven by water

balance and transport. Water movement in soil follows a capacity approach, for which the water content at saturation, field capacity and wilting point define the hydraulic soil properties. Crop evapotranspiration is calculated using Penman–Monteith algorithms (Allen *et al.* 1998) and crop-specific correction factors ( $K_c$  values). In simulations, water stress reduces plant growth linearly with decreasing available soil moisture, as soon as it falls below a user-defined critical deficit. If the simulated average soil moisture in the rooting zone is below the permanent wilting point, crop growth ceases.

Crop growth follows a target yield approach, for which a maximum achievable yield needs to be provided on the basis of the user's experience. This approach is considered the most feasible, considering the vast range of different crop types and morphologies among field vegetables and the resulting difficulties in applying generic photosynthesis-driven algorithms. Marketable parts of the crops and, correspondingly, the amount of residues to remain in the field are calculated using a population approach for row crops providing a single product per plant and a regression approach for others (Nendel et al. 2009). The population approach uses crop-specific dry matter concentrations and a distribution coefficient for individual weights to calculate a fresh weight distribution of the plant population. For user-defined upper and lower boundaries of marketable produce the fresh marketable yield is calculated. Individual plants producing marketable parts outside the boundary conditions (i.e. at insufficient water or N supply or inappropriate planting space) are treated as crop residues, assuming that they would be graded out and left in or brought back to the field immediately. This approach reflects the water and N availability to individual plants at varying planting spaces. For non-row crops an empirical transfer function was used to calculate fresh marketable yield for different N supply levels (Nendel et al. 2009).

Crop residues were assigned a dynamic C : N ratio, which reflects the N supply of the crop during the growth period. Default C : N ratios and partitioning coefficients for crop residues were derived from stepwise chemical digestion experiments (Jensen *et al.* 2005).

Organic matter turnover, including N mineralization, denitrification and  $CO_2$  release were based on algorithms from the DAISY model (Hansen *et al.* 1991). The pool concept includes two pools each for fresh added organic matter, microbial biomass and soil organic matter, representing a fraction of organic matter with slow and one with rapid turnover rates. The pools are carbon (C) pools, from which N is released or immobilized during turnover processes according to increasing or decreasing C : N ratios during mass transfer between pools of fixed C : N ratios. The turnover rates are taken from DAISY standards.

Root growth is calculated by a thermal time approach and distributed spatially in a 2D soil cell grid (Pedersen et al. 2010), allowing for the simulation of spacing effects in row crops (Nendel et al. 2009). Crop and soil-specific rooting depth enables deep and shallow rooted crops, and their characteristic N exploitation from the soil, to be simulated. Nitrogen uptake is calculated as a function of crop N demand and the potential root N uptake. Crop critical N content is calculated according to Greenwood (2001), allowing for luxury N consumption in typical vegetables using a crop-specific surplus factor. The critical N curve (or luxury N curve, respectively) determines the N demand of the crop. If the N demand cannot be met due to insufficient N available in the rooted soil or due to low soil water contents that limit N transport towards the root, a reduction factor proportional to the N deficit reduces daily growth. Once growth is reduced by N or water shortage, the specified target yield at harvest can no longer be met.

Nitrogen fertilizer applications can be input directly, specifying date, amount and fertilizer type. Different N fertilizers are provided in a database, distinguished by percentages of ammonia, nitrate and carbamide content. In addition, a triggered fertilizer strategy is provided by the model (Nendel 2009). A database containing European standard prices for marketable crops and standard figures for gross margin calculation supports the economic output of the model, enabling the simultaneous evaluation of management effects on both the environment and economic returns (Nendel 2009).

Model settings and input variables

Simulations were performed for the treatments (crop rotations by N input levels) with version 1.5 of the EU-Rotate\_N model (Rahn *et al.* 2010). These followed the observed time schedules for each rotation, and the results were compared with the observations (average of replicates). The optional surface run-off calculation was turned off. Soil water content at saturation was calculated from soil texture according to Saxton *et al.* (1986), with a ceiling at 1–(bulk density)/2·65. Initial

Table 2. Soil information input into the EU-Rotate\_N model

Soil variable	Unit	0–0∙3 m	0·3–0·6 m	0·6–0·9 m*
Clay content Sand content Bulk density Soil pH value OM content Field capacity Permanent wilting point Saturation	kg/kg kg/kg kg/m <sup>3</sup> kg/kg m <sup>3</sup> /m <sup>3</sup> m <sup>3</sup> /m <sup>3</sup>	0.169 0.431 1115 7.95 0.0371 0.226 0.127	0.181 0.416 1090 8.05 0.0358 0.223 0.126	0.156 0.442 1090 8.15 0.0245 0.216 0.12
Drainage coefficient	111 /111	0.437 0.2	0·462 0·2	0·432 0·2

\* The model assumes input variables from the lowest defined soil horizon valid for the soil profile below down to 2 m depth.

conditions for soil moisture and mineral N content (as  $NO_3$ -N) were set as observed in two soil layers down to 0.6 m depth at the start of the experiment, with no further update for soil mineral N. Soil information used as input for the model is summarized in Table 2. The ratio between soil moisture deficit and the corresponding dry matter weight reduction due to water stress was set to 0.1, while defaults (0) have been used for minimum and maximum fresh weight per marketable part of the crop and variability coefficient of marketable yield. The target yields for each season were set from the maximum dry matter yields achieved in the experiments for each crop–season combination (Table 3).

## Model performance evaluation

Model performance was evaluated by comparisons between observations and model predictions for aboveground dry biomass, amount of crop residue biomass, above-ground biomass N concentration, crop N uptake and soil mineral N content. Overall evaluation by crop was based on the following summary statistics for forecast verification (Stanski *et al.* 1989), which were calculated on paired predictions and means of replicate observations. The percent bias of prediction (PBIAS) was calculated as:

PBIAS = 
$$100 \times \frac{\sum_{i=1}^{n} (P_i - O_i)}{\sum_{i=1}^{n} O_i}$$

where n is the size of the sample, P is the predicted value and O the observed value. This is the average

difference between predicted and observed as percentage of observed mean (range =  $0 : +\infty$ ), used to assess prediction bias in relation to the average magnitude of the observed. The mean absolute prediction error (MAE, Shaeffer 1980) was calculated as:

$$\mathsf{MAE} = \sum_{i=1}^{n} \frac{|P_i - O_i|}{n}$$

It is the average of absolute differences between predicted and observed (range=0 :  $+\infty$ ), employed to calculate the average magnitude of prediction errors, irrespective of their direction. Willmott's index of agreement (*d*, Willmott & Wicks 1980) was calculated as:

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

where  $\overline{O}$  is the mean of the observed values. This is a standardized measure of the degree of model prediction error and proportionality between predictions and observations with a range 0 : 1 (1 = perfect agreement; 0 = no agreement at all). It is more consistent than the linear correlation coefficient, but sensitive to extreme values, due to the squared differences. Finally, the Nash–Sutcliffe efficiency index (EF, Nash & Sutcliffe 1970) was calculated as:

$$EF = 1 - \frac{\sum_{i=1}^{n} (P_i - O_i)^2}{\sum_{i=1}^{n} (O_i - \overline{O})^2}$$

This is a normalized measure of the relative magnitude of the data variance (information) compared with the residual variance (noise), with the range  $-\infty$  to 1 (1 = perfect fit; 0 = predictions are as accurate as the mean of the observed data;  $-\infty < 0 =$  predictions worse than the mean of observed).

Model performance in relation to the experimental factors was further assessed with an analysis of variance (ANOVA) by crop species of the difference between the unique model predictions and the replicated observations for the combinations of rotation×N treatment×crop stage, according to the split-plot design of the field layout, with crop stages within N treatments within rotation within blocks, summarized as:

$$y_{ijkl} = m + block_i + rotation_{ij} + N treatment_{ijk}$$
  
+ crop stage<sub>ijkl</sub>

where i=1:2, j=1:4, k=1:3 and l=1:n, with n varying by crop and response variable. Crop stage is not relevant for crop residues. The boundary given by

Table 3. Management data for the crops in the four rotations, including sowing/transplanting dates, total amount of irrigation and number of irrigation events, target yield, N concentration in transplant, dry weight of transplant, row width and plant spacing, as used as input information for the EU-Rotate\_N model

Rotation and crop	Sowing/Transplant date	Harvest date	Irrigation amount mm	No. irrigation events	Dry matter target yield t/ha	Sown/ Transplanted	N in transplants g/100 g	Dry weight at transplanting kg/ha	Row width m	Spacing m
Rotation 1										
Broccoli	14 November 2003	29 March 2004	18.0	1	3.9	Transplanted	4.1	50.0	0.60	0.40
Lettuce	09 April 2004	9 June 2004	34.7	5	1.9	Transplanted	2.3	17.0	0.30	0.40
Fennel	17 September 04	8 February 2005	70.6	8	5.0	Transplanted	2.1	7.0	0.60	0.20
Spinach	08 April 2005	1 June 2005	57.0		3.5	Sown	-	_	0.30	0.05
Rotation 2										
Lettuce	17 November 2003	5 April 2004	18.0	1	2.0	Transplanted	5.4	4.0	0.30	0.40
Cabbage	09 April 2004	23 June 2004	15.6	3	9.5	Transplanted	1.7	50.0	0.60	0.40
Spinach	04 October 2004	2 February 2005	105.1	12	2.0	Sown	_	_	0.30	0.05
Fennel	17 March 2005	05 July 2005	129.2	15	7.8	Transplanted	1.4	8.0	0.60	0.20
Rotation 3						Transplanted				
Fennel	14 November 2003	24 May 2004	22.1	2	8.9	Transplanted	2.1	8.7	0.60	0.20
Spinach	01 July 2004	11 August 2004	204.6	24	2.8	Sown	_	_	0.30	0.05
Cabbage	15 September 2004	14 December 2004	40.6	6	4.9	Transplanted	1.9	19.9	0.60	0.40
Lettuce	16 March 2005	26 May 2005	57.1	9	3.3	Transplanted	1.0	8.7	0.30	0.40
Rotation 4										
Spinach	18 November 2003	24 March 2004	4.5	1	2.0	Sown	_	_	0.30	0.05
Fennel	31 March 2004	5 July 2004	36.8	7	5.9	Transplanted	2.2	10.0	0.60	0.20
Lettuce	15 September 2004	6 December 2004	68.5	7	2.0	Transplanted	1.7	13.0	0.30	0.40
Cabbage	15/ March 2005	21 June 2005	135.8	16	9.6	Transplanted	2.0	50.0	0.60	0.40

the 95% confidence interval of the difference relative to zero was considered for assessing model adequacy at each experimental condition, with intervals including zero, showing a prediction error not larger than the experimental error of the mean estimates. The ANOVA also allows an assessment of the respective impact of the experimental factors on the adequacy of predictions. Data analyses were performed with the *R* software environment (R Development Core Team 2011), using functions of the contributed packages *hydroGOF* (Zambrano-Bigiarini 2010) for computing the summary statistics and *ggplot2* (Wickham 2009) for graphical displays.

### RESULTS

## Above-ground biomass

Dry matter yield varied by crop species between averages of 1.6 t/ha for spinach and 6.4 t/ha for white cabbage and was considerably higher for springsummer crops, 4.1 t/ha on average v. 3.2 t/ha for autumn-winter crops, with seasonal differences for crops of the same species largest for cabbage (Table 4). Dry matter generally increased for most crops, as expected, with N treatments N1 and N2 compared with N0, with little or no increase between N1 and N2, given the relatively minor difference between the respective input levels (Table 4). White cabbage in the first rotation, fennel in the fourth and lettuce in the first and fourth showed little benefit from N input, but only the autumn-winter fennel in the first rotation and the spring-summer spinach in the third did not show a positive response to N input, because of partial failure. The average increase across rotation of above-ground dry matter for the higher N input was 32% for lettuce, 28% for fennel, 22% for spinach and 78% for white cabbage, while a 130% increase was observed for the single crop of broccoli. The average increase by rotation across crops was 40% for the cold season (autumn-winter) and 51% for the warm season (spring-summer).

In terms of the summary measures, model predictions of biomass growth and yield were better for white cabbage, lettuce and broccoli, with little overall bias (MAE=0.15-0.34 t/ha) and high correlation indices (d=0.97-0.99; EF=0.88-0.96) (Table 5). Predictions of fennel dry matter were only slightly less accurate, while those for spinach were positively biased.

The prediction bias for the dry matter yield of broccoli is within the confidence band at the initial stages for all N treatments and at the final stage for N1 and N2, because of the large coefficient of variation for this crop, yet an intermediate stage for N1 and N2 and the final stage for N0 are over-predicted (Fig. 2). The ANOVA for white cabbage gives an assessment of the goodness of fit that is rather less optimistic than the summary statistics, due to the relatively low coefficient of variation compared with the other crop species, showing substantial under-prediction for N0 in the advanced crop stages in rotations 1 and 2 and for N1 and N2 in the pre-final stages in rotation 3. Predictions for fennel dry matter show a similar pattern in the first three rotations, with some intermediate or late stages biased upward for N1 and N2 and downward for N0; for the last crop fewer points were observed and the model under-predicts N0 more than N1 and N2. Lettuce dry matter is predicted fairly well for N1 and N2 in all rotations and for N0 in the first two rotations; only the later stages of N0 are under-predicted in rotations 3 and 4. Predictions of spinach dry matter are good for the autumn-winter crops (rotations 2 and 4), but tend to diverge with crop stage for the springsummer crops, to upward bias for N1 and N2 and downward bias for N0.

#### Crop residues

Crop residues were higher for broccoli and fennel, both in absolute terms and relative to above-ground biomass (70 and 50%, respectively) and lower for spinach and lettuce (30 and 20%, respectively), high in absolute and low in relative terms (20%) for cabbage and tended to increase with increasing N input (Table 4). Average increase by crop species ranged from 24% for fennel to 116% for broccoli, but some crops of each species apart from broccoli showed little increase (cabbage in rotation 3, lettuce in rotation 1 and fennel in rotations 1 and 4) or decrease (lettuce in rotation 4 and spinach in rotation 3). Averaged by rotation and season across crops, residues increased with the higher N input (N2) by 42% for both autumn– winter and spring–summer crops.

Summary statistics show better prediction of fennel and broccoli residues, with slight negative bias for the first and positive bias for the second (Table 5). The correlation indices for cabbage, lettuce and spinach, particularly the EF coefficient, point to a poor overall fit, though the average bias is large and positive, only for cabbage.

The error of prediction varies with the N treatment more for the fennel crops, where it tends to shift from

Rotation, season and crop			e-ground d	(t/ha)		Residue dry matter (t/ha)								
		N0		N1		N2		1	N0		N1		N2	
	0	P-O	0	P-O	0	P-O	S.E.D.	0	P-O	0	P-O	0	P-O	S.E.D.
Broccoli														
1-AW	1.6	1.0	3.6	0.0	3.8	-0.1	0.24	1.15	0.8	2.4	0.3	2.5	0.4	0.19
White cabbage														
2-SS	4.4	-1.7	8.9	-0.3	9.1	-0.2		0.8	-0.1	1.5	0.7	1.7	0.5	
3-AW	4.4	-1.6	4.4	0.1	4.7	0.0		0.8	0.0	0.8	0.3	0.8	0.4	
4-SS	3.8	0.7	9.5	-0.2	8.8	0.6		0.7	0.5	1.4	0.9	1.4	1.0	
Mean	4.2	-0.8	7.6	-0.1	7.5	0.1	0.25 (0.14)	0.8	0.1	1.2	0.6	1.3	0.6	0.10 (0.06)
Lettuce														
1-AW	1.5	-0.2	1.8	0.2	1.6	0.3		0.5	-0.1	0.5	-0.1	0.5	0.2	
2-SS	1.2	0.2	1.6	0.4	1.9	0.1		0.2	0.2	0.3	0.0	0.3	0.0	
3-AW	1.6	-1.0	2.9	0.1	2.6	0.5		0.3	0.1	0.6	-0.2	0.6	-0.2	
4-SS	1.6	-0.8	1.8	0.0	1.8	0.1		0.5	0.1	0.5	-0.2	0.4	-0.1	
Mean	1.5	-0.5	2.0	0.2	2.0	0.3	0.09 (0.04)	0.4	0.1	0.5	-0.1	0.5	0.0	0.03 (0.02)
Fennel														
1-SS	4.9	-1.5	4.9	0.1	4.9	0.1		2.6	-0.8	2.8	-0.2	2.9	-0.3	
2-AW	3.9	-1.0	7.5	0.1	6.8	0.9		1.7	-0.2	3.8	0.2	3.2	0.8	
3-SS	4.9	-0.8	6.2	1.8	6.9	1.6		2.9	-0.7	3.8	0.3	4.1	0.4	
4-AW	4.8	-3.4	4.9	0.7	5.1	0.6		2.3	-1.6	2.2	0.7	2.5	0.5	
Mean	4.6	-1.7	5.9	0.7	5.9	0.8	0.43 (0.22)	2.4	-0.8	3.2	0.2	3.2	0.3	0.24 (0.12)
Spinach														
1-SS	1.8	-0.5	2.3	1.3	2.7	0.9		0.6	-0.2	0.7	0.2	0.9	-0.1	
2-AW	1.1	-0.2	1.6	0.4	1.6	0.4		0.4	-0.1	0.5	0.0	0.5	0.0	
3-SS	1.8	-1.2	1.1	1.3	1.2	1.4		0.5	-0.3	0.4	0.2	0.4	0.3	
4-AW	1.1	0.3	1.6	0.1	1.6	0.1		0.2	0.2	0.4	0.0	0.3	0.0	
Mean	1.5	-0.4	1.6	0.8	1.8	0.7	0.19 (0.09)	0.4	-0.1	0.5	0.1	0.6	0.0	0.08 (0.04)

Table 4. Means of observed (O) and model-predicted minus observed (P–O) values for above-ground and crop residue biomass for five crops at three N input treatments (N, none; N1, recommended rate and N2, farmer's practice rate) in four rotations

AW, autumn–winter; SS, spring–summer; s.E.D., standard error of difference among means for N treatment × rotation; in parenthesis, for N treatment.

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Variable and crop	ME (mod-obs)	PBIAS	MAE	Willmott's d	EF
Above-ground dry matter (t/ha)					
Broccoli	0.31	34.7	0.32	0.97	0.87
White cabbage	-0.58	-11.5	0.34	0.99	0.96
Fennel	0.16	8.3	0.61	0.96	0.82
Lettuce	-0.06	-8.3	0.15	0.97	0.88
Spinach	0.17	21.9	0.38	0.87	0.36
Crop residues dry matter (t/ha)					
Broccoli	0.49	24.6	0.49	0.77	0.22
White cabbage	0.45	41.1	0.49	0.73	- 1.39
Fennel	-0.09	-2.9	0.55	0.85	0.05
Lettuce	-0.03	-8	0.13	0.48	-0.6
Spinach	0.01	1.6	0.14	0.75	-0.02
Biomass N concentration (%)					
Broccoli	0.76	19.5	0.80	0.45	-2.23
White cabbage	0.30	9.5	0.53	0.92	0.71
Fennel	0.78	25.6	0.96	0.74	-0.30
Lettuce	0.65	19.3	1.05	0.74	-0.27
Spinach	-0.34	-7.3	0.66	0.59	-0.58
N uptake by crops (kg/ha)					
Broccoli	19.63	55	20.18	0.93	0.72
White cabbage	0.03	0	16.93	0.97	0.89
Fennel	18.05	32.9	24.81	0.93	0.64
Lettuce	2.41	10.6	9.35	0.93	0.67
Spinach	2.34	6.6	11.76	0.92	0.71
Soil mineral N content (kg/ha)					
Broccoli	-17.8	-14.7	34.93	0.8	0.36
White cabbage	-80.2	-63.2	87.86	0.45	-0.13
Fennel	-49.6	-44.6	53.51	0.83	0.54
Lettuce	-76.9	-52.3	83.24	0.64	-0.02
Spinach	-83.5	-62.7	88.42	0.5	-0.38

Table 5. Summary statistics of goodness-of-fit of EU-Rotate\_N predictions for above-ground biomass, crop residues, biomass N concentration, N uptake by crops and soil mineral N (as  $NO_3$ -N) within the top 0.6 m soil for four biannual rotations of four vegetable crops at three N input treatments in South Italy

negative to positive between N0 and N1, though mostly remaining within the confidence interval, and for the cabbage crops, where the tendency is similar, but residues for rotations 2 and 4 are over-predicted (Table 4 and Fig. 3). The ANOVA of prediction error, although confirming poor predictions for cabbage residues, shows a better agreement than the summary indices for spinach and lettuce, even if the coefficient of variation of residues for these crops were smaller (less tolerant of deviations) compared with those for broccoli and fennel, which score higher correlation indices.

#### Crop N concentration

Average N concentration in plants, on a dry weight basis, varied among crop species from 3% for fennel

and cabbage, 3·4% for lettuce, 3·9% for broccoli and 4·7% for spinach and was slightly higher for spring– summer crops (3·7%) compared with autumn–winter crops (3·5%), as shown in Table 6. Positive N inputs generally increased N concentration, on average by between 9% for spinach and 32% for fennel, but with considerable variation among individual crops: the largest increase (96%) was recorded for the autumn– winter crop of fennel in rotation 2; the lowest (6%) for the spring–summer crop of spinach of rotation 3.

Summary statistics for crop N show a reasonably good fit of model predictions for white cabbage, with a moderate positive bias (10%), over-prediction for broccoli, lettuce and fennel and under-prediction for spinach (Table 5). Cabbage N is over-predicted for the spring–summer crop in rotation 4 and under-predicted for the early stages of N0 in rotation 1 (Fig. 4).



**Fig. 2.** EU-Rotate\_N prediction error for above-ground dry matter biomass by crop stage, nitrogen treatments (N0, unfertilized control; N1, average recommended rate and N2, assumed average farmer's practice), rotations (R1 to R4) and seasons (AW, autumn–winter and SS, spring–summer). The confidence interval of the difference is shifted as a grey-coloured band around zero.



**Fig. 3.** EU-Rotate\_N prediction error for dry matter of crop residues by nitrogen treatment (N0, unfertilized control; N1, average recommended rate and N2, assumed average farmer's practice), rotations (R1 to R4) and seasons (AW, autumn–winter and SS, spring–summer). The confidence interval of the difference is shifted as a grey-coloured band around zero.

	Bior	nass N o	conce	ntration	(%)			Crop N uptake (kg/ha)						
		N0		N1		N2		٢	٧٥	٢	N1	١	12	
and crop	0	P-O	0	P-O	0	P-O	S.E.D.	0	P-O	0	P-O	0	P-O	S.E.D.
Broccoli														
1-AW	3.4	1.1	4.1	0.6	4.2	0.6	0.06	43	72	150	3	160	-3	12.2
White cabbage														
2-SS	2.4	-0.3	3.0	0.4	3.2	0.2		74	-18	208	42	228	27	
3-AW	3.5	0.0	4.0	-0.1	4.1	-0.1		131	-45	164	- 8	171	-10	
4-SS	2.2	0.7	2.7	0.9	2.9	0.8		61	23	188	74	204	62	
Mean	2.7	0.2	3.2	0.4	3.4	0.3	0.09 (0.05)	88	- 13	186	36	201	26	6.7 (3.9)
Lettuce														
1-AW	3.3	-0.7	3.5	-0.8	3.6	-0.8		50	-17	71	-24	66	-19	
2-SS	3.7	1.1	4.1	0.9	4.3	0.8		31	27	55	29	67	19	
3-AW	2.5	-0.2	3.1	1.2	3.0	1.3		41	-21	82	36	80	41	
4-SS	3.0	1.0	3.2	1.1	3.3	1.1		45	-8	55	25	57	25	
Mean	3.1	0.3	3.5	0.6	3.5	0.6	0.08 (0.04)	42	-5	66	17	68	16	4.7 (2.4)
Fennel														
1-SS	3.5	0.1	3.8	0.3	3.9	0.3		131	-13	144	32	162	14	
2-AW	1.5	1.4	2.7	1.2	3.0	1.0		41	18	160	59	165	67	
3-SS	2.9	0.6	3.3	1.0	3.5	1.0		85	0	146	33	171	42	
4-AW	2.3	0.3	3.0	1.1	3.1	1.0		84	-46	128	62	144	47	
Mean	2.6	0.6	3.2	0.9	3.4	0.8	0.06 (0.03)	85	- 10	145	46	160	43	10.2 (5.1)
Spinach														
1-SS	4.4	-0.9	4.9	-0.6	5.0	-0.8		52	-15	92	13	112	-7	
2-AW	4.4	0.3	4.9	-0.5	4.8	-0.4		36	- 8	67	-3	71	-6	
3-SS	4.7	-1.0	5.1	-1.1	5.0	-1.1		108	-26	74	6	67	23	
4-AW	4.0	0.7	4.3	0.3	4.4	0.2		40	19	63	4	71	-3	
Mean	4.4	-0.2	4.8	-0.5	4.8	-0.5	0.17 (0.08)	59	-7	74	5	80	2	5.6 (2.8)

Table 6. Means of observed (O) and model-predicted minus observed (P - O) values for N concentration in above-ground biomass and crop N uptake for five crops at three N input treatments (N0, none; N1, recommended rate and N2, farmer's practice rate) in four rotations.

AW, autumn–winter; SS, spring–summer; s.E.D., standard error of difference among means for N treatment × rotation; in parenthesis, for N treatment.

Predictions of fennel N are rather good for the autumnwinter crop in rotation 1, but biased upward in the other rotations, except for a good agreement in the final stage of the autumn-winter crop in rotation 3 and a downward bias for N0 in rotation 4. Predictions for lettuce N are mostly positively biased, except for early crop stages, the spring-summer crop of rotation 1 and the N0 treatment of rotation 3. Spinach N is predicted quite well for the autumn-winter crop of rotation 4 and not too badly for the corresponding crop of rotation 2, but under-predicted for spring-summer crops, in rotation 3 more than in rotation 1.

#### Crop N uptake

Nitrogen uptake by crops was substantially higher for broccoli, cabbage and fennel than for spinach and lettuce. With no N input, average uptake by crop species varied from 42 kg/ha for lettuce to 88 kg/ha for cabbage (Table 6). Uptake was higher in spring–summer compared with autumn–winter crops for lettuce, spinach and rotations 1 and 2 of cabbage, but lower for fennel. Except for the spring–summer crop of spinach in rotation 3, which did not succeed very well and showed decreasing N uptake with N fertilization, positive N input resulted in large increase in N uptake, ranging from 24% for the fennel crop in rotation 2. The N input increase between N1 and N2 resulted in a moderate increase of N uptake for most crops, between 3 and 22%.

Nitrogen uptake values were derived from aboveground dry matter and crop N concentration values and model predictions for this trait show an accuracy



**Fig. 4.** EU-Rotate\_N prediction error for biomass N concentration by crop-stage, nitrogen treatment (N0, unfertilized control; N1, average recommended rate and N2, assumed average farmer's practice), rotations (R1 to R4) and seasons (AW, autumn–winter and SS, spring–summer). The confidence interval of the difference is shifted as a grey-coloured band around zero.

intermediate between those for the component traits, with good proportionality between predictions and observation (*d* in the range 0.92-0.97) and average efficiency of prediction (EF in the range 0.64-0.89), but positive bias for broccoli, fennel, lettuce and spinach (Table 5). Overall, white cabbage shows the best summary statistics for this trait, followed by lettuce and spinach.

The error of prediction shows different trends in relation to crop stages among N input treatments and rotations, with a tendency to over-prediction for positive N fertilizer inputs in many crops (Fig. 5). Nitrogen uptake at the later stages of the spring-summer crops of cabbage (rotations 2 and 4) is over-predicted, particularly for N1 and N2 treatments, while there is a tendency to under-predict for the same stages in the autumn–winter crop of rotation 3. Prediction of N uptake of broccoli is positively

biased at an advanced stage for all N input treatments, but only for N0 at the final stage. Fennel N uptake is predicted fairly well for the N0 treatment but overpredicted for N1 and N2 in later crop stages in the first three rotations, while in the fourth for these treatments there is under-prediction at the advanced intermediate stage and over-prediction at the last, where the prediction for N0 is biased downward. For lettuce predictions are better in rotations 1 and 2, though not in the final crop stage; in rotation 1 the bias increases with crop stage and is negative for all N treatments; the same tendency is showed by the crop of rotation 4, but the bias is negative for NO and positive for N1 and N2. Apart from the springsummer crop of rotation 3, where N uptake of spinach is under-predicted for N0, there are few significant points of bad prediction for this trait in the other spinach crops.



**Fig. 5.** EU-Rotate\_N prediction error for crop N uptake by crop-stage, nitrogen treatment (N0, unfertilized control; N1, average recommended rate and N2, assumed average farmer's practice), rotations (R1 to R4) and seasons (AW, autumn-winter and SS, spring-summer). The confidence interval of the difference is shifted as a grey-coloured band around zero.

#### Soil mineral N

Soil mineral N content in the 0-0.6 m layer, determined before planting and application of fertilizer and at harvest time, was obviously influenced by the N fertilizer inputs as the rotation progressed: relative to the level for N0, the available soil N at crop start increased on average by 32% with N1 and by 50% with N2, while the reduction on the pre-cropping level due to cultivation averaged 58, 30 and 23% for N0, N1 and N2, respectively (Table 7). High amounts of soil mineral N were available at the start of the autumnwinter crops of the third cycle: fennel in rotation 1, spinach in rotation 2, cabbage in rotation 3 and lettuce in rotation 4, in proportion to the N input treatment. At harvest, however, the levels of soil N for these crops were not much different from those found in other cycles. For the spring-summer crops of lettuce in rotations 1 and 3 and of spinach in rotation 3 the

end-crop level of soil N was considerably above the start level with the N1 and N2 input treatments. Such unbalances may have been due to enhanced mineralization.

Goodness-of-fit statistics show that the model underpredicted soil N for all crop species and particularly for spinach, cabbage and lettuce, but proportional agreement, as measured by Willmott's *d* and EF, were not so bad for fennel and broccoli (Table 5). The ANOVA of prediction error shows that the inadequacies of predictions for cabbage and fennel were determined only by the very high soil N level at the start of these autumn–winter crops (rotations 3 and 1, respectively), the agreement for the other rotations being quite good (Fig. 6). Predictions for lettuce were affected by the same downward bias of high soil N levels at the start of rotation 4, while it is the end-crop stage to be underpredicted for the spring–summer crop of rotation 3. The problem was similar for spinach in rotations 2

		Ν	10			Ν	11			Ν			
<b>D</b> ( ) ( )	S	Start		End		Start		End		itart	End		
Rotation, season and crop	0	P-O	0	PO	0	PO	0	P-O	0	P-O	0	PO	S.E.D.
Broccoli													
1-AW	153	-25	44	- 36	153	-25	101	-9	153	-25	117	14	43.5
White cabbage													
2-SS	46	-27	29	-20	56	2	50	3	74	0	93	21	
3-AW	225	-189	47	- 38	489	-426	130	-60	545	-456	208	-106	
4-SS	42	- 30	56	-47	44	-30	55	-34	42	-26	54	20	
Mean	104	-82	44	- 35	196	- 152	78	-30	220	- 161	118	-21	18·9 (10·9)
Lettuce													
1-AW	44	-36	94	- 59	101	-10	277	- 74	117	13	399	-139	
2-SS	122	- 30	46	-33	122	-30	56	- 5	122	- 30	74	-6	
3-AW	49	-46	56	-24	57	-55	271	-213	65	-62	356	-264	
4-SS	190	-169	58	-40	280	-217	97	-38	348	-232	126	-49	
Mean	101	-70	63	- 39	140	-78	175	-82	163	-78	239	-114	41.9 (20.9)
Fennel													
1-SS	284	-207	38	- 31	375	-134	47	-34	562	-266	61	-46	
2-AW	44	- 38	25	- 15	52	-48	37	-23	51	-47	57	-9	
3-SS	127	1	52	-45	127	1	72	-65	127	1	72	-65	
4-AW	54	-43	53	-42	61	7	111	-58	64	27	116	-11	
Mean	127	-72	42	- 33	154	-44	67	-45	201	-71	76	-33	23.5 (11.7)
Spinach													
1-SS	120	-113	41	-25	148	-139	93	-24	134	-124	116	-14	
2-AW	196	-165	26	-13	303	-222	45	-18	380	-237	41	-8	
3-SS	52	-45	127	-100	72	-65	346	-291	72	-64	378	-296	
4-AW	108	-11	54	-43	108	-11	61	8	108	-11	64	28	
Mean	119	-83	62	- 46	158	- 109	136	-81	173	- 109	150	- 73	21.3 (10.7)

Table 7. Means of observed (O) and model-predicted minus observed (P–O) for soil mineral N content in the top 0.6 m by crops at the start and end of the cropping cycle for five crops at three N input treatments (N0, none; N1, recommended rate and N2, farmer's practice rate) in four rotations

AW, autumn–winter; SS, spring–summer; s.E.D., standard error of difference among means for N treatment×rotation; in parenthesis, for N treatment.

and 3, respectively; in addition, the start-crop levels were under-predicted also for the second spring–summer crop in rotation 1, while predictions were rather good for the first autumn–winter crop in rotation 4.

## DISCUSSION

## General model performance

The overall pattern of simulation results obtained using the EU-Rotate\_N model under Mediterranean conditions are comparable to those achieved with other, well-established simulation models in international model comparisons (Kersebaum *et al.* 2007; Palosuo *et al.* 2011), in that crop variables were simulated with higher accuracy than the soil variables. Above-ground dry matter biomass predictions were almost unbiased and deviated little from the observed values, as did the simulations of crop residue biomass. Predictions of the N concentration in the above-ground biomass and, correspondingly, the total N uptake during the growth season were slightly over-predicted, for the latter to a greater extent at later crop stages of some crops. However, the model did reflect very well both the low initial N concentrations of the transplant, which were raised at low N supply for better root development in the juvenile phase, and the high N concentrations at later stages, which express luxury consumption of N above the critical concentration for the respective growth stage. Soil mineral N content was underpredicted substantially for six observations, otherwise it was modelled satisfactorily. Four of the observations occurred in late summer 2004, at the start of autumn



Fig. 6. EU-Rotate\_N prediction error for N content (as NO<sub>3</sub>-N) in the top 0.6 m soil layer by crop-stage, nitrogen treatment (N0, unfertilized control; N1, average recommended rate and N2, assumed average farmer's practice), rotations (R1 to R4) and seasons (AW, autumn-winter and SS, spring-summer). The confidence interval of the difference is shifted as a greycoloured band around zero.

N2 N treatment

N0

N1

N2

N0

N1

N2

crops (fennel in the first rotation, spinach in the second, white cabbage in the third and lettuce in the fourth) and followed a warm and dry period of about 2 months, which may have considerably enhanced mineralization from organic N sources above the rate considered in the model for the reference climate (Fig. 1). Moreover, the short-lived spinach crops could have left unused soil N, which contributed to the large amount measured at the start of the following crops.

N0

N1

N2

N0

N1

The other two observations were the harvest of late spring crops (spinach in the first rotation and lettuce in the third). Both species prefer a colder environment and are less suitable for late spring, where the cropping cycle tend to be shortened; in addition, the weather at the end of these crop cycles was already favourable for high N mineralization rates; so it is possible that less nitrogen uptake and higher mineralization contributed to a build-up of excess soil mineral N.

Taking account of this, the results obtained with EU-Rotate\_N are well in the range of those obtained with other simulation models for arable crops (Kersebaum et al. 2007), with the additional difficulty of being recalibrated neither for the simulated site nor for the simulated crops (Palosuo et al. 2011; Rötter et al. 2012). Furthermore, the results obtained under Mediterranean conditions were of a similar quality to those obtained under Central and Northern European conditions (Rahn et al. 2010).

#### Specific problems with the modelled system

The most obvious problem with the simulation of the Italian crop rotations was the fact that the model did not predict the high levels of soil mineral N for the six observations during the late summer of 2004 discussed above. The site history included vegetable crops with

frequent catch crops of sunflower or broad beans for several years after conversion from a citrus orchard and this management could have contributed to the large amount of soil organic matter (0.035 kg/kg). The organic carbon content of the arable soil layer in the site area (Sele Plain) has been found to vary by soil district (24 districts) from 0.007 to 0.050 kg/kg, with an interguartile range of 0.009-0.016 and a median of 0.012 kg/kg (observed in the region of Campania in 2002), so the experimental soil is unusually rich in organic carbon. However, the soil itself, which at the start of the experiment showed a C : N ratio of 10, cannot explain the high rates of N release observed, if common rate coefficients and temperature-moisture impact relations obtained from laboratory incubations are assumed (Sierra 1997; Crohn & Valenzuela-Solano 2003). Nevertheless, increase of soil mineral N of more than  $10 \text{ g N/m}^2$  within 3 months from late summer to early August 2004 were observed consistently in the control treatments and, correspondingly, increase of up to 30 g N/m<sup>2</sup> were observed in the respective fertilized treatments. The latter values cannot be explained either with the model or with current knowledge on organic matter decomposition. However, they are mainly responsible for the poor simulation result of this variable. Further work needs to be done to allow EU-Rotate\_N to take account of these extreme conditions but in the meantime simulations can be adjusted by updating simulations with measured values where these errors are likely or the model can be pre-calibrated by adjusting the N turnover parameters.

In conclusion, the ability of the EU-Rotate\_N model to simulate crops grown under Mediterranean conditions was broadly comparable with simulations obtained using Northern European data. In general, crop growth and N uptake patterns were well predicted; non-marketable yields less well. Soil N mineralization may not be well simulated in this particular instance, affecting the accuracy of prediction of soil mineral N. However, soil mineral N values can be updated with measured values in the model on a seasonal basis to overcome this problem. Vegetable production systems, with their higher turnover of organic matter and higher use of fertilizer N, pose considerable problems to crop modellers. In the light of not being calibrated prior to this exercise, the simulations results show the potential of the EU-Rotate\_N model for use in vegetable rotations under warm and dry conditions of a Mediterranean climate.

The authors acknowledge funding from the EU Quality of Life Programme which supported the development of the EU-Rotate\_N simulation model within the project QLK5-2002-01100 co-ordinated by C. Rahn at Warwick University. C. Nendel was additionally funded by ZALF budget funds.

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