



# Allometric equations and wood density parameters for estimating aboveground and woody debris biomass in Cajander larch (*Larix cajanderi*) forests of Northeast Siberia

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**Abstract.** Boreal forests are particularly vulnerable to climate warming which increases the occurrence of natural disturbances, such as fires and insect outbreaks. It is therefore essential to better understand climate-induced changes in boreal vegetation dynamics. This requires accurate estimates of variations in biomass across regions and time. This remains  
10 challenging in the extensive larch forests of Northeast Siberia because of the paucity of allometric equations and physical properties of woody debris needed for quantifying aboveground biomass pools from field surveys. Our study is the first to present values of mean squared diameter (MSD) and specific gravity that can be used to calculate fine dead and downed woody fuel loads in Cajander larch (*Larix cajanderi*) forests using the line-intersect sampling approach. These values were derived from field measurements collected in 25 sites in the Republic of Sakha, Russia, and compared with values reported  
15 for other prevalent boreal tree species. We developed allometric equations relating diameter at breast height (DBH) to stem wood, stem bark, branches, foliage, and aboveground biomass based on measurements of 63 trees retrieved from previous studies. Differences between our allometric models and existing equations were assessed in predicting larch aboveground biomass in 53 sites sampled in the Republic of Sakha. We found that using fine woody debris (FWD) parameters from other boreal tree species and allometric equations developed in other regions may result in significant underestimates of fuel  
20 biomass in larch-dominated forests of Northeast Siberia. The FWD parameters and allometric equations presented in our paper can be used to refine estimates of aboveground biomass in Cajander larch forests in Northeast Siberia.

## 1 Introduction

The boreal forest represents the largest remaining forest on Earth and covers large areas of the high northern latitudes (FAO, 2020). The boreal forest stores nearly a quarter of the global terrestrial carbon pool (Scharlemann et al., 2014), and as such  
25 plays a major role in the global carbon cycle. In addition to its role of a long-term carbon sink (Goodale et al., 2002; Gurney et al., 2002; Pan et al., 2011), boreal forests influence energy and water fluxes through biogeophysical processes associated with surface albedo and evapotranspiration (Bonan et al., 1992; Thomas and Rowntree, 1992). The accelerated warming observed in the boreal regions (Serreze et al., 2009; Cohen et al., 2014) is predicted to increase the extent, frequency, and severity of natural disturbances such as fires (Kasischke and Turetsky, 2006; Flannigan et al., 2009; De Groot et al., 2013)



30 and insect outbreaks (Bale et al., 2002; Gustafson et al., 2010), thereby invoking aboveground biomass losses. These changes in land cover may have significant impacts on multiple forcing agents, including from greenhouse gases and aerosols, and through alterations in surface albedo (Bonan et al., 1995; Randerson et al., 2006). Quantifying variations in forest biomass and productivity across regions, ecosystems, and time is therefore essential for assessing climate-induced changes in boreal vegetation dynamics and feedback mechanisms.

35 Estimating forest carbon stocks is possible from various techniques from local field inventories to spaceborne assessment at regional to global scales (Picard et al., 2012). Remote sensing is an effective tool for forest structure assessments as it provides repeated information over large areas of interest in a cost-effective manner. Indirect measurements of biomass stocks are based on relationships between remotely sensed proxies and detailed field measurements of biomass. In addition to calibrating and validating remotely sensed measurements and constraining biogeochemical models, field measurements  
40 provide a level of detail of the vertical and horizontal structure of biomass that are unmatched from other methods. For example, field-based surveys are required to assess the spatial distribution of dead and downed woody debris (DWD) on the forest floor (Woodall et al., 2008).

DWD is a major component in forest ecosystem functioning. It plays a fundamental role in carbon storage (Woodall et al., 2013), influences other nutrient cycles (Finér et al., 2003; Graham and Cromack, 1982), facilitates tree regeneration (Weaver  
45 et al., 2009), and serves as habitat for several plant and animal species (Harmon et al., 1986; Freedman et al., 1996). DWD is also an important controlling factor of forest fire behavior (Rothermel, 1972). DWD fuel load affects surface fire intensity (Byram, 1959; Alexander, 1982) and can trigger the transition between surface and crown fire regimes (Van Wagner, 1977). Fuel size is also critical in fire behavior prediction as the surface area-to-volume ratio determines fuel moisture and combustion efficiency (Byram, 1959). Ignition and consumption are generally larger for smaller diameter pieces that exhibit  
50 high surface exposure. Quantification of fine and medium-sized dead and downed woody material is therefore essential for assessing fire effects and forest carbon dynamics. The line-intersect method is one of the most common field-based approaches to sample woody debris in forest stands (Warren and Olsen, 1964; Van Wagner, 1968, 1982; Brown, 1971; Brown and Roussopoulos, 1974; Brown et al., 1982). This technique allows estimation of the total biomass by measuring the diameter or cross-sectional area of all dead and downed woody pieces at their intersection with a transect line (Warren and  
55 Olsen, 1964). As this sampling approach can be tedious and time-consuming for smaller pieces, fine woody debris (FWD, < 7 cm in diameter) are generally tallied by diameter size class using a go/no-go sizing gauge, and fuel load for any size class can be retrieved from the number of intercepts over the transect line (Van Wagner, 1982). One of the advantages of this method is that it significantly reduces sampling time in the field, but locally derived species-specific values for specific gravity, tilt angle and diameter for each size class are needed. Such data have been published for most of the North American  
60 boreal forest tree species (e.g., Brown, 1974; Sackett, 1980; Delisle et al., 1988; Nalder et al., 1999). However, to the best of our knowledge, there is no available data for larch species in boreal forests of Northeast Siberia.

Destructive harvest is the most accurate approach for estimating tree biomass, yet this method requires intensive sampling efforts and complete harvesting of a forest stand is time consuming and not suitable for long-term monitoring. To overcome



65 these limitations, one standard technique is to apply allometric equations to convert easily measured variables, such as tree diameter and height, to biomass for each individual tree in a given area. Allometry examines size-correlated variations in rates of plant growth (Huxley and Teissier, 1936; Niklas, 1994) and can be applied to the different parts of a tree (e.g., stem, foliage, and branches). By sampling individual trees over a size range of interest, allometric equations can be developed using regression models for estimating the relationship between tree component biomass and one or more size parameters. Numerous allometric equations have been published for North American boreal tree species (Smith and Brand, 1983; Penner  
70 et al., 1997; Ter-Mikaelian and Korzukhin, 1997). In contrast, allometric relationships are more limited in the larch forests of Northeast Siberia, which differ from other boreal forests because they consist of deciduous needleleaf trees from the genus *Larix* Mill. Characterized by its adaptability to grow on permafrost terrain, Siberian larch species (*Larix sibirica* Ledeb., *Larix gmelinii* (Rupr) Rupr., *Larix cajanderi* Mayr.) have evolved physiological and morphological features to endure the long and extremely low air and soil temperatures as well as vigorous cryogenic processes in permafrost terrain. These forests  
75 account approximately for 20 % of the world's boreal forests (Osawa and Zyryanova, 2010), store vast amount of carbon, mainly in organic soils (Matsuura and Hirobe, 2010), and contribute to the stability of the permafrost in a warming climate (Abaimov, 2010; Stuenzi et al., 2021). Despite their critical importance to the global carbon cycle, larch forest ecosystems, especially the remote Cajander larch (*Larix cajanderi* Mayr.) forests of northeastern Siberia, are understudied and little is known about their response to climate change.

80 Most of *L. cajanderi* habitat is located eastwards of the Verkhoyansk Mountain Range where very large differences between summer and winter temperatures prevail (Abaimov, 2010; Chevychelov and Bosikov, 2010). *L. cajanderi* can grow on various soil types, from poorly developed stony soils of mountainous terrains to rich alluvial soils, and ranges in size from dwarf and shrub-like forms to 25-m tall trees. It is the least heat-demanding larch species and is well adapted to the underlying continuous permafrost as it can resist freezing temperatures and develop adventitious roots as the active layer  
85 deepens (Abaimov, 2010). Few studies have reported allometric equations for *L. cajanderi* in Northeast Siberia (Kajimoto et al., 2006; Alexander et al., 2012), but local allometric equations have been developed based on limited tree harvests near the forest-tundra ecotone (Chersky, 68.74° N, 161.40° E, 100 m above sea level), and the altitudinal treeline (about 100 km west to Oymyakon, 63.45° N, 142.77° E, 1160 m a.s.l). As conifer biomass accumulation and allocation are controlled by climate, soil conditions and stand characteristics (Gower et al., 1995), there may be limitations to applying site-specific allometric  
90 equations over large areas away from the measurement sites.

The objective of this study was to expand the biomass allometry of *L. cajanderi* for Northeast Siberia using raw measurements from a comprehensive dataset of biomass measurements in Eurasia (Schepaschenko et al., 2017). We developed allometric equations relating diameter at breast height (DBH) to stem wood, stem bark, foliage, branches, and total aboveground biomass. In addition, we sampled fine woody debris of *L. cajanderi* using the line-intersect method in  
95 Siberian larch-dominated forest stands. We derived diameter and specific gravity values per woody debris size-classes. The allometric equations and wood density parameters presented in this work will be of use to researchers that want to quantify aboveground and woody debris biomass in Cajander larch forests of Northeast Siberia.



## 2 Methods

### 2.1 Fine woody debris sampling

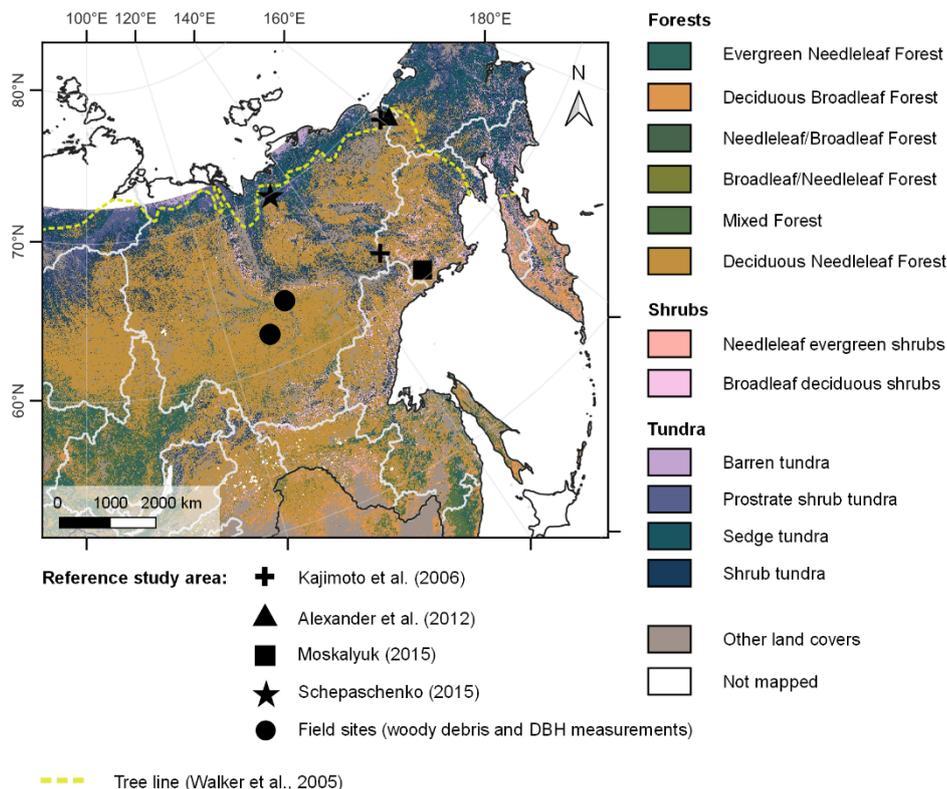
100 Following the line-intersect method, fuel load for any species and size class can be calculated as follows (Van Wagner, 1982; Nalder et al., 1999):

$$W_i = \frac{\pi^2 \times G_i \times \sec h_i \times N_i \times \text{QMD}_i^2 \times s}{8 \times L}, \quad (1)$$

$$s = \sqrt{1 + (\tan \text{slope})^2}, \quad (2)$$

105 where  $W$  is the fuel load ( $\text{Mg ha}^{-1}$ ),  $G$  is the specific gravity ( $\text{Mg m}^{-3}$ ),  $h$  is the piece tilt angle (degrees),  $N$  is the number of intercepts over the length of the transect line, QMD is the quadratic mean diameter (cm),  $s$  is the slope correction factor,  $L$  is the length of the transect line (m),  $\text{slope}$  is the ground slope (degrees), and  $i$  is the diameter size class.

To determine wood density and size parameters for *L. cajanderi*, we sampled natural forest stands within the boreal forests of the Republic of Sakha (Russia) in the summer of 2019 (Fig. 1). Our study sites were located on both sides of the Lena River within the Central Yakutian Lowland (0–200 m a.s.l) and the Near-Lena Plateau (200–500 m a.s.l) (Chevychelov and Bosikov, 2010). *Larix cajanderi* largely prevails in these areas of continuous permafrost with inclusion of *Pinus sylvestris* communities (Isaev et al., 2010). We selected larch-dominated stands (average proportion of 80 % of the living tree biomass) within a gradient of vegetation structure, stand age, and landscape position. At each site, we established a 30 m × 30 m quadrant, within which measurements were made along a 2 m × 30 m belt transect in the north-south direction intersecting the quadrant's centroid. We recorded latitude, longitude, elevation, slope, aspect, and a general site description. To  
115 characterize stand structure and composition, we inventoried every tree within the belt transect by recording species and DBH, and calculated stem density and basal area. We estimated stand age from basal tree disks or increment cores collected on five trees of the dominant cohort.



120 **Figure 1.** Field site locations of existing studies on *Larix cajanderi* allometry in Northeast Siberia (Kajimoto et al., 2006; Alexander et al., 2012) and biomass measurements used in this study for the development of new allometric equations. Locations of the *L. cajanderi* forest stands sampled for fine woody debris analysis and diameter at breast height (DBH) measurements are shown as black circles. Background is the land cover map of Northern Eurasia (Bartalev et al., 2003).

FWD was sampled for *L. cajanderi* using the line-intersect approach. In each site, we inventoried every piece (e.g., twigs, limbs, branches) that intersects the 30 m transect line (west side of our belt transect) in each of the following five roundwood  
 125 diameter size classes: 0–0.49 cm, 0.50–0.99 cm, 1–2.99 cm, 3–4.99 cm, and 5–6.99 cm (McRae et al., 1979), hereafter referred to as classes I to V. For the first five pieces in each size class, we measured the distance along the transect (m) and their diameters (cm) at their points of intersection with the transect line (Fig. 2) using a caliper to 1 mm. These pieces were systematically collected and returned to the laboratory for specific gravity determination using the water displacement method in accordance with the ASTM International D2395–14 Method B-II (ASTM International, 2014). First, we measured  
 130 the oven-dry mass of each sample by drying to constant mass (i.e., less than 0.2 % mass change over a five hour period of drying) at 105 °C (Roussopoulos and Johnson, 1973). Each oven-dried sample was then covered with a thin impermeable layer by immersion in hot liquid paraffin (solidification point 57–60 °C, 0.90 g cm<sup>-3</sup> at 20 °C), and the mass of the coated piece was measured again before volume determination. As suggested by Nalder et al. (1999), we used a paraffin temperature of 180 °C to minimize the error associated with the use of a finite thickness paraffin layer. Using a pointed,  
 135 slender rod, each sample was submerged in a container of water placed on a balance. The mass of water after immersion in



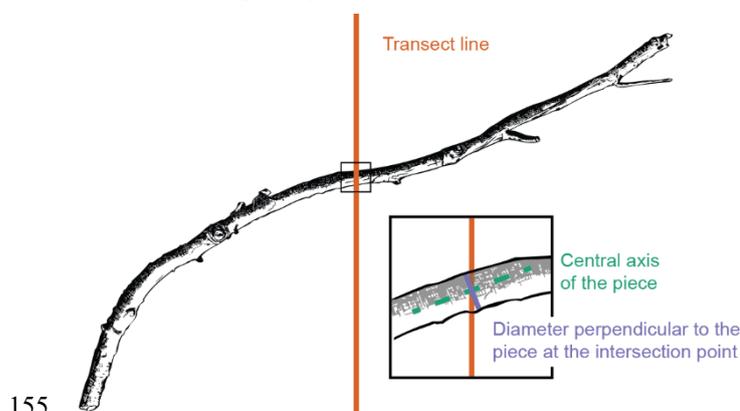
grams corresponds to the volume of the immersed sample in cubic centimeters. Finally, specific gravity of each sample was determined as follows:

$$S = \frac{K \times m_0}{V_0}, \quad (3)$$

$$V_0 = m_{w,disp} - \frac{m_{coated} - m_0}{\rho_{paraffin}}, \quad (4)$$

140 where  $S$  is the specific gravity ( $\text{g cm}^{-3}$ ),  $K$  is a constant equal to 1 when the mass is in grams and the volume is in cubic centimeters,  $m_0$  is the oven-dry mass (g),  $V_0$  is the oven-dry volume ( $\text{cm}^3$ ),  $m_{w,disp}$  is the mass of water displaced (g),  $m_{coated}$  is the mass of the oven-dried sample after immersion in the paraffin, and  $\rho_{paraffin}$  is the density of the paraffin wax ( $\text{g cm}^{-3}$ ).

For each site and size class, we calculated the mean specific gravity and mean squared diameter (MSD) using a similar  
145 approach to Sackett (1980) and Nalder et al. (1999). Defined as the sum of the squared diameters divided by the number of samples, MSD is a direct measure of cross-sectional area. It is therefore more adequate than QMD to interpret differences in dead and downed woody debris biomass between species and regions (Nalder et al., 1999). All statistical analyses were performed using R statistical software version 4.0.3 (R Core Development Team, 2021). We compared specific gravity and  
150 MSD as a function of diameter size class using a one-way analysis of variance (ANOVA) followed by a Tukey-Kramer post hoc analysis for multiple comparisons. Each MSD value was divided by the square of the arithmetic class center (ACC) of the corresponding size class (i.e., 0.25, 0.75, 2, 4, and 6 for classes I to V) to test for the effect of size classes relative to class midpoint. In cases where the assumptions of ANOVA were not met, we used the non-parametric Kruskal-Wallis test and the Wilcoxon rank sum test for pairwise comparisons with Benjamini-Hochberg corrections for multiple testing as implemented in the R ‘stats’ package.



155 **Figure 2. Fine woody debris diameter measurements using the line-intersect method.** Diameter was measured perpendicular to the central axis of the sampled piece at the intersection point with the transect line.

To facilitate comparisons with other species and regions, specific gravity and MSD can be combined into a single factor  $M$  ( $\text{g cm}^{-1}$ ) as follows (Nalder et al., 1999):



$$M_i = \frac{\pi^2 \times G_i \times \sec h_i \times \text{MSD}_i}{8} \quad (5)$$

Note that the factor  $M$  also includes the tilt correction factor equal to the secant of the piece tilt angle relative to horizontal (Van Wagner, 1982). This factor aims to minimize the bias related to tilted pieces that are less likely to be intercepted by the transect line. While tilt bias can be significant in fresh logging slash where smaller pieces are attached to larger ones (Brown and Roussopoulos, 1974), fuel inventory made in harvested and natural Canadian boreal forest sites indicated that it was generally not large (Nalder et al., 1999). The single factor  $M$  defined in Eq. (5) can then be multiplied to the number of intercepts per meter of transect to calculate fuel loads.

## 2.2 Biomass data

We retrieved raw biomass data from a comprehensive dataset of destructive sampling measurements compiled by Schepaschenko et al. (2017). This dataset summarizes measurements from about 1200 experiments conducted between 1930 and 2014 in Eurasia. This dataset provides valuable data that were previously difficult to access for the non-Russian scientific community due to limited publications in English language literature. For each sample plot, the dataset consists of forest stand parameters (e.g., tree species composition, stand age, tree density) as well as tree level variables including DBH, stem height, age, and biomass. Aboveground biomass is reported in kilograms of dry matter for four components: stem, stem bark, branches, and foliage. All the data contained in this dataset were collected using similar sampling strategies. We selected raw harvest data from *L. cajanderi* stands sampled as part of two experiments conducted in the Republic of Sakha (Schepaschenko, 2015) and the Magadan Oblast (Moskalyuk, 2015) (Fig. 1). Table 1 summarizes the characteristics of larch-dominated forest stands sampled in both sites.

**Table 1. Summary of tree samples harvested in the Republic of Sakha (Schepaschenko, 2015) and the Magadan Oblast (Moskalyuk, 2015).** The ranges in stand density, tree age, diameter at breast height (DBH), and tree height ( $H$ ) are provided for each experiment.

Location	Latitude	Longitude	Number of stands	Range	Number of trees	Range		
				Density (trees ha <sup>-1</sup> )		Tree age (years)	DBH (cm)	$H$ (m)
Republic of Sakha	69.88	135.59	2	600–1521	20	57–154	1.8–18.9	2.2–11.8
Magadan Oblast	60.50	148.00	7	250–860	43	30–424	3.9–52.8	1.9–30.0

## 2.3 Development of allometric equations

We developed site-specific allometric equations relating tree DBH to component biomass and total aboveground biomass by fitting power functions of the form:

$$Y = a \times \text{DBH}^b, \quad (6)$$

where  $Y$  is the dry biomass (kg), DBH is the tree diameter at breast height (cm), and  $a$  and  $b$  are the regression coefficients.



Power relationships are commonly used when describing plant allometry and can be approximated following different regression techniques. We first applied a double logarithmic transformation of both biomass and diameter variables as in Eq. (7) and fitted the linear regression using the ordinary least squares method:

$$\ln Y = \ln a + b \times \ln \text{DBH} . \quad (7)$$

190 The logarithmic transformation introduces a downward bias in the prediction of plant biomass (Baskerville, 1972). A correction factor ( $CF$ ) was therefore calculated using Eq. (8) for each regression and multiplied to the value of  $a$  to correct for this systematic bias (Sprugel, 1983):

$$CF = \exp\left(\frac{\hat{\sigma}^2}{2}\right), \quad (8)$$

195 where  $\hat{\sigma}$  is the residual standard deviation. The log-log form depicted in Eq. (7) has been widely used to model allometric relationships as it corrects for heteroscedasticity and facilitates statistical comparison between several equations compared to curvilinear regressions (Gower et al., 1999). However, the performance of the double logarithmic transformation model may be reduced when predicting biomass over a wide range of tree diameters (Bond-Lamberty et al., 2002).

Equation (6) was then fitted using the weighted nonlinear regression model as implemented by the function ‘nls’ in the R ‘stats’ package. Originally developed in forestry in the 1960s (Cunia, 1964; Wharton and Cunia, 1987), the weighted least squares method can be used to treat models which have non-random residuals by assigning each sample a positive weight  $w_j$  as follows (after Picard et al., 2012):

$$\varepsilon_j \sim \mathcal{N}(0, \sigma_j), \quad (9)$$

$$w_j \propto \frac{1}{\sigma_j^2}, \quad (10)$$

205 where  $\varepsilon_j$  is the residual error and  $\sigma_j$  is the residual standard deviation for each observation. In biomass studies, the heteroscedasticity of the residuals is often approximated by a power relationship between the residual variance and the diameter of trees (Picard et al., 2012) such that:

$$\sigma_j = k \times \text{DBH}_j^c, \quad (11)$$

where  $k > 0$  and  $c \geq 0$ . Consequently,

$$w_j \propto \text{DBH}_j^{-2c}. \quad (12)$$

210 As shown in Eq. (12), the weighting is defined by the value of the exponent  $c$  that must be fixed prior to fitting the nonlinear regression. For each site and biomass component, the value of  $c$  was determined by trial and error after visual inspection of the residual plots (Table 2). We report regression coefficients and root mean square errors (RMSE) for each linear and nonlinear regression equation. Standard errors of the regression coefficients are also provided for uncertainty propagation purposes. To determine whether there were differences in allometric equations among sites, we fitted one model where regression parameters varied from site to site (reduced model) and another model where the parameters were identical for both sites (full model). We tested the null hypothesis that  $a$  and  $b$  parameters did not differ between the two sites using the extra sum-of-squares  $F$ -test (Motulsky and Christopoulos, 2004). Significant test results would suggest site-specific



220 variations in the allometric relationships between DBH and component biomass. Our allometric models were compared with existing biomass equations for *L. cajanderi* published by Kajimoto et al. (2006) and Alexander et al. (2012). We assessed differences between models in predicting larch aboveground biomass in 53 forest stands located in the study area described in Sect. 2.1. In each stand, we inventoried every tree within the belt transect and measured DBH (at the height of 1.3 m from the base). Significant differences among models were assessed using the non-parametric Kruskal-Wallis test and the Wilcoxon rank sum test for pairwise comparisons (0.05 significance level).

225 **Table 2. Values of the exponent  $c$  used in the weighted nonlinear regressions of component biomass against diameter at breast height (DBH) in which the weightings were inversely proportional to  $DBH^{2c}$ .** The number of observations ( $n$ ) is provided for each regression.

Biomass component	Yakutia		Magadan		Pooled sites	
	$n$ trees	$c$	$n$ trees	$c$	$n$ trees	$c$
Stem	20	2.5	43	2	63	2
Stem wood	20	2.5	32	2	52	2
Stem bark	20	2	32	2.5	52	2
Branches	20	1.5	43	2	63	2
Foliage	20	1.5	43	1.5	63	1.5
Aboveground	20	2	43	2	63	2

### 3. Results and discussion

#### 3.1 Fine woody debris

230 We sampled a total of 25 forest sites, measuring diameter on 223 pieces and specific gravity on 95 pieces of dead and downed wood of *L. cajanderi*. Summary values of MSD and specific gravity are reported in Table 3. Thirteen sites were intermediate aged ( $58.1 \pm 6.8$  years old) and 11 were mature ( $123.5 \pm 24.5$  years old). Basal areas and tree densities ranged from 1.9 to 15.7  $m^2 ha^{-1}$  and 1170 to 69830 stems  $ha^{-1}$ , respectively. The average dominance of *L. cajanderi* was 64 %, and larch trees co-occurred with either Scot pine (*Pinus sylvestris*) or silver birch (*Betula pendula*) or both in 21 of the 25 sampled sites. Specific gravity ranged from 0.625 to 0.672  $Mg m^{-3}$  (Table 3) and differed as a function of diameter size classes (ANOVA,  $F_{3,91} = 3.22$ ,  $p = 0.026$ ), with the Class II being significantly higher than Class III (Tukey,  $p < 0.05$ ). Site-level MSD/ACC<sup>2</sup> values were normally distributed (Shapiro-Wilk,  $p = 0.08$ ) but the assumption of homogeneity of variance was violated (Levene,  $p < 0.05$ ). The log-transformed data did not satisfy the assumptions of normality and homoscedasticity (Shapiro-Wilk,  $p < 0.05$ ; Levene,  $p < 0.05$ ). MSD varied significantly across size classes (Kruskal-Wallis,  $\chi^2 = 21.8$ ,  $df = 4$ ,  $p < 0.001$ ) with Class II being significantly different from Class III (Wilcoxon,  $p < 0.05$ ) and Class IV (Wilcoxon,  $p < 0.001$ ).

240

**Table 3. Mean squared diameter (MSD) and mean specific gravity (G) of fine dead and downed woody debris by diameter size class.** The number of pieces for each size class is reported in brackets. Letters represent significant differences ( $p < 0.05$ ) between size classes determined using the Tukey-Kramer test (G) or the Wilcoxon rank sum test (MSD) for multiple comparisons.



Diameter size class	MSD (cm <sup>2</sup> )	<i>G</i> (Mg m <sup>-3</sup> )
<i>Larix cajanderi</i>		
I (< 0.5 cm)	0.04 (6) <sup>ab</sup>	Not measured
II (0.5–0.99 cm)	0.67 (47) <sup>a</sup>	0.672 ± 0.049 (30) <sup>a</sup>
III (1.0–2.99 cm)	3.27 (123) <sup>b</sup>	0.633 ± 0.066 (40) <sup>b</sup>
IV (3.0–4.99 cm)	13.89 (32) <sup>b</sup>	0.625 ± 0.052 (13) <sup>ab</sup>
V (5–6.99 cm)	35.16 (15) <sup>ab</sup>	0.659 ± 0.069 (12) <sup>ab</sup>

245 Specific gravity was the highest in Class II and then decreased with larger pieces until Class V where it took intermediate values (Table 3). This pattern in the variation of *G* across diameter size classes is similar to that of *Larix laricina* (tamarack) in the boreal forests of western Canada (Nalder et al., 1999), although our values for *L. cajanderi* are higher. Discrepancy in specific gravity between species can be attributed to differences in live tree stem wood specific gravity, but also to decomposition rates and growth ring patterns that are both influenced by climate. In particular, the tighter the growth rings, the greater the proportion of cell walls in the wood cells. It is worth noting that our approach to measure specific gravity has some limitations associated with (1) the removal of rotten pieces for which we were not able to determine the volume; (2) the inevitable uptake of moisture between oven-drying and volume determination; and (3) the use of paraffin wax to seal the surface of woody pieces before their immersion in water. The latter may lead to an overestimation of the oven-dry volume resulting from the filling of small cracks with paraffin (Nalder et al., 1999). Furthermore, the number of pieces sampled for specific gravity and MSD determination is relatively small for larger size classes.

250 Despite these limitations, this study is the first to report measurements of specific gravity and mean squared diameter for *Larix cajanderi* in the boreal forests of Northeast Siberia. Nalder et al. (1999) showed that these two variables can vary substantially between genera and regions, emphasizing the need for locally derived species-specific data. When calculated for size classes II, III, IV, and V from values reported in Table 3, the single factor *M* varies considerably from values derived by Nalder et al. (1999) for common boreal tree species including *Picea mariana* (black spruce), *Picea glauca* (white spruce), and *Larix laricina* in the Canadian Northwest Territories and Saskatchewan. For 19 of the 20 comparisons, *M* was greater for *Larix cajanderi* than for the other species, with a mean difference of 27 % (range: -2–60 %) (Table A1). This suggests that using specific gravity and MSD values from other species and/or regions would significantly underestimate dead and downed wood fuels in larch-dominated boreal forests of Northeast Siberia.

### 265 3.2 Allometric relationships

In line with previous studies in Northeast Siberia (Kajimoto et al., 2006; Alexander et al., 2012), DBH-based site-specific allometry is a reliable approach for estimating aboveground tree biomass in mature stands of *L. cajanderi*. All equations fitted using linear regressions applied to log-transformed data were statistically significant ( $p < 0.001$ ) (Table B1). At Yakutia and Magadan sites, coefficients of determination ( $R^2$ ) for individual biomass components ranged from 0.93 to 0.99 and 0.84 to 0.96, respectively. Weighted nonlinear regression models resulted in better fits in all cases (Table 4; Fig. B1).



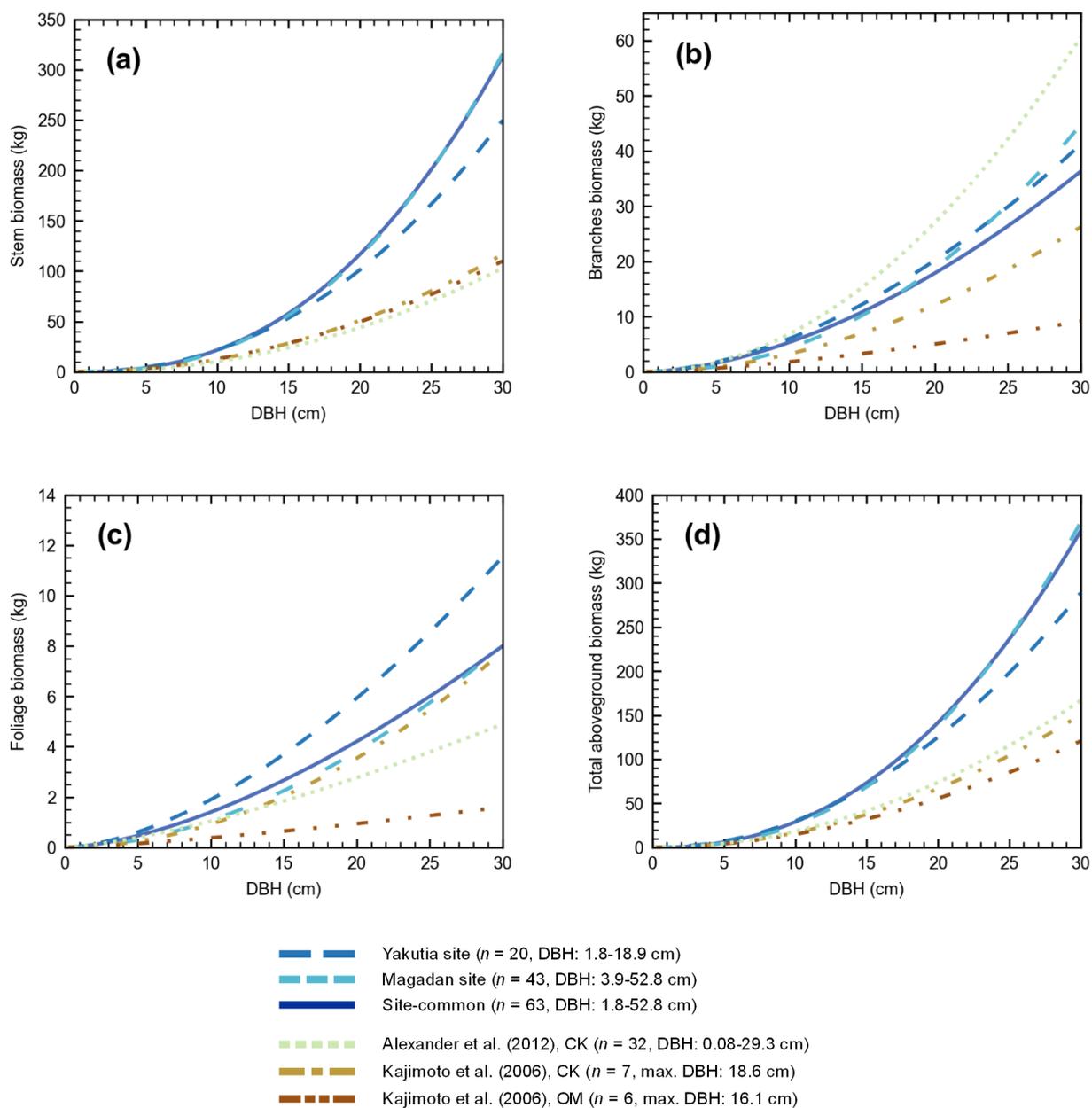
DBH was a significant predictor ( $p < 0.05$ ) of tree components biomass at Yakutia (RMSE = 0.51–5.57 kg) and Magadan (RMSE = 2.60–46.29 kg) sites (Table 4). Higher RMSE observed at Magadan sites are explained by the larger range of DBHs. Most biomass equations for boreal tree species were derived from linear regressions on log-transformed data (Ter-Mikaelian and Korzukhin, 1997; Bond-Lamberty et al., 2002). However, the slopes and intercepts of the relationships between tree diameter and biomass may differ with stand age (Lieffers and Campbell, 1984; Campbell et al., 1985), which limits the efficiency of the logarithmic transformation for describing plant allometry over a wide range of tree sizes (Bond-Lamberty et al., 2002; Kajimoto et al., 2006). Similarly to a previous work on shrub allometry in boreal forests (Berner et al., 2015), our findings suggest that weighted nonlinear regression models can be used to predict plant biomass.

**Table 4. Site-specific and site-common allometric equations relating diameter at breast height (DBH) to stem, stem wood, stem bark, branches, foliage, and total aboveground biomass at *Larix cajanderi* sites in the Republic of Sakha and Magadan Oblast.** Allometry is expressed as a power-form equation  $Y = a \times \text{DBH}^b$  where units of  $Y$  are in kilograms of dry weight and DBH is in centimeters. The coefficients  $a$  and  $b$  were derived using weighted non-linear least squares regressions in which residuals were weighted by  $\text{DBH}^{-2c}$  to correct for non-constant residuals. The values of the exponent  $c$  for each location and biomass component are reported in Table 3. For each allometry model, the range of DBH used in regression is provided, as well as the number of trees, the standard errors (SE) of the coefficients and the root mean square error (RMSE).

Location	Component $Y$	DBH range (cm)	Number trees	$a$	$a$ [SE]	$b$	$b$ [SE]	RMSE (kg)
Site-specific allometry (kg)								
<i>Yakutia</i>	Stem	1.8–18.9	20	0.128	0.013	2.227	0.059	5.568
	Stem wood	1.8–18.9	20	0.084	0.011	2.308	0.073	5.338
	Stem bark	1.8–18.9	20	0.046	0.007	2.006	0.078	0.816
	Branches	1.8–18.9	20	0.105	0.026	1.757	0.115	1.536
	Foliage	1.8–18.9	20	0.043	0.010	1.642	0.111	0.510
	Aboveground	1.8–18.9	20	0.260	0.039	2.062	0.074	5.285
<i>Magadan</i>	Stem	3.9–52.8	43	0.066	0.014	2.493	0.068	40.934
	Stem wood	3.9–52.8	32	0.058	0.014	2.505	0.075	46.293
	Stem bark	3.9–52.8	32	0.006	0.002	2.556	0.110	10.509
	Branches	3.9–52.8	43	0.031	0.013	2.136	0.144	17.082
	Foliage	3.9–52.8	43	0.016	0.006	1.835	0.130	2.601
	Aboveground	3.9–52.8	43	0.097	0.019	2.423	0.062	45.071
Site-common allometry (kg)								
	Stem	1.8–52.8	63	0.079	0.011	2.435	0.047	32.915
	Stem wood	1.8–52.8	52	0.057	0.009	2.505	0.050	35.624
	Stem bark	1.8–52.8	52	0.033	0.006	2.063	0.073	11.323
	Branches	1.8–52.8	63	0.095	0.019	1.749	0.089	15.355
	Foliage	1.8–52.8	63	0.036	0.008	1.586	0.084	2.104
	Aboveground	1.8–52.8	63	0.147	0.019	2.293	0.046	38.234



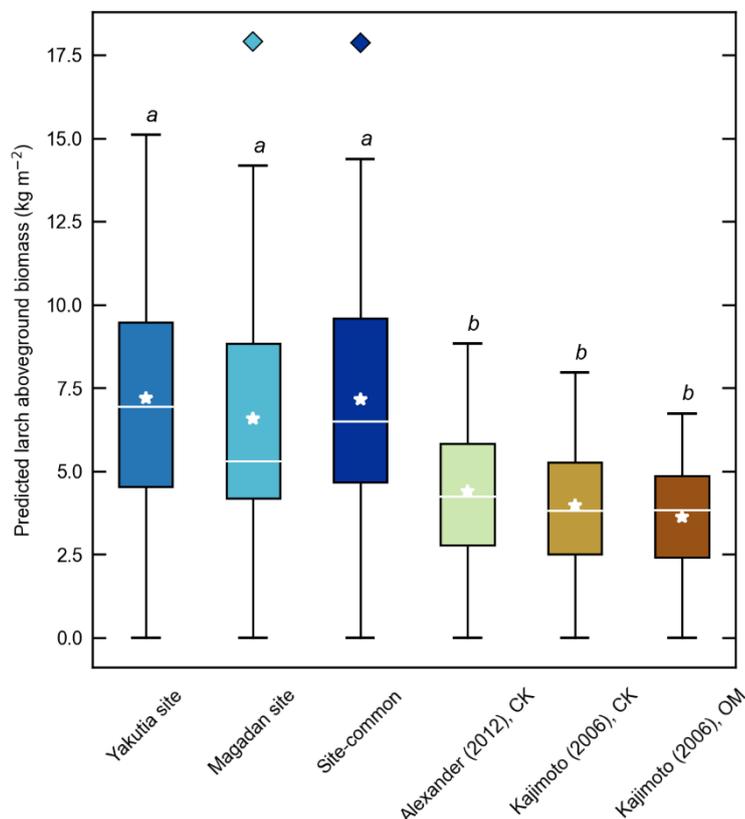
Our regression models performed poorer job in predicting foliage and branches biomass, particularly in the Magadan site ( $R^2 < 0.90$ ), as shown by the higher errors of the regression coefficients (Table 4). This is in agreement with other studies on shrubs (Buech and Rugg, 1995; Berner et al., 2015) and trees (Gower et al., 1997; Bond-Lamberty et al., 2002) that found weaker allometric models for components related to annual production such as foliage and new growth. It is also clear from Fig. 3b, c and Fig. B2 that there is more discrepancy between allometric models for these biomass components, which is likely to be caused by local variations in light, water, and nutrient availability (Bond-Lamberty et al., 2002). While some studies have used crown-base diameter and sapwood area to improve biomass estimation for foliage and branches (Waring et al., 1980; O'Hara, 1988; Comeau and Kimmins, 1989; Osawa, 1990), Kajimoto et al. (2006) found that regression models based on these variables did not always result in better fits in *L. gmelinii* and *L. cajanderi* stands. Including tree height in addition to DBH as independent variables is another alternative often used for boreal tree species (Schmitt and Grigal, 1981; Ker, 1984; Harding and Grigal, 1985), including Siberian larch species (Sawamoto et al., 2003). However, it may be more difficult to measure tree height accurately in the field and more time-consuming to apply such an allometric model for biomass estimation, especially in dense forest stands. We tested tree height ( $H$ ) as a predictor of tree components biomass (Table B2) and found that the improvement in model fits may not be large enough to counterbalance the additional practical difficulties associated with making in situ tree height measurements.



305 **Figure 3. Allometry models developed in northeastern Siberia for *Larix cajanderi* relating diameter at breast height (DBH) to (a) stem, (b) branches, (c) foliage, and (d) aboveground tree biomass.** For each model, the number of trees harvested ( $n$ ) and the range or maximum (max.) value of DBH are provided. Regression coefficients are given in Table 4 for site-specific (Yakutia and Magadan sites) and site-common allometry. For allometric relationships developed in Chersky (CK) and Oymyakon (OM) areas, regression coefficients can be found in Kajimoto et al. (2006) and Alexander et al. (2012).



310 Comparison of the generalized and site-specific models revealed significant differences (ANOVA,  $p < 0.01$ ) in the  
relationship between DBH and biomass for each component except branches (ANOVA,  $p > 0.05$ ), suggesting regional  
variations in *L. cajanderi* allometry. Site-common allometry was obtained after pooling tree data from both sites (Table 4)  
and resulted in significant relationships between DBH and biomass ( $p < 0.001$ ). Generalized models performed as well as  
those derived using only Magadan stands ( $R^2 = 0.81\text{--}0.97$ ; RMSE = 2.10–38.23 kg) (Table B1; Table 4). We found  
315 significant differences between our allometric models and existing tree aboveground biomass equations (Kruskal-Wallis,  $\chi^2$   
= 67.4,  $df = 5$ ,  $p < 0.001$ ) (Fig. 3d; Fig. 4). Aboveground biomass estimated by applying site-specific allometric models from  
Yakutia and Magadan at our 53 field sites near Yakutsk respectively averaged  $7.21 \pm 3.42 \text{ kg m}^{-2}$  (range: 0–15.1  $\text{kg m}^{-2}$ ) and  
 $6.58 \pm 3.94 \text{ kg m}^{-2}$  (range: 0–17.9  $\text{kg m}^{-2}$ ) (Fig. 4). While predictions from site-common allometry ( $7.17 \pm 3.94 \text{ kg m}^{-2}$ )  
showed good agreement with predictions based on site-specific models, applying models developed in Chersky and  
Oymyakon areas systematically resulted in underestimating stocks by 38–49 % (Wilcoxon,  $p < 0.05$ ) (Fig. 4). A similar trend  
320 was found when predicting stem biomass (Fig. 3; Fig. B2). Aboveground biomass is assumed to vary along a latitudinal  
gradient within larch forests of Northeast Siberia (Usoltsev et al., 2002), ranging from 0.1  $\text{kg m}^{-2}$  in northern regions to 18  $\text{kg m}^{-2}$   
in more productive southern stands (Usoltsev, 2001; Kajimoto et al., 2010). Using the allometric equations developed in  
this study, mean aboveground biomass estimates across our studied sites were similar to values reported for *L. cajanderi*  
stands located in the same region ( $7.2 \text{ kg m}^{-2}$ ) (Siewert et al., 2015).



325

**Figure 4.** Larch aboveground biomass predicted for 53 forest stands near Yakutsk using allometry models developed in northern Yakutia, Magadan Oblast, Chersky (CK) area (Kajimoto et al., 2006; Alexander et al., 2012) and Oymyakon (OM) area (Kajimoto et al., 2006). Letters represent significant differences ( $p < 0.05$ ) between allometry models determined using the Wilcoxon rank sum test for pairwise comparisons.

330 Previous studies have shown that caution is needed when applying regional biomass equations in other regions (Bond-  
Lamberty et al., 2002; Jenkins et al., 2003; Berner et al., 2015). Differences in the relationship between tree diameter and  
biomass may relate to differences in local site conditions, including stand age, tree density, growing season length, drainage,  
and nutrient availability (Schulze et al., 1995; Kajimoto et al., 2010). By influencing these factors, permafrost and fire  
disturbances may shift biomass allocation of Siberian larch trees (Kajimoto et al., 1999; Alexander et al., 2012). The mature  
335 stand (140 years-old) sampled near Oymyakon was located near the altitudinal treeline of *L. cajanderi* and consisted in  
relatively small trees (mean DBH = 5.93 cm, mean  $H = 4.31$  m) (Kajimoto et al., 2006). Allometric equations provided in  
Alexander et al. (2012) were derived from trees harvested near Chersky in young ( $n = 1$ , 15 years old) and intermediate-aged  
stands ( $n = 2$ , 60 years old), as well as from a mature stand (155 years old) described in Kajimoto et al. (2006). Stands  
structure and dynamics in both areas differ with our studied sites in northern Yakutia and Magadan Oblast (Table 1). Our  
340 study shows that using existing DBH-based biomass equations for *L. cajanderi* would substantially underestimate  
aboveground biomass and carbon stocks in boreal forests of Northeast Siberia. This may have important implications for



understanding changes in boreal vegetation dynamics, carbon, and energy budgets in a warming climate. Our newly developed allometric equations using data from Moskalyuk (2015) and Schepaschenko (2015) cover a larger geographic gradient of the Cajander larch forest of Northeast Siberia and have therefore a wider applicability than site-specific equations that have been published before (Kajimoto et al., 2006; Alexander et al., 2012). We acknowledge that the number of samples resulting in our newly developed allometric equations is still relatively small, and these equations can further be refined in the future when more data becomes available that covers a wider range of climate conditions, tree ages, and stem sizes.

### Conclusions

Quantifying regional and temporal variations in biomass of boreal forests is essential for assessing the effects of climate warming on these ecosystems. This study contributes much needed data and equations for estimating aboveground biomass in larch-dominated forests of Northeast Siberia. We collected measurements of specific gravity and mean squared diameter from fine dead and downed woody debris in the Republic of Sakha (Russia). These values, the first available for *Larix cajanderi*, are required to calculate fuel loads using the line intersect method. We showed that using data from other dominant boreal tree species may result in large biases.

Allometric equations relating DBH to aboveground tree biomass, as well as individual tree compartments (i.e., stem wood, stem bark, branches, foliage), were developed for two sites in the Republic of Sakha and the Magadan Oblast (Russia). In agreement with previous studies, our analysis revealed that DBH-based allometry was a simple and reliable approach for estimating *L. cajanderi* biomass in Siberian forests. However, we found significant differences between our newly developed allometric relationships and existing equations, which are likely due to differences in stand characteristics and environmental conditions at sampled sites. Our results suggest that site-specific allometric equations should be applied with caution in other regions. While our newly developed allometric equations cover a wider geographic range for *L. cajanderi* forest in Northeast Siberia, our study also demonstrates the critical need for additional field surveys to reduce uncertainties in biomass pool estimates. The data and equations presented in our study contribute to the quantification of aboveground boreal biomass pools in a warming climate.

365



## Appendices

### Appendix A

370 **Table A1. Differences between  $M$  values from this study and those from other boreal tree species in the Canadian Northwest Territories and Saskatchewan by diameter size class.**  $M$  values for *Larix laricina* (tamarack), *Picea glauca* (white spruce), and *Picea mariana* (black spruce) were derived from Equation (5) using specific gravity ( $G$ ) and mean squared diameter (MSD) values from Nalder et al. (1999). To facilitate comparisons with  $M$  values from our study, we used a tilt correction factor of 1.13 as suggested by Brown (1974).

Location	Species	Percentage difference by size class:			
		II	III	IV	V
Northwest Territories	<i>Larix laricina</i>	60	44	23	4
	<i>Picea glauca</i>	45	16	18	49
	<i>Picea mariana</i>	49	15	12	33
Saskatchewan	<i>Picea glauca</i>	47	17	13	34
	<i>Picea mariana</i>	39	-2	5	25

375



## Appendix B

380

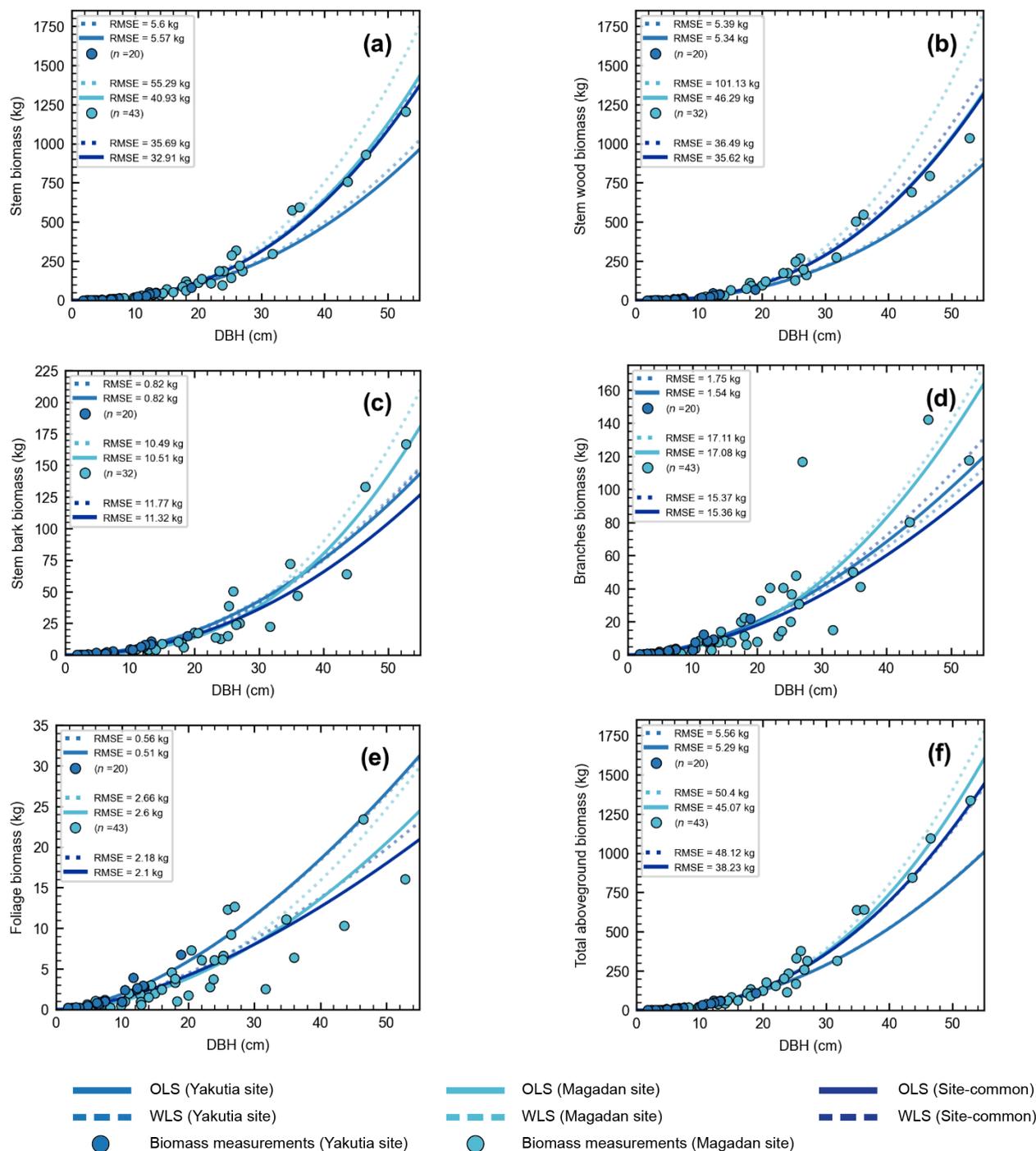
**Table B1. Coefficients of site-specific and site-common allometric equations relating diameter at breast height (DBH) to stem, stem wood, stem bark, branches, foliage, and total aboveground biomass derived using linear regressions.** Equations are of the form  $Y = a \times \text{DBH}^b$  where units of  $Y$  are in kilograms of dry weight and DBH is in centimeters. A logarithmic transformation of the form  $\ln Y = \ln a + b \times \ln \text{DBH}$  was applied before fitting the linear regression using the ordinary least squares method. Each  $a$  value is corrected by the multiplication factor ( $CF$ ). The coefficient of determination ( $R^2$ ) is provided for each regression, as well as the root mean square error (RMSE). Differences in  $a$  and  $b$  coefficients among site-specific regressions are shown by  $t$ -values with significance levels (ANOVA with interaction term). Site-common allometry was derived by pooling data from both sites and results of ANOVA are shown by  $F$ -values with significance levels. All regressions are significant at  $p < 0.001$ . *ns*: not significant at  $p < 0.05$ , \*  $p < 0.05$ , \*\*  $p < 0.01$ , \*\*\*  $p < 0.001$ .

Component $Y$	Coefficients	Site-specific allometry			Site-common allometry
		Yakutia	Magadan	$t$ -value	
Stem (kg)	$a$	0.123	0.045	3.288**	0.082
	$b$	2.251	2.637	-2.657*	2.435 ( $F_{1,61} = 1424,3$ )***
	$CF$	1.018	1.093		1.082
	$R^2$	0.987	0.950		0.960
	RMSE	5.600	55.286		35.691
Stem wood (kg)	$a$	0.081	0.027	3.303**	0.053
	$b$	2.326	2.781	-2.968**	2.549 ( $F_{1,50} = 1438.5$ )***
	$CF$	1.026	1.099		1.085
	$R^2$	0.982	0.955		0.966
	RMSE	5.392	101.133		36.486
Stem bark (kg)	$a$	0.045	0.005	5.840***	0.029
	$b$	2.020	2.664	-3.807***	2.130 ( $F_{1,50} = 466.6$ )***
	$CF$	1.032	1.123		1.191
	$R^2$	0.972	0.941		0.903
	RMSE	0.815	10.485		11.766
Branches (kg)	$a$	0.112	0.029	3.044**	0.075
	$b$	1.724	2.171	-2.053*	1.863 ( $F_{1,61} = 371.3$ )***
	$CF$	1.054	1.215		1.200
	$R^2$	0.936	0.854		0.859
	RMSE	1.749	17.110		15.366
Foliage (kg)	$a$	0.044	0.011	3.249**	0.034
	$b$	1.634	1.981	-1.633 <i>ns</i>	1.625 ( $F_{1,61} = 254.7$ )***
	$CF$	1.052	1.203		1.224
	$R^2$	0.933	0.837		0.807
	RMSE	0.558	2.655		2.180
Aboveground (kg)	$a$	0.260	0.080	4.459***	0.159
	$b$	2.064	2.497	-3.616***	2.271 ( $F_{1,61} = 1640.1$ )***
	$CF$	1.023	1.058		1.063
	$R^2$	0.980	0.964		0.964
	RMSE	5.561	50.395		48.117



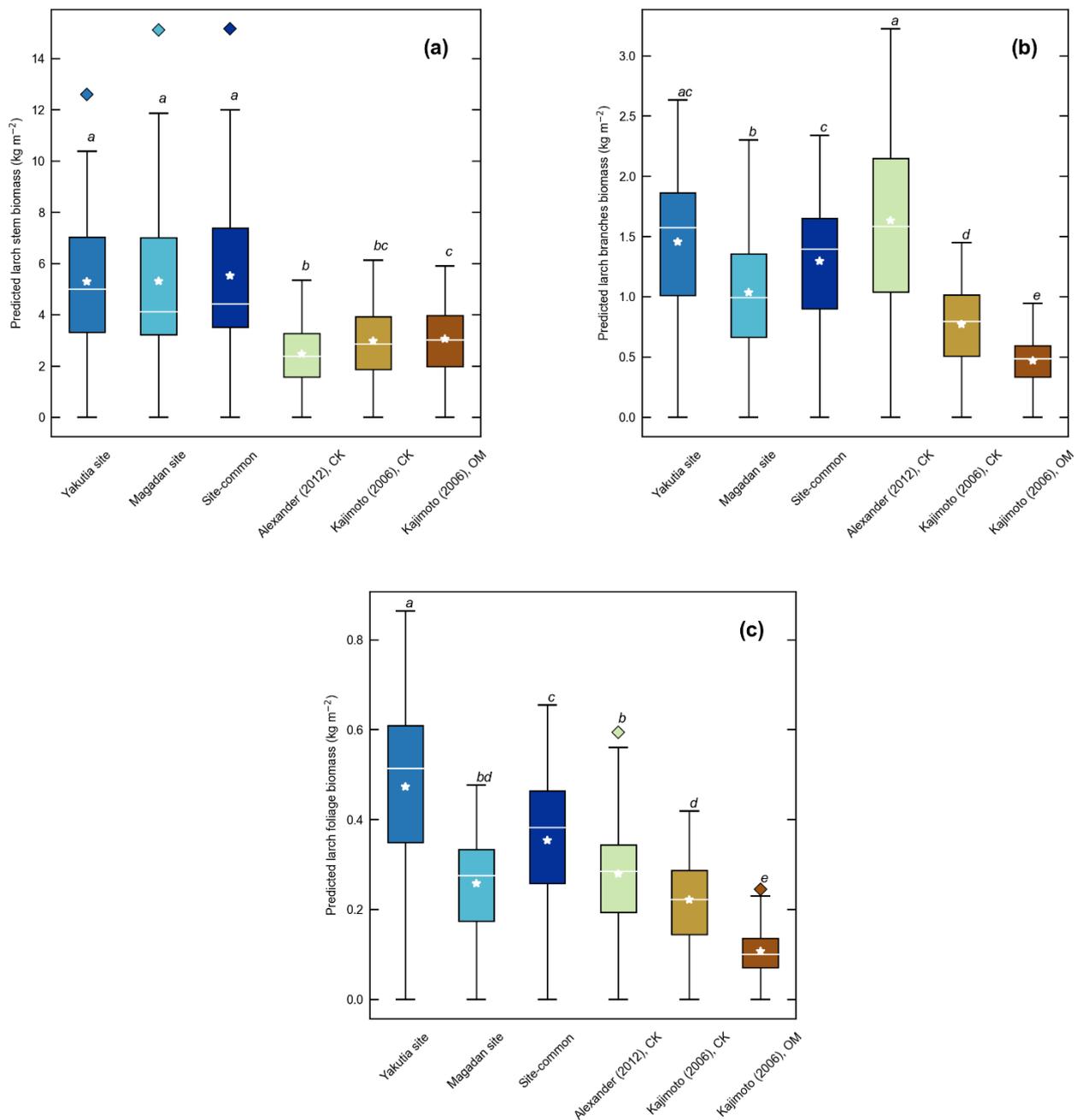
385 **Table B2. Coefficient of determination ( $R^2$ ) from linear regressions between biomass components ( $Y$ ) and size parameters ( $D$ ) after log-log transformation.** All regressions are significant at  $p < 0.001$ . DBH: diameter at breast height (cm);  $H$ : tree height (m).

Component $Y$	Size parameter $D$	Coefficient of determination ( $R^2$ )		
		Yakutia	Magadan	Site-common
Stem (kg)	DBH (cm)	0.987	0.950	0.960
	DBH <sup>2</sup> × $H$ (cm <sup>2</sup> m)	0.992	0.979	0.979
Stem wood (kg)	DBH (cm)	0.982	0.955	0.966
	DBH <sup>2</sup> × $H$ (cm <sup>2</sup> m)	0.989	0.983	0.983
Stem bark (kg)	DBH (cm)	0.972	0.941	0.903
	DBH <sup>2</sup> × $H$ (cm <sup>2</sup> m)	0.969	0.972	0.919
Branches (kg)	DBH (cm)	0.936	0.854	0.859
	DBH <sup>2</sup> × $H$ (cm <sup>2</sup> m)	0.938	0.870	0.870
Foliage (kg)	DBH (cm)	0.933	0.837	0.807
	DBH <sup>2</sup> × $H$ (cm <sup>2</sup> m)	0.935	0.861	0.821
Aboveground (kg)	DBH (cm)	0.980	0.964	0.964
	DBH <sup>2</sup> × $H$ (cm <sup>2</sup> m)	0.986	0.990	0.981



**Figure B1. Site-specific and site-common allometry models for *Larix cajanderi* developed using linear regressions (OLS) and weighted nonlinear regressions (WLS).** The dots represent biomass measurements collected in two stands in Yakutia and seven stands in the Magadan Oblast, with  $n$  the number of harvested trees reported in brackets. Site-common allometry was derived by pooling data from both sites. OLS: ordinary least squares; WLS: weighted least squares; RMSE: root mean square error.

390



395 **Figure B2. Component biomass predicted for 53 forest stands near Yakutsk using allometry models developed in northern Yakutia, Magadan Oblast, Chersky (CK) area (Kajimoto et al., 2006; Alexander et al., 2012) and Oymyakon (OM) area (Kajimoto et al., 2006). (a) Stem, (b) branches, and (c) foliage biomass.** For each allometry model, mean predicted biomass is indicated as a white star. Letters represent significant differences ( $p < 0.05$ ) between allometry models determined using the Wilcoxon rank sum test for pairwise comparisons.



### Author contributions

CJFD designed the research with inputs from SV. CJFD organized the field campaign with inputs from SV and the people in  
400 the Acknowledgements. CJFD performed the analysis, created figures, and wrote the manuscript with inputs from SV. SV  
acquired funding for this research and supervised the work.

### Competing interests

The authors declare that they have no conflict of interest.

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