ORIGINAL PAPER

Compatible taper and volume systems for *Larix olgensis* **and** *Larix kaempferi* **in northeast China**

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Received: 18 March 2023 / Revised: 16 August 2023 / Accepted: 14 September 2023 / Published online: 29 September 2023 © The Author(s), under exclusive licence to Springer-Verlag GmbH Germany, part of Springer Nature 2023

Abstract

Accurate estimation of tree stem form and merchantable volume is an important prerequisite for forest management and economic evaluation. A system of compatible taper-volume equations was constructed for estimating the upper stem diameter and merchantable volume of diferent larch species in northeast China using *Larix olgensis* (LO) and *Larix kaempferi* (LK) as examples. Five common compatible taper-volume systems were evaluated by using the diameter, height, and cumulative volume data of 262 LO and 86 LK trees. The seemingly unrelated regression (SUR) was used for parameter estimation of the nonlinear simultaneous equations, and the power function was applied to eliminate the heteroscedasticity of the volume equations. Subsequently, the tree species were used as dummy variables to construct generalized equations suitable for the two species. Finally, the adjusted coefficient of determination (R_a^2) , root mean square error (RMSE), Akaike information criterion (AIC), RMSE%, condition number (CN), mean absolute bias (MAB) and mean percentage of bias (MPB) were used to evaluate the performance of the model. The segmented model outperformed the simple model, and in particular, the model presented by Fang (FS 46:1–12, 2000) exhibited the best performance in predicting diameter and volume. The Fang (FS 46:1–12, 2000) model explained the diference in stem form between both larch species, that is, LO had a higher upper infection point and a lower infection point than LK. The dummy variable model provides an efective approach to accurately predict stem diameter and volume variables for both species. The generalized equation can be used for simultaneous estimation of stem taper and merchantable volume for LO and LK in northeast China. Under the same conditions, LO has longer middle segments and better stem form than LK.

Keywords *Larix olgensis* · *Larix kaempferi* · Taper and volume equation systems · Compatible · Dummy variable · Generalized equation

Introduction

The trunk is an important component of trees, accounting for $60~\sim~70\%$ of tree volume (Li [2019](#page-13-0)). Volume is the main basis for evaluating tree economic value, and the quality of the stem form is also an important indicator for wood utilization. The taper equation is often used to describe the

Communicated by Tianjian Cao.

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stem profle in forestry. The taper equation describes how sharply the stem diameter becomes thinner with increasing height, and its mathematical expression is $d = f(h, H, D)$ (Li [2019\)](#page-13-0). The taper equation not only enables estimation of the diameter at any height of the stem or of the height at any diameter but also makes it possible to obtain the total volume of the trunk and the volume at any given position by integration. Because the taper equation is not afected by the change in material specifcations, it has become the preferred method for preparing volume and species yield tables (Meng [1982](#page-13-1); Jiang et al. [2016\)](#page-13-2). It is widely used in timber yielding and utilization, forest management planning, actual timber production, forest stock and biomass estimation, etc. (Jiang et al. [2005;](#page-13-3) Özçelik and Crecente-Campo [2016](#page-13-4); He et al. [2021\)](#page-13-5). Tree volume estimates are critical to constructing growth yield models, not only as an important way to evaluate forest health and productivity but also as a primary basis for determining the method and time of forest harvesting (Alkan and Özçelik [2020\)](#page-13-6). In recent years, with scientifc and technological developments, foresters have derived a consistent volume equation by integrating the taper equation. The consistent taper and volume equation system is highly compatible and can simultaneously estimate stem diameter, total volume and merchantable volume, providing fexibility for forest management and planning in the context of changing wood use standards (Quiñonez-Barraza et al. [2019](#page-13-7); Zhao et al. [2019\)](#page-14-0).

Stem taper is infuenced by a variety of factors, such as species (Özçelik et al. [2016](#page-13-8)), site quality (Lee et al. [2006](#page-13-9)), and management practices (Jiang and Liu [2011\)](#page-13-10); therefore, no single taper equation can be applied to all species or to the description of the stem profle of the same species in diferent regions (He et al. [2020](#page-13-11)). *Larix olgensis* (LO) and *Larix kaempferi* (LK) are the main timber trees in northeast China with good timber quality, fast growth rates and high yields, characteristics which have made important contributions to modernization of the Chinese economy. Foresters have conducted numerous studies on larch growth and yield models in terms of diameter at breast height (DBH) and tree height (TH) growth (Wang and Li [2018;](#page-13-12) Zhang et al. [2021](#page-14-1); Qiao and Sun [2022](#page-13-13)), stem taper and volume (Jiang et al. [2016](#page-13-2)), and forest stock and biomass (Fu et al. [2015;](#page-13-14) Jia and Chen [2019;](#page-13-15) Dong et al. [2022\)](#page-13-16). Previous studies have covered LO, LK and *Larix gmelinii* (LG) together as a whole or have focused on a single *Larix* species; however, the diferences and commonalities among the diferent species have rarely been reported. In recent years, researchers have developed a compatible volume-biomass system for diferent tree species by using dummy variables and mixed efects models that incorporate both geography and origin—a system that refects not only the relationship between biomass and independent variables but also the diferences in biomass among diferent tree species (Fu et al. [2015](#page-13-14); Zeng et al. [2019](#page-13-17)). In previous studies, the taper and volume system has been studied only for a specifc tree species or only for taper and total volume (Jiang et al. [2011\)](#page-13-18). However, studies on the compatible taper and merchantable volume equation systems of diferent larch species in northeast China are rarely reported.

The objectives of this study were to use destructive sampling to investigate the diameter and height data of LO and LK in northeast China to construct a system of compatible taper and volume equations and then construct a generalized equation appropriate for both larch species using species as dummy variables. With this approach, a reference can be provided for accurate estimation of the diameter and merchantable volume of diferent larch species in northeast China, offering insight into larch growth yield to inform management decisions.

Materials and methods

Study area

Larix kaempferi data were collected in 2017 and 2018 at Dagujia Forest Farm (Fig. [1\)](#page-1-0), which is located in northeast Qingyuan County, Fushun City, Liaoning Province, with

areas within Liaoning and Hei-China longjiang provinceLegend

Fig. 1 Location of the study

longitude 124°47′–125°12′ E and latitude 42°22′–42°16′ N and an altitude from 200 to 600 m. It belongs to the middle temperate continental climate, with long, cold winters, warm and rainy summers, an average annual temperature of 6 °C and an annual precipitation of 500–800 mm. The forest mainly consists of larch, *Pinus koraiensis*, *Picea asperata*, *Betula platyphylla*, *Tilia tuan* and other species.

Larix olgensis data were collected from the Mengjiagang Forest Farm in 2020. Mengjiagang Forest Farm is located in northeast Huanan County, Jiamusi City, Heilongjiang Province (Fig. [1\)](#page-1-0), with longitude 130°32′42″–130°52′36″E and latitude 46°20′16″–46°30′50″N and an altitude from 170 to 575 m. It has a temperate continental monsoon climate with long winters, average annual temperature of 2.7 °C and average annual precipitation of 550 mm. The forest farm is dominated by planted forests, and the main coniferous species are larch, *Pinus sylvestris* and *Pinus koraiensis*, as well as secondary broad-leaved mixed forests such as *Fraxinus mandshurica*, *Populus davidiana* and *Quercus mongolica*.

Data

LK sample trees were collected from 30 sample plots in Dagujia Forest Farm, and three trees (dominant, average and inferior) were felled in each plot for trunk analysis. A total of 90 LKs were collected. The LO sample trees were obtained from 9 clear-cut areas in the Mengjiagang Forest Farm, and 262 representative LOs were selected according to diameter and height grades. The diameter at breast height (DBH, 1.3 m), stump diameter $(d_0, 0.1 \text{ m})$, tree height (TH) and diameters at relative heights of 0.02, 0.04, 0.06, 0.08, 0.1, 0.2, 0.25, 0.3, 0.4, 0.5, 0.6, 0.7, 0.75, 0.8, and 0.9 were measured after felling the sample trees. Bole volumes were calculated with the Smalian formula, and the tip volumes were calculated with the cone equation. The collected LO and LK data were randomly divided into two groups with same number of trees, and the two-fold evaluation scheme was used to ft and test the model system (Bohora and Cao [2014](#page-13-19); Özçelik et al. [2018\)](#page-13-20). Removing sample trees with DBH less than 5 cm, the actual LK used for modeling was 86. The summary statistics for the LO and LK sample trees are shown in Table [1.](#page-3-0) Figure [2](#page-3-1) shows a local nonparametric quadratic ft of the two larch species using the PROC LOESS procedure in Statistical Analysis System (SAS) software. The scatter plot of the relative LO and LK diameter and height was assessed to remove outliers.

Methods

System of equations selected for comparison

The volume equation obtained by integrating the taper equation, or the taper equation derived by derivation of the volume equation, were combined into a compatible equation system. The volume calculated by the integral of the compatible taper equation is equal to the volume calculated by the volume equation, and the two equations provide consistent estimates to ensure consistency and logical interconversion between the tree volume table and the merchantable volume table $(L_i 2019)$ $(L_i 2019)$ $(L_i 2019)$. The two equations in the compatible system share one set of parameters to ensure the robustness of the model parameter estimation and the coordinated consistency of the calculated results, which is conducive to the standardization and serialization of forestry management (Zeng and Tang [2011](#page-13-21)). Based on previous research, this study adopted fve compatible taper and volume equation systems commonly used in forestry: those presented in Goulding ([1976\)](#page-13-22), Max [\(1976](#page-13-23)), Cao ([1980\)](#page-13-24), Fang [\(2000](#page-13-25)) and Zhao ([2017\)](#page-14-2).

The Goulding and Murray ([1976](#page-13-22)) equation, which uses a power function of relative height to defne the stem profle, was originally introduced by Demaerschalk ([1972\)](#page-13-26) to develop a compatible volume system (Diéguez-Aranda et al. [2006](#page-13-27)). In the present study, it is rewritten as follows:

$$
\begin{cases}\n d^2 = \frac{a_0 DB H^{a_1} T H^{a_2}}{k T H} \left(b_1 z + b_2 z^2 + b_3 z^3 + b_4 z^4 + b_5 z^5 \right) \\
 V_m = a_0 DB H^{a_1} T H^{a_2} - a_0 DB H^{a_1} T H^{a_2} \left(\frac{b_1}{2} z^2 + \frac{b_2}{3} z^3 + \frac{b_3}{4} z^4 + \frac{b_4}{5} z^5 + \frac{b_5}{6} z^6 \right)\n \end{cases} \tag{1}
$$

where *d* is the diameter at height *h* (cm), *DBH* is the diameter at breast height (cm), *TH* is the total tree height (m), *h* is the stem height from the butt (m) , V_m is the merchantable volume (m^3) , a_i , b_i are model parameters, $Z = (TH - h)/TH$, and *k* is a metric constant for converting from diameter squared in cm² to cross section area in m², $k = \pi/40000$.

The Max and Burkhart [\(1976\)](#page-13-23) equation is currently the most applied segmented taper equation with the highest accuracy (Jiang et al. [2011\)](#page-13-18), and Zhao et al. [\(2019](#page-14-0)) integrated it to obtain the following merchantable volume equation.

$$
\begin{cases}\n d^2 = DBH^2 \left[b_1(q-1) + b_2(q^2-1) + b_3(p_1-q)^2 I_1 + b_4(p_2-q)^2 I_2 \right] \\
 V_m = kDBH^2 TH \left\{ \frac{b_3 p_1^3 + b_4 p_2^3}{3} + \frac{b_1}{2} q^2 + \frac{b_2}{3} q^3 - \left(b_1 + b_2 \right) q - \frac{b_3}{3} \left(p_1 - q \right)^3 I_1 - \frac{b_4}{3} \left(p_2 - q \right)^3 I_2 \right\}\n\end{cases}
$$
\n(2)

 $I_1 = 1$, if $q \leq p_1$; 0 otherwise

 $I_2 = 1$, if $q \leq p_2$; 0 otherwise

Species	Variable	Group 1						
		$\mathbf n$	Mean	Minimum	Maximum	SD	CV	
Larix olgensis $(n=262)$	DBH/cm	131	21.01	7.70	40.30	6.66	31.69	
	TH/m		22.27	8.40	30.90	4.56	20.48	
	d/cm		16.61	0.60	60.50	8.36	50.32	
	h/m		7.93	0.10	27.81	7.04	88.81	
	Vm/m^3		0.2327	0.0119	1.5802	0.2493	107.13	
	V/m^3		0.4490	0.0239	1.5823	0.3022	67.32	
Larix kaempferi ($n = 86$)	DBH/cm	43	14.26	5.60	28.10	5.68	39.82	
	TH/m		15.22	6.78	26.60	5.60	36.77	
	d/cm		11.35	0.70	38.50	6.40	56.38	
	h/m		5.41	0.10	23.94	5.28	97.59	
	Vm/m^3		0.0899	0.0002	0.6757	0.1262	140.34	
	V/m^3		0.1731	0.0090	0.6772	0.1734	100.20	
Species	Variable	Group 2						
		$\mathbf n$	Mean	Minimum	Maximum	${\rm SD}$	${\rm CV}$	
Larix olgensis $(n=262)$	DBH/cm	131	21.26	7.30	43.50	7.61	35.78	
	TH/m		20.89	8.90	27.60	5.24	25.08	
	d/cm		16.59	$0.80\,$	58.80	9.00	54.25	
	h/m		7.44	0.10	24.84	6.75	90.76	
	Vm/m^3		0.2302	0.0006	1.7564	0.2657	115.38	
	V/m^3		0.4404	0.0226	1.7593	0.3370	76.51	
Larix kaempferi ($n = 86$)	DBH/cm	43	14.87	5.50	28.10	5.81	39.07	
	TH/m		16.12	6.35	27.72	5.97	37.03	
	d/cm		11.81	0.74	35.20	6.62	56.09	
	h/m		5.74	0.10	24.95	5.60	97.62	
	Vm/m^3		0.1034	0.0001	0.7837	0.1423	137.61	
	V/m^3		0.1994	0.0079	0.7846	0.1933	96.96	

Table 1 Summary statistics for *Larix olgensis* and *Larix kaempferi* sample trees

DBH diameter at breast height (cm), *TH* total tree height (m), *d* diameter at height *h* (cm); *h* stem height from the butt (m), *V* total volume, V_m merchantable volume, *SD* standard deviation, *CV* coefficient of variation

Fig. 2 Data points for relative diameter and relative height plotted with a local regression loess smoothing curve (smoothing factor=0.2) for each larch species

where p_1 and p_2 are the relative heights at the lower and upper infection points of the stem, respectively, *q*=*h*/*TH*, all other variables as previously defned.

The Cao and Burkhart ([1980\)](#page-13-24) equation is derived from the volume ratio equation. This equation system is used to estimate the volume of the stem at any height, and its merchantable volume is converted from the total volume (Quiñonez-Barraza et al. [2019](#page-13-7)).

$$
\begin{cases}\n d^2 = -\frac{a_0 \text{DBH}^{a_1} \text{TH}^{a_2}}{k} b_1 b_2 \left[\frac{(\text{TH}-h)^{b_2-1}}{\text{TH}^{b_3}} \right] \\
 V_m = a_0 \text{DBH}^{a_1} \text{TH}^{a_2} \left\{ 1 + b_1 \left[\frac{(\text{TH}-h)^{b_2}}{\text{TH}^{b_3}} \right] \right\}\n \end{cases}\n \tag{3}
$$

All variables as previously defned.

Fang et al. [\(2000](#page-13-25)) presented a taper model proposed for stems with two infection points that divide the stem into three parts with different shapes. b_1 , b_2 , and b_3 are the shape factors of the corresponding segments, and p_1 and p_2 are the relative positions of the two infection points. The equations were mainly used for the study of pine species, and they have good statistical performance and low multicollinearity in estimating stem diameter, total volume and merchantable volume (Li and Weiskittel [2010\)](#page-13-28).

Heteroscedasticity

Heteroscedasticity is a common problem in forest modeling, especially in volume equations (Parresol [1993](#page-13-29)). The presence of heteroscedasticity will lead to inaccuracy in the parameter estimation and prediction intervals. Weighted regression or logarithmic transformation methods are commonly used in forestry to eliminate heteroscedasticity (Diéguez-Aranda et al. [2006;](#page-13-27) Wang et al. [2014](#page-13-30); Quiñonez-Barraza et al. [2019\)](#page-13-7). The logarithmic transformation process is prone to errors, so this study adopts the weighted regression method to correct for heteroscedasticity. According to relevant literature (Quiñonez-Barraza et al. [2014](#page-13-31); López-Martínez et al. [2020](#page-13-32); Zhang et al. [2022](#page-14-3)), DBH and TH are used as independent variables, and the power function of residual variance $(\sigma_i^2 = (DBH^2TH)^{\varphi})$ is used as the error variance function. The estimated error of the unweighted model \hat{e}_i^2 is used as the dependent variable $\hat{e}_i^2 = \varphi_0 (\overrightarrow{DBH}^2TH)^{\varphi_1}$ in the error variance model, and the parameters are estimated in SAS/ETS PROC MODEL.

$$
\begin{cases}\n d = c_1 \sqrt{TH^{(k-b_1)/b_1}(1-q)^{(k-\beta)/\beta} q_1^{J_1+J_2} q_2^{J_2}} \\
 V_m = c_1^2 TH^{k/b_1} \Big[b_1 t_0 + (J_1 + J_2)(b_2 - b_1) t_1 + J_2 (b_3 - b_2) q_1 t_2 - \beta (1-q)^{k/\beta} q_1^{J_1+J_2} q_2^{J_2} \Big]\n \end{cases}\n \tag{4}
$$

$$
c_1 = \sqrt{a_0 DB H^{a_1} TH^{a_2 - k/b_1} / [b_1(t_0 - t_1) + b_2(t_1 - q_1 t_2) + b_3 q_1 t_2]};
$$

\n
$$
t_0 = (1 - p_0) k/b_1; t_1 = (1 - p_1)^{k/b_1}; t_2 = (1 - p_2)^{k/b_2};
$$

\n
$$
q_1 = (1 - p_1)^{\frac{(b_2 - b_1)k}{b_1 b_2}}; q_2 = (1 - p_2)^{\frac{(b_3 - b_2)k}{b_2 b_3}}; \beta = b_1^{1 - (J_1 + J_2)} b_2^{J_1} b_3^{J_2};
$$

\n
$$
p_0 = h_0 / TH; p_1 = h_1 / TH; p_2 = h_2 / TH
$$

\n
$$
J_1 = 1, if \ p_1 \le q \le p_2; 0, otherwise
$$

\n
$$
J_2 = 1, if \ p_2 < q < 1; 0, otherwise
$$

where h_0 is the stump height; 0.1 m, h_1 , h_2 are the heights of the lower and upper infection points (*m*), respectively, all other variables as previously defned.

Zhao and Kane [\(2017\)](#page-14-2) developed a variable merchantable volume equation based on the cumulative relative distribution of height, which in essence is a partial derivative of the volume ratio function for the upper height of the stem to derive the corresponding taper equation (Quiñonez-Barraza et al. [2019](#page-13-7)):

resid. $V_m = \text{resid.} V_m / \left[\left(DBH^2 T H \right)^{\varphi} \right]^{0.5}$

Generalized equation

There are some diferences in stem form between LO and LK. To more accurately reflect their differences and to

$$
\begin{cases}\nd^2 = \frac{b_1}{kTH}a_0DBH^{a_1}TH^{a_2}(1-q)^{b_1-1}\left\{1-b_2 \exp\left[-\exp\left(b_3DBH^{a_1}TH^{a_2}\right)\right]\right\}\left[1-(1-q)^{b_1}\right]\left\{-b_2 \exp\left[-\exp\left(b_3DBH^{a_1}TH^{a_2}\right)\right]\right\} \\
V_m = a_0DBH^{a_1}TH^{a_2}\left[1-(1-q)^{b_1}\right]\left\{-b_2 \exp\left[-\exp\left(b_3DBH^{a_1}TH^{a_2}\right)\right]\right\}\n\end{cases}\n\tag{5}
$$

improve the generality and practicability of the equations, compatible stem taper and merchantable volume equations appropriate for both were constructed using the tree species as dummy variables. The dummy variables are denoted by S, i.e., *S*=1 for LO and *S*=0 for LK. All parameters in Eq. (1) (1) – (5) (5) are assumed to depend linearly on these dummy variables:

$$
AIC = n \log \left(\sum_{i=1}^{n} \frac{\left(y_i - \hat{y}_i \right)^2}{n} \right) + 2p \tag{10}
$$

where y_i and \hat{y}_i are the measured and predicted diameter or V_m at different height; *n* is the total number of observations;

$$
a_0 = a_{01} + a_{02}S; a_1 = a_{11} + a_{12}S; a_2 = a_{21} + a_{22}S; b_1 = b_{11} + b_{12}S;
$$

\n
$$
b_2 = b_{21} + b_{22}S; b_3 = b_{31} + b_{32}S; b_4 = b_{41} + b_{42}S;
$$

\n
$$
b_5 = b_{51} + b_{52}S; p_1 = p_{11} + p_{12}S; p_2 = p_{21} + p_{22}S
$$
 (6)

where a_{i1} , b_{i1} , and p_{i1} are model fixed parameters and a_{i2} , b_{i2} , and p_i ² are dummy variable parameters. Substituting (6) into Eq. (1) (1) – (5) (5) results in the dummy variable model for describing stem diameter and merchantable volume varying across the two species.

Fitting and evaluation of models

To minimize the error of taper and volume, the taper and volume equations for each model system are ftted simultaneously by tree species in SAS PROC MODEL using seemingly unrelated regression (SUR) based on diameter and cumulative volume data at each relative height. Parameter estimation is performed by solving nonlinear simultaneous equations (Jiang et al. [2011](#page-13-18)), with the taper and volume equations sharing a set of parameters. The adjusted coefficient of determination (R_a^2) , root mean square error (RMSE), RMSE%, Akaike information criterion (AIC), and condition number (CN) were used as model ftting statistical criteria. The condition number (CN) assesses whether there is a multicollinearity problem among the variables of the model system. Generally, if the CN is less than 30, then collinearity is not a problem; if the CN is between 30 and 100, then there are associated problems of multicollinearity, but the model is acceptable; and if the CN is greater than 100, then there is serious multicollinearity (Belsley [1991](#page-13-33)). The expressions of these statistical criteria are:

$$
R_a^2 = 1 - \frac{\sum_{i=1}^n (y_i - \hat{y}_i)^2}{\sum_{i=1}^n (y_i - \bar{y})^2} \times \left(\frac{n-1}{n-p}\right)
$$
 (7)

RMSE =
$$
\left[\frac{\sum_{i=1}^{n} (y_i - \hat{y}_i)^2}{n - p}\right]^{0.5}
$$
 (8)

$$
RMSE\% = \frac{RMSE}{\bar{y}} \times 100\tag{9}
$$

 \overline{y} is the mean of y_i ; and p is the number of estimated parameters in a model.

In this study, the data were randomly divided into two groups, each contained the same number of trees. We used the two-fold evaluation scheme (Ozçelik et al. [2018\)](#page-13-20), in which parameters of the equation systems fitted to one group was applied to predict for the other group. The predictions from both groups were then used to calculate evaluation statistics for the equation systems. The mean absolute bias (MAB) and the mean percentage of bias (MPB) were used as the model evaluation criteria. The expressions for the test criteria are:

$$
MAB = \frac{1}{n} \sum_{i=1}^{n} |y_i - \hat{y}_i|
$$
 (11)

$$
MPB = \frac{\sum_{i=1}^{n} |y_i - \hat{y}_i|}{\sum_{i=1}^{n} y_i} \times 100
$$
 (12)

All variables as previously defned.

Results

Compatible taper and volume equations system

Table [2](#page-6-0) shows the parameter estimates and standard errors of the simultaneous ftting taper and volume equation systems of *Larix olgensis* and *Larix kaempferi*. For LK, all parameters were significant ($P < 0.05$) except $b₁$ in the equation of Goulding ([1976\)](#page-13-22) and b_2 in the equation of Zhao ([2017\)](#page-14-2). The equations from Max ([1976\)](#page-13-23) and Fang ([2000](#page-13-25)) are segmented taper equations, and they both have two infection points p_1 and p_2 , which divide the stem into three parts (neiloid, paraboloid and cone). However, the positions of the infection points for these two equations are diferent. For LO, the lower and upper infection points with the Max ([1976\)](#page-13-23) equation were 0.036 and 0.909, respectively, while the lower and upper infection points with the Fang [\(2000\)](#page-13-25) equation were

Table 3 Fitting and testing statistical criteria of the basic taper and volume model system

LO *Larix olgensis*, LK *Larix kaempferi*, d stem diameter (cm), V_m merchantable volume (m³)

0.027 and 0.726, respectively. For LK, the lower and upper infection points with the Max [\(1976\)](#page-13-23) equation were 0.055 and 0.798, respectively, while the lower and upper infection points with the Fang (2000) equation were 0.030 and 0.663, respectively. The lower infection points with the Max [\(1976](#page-13-23)) equation for LO and LK were only slightly diferent, but the upper infection points difered by approximately 10%. For the Fang ([2000\)](#page-13-25) equation, the upper infection point of LO was higher than that of LK.

Table [3](#page-7-0) shows the statistics for goodness of ft, RMSE%, condition number (CN) and test criteria of the taper and volume equations of both larches. For LO, the R_a^2 of all the taper equations were above 0.95 except for in the case of the Cao (1980) (1980) Equation (0.921) . The Fang (2000) (2000) equation performed slightly better than the Max ([1976](#page-13-23)) equation, with RMSEs of diameter and V_m of 1.04 and 0.0148, respectively. The merchantable volume equation had a good fitting effect, with an accuracy of more than 99%. In the model test, the mean absolute bias (MAB) for diameter ranged from 0.83 to 1.28 cm and was less than 0.0128 m^3 for merchantable volume; the mean percentage of bias (MPB) for both taper and merchantable volume was less than 7.72%. For LK, all fve taper equations explained more than 97% of the variation in diameter. Similarly, the ftting accuracy of the merchantable volume equations was more than 99%. The Fang [\(2000](#page-13-25)) and Zhao ([2017\)](#page-14-2) equation had the lowest multicollinearity, while

the Fang ([2000](#page-13-25)) equation had the best overall performance. In the model test, the mean absolute bias (MAB) for diameter was less than 0.85 cm (less than that of LO) and less than 0.0051 m^3 for merchantable volume. The mean percentage of bias (MPB) of both taper and merchantable volume were less than 7.3%.

The Goulding [\(1976](#page-13-22)), Max ([1976\)](#page-13-23) and Cao [\(1980](#page-13-24)) equations had strong multicollinearity. For both LO and LK, the Fang [\(2000](#page-13-25)) model had the smallest AIC and RMSE%, the condition number (CN) was less than 100, and the model had the best performance in terms of ft and test statistical criteria. Therefore, the Fang [\(2000\)](#page-13-25) model was selected as the optimal base model in this study to establish a generalized larch taper and volume equation system appropriate for northeast China with species as dummy variables.

In this study, a power function $(DBH²TH)$ of the variance covariate was used for weighted regression in ftting the model, and the heteroscedasticity of the volume equation was corrected. Figure [3](#page-8-0) shows the standardized residual plots of the unweighted and weighted merchantable volume for the two larch species from the Fang (2000) model. In Fig. [3](#page-8-0)A and C are the uncorrected residual distributions for LO and LK, respectively. It can be seen from the fgure that both scatter plots are trumpet shaped, indicating that the volume has variance heterogeneity. The model was then corrected by the variance function, and the resulting

Fig. 3 Unweighted and weighted standardized residual distributions of the Fang (2000) model for LO and LK

standardized residual distributions of LO and LK are shown in Fig. [3B](#page-8-0) and D. The model residuals are evenly distributed, and the heteroscedasticity was eliminated. The other models had similar results, so we will not go into detail here.

A, unweighted residual distribution of the LO merchantable volume equation; B, weighted residual distribution of the LO merchantable volume equation; C, unweighted residual distribution of the LK merchantable volume equation; D, weighted residual distribution of the LK merchantable volume equation.

Dummy variable model

Based on the optimal basic model of Fang (2000), a generalized equation applicable to both larch species was constructed with tree species as dummy variables, and the model parameters and statistics are shown in Tables [4](#page-8-1) and [5](#page-9-0). Model 4 is an overall model without distinguishing tree species, and Model 6 is a generalized equation with tree species as a dummy variable. We used the overall data to ft Model 4 and Model 6.

Table 4 Parameters of the overall Model 4 and generalized Model 6

Model	Parameters										
	a_0	a ₁	a ₂	b ₁	b ₂	b ₃	p_1	p ₂			
(4)	5.200E-05	1.9335	0.9640	2.725E-06	$3.500E - 0.5$	2.700E-05	0.027	0.702			
(6)	a_{01} 5.500E-05	a_{11} 1.9643	a_{21} 0.9297	b_{11} $4.210E - 06$	b_{21} $3.600E - 0.5$	b_{31} $2.600E - 05$	p_{11} 0.031	p_{21} 0.687			
	a_{02} $1.300E - 0.5$	a_{12} 0.0168	a_{22} 0.0632	b_{12} $-2.850E - 07$	b_{22} $-5.520E - 06$ $5.420E - 06*$	b_{32}	p_{12} -0.019	p_{22} 0.029			

An asterisk (*) indicates nonsignifcant parameters at *P*<0.05

Table 5 LO and LK's ftting and testing statistical criteria based on the dummy variable Model 6

LO *Larix olgensis*, LK *Larix kaempferi*, d stem diameter (cm), V_m merchantable volume (m³)

There was little difference in the fixed parameters between the overall model and the dummy variable model (Table [4\)](#page-8-1). The Fang ([2000](#page-13-25)) equation is a segmented taper equation with two infection points, and the dummy variable parameters p_{12} and p_{22} are important for distinguishing the species infection points and accurately calculating the diameter and volume of diferent species. The dummy variable parameter p_{12} was less than 0 (−0.019), which means that the lower stem infection point for LK was higher than that for LO under the same conditions; p_{22} was greater than 0 (0.029), indicating that the upper stem infection point for LO was higher than that of LK. This is similar to the location of the upper and lower infection points calculated by ftting LO and LK separately.

Model performance

In this study, the overall model and the dummy variable model explained more than 98% and approximately 99.5% of the variation in diameter and merchantable volume, respectively. The root mean square error (RMSE), AIC, and RMSE% of the dummy variable model were smaller than those of the overall model, and the test criteria (MAB, MPB) were also smaller than those of the overall model. In general, the dummy variable model presents advantages in statistics of ft compared to the overall model for both larch types. The results of LO and LK based on the dummy variable model are shown in Table [5.](#page-9-0) Compared with the results of Fang ([2000](#page-13-25)) model in Table [3](#page-7-0), both are almost identical, and the dummy variable model still outperforms other models. Figure [4](#page-10-0) shows the standardized residual distributions of the overall model (A, B, C, D) and the dummy variable model (E, F, G, H) for LO and LK. Similar to the optimal model of Fang ([2000\)](#page-13-25), the uncorrected residual distributions are trumpet shaped, and weighted regression eliminates heteroscedasticity.

A and E, unweighted residual distribution of the LO merchantable volume equation; B and F, weighted residual distribution of the LO merchantable volume equation; C and G, unweighted residual distribution of the LK merchantable volume equation; D and H, weighted residual distribution of the LK merchantable volume equation.

To verify the applicability and accuracy of the dummy variable model, the parameters of Model 6 were used to predict the stem diameter and volume of the relative height classes of the two larch species in this study. The mean absolute bias (MAB) and the mean percentage of bias (MPB) of the estimates are shown in Table [6](#page-11-0). At a relative height of 0.9–1, the MAB of the LO diameter was equal to 0.91 cm, and the MAB of the LK diameter was also the largest at this position, while the others were all less than 0.90 cm. The MPB of both larch species below a relative height of 0.8 was less than 10%. The MAB of the LO merchantable volume ranged from 0.0031 to 0.0191 m^3 ; that of LK ranged from 0.0009 to 0.0060 m³; and the MPB of both larch species was relatively stable (LO: 2.97–5.73%; LK: 2.61–4.43%). In general, the dummy variable Model 6 performed better for both LO and LK in terms of diameter and volume at relative height classes; it is therefore very suitable for describing the shapes of stems and can be used as a general equation for both species of larch in northeast China.

Discussion

Larix olgensis and *Larix kaempferi* are two important tree species in northeast China, and their taper and merchantable volume are crucial evaluation criteria for forest production, yield and management. Due to the variety of taper and volume equation forms, it is difficult to select an appropriate model that is applicable to multiple species and to the conditions of each stand. Most previous studies have ftted the taper equation or the volume equation separately (Corral-Rivas et al. [2007](#page-13-34); Li and Weiskittel [2010](#page-13-28); Shahzad et al. [2020](#page-13-35)), which may lead to large deviations in the calculation of trunk volume, and few researchers have connected the two to construct a consistent model system (Jiang et al. [2011](#page-13-18)). On the other hand, Zeng and Liao [\(1997\)](#page-13-36) indicated that the compatible taper equation (variable model in his article) was afected by the constraint of the volume equation. Fang et al. [\(2000](#page-13-25)) developed a compatible segmented taper and volume equation system. In this study, we used Fang's segmented model, the goodness-of-ft of the compatible taper and volume equation did not loss.

Fig. 4 Unweighted and weighted standardized residual distributions of the overall model (A, B, C, D) and the dummy variable model (E, F, G, H) for LO and LK

Table 6 Mean absolute bias (MAB) and the mean percentage of bias (MPB) of the estimate by relative height (RH) class for both diameter and volume for *Larix olgensis* and *Larix kaempferi*

The relative height (RH) interval is upper limit excluded. For example, 0.1–0.2 means 0.1≤RH<0.2

In this study, fve compatible taper and volume model systems, including simple and segmented models, were compared. The taper and volume equations for each system were ftted simultaneously using seemingly unrelated regression (SUR) in the SAS PROC MODEL procedure to minimize diameter and volume errors. All fve equation systems demonstrated good predictive performance, and the segmented model performed better than the simple model in the estimation of diameter and volume. Among the simple models, the Zhao (2017) (2017) (2017) equation has a simple form, few parameters, and good ftting and testing results, which indicate that it can be popularized and utilized in general forestry production (Zhao and Kane [2017;](#page-14-2) Zhao et al. [2019](#page-14-0)). The Fang [\(2000](#page-13-25)) and Max [\(1976](#page-13-23)) models are segmented models, which divides the trunk into three parts with two infection points, upper and lower, and describes the variation in the profles of the stem at diferent positions in more detail, so the estimation of diameter and volume is more accurate (Fang et al. [2000;](#page-13-25) Quiñonez-Barraza et al. [2019](#page-13-7); Hussain et al. [2020](#page-13-37); López-Martínez et al. [2020](#page-13-32)). In this study, both larch species had higher upper and lower infection points when these values were calculated by the Max ([1976](#page-13-23)) model than when they were calculated by the Fang [\(2000\)](#page-13-25) model, and the same results were obtained in a study of *Larix gmelinii* (Hussain et al. [2020](#page-13-37)). In addition, stem form is also infuenced by site quality (Lee et al. [2006\)](#page-13-9), management practices (Jiang and Liu 2011), and temperature and precipitation (Ozçelik et al. [2016](#page-13-8)). Although both the Max ([1976](#page-13-23)) and Fang ([2000\)](#page-13-25) models are segmented models, the Fang ([2000\)](#page-13-25) equation provides better overall performance than the Max ([1976](#page-13-23)) equation in estimating diameter and merchantable volume (Quiñonez-Barraza et al. [2014;](#page-13-31) López-Martínez

et al. [2020](#page-13-32)), and the Fang ([2000\)](#page-13-25) model exhibited lower multicollinearity in this study.

In this study, the compatible taper and volume system of Fang ([2000\)](#page-13-25) provided the best predictive performance. On the one hand, the original Fang [\(2000](#page-13-25)) equation was developed with pine species as the research object (Fang et al. [2000;](#page-13-25) Li and Weiskittel [2010](#page-13-28)), which corresponded to the objective species of this study; on the other hand, the two infection points more suitably represented the trunk profle, which also helped in the accurate estimation for LO and LK. At present, the Fang ([2000\)](#page-13-25) taper equation is rarely reported in the literature, and there are even fewer volume equations compatible with it, mainly because its formula is complex and the model does not easily converge. However, because the Fang [\(2000](#page-13-25)) formula is complex, it has greater accuracy, fexibility and applicability (Fang et al. [2000;](#page-13-25) Quiñonez-Barraza et al. [2014;](#page-13-31) Hussain et al. [2020;](#page-13-37) López-Martínez et al. [2020](#page-13-32)).

Heteroscedasticity is often present in the modeling of the volume equation, and in previous papers, most researchers used the power function ($DBH²TH$) as the weight function to correct it (Quiñonez-Barraza et al. [2014;](#page-13-31) López-Martínez et al. [2020\)](#page-13-32). This study used the same method to correct the heteroscedasticity. The distribution of the corrected residuals was uniform, and heteroscedasticity was eliminated. Notably, Zhang et al. ([2022\)](#page-14-3) used three kinds of weighting functions (power function, exponential function and constant plus power function) to address the heteroscedasticity of the volume equation, and the volume model performed best when the predicted value V was used as the function variable for correction. In future research, diferent variance functions can also be tried to correct the heteroscedasticity of the compatible taper and volume equations system.

Dummy variables have wide application in forestry modeling of biomass, carbon stock, and stand basal area (Castedo-Dorado et al. [2007;](#page-13-38) Zeng [2015;](#page-13-39) Jia et al. [2019\)](#page-13-40), which can enable good integration of the simultaneous estimation problems for diferent stand types, diferent management practices, and diferent study areas and species, but they are rarely used in taper and volume modeling. Subati and Jia ([2021](#page-13-41)) used geographical regions as dummy variables to construct an additive model system for heartwood, sapwood and bark taper for a *Pinus koraiensis* plantation in Heilongjiang Province, China, which did not explain the geographical diferences represented by the dummy variables, although the model accuracy and applicability were improved. Fu et al. ([2015\)](#page-13-14) constructed a generalized equation for the aboveground biomass of *Larix gmelinii* and *Larix olgensis* in northeast China with tree species as dummy variables and explained the biomass diference between both species refected by the dummy variable parameters. The overall model has a bias in the estimation of LK (Fig. [4C](#page-10-0) and D), and the standardized residuals are biased upward for V_m greater than 0.3 m³, which may be related to the samples used. For LO, the optimal model, the overall model and the dummy variable model do not difer signifcantly. The dummy variable segmented model of Fang ([2000](#page-13-25)), constructed based on the tree species factor, refected the diferences in stem curves among tree species quite well. In the separate modeling of both tree species, the lower infection point for LO was lower than that for LK, and the upper infection point was higher than that for LK. The infection points estimated by the dummy variable model produced similar results, i.e., the middle segment (paraboloid) for LO was longer than that for LK, which can be interpreted in forestry as LO having a better stem form index and being able to produce a higher yield. Therefore, the Fang ([2000\)](#page-13-25) equation is applicable to the compatible taper and volume model system that includes diferent tree species, and the introduction of dummy variables not only circumvents the problem of repeated modeling but also explains the diferences in trunk form among diferent tree species. In addition, a mixed model with tree species as random efects can also refect the diferences among diferent species (Zeng et al. [2011](#page-13-42); Xie et al. [2022\)](#page-13-43), which are not explained in this study because there were only two species, i.e., fewer species variables. In the future, multiple tree species can be collected for further research.

There was also a signifcant diference between LO and LK in the diameter and volume predicted by the dummy variable model. The error for LO was slightly larger than that for LK, probably due to the DBH size of the sample trees (LO: 7.3–43.5 cm; LK: 5.5–28.1 cm). For relative heights between 0.0–0.2 and 0.7–0.9, both tree species showed larger estimation errors than at other height intervals. These relative height classes are related to trunk butt swell and the point at the base of the canopy (Jiang et al. [2005\)](#page-13-3).

In this study, tree species were used as dummy variables to solve the problem of compatibility between diferent species variables and simultaneous modeling of taper and volume, improving the prediction accuracy and applicability to a certain extent, and simplifying the modeling process. It is advantageous to construct a generalized biomathematical model, which has important reference signifcance in related forestry research (Zeng et al. [2019\)](#page-13-17).

Conclusions

We used LO and LK as the objects of the study, and the power function ($DBH²TH$) was used to eliminate the heteroscedasticity of the volume equation and to construct a compatible taper and volume model system appropriate for diferent tree species by introducing dummy variables. The results showed that fve compatible model systems could accurately predict stem diameter and merchantable volume, with the Fang ([2000\)](#page-13-25) equation having the best statistical criteria and prediction performance. The Fang [\(2000\)](#page-13-25) equation was not only able to predict the diameter and volume of stems at any given position but could also accurately characterize the diferences in stem profle between the two tree species, which indicates the wide applicability and fexibility of the equation in forest production, yield and management. The infection points estimated by the Fang [\(2000](#page-13-25)) equation system showed that LO has a longer middle section and shorter tip than LK, i.e., LO has a better stem form and produces more merchantable volume with higher yield for the same DBH and TH.

Acknowledgements We would like to thank Dongsheng Chen's team at the State Forestry Administration Key Laboratory for Forest Tree Breeding, Research Institute of Forestry, Chinese Academy of Forestry, for providing data support. We also thank Mengjiagang Forest Farm and its staff for their help in the field activities.

Author contributions Conceptualization contributed by DL, WJ; methodology contributed by DL, HG; formal analysis and investigation contributed by DL, HG, YS, FW; writing—original draft preparation contributed by DL; writing—review and editing contributed by DL, WJ, YS; funding acquisition contributed by WJ; supervision contributed by WJ.

Funding This research was funded by the Joint Funds for Regional Innovation and Development of the National Natural Science Foundation of China (Grant No. U21A20244).

Declarations

Competing interests The authors declare no competing interests.

Conflict of interest The authors have no confict of interest to declare that are relevant to the content of this article.

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