

# Remote sensing of upper canopy leaf area index and forest floor vegetation cover as indicators of net primary productivity in a Siberian larch forest

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[1] In this study, we demonstrated that the leaf area index (LAI) and forest floor vegetation cover (FVC) are indicators of net primary productivity (NPP) in Siberian larch forest by considering forest biometric and CO<sub>2</sub> budget parameters. Further, we estimated the distributions of these indicators and the corresponding NPP using Landsat ETM+ imagery. This estimation was based on the spectral measurements of larch leaves and the forest floor and on radiative transfer modeling studies. The results revealed that the estimated and observed values of larch LAI and FVC were similar; however, the estimated NPP ( $222 \pm 24$  gC m<sup>-2</sup> yr<sup>-1</sup>) was greater than that obtained from observations from meteorological towers and soil heterotrophic respiration values (130–180 gC m<sup>-2</sup> yr<sup>-1</sup>) at the study site. We present the geographical distributions of larch LAI, FVC, and annual NPP that are associated with the components of the CO<sub>2</sub> budget and spectral parameters, which will be used to conduct intercomparison studies in the future.

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# 1. Introduction

[2] In Siberia and the Russian far east, larch forests occupy 263 million ha, thereby accounting for 52% of the total forest cover in the region [Federal Service of Forest Management of Russia, 1995] and 6.8% of the total forest area worldwide [Food and Agriculture Organization of the United Nations, 2001]. In the Sakha Republic (Yakutia), Russian Federation, larch forests occupy 109 million ha, accounting for 90% of the total forest cover in the region. These areas are underlain by continuous permafrost from the bottom of the seasonal thawing layer to depths of as much as 400-500 m. This prevents water infiltration, and large forest areas are preserved even under conditions of extremely low precipitation (200-300 mm/yr). The mean annual air temperature of Yakutsk has increased by 2.5°C in the last 100 years [Romanovsky, 2003] and is predicted to increase by 3-11°C in the next 100 years [Sazonova et al., 2004]. This change is accompanied by changes in the larch forest and its CO<sub>2</sub> budget in a geographically distributed area that affect the atmospheric CO<sub>2</sub> concentration.

[3] In Canada, human-induced climate changes have had a detectable influence on the area that was burned by forest fires over recent decades [*Gillett et al.*, 2004], and forest fires themselves influence the changes in the boreal forest  $CO_2$  budget [*Hinzman et al.*, 2003]. In particular, in Siberian larch forests, surface fires that burn only forest floors predominate over crown fires, while crown fires are more dominant in North America [*Wooster and Zhang*, 2004]. Disturbances in Siberian larch forest strongly alter the soil thermal and hydrological conditions; this is dependent on initial ice content in the soil and influences vegetation recovery [*Iwahana et al.*, 2005]. In order to estimate the changes in the  $CO_2$  budget of the ecosystem before and after fires, the  $CO_2$  budget in a geographically distributed area must be estimated.

[4] Remote sensing is the most promising method by which the geographical distribution of the  $CO_2$  budget of terrestrial ecosystems and the changes it undergoes can be estimated. Remote sensing of net primary productivity (NPP) in North America was based on ecosystem modeling [*Goetz et al.*, 1999; *Kimball et al.*, 2000; *Liu et al.*, 2002]. These models were based on the leaf area index (LAI) and the fraction of absorbed photosynthetically active radiation (FAPAR) obtained from the remotely sensed normalized difference vegetation index (NDVI) for each vegetation type. The estimated LAI or FAPAR was combined with plant physiology models and climate data including temperature and precipitation. In order to estimate net ecosystem productivity (NEP) as a component of the ecosystem  $CO_2$  budget, soil respiration was assumed to mainly include

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degradation of the litter from canopy foliage. *Kushida et al.* [2004] focused on the contribution of not only the canopy but also the forest floor mosses or lichens to the total NPP, and included the aerial estimation of mosses or lichens in the  $CO_2$  budget of a spruce forest in interior of Alaska.

[5] Further, remote sensing of the ecosystem  $CO_2$  budget distribution in forests in Siberia and the Russian Far East has been included in studies conducted on a global scale by using the NDVI spectral index [*Myneni et al.*, 2001; *Nemani et al.*, 2003; *Running et al.*, 2004; *Bunn and Goetz*, 2006]; however, these studies have not considered the ecosystem  $CO_2$  budget at the regional or tree-species level. Boreal forests are characterized by the high contribution of forest floor NPP to the total NPP, but this differs depending on the tree species and site characteristics.

[6] Here we first demonstrate that the LAI of larch and forest floor vegetation cover (FVC) are indicators of the NPP of Siberian larch forest by considering forest biometric and  $CO_2$  budget parameters. Second, we estimate the indicators and the corresponding NPP distribution using Landsat Enhanced Thematic Mapper Plus (ETM+) imagery.

### 2. Materials and Methods

### 2.1. Site Specifications

[7] Leaf and forest floor spectra were recorded in a 170-year-old larch forest (Neleger site,  $62^{\circ}19'N$  129°31'E, 220 m asl) in the East Siberian taiga, which is located 35 km northwest of Yakutsk. Larch (*Larix cajanderi* Mayr.) is the dominant tree species, reaching heights of 20 m. More than 99% of the trees higher than 1 m are larch, present at a density of 0.2 trees/m<sup>2</sup>. Up to a height of 10 cm, the understory is dominated by the evergreen shrub *Vaccinium vitis-idaea* L. Unvegetated portions with fallen larch leaves are widely present on the forest floor, although woody plants such as *Rosa acicularis* Lindl. and herbaceous plants such as *Limnas stelleri* Trin. occur in small portions. The topography is flat, and the soil type is silty loam.

[8] Summer and autumn Landsat ETM+ images of the study site were taken on 13 August 2000 and 3 October 2001 (path: 122 and row: 16). These images were overlaid and used for land cover classification. The larch forest was differentiated from other land categories such as pine and birch forests, fire scars, grasslands, water bodies, ice, and sand by maximum likelihood supervised classification of the two images. In the autumn image, the larch and birch forests are leafless. The larch forest area on the summer Landsat ETM+ image was used to estimate the geographical distribution of the NPP components. Atmospheric correction was performed using ATCOR2 for Erdas Imagine 8.7 (Leica Geosystems Corp., Heerbrugg, Switzerland) with the standard parameters (midlatitude summer, rural, 20.0 km scene visibility).

# 2.2. Spectral Measurements

[9] As described by *Kushida et al.* [2004], the forest floor vegetation cover (FVC), namely, *V. vitis-idaea* L. and the unvegetated portions with fallen and live larch leaves, were spectrally measured with a GER-2600 spectroradiometer (GER Corp., New York, United States) at a wavelength of 350–2500 nm in late July 2000 and 2001, respectively. For the FVC components, each reflectance of a 0.15-m diameter

circle to the nadir direction at wavelengths in the 1.5-nm interval in 350–1050 nm; the 11.5-nm interval in the 1050–2500 nm range was observed by alternately measuring the emissions from the object and from a standard reflectance Spectralon panel at least 5 times. A LI-COR integrating sphere (LI-1800-12) was attached to the spectroradiometer, and the method of *Daughtry et al.* [1989] was used to observe the reflectance and transmittance of the leaves set at the 14-mm diameter sample port.

[10] In late July 2001, in the same plot, the horizontal distribution of the forest floor plant species was mapped using 900 pictures of a 30 m  $\times$  30 m plot in the Neleger site; the field was described, and the cover ratios of the dominant species were determined.

#### 2.3. Radiative Transfer Model

[11] The spectral data were used as input for a canopy radiative transfer model [Kushida et al., 2004], which is based on the SAIL model [Verhoef, 1984] and a clumping index [Chen et al., 2005], in order to calculate the variations in the relationships between the upper canopy LAI and the reflectance factors in the Landsat ETM+ bands depending on the change in FVC. The clumping index that denotes the inhomogeneity of leaf spatial distribution was set at 0.68 by adopting the value assigned to deciduous conifer forests in the Northern hemisphere in the global foliage clumpingindex distribution estimated by Chen et al. [2005]. The leaf angle distribution was assumed to be spherical. The solar beam was assumed to be a specular radiation from a  $45^{\circ}$ zenith angle. The forest floor was modeled as a horizontal mixture of V. vitis-idaea and the unvegetated portion with fallen larch leaves.

### 2.4. Larch NPP

[12] The total NPP (gC  $m^{-2} yr^{-1}$ ) and NEP (gC  $m^{-2} yr^{-1}$ ) can be expressed as follows:

$$NPP = NPP_l + NPP_u, \tag{1}$$

$$NEP = NPP - SHR,$$
 (2)

where  $NPP_l$  (gC m<sup>-2</sup> yr<sup>-1</sup>) and  $NPP_u$  (gC m<sup>-2</sup> yr<sup>-1</sup>) represent the NPP of the larch and the understory, respectively, and *SHR* (gC m<sup>-2</sup> yr<sup>-1</sup>) represents soil heterotrophic respiration. On the basis of the mensuration of the larch (*L. gmelinii* (Rupr.) Rupr. and *L. cajanderi* Mayr.) forests in Yakutia, yield tables were prepared by *Usoltsev* [2002]. These tables include information on the age-related changes in the biomass of the stem ( $B_s$ , g/m<sup>2</sup>), foliage ( $B_f$ , g/m<sup>2</sup>), branch ( $B_b$ , g/m<sup>2</sup>), root ( $B_r$ , g/m<sup>2</sup>), and stand density (*S*, m<sup>-2</sup>) for each of the eight site indices that further indicate site condition and forest floor types.  $B_r$  can be further classified into fine root biomass ( $B_{fr}$ , g/m<sup>2</sup>) and coarse root biomass. *NPP<sub>l</sub>* can be expressed as follows [after *Chen et al.*, 2002]:

$$NPP_{l} = \Delta C + L_{f} + L_{b} + L_{fr} + M$$
  
=  $\Delta C + r_{f}c_{f}B_{f} + r_{b}c_{b}B_{b} + r_{fr}c_{fr}B_{fr} + M,$  (3)

where  $\Delta C$  (gC m<sup>-2</sup> yr<sup>-1</sup>) is the carbon increment due to biomass increment;  $L_f$  (gC m<sup>-2</sup> yr<sup>-1</sup>),  $L_b$  (gC m<sup>-2</sup> yr<sup>-1</sup>),

Table 1.	Parameters	for	$CO_2$	Budget	Estimation <sup>a</sup>
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Components	Equations and Parameters	References
Biomass increment, $\Delta B^{\rm b}$	$\frac{\underline{B(A_i)} - \underline{B(A_{i-1})}}{A_i - A_{i-1}}$	Usoltsev [2002]
Foliage turnover rate, $r_f$	$1.0 \ yr^{-1}$	
Branch turnover rate, $r_b$	$0.05 \text{ yr}^{-1}$	Kanazawa and Osawa [1994], Harmon et al. [2000]
Fine root turnover rate, $r_{fr}$	$0.16 \text{ yr}^{-1}$	Matamala et al. [2003]
Mortality, M	0.4 $\frac{C(A_{i-1})}{S(A_{i-1})} \frac{S(A_i) - S(A_{i-1})}{A_i - A_{i-1}}$	this study <sup>c</sup>
NPP of understory, NPP <sup>d</sup>	$57 \text{ gC m}^{-2} \text{ yr}^{-1}$	this study <sup>e</sup>
Soil heterotrophic respiration, SHR <sup>f</sup>	$49 \text{ gC m}^{-2} \text{ yr}^{-1}$	Sawamoto et al. [2001, 2003]
Specific leaf area, SLA	$139.4 \text{ cm}^2/\text{g} (d.w.)$	Kanazawa and Osawa [1994]
Fine root biomass, $B_{fr}^{g}$	$B_r(-0.1351 \ln(B_r) + 1.3173) (g/m^2)$	Chen et al. [2002], Kajimoto et al. [1999], Kajimoto et al. [2003]

 ${}^{a}B(A_i)$ ,  $C(A_i)$ , and  $S(A_i)$  denote biomass (g/m<sup>2</sup>), carbon amount (g/m<sup>2</sup>), and stand density (m<sup>-2</sup>), respectively, at age  $A_i$  (y).  $B_r$  denotes total root biomass (g/m<sup>2</sup>). The carbon content in foliage and fine roots and in other parts was assumed be 0.45 gC/g and 0.50 gC/g, respectively.

<sup>b</sup>Age is  $(A_i + A_{i-1})/2$  (years).

<sup>c</sup>Value is calculated on the basis of work by *Shvidenko and Nilsson* [1998], *Schulze et al.* [1999], and *Usoltsev* [2002]. <sup>d</sup>Site is the Neleger.

<sup>e</sup>Value is calculated on the basis of work by *Burton et al.* [2002], *Sawamoto et al.* [2001, 2003], and *Saito et al.* [2005]. <sup>f</sup>Observation is at the Neleger site.

<sup>g</sup>Root diameter is  $\leq$ 5 mm.

 $L_{fr}$  (gC m<sup>-2</sup> yr<sup>-1</sup>), and M (gC m<sup>-2</sup> yr<sup>-1</sup>) are foliage litter fall, branch litter fall, fine root turnover, and mortality, respectively;  $r_f$  (yr<sup>-1</sup>),  $r_b$  (yr<sup>-1</sup>), and  $r_{fr}$  (yr<sup>-1</sup>) are the turnover rates of foliage, branches, and fine roots, respectively; and  $c_f$  (gC/g),  $c_b$  (gC/g), and  $c_{fr}$  (gC/g) are the carbon contents of the foliage, branches, and fine roots, respectively. The carbon content of the foliage and fine roots and that of the other parts was assumed be 0.45 gC/g and 0.50 gC/g, respectively. The mortality at the age  $(A_i + A_{i-1})/2$ (years) can be expressed as follows:

$$M\left(\frac{A_i + A_{i-1}}{2}\right) = \alpha_M \frac{C(A_{i-1})}{S(A_{i-1})} \frac{S(A_i) - S(A_{i-1})}{A_i - A_{i-1}},$$
 (4)

where  $C(A_i)$  (gC/m<sup>2</sup>) and  $S(A_i)$  (m<sup>-2</sup>) denote the carbon amount and stand density, respectively, at age  $A_i$  (years), and  $\alpha_M$  (gC/gC) denotes the coefficient of mortality. The *NPP*<sub>l</sub> at each age for each of the eight site indices was calculated on the basis of data from the Usoltsev yield table and on the basis of  $r_j$ ,  $r_b$ ,  $r_{j_j}$ , and  $\alpha_M$  by using equation (3). The upper canopy LAI at each age for each of the eight site indices (*LAI*<sub>l</sub>, m<sup>2</sup>/m<sup>2</sup>) was calculated as follows:

$$LAI_l = B_f \cdot SLA, \tag{5}$$

where *SLA* ( $cm^2/g$  (d.w.)) is the specific leaf area of the larch; its value was fixed at 139.4  $cm^2/g$  (d.w.) as determined by *Kanazawa and Osawa* [1994].

[13] We then deduced the relationship between  $LAI_l$  and  $NPP_l$  for the East Siberian larch forest from the relationships between age and  $NPP_l$  or  $LAI_l$  by assuming  $r_{f}$ ,  $r_b$ ,  $r_{fr}$ ,  $\alpha_M$ , and SLA as constant values. The parameters of the CO<sub>2</sub> budget components were fixed as shown in Table 1. Larch is deciduous, and the foliage turnover rate  $(r_f)$  was set at 1.0 yr<sup>-1</sup>.

[14] Gill and Jackson [2000] used several methods and found that the  $r_{fr}$  ranged from 0.8 yr<sup>-1</sup> in tropical regions to 0.4 yr<sup>-1</sup> at high latitudes. The adoption of these values

considerably increases the larch NPP in comparison to the values obtained from tower observations in Yakutia by *Hollinger et al.* [1998], *Dolman et al.* [2004], and *Machimura et al.* [2005]. On the other hand, *Matamala et al.* [2003] obtained a value of 0.16 yr<sup>-1</sup> for loblolly pine (*Pinus taeda* L.) in North Carolina by using depleted <sup>13</sup>CO<sub>2</sub> under free-air CO<sub>2</sub> enrichment (FACE); this indicates the overestimation of  $r_{fr}$  by conventional methods. As an alternative, we adopted a value of 0.16 yr<sup>-1</sup> for  $r_{fr}$ .

[15]  $B_{fr}$  (fine root,  $\leq 5$  mm in diameter) was calculated from  $B_r$  by using the following equation [*Chen et al.*, 2002]:

$$B_{fr} = B_r(-0.1351\ln(B_r) + 1.3173).$$
(6)

This is common in spruce, pine, and boreal broadleaf forests. For larches (L. gmelinii) in Central Siberia [*Kajimoto et al.*, 1999, 2003],  $B_{fr}$  was calculated from  $B_r$  by using this equation, and the values of  $B_{fr}$  were 526 g/m<sup>2</sup> and 445  $g/m^2$ ; these values were similar to the actual values observed at the site, i.e., 590 g/m<sup>2</sup> and 410 g/m<sup>2</sup>, respectively. In Siberia, both a macroscopic inventory [Shvidenko and Nilsson, 1998] and site-level observation [Schulze et al., 1999] revealed that mortality is equivalent to net stem wood growth. Assuming a value of 0.4 gC/gC for  $\alpha_M$ , the Usoltsev yield table yields larch mortality in Yakutia as equivalent to its net stem wood growth on the basis of another assumption regarding the age distribution in Russian needleleaf forests [Shvidenko and Nilsson, 1996]. An  $r_b$  value of 0.05 yr<sup>-1</sup> was deduced by multiplying the value of the ratio of branch detritus to branch biomass in the 170-year-old larch forest in Yakutia [Kanazawa and Osawa, 1994] with the woody detritus decomposition rate of pine in Northwestern Russia, i.e., 0.05 yr<sup>-1</sup> [Harmon et al., 2000].

### 2.5. Forest Floor NPP

[16] For the following flux parameter determination, the hourly soil temperature at the soil surface and at a 10-cm depth in a *L. cajanderi* forest in Spasskaya Pad, Yakutia

	Value, gC $m^{-2} yr^{-1a}$	References
Soil heterotrophic respiration, SHR	49	Sawamoto et al. [2001, 2003]
Total soil respiration, TSR	325	Sawamoto et al. [2001, 2003]
Larch root respiration, $RR_l$	148	Kajimoto et al. [1999],
· · ·		Widen and Majdi [2001],
		Burton et al. [2002],
		Chen et al. [2002],
		Kajimoto et al. [2003],
		Saito et al. [2005].
$CO_2$ upward flux at the top of the	140	T. Machimura, personal
understory, $F_{CO2}$		communication, 2005
Understory root respiration, $RR_{u}$	128	this study <sup>b</sup>
Understory aboveground NPP, ANPP <sub>u</sub>	185	this study <sup>c</sup>
Understory NPP, NPP <sub>u</sub>	57	this study <sup>d</sup>

 Table 2. CO<sub>2</sub> Budget Components at the Neleger Site

<sup>a</sup>Value is revised by using temperature data in 1998.

<sup>b</sup>Value is estimated by  $RR_{\mu} = TSR - SHR - RR_{l}$ .

<sup>c</sup>Value is estimated by  $ANPP_u = TSR - F_{CO2}$ .

<sup>d</sup>Value is estimated by equation (7).

(1998) [*Ohta et al.*, 2001] was used; further, the anomalies estimated from the differences in the monthly mean air temperature between 1998 and a normal year were corrected. The fluxes for all months with the exception of May to September were assumed to be 0 gC m<sup>-2</sup> yr<sup>-1</sup>. In 1998, the average monthly mean air temperature in May, June, July, August, and September and from May to September was 4.2, 18.7, 20.1, 16.9, 3.5, and 12.7°C, respectively, which was slightly warmer than that in a normal year.

[17] Soil heterotrophic respiration (*SHR*) at the Neleger site was fixed at 49 gC m<sup>-2</sup> yr<sup>-1</sup> based on calculations made by *Sawamoto et al.* [2001, 2003]. They related the total soil respiration (*TSR*) to the soil temperature on the basis of flux measurements using a closed-chamber method conducted at the Neleger site. They determined the *TSR-SHR* ratio as 15% by conducting flux measurements from soil samples that were collected at each soil horizon at the Neleger site and incubated under various temperature conditions. Plants on the soil surface were removed before setting the chamber for the measurement. The *TSR* at the Neleger site was estimated to be 361 gC m<sup>-2</sup> yr<sup>-1</sup> in 1998; it changed to 325 gC m<sup>-2</sup> yr<sup>-1</sup> in a normal year after the monthly air temperature anomalies between the two years were corrected.

[18] NPP of the forest floor (understory) vegetation  $(NPP_u)$  was then calculated as follows:

$$NPP_u = ANPP_u - RR_u = (TSR - F_{CO2}) - (TSR - SHR - RR_l) = -F_{CO2} + SHR + RR_l,$$
(7)

where  $ANPP_{u}$  (gC m<sup>-2</sup> yr<sup>-1</sup>),  $RR_{u}$  (gC m<sup>-2</sup> yr<sup>-1</sup>),  $F_{CO2}$  (gC m<sup>-2</sup> yr<sup>-1</sup>), and  $RR_{l}$  (gC m<sup>-2</sup> yr<sup>-1</sup>) are understory aboveground NPP, understory root respiration, CO<sub>2</sub> upward flux at the top of the understory ( $F_{CO2}$ ), and larch root respiration ( $RR_{l}$ ), respectively. From the relationship between temperature and flux [*Hollinger et al.*, 1998],  $F_{CO2}$  in a *L. gmelinii* forest in Yakutia was estimated to be 85 gC m<sup>-2</sup> yr<sup>-1</sup>. The  $F_{CO2}$  at the Neleger site was 130 gC m<sup>-2</sup> yr<sup>-1</sup>, as determined by tower observations conducted in 2004 (T. Machimura, personal communication, 2005); this value was revised to 140 gC m<sup>-2</sup> yr<sup>-1</sup> in a normal year after the monthly air temperature anomalies between the two years were corrected using the temperature- $F_{CO2}$  relationship determined by *Hollinger et al.* [1998]. [19]  $RR_l$  at the Neleger site was fixed at 148 gC m<sup>-2</sup> yr<sup>-1</sup>. Burton et al. [2002] observed broad, cross-species relationships between the fine root respiration rate, nitrogen content, and temperature as follows:

$$FRR = (-0.185 + 0.83N) \exp(0.092T), \tag{8}$$

where *FRR* (nmol  $CO_2 \cdot g^{-1} \cdot s^{-1}$ ) is the fine root respiration rate, N (%) is the fine root nitrogen content, and T (°C) is the ambient temperature. The FRR at the Neleger site was calculated using the larch N at the site and it was found to be 0.68% [Saito et al., 2005]. Since the lateral roots of L. gmelinii in Siberia extend to a depth of 20 cm or lower below the ground surface [Kajimoto et al., 1999], the ambient temperature was set as the soil temperature at a depth of 10 cm. Coarse root respiration rates were found to be 8-23% of the FRRs in the Boreal Ecosystem-Atmosphere Study (BOREAS) sites in Canada [Widen and Majdi, 2001] and were fixed at 15% of the FRRs. From equation (6) and the Usoltsev yield table, the coarse and fine root biomass at the Neleger site were estimated as  $3060 \text{ g/m}^2$  and  $780 \text{ g/m}^2$ , respectively. This estimation was consistent with the results of a coarse root biomass study by Kanazawa and Osawa [1994]. On the basis of the relationship between temperature and root respiration, larch root respiration  $(RR_l)$  at the Neleger site was estimated as 148 gC m<sup>-2</sup> yr<sup>-1</sup> by weighing the coarse and fine root biomass.

[20] Thus, from equation (7),  $NPP_u$  was estimated to be 57 gC m<sup>-2</sup> yr<sup>-1</sup> at the Neleger site. Correspondingly, from the *TSR*, the *ANPP<sub>u</sub>* and *RR<sub>u</sub>* at the Neleger site were estimated to be 185 gC m<sup>-2</sup> yr<sup>-1</sup> and 128 gC m<sup>-2</sup> yr<sup>-1</sup>, respectively. CO<sub>2</sub> budget components at the Neleger site are summarized in Table 2.

[21] Forest floor mapping and plant identification were carried out in the 30 m  $\times$  30 m plot at the Neleger site. On the basis of these studies, the plant cover ratios of *V. vitisidaea*, other shrubs (*Rosa acicularis* Lindl., *Salix bebbiana* Sarg., *Betula platyphylla* Sukachev, etc.), herbaceous plants (*L. stelleri* Trin. etc.), and mosses (*Tomenthypnum nitens* (Hedw.) Loeske, *Polytrichum strictum* Brid., *Ptilidium ciliare* (L.) Hampe, etc.) were calculated and were found to be 41%, 4%, 7%, and 1%, respectively. Assuming that



**Figure 1.** Changes in the components of the upper canopy (larch) LAI  $(LAI_l)$  and larch NPP  $(NPP_l)$  with the age of the larch forest (site index: *Vaccinium* type, V) in Yakutia. The solid circles indicate larch LAI  $(LAI_l)$ . The areas within solid polygons indicate carbon increment due to biomass increment  $(\Delta C)$ , foliage turnover  $(L_f)$ , fine root turnover  $(L_{fr})$ , and mortality (M) (arranged from darker to brighter shades); the white area indicates branch turnover  $(L_b)$ .

the contributions of the mosses to the  $NPP_u$  are negligible and that the NPP of *V. vitis-idaea*, other shrubs, and the herbaceous plants per unit ground area is equivalent to that obtained at the Neleger site, which was 57 gC m<sup>-2</sup> yr<sup>-1</sup>, the relationship between the forest floor vegetation cover *FVC* (%) and  $NPP_u$  was defined as follows:

$$NPP_u = 1.10FVC (gC m^{-2} yr^{-1}).$$
(9)

# 2.6. Relationship Between NPP, Larch LAI, FVC, and Spectral Indices

[22] By using the radiative transfer model mentioned in section 2.3, we considered individual estimation of larch LAI and FVC from spectral indices. We then directly compared the estimation of the total NPP from NDVI and the quotients of difference and summation of bands 4 and 2 (B4 - B2)/(B4 + B2) and the NDVI (B4 - B3)/(B4 + B3)with that obtained from equation (11), in which the values of larch LAI and FVC were individually estimated from the spectral data. B4 (%) and B3 (%) are atmospherically corrected reflectance factors in Landsat ETM+ bands 4 and 3, respectively. NDVI was calculated from the reflectance factors, and which differs from the NDVI calculated from the spectral radiance or digital count values. In the simulation, we assumed that larch LAI and FVC are uniformly distributed from 0 to 4 and from 0% to 100%, respectively. NDVI, (B4 - B2)/(B4 + B2), and the forest canopy reflectance factors were calculated for each larch LAI and FVC, assuming independent normal distributions of the larch leaf reflectance and transmittance and reflectances of V. vitis-idaea and fallen leaves with the averages and standard deviations obtained in the spectral measurements.

# 3. Results

# **3.1.** Relationship Between NPP, Larch LAI, FVC, and Spectral Indices

[23] Analysis of the relationships between the upper canopy (larch) LAI and the larch NPP components showed

that the larch forest was characterized by a high contribution of foliage turnover to the larch NPP, and the LAI ( $LAI_l$ ) and NPP ( $NPP_l$ ) were highly correlated. The changes in the LAI and NPP components with the age of the larch forest (site index: *Vaccinium* type, V) are shown in Figure 1. The relationship between the LAI and NPP of the larch forest in Yakutia for the eight site indices are shown in Figure 2. The relationship between the upper canopy LAI and NPP was independent of the site index while that of spruce forests in North America was dependent on the site index [*Kushida et al.*, 2004, Figure 5]. The relationship between  $LAI_l$  and  $NPP_l$  was as follows:

$$NPP_l = 70.4LAI_l (gC m^{-2} yr^{-1}) \quad (R^2 = 0.90).$$
 (10)



**Figure 2.** Relationship between the upper canopy (larch) LAI  $(LAI_l)$  and larch NPP  $(NPP_l)$ . The solid circles correspond to each site index at each age.

Band	Wavelength	V. vitis-idaea	Fallen Leaves	Leaf reflectance	Leaf transmittance
1	0.45–0.52 μm	$3.2 \pm 0.5$	$4.9 \pm 0.6$	$6.1 \pm 0.8$	$2.1 \pm 0.9$
2	$0.53 - 0.61 \ \mu m$	$8.8 \pm 1.1$	$9.4 \pm 1.1$	$13.2 \pm 1.8$	$7.7 \pm 0.9$
3	$0.63 - 0.69 \ \mu m$	$4.9 \pm 0.9$	$11.2 \pm 1.7$	$6.3 \pm 1.1$	$1.2 \pm 0.1$
4	$0.75 - 0.90 \ \mu m$	$41.3 \pm 3.8$	$24.1 \pm 3.2$	$48.8 \pm 5.1$	$38.8 \pm 3.7$
5	$1.55 - 1.75 \ \mu m$	$27.3 \pm 4.7$	$41.6 \pm 6.9$	$32.4 \pm 3.0$	$24.6 \pm 3.4$
7	$2.09 - 2.35 \ \mu m$	$25.0 \pm 10.9$	$47.5 \pm 9.8$	$58.6 \pm 10.2$	$22.8 \pm 14.7$

 Table 3. Spectral Characteristics of Forest Floor Components and Leaves of the Larch Forest in Landsat ETM+

 Bands<sup>a</sup>

<sup>a</sup>Values are given as average ± standard deviation, unit:%. The number of samples is 10 for forest floor reflectance and 14 for leaf reflectance and transmittance.

[24] The root mean square error (RMSE) of the  $NPP_l$  estimation was 26 gC m<sup>-2</sup> yr<sup>-1</sup>. From equations (1), (9), and (10), we obtain the following equation:

$$NPP = 70.4LAI_l + 1.10FVC + D(gC m^{-2} yr^{-1}), \qquad (11)$$

where D (gC m<sup>-2</sup> yr<sup>-1</sup>) is a term that represents any unknown factors including climate factors. Equation (11) indicates that 1 (m<sup>2</sup>/m<sup>2</sup>) of *LAI*<sub>l</sub> is equivalent to 64 (%) of *FVC*.

[25] From the radiative transfer analyses carried out using the component spectral characteristics observed, band 2 was found to be the most effective among the single bands, biband ratios, and quotients of bi-band difference and summation to obtain larch LAI. The reflectances from the larch canopy in band 2 were independent of the forest floor types. Table 3 shows the component spectral characteristics that were observed in the Landsat ETM+ bands. In band 2, V. vitis-idaea and the fallen leaves on the forest floor showed similar reflectances, and the reflectance factors of the larch forest in band 2 decreased as the larch LAI increased. In the other bands or any bi-band ratios, V. vitis-idaea and the fallen leaves showed different reflectances or exhibited lower sensitivities of the larch canopy reflectance to the larch LAI. For example, V. vitis-idaea had higher NDVI and (B4 - B2)/(B4 + B2) than those of the fallen leaves. Figure 3 shows the relationships of larch LAI and FVC with NDVI and (B4 - B2)/(B4 + B2). Both NDVI and (B4 - B2)/(B4 + B2). (B4 + B2) increased with an increase in the larch LAI and FVC, and the individual values of larch LAI and FVC were not well estimated using these spectral indices.

[26] The LAI value calculated from band 2 was used as the input for the radiative transfer model in the other bands. Among the single bands, bi-band ratios, and quotients of bi-band difference and summation, band 5 was the most sensitive to FVC. FVC was assigned a value under the assumption of independent normal distributions of the larch leaf reflectance and transmittance and the reflectances of *V. vitis-idaea* and the fallen leaves with the averages and standard deviations obtained in the spectral measurements. Figure 4 shows the relationships of larch LAI and FVC with bands 2 and 5, respectively.

[27] Individual values of larch LAI and FVC were not well estimated using *NDVI* and (B4 - B2)/(B4 + B2); however, these indices have the potential to estimate gross primary productivity as shown in previous studies. We compared the estimation of the total NPP by using *NDVI* and (B4 - B2)/(B4 + B2) with that by using equation (11) in

which the values of larch LAI and FVC were estimated using bands 2 and 5 under the assumptions mentioned in 2.6. Figure 5 shows the result of the simulation. The plateaus in the lower and higher NPPs in Figures 5a, 5b, and 5c resulted from the upper and lower limits of larch LAI and FVC that were set in the simulation. The RMSEs of the estimation using *NDVI*, (B4 - B2)/(B4 + B2), and the function of bands 2 and 5 at 200 gC m<sup>-2</sup> yr<sup>-1</sup> of NPP were 80, 75, and 48 gC m<sup>-2</sup> yr<sup>-1</sup>, respectively. Over the entire NPP range, the estimation using *NDVI* and (B4 - B2)/(B4 + B2). This shows that NPP estimation using the function of bands 2 and 5 was more effective than that using the others, provided the spectral data are atmospherically corrected.

### **3.2.** NPP Mapping

[28] Using equation (11) and the relationship of larch LAI and FVC with bands 2 and 5 (Figure 4), the geographical distributions of larch LAI, FVC, and the annual NPP were calculated using the August 2000 Landsat ETM+ imagery. The geographical distributions are shown in Figure 6. Evaluation by field observations at the Neleger site (Table 4, Neleger site) showed that the observed values of larch LAI and FVC were within the average  $\pm$  standard deviations of the estimated values of the two, respectively.



**Figure 3.** Relationships between the larch LAI (*LAI*<sub>*l*</sub>), forest floor vegetation cover (*FVC*), and Landsat ETM+ spectral indices. (a) Landsat ETM+ NDVI versus larch LAI (*LAI*<sub>*l*</sub>); the solid and dotted lines indicate 100% and 0% *FVC*, respectively. (b) (B4 - B2)/(B4 + B2) versus larch LAI (*LAI*<sub>*l*</sub>); the solid and dotted lines indicate 100% and 0% *FVC*, respectively. *B2* and *B4* denote reflectance factors (%) in Landsat ETM+ bands 2 and 4, respectively.



**Figure 4.** Relationships between larch LAI (*LAI<sub>l</sub>*), forest floor vegetation cover (*FVC*), and reflectance factors. (a) Landsat ETM+ band 2 versus larch LAI (*LAI<sub>l</sub>*); the solid and dotted lines indicate 100% and 0% *FVC*, respectively (*LAI<sub>l</sub>* = -1.321ln (0.2154*B*2 - 0.9698), R<sup>2</sup> = 0.99). (b) Landsat ETM+ band 5 versus *FVC*; the chain, dotted, and solid lines indicate *LAI<sub>l</sub>* values of 1, 2, and 4, respectively. (*FVC* = -11.7B5 + 357 + E1 (*LAI<sub>l</sub>* = 1), *FVC* = -20.8B5 + 491 + E2 (*LAI<sub>l</sub>* = 2), and *FVC* = -73.0B5 + 1284 + E4 (*LAI<sub>l</sub>* = 4)), where *E1*, *E2*, and *E4* are error functions and are 0 at *B5* = 50 (%), and *B2* and *B5* denote reflectance factors (%) in Landsat ETM+ bands 2 and 5, respectively.

NPP was, however, overestimated. The average larch NPP that was estimated from the Landsat scene  $(194 \pm 22 \text{ gC m}^{-2} \text{ yr}^{-1})$  (Table 4, 185 km × 185 km area) was lower than that of the Neleger site by 30 gC m<sup>-2</sup> yr<sup>-1</sup>.

[29] The relationship between the estimated NPP and NDVI showed that the range corresponding to each NDVI value was so wide that the NPP estimation by the NDVI could show different results from that by the individual estimation of larch LAI and FVC. Figure 7 shows the relationship between the estimated NPP and the NDVI for larch forests observed using Landsat ETM+ imagery. The lattices of the low-probability densities in Figure 7 were caused by quantization of the imagery. There was a significant correlation between the estimated NPP (NPP (gC m<sup>-2</sup> yr<sup>-1</sup>)) and NDVI (NDVI) (NPP = 511NDVI - 236,  $R^2 = 0.17$ ), but the RMSE in the regression was 20 gC m<sup>-2</sup> yr<sup>-1</sup>,

which was close to the standard deviation of the estimated NPP (22 gC m<sup>-2</sup> yr<sup>-1</sup>).

[30] Larch LAI and FVC estimated from the Landsat ETM+ imagery were correlated ( $LAI_l = -4.35FVC + 4.68$ ,  $R^2 = 0.71$ ), but the distributions of the FVC, larch LAI, and the corresponding NPP estimated from the Landsat ETM+ imagery (Figure 8), revealed that the variations in FVC contributed to those in NPP even if the larch LAI was constant. This was because the isograms of NPP were almost parallel to the regression line of the larch LAI-FVC relationship. Thus FVC influences the estimation of larch canopy NPP using Siberian imagery.

### 4. Discussion

[31] On the basis of forest biometric and CO<sub>2</sub> budget parameters, we found that the larch LAI and FVC are indicators of the annual NPP of Siberian larch forest. These indicators were related to Landsat ETM+ bands using a radiative transfer model and component spectral characteristics. The distributions of the LAI, FVC, and NPP were mapped using Landsat ETM+ imagery. Evaluation using field observations showed that the estimated and observed values of larch LAI and FVC were equivalent; however, the estimated NPP was greater than that obtained from observations from meteorological towers and the heterotrophic soil respiration at the study site.

[32] The overestimation of NPP appeared to be due to the inadequacy of parameters for forest biometry and the influence of FVC. The estimated NPP was greater than that observed even when the differences between the estimated and observed values of larch LAI and FVC were corrected. Nevertheless, the biometric and meteorological methods for  $CO_2$  budget estimation are based on different frameworks, and a simple comparison is difficult. The meteorological method detects the year-to-year variation, while the biometric method indicates the average values in the last 10 to 100 years.

[33] The contributions of heterotrophic respiration to the total soil respiration of larch [*Sawamoto et al.*, 2003] and pine [*Kelliher et al.*, 1999; *Santruckova et al.*, 2003] forests in Siberia were smaller than those of the boreal forests in Canada and Sweden [*Bond-Lamberty et al.*, 2004]. However,



**Figure 5.** Simulation of NPP (*NPP*) estimation by (a) NDVI, (b) (B4 - B2)/(B4 + B2), and (c) larch LAI (*LAI*<sub>l</sub>) and forest floor vegetation cover (*FVC*) calculations by *B*2 and *B*5. The solid and dotted lines indicate average and average ±S.D., respectively. In the simulation, *LAI*<sub>l</sub> and *FVC* were assumed to be uniformly distributed from 0 to 4 and from 0% to 100%, respectively.



**Figure 6.** Geographical distributions of (a) upper canopy (larch) LAI (*LAI*<sub>*l*</sub>), (b) forest floor vegetation cover (*FVC*), and (c) annual NPP (*NPP*) (Landsat ETM+ 122-16 on 13 August 2000;  $61.8^{\circ}N-63.9^{\circ}N$ ,  $126.6^{\circ}E-131.3^{\circ}E$ ; 300-m grid).

there are limited documented analyses of the soil heterotrophic respiration of the Siberian larch forest, and this makes evaluation difficult. Assuming that the soil heterotrophic respiration is greater by  $\alpha$  gC m<sup>-2</sup> yr<sup>-1</sup> than the observed value, *NPP*<sub>u</sub> can be shown to increase by  $\alpha$  gC m<sup>-2</sup> yr<sup>-1</sup> from equation (9), and the NPP at the Neleger site is of the same value as that derived from equation (11).

[34] Mortality (*M*) that was set at 0.4 yr<sup>-1</sup> (Table 1) was greater than or equal to that of spruce forests in Canada for which *M* ranged from 0.2 to 0.4 yr<sup>-1</sup> [*Chen et al.*, 2002]. The  $r_b$  value that was set at 0.05 yr<sup>-1</sup> was greater than that of spruce forests in Canada ( $r_b$  value, 0.024 yr<sup>-1</sup>) [*Chen et al.*, 2002]. Assuming the mortality and branch turnover rate

to be 0.3 yr<sup>-1</sup> and 0.024 yr<sup>-1</sup>, respectively, the NPP at the Neleger site was found to decrease by 5 gC m<sup>-2</sup> yr<sup>-1</sup> and 6 gC m<sup>-2</sup> yr<sup>-1</sup>, respectively.

[35] A possible reason for the overestimation may be that the parameters are barely measured. The  $r_{fr}$  value was set at  $0.16 \text{ yr}^{-1}$  by adopting the value in North Carolina that was determined using depleted <sup>13</sup>CO<sub>2</sub>, but  $r_{fr}$  is generally observed to decrease with latitude [*Gill and Jackson*, 2000]. If the  $r_{fr}$  at the Neleger site is assumed to be  $0.08 \text{ yr}^{-1}$ , the NPP at this site decreases by 14 gC m<sup>-2</sup> yr<sup>-1</sup>. In direct flux observations, it was difficult to distinguish between  $RR_l$  and *V. vitis-idaea* root respiration. If 10%  $RR_l$ variation is assumed, the NPP at the Neleger site changes by

Table 4.	Evaluation	of the	Estimation	Using	Field	Observation	ıs
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	Estimated <sup>a</sup>	Observed	References
		Neleger Site	
LAI	$2.2\pm0.3$	2.4	Shibuya et al. [2004], Kanazawa and Osawa [1994]
FVC,%	$61 \pm 9$	52 <sup>b</sup>	this study
NPP, gC m <sup><math>-2</math></sup> yr <sup><math>-1</math></sup>	222 ± 24	130–180 <sup>c</sup>	Machimura et al. [2005], Sawamoto et al. [2001, 2003]
	185	$km  imes 185 \ km \ Area$	
LAI	$1.7 \pm 0.4$		
FVC,%	$69 \pm 8$		
NPP, gC $m^{-2}$ yr <sup>-1</sup>	$194 \pm 22$		

<sup>a</sup>Values are estimated from this study. For the Neleger site LAI and FVC, the averages  $\pm$  standard deviations were determined assuming the independent normal distributions of larch leaf reflectance and transmittance and the reflectances of *V. vitis-idaea* and fallen leaves with the averages and standard errors obtained in the spectral measurements. For the Neleger site NPP, the averages  $\pm$  standard deviations were determined using equations (11) and (2) assuming that the standard deviations of LAI and FVC and the RMS of larch NPP estimation from equation (10). For a 185 km × 185 km area, the averages $\pm$ standard deviations for a 300 m × 300 m unit area were calculated using Landsat ETM+ (13 August 2000; path: 122, row: 16; 61.8°N-63.9°N, 126.6°E-131.3°E).

<sup>b</sup>Percentages are as follows: 41% *V. vitis-idaea*, 4% other shrubs, and 7% herbaceous plants.

<sup>c</sup>Range is obtained from tower flux observations and soil heterotropic respiration at the Neleger site.



**Figure 7.** Relationship between NDVI and NPP estimated using the proposed method by Landsat ETM+ imagery. The probability densities were normalized by the maximum value.

15 gC m<sup>-2</sup> yr<sup>-1</sup>. There is little information on the specific leaf area (SLA) of Siberian larch trees, although SLA is one of the most important parameters in remote sensing and concerns the coefficient of the relationship between larch LAI and larch NPP. If a 10% SLA variation is assumed, the NPP at the Neleger site changes by 15 gC m<sup>-2</sup> yr<sup>-1</sup>. Therefore a combination of the variations in the abovementioned parameters can account for the overestimation of NPP.

[36] The variations in turnover rates and understory NPP with those in the tree age and sites were not accounted for in this study because of the lack of observations. However, a strong relationship exists between larch LAI and larch NPP, and the relationship is based on foliage turnover that is equivalent to the upper layer LAI. When  $M, r_b, r_{fr}$ , and SLA were assumed to have the maximum values of 0.3  $yr^{-1}$ , 0.024 yr<sup>-1</sup>, 0.08 yr<sup>-1</sup>, and 153.3 cm<sup>2</sup>/g (d.w.), respectively, NPP<sub>l</sub> was found to be  $52.1LAI_l$  (R<sup>2</sup> = 0.79) with an RMSE of 32 gC m<sup>-2</sup> yr<sup>-1</sup>. NPP<sub>u</sub> was implicitly estimated, and detailed observations in the future will lend better accuracy to this value. On the other hand, the CO<sub>2</sub> assimilation rate of V. vitis-idaea was equivalent to that of L. gmelinii based on the observations made in Yakutia by Vygodskaya et al. [1997]. The LAI of V. vitis-idaea was 67% of the LAI of larch in a 130-year-old L. gmelinii forest in Yakutia [Kelliher et al., 1997]. These studies support the inclusion of  $NPP_u$  as an indicator of NPP. In the East Siberian larch forest, surface fires often occur. The frequency of surface fires characterizes the forest floor vegetation cover. The high variation in the forest floor vegetation cover that is caused by frequent surface fires in this region supports the assumption that the  $NPP_u$  per unit vegetated area is a constant proportional value.

[37] The estimation of the larch LAI from Landsat ETM+ band 2 was based on the observation that the reflectance factors of *V. vitis-idaea* and the fallen larch leaves in band 2 were similar, and the absorption by live larch leaves in band 2 was 79% (Table 3). The reflectance factor of the live larch leaves was slightly greater than those of the fallen larch leaves and *V. vitis-idaea*. On the other hand, the distribution of the live larch leaves was observed to be three-dimensional, while those of *V. vitis-idaea* and the fallen larch leaves were horizontal. Owing to the high absorption of the live larch leaves, the increase in the larch LAI leads to an exponential increase in the absorption of the larch canopy in band 2, thereby decreasing the reflectance from the larch forest in band 2 (Figure 4a).

[38] The estimated NPP had a weak positive correlation with the NDVI for the larch forests that was observed using Landsat imagery (Figure 7). This suggests that NDVI is an indicator of larch NPP but does not perform as well as the estimation method used in this study. The estimation of the larch LAI and FVC as indicators of NPP is connected to the scientific bases obtained through biometric and meteorological studies. The negative correlation between the larch LAI and FVC that was estimated using Landsat imagery (Figure 8) can be explained by a reduction in the incident solar irradiance transmitted to the forest floor vegetation due to the increased larch LAI. The high contribution of FVC to the total NPP indicates that besides LAI, FVC is also an indicator of NPP. Other studies have noted similarly important influences of ground cover on boreal forest NPP [e.g., Goetz and Prince, 1996].

### 5. Conclusion

[39] We proposed several spectral indices to estimate the upper canopy LAI, forest floor vegetation cover, and NPP distributions of larch forests in East Siberia based on biometric analyses of the  $CO_2$  budget, spectral measurements of the larch leaf and forest floor components, and radiative transfer modeling. Further, we evaluated the estimates using observations of field LAI, FVC, and meteorological  $CO_2$  budgets. LAI has been estimated by remote



**Figure 8.** Relationship between the forest floor vegetation cover (*FVC*), larch LAI (*LAI*<sub>*l*</sub>), and NPP estimated using Landsat ETM+ imagery. The probability densities were normalized by the maximum value. The dotted lines denote isograms of the estimated NPP.

sensing in many previous studies, but the relationship between LAI and the NPP components has rarely been studied at an individual tree-species level. Thus far, observations of the NPP of forest floor vegetation have been restricted to species such as mosses and lichens. This study includes assumptions for NPP component estimation, but comparisons of ecological and physiological studies using the results of this study may lead to further advancement in both these areas of research.

# Notation

- *NPP* net primary productivity (NPP), gC  $m^{-2}$  $yr^{-1}$ .
- net ecosystem productivity (NEP), gC NEP  $m^{-2} yr^{-1}$ .
- $NPP_l$  net primary productivity (NPP) of larch, gC m<sup>-2</sup> yr<sup>-1</sup>.
- NPP, NPP of understory, gC m<sup>-2</sup> yr<sup>-1</sup>.
- SHR soil heterotrophic respiration, gC  $m^{-2}$  $\mathrm{yr}^{-1}$ .
  - biomass of stem, g/m<sup>2</sup>.  $B_{s}$
  - $B_f$  biomass of foliage, g/m<sup>2</sup>.
  - $B_b$  biomass of branches, g/m<sup>2</sup>.
  - $B_r$ biomass of root,  $g/m^2$ .
  - biomass of fine roots,  $g/m^2$ .  $B_{fr}$
  - S stand density,  $m^{-2}$ .
- $\Delta C$ carbon increment due to biomass increment, gC m<sup>-2</sup> yr<sup>-1</sup>
- $L_f$  foliage litter fall, gC m<sup>-2</sup> yr<sup>-1</sup>.  $L_b$  branch litter fall, gC m<sup>-2</sup> yr<sup>-1</sup>.
- $L_b$
- fine root turnover, gC m<sup>-2</sup> yr<sup>-1</sup>  $L_{fr}$
- M mortality, gC m<sup>-2</sup> yr<sup>-1</sup>.
- turnover rate of foliage,  $yr^{-1}$  $r_{f}$
- turnover rate of branches,  $yr^{-1}$  $r_b$
- turnover rate of fine roots,  $yr^{-1}$ r<sub>fr</sub>
- carbon content of foliage, gC/g.  $C_f$
- carbon content of branches, gC/g.  $C_b$
- carbon content of fine roots, gC/g.  $C_{fr}$
- $A_i$ age, years.
- $B(A_i)$  biomass at age  $A_i$ , g/m<sup>2</sup>.
- $C(A_i)$  carbon amount at age  $A_i$ , gC/m<sup>2</sup>.
- $S(A_i)$  stand density at age  $A_i$ , m<sup>-</sup>
- coefficient of mortality, gC/gC.  $\alpha_M$
- specific leaf area,  $cm^2/g$  (d.w.) SLA
- upper canopy (larch) LAI, m<sup>2</sup>/m<sup>2</sup>  $LAI_{l}$
- total soil respiration, gC  $m^{-2}$  yr<sup>-1</sup> TSR
- understory above ground NPP, gC  ${\rm m}^{-2}$  $ANPP_{u}$  $vr^{-1}$ .
  - $RR_u$  understory root respiration, gC m<sup>-2</sup> yr<sup>-1</sup>.
  - $F_{CO2}$  CO<sub>2</sub> upward flux at the top of the understory, gC  $m^{-2}$  yr<sup>-1</sup>.
  - larch root respiration, gC m<sup>-2</sup> yr<sup>-1</sup>.  $RR_1$
  - fine root respiration rate, nmol  $CO_2 g^{-1}$ FRR  $s^{-1}$ .
    - N fine root nitrogen content, %.
    - ambient temperature, °C.
  - FVCforest floor vegetation cover, %.
  - disturbance term (unknown factors) for NPP estimation, gC  $m^{-2} yr^{-1}$ .
- NDVI normalized difference vegetation index determined by Landsat ETM+ imagery.

- B2 reflectance factor in Landsat ETM+ band 2, %.
- reflectance factor in Landsat ETM+ band *B*3 3, %.
- reflectance factor in Landsat ETM+ band *B*4 4, %.
- reflectance factor in Landsat ETM+ band *B*5 5, %.
- E1, E2, and E4 error functions for forest floor vegetation cover estimation, %.

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