# RESEARCH ON SINGLE-PARAMETER LOGISTIC MODEL FOR RELATIVE PLANT HEIGHT AND RELATIVE DRY MATTER OF WINTER WHEAT (*TRITICUM AESTIVUM* L.) AND SUMMER MAIZE (*ZEA MAYS* L.)

GUO, Y.<sup>1,2</sup> – WANG, Q. J.<sup>1,2\*</sup> – ZHANG, J. H.<sup>3,4\*</sup> – WEI, K.<sup>1,2</sup>

<sup>1</sup>State Key Laboratory of Eco-hydraulics in Northwest Arid Region, Xi'an University of Technology, Xi'an 710048, China

<sup>2</sup>School of Water Resource and Hydropower, Xi'an University of Technology, Xi'an 710048, China

<sup>3</sup>College of Water Conservancy and Architectural Engineering, Shihezi University, Shihezi 832000, Xinjiang, China

<sup>4</sup>Key Laboratory of Modern Water-Saving Irrigation of Xinjiang Production and Construction Corps, Shihezi University, Shihezi 832000, Xinjiang, China

> \*Corresponding authors e-mail: wquanjiu@163.com; zhangjihong\_eric@163.com

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**Abstract.** Logistic model has been widely used in simulating plant height and dry matter accumulation (DMA). However, the parameters of logistic model vary greatly under different crop cultivar, cultivation environment and weather conditions, which limits the application range of the model. In order to increase the applicability of the model, the maximum DMA, maximum plant height, and maximum growing degree days of typical crops were set to 1. Based on the method of normalization, the parameters a and b of the logistic model were estimated using a series of field trial data. The results showed that a/b values were a relatively stable constant due to a/b represented the peak of crop growth rate. Based on the above opinion, the single-parameter logistic models for plant height and DMA of typical food crops were established. The accuracy of the single-parameter models was evaluated, showing that the single-parameter models can accurately reflect the dynamic characteristics of plant height and DMA. These results can provide theoretical support for precise regulation and prediction of plant height and dry matter accumulation of two food crops.

Keywords: growth function, relative growing degree days, food crops, crop modeling

# Introduction

Winter wheat and summer maize are the two main food crops cultivated worldwide. As one of the most important food production countries, China is the largest wheat and second-largest maize producer in the world (Liu et al., 2014a; Anjum et al., 2017), which in 2021 contributed 17.6% and 23.1% of global wheat and maize production respectively (FAO, 2023). With the rapid growth of global population, accurate analysis and forecast of food production have attracted increasing attention. Dry matter accumulation (DMA) and plant height are both important indicators to reflect the growth status and yield of food crops (Yin et al., 2011; Ning et al., 2013; Zhang et al., 2023; Gao et al., 2020). DMA determine the yield formation because the essence of crop DMA is the process of photosynthetic product formation (Ferrise et al., 2010; Ning et al., 2013). Plant height is the main agronomic index to characterize the stem

morphology of crops, which is closely related to light absorption ability of the crop (Boomsma et al., 2010). Moreover, plant height is the basis of DMA, and is usually used by farmers to judge the growth state of crop (Kaplan et al., 2023). Compared with the data of DMA of crops, the data of plant height is easier to obtain. Recently, the importance of plant height to yield has been gradually recognized by researchers. Bendig et al. (2014) constructed the relationship between plant height and DMA, and used the plant height to estimate the DMA. Tao et al. (2020) estimated the yield of winter wheat using the spectral indices, ground-measured plant height, and plant height extracted from the hyperspectral remote sensing data, combined with three regression techniques. Gilliot et al. (2021) showed the potential of predicting maize yield based on the plant height extracted from unmanned aerial vehicle imagery. Ji et al. (2022) reported that the yield of faba bean can be reasonably estimated using the multiple time points data of plant height. Thus, it is necessary to study the dynamic changes in DMA and plant height for yield prediction.

At present, the simulation of dynamic changes of the DMA can usually be described in two ways: mechanism models and empirical models. The commonly used mechanism models include DSSAT, STICS and WOFOST models (Jones et al., 2003; Brisson et al., 2003; van Diepen et al., 1989). However, mechanism models have a lot of parameters and these parameters are difficult to determine. Instead, the empirical models are widely used because of the process of the parameter determination is relatively simple. The common empirical models used to describe crop growth including logistic, Gompertz and Richard equations (Verhulst, 1838; Gompertz, 1825; Richard, 1959). Among these models, logistic model is most frequently used in crop dynamic simulation because of its biological significance. Logistic model was originally proposed by ecologists to describe the laws of biological population growth and were subsequently widely used in DMA, plant height, leaf area expansion and grain filling (Hirooka et al., 2016; Liu et al., 2020; Bagheri et al., 2014; Sepaskhah et al., 2011).

As for the dynamic simulation of plant height, most crop mechanism growth models do not include simulations of plant height since they assume the canopy architecture as mono-layer or several layers to simulate light interception. The development of plant height model is slow over the past decades (Confalonieri et al., 2011). At present, using a logistic model is the most common method for simulating the change characteristics of plant height.

Many investigators have applied logistic models to simulate the growth processes of DMA and plant height. Wardhani and Kusumastuti (2014) described the height growth of maize using logistic and Gompertz models with the days after planting as independent variables respectively. Ma et al. (2013) used logistic model to simulate the plant height, leaf area index (LAI), and DMA of spring wheat under different irrigation regimes. And a modified logistic model was established to simulate DMA and LAI based on plant height. Considering the effect of different environmental conditions and plating dates, some studies have shown that growing degree days (GDD) can be used instead of days after planting in the logistic function (Shabani et al., 2018; Mahbod et al., 2014; Sepaskhah et al., 2011). Mahbod et al. (2014) used logistic models to predict DMA and grain yield of winter wheat in semi-arid regions based on GDD. Bagheri et al. (2014) simulated maize daily DMA using logistic model for different water and nitrogen management regimes. Wang et al. (2014) presented a logistic model calculating winter wheat above-ground biomass and LAI for different irrigation treatments. Liu et al. (2020) established a universal logistic model simulating DMA and

plant height of winter wheat in China using GDD as independent variable. Wang et al. (2021) and Guo et al. (2022) developed a universal logistic model predicting the plant height of cotton and summer maize in different regions. However, the parameters of logistic function vary greatly under different crop cultivar, cultivation environment and weather conditions. The difference of logistic model parameters in different environments limits the popularization and application of the model. In addition, there is still a lack of in-depth analysis of the changing characteristics of the parameters of the logistic model and the relationship between the parameters.

In this paper, the variations of relative plant height (RH) and relative dry matter accumulation (RDMA) with the relative growing degree days (RGDD) were investigated to clarify the relationship between the parameters of the normalized logistic model. Thus, the objective of this study was to establish and evaluate a normalized logistic model for simulating plant height and DMA in winter wheat and summer maize with reduced complexity and less parameter.

## Materials and methods

#### Data collection

The data of crop plant height and DMA are obtained from literature published on China National Knowledge Infrastructure (https://www.cnki.net/). The growth characteristics data were directly from the tables and text or indirectly from figures using Get Data Graph Digitizer software. The selected literature meets the following criteria: (1) Data collection is restricted to field experiment studies, (2) The growth data under the condition of widely used agronomic technologies were taken into consideration, and data from some new technologies were removed. Based on above criteria, 20 articles and 13 articles were selected to analyze growth characteristics of DMA and plant height of typical food crops, respectively. Detailed information on the literature is listed in *Tables 1–4*.

The meteorological data are obtained from the China Meteorological Data Network (http://data.cma.cn), including the daily maximum temperature and the daily minimum temperature during the crop growth period. GDD is the difference between the average daily temperature and the minimum temperature required for crop activity, as shown below (McMaster and Wilhelm, 1997):

$$GDD = \sum (T_{avg} - T_{base})$$
(Eq.1)

 $T_{\text{avg}}$  is average daily temperature;  $T_{\text{base}}$  is minimum temperature required for crop activity.  $T_{\text{avg}}$  is calculated as follows:

$$T_{avg} = \begin{cases} T_{avg} = \frac{T_x + T_n}{2} \\ T_{avg} = T_{base} & if \ T_{avg} \leq T_{base} \\ T_{avg} = T_{upper} & if \ T_{avg} \geq T_{base} \end{cases}$$
(Eq.2)

 $T_x$  is daily maximum temperature;  $T_n$  is daily minimum temperature;  $T_{upper}$  is the maximum temperature required for crop activities.

Location	Year	Sample size	References	Purpose
Qingyang City, Gansu Province	1995-1996	1	Zhang et al. (2004)	
Taiyuan City, Shanxi Province	2014-2015	4	Shi et al. (2017)	
Jinzhong City, Shanxi Province	2015-2016	1	Tian et al. (2012)	Model
Yangling City, Shaanxi Province	2012-2013	2	Yang et al. (2015)	establishment
Hefei City, Anhui Province	2010-2011	1	Teng (2012)	
Zhengzhou City, Henan Province	2009-2010	1	Liu et al. (2012)	
Haozhou City, Anhui Province	2010-2011	2	Zhang et al. (2014)	
Gaoyou City, Jiangsu Province	2001-2002	1	Huang et al. (2008)	Model validation
Handan City, Hebei Province	2011-2012	2	Liu et al. (2014b)	

Table 1. Data sources of winter wheat dry matter accumulation

Table 2. Data sources of summer maize dry matter accumulation

Location	Year	Sample size	References	Purpose
Beijing City	1980	1	Chen (1986)	
Shijiazhuang City, Hebei Province	2010	1	Wang et al. (2013)	
Taian City, Shandong Province	2011	1	Feng et al. (2015)	
Zhengzhou City, Henan Province	1994	1	Ma et al. (2007)	Model
Songyuan City, Jilin Province	2014	1	Sun et al. (2017)	establishment
Luoyang City, Henan Province	2013	2	Jin et al. (2014)	
Cangzhou City, Hebei Province	2016	2	Kan et al. (2019)	
Yangling City, Shaanxi Province	2008	1	Ma et al. (2010)	
Lang fang City, Hebei Province	2009	1	Li et al. (2010)	
Luoyang City, Henan Province	2012	2	Liang et al. (2013)	Model validation
Taian City, Shandong Province	2015	2	Zhang et al. (2017)	

Table 3. Data sources of winter wheat plant height

Location	Year	Sample size	References	Purpose
Nanjing City, Jingsu Province	2013-2014	1	Dong et al. (2017)	
Beijing City	2004-2005	2	Kong et al. (2008)	NC 11
Langfang City, Hebei Province	2013-2014	3	Jiao et al. (2017)	Model establishment
XinXiang City, Henan Province	2009-2010	2	Gao et al. (2012)	establishment
YunCheng City, Shanxi Province	2012-2013	2	Ding et al. (2014)	
Cangzhou City, Hebei Province	2010-2011	2	Wu and Wang (2009)	Model validation
Yangling City, Shannxi Province	2001-2002	3	Liu et al. (2010)	woder validation

Table 4.	Data	sources	of	summer	maize	plant	height
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Location	Year	Sample size	References	Purpose
Cangzhou City, Hebei Province	2013	2	Liu et al. (2014c)	
Tianchang City, Anhui Province	2009	3	Xiao et al. (2010)	Model
Xinxiang City, Henan Province	2007	2	Zhang et al. (2008)	establishment
jiamusi City, Heilongjiang Province	2014	3	Zhu et al. (2015)	
Yiyang City, Henan Province	1999	3	Fu et al. (2005)	Model validation
Xinxiang City, Henan Province	2009	2	Xiao et al. (2011)	woder vandation

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### Data normalization

The maximum value of DMA and plant height were set to 1, respectively. The data of plant height and DMA were normalized. The RDMA, RH and RGDD were all in the range of [0-1].

$$RDMA_i = \frac{DMA_i}{DMA_{max}}$$
(Eq.3)

$$RH_i = \frac{H_i}{H_{max}}$$
(Eq.4)

$$RGDD_i = \frac{GDD_i}{GDD_{max}}$$
(Eq.5)

 $DMA_i$  is measured dry matter accumulation,  $DMA_{max}$  is maximum dry matter accumulation,  $H_i$  is measured plant height,  $H_{max}$  is maximum plant height,  $GDD_i$  is growing degree days from sowing to measurement period,  $GDD_{max}$  is growing degree days when crop is mature.

#### Statistical analysis

The determination coefficient  $(R^2)$  and the root mean square error (RMSE) were used to evaluate the accuracy of the model. These statistical indexes could be calculated as follows:

$$RMSE = \sqrt{\frac{\sum_{i=1}^{n} (O_i - P_i)^2}{n}}$$
(Eq.6)

$$R^{2} = 1 - \frac{\sum_{i=1}^{n} (O_{i} - P_{i})^{2}}{\sum_{i=1}^{n} (O_{i} - \overline{O_{i}})^{2}}$$
(Eq.7)

where  $O_i$  is measured value,  $P_i$  is the simulated value,  $\overline{O_i}$  is the average value of measured data, and *n* is the number of observations.

# Single-parameter logistic model construction

## Normalized logistic model

The formula of the logistic growth function is as follows:

$$y = \frac{y_{max}}{1 + e^{a - bt}} \tag{Eq.8}$$

where y is growth index (plant height or DMA),  $y_{max}$  is the upper limit of the crop growth index, t is the number of days after planting or sowing, a and b are coefficients of the equation.

Some researchers suggested that applying logistic model to simulate crop growth status under different weather conditions, it is more reasonable to use GDD instead of

calendar days after planting (Mahbod et al., 2014; Sepaskhah et al., 2011). Thus, logistic model can be expressed as follows:

$$y = \frac{y_{max}}{1 + e^{a - bGDD}}$$
(Eq.9)

In order to eliminate the differences in crop growth characteristics caused by different crop varieties, soil types and management methods, the plant height and DMA were normalized (Fu et al., 2009). The normalized logistic model is as follows:

$$Ry = \frac{y}{y_{max}} = \frac{1}{1 + e^{a - bRGDD}}$$
(Eq.10)

# Characteristic parameters of the normalized logistic equation

The instantaneous rate of relative dry matter accumulation or relative plant height at the moment of RGDD was obtained by taking derivative of *Equation 10*:

$$Ry' = \frac{be^{a-bRGDD}}{(1+e^{a-bRGDD})^2}$$
(Eq.11)

In order to determine the maximum rate and its corresponding RGDD, the second derivative of normalized logistic equation is as follows:

$$Ry'' = \frac{b^2 (e^{a-bRGDD} - 1)e^{a-bRGDD}}{(1+e^{a-bRGDD})^3}$$
(Eq.12)

Let Ry'' = 0, an inflection point (a/b, b/4) was defined. b/4 and a/b are respectively the maximum rate and its corresponding RGDD.

#### Relationships between parameters of normalized logistic model

The parameters of the normalized logistic model were estimated using data set for model establishment in MATLAB software. *Tables 5* and 6 show severally the values of parameters a and b of normalized logistic model describing the DMA of winter wheat and summer maize. And *Tables 7* and 8 show severally the values of parameters a and b of normalized logistic model describing plant height dynamic process of winter wheat and summer maize. It can be seen that that a/b values of different crops were relatively stable constants. From the above analyses, we can know that when RGDD = a/b, the growth rate reaches maximum. Combined with the RGDD when the maximum growth rate occurs, the single-parameter logistic models of plant height or DMA were established.

*Table 5* shows that  $a_1/b_1$  ranges from 0.531 to 0.591. Since the variation amplitude of  $a_1/b_1$  values are small, in order to simplify the model, take the average value. Therefore, the normalized DMA logistic model of winter wheat can be modified as follows:

$$RDMA_{wheat} = \frac{1}{1 + e^{0.559b_1 - b_1 RGDD}}$$
(Eq.13)

*Table 6* shows that  $a_2/b_2$  ranges from 0.538 to 0.622. Similarly, take the average of  $a_2/b_2$ . The normalized DMA logistic model of summer maize can be modified as follows:

$$RDMA_{maize} = \frac{1}{1 + e^{0.579 \, b_2 - b_2 RGDD}} \tag{Eq.14}$$

*Table 7* shows that  $a_3/b_3$  ranges from 0.344 to 0.449. Similarly, take the average of  $a_3/b_3$ . The normalized plant height logistic model of winter wheat can be modified as follows:

$$RH_{wheat} = \frac{1}{1 + e^{0.393b_{\rm g} - b_{\rm g}RGDD}}$$
(Eq.15)

*Table* 8 shows that  $a_4/b_4$  ranges from 0.361 to 0.436. Similarly, take the average of  $a_4/b_4$ . The normalized plant height logistic model of summer maize can be modified as follows:

$$RH_{maize} = \frac{1}{1 + e^{0.391b_4 - b_4 RGDD}}$$
(Eq.16)

*Table 5. Parameter fitting results of normalized logistic model for relative winter wheat DMA* 

Dataset	$a_1$	<b>b</b> 1	<b>R</b> <sup>2</sup>	RMSE	$a_1/b_1$
1	7.831	14.17	0.99	0.02	0.553
2	3.650	6.608	0.99	0.03	0.552
3	3.694	6.473	0.98	0.04	0.571
4	3.567	6.514	0.99	0.04	0.548
5	3.94	7.002	0.98	0.06	0.563
6	5.133	8.676	0.98	0.06	0.592
7	4.362	7.918	0.99	0.02	0.551
8	4.238	7.752	0.99	0.04	0.547
9	4.001	7.530	0.99	0.03	0.531
10	5.187	8.896	0.99	0.03	0.583
Average					0.559

*Table 6.* Parameter fitting results of normalized logistic model for relative summer maize DMA

Dataset	<i>a</i> <sub>2</sub>	<b>b</b> 2	R <sup>2</sup>	RMSE	<i>a</i> 2/ <i>b</i> 2
1	4.688	7.594	0.99	0.05	0.617
2	3.915	7.103	0.99	0.04	0.551
3	4.760	7.650	0.98	0.04	0.622
4	4.198	7.581	0.99	0.05	0.554
5	4.564	7.980	0.99	0.03	0.572
6	3.808	6.564	0.99	0.04	0.580
7	3.754	6.404	0.99	0.04	0.586
8	4.115	7.415	0.99	0.03	0.555
9	4.375	8.126	0.98	0.04	0.538
10	4.065	6.607	0.94	0.09	0.615
Average					0.579

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Dataset	аз	<b>b</b> 3	<b>R</b> <sup>2</sup>	RMSE	<i>a</i> <sub>3</sub> / <i>b</i> <sub>3</sub>
1	8.688	19.33	0.98	0.01663	0.450
2	4.833	12.32	0.99	0.00625	0.392
3	4.349	10.51	0.99	0.01387	0.414
4	3.357	9.748	0.99	0.04604	0.344
5	3.772	9.686	0.98	0.06795	0.389
6	3.228	8.916	0.98	0.06445	0.362
7	2.846	6.637	0.97	0.04937	0.429
8	3.426	8.402	0.99	0.04102	0.408
9	2.704	7.279	0.99	0.00894	0.372
10	2.337	6.353	0.99	0.01375	0.368
Average					0.393

**Table 7.** Parameter fitting results of normalized logistic model for relative winter wheat plant height

**Table 8.** Parameter fitting results of normalized logistic model for summer relative maizeplant height

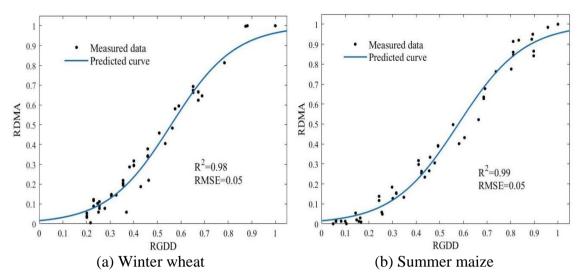
Dataset	<b>a</b> 4	<b>b</b> 4	$\mathbb{R}^2$	RMSE	<i>a</i> 4/ <i>b</i> 4
1	2.712	7.154	0.96	0.09664	0.379
2	2.688	7.427	0.98	0.07587	0.362
3	4.073	10.78	0.99	0.01804	0.378
4	3.914	9.437	0.98	0.05325	0.415
5	3.768	8.976	0.99	0.03806	0.420
6	3.231	8.569	0.99	0.02085	0.377
7	3.640	8.340	0.98	0.03444	0.436
8	2.371	6.447	0.99	0.03298	0.368
9	2.248	6.025	0.97	0.05004	0.373
10	2.404	5.938	0.98	0.04032	0.405
Average					0.391

# **Model evaluation**

# Evaluation of single-parameter DMA model with data for model establishment

In order to evaluate the established single-parameter logistic model, *Equations 16* and 17 were used to fit the parameters of the two crops respectively. Then predicted RGDD value of the two crops were calculated. The comparison results with the measured data are shown in *Figure 1*. It can be seen that the established single-parameter models reasonably describe the RGDD process of two crops. The measured and predicted values were plotted 1: 1 line to verify the simulation performance of the model in *Figure 2*. It can be seen that the scattered points are evenly distributed around the 1:1 line. The value of  $R^2$  and RMSE are 0.98 and 0.05. Therefore, the single-parameter logistic models had a satisfactory precise simulating the RDMA of two crops.

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*Figure 1.* Measured and predicted relative dry matter accumulation based on the singleparameter logistic model for winter wheat and summer maize (data for model establishment)

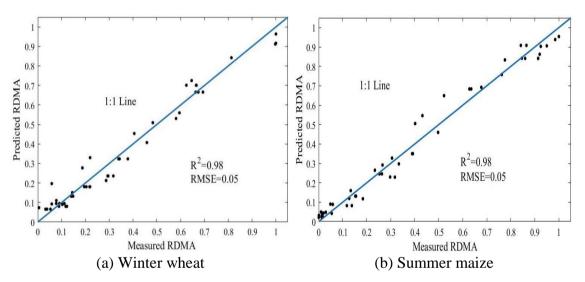
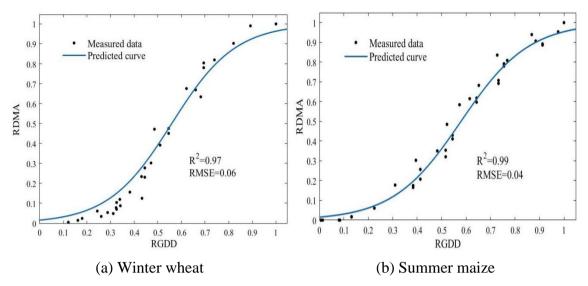


Figure 2. Relationship between measured and predicted values of relative dry matter accumulation for winter wheat and summer maize (data for model establishment)

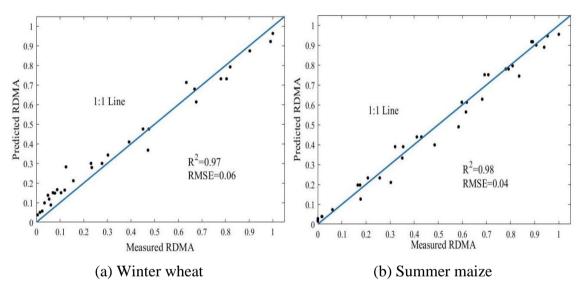
#### Evaluation of single-parameter DMA model with data for model validation

In order to further evaluate the performance of the single-parameter logistic model, 5 added dry matter data provided by the relevant literature were used to validate the model. The predicted and measured variation curves of RDMA in two crops are shown in *Figure 3*. Results indicate that the simulation effect of the simplified logistic model is acceptable. Then the measured and predicted wheat winter and summer maize RDMA by developed simplified logistic model was compared with 1:1 line in *Figure 4*. The values of  $R^2$  (0.97 and 0.98) and RMSE (0.06 and 0.04) showed that single-parameter logistic model predicted winter wheat and summer maize with good accuracy. Therefore, the simplified model can be used to simulate the RDMA with the RGDD.

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*Figure 3. Measured and predicted relative dry matter accumulation based on the singleparameter logistic model for winter wheat and summer maize (data for model validation)* 



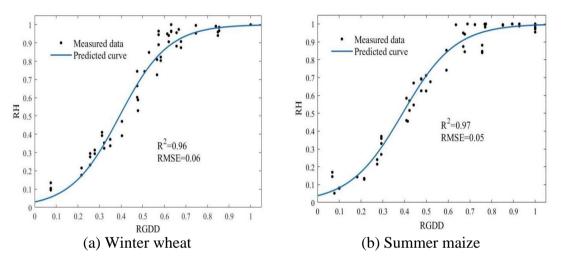
*Figure 4. Relationship between measured and predicted values of relative dry matter accumulation for winter wheat and summer maize (data for model validation)* 

# Evaluation of single-parameter plant height model with data for model establishment

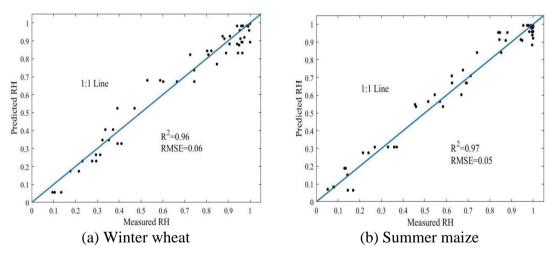
*Equations 18* and *19* were used to fit the parameters of the two crops, and then predicted RH values were calculated bases on the established single-parameter logistic model. The predicted and measured values of RH are shown in *Figure 5*. It can be seen from *Figure 5* that the established single-parameter model precisely describes the RH change process of the two crops of winter wheat and summer maize. To further evaluate the results of single parameter logistic model for RH prediction, all values of predicted and measured RH were compared in *Figure 6*. The statistical parameters  $R^2$  (0.96 and 0.97) and RMSE (0.06 and 0.05) showed acceptable estimation of RH.

### Evaluation of single-parameter plant height model with data for model validation

5 other plant height data provided by the relevant literature were used to validate the model. The predicted and predicted RH are shown in *Figure 7*. Agreement between measured and predicted values of RH was obtained with good accuracy. In order to further evaluate the performance single-parameter plant height logistic model, the measured and simulated winter wheat was compared with 1:1 line in *Figure 8*. The values of R<sup>2</sup> (0.95 and 0.91) and RMSE (0.06 and 0.08) showed that single-parameter logistic model predicted winter wheat and summer maize RH with good accuracy. Therefore, the normalized logistic model was validated with good accuracy.



*Figure 5.* Measured and predicted relative plant height based on the single-parameter logistic model for winter wheat and summer maize (data for model establishment)

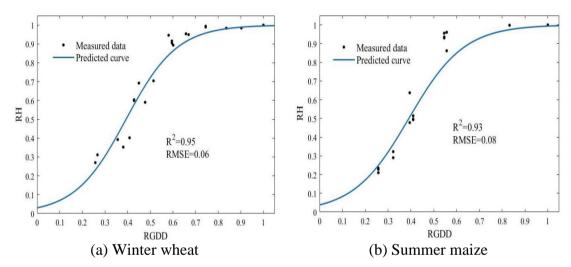


*Figure 6. Relationship between measured and predicted values of relative plant height for winter wheat and summer maize (data for model establishment)* 

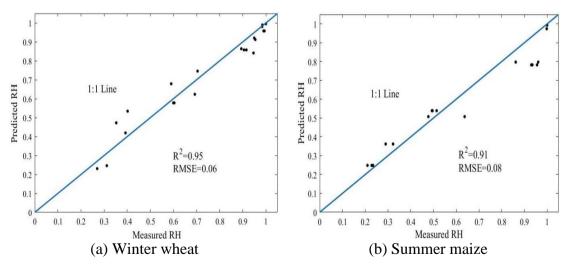
#### Discussion

Plant height and DMA are important indicators reflecting crop yield formation (Jiang et al., 2020; Rebetzke et al., 2011; Arduini et al., 2006; Fang et al., 2010). Quantitative

analysis of the dynamic changes of crop plant height and DMA is the key to deepening understanding of crop field management. Because of its biological significance and good simulation effect, the logistic model is used by many scholars to simulate the dynamic changes of plant height and DMA in winter wheat and summer maize (Sepaskhah et al., 2011; Mahbod et al., 2014; Liu et al., 2020). For example, Mahbod et al. (2014) developed an empirical logistic model for winter wheat in semiarid region. Result showed that the model can be applicable in different years and location in this study region. Liu et al. (2020) established a universal logistic model simulating the characteristics of plant height and DMA and of winter wheat in China based on growing degree days. Similarly, the logistic model was used to estimate DMA and grain yield of maize with an acceptable accuracy at different irrigation water and nitrogen levels (Bagheri et al., 2014; Sepaskhah et al., 2011). However, the parameter of logistic model under different varieties, cultivation measures and meteorological conditions has large differences, which restricts the applicability of model (Fu et al., 2009).



*Figure 7.* Measured and predicted relative plant height based on the single-parameter logistic model for winter wheat and summer maize (data for model validation)



*Figure 8. Relationship between measured and predicted values of relative plant height for winter wheat and summer maize (data for model validation)* 

In this study, a normalized logistic equation was used to construct a dynamic universal model of RH and RDMA in winter wheat and summer maize, which avoided differences due to different varieties, planting dates, planting densities, and farming practices. In the process of fitting parameters using a normalized logistic model, it was found that the value of a/b is a relatively stable constant. Subsequently, the logistic model can be simplified to a single-parameter model. The performance of the single-parameter logistic models was evaluated a lot of field data. Statistic indexes showed that single-parameter can accurately reflect the changes in plant height and DMA of winter wheat and summer maize during the growth period. Moreover, the simplified model has only one parameter, which is easier to popularize and apply than the traditional logistic model. Generally, the maximum GDD of a given cultivar of crop was stable in a certain region. The normalized model could characterize plant height and DMA growth dynamic of crops when maximum plant height, maximum DMA, and parameter b were obtained (Fu et al., 2009). The corresponding dry matter and plant height values can be obtained by substituting the RGDD into the equation.

In this study, the relationship between parameters a and b is a basic condition for establishing a single-parameter logistic model. This condition is obtained based on the normalized logistic model, and this study only includes winter wheat and summer maize. For other crops, it is still necessary to study the normalized logistic model, and then establish the corresponding simplified model. The RGDD used in this study can also represent the relative growth period of crops. Therefore, the relationship between the relative growth period of crops and growth indicators still needs to be further studied to clarify the internal relationship between their corresponding model parameters. In general, this study has certain reference significance for establishing a simplified logistic model for other crops.

# Conclusion

This paper normalizes the GDD, DMA, and plant height data of two major food crops. In the process of fitting parameters using a normalized logistic model, it was found that the a/b value is a relatively stable constant. Based on this opinion, single-parameter models of several crops were established. These parameters can provide theoretical support for precise regulation of crop plant height and DMA. It is concluded that single-parameter logistic models are appropriate for accurate prediction of DMA and plant height of typical food crops.

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