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# **Soil Water and Nitrogen Fluxes in Response to Climate Change in a Wheat–Maize Double Cropping System**

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**Abstract:** The impact of soil nutrient depletion on crop production is a thoroughly researched issue; however, robust assessments on the impact of climate change on water and N fluxes in agroecosystem are lacking. The complexity of soil water and N fluxes in response to climate change under agroecosystems makes simulation-based approaches to this issue appealing. This study evaluated the responses of crop yield, soil water, and N fluxes of a wheat–maize rotation to two Representative Concentration Pathways climate scenarios (RCP4.5 and RCP8.5) at Tai'an, a representative site on the North China Plain (NCP). Results showed that the mean air temperature and accumulated precipitation for both winter wheat (*Triticum aestivum* L.) and summer maize (*Zea mays* L.) growing seasons changed in both magnitude and pattern under various climate scenarios. The temperature increases shortened the growth periods of these two crops by more than 13 days and decrease summer maize yields  $(P < 0.05)$ . These results are illustrated by lower yield results associated with RCP4.5 (20.5%) and RCP8.5 (19.3%) climate scenarios, respectively. During the winter wheat growing season, water drainage examined in the climate scenarios was significantly higher (more than double) than the baseline, and there was no significant change to nitrate leaching and denitrification. In the summer maize growing season, with continuously rising temperatures, the ranking for evaporation was in the order baseline < RCP4.5 < RCP8.5, however, the opposite ranking applied for transpiration and evapotranspiration. The increase in water drainage was 1.4 times higher than the baseline, whereas the nitrate leaching in soil significantly decreased. Our simulation results provide an opportunity to improve the understanding of soil water and N fluxes in agroecosystems, which can lead to deficient or excess N under future climate conditions.

**Keywords:** soil water and nitrogen fluxes; climate change; wheat–maize cropping system; crop modeling

# **1. Introduction**

Nitrogen (N) fertilizer plays an important role in improving crop yield and quality in agricultural production. Among various forms of added N, the leaching of nitrate is considered to be one of the main pathways of N loss in agroecosystem [\[1\]](#page-10-0). Globally, vast amount of nitrates leach from agricultural fields to ecosystems, primarily associated with fertilizer application, which causes substantial and wide-ranging impacts including declines in water quality and increases in N loss [\[2–](#page-10-1)[4\]](#page-10-2). A major cause of this is poor nutrient and water management technologies in agroecosystem [\[2\]](#page-10-1).



The potential for soil water drainage and N loss is a function of weather conditions, soil types, and crop management systems [\[5–](#page-10-3)[7\]](#page-10-4). Among these influential factors, it is axiomatic that alterations in climate patterns will influence agroecosystems in terms of crop life cycles, soil water balance, and the efficiency of crop N uptake and use. Studies have shown that nitrate leaching is related to the intensity, duration, and interval of precipitation, as well as the crop's growth stage at the time of precipitation [\[8](#page-10-5)[,9\]](#page-10-6). Changes in climate with increased variability have already been observed to affect available soil moisture and N variability across crop growth phases with major negative impacts on crop production globally [\[10–](#page-11-0)[12\]](#page-11-1). For example, a modeling study conducted in Denmark indicated that air temperature increases have negative effects on both wheat yield and nitrate leaching [\[13\]](#page-11-2).

Understanding the processes that influence water and N fluxes in soil–crop systems in the context of climate change is of major importance with respect to both environmental concerns and the crop production [\[13,](#page-11-2)[14\]](#page-11-3). Many investigations have been conducted in agroecosystems to explore the potential contribution of field practice measures on soil water drainage and nitrate leaching under current and future climates [\[15–](#page-11-4)[18\]](#page-11-5). Knowledge obtained regarding water and N fluxes in agroecosystems and the corresponding control factors has been utilized to develop field management practices to decrease N loss [\[19,](#page-11-6)[20\]](#page-11-7). However, soil water and N fluxes in response to climate change under complicated cropping systems need to be further investigated [\[15\]](#page-11-4). The process-based crop models have become accepted tools for agricultural research because the model's purpose is to describe the causal relationships between crop growth and environmental driving factors [\[21\]](#page-11-8). Numerous studies have examined the effectiveness of field management practices and measures aimed at reducing N loss and increasing crop yields under future climatic conditions by using modeling approaches [\[22–](#page-11-9)[24\]](#page-11-10). For example, Biggs et al. (2013) reported that adaptive fertilizer management practices could reduce N loss with soil water drainage under projected climate change conditions. Modeling crop yields together with water and N balances is key to quantifying and reducing N loss in the context of climate change [\[25\]](#page-11-11).

The objective of this study was to evaluate climate change impacts on crop yield, soil water, and N fluxes in a wheat–maize cropping system. We recognize that increased atmospheric  $CO<sub>2</sub>$  concentration will also interact with changes in air temperature and precipitation to affect crop and soil processes [\[26\]](#page-11-12); however, we focus mainly on the over-riding effects of changing temperature and precipitation patterns on soil water and N fluxes, which can lead to deficient or excess N under future climatic conditions.

# **2. Materials and Methods**

# *2.1. Study Area and Overview of Experiment*

For the case study, we considered the Tai'an in Shandong Province and the North China Plain (NCP), an important agricultural production region for winter wheat and summer maize production in China. The research site is located inside the Shandong Agricultural University's Agricultural Experimental Station (36°09'37" N, 117°09'18" E, 130 m above sea level), which has a temperate, semi-humid continental monsoon climate. Its mean annual temperature and sunshine hours are 13 °C and 2627 h, respectively. The maximum and minimum temperatures occur in July (26.4 °C) and January (−2.6 ◦C), respectively. The rainy season is from July to September each year. The mean annual precipitation is 697 mm, and the groundwater depth exceeds 10 m. The parent material for soil formation is fluvial alluvium, and the soil type is alluvial cambisol (further details are given in Table [A1](#page-8-0) in the Appendix [A\)](#page-8-1). The winter wheat and summer maize crop rotation system has long been in use in the region and is widely practiced.

According to historical records of the local agro-meteorological observation stations, the growing season for winter wheat starts as early as October each year and continues until mid-June the following year, while that for summer maize is mid-June to mid-October of each year. The variety of winter wheat used in this experiment was Tainong 8. The cultivation method is deep ploughing, with straw mulching being practiced after harvesting. The variety of summer maize used in this study was Zhengdan 958 and the no-till farming method was used. Experimental design and water–fertilizer management details are shown in Table [A2](#page-9-0) [\[27\]](#page-11-13).

#### *2.2. Data Sources*

Historical daily weather data (1981–2010) were obtained from the Tai'an Meteorological Station's surface climate daily dataset, which was provided by the China Meteorological Data Service Center (http://[cdc.cma.gov.cn](http://cdc.cma.gov.cn/)/). The meteorological elements included air temperature (maximum, minimum, and mean), precipitation, mean wind speed, relative humidity, and sunshine hours. This set of 30-year historical meteorological data was used as the baseline climate period to generate data for future climate scenarios. Specifically, the baseline data were generated by three climate system models: GFDL-CM3, CSIRO-Mk3-6-0, and Had-GEM2-AO. In this study, the future climate period assessed was from 2031–2060. Two Representative Concentration Pathways (RCP4.5 and RCP8.5) scenarios were selected to generate meteorological data for this future climate period. The data included daily minimum, maximum, temperatures, and precipitation. The current  $CO<sub>2</sub>$  concentration (354 ppm) was assumed for the study [\[28\]](#page-11-14).

# *2.3. Model Choice*

A soil–crop system model (soil Water Heat Carbon Nitrogen Simulator, WHCNS), which was used in this study to simulate water consumption, N fates, and crop growth for different climate scenarios. The WHCNS model includes five main modules: Soil water, soil temperature, soil carbon, soil N, and crop growth. The model is driven by daily meteorological data and crop biology parameters that compute daily processes including soil evaporation, crop transpiration, soil water movement, runoff, soil temperature, soil net mineralization, nitrification, ammonia volatilization, denitrification, and crop growth. The model has been widely used to support its effectiveness in increasing crop yields and fertilizer use efficiency [\[29](#page-11-15)[–32\]](#page-12-0). For a more detailed description of the model, please refer to Liang et al. (2016) [\[30\]](#page-11-16).

# *2.4. Model Parameters, Evaluation, and Statistical Analyses*

Data from field experiments conducted from 2009-2012 were used to calibrate and evaluate the WHCNS model. Soil hydraulic parameters soil N transformation parameters, and crop parameters entered into the model are shown in Tables [A1,](#page-8-0) [A3](#page-10-7) and [A4,](#page-10-8) respectively. For the model used in this study, the source of its parameters is described in the literature [\[30\]](#page-11-16). The model parameters were calibrated and evaluated, and the indicators for evaluating the simulation effect are shown in Table [A5.](#page-10-9) The performance of the WHCNS model was acceptable in its simulation of the soil water content, nitrate concentration, and grain yield. Therefore, we proceeded to perform a response analysis of soil water drainage, nitrate leaching, crop N uptake, and grain yield to climate change. Several WHCNS-simulated outputs, including crop yield at harvest, various items related to water and N budget driven by the above three climate system models were averaged and then used to analyze the effect of climate change using the SAS PROC MIXED procedure with the method of restricted maximum likelihood (REML) [\[33\]](#page-12-1). The LSMEANS procedure of PROC MIXED along with adjusted Tukey was used for mean comparisons.

#### *2.5. Optimizing Field Management Measures*

This study eliminated the complex process of annual variations causing changes in the growth stages since the current WHCNS model cannot schedule automatic irrigation according to the crop growth period. The specific method involved selecting the fertilization and irrigation date as the date that corresponded to the multi-year average key growth period. Optimized water and fertilizer management measures were adopted for winter wheat and summer maize and are shown in Table [1.](#page-3-0)

Field Management <b>Stage</b>	<b>Winter Wheat</b>			<b>Summer Maize</b>			
	Date (Month/Day)	Fertilization $(kg N ha^{-1})$	Irrigation (mm)	Date (Month/Day)	Fertilization $(kg \text{ N} \text{ ha}^{-1})$	Irrigation (mm)	
Sowing	10/10	60	0	6/20	25	0	
Seedling	10/15	0	60		0	0	
Jointing	3/30	90	60	7/20	125	0	
Flowering	4/28	0	60		0	0	
Filling	5/14	0	60			0	

<span id="page-3-0"></span>**Table 1.** Sowing date and optimized field management measures of winter wheat and summer maize.

#### **3. Results** *3.1. Growing Season Air Temperature and Precipitation of Climate Scenarios*

# 3.1. Growing Season Air Temperature and Precipitation of Climate Scenarios

The mean temperature and accumulated precipitation of the winter wheat growing season changed in terms of both quantity and pattern under different climate scenarios. On a growing season basis, the mean temperatures shifted right under the future climate scenarios (Figure [1A](#page-3-1)), with the ranking for the minimum, maximum, and mean values being RCP8.5 > RCP4.5 > baseline. In other words, temperatures increased across the growing season. The probability distribution of accumulated precipitation during the growing season of winter wheat under different climate scenarios is shown in Figure [1B](#page-3-1). In terms of the mean accumulated precipitation during the growing season, the ranking is RCP8.5 > RCP4.5 > baseline. The minimum and maximum precipitation under RCP4.5 and RCP8.5 are very similar and are both higher than the baseline. The intensity of heavy precipitation events under RCP8.5 compared to RCP4.5 scenarios is also higher than that of the baseline. baseline.

<span id="page-3-1"></span>

Figure 1. Frequency distributions of  $(A,C)$  temperature and  $(B,D)$  average accumulated precipitation for the winter wheat and summer maize growing seasons for the baseline (1981–2010), RCP4.5, and RCP8.5 climate scenarios. The mean value for the RCP4.5 and RCP8.5 climate scenarios was averaged from three general circulation models: BCC-CSM1.1 (m), CSIRO-Mk3.6.0, and HadGEM2-AO.

The pattern of changes in the mean temperature of summer maize growing season is similar to The pattern of changes in the mean temperature of summer maize growing season is similar to that of winter wheat, with overall increases in the maximum, minimum, and mean values (Figure [1C](#page-3-1)). This implies that hot weather occurs more frequently during the growing season. The changes in accumulated precipitation are more complicated. The probability distribution of accumulated in accumulated precipitation are more complicated. The probability distribution of accumulated precipitation during the growing season under different climate scenarios is shown in Figure [1D](#page-3-1). The distribution under the baseline is scattered, together with the occurrence of extremely dry and wet years (i.e., accumulated precipitation < 200 mm and >800 mm, respectively). Compared with the

baseline, precipitation is more concentrated under the future climate scenarios, i.e., 300–900 mm and 200–1000 mm under RCP8.5 and RCP4.5, respectively.

## *3.2. Impact of Climate Change on Crops' Growth Period, Crop Yield, Soil Water, and N Fluxes*

Air temperature increases will shorten the growth periods of winter wheat and summer maize. For the winter wheat growing season, the growth period under both scenarios is shorter than that under the baseline: the mean reduction under RCP4.5 is 18 d, and that under RCP8.5 is more significant at 23 d (*P* < 0.05) (Table [2\)](#page-4-0). The reduction ration of growth period for summer maize is higher than that of winter wheat (data no shown). With increasing temperatures, the ranking of the growth period is baseline > RCP4.5 > RCP8.5 (Table [2\)](#page-4-0). Projected climate scenarios only significantly decreased maize yields (*P* < 0.05) with substantial differences found among climate scenarios as indicated by the lower yields associated with RCP4.5 (20.5%) and RCP8.5 (19.3%) climate scenarios, respectively.

<span id="page-4-0"></span>**Table 2.** Mean growth period, yield, water drainage, and nitrate leaching of winter wheat and summer maize under different climate scenarios.



Note: Means followed by a letter in common are not significantly different at the 5% level.

In the winter wheat growing season, items related to water balance—such as precipitation—increased significantly in the future compared with the baseline, with the greatest increase occurring under RCP8.5. There is no significant change to evaporation, transpiration, evapotranspiration, or runoff. Soil water drainage in the climate scenarios is significantly higher (i.e., more than double) ( $P < 0.05$ ) than at the baseline. Overall, there are significant increases in precipitation and water drainage (*P* < 0.05) under RCP4.5 and RCP8.5 compared with the baseline. Since the increase in input is greater than that of output, there is a significant increase in soil water storage under RCP8.5 (*P* < 0.05). Items related to N balance—such as the amounts of N brought into the field through N fertilizer, straw mulching, and irrigation water—were consistent under the various scenarios. In the climate scenarios, there is a significant decline  $(P < 0.05)$  in the amount of N due to mineralization, meaning that there is a significant decrease in N input. Uptake of N by crops also decreases significantly  $(P < 0.05)$ . The same applies to ammonia volatilization, with the ranking being baseline > RCP8.5 > RCP4.5. There is no significant change to nitrate leaching or denitrification. The various input and output items for N balance change dynamically, although there is no significant change to the overall N balance.

In the summer maize growing season, the indicators for water and N balances are more susceptible to climate change than they are for winter wheat. For the various items pertaining to water balance, there is no significant change to precipitation and runoff for the summer maize growing season. With continuously rising temperatures, the ranking for evaporation is baseline < RCP4.5 < RCP8.5, whereas the opposite ranking was determined for transpiration and evapotranspiration. The increase in water drainage is 1.4 times higher than the baseline (*P* < 0.05). Although there are increases and decreases in the output items, the overall water balance does not change significantly. For the items related to N balance, net mineralization decreases significantly (*P* < 0.05). The pattern of change for the various N output items is consistent with the ranking of baseline > RCP4.5 > RCP8.5. Nitrate leaching and accumulation in soil significantly decreases and increases (*P* < 0.05), respectively.

# **4. Discussion**

#### *4.1. Crops Growth and Crop Yield Under Baseline and Projected Future Climate Scenarios*

The projected climate change pattern in our study site is consistent with the phenomenon of climate change and the findings of many studies conducted near our study areas [\[34](#page-12-2)[–36\]](#page-12-3). Our results demonstrated the dominant effect of climate change on crop growth periods and yields. Similar results have been reported by Xiao et al. (2016) [\[36\]](#page-12-3). Air temperature increases accelerate crop flowering and maturation, thereby accelerating the growth process and shortening the growth period [\[37,](#page-12-4)[38\]](#page-12-5). The magnitude of the temperature increase is the largest under RCP8.5, and hence the reduction in the growth period is also the most obvious. In terms of crops, summer maize has more reduction in the growth period due to more frequent hot weather patterns. Similar change patterns were also noted in a study on the growth periods of winter wheat and summer maize on the North China Plain [\[36\]](#page-12-3).

Crop yield is affected by several factors that, in combination, cause a decline under the different climate scenarios. Among these factors, the length of growth period had been observed to be closely related to crop yield [\[39\]](#page-12-6). In our study, the correlation between yield and temperature is negative, which agrees with the findings of Ray et al. (2015) [\[40\]](#page-12-7). Correlations between the yield of winter wheat and the mean temperature of the wheat growing season are significant (*P* < 0.05) and vary among baseline and climate scenarios (Figure [2\)](#page-7-0). This result further confirmed the negative impact of warmer weather on yield. The negative correlation between yield and temperature in summer maize is extremely significant. This indicates that it is susceptible to heat damage from high temperatures during its growing season, which results in a decline in yield. The positive correlation between transpiration and yield is also extremely significant, and is in agreement with the findings of Djaman et al. (2013) [\[41\]](#page-12-8). The correlation coefficients of the aforementioned factors are ranked in the following descending order: Transpiration > temperature > growth period. It is surmised that transpiration has the greatest effect on yield determination. Under the varying climate scenarios, there is no significant change in transpiration during the wheat growing season; therefore, the reduction in yield is not significant. However, during the maize growing season, transpiration, as well as crop yield, are significantly reduced, which is consistent with what would be expected.

#### *4.2. Soil Water and N Fluxes Under Baseline and Projected Future Climate Scenarios*

Projected climate scenarios have significant effects on soil water drainage. This result was expected due to seeing precipitation increases during the growth period of both crops under RCP4.5 and RCP8.5 climate scenarios. The correlation coefficient between precipitation and water drainage during the summer maize growth period is 0.859 (*P* < 0.01), which is higher than that of winter wheat (0.500, *P* < 0.001) (Figure [2\)](#page-7-0). Precipitation impacts varied, which is possibly due to the use of different irrigation systems used for both crops. Cultivation of winter wheat in the NCP utilizes two methods of water input: irrigation and rainfed. In contrast, summer maize is cultivated only using rainfed conditions, making it more susceptible to changes in climate and precipitation. This also resulted in a greater correlation between water drainage and precipitation under RCP4.5 and RCP8.5. Although

increased precipitation led to more water input, the soil water balance for the maize growth period did not differ significantly with warmer temperatures, which was likely due to reduced crop water consumption (CWC). This result is similar to the reports of Hawkins et al. (2013) that showed that the amount of CWC was directly relevant to temperature increases [\[42\]](#page-12-9). Therefore, further investigation into the means of addressing decreases in CWC resulting from temperature increases is necessary for maximizing water use efficiency.

Increases in soil water drainage did not result in an increase of nitrate leaching. In general, soil water drainage is closely related to nitrate leaching. Congreves et al. (2016) and Patil et al. (2010) showed that heavy rainfall events cause larger soil water drainage through the soil that carries nitrate below the root zone and vice versa [\[43](#page-12-10)[,44\]](#page-12-11). In our present study, nitrate leaching for winter wheat did not increase significantly, and there was a significant reduction in nitrate leaching for summer maize, although precipitation and water drainage increased. These results were not expected; however, they can be explained in part due to a decreased N input (net mineralization) induced by climate change. The positive effect of temperature increases on reducing net mineralization is shown in both the incubation experiment of Dalias et al. [\[45\]](#page-12-12) and in our simulation. In addition, studies have shown that nitrate leaching is related to the intensity, duration, and precipitation intervals as well as the crop's growth stage at the time of precipitation [\[8,](#page-10-5)[9\]](#page-10-6). Precipitation patterns during the summer maize growing season will become complicated in the future. Under conditions where total precipitation does not change significantly, the occurrence of extreme precipitation events will decrease mostly in the RCP8.5 scenario. This study showed that the correlation coefficient between precipitation and nitrate leaching in the summer maize growing season reduces from 0.847 to 0.716 and then to 0.585, corresponding to the baseline, RCP4.5, and RCP8.5 climate scenarios, respectively (Figure [2B](#page-7-0)). A plausible explanation is that there are less extreme precipitation events under RCP4.5 and RCP8.5 climate scenarios, and thus, less extreme soil water drainage events. Such an explanation could be supported by an experimental study of nitrate isotopes, which was also conducted in NCP under a wheat–maize double cropping system [\[46\]](#page-12-13). This study indicated that extreme precipitation events are highly relevant to nitrate leaching.

Climate factors that limit crop growth can leave surpluses of unused fertilizer N in soil and has a negative effect on crop N uptake even when field management practices are optimized [\[47\]](#page-12-14). Crop N uptake in field conditions can greatly vary in a single year and over several years even when the N supplies from both the soil and additional fertilizer inputs are abundant [\[10\]](#page-11-0). Changes in the climatic factors, specifically temperature and precipitation, are associated with decreased N uptake during the growing season. The present crop model assessing N uptake is based on the thermal unit concept, which implies that high temperatures will affect the process of N transfer from the soil to the shoot and limit N accumulation in crops [\[48\]](#page-12-15). In addition, a shorter growth period further reduces N uptake. This result agrees with the findings of Gastal and Lemaire (2002), who suggest that with an adequate soil N supply, crop N uptake is mostly determined by the crop growth rate [\[10\]](#page-11-0).

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

**Figure 2.** Correlation matrix for growing season accumulated precipitation, transpiration (T a ), water drainage, crop N uptake, soil nitrate leaching, and yield for winter wheat (**A**) and summer soil water drainage, crop N uptake, soil nitrate leaching, and yield for winter wheat (**A**) and summer maize (**B**) based on the mean of all climate scenarios of baseline (red), RCP4.5 (green), RCP8.5 (blue) maize (**B**) based on the mean of all climate scenarios of baseline (red), RCP4.5 (green), RCP8.5 (blue) climate scenarios, respectively. Note: \*\*\* Significant at the 0.001 probability level, \*\* Significant at the climate scenarios, respectively. Note: \*\*\* Significant at the 0.001 probability level, \*\* Significant at the 0.01 probability level, \* Significant at the 0.05 probability level. 0.01 probability level, \* Significant at the 0.05 probability level.

# **5. Conclusions**

Climate change impacts on winter wheat and summer maize growth, and water and N fluxes in agroecosystems were determined using the process-based WHCNS model. Our results showed that the mean temperature and accumulated precipitation of the winter wheat growing season clearly changed in both quantity and pattern under different climate scenarios. Temperature increases were shown to shorten the growth periods of winter wheat and summer maize.

Our study shows that increased precipitation under RCP4.5 and RCP8.5 climate scenarios leads to a significant increase in soil water drainage. However, the increases in soil water drainage did not result in increased nitrate leaching, which could be explained in part by a decrease in N input (net mineralization) induced by climate change. There is no significant change to evaporation, transpiration, or evapotranspiration for the winter wheat growing season, and the converse is true for the summer maize growing season. Although the various input and output items for the N balance change dynamically, there is no significant change to the overall N balance. During the summer maize growing season, the pattern of change for the various N output items is consistent with the order baseline > RCP4.5 > RCP8.5. Nitrate leaching in soil significantly decreases, which is likely due to less N input (net mineralization) and less heavy rainfall events under projected climate change scenarios.

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**Conflicts of Interest:** The authors declare no conflict of interest.

# <span id="page-8-1"></span><span id="page-8-0"></span>**Appendix A**

<b>Soil Layer</b>	Volumetric Weight	$\theta_r$	$\theta_{s}$	$\alpha$	n	$K_{\rm s}$
(cm)	$(g cm^{-3})$	$\rm (cm^3 \ cm^{-3})$	(cm <sup>3</sup> cm <sup>-3</sup> )	$(cm^{-1})$		$(cm d^{-1})$
$0 - 25$	1.45	0.030	0.453	0.0106	1.44	72.1
$25 - 45$	1.50	0.032	0.374	0.0111	1.28	62.2
$45 - 95$	1.50	0.025	0.430	0.0120	1.29	62.5
$95 - 115$	1.51	0.025	0.430	0.0270	1.13	55.4
115–135	1.45	0.050	0.453	0.0263	1.14	55.0
135–160	1.40	0.050	0.472	0.0179	1.09	54.0

**Table A1.** Parameters for physical and hydraulic properties of soil profiles [\[30\]](#page-11-16).

Note:  $\theta_r$  and  $\theta_s$  = residual and saturated water contents, respectively;  $K_s$  = the saturated hydraulic conductivity; and  $\alpha$  and  $n =$  parameters of the water characteristic curve.

<span id="page-9-0"></span>



<span id="page-10-7"></span>

**Table A4.** Parameters for original crop species used in the WHCNS model [\[30\]](#page-11-16).

**Table A3.** Soil nitrogen transformation parameters used in the WHCNS model [\[30\]](#page-11-16).

<span id="page-10-8"></span>

Parameter	Description	Crop		
		<b>Winter Wheat</b>	<b>Summer Maize</b>	
$T_{\text{base}}$	Minimum temperature for crop growth & development ( $^{\circ}$ C)	0	8	
$T_{sum}$	Accumulated temperature from seedling germination to maturity $(^{\circ}C)$	2000	1550	
$K_e$	Extinction coefficient (-)	0.6	0.6	
K ini	Early-term crop coefficient (-)	0.65	0.65	
K mid	Mid-term crop coefficient (-)	1.05	1.35	
K end	Late-term crop coefficient (-)	0.25	1.2	
SLA max	Maximum specific leaf area ( $m^2$ kg <sup>-1</sup> )	24	30	
SLA min	Minimum specific leaf area ( $m^2$ kg <sup>-1</sup> )	14	15	
AMAX	Maximum assimilation rate (kg hm <sup><math>-2</math></sup> h <sup>-1</sup> )	45	60	
$R$ max	Maximum root length (cm)	120	80	

**Table A5.** Evaluation of the model's simulation effects [\[30\]](#page-11-16).

<span id="page-10-9"></span>

Note: *RMSE* = root mean square error;  $E =$  coefficient for the model's simulation efficiency; and  $d =$  consistency index.

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