

# Airborne Measurements of Surface Albedo and Leaf Area Index of Snow-Covered Boreal Forest

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# JGR Atmospheres

## RESEARCH ARTICLE

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#### **Key Points:**

- · Surface albedo and effective leaf area index (LAI) can be measured at fine resolution and landscape scale simultaneously using helicopter
- Surface albedo and effective LAI are coherently retrieved based on a photon recollision probability based model
- Airborne and satellite-based surface albedo show a good agreement

#### **Supporting Information:**

Supporting Information may be found in the online version of this article.

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# Airborne Measurements of Surface Albedo and Leaf Area **Index of Snow-Covered Boreal Forest**

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**Abstract** Helicopter based simultaneous measurements of broadband surface albedo and the effective leaf area index (LAI<sub>eff</sub>) were carried out in subarctic area of Finnish Lapland in spring 2008, 2009, and 2010 under varying illumination and snow cover conditions. Vertical profile measurements show that the found relationship between albedo and LAI<sub>eff</sub> seems to be rather independent of the flight altitude and therefore the footprint scale. Actually, flights above 500 m in altitude revealed low variations of the surface albedo approaching an aerial average at 1 km, meaning that a footprint of 20 km is representative of the landscape. The albedo of the area was beta distributed, and without  $LAI_{eff}$  values below 0.25, the average albedo value of the area would decrease from 0.49 to 0.44 showing the albedo sensitivity to sparse vegetation. The results agreed with the photon recollision probability based model PARAS and the MODIS satellite albedo product MCD43A3. However, differences between satellite based and airborne albedo values were noticed, which could be explained by a difference in footprint size and/or the strong local heterogeneity as certain flights were operated on specific targets.

Plain Language Summary Helicopter based measurements were used to assess how much a forest stand laying over a snow slab reduces the surface albedo at high latitudes where the sun zenith angle is large and shadow cast is always important. The effect is amplified in the case of sparse vegetation as there is less mutual shadowing. Model results and satellite observations are found in good agreement with the airborne data

#### 1. Introduction

Surface albedo is an Essential Climate Variable (ECV) as it determines the net radiation (GCOS, 2016). All changes in existence of snow and snow properties have a marked effect on the surface albedo because fresh snow is a particularly highly reflecting material in the visible—with a slow decrease in the near infrared - compared to most land cover types with the exception of deserts. Today the boreal biome is characterized by tree stands laying above snow for about half a year. Vegetation attributes strongly influence the snow-melting when the sun elevation is rapidly increasing during springtime (Betts & Ball, 1997). Actually, leaves (described with leaf area index (Chen & Black, 1992)) and snow form a complex system with close interactions (Essery, 2013; Jääskeläinen & Manninen, 2021; Manninen & Jääskeläinen, 2018; Manninen & Stenberg, 2009; Verseghy et al., 1993; Webster & Jonas, 2018). In the visible range, surface albedo is quite high—especially with fresh snow—and shadows cast by crown and trunk drive the landscape visual heterogeneity. In the near-infrared, radiation absorption by woody material initiates the snow metamorphism and melt around trunks. Due to climate change, snow occurrence has reduced by several weeks in many areas in the boreal zone during the last decades (Anttila et al., 2018; Bormann et al., 2018; Brown & Mote, 2009; Derksen & Brown, 2012; Manninen, Aalto, et al., 2019; Manninen, Jääskeläinen et al., 2019).

Several studies show changes in the vegetation of the Arctic (Berner et al., 2020; Buitenwerf et al., 2015; Piao et al., 2011). In many places the sub-Arctic plant productivity has increased. The tundra areas have witnessed a significant increase in shrub coverage and size (Forbes et al., 2010). Shrub abundance also enhances the melt in the spring causing earlier snow melt, which also decreases the albedo of the sub-Arctic and increases the absorption of solar energy to the ground. This has a potentially significant effect on the surface albedo of the sub-Arctic

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MANNINEN ET AL. 1 of 29 areas, as tundras are traditionally open areas and forest vegetation in the northern areas of the boreal forest zone is sparse. In the sub-Arctic the snow covers the ground until May, during which time there is already considerable amount of sunlight. Consequently, any changes in albedo will inevitably also affect the energy balance. In the area studied, the possible changes would be related to forest coverage and density as shown by the effective leaf area index. One aspect of this study is related to the effective leaf area index distribution in the area and how changes in it would change the albedo of the area.

Satellite based surface albedo products (e.g., Anttila et al., 2016; Carrer et al., 2021; Govaerts et al., 2008; Karlsson et al., 2017; Liu et al., 2013; Lucht et al., 2000; Schaaf et al., 2002) are able to provide global estimates of the surface albedo, but in regard to the sensitivity to several environmental factors—wind and air temperature may accelerate the processes—the collection of *in situ* measurements is mandatory to enhance our understanding and supports the validation exercise. Continuous *in situ* measurements from ground-based networks offer the suitable temporal frequency to capture the dynamic of snow melt but they are not representative of the processes occurring at landscape scale. Snow metamorphism is typically not yet observed operationally. On the other hand, satellite-based surface albedo can offer a regional vision but with pixels of a moderate spatial resolution, thereby generating problems of representativity (Riihelä et al., 2010; Róman et al., 2010). Airborne albedo measurements meet the requirements in offering the appropriate flexibility in terms of time frequency, spatial resolution, and a large areal coverage.

Previously, airborne albedo measurements have covered diverse sites: both ocean (Gatebe et al., 2005; Wendisch et al., 2004) and sea ice (Predoehl & Spano, 1965) and a wide variety of land cover types, both snow-covered (Bergstrom et al., 2020; Ryan et al., 2017) and snow-free (Cao et al., 2018; Gatebe et al., 2003; Webb et al., 2004; Wendisch et al., 2004). Seasonal variability of boreal forest albedo was investigated by Solantie (1988). The collected airborne albedo were used both for conducting modeling studies and for the validation of satellite-based albedo products.

Airborne measurements of broadband surface albedo covering large areas have mostly been carried out using airplanes with up- and down-facing pyranometers (Predoehl & Spano, 1965). The flight altitude has varied in the range 300 m (Solantie, 1988)–2300 m (Predoehl & Spano, 1965). Spectral airborne albedo measurements have been carried out using airplanes with wavelength-scanning spectroradiometers (Gatebe et al., 2005; Webb et al., 2000, 2004). The altitude varied within 200 m (Gatebe et al., 2005), 600 m (Gatebe et al., 2003) and 370–1,700 m (Webb et al., 2004), 200–500 m (Wendisch et al., 2004) and 800 m–8 km (Román et al., 2011, 2013). In this study the flight altitude varies in the range 20–880 m. It would have been possible to fly higher, but the average albedo of the area was achieved already at about 800 m.

Recently unmanned aerial vehicles (UAV) have become popular in measuring broadband surface albedo. First experiments were carried out using ordinary cameras (Cao et al., 2018; Ryan et al., 2017), but later on a quadcopter UAV has been used to carry the downward looking pyranometer, the upward looking pyranometer being at a fixed point in the flight area (Levy et al., 2018). As fixed wing UAVs are typically able to carry more weight than average quadcopters, they have also been used to carry both the up- and downward looking pyranometers (Ryan et al., 2017). The possibility to program the flight route of an UAV in advance enables carrying out very detailed flight plans. Fixed wing UAVs can in principle operate in a large area (range about 140 km) and the altitude may be as large as 600 m. On the contrary, the pilot of the quadcopter UAV usually has to keep eye contact to it and the maximum altitude is in practice about 100 m (Cao et al., 2018). In addition, in winter conditions the practical limit for the flight lengths of quadcopters comes typically from the frequent need of battery recharging. The smaller UAVs can't carry very heavy loads, which also limits the choice of the instrument to use. On the other hand, the quadcopters offer a very flexible possibility to study the reflectance characteristics of targets in three dimensions and will support modeling with data otherwise not achievable.

Helicopters have been used less frequently as a platform for airborne surface albedo measurements, probably because of problems related to irradiance measurements, as placing an upwards looking pyranometer unoccluded above the helicopter is not possible in practice. Hence, calibration of the global radiation measurements is challenging. Bergström et al. (2020) had one pyranometer below the helicopter registering the reflected radiation and the irradiance was observed at meteorological stations.

The advantages of a helicopter as the airborne platform are that (a) it is able to cover a large area over a short time, (b) the flight altitude is flexible enough to capture different footprint sizes, (c) vertical profiling is possible, (d) it can carry the expected payload to support the synergy of spectral data sets, (e) electricity is sufficiently available

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**Figure 1.** Pyranometer (P), UV sensor (UV) and camera (C) attachment to the helicopter. The other pairs of pyranometers and UV sensors are attached to the opposite landing gear symmetrically. The thermometer and the humidity sensor are attached at the back of the opposite landing gear below the fuselage.

even in cold weather, (f) flight planning can be quickly adjusted to varying atmospheric conditions and (g) flight routes do not have to be linear as for an aircraft and it is possible to hover at a point and rotate 360° to statistically sample a scenery BRDF (Bidirectional Reflectance Distribution Function).

This study presents surface albedo data measured during the SNORTEX (SNOw Reflectance Transition EXperiment) campaign from helicopter measurements acquired during 2008–2010 in Northern Finland (Manninen and Roujean, 2014; Manninen, Korhonen, Riihelä, et al., 2012; Manninen, Korhonen, Voipio, et al., 2012) using two pairs of pyranometers for observing both the irradiance and the reflected radiation. The study area belongs to northern boreal vegetation zone and subarctic climate zone. The data contains snow cover situations corresponding to pre-melt conditions and various phases of the melting season. The leaf area index (LAI) was measured simultaneously to radiation measurements from the helicopter (Manninen et al., 2009; Manninen, Korhonen, Riihelä, et al., 2012; Manninen, Korhonen, Voipio, et al., 2012).

The goal of the whole study was to observe the variation of surface albedo of a forested area in diverse phases of the snow cover evolution. Of special interest was the relationship between the surface albedo and the effective leaf area index  $LAI_{eff}$ . The large airborne  $LAI_{eff}$  data set enabled validation of the PARAS albedo model (Jääskeläinen & Manninen, 2021; Manninen & Jääskeläinen, 2018; Manninen & Stenberg, 2009; Rautiainen & Stenberg, 2005; Smolander & Stenberg, 2005; Stenberg et al., 2016) with respect to  $LAI_{eff}$  variation in a large range, which is not possible with mast measurements. Before the PARAS model had been validated in varying snow and diurnal illumination conditions (Jääskeläinen & Manninen, 2021; Manninen & Stenberg, 2009). Comparison with satellite products is an important issue as well.

The data used is described in Section 2, including the calibration of the airborne albedo measurements (Section 2.4). The already published  $LAI_{eff}$  airborne measurements are briefly presented in Section 2.5. The modeling of albedo using the airborne  $LAI_{eff}$  data as input is summarized in Section 2.7 and the analysis of the albedo/ $LAI_{eff}$  relationship and comparison of airborne albedo with MODIS LAI products follow in Section 2.8. The albedo/ $LAI_{eff}$  relationship derived from vertical profile data is presented and compared to modeled values in Section 3.1. Spatial heterogeneity versus altitude is shown in Section 3.2 and, finally, comparison with MODIS products is demonstrated in Section 3.3.

#### 2. Data and Methods

#### 2.1. Operational Radiation Measurements

The global and diffuse radiation is operationally measured at Sodankylä at the FMI sounding station (67.36664°N, 26.628253°E) with a one minute interval using a Kipp and Zonen CM11 Pyranometer and a tracker. In addition, the global and reflected radiation is measured with a 10 min interval at the Sodankylä Heikinheimo mast (67.361866°N, 26.637728°E) in a Scots pine dominated mature forest at an altitude of 45 m above the ground and well above the treetops using a Kipp and Zonen CM11 Pyranometer.

#### 2.2. Helicopter Instrumentation

Two Kipp and Zonen CM-11 pyranometers on either side of the helicopter were used for the global radiation measurements and another two for reflected radiation measurements. The upwards and downwards looking sen-

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**Figure 2.** Example photos of the study area showing varying forest density on 24 April 2009. The flight altitude was about 880 m.

sors were attached back to back by the helicopter landing gear. Black plates are attached between the pyranometers and the helicopter fuselage to prevent direct reflections from the fuselage (Figure 1). Super ellipsoid descriptions of the helicopter fuselage and rotors were used to analyze possible direct solar radiation reflections to the pyranometers. Mirror reflection from the helicopter fuselage to the pyranometers was not possible for the solar zenith angle values during the campaign. The pyranometers integrated and automatically stored the observed radiation within 10 s in 2008 and 2009. In 2010 the radiation value was integrated within 10 s and stored with an interval of 2 s. A time stamp and the latitude and longitude co-ordinates provided by GPS were attached to every measured quartet of radiance values and stored to the laptop, which also showed the measured values on the screen in real time. In 2009 also the altitude co-ordinate provided by GPS was integrated in the system.

For airborne LAI measurements a Canon pocket camera A640 with a 0.7X wide angle conversion lens WC-D58N was attached to the helicopter landing gear so that it was looking orthogonally downwards (Manninen et al., 2009; Manninen, Korhonen, Riihelä, et al., 2012; Manninen, Korhonen, Voipio, et al., 2012). The images were taken by the Karhukamera system (Manninen et al., 2009) every three seconds and the 3-D GPS coordinates with time

stamps were registered for each image frame. The images were stored in standard jpg format directly to a laptop used for operating the camera. During the flight the latest image was repeatedly sent to the screen of the laptop to enable choice of optimal route and altitude. Hence, two independent GPS-coordinate sets (pyranometer and camera systems) were available for the flights to guarantee accurate temporal combination of the pyranometer and LAI data sets. A pressure gauge and a thermometer were integrated in 2009 and 2010 to the pyranometer system to achieve better altitude accuracy at low altitudes.

In addition there were two pairs of UV sensors and a Pt100 thermometer and a humidity sensor (humicap) attached to the helicopter, the UV sensors being between the pyranometers and the black plates (Figure 1). In all flights except the cloudy days, 13 March 2009 and 24 April 2009, there was also the shortwave multi-directional instrument OSIRIS (airPOLDER) beneath the back part of the fuselage (Manninen, Korhonen, Riihelä, et al., 2012; Manninen, Korhonen, Voipio, et al., 2012). See Section 2.2 for a full listing of measurement flights undertaken with the helicopter.

#### 2.3. Flights During the SNORTEX Campaign

The studied area represents subarctic boreal forest (Figure 2) and the flights were carried out within an area with corner co-ordinates (67.258°N, 26.2253°E) and (67.9263°N, 27.3897°E), all co-ordinates are in WGS84 system. In order to capture the albedo variation from pre-melt conditions to melting snow conditions and after melt snow-free conditions, the flights in 2009 were carried out in March, April, and May (Table 1). Both cloudy and cloud-free conditions (Figure 3, Figure S1 in Supporting Information S1) were available before and after the snow melt started. Some of the horizontal flight routes were planned so that the helicopter was measuring in the four cardinal directions above a site of interest (mainly for the OSIRIS instrument), some routes provided a grid over the intensive test area of ground measurements of 2009 and 2010 (Manninen and Roujean, 2014). Some longer transects were also flown. Since winters are not all similar, flights were carried out in three years (2008, 2009 and 2010) to cover the natural variation of the snow-covered area albedo.

The vertical flights were planned partly to test the airborne LAI retrieval quality and partly to study, how the altitude variation impacts the albedo variation, that is, how the albedo varies with spatial resolution. Namely, when using pointwise *in situ* albedo measurements, the areal representativity of the ground based measurements is always an issue.

On some days more than one flight was planned, but occasionally a flight had to be interrupted because the helicopter was needed to rescue service. Sometimes also the flight was interrupted due to instrument failure. The flight route patterns are shown in Appendix A. The flights carried out on 4 and 5 May 2009 were dedicated to partial snow measurements, since most of the snow cover had already melted during that area.

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The Pyranometer Flights Carried Out in the SNORTEX Campaign in 2008–2009

Date	Flight time [UTC hour]	Sky conditions during the flights	Flight altitude above ground [m]	Flight pattern	Comments
2 April 2008	10.7–12.0	Clear/cloudy	20–280	Vertical profiles	-
3 April 2008	10.3-12.4	Clear	830	Horizontal line and wind rose	-
7 April 2008	13.7-14.9	Clear	50-800	Horizontal line and crosses	-
10 April 2008	13.2-14.7	Clear	~120	Horizontal line and crosses	No LAI or altitude data
13 March 2009	8.5-10.6	Cloudy	20-320	Vertical profiles	-
17 March 2009	11.1-14.2	Clear	280	Crosses over test sites	-
18 March 2009	8.9-9.0	Clear/cloudy	50-450	Crosses over test sites	No $LAI_{eff}$ data
22 April 2009	7.7–9.0	Clear	280	Crosses over test sites	
	10.0–11.3	Clear	880	Grid over test area	Camera co-ordinates partly missing
24 April 2009	7.5–8.8	Clear/cloudy	250, 120	Crosses over test sites	Missing camera co-ordinates
	10.4-10.7	Cloudy/clear	880	Grid over test area	-
	11.2-11.9	Cloudy/clear	880	Grid over test area	-
4 May 2009	13.2-14.3	Clear -> cloudy	200	Crosses over test sites	-
5 May 2009	6.3–8.0	Cloudy -> clear	170	Long transect	Partly large difference in illumination conditions at the sounding station
18 March 2010	11.4–12.2	Clear/cloudy	600	Horizontal North-South flight lines over lake and aapa mire	Co-ordinate matching of camera and pyranometer not possible due to GPS failure.
19 March 2010	11.3-15.0	Clear/cloudy	20-300	Vertical profiles	-

#### 2.4. Airborne Albedo Data and Its Calibration

As the helicopter is far from being an ideal platform, besides the normal radiometric instrument calibration the measurement configuration has to be calibrated as well. All four pyranometers were radiometrically calibrated before the campaigns using the standard procedure of Finnish Meteorological Institute (FMI).

The configuration calibration contains the following steps (Figure 4): (1) azimuthal calibration, (2) first albedo magnitude calibration and (3) flight altitude correction, (4) final albedo magnitude calibration. The azimuth effect (step 1) has to be checked, because the illumination conditions of the upwards looking pyranometers are

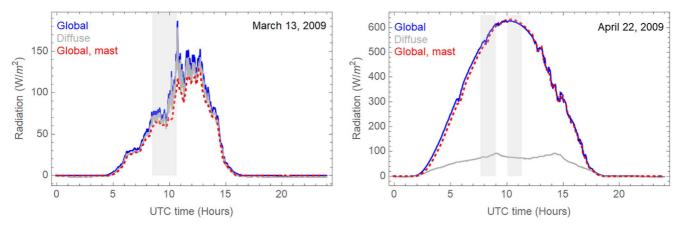


Figure 3. The global and diffuse radiation observed at the sounding station (solid curves) and the global radiation observed at the Sodankylä Heikinheimo mast (dashed curves) on the flight days 13 March 2009 and 22 April 2009. The times of the flights are shown in light gray bars.

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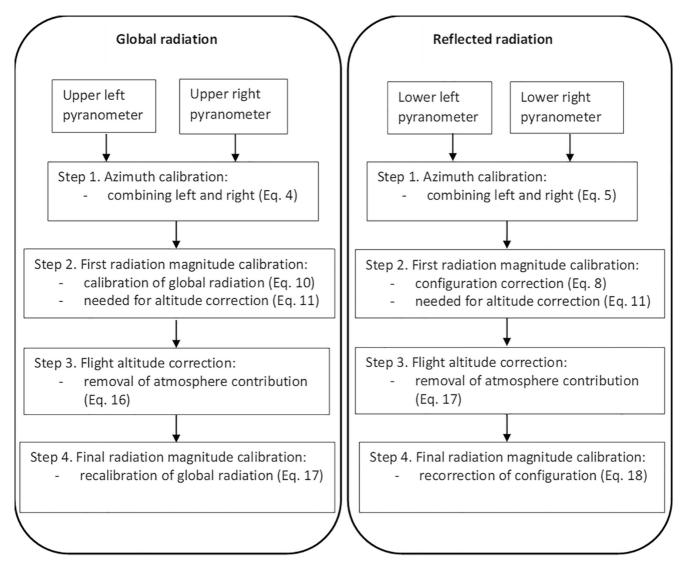


Figure 4. The flowchart of the configuration calibration of the airborne pyranometer data.

different, when the helicopter is flying toward the sun (or the opposite direction) or perpendicular to the principal plane (the plane where the target and the Sun are aligned). The effect of the atmospheric attenuation on the global and reflected radiation depends on the flight altitude and must be corrected for. That process requires prior knowledge about the surface albedo. Hence, we derive first an estimate of the surface albedo (step 2) assuming no atmospheric effect (Section 2.4.2) and use it as input for the altitude correction (step 3) of the global and reflected radiation (Section 2.4.3). After that correction the final surface albedo estimate is calculated anew (step 4) using the atmospherically corrected global and reflected radiation values (Section 2.4.4).

#### 2.4.1. Azimuthal Calibration

The azimuthal calibration is based on operational global, diffuse, and reflected radiation measurements carried out at the Arctic Space Center of Finnish Meteorological Institute.

The azimuthal dependence of the airborne global and reflected radiation was measured in cloudy and clear-sky conditions above forest at the immediate vicinity (67.3625°N, 26.6415°E) of the Sodankylä Heikinheimo mast. The helicopter hovered at that height in eight azimuth directions starting from direct view to the sun. The whole

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 Table 2

 Azimuth Dependence of the Airborne Radiation Measured at the Sodankylä Heikinheimo Mast

				Sinusoidal characteristics							
				$I_{gleft}(1-k_g)$		$I_{gright}(1-k_g)$				Alb	edo
Date	Sky	Solar zenith angle	$\frac{I_{diffs}}{I_{gs}}$	80% range/mean	$R^2$	80% range/mean	$R^2$	$\frac{\sigma_{gc}}{\langle I_{gc} \rangle}$ [%]	$\frac{\sigma_{rc}}{< I_{rc}>}$ [%]	$<\alpha_{gc}>$	$\sigma_{lpha gc}$
2 April 2008	Clear	63.4°	0.31	122	0.971	115	0.980	11.7	9.4	0.185	0.009
13 March 2009	Cloudy	70.1°	0.94	18	0.999	5.1	0.998	3.8	5.3	0.224	0.007
22 April 2009	Perfectly clear	60.1°	0.14	143	0.926	158	0.827	7.3	1.9	0.166	0.015
24 April 2009	Cloudy/clear	60.1°	0.73	71	0.975	62	0.936	7.8	11.1	0.183	0.010
19 March 2010	Clear/cloudy	80.3°	0.50	92	0.979	127	0.978	13.7	9.7	0.166	0.030

Note. The 80% variation range normalized with the mean value and the coefficient of determination for the sinusoidal dependence of the global radiation on the azimuth angle for the left and right airborne pyranometers. The ratio of the standard deviation and the mean of the averaged airborne global and reflected radiation and mean and standard deviation of albedo,  $\sigma_{gc}/\langle I_{gc}\rangle$ ,  $\sigma_{rc}/\langle I_{rc}\rangle$ ,  $\langle \alpha_{gc}\rangle$  and  $\sigma_{agc}$  respectively, measured at 45 m level beside the Sodankylä Heikinheimo mast at the Arctic Space Centre of Finnish Meteorological Institute, where the surface albedo is operationally measured above a forest. The azimuth directions of the helicopter were 0°, 45°, 90°, 135°, 180°, 225°, 270°, 315° and 360° between the sun and the helicopter fuselage.

circle took about 5 min. This data was used to check the azimuth dependence of the measured radiation data. In addition, it was used to derive the shading correction coefficient for the reflected radiation.

First the time dependence coefficient  $k_g$  of the global radiation  $I_g$  measured at the mast was determined

$$k_g = \frac{(I_g - I_{g0})}{\langle I_g \rangle},\tag{1}$$

where  $I_{g0}$  refers to the value of  $I_g$  at the beginning of the time window and <> denotes the average. Since the time window was so short, it was sufficient to use linear approximation of the time dependence of  $I_g$ . Either the variation was extremely small ( $k_g < 0.4\%$ ) or the  $R^2$  value for the linear relationship of  $I_g$  was high, the variation range being 0.984–0.99997. Then the variation of the airborne global radiation values of the left and right pyranometers ( $I_{gleft}$  and  $I_{gright}$ ) multiplied by (1- $k_g$ ) was analyzed versus the azimuth angle of the helicopter direction. A clear sinusoidal dependence was observed for both pyranometers (Table 2) both in clear-sky and cloudy conditions, but understandably the variation range was markedly larger in clear-sky conditions due to shadowing of the fuselage. The right and left pyranometer global radiation had a phase difference of 180°, as expected, so that all the time either of the two upwards looking pyranometers avoided shading of the fuselage. The variation of the reflected radiation did not show as systematic time dependence (as it was really small), hence no temporal correction was made to it in the azimuthal analysis.

The fraction of the diffuse irradiance observed by the helicopter borne pyranometers can be estimated from the ratio r' of the shady and sunny side (perpendicular to the sun) irradiance values, assuming that the direct irradiance of the sunny side equals that of the reference value measured at the sounding station  $I_{dirs}$ , which equals the difference of the global radiation  $I_{gs}$  and the diffuse radiation  $I_{diffs}$  measured at the sounding station, so that

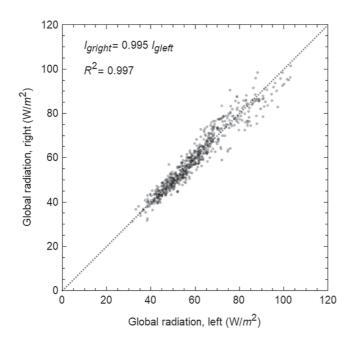
$$r' = \frac{I_{shade}}{I_{sunny}} = \frac{xI_{diffs}}{I_{dirs} + xI_{diffs}} = \frac{xI_{diffs}}{\frac{1-r}{2}I_{diffs} + xI_{diffs}},$$
(2)

where  $r = I_{diffs}/I_{gs}$ . Thus,

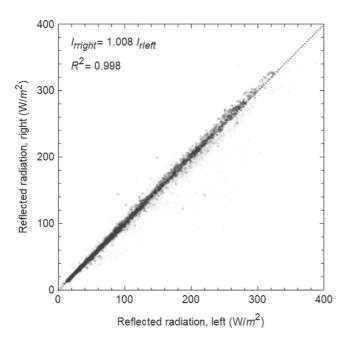
$$x = \frac{(1-r)}{r} \frac{r'}{(1-r')} \tag{3}$$

The value of x depends only on the measurement configuration. It was determined using the measurements of the brightest day, 22 April 2009, and its value was  $0.7489 \approx 0.75$ . This motivates the use as the basis of the calibration of the airborne global irradiance the following combination of  $I_{gleft}$  and  $I_{gright}$  that is essentially linearly related to the sum of the direct and diffuse radiation, that is, to global radiation

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**Figure 5.** The global radiation measured by the right pyranometer versus that of the left pyranometer for the flight carried out on 13 March 2009 (Table 1) before calibration and removal of tilted data.



**Figure 6.** The reflected radiation measured by the right pyranometer versus that of the left pyranometer for all data from all flights (Table 1) before calibration and removal of tilted data.

$$I_{gc} = \left(\max(I_{gleft}, I_{gright}) + \frac{(I_{gleft} + I_{gright})}{2}\right)/2 \tag{4}$$

The above quantity was relatively insensitive to the helicopter azimuth angle variation; hence no explicit azimuth angle correction was needed. In addition, the formula reduces to the correct limit values in completely diffuse conditions and when the helicopter is looking toward the sun so that  $I_{left} = I_{right}$ . The quantity  $I_{gc}$  must still be calibrated in order to remove the effect of shadowing of the rotor blades. Since  $I_{gc}$  was relatively independent of the azimuth direction, the calibration should be reliable in all directions.

For the completely cloudy day of 13 March 2009 the global radiation observed by the left and right pyranometers was practically identical (Figure 5) since the amount of direct radiation was then negligible.

The reflected radiation observed by the left and right pyranometer was very similar for all flights (Figure 6), except when the helicopter was markedly tilting at turning points. Hence, there is no need to calibrate the right and left downwards looking pyranometers separately, and the reflected radiation  $I_r$  to be calibrated was chosen to be

$$I_{rc} = \frac{(I_{rleft} + I_{rright})}{2} \tag{5}$$

The variation of the airborne global and reflected radiation of the left and right pyranometers with the azimuth direction is characterized in Table 2.

The uncalibrated albedo  $\alpha_{gc}$  was now derived to be

$$\alpha_{gc} = \frac{I_{rc}}{I_{gc}} \tag{6}$$

The variation of  $\alpha_{gc}$  as a function of the azimuth angle was very small for clear and cloudy conditions, but understandably slightly larger for the mixed case of 19 March 2010 (Table 2) due to varying cloudiness during the azimuthal circle. In addition, some of the variation of the albedo was due to the uneven helicopter motion between stabilized azimuth direction positions. Since the azimuth dependence is related to the measurement geometry, it is reasonable to assume that the azimuth effect on the albedo is of the same order for all flights in the same conditions.

In perfectly clear-sky conditions when the helicopter is perpendicularly to the sun the airborne pyranometer of the sunny side measures the direct radiation and a fraction of diffuse radiation, while the pyranometer on the opposite side of the helicopter measures just the same fraction of the diffuse irradiance. Comparing the ratio r' of the shaded and sunny side pyranometer irradiances,  $I_{shade}$  and  $I_{sunny}$  respectively, to the ratio of the diffuse irradiance to the global irradiance measured at the sounding station, r, one can derive the correct global radiation for the airborne measurements  $I_a$  to be

$$I_a = \frac{(1 - r')}{(1 - r)} I_{sunny} \tag{7}$$

For April 22 the calibration factor (1-r')/(1-r) was 1.037. The empirical ratio  $\langle I_g \rangle / \langle I_{gc} \rangle$  was 1.039 for the same calibration time window. So, a good accuracy can be obtained carrying out an empirical calibration of the global radiation using  $I_{gc}$ . Since  $I_{gc}$  was relatively independent of the azimuth direc-

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**Table 3**The Relationship Between the Global Irradiance Measured at the Sodankylä Heikinheimo Mast  $(I_g)$  and at the Sounding Station  $(I_{gs})$  for the Flight Times

	$I_g$ versu	$I_{gc}$ versus $I_{gs}$	
Date	$\frac{ \langle I_g \rangle - \langle I_{gs} \rangle }{\langle I_{gs} \rangle} [\%]$	$R^2$	$R^2$
2 April 2008	4.0	0.967	0.887
3 April 2008	2.9	0.9998	0.968
7 April 2008	2.7	0.9997	0.961
10 April 2008	0.4	0.983	0.927
13 March 2009	5.6	0.989	0.963
17 March 2009	3.7	0.9997	0.872
18 March 2009	0.2	0.999	0.964
22 April 2009	0.5	0.9999	0.993
24 April 2009	3.3	0.980	0.957
4 May 2009	4.9	0.972	0.896
5 May 2009	11.2	0.932	0.929
18 March 2010	2.5	0.995	0.933
19 March 2010	4.3	0.985	0.946

*Note*. The  $R^2$  values for the linear relationship between the airborne irradiance  $I_{gc}$  and  $I_{gs}$  are given as well. Notice that the  $R^2$  values were derived for a linear regression without allowing a constant.

tion, the calibration should be reliable in all directions. It is noticeable that the airborne global irradiance was underestimated only by 4%, but the reason is that the sky was perfectly clear at that time and the solar zenith angle was not larger than 60.1°. In more cloudy sky and/or larger solar zenith angle the fraction of diffuse irradiance would be larger and consequently also the underestimation of the global irradiance would be larger. Therefore, it is essential to calibrate the airborne global irradiance using simultaneously measured reference values.

#### 2.4.2. First Radiation Magnitude Calibration

The next step of the calibration was to correct the magnitudes of the global and reflected radiation. This is carried out by comparing the airborne measurements to global ( $I_g$ ) and reflected ( $I_r$ ) radiation measurements operationally carried out at the mast with 10 min interval and to global irradiance ( $I_{gs}$ ) measurements operationally carried out with 1 min interval at the Tähtelä sounding station (67.36664°N, 26.628253°E). In the clearest sky conditions the agreement between the global radiation values at the mast and at the sounding station were very similar (Table 3) in spite of the 667 m distance between the mast and the sounding station. Also, the airborne global irradiance  $I_{gc}$  had a good correlation with them. When the flight altitude varied markedly, the  $R^2$  values between  $I_{gc}$  and  $I_{gs}$  were taken separately for two or three patches and their mean value is shown in the table. Besides the weather conditions, also the distance between the helicopter and the sounding station and possible tilting of the helicopter (at turning points) could reduce the  $R^2$  value. The correlation between  $I_{gleft}$  and  $I_{gright}$  was high (Appendix B, Table B1), when the sky was cloudy, because then there was mainly diffuse radiation. At clear sky conditions their correlation could be high only if the helicopter was flying toward or away from the sun.

The fuselage of the helicopter did not shade the downwards looking pyranometers, but the skids of the helicopter and the black plates between the sensors and the fuselage occluded their view to some extent. As the configuration was the same for all flights, it was sufficient to determine the calibration coefficient  $c_r$  of the reflected radiation only once using the data of the best day, April 22, which was perfectly clear at the time window of the calibration. So,  $c_r$  was calculated from

$$c_r = \frac{\langle I_r \rangle}{\langle (I_{rleft} + I_{rright})/2 \rangle}$$
 (8)

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$$c_m = \frac{\widetilde{I}_{gs}}{\widetilde{I}_{gc}} \tag{9}$$

where  $\sim$  denotes the median. The first estimate for the true airborne global radiation  $I_{eq}$  is then

$$\hat{I}_{ga} = c_m I_{gc} \tag{10}$$

where ^ denotes an estimated value. Some flights had two or three distinct relatively constant flight altitudes. Then the value for  $c_m$  was derived separately for the patches of constant altitude. The  $c_m$  value of the lowest altitude was used for the data remaining outside the constant altitude patches.

So far, the calibration of the airborne global radiation could be of high quality only, if the flight altitude were so small that atmospheric effect on it does not have to be taken into account. However, taking the atmosphere into account requires some knowledge of the surface albedo. Hence, we used the calibration derived so far to retrieve as input for the atmospheric calibration the temporary surface albedo estimates that are derived as follows

$$\hat{\alpha}_a = \frac{c_r(I_{rleft} + I_{rright})/2}{c_m I_{ac}} \tag{11}$$

#### 2.4.3. Flight Altitude Correction

The next step of the calibration was to take into account the effect of the flight altitude (Boers et al., 1998). The diffuse and global irradiance measured at the sounding station were used to retrieve the direct (but attenuated) solar radiation S, which is the difference of the global and diffuse irradiance. Then the optical thickness  $\tau$  of the atmosphere (at the surface) was derived from the equation (Kahle, 1968; Sekera & Kahle, 1966)

$$S = \pi F_0 \mu_0 e^{-\tau/\mu_0} \tag{12}$$

where  $\pi F_0$  is the incident flux, using the notation of Kahle (1968) and  $\mu_0$  is the cosine of the solar zenith angle  $\theta_0$ . The variation of the airborne global and reflected radiation with flight altitude were taken into account by assuming that the optical thickness is linearly related to the flight altitude and the height of the tropopause was taken to be 8.5 km (which is a realistic value for the polar areas in winter (Geerts & Linacre, 1997). The linearity assumption is supported by the measured Arctic AOD vertical profiles (Stone et al., 2010) for small AOD values typical of the study area. The global and reflected radiation values were transformed from the flight altitude values to surface values by the relationship of the upward  $H_u$  and downward  $G_d$  radiation dependence on the altitude and optical thickness of the atmosphere (Kahle, 1968)

$$G_d = \pi F_0 \mu_0 \left[ \frac{\gamma_l(\mu_0) + \gamma_r(\mu_0)}{2(1 - A\bar{s})} \right]$$
 (13)

$$H_u = \pi F_0 \mu_0 \left[ 1 - (1 - A) \frac{\gamma_I(\mu_0) + \gamma_r(\mu_0)}{2(1 - A\bar{s})} \right]$$
 (14)

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$$Y_{a} = \frac{\frac{\gamma_{Ia}(\mu_{0}) + \gamma_{ra}(\mu_{0})}{2(1 - A\bar{s}_{a})}}{\frac{\gamma_{I}(\mu_{0}) + \gamma_{r}(\mu_{0})}{2(1 - A\bar{s})}}$$
(15)

where the values for  $\gamma_l$ ,  $\gamma_r$  and  $\bar{s}$  are calculated at the surface and for  $\gamma_{la}$ ,  $\gamma_{ra}$  and  $\bar{s}_a$  at the flight altitude, which was available for each point from the pressure gauge. Here we used  $A = \hat{\alpha}_a$ . The airborne global  $I_{ga}$  and reflected  $I_{ra}$  radiation corrected for the altitude are now

$$I_{ga} = c_a I_{gc} \tag{16}$$

$$I_{ra} = (I_{rleft} + I_{rright})/2 + (1 - c_a)I_{gc}$$
(17)

Since  $c_a \le 1$ , the true reflected radiation is larger, the global radiation smaller and the surface albedo larger than the ones measured at higher altitudes. However, at this stage the measured radiation components are corrected only for the altitude and the configuration of the shading effect correction presented in the previous section must still be carried out.

#### 2.4.4. Final Radiation Magnitude Calibration

The global radiation was now corrected for the configuration effects by requiring the median of the airborne altitude corrected global radiation to match the median of simultaneous global radiation measurements at the sounding station like in Equation 9 so that the completely calibrated airborne global radiation  $I_{g_t}$  is

$$c_t = \frac{\widetilde{I_{gs}}}{\widetilde{I_{ga}}} \tag{18}$$

$$I_{gt} = c_t I_{ga} \tag{19}$$

The completely calibrated airborne reflected radiation  $I_{rt}$  is obtained from

$$I_{rt} = c_r I_{ra} \tag{20}$$

using the value  $c_r = 1.1697$  derived for the clearest day, April 22, for all flights, because it is only due to the geometry of the measurement configuration. The airborne calibrated albedo  $\alpha$  is finally

$$\alpha = \frac{I_{rt}}{I_{\sigma t}} \tag{21}$$

Values for the calibration parameters  $c_m$  and  $< c_a >$  and  $c_t$  are given in Table 4 for all flights. In addition, the ratio of the mean calibrated albedo and the mean uncalibrated albedo are shown for each flight. Mostly the calibration coefficients are essentially of the same order in similar sky conditions. However, on 5 May 2009 the first patch had a distinctly different calibration coefficient  $c_m$  due to varying cloudiness. The timing of the cloud disappearance differed at the helicopter and the mast, which showed then in more distinct discrepancy of the airborne and sounding station global radiation level. For the same reason on that day also the global radiation measured at the mast deviated markedly from that of the sounding station (Table 3). Hence, the first part of the data of 5 May 2009 was discarded, because the calibration of the global radiation would not have been reliable. The airborne albedo is compared to the mast measurements in Table 5.

#### 2.5. Airborne LAI Data

The wide-optics camera data was used for LAI estimation essentially similarly as fish-eye photos, the white snow serving as the background. The airborne LAI estimates were validated with ground based measurements in points of diverse forest types representative of the area (Manninen et al., 2009; Manninen, Korhonen, Riihelä, et al., 2012; Manninen, Korhonen, Voipio, et al., 2012). The validation measurements were made using hemi-

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 Table 4

 Calibration Coefficients for the Global Radiation Derived for Various Flights

D.	Sky conditions during the		_		$\frac{\langle \alpha \rangle}{\langle \alpha_{gc} \rangle}$
Date	azimuthal calibration	$C_m$	< <i>c</i> <sub>a</sub> >	$c_t$	<α <sub>gc</sub> >
2 April 2008	Clear (mostly)	1.15	0.993	1.16	1.04
3 April 2008	Clear	1.09	0.974	1.12	1.13
7 April 2008	Clear	1.20, 1.11	0.989	1.13	1.06
10 April 2008	Clear	1.12	0.996	1.13	1.04
13 March 2009	Cloudy	1.31	0.992	1.32	0.90
17 March 2009	Perfectly clear	1.05	0.991	1.07	1.12
18 March 2009	Clear/cloudy	1.11	0.993	1.12	1.06
22 April 2009	Perfectly clear	1.09, 1.08	0.982	1.12	1.11
24 April 2009	Clear -> cloudy	1.10, 1.35, 1.36	0.961	1.39	0.98
4 May 2009	Clear -> cloudy	0.91	0.988	1.12	1.15
5 May 2009	Cloudy -> clear	(2.02,) 0.96	0.992	(2.04,) 0.97	0.77
18 March 2010	Clear/cloudy	0.92	0.989	0.93	0.86
19 March 2010	Clear/cloudy	1.01	0.998	1.07	1.10

*Note*. When there were several constant altitudes, the coefficient  $c_m$  was derived separately for each of them.

spherical photographs. First, *in situ* images obtained in summer were used for validation of the airborne  $LAI_{eff}$  values, but in 2010 the *in situ*  $LAI_{eff}$  was measured in winter conditions just before the flights and every point was marked with a black cross (Figure 7). Then, the vertical profiles were started right above the treetops at the black cross and the altitude of the helicopter was slowly increased up to about 300 m.

Both in-situ and airborne images were processed similarly. The images were thresholded automatically (Nobis & Hunziker, 2005; Ridler & Calvard, 1978) to classify each pixel as either canopy or the background, which was sky in the *in situ* and snow in the airborne images. The resultant binary images were used to compute canopy gap fractions as the percentages of non-canopy pixels at different off-nadir angle ranges: *in situ*  $0-15^{\circ}$ ,  $15-30^{\circ}$ ,  $30-45^{\circ}$ ,  $45-60^{\circ}$ ,  $60-75^{\circ}$ , and airborne  $0-10^{\circ}$ ,  $10-20^{\circ}$ ,  $20-30^{\circ}$ , and  $30-40^{\circ}$ .  $LAI_{eff}$  was estimated from the annular gap fractions based on the Beer-Lambert law using the well-known formula proposed by Miller (1967) as implemented in the LAI-2000 plant canopy analyzer (Welles & Cohen, 1996). The results were compared with hemispherical fisheye images obtained *in situ* that were analyzed in a similar manner. A simple linear regression fit between the estimates ( $LAI_{ground} = 1.03 LAI_{eff} - 0.04$ ) had an  $R^2$  of 0.96 (Manninen, Korhonen, Riihelä, et al., 2012; Manninen, Korhonen, Voipio, et al., 2012). The details of the LAI retrieval are provided by Manninen et al. in the papers published in 2009 and Manninen, Korhonen, Riihelä, et al. (2012) and Manninen, Korhonen, Voipio, et al. (2012).

Table 5
The Relationship Between the Airborne Calibrated Albedo and That Measured at the Sodankylä Heikinheimo Mast

						Albedo at mast		Airborne albedo		Airborne LAI <sub>eff</sub>	
Date	Latitude	Longitude	Sky	$\frac{I_{diffs}}{I_{gs}}$	Solar zenith angle	Mean	Median	Mean	Median	Mean	Standard deviation
2 April 2008	67.3617°	26.6367°	Clear	0.31	63.2°	0.185	0.184	0.206	0.204	1.17	0.11
13 March 2009	67.3624°	26.6413°	Perfectly cloudy	0.94	70.1°	0.261	0.263	0.198	0.199	1.18	0.06
22 April 2009	67.3622°	26.6409°	Perfectly clear	0.14	60.1°	0.184	0.184	0.179	0.174	1.32	0.11
24 April 2009	-	-	Cloudy	0.73	60.1°	0.182	0.183	0.195	0.167	1.11	0.05
19 March 2010	67.3621°	26.6401°	Clear/cloudy	0.50	80.0°	0.211	0.211	0.221	0.224	0.72	0.09

Note. The  $LAI_{eff}$  value previously measured at ground closest to the mast was 0.41 (Manninen & Riihelä, 2009) and the airborne  $LAI_{eff}$  varied slightly at the calibration points.

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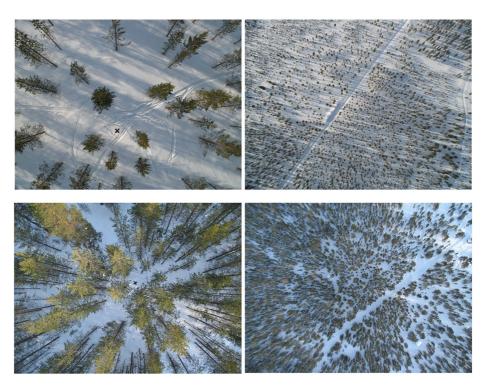


Figure 7. Examples of photos taken at two LAI points in 2010 at the lowest (left) and the highest (right) altitude of the vertical profile. The  $LAI_{eff}$  values derived from the photos were validated with the corresponding in situ  $LAI_{eff}$  values (Manninen, Korhonen, Riihelä, et al., 2012; Manninen, Korhonen, Voipio, et al., 2012).

#### 2.6. Satellite Data

The satellite based albedo values used in this study are the MODIS based MCD43A3 white sky and black sky albedo products (Schaaf et al., 2002). They are daily products that are based on 16 days of local solar noon data, temporally weighted to the ninth day. The data is in 500 m resolution. The products include quality flags. Only data with the highest quality classification was used in this study. For March 13th and April 24th (cloudy days) the analysis is based on the WSA\_shortwave product (white sky albedo), and for the rest of the days the BSA\_shortwave (black-sky-albedo) data was used. However, for the solar zenith angles of the campaign the black-sky and white-sky albedo values are very similar.

Comparison of airborne albedo estimates to MCD43 is challenging given the different footprints and e.g., challenges in satellite-based albedo retrievals during periods of low Sun elevation, such as our study period in Sodankylä. Comparing against higher-resolution satellite data such as Landsat imagery would be preferred. However, as we investigated the availability of Landsat imagery over our flight paths, we found that no images were available for the flight days. As MCD43 data has been thoroughly evaluated, also in the area of our flight campaigns (Pisek et al., 2021), and quantitative quality information is available to narrow the selection to highest quality retrievals, we apply MCD43A3 here for the purposes of a statistical comparison against our helicopter-based albedo data.

#### 2.7. Albedo Modeling

Albedo modeling is performed using the vegetation dependent PARAS albedo model (Rautiainen & Stenberg, 2005; Smolander & Stenberg, 2005; Stenberg et al., 2016). The basis of the PARAS model albedo calculation is the spectrally invariant photon recollision probability p. That is a probability of an event in which a photon, after being scattered from a leaf in a canopy, interacts with that same canopy again. When p and leaf single scattering albedo ( $\omega_L$ ) that depends on the wavelength are known, the total amount of radiation scattered by the canopy is possible to estimate at any wavelength. The PARAS albedo model was extended by Manninen and Stenberg (2009) by adding

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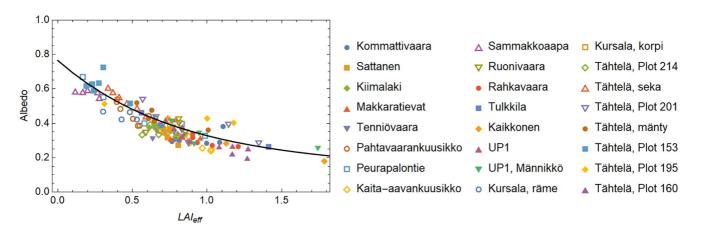


Figure 8. Variation of the airborne albedo with the airborne *LAI<sub>eff</sub>* of the labeled individual vertical profiles measured on 13 March 2009. The profile height was about 200 m. The black curve shows the PARAS model result.

multiple scattering between canopy and ground to include effect of highly reflective background (i.e., snow). Extended PARAS model has been used to model boreal forest albedo (Jääskeläinen & Manninen, 2021; Manninen & Jääskeläinen, 2018; Manninen & Stenberg, 2009). Detailed model formulas are presented in Appendix C.

The model was first compared with the vertical profile data of 13 March 2009, which was a completely cloudy day. The model was used to simulate the albedo in visible and near infrared bands. The broadband albedo was derived using the conversion formula by Liang (2000). The broadband albedo of the forest floor was taken to be the mean of the values for which  $LAI_{eff}$  was 0, excluding one aapa mire (northern wetland type) related darker value. The corresponding spectral albedo of visible and near infrared bands were obtained on the basis of the reflectance ratio of those bands of the snow spectra measured on 13 March 2009 (Manninen et al., 2021). The leaf single scattering albedo for the visible and near infrared bands,  $\omega_{red} = 0.068$  and  $\omega_{nir} = 0.697$ , were taken to be 15% smaller than the smallest values measured by Hovi et al. (2017) for the season May–October to take into

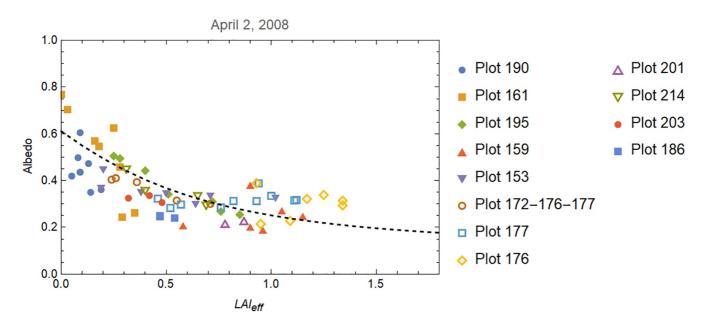


Figure 9. Variation of the airborne albedo with the airborne  $LAI_{eff}$  of the labeled individual vertical profiles measured on 2 April 2008. The vertical profile height was about 250 m. The solar zenith angle varied in the range  $62.6^{\circ}$ – $64.5^{\circ}$  and the fraction of diffuse irradiance in the range 0.21–0.80. The profile height was about 200 m. The dashed curve shows the PARAS model result for the mean fraction of diffuse radiation and the mean cosine of the solar zenith angle values. The forest floor broadband albedo was taken to be the mean of albedo values measured for  $LAI_{eff} = 0$ .

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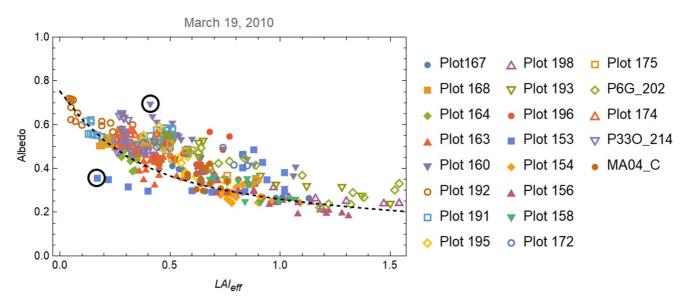


Figure 10. Variation of the airborne albedo with the airborne  $LAI_{eff}$  of the labeled individual vertical profiles measured on 19 March 2010. The solar zenith angle varied in the range  $75.6^{\circ}$ – $82.6^{\circ}$  and the fraction of diffuse irradiance in the range 0.27–0.63. The profile height was about 80 m. The dashed curve shows the PARAS model result for the mean fraction of diffuse radiation and the mean cosine of the solar zenith angle values. The forest floor broadband albedo was taken to be the mean of albedo values measured for  $LAI_{eff} = 0$ .

account the seasonal difference. As the modeling result looked convincing, those single scattering albedo values were used for all modeling calculations.

The forest floor albedo for other days were derived similarly as for 13 March 2009. The spectral albedo ratio of March 13 was used for all pre-melt snow conditions (2008, March 2009 and 2010). For April 2009 the measured spectra of 22 April 2009 (Manninen et al., 2021) were used for deriving the forest floor spectral albedos from broadband albedo.

The model was used for normalizing the albedo values to match the solar zenith angle of  $60^{\circ}$  in order to make the albedo values of diverse days directly comparable and to be able to derive the total albedo distribution for analyzing the effect of  $LAI_{eff}$  on it. It should be noted that this could be done only for days, for which airborne  $LAI_{eff}$  data was available.

#### 2.8. Analysis of Airborne Data

The pyranometer and camera measurements were co-registered with their independent time codes checking the match by comparison of their independent co-ordinate information. In 2008 only the camera GPS provided the



Figure 11. Examples of the heterogeneity effect on the albedo, circled points of Figure 10 left (Plot 160) and right (Plot 153). The left image is related to higher albedo than expected on the basis of  $LAI_{eff}$  and the right image to the opposite situation.

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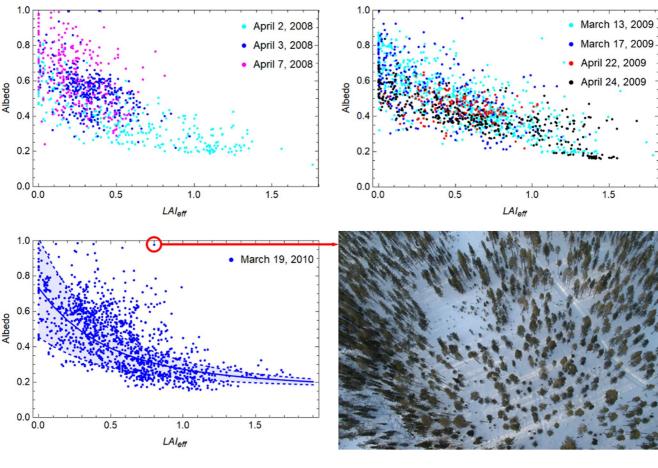


Figure 12. The airborne albedo versus airborne  $LAI_{eff}$  for all data of flights in 2008, 2009, and 2010. The albedo has been normalized to correspond to the solar zenith angle of 60°. For 19 March 2010, also the modeled albedo for homogeneous forests with similar forest floor albedo variation range is shown for comparison. The photo demonstrates, how sun glints cause very high albedo values for relatively large  $LAI_{eff}$  values.

altitude, which was then used for the vertical profiles, interpolating missing values linearly. In 2009 and 2010 the pressure gauge of the pyranometer system provided gap free vertical co-ordinates, which were used for the vertical profiles. The flight altitude was compared to the above sea level height of the helicopter station, which was 185 m. However, there are some hills in the flight area, so that the flight altitude is not exactly everywhere the same amount above the ground. The vertical profiles were equally high every place and started from close to the tree top level (Figure S2 in Supporting Information S1). For vertical profiles 10% difference was allowed for the left and right reflected radiation value included in the analysis to have more data per profile. For other flights data having larger difference than 5% was excluded from the analysis.

The relationship between  $LAI_{eff}$  and albedo was first analyzed for each vertical profile of three individual days (2 April 2008, 13 March 2009, and 19 March 2010). The results were compared to the PARAS modeling (Section 2.7) results. Then the PARAS model was used to normalize the albedo data to correspond to the solar zenith angle of  $60^{\circ}$  in order to be able to compare the diverse flight data with each other and to derive the albedo distribution for the region.

Finally, the airborne data was then co-registered with MODIS data by grouping the airborne parameter values according to which pixel their horizontal co-ordinates were located. For cloudy days (13 March 2009 and 24 April 2009) airborne data was compared to the white-sky shortwave albedo product of MODIS, for the rest the black-sky shortwave albedo product was used. As the MODIS product is normalized to local midday, the airborne data had to be normalized to that. Since the scenery was very heterogeneous, it was not possible to use the PARAS model or a normalization scheme derived for a homogeneous target (Manninen et al., 2020; Yang et al., 2008). Using the whole data mass per day a statistical relationship was derived by linear regression between the solar

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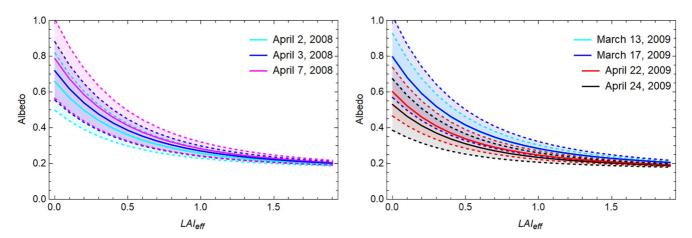


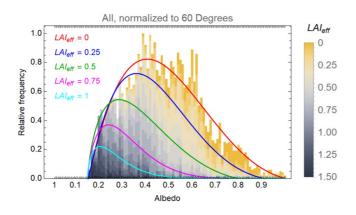
Figure 13. The modeled albedo versus  $LAI_{eff}$  for the variation range of measured albedo at  $LAI_{eff} = 0$ . The albedo corresponds to the solar zenith angle of  $60^{\circ}$ . The solid curves correspond to the forest floor mean albedo and the dashed curves to the forest floor albedo minimum and maximum.

zenith angle and the albedo. Both the hyperbolic cosine of the normalized azimuth (Manninen et al., 2020) and the cosine of the solar zenith angle using the functional form by Yang et al. (2008) were tested as predictors and the correction was very much the same for both alternatives. The mean of the two alternatives was then used to normalize the airborne albedo values to local noon. The comparison between the airborne and MODIS data was carried out using the airborne data normalized this way.

#### 3. Results

#### 3.1. Variation of Albedo With LAI

The simultaneously measured airborne albedo and  $LAI_{eff}$  values of the three days of vertical profiles (2 April 2008, 13 March 2009, and 19 March 2010) were compared to each other and modeling results (Figure 8). The individual outliers correspond to cases, where the area seen by the camera differs markedly from its near surroundings, which affect the albedo value. Since 13 March 2009 was a completely cloudy day, there is no need to pay attention to the solar zenith angle varying from profile to another. Contrarily, on 2 April 2008 and 19 March 2010, the day was clear, and the solar zenith angle varied in the range  $62.6^{\circ}$ – $64.5^{\circ}$  and  $75.6^{\circ}$ – $82.6^{\circ}$ , respectively. The CM11 pyranometer accuracy for the latter solar zenith angle range is about half of that for the previous range, the maximum



**Figure 14.** The relative distribution of all airborne albedo values of 2008, 2009 and 2010 normalized to the solar zenith angle value  $60^{\circ}$  and for which airborne  $LAI_{eff}$  values were available. The yellow-gray shades are related to  $LAI_{eff}$ . The area below the red, blue, green, magenta, and cyan curves consist of albedo values for which  $LAI_{eff} = 0$ ,  $LAI_{eff} = 0.25$ ,  $LAI_{eff} = 0.5$ ,  $LAI_{eff} = 0.75$  and  $LAI_{eff} = 1$ , respectively.

relative error being 4%-7% and 2%, respectively. Because the sun elevation was so low, the albedo of the point in question could not be accurately normalized to a fixed solar zenith angle value using only information related to point itself, because the albedo would depend also on possible shading form the nearby region. Hence, the data shown in Figure 9 and Figure 10 are not normalized and for 2008 and 2010 some of the scatter of the points comes from varying solar zenith angle and shadows. Also, the varying fraction of diffuse irradiance caused some scatter with respect to the mean modeled curve. The outliers of the clear day of 2010 are clearly caused by heterogeneous surroundings. In Figure 11 left the  $LAI_{eff}$  is measured at a lower altitude from the forest at the image center, but the open area in its immediate vicinity increases the albedo value. In Figure 11 right the opposite effect takes place, the surrounding forest decreases the albedo, but  $LAI_{eff}$  measured at a lower altitude has the value of the open area in the center. In Figure 10, the circled point is from the highest altitude for the plot 160 and from the lowest altitude for the plot 153. For plot 160 the *LAI*<sub>eff</sub> decreased with altitude and for 153 it increased.

The relationships between the airborne albedo and  $LAI_{eff}$  was studied also for all data, not only for the vertical profiles (Figure 12). All albedo values are now normalized to correspond to the solar zenith angle of  $60^{\circ}$  using the PA-

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RAS model and the single scattering albedo values derived from the model fit to the data of 13 March 2009. First, the PARAS model was used to simulate albedo values for each flight (using for the forest floor albedo value corresponding to  $LAI_{eff} = 0$ ) covering the variation range of  $LAI_{eff} (0-1.9)$ , cosine of the solar zenith angle (0.122–0.588) and the fraction of diffuse irradiance (0–1) with a constant interval. The numbers of individual values of  $LAI_{eff}$ , cosine of the solar zenith angle and the fraction of diffuse irradiance were 20, 30 and 11, respectively. The simulated albedo values were used to derive a second order interpolation function for the ratio of the albedo at the solar zenith angle  $60^{\circ}$  and the measurement angles. The measured albedo values were then multiplied by this ratio to obtain the normalized albedo values.

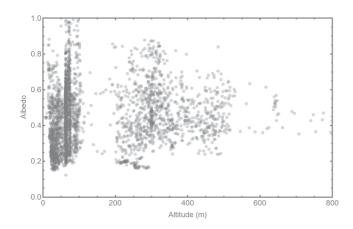
The spread of albedo values corresponding to the same  $LAI_{eff}$  was now markedly larger than for the vertical profiles. The albedo values exceeding the model values of the same  $LAI_{eff}$  are typically caused by land cover heterogeneity. Since the relationship between albedo and  $LAI_{eff}$  is not linear, the albedo of a heterogeneous area, which is the weighted mean of the homogeneous subarea albedo values, is larger than the albedo corresponding to the average  $LAI_{eff}$ . In addition, sometimes sun glints caused some very high albedo values, like on 19 March 2010, when the albedo was 0.92 but  $LAI_{eff}$  was 0.8 (Figure 12). The albedo values smaller than the model values for the same area are related to the forest floor albedo being smaller than in the open areas. Either the snow is darker, or the snow cover is fractional, which is common in the melting season. To some extent the albedo variation may also be related to the fact that the camera did not observe the whole area observed by the downwards looking pyranometers, partly due to the rectangular photo shape and partly due to the view angle of the optics being clearly smaller than hemispherical. Although, the central part of the photo is the area that also dominates the albedo value, the surrounding area may occlude some of the irradiance, when the solar zenith angle is low (Figure 11).

The general trends of the data shown in Figure 12 were analyzed by modeling the albedo of homogeneous areas as a function of  $LAI_{eff}$  using the mean, minimum and maximum values corresponding to the value  $LAI_{eff} \approx 0$  as the forest floor albedo value. Then the mean and the variation range of albedo versus  $LAI_{eff}$  were plotted for each day (Figure 13). The modeled albedo curves of 2008 can be explained by snowfall and temperature. Typically the diurnal albedo cycle in seasonal snow area is related to microscopic morphosis of the surface during the course of the day (McGuffie & Henderson-Sellers, 1985). The air temperature at 2 m was about +2°C on April 1-2, 2008 and the snow surface temperature was only slightly below the melting temperature, on the average  $-1^{\circ}$ C. On 3 April 2008 it was already colder: the air temperature being at 2 m about  $-2^{\circ}$ C and the snow surface temperature about -4°C. Cooling down continued and on 5 April 2008 the air and snow surface temperatures were both -6°C. 6 April 2008 was slightly warmer, -2°C for both air and snow surface, but on 7 April 2008 it was again somewhat colder, −4°C and −3°C for air and snow surface, respectively. The increase in the average albedo from April 2 to 3 April 2008 could possibly be explained by the cooling of the snow surface and temperature gradient within the snow pack possibly causing surface hoar formation and surface crystal reformation through water vapour supply from the atmosphere and deeper layers of the snow pack. In addition, the roughly 10 cm thick layer of fresh new snow that accumulated to the snow surface due to precipitation between 3 and 7 April 2008, manifests as a further increase in the albedo level for all values of LAI<sub>eff</sub> from April 3 to 7 April 2008.

In 2009, the modeled albedo curves demonstrate the snowmelt related decrease of surface albedo. In 13 and 17 March 2009 the air temperature at 2 m was about  $-0.5^{\circ}$ C and the snow surface temperature was about  $-2^{\circ}$ C. The albedo ranges of 13 and 17 March 2009 also essentially coincide. On 22 April 2009 the air temperature was  $+6^{\circ}$ C, whereas the snow surface temperature was still below  $0^{\circ}$ C, being about  $-0.5^{\circ}$ C. In 23 and 24 April 2009 the air temperature was still  $+6^{\circ}$ C, but the snow surface temperature was now  $+0.1^{\circ}$ C indicating that the melting was proceeding quickly. Consequently, the albedo level is in April clearly smaller than in March and the albedo is markedly smaller in April 24 than on 22 April 2009. In addition, in April during the melting season the variation range of the albedo values is much narrower than in the premelt conditions of March. At the end of the melting season (24 April 2009) the albedo is also less strongly dependent on  $LAI_{eff}$ .

The whole albedo/ $LAI_{\it eff}$  data set was also used to derive the relative albedo distribution, again using albedo values normalized to the solar zenith angle of 60° (Figure 14). The distributions are skewed to high values and beta distribution starting from the lowest value matches the shape well. Beta distributions parameters were derived for the whole data and data for which  $LAI_{\it eff}$  exceeded 0.25, 0.5, 0.75 and 1. The mean values of the distributions are given in Table 6. This manifests the effect of vegetation above snow layer on albedo. If the  $LAI_{\it eff}$  values smaller than 0.25 would be missing (25% of all data), the albedo would decrease from 0.49 to 0.44. Further increasing the minimum  $LAI_{\it eff}$  to 0.5 would drop the mean albedo to 0.39. Examples of forests with these two limit values are shown in Supplementary

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**Figure 15.** Albedo data from all flights versus the flight altitude. The darkness of the point is related to the number of retrievals.

material (Figure S3 in Supporting Information S1). From the point of view of albedo, it is not only the amount of forested area that matters, but changing an open area to vegetated has a major effect. Here the effect is demonstrated with forests, but the same principle is valid for shrubs and other vegetation above the snow cover. The effect of the change in  $LAI_{eff}$  on albedo decreases with increasing  $LAI_{eff}$ . On the other hand, the structure of the forest matters as well. From the albedo point of view, it is advantageous to have heterogenous area with high and low  $LAI_{eff}$  values rather than a homogeneous area with the same mean  $LAI_{eff}$ . For example, changing a homogeneous area of  $LAI_{eff} = 0.5$  into two equal size subareas with  $LAI_{eff} = 0$  and  $LAI_{eff} = 1$  the albedo would decrease by 0.011 and relatively 2.8%.

#### 3.2. Variation of Albedo With Altitude/Spatial Resolution

The spatial variation of airborne albedo for a given altitude naturally decreased with increasing flight altitude due to the heterogeneity of the scenery. Very large uniform forested areas just don't exist in the region. On the other

hand, also large open areas are rare. Already at 500 m altitude the variation range of the albedo was only about half of the range achieved at very low altitudes (Figure 15). Given this trend, the albedo would approach a constant value roughly at 1 km altitude. Since, the pyranometer response is dominated by an area with a radius about 10 times the measurement altitude, this would mean that a footprint of about 20 km would represent the areal average albedo. Some individual albedo values were very high, close to unity. They may be related to uneven movement of the helicopter, but it is also possible to get sun glints from large open areas with snow cover as shown before (Manninen, Jääskeläinen et al., 2019; Figure 12).

#### 3.3. Comparison of Measured Albedo and Satellite Based Albedo

The airborne albedo values were compared to the corresponding MODIS albedo products. The comparison is made separately for different altitudes to take into account the varying size of the area observed by the pyranometers. The airborne albedo values were directly linked with the overlapping MODIS pixels. The results are shown in Figure 16 and Figures S4–S6 in Supporting Information S1 for the flights of years 2008, 2009 and 2010, respectively. For low flight altitudes the airborne measured area represented by one albedo value could be markedly smaller than that of the MODIS pixel. Even when the spatial resolution of the airborne and MODIS albedo retrievals were about similar there could be a mismatch in the albedo values due to the airborne co-ordinate being not quite at the center of the MODIS pixel. In addition, the effective footprint of a MODIS pixel at

**Table 6**The Beta Distribution Parameters for the Albedo and the Distribution Means for the Whole Data Set and Subsets With LAI<sub>eff</sub> Exceeding Values 0.25, 0.5, 0.75 and 1

	Cumulative	Beta distribu		
	fraction of values			Distribution
Minimum	smaller than			mean
$LAI_{eff}$	minimum $LAI_{e\!f\!f}$	$\alpha$	β	albedo
0	0%	2.08	4.12	0.49
0.25	25%	2.11	5.15	0.44
0.5	53%	1.69	5.40	0.39
0.75	76%	1.79	8.88	0.32
1	89%	1.65	12.2	0.27

Note. The cumulative fractions of points with  $LAI_{eff}$  smaller than the minimum in question are provided too.

high latitudes is considerably larger than 500 m (Campagnolo et al., 2016). Moreover, MODIS albedo values have lower accuracy where solar zenith angles are greater than 70° (Wang et al., 2012), which is relevant for the March retrievals. Hence, in addition to direct comparison of albedo values, also daily albedo distributions were compared (Figure 17 and Figures S7–S9 in the Supporting Information S1).

In general, the airborne and MODIS albedo values have good agreement, but clearly there is a wide variation range of airborne values corresponding to one MODIS pixel. In low altitude flights the airborne albedo distribution is typically wider than the MODIS albedo distribution, which is related to the larger dynamic variation of albedo in higher spatial resolution. In some cases, the distributions differ, because during those flights the airborne measurements have been focused for certain targets, so that the sampling does not cover the whole MODIS pixel. The vertical profiles were flown above forests, hence in those days the airborne distributions have more dark values (2 April 2008; 13 March 2009 and 19 March 2010). On 18 March 2010, the focus was on bright targets, such as aapa mire and lake ice snow cover. The darker distribution of

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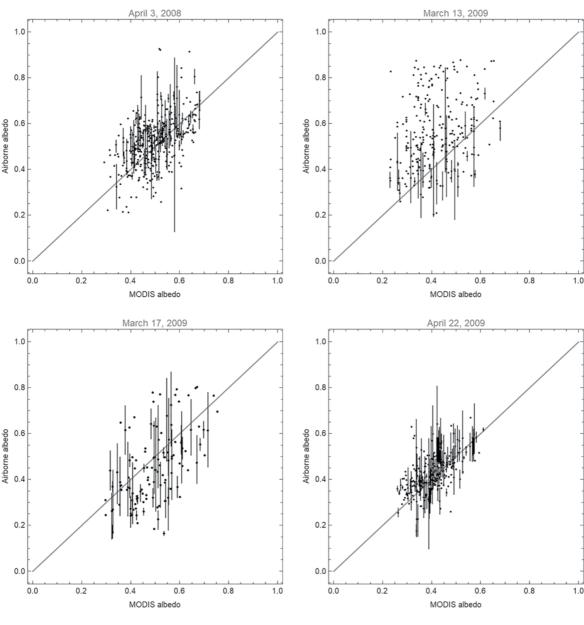


Figure 16. The airborne albedo values measured on 3 April 2008, 13, 17, and 22 April 2009 versus the MODIS albedo value (MCD43A3, Albedo\_WSA\_shortwave for March 13 and Albedo\_BSA\_shortwave for the rest). The mean airborne value within a MODIS pixel is shown as a point and the variation range as a vertical line.

the MODIS albedo product of 24 April 2009 as compared to that of 22 April 2009 may be a result of more open water and bare soil due to the progress of melting during the 16 days from which the MODIS product is compiled. On 24 April 2009 there was not yet open water, hence the airborne albedo is brighter than that of the MODIS product. The slightly brighter airborne distributions of 4 and 5 May 2009 are due to their focus being on fractional snow cover, which was not a dominating feature at that time.

The large variation range of individual airborne albedo values corresponding to a MODIS pixel is to a large extent related to variation of  $LAI_{eff}$  measured from the helicopter simultaneously with the albedo (Figure 18). As the camera objective is wide optics, but not a fish-eye lens, the airborne  $LAI_{eff}$  presents the central part of the area affecting the reflected radiation value observed by the downwards looking pyranometers. If the surrounding area is completely different, then the  $LAI_{eff}$  does not correspond to the measured value well, which can be seen in individual points of Figure 18.

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Relative frequency

Relative frequency

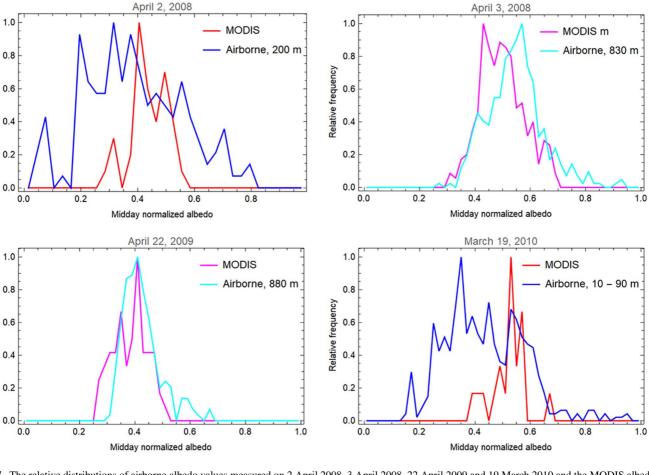


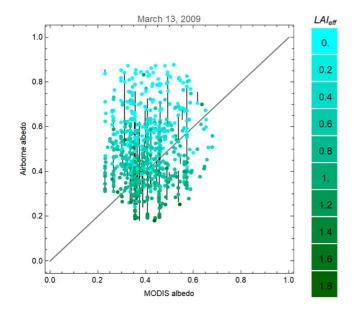
Figure 17. The relative distributions of airborne albedo values measured on 2 April 2008, 3 April 2008, 22 April 2009 and 19 March 2010 and the MODIS albedo values of corresponding pixels (MCD43A3, Albedo\_BSA\_shortwave). The flight altitude corresponding to the airborne data retrieval is given for clarity.

#### 4. Discussion

The helicopter based simultaneously measured albedo and  $LAI_{eff}$  data in snow covered conditions provide a unique possibility to observe the evolution of albedo in areas of low accessibility, where roads are sparse and wetlands complicate advancing. In addition, the photos, from which the  $LAI_{eff}$  values are calculated, provide background information for interpretation of unexpected, measured albedo values. In situ it is possible to measure only a relatively limited set of  $LAI_{eff}$  values (typically about 20 values per campaign), because the measurements require human presence in the field. On the contrary, the size of the airborne data set is limited only by the hours available for flying and in this study more than 4,000 airborne  $LAI_{eff}$  values were measured. As the airborne albedo and  $LAI_{eff}$  are measured simultaneously, they are automatically co-registered both temporally and spatially.

One of the important results of this study was to validate the version of the PARAS model that also contains the contribution of the multiple scattering between the canopy and the forest floor in addition to the direct scattering from the forest floor. Previously, it has been validated only in one site (Manninen & Stenberg, 2009) as albedo is very rarely measured above forests. Then it was possible to show that the model applies in varying forest floor and weather conditions, but the  $LAI_{eff}$  value was all the time the same. In this study, it has been possible to show that the model applies also for a wide range of  $LAI_{eff}$  values and in varying forest floor and illumination conditions. As the model describes an area of homogeneous canopy, the amount of validation data was increased by flying vertical profiles above homogeneous forest plots. The advantage of the PARAS model is that it takes properly into account the multiple scattering between the canopy and the forest floor, which is not included in many forest scattering models used for climate research. Neglection of that effect may lead

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**Figure 18.** The airborne albedo values measured on 13 March 2009 versus the MODIS albedo value (MCD43A3, Albedo\_WSA\_shortwave). The individual point color is related to the corresponding airborne measured  $LAI_{eff}$  value and the vertical line shows the variation range of the airborne albedo values within a MODIS pixel.

into modeled forest albedo value being only 80% of the true one, which further on may result into underestimation of the reflected solar energy by 30% (Jääskeläinen & Manninen, 2021). The large amount of simultaneous  $LAI_{eff}$  and albedo data also shows the difference to the albedo caused by the land cover heterogeneity. The albedo deviates markedly from that of a homogeneous area with similar average  $LAI_{eff}$ . Hence, modeling of albedo of forested areas should take into account also the structure of the forest, not only its average properties.

The comparison of the airborne albedo values with the MODIS albedo products showed that their general agreement is good. In addition, the effect of  $LAI_{eff}$  on albedo explains the variation of the individual albedo values within one MODIS pixel. As the MODIS albedo product is very thoroughly validated in various contexts, this supports the perception that the calibration of the airborne albedo data is reliable.

The extensive airborne  $LAI_{eff}$  and albedo data set enabled also studying the effect of seasonal progress on albedo. Even before the onset of the actual melting season the albedo of old snow cover increases when the snow surface temperature decreases from  $-1^{\circ}\text{C}$  to  $-2^{\circ}\text{C}$ . And naturally accumulation of 10 cm of fresh snow increases the albedo even more. When the daytime air temperature starts to be above  $0^{\circ}\text{C}$  day after day, the actual melting season starts. This is directly observed as a decrease in the albedo value. And when also the surface temperature of the snow layer reaches the melting temperature, the melting proceeds rapidly and the albedo evolution reaches the linear part of the sigmoid characterizing albedo changes during the melting season (Anttila et al., 2018; Manninen, Aalto, et al., 2019; Manninen, Jääskeläinen et al., 2019). The smaller the albedo is the smaller is also the effect of  $LAI_{eff}$  on it.

The presence of high vegetation at snow covered areas affects the scenery albedo in different ways. Besides altering the snow microstructure and surface roughness, it casts shadows on the snow surface and increases the multiple scattering of solar radiation between canopy and snow surface (Jääskeläinen & Manninen, 2021; Manninen & Jääskeläinen, 2018; Manninen & Stenberg, 2009). The large effect of vegetation protruding above the snow surface on surface albedo comes from the substantial difference between the albedo of snow and the albedo of plant stands. Therefore, the vegetation and snow scenery albedo is sensitive to even small changes in either quantity, depending closely on both vegetation architecture and snow coverage and properties as a function of solar geometry.

With a dense vegetation canopy the snow surface is already largely covered by vegetation, and thus the increase in LAI or vegetation coverage does not significantly affect the albedo. With a sparse vegetation canopy and dominating open snow cover, increasing LAI means increasing coverage and shadowing of the snow, and through that, lower wintertime albedo. Even relatively small shrubs can have a significant effect in such case. For example, Sturm et al. (2005) found that if shrubs protrude above the snow and cover 10% of the surface, the albedo will decrease by 30%. With climate change also the tree line of subarctic forests has shown to move to higher altitudes (Sutinen et al., 2012), which will inevitably decrease the wintertime albedo of hilly terrain. Also, in other forested parts of Finland the albedo has been shown to have decreased since 1980s by 0.02-0.03 per decade due to increased stem volume (Manninen, Aalto, et al., 2019; Manninen, Jääskeläinen, 2019). In the measured data of this study 25% had smaller  $LAI_{eff}$  than 0.25, for which a high risk of marked albedo change exists.

## 5. Conclusions

Helicopter can be used successfully to measure simultaneously airborne albedo and  $LAI_{eff}$ . The relationship of airborne albedo and  $LAI_{eff}$  does not show a marked flight altitude dependence and it agrees well with the PARAS model, which can be used for normalizing albedo to other solar zenith angle values. The airborne albedo variation range decreases essentially, when the measurement altitude increases up to 500 m and reduces at about

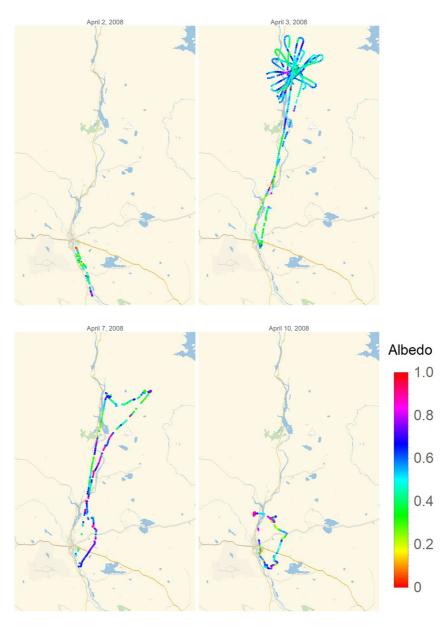
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1 km altitude to an aerial average. The albedo of forested area with snow covered floor decreases with increasing  $LAI_{eff}$ , the change being markedly larger for smallest  $LAI_{eff}$  values. The mean albedo of the area as presented by the measurements of this study would decrease from 0.49 to 0.44, if the points with  $LAI_{eff}$  smaller than 0.25 (25% of all points) were removed.

The airborne albedo distributions agreed in general with those of the MODIS albedo product MCD43A3. The differences between pixelwise values were explained by differences in spatial resolution and representativity related to airborne measurements being focused on only certain targets, such as forest and partial snow cover.

## **Appendix A: The Flight Routes During the SNORTEX Campaign**

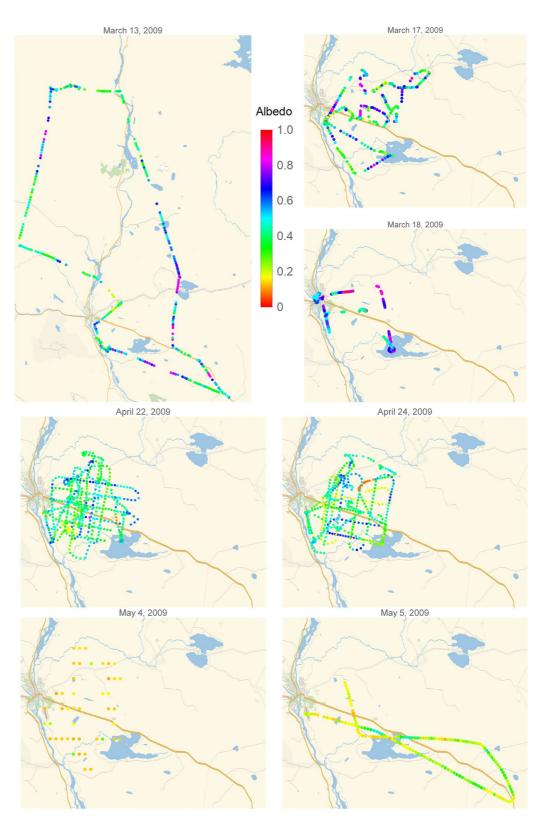
Figures A1-A3



**Figure A1.** The flight routes of April 2, April 3, April 7, and April 10 in 2008. The lower left and upper right corner coordinates are (67.25°N, 26.22°E) and (67.95°N, 27.39°E), respectively. The crossroads of Sodankylä center are near the starting point of all flights. The background map is provided by Wolfram Research.

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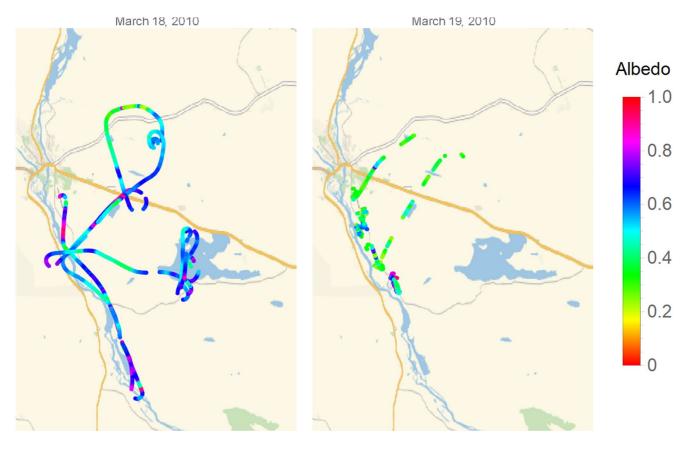
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**Figure A2.** The flight routes of March 13, March 17, March 18, April 22, April 24, May 4, and May 5 in 2009. The lower left and upper right corner co-ordinates are (67.25°N, 26.22°E) and (67.95°N, 27.39°E) for March 13; and (67.29°N, 26.55°E) and (67.5°N, 27.25°E) for the rest. The background map is provided by Wolfram Research.

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**Figure A3.** The flight routes of March 18 and March 19 in 2010. The size of the point is related to the albedo value. The lower left and upper right corner co-ordinates are (67.25°N, 26.55°E) and (67.5°N, 27.0°E). The background map is provided by Wolfram Research.

# Appendix B: Comparison of Left and Right Pyranometer Observations

# Table B1 The Coefficient of Determination for Linear Relationships Between the Left and Right Global and Reflected Radiation Measured From the Helicopter for All Data

Date	Sky conditions during the azimuthal calibration	Airborne global right versus left	Airborne reflected right versus left
2 April 2008	Clear	0.013	0.976
3 April 2008	Clear	0.152	0.978
7 April 2008	Clear	0.496	0.979
10 April 2008	Clear	0.268	0.986
13 March 2009	Cloudy	0.944	0.989
17 March 2009	Perfectly clear	0.278	0.980
18 March 2009	Clear/cloudy	0.258	0.729
22 April 2009	Perfectly clear	0.402	0.989
24 April 2009	Clear - > cloudy	0.004	0.990
4 May 2009	Clear - > cloudy	0.006	0.995

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Table B1 Continued						
		$R^2$				
Date	Sky conditions during the azimuthal calibration	Airborne global right versus left	Airborne reflected right versus left			
5 May 2009	Cloudy - > clear	0.148	0.994			
18 March 2010	Clear/cloudy	0.200	0.984			
19 March 2010	Clear/cloudy	0.005	0.798			
<i>Note.</i> Notice that the $R^2$ values were derived for a linear regression without allowing an offset.						

### Appendix C: Albedo Model Formulas of the PARAS Model

In the extended PARAS albedo model (Manninen & Stenberg, 2009), the black-sky spectral forest albedo ( $\alpha_{black}$ ) is a sum of four components:

$$\alpha_{black} = \alpha_{tt} + \alpha_s + \alpha_{st} + \alpha_{ss} \tag{C1}$$

where  $\alpha_{tt}$  is the pure forest floor scattering part,  $\alpha_s$  is the pure canopy scattering,  $\alpha_{st}$  denotes the multiple scattering between forest floor and canopy with the last hit from the floor, and  $\alpha_{ss}$  is the multiple scattering between forest floor and canopy with the last hit from the canopy. To achieve more compact version of the  $\alpha_{black}$ , the multiple scattering components  $\alpha_{st}$  and  $\alpha_{ss}$  are reformulated:

$$\alpha_{black} = \alpha_{tt} + \alpha_s + \alpha'_{st} + \alpha'_{ss} \tag{C2}$$

where

$$\alpha_{tt} = k\alpha_b t_0^2 + (1 - k)\alpha_b t_0 t_1 \tag{C3}$$

$$\alpha_s = Q(1 - t_0) \cdot \frac{\omega_L - p\omega_L}{1 - p\omega_L} \tag{C4}$$

$$\alpha'_{st} = \{\alpha_b(1 - Q_b)[kt_0(1 - t_0) + (1 - k)t_0(1 - t_1)]\} \cdot \frac{\omega_L - p\omega_L}{1 - p\omega_L}$$
(C5)

$$\alpha'_{ss} = \left\{ \alpha_b [(1 - Q)(1 - t_0) + Q_b \alpha_b t_0 (k(1 - t_0) + (1 - k)(1 - t_1))] \cdot \frac{t_1 (1 - \omega_L + Q_b \omega_L - Q_b p \omega_L) + (1 - Q_b)(\omega_L - p \omega_L)}{1 - p \omega_L - Q_b \alpha_b (1 - t_1)(\omega_L - p \omega_L)} \right\} \cdot \frac{\omega_L - p \omega_L}{1 - p \omega_L}$$
(C6)

Now  $\alpha'_{st}$  consists of the portion of multiple scattering where radiation escapes upwards from canopy scattering after being first scattered from the forest floor, and  $\alpha'_{ss}$  contains the rest of the multiple scattering (including radiation scattering several times between canopy and forest floor).

The uncollided canopy transmittance in direct  $(t_0)$  and diffuse  $(t_1)$  radiation conditions are:

$$t_0 = exp\left(-\frac{G \cdot LAI_{eff}}{\cos(\theta)}\right) \tag{C7}$$

and

$$t_1 = exp(-G \cdot LAI_{eff})(1 - G \cdot LAI_{eff}) - (G \cdot LAI_{eff})^2 Ei(-G \cdot LAI_{eff})$$
 (C8)

where  $\theta$  is the solar zenith angle, G is the radiation extinction coefficient of a uniform leaf canopy,  $LAI_{eff}$  is the effective leaf area index, and Ei is the exponential integral.

The formula for photon recollision probability p is from Stenberg (2007):

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$$\hat{p} = 1 - \frac{1 - t_1}{LAI_{eff}/\beta} \tag{C9}$$

where  $\beta$  is the clumping index, which equals unity for broadleaved canopy and is smaller than unity for coniferous canopy. For broadleaved forests  $\beta = 1$  and for coniferous forests  $\beta = 0.67$  (Stenberg et al., 2003). The leaf single scattering albedo  $\omega_L$ , the forest floor albedo  $\alpha_b$ , the fraction of incoming radiation scattered upwards by the canopy Q, and the portion of radiation reflected by the forest floor and then scattered downwards by the canopy  $Q_b$  are all wavelength dependent parameters. Forest floor albedo is a combination of a purely Lambertian surface and a completely forward/backward scattering surface. A parameter k is used to indicate the weight of the forward/backward scattering part.

The white-sky spectral forest albedo ( $\alpha_{white}$ ) is modeled similarly as the black-sky albedo. Only difference is that the calculations are done by integrating over solar zenith angle. The four component sum is:

$$\alpha_{white} = \alpha_{difftt} + \alpha_{diffs} + \alpha'_{diffst} + \alpha'_{diffss}$$
 (C10)

where

$$\alpha_{difftt} = k\alpha_b t_2 + (1 - k)\alpha_b t_1^2 \tag{C11}$$

$$\alpha_{diffs} = Q(1 - t_1) \cdot \frac{\omega_L - p\omega_L}{1 - p\omega_I} \tag{C12}$$

$$\alpha'_{diffst} = \{\alpha_b(1 - Q_b)[k(t_1 - t_2) + (1 - k)t_1(1 - t_1)]\} \cdot \frac{\omega_L - p\omega_L}{1 - p\omega_L}$$
(C13)

and

$$\alpha'_{diffss} = \left\{ \alpha_b [(1 - Q)(1 - t_1) + Q_b \alpha_b (k(t_1 - t_2) + (1 - k)t_1(1 - t_1))] \cdot \frac{t_1 (1 - \omega_L + Q_b \omega_L - Q_b p \omega_L) + (1 - Q_b)(\omega_L - p \omega_L)}{1 - p \omega_L - Q_b \alpha_b (1 - t_1)(\omega_L - p \omega_L)} \right\} \cdot \frac{\omega_L - p \omega_L}{1 - p \omega_L}$$
(C14)

and where

$$t_2 = \exp(-2G \cdot LAI_{eff}) \cdot (1 - 2G \cdot LAI_{eff}) - (2G \cdot LAI_{eff})^2 Ei(-2G \cdot LAI_{eff})$$
(C15)

In this study we used spherical G = 0.5 (assuming spherical leaf orientation distribution), and the forest floor surface was assumed to cause only diffuse scattering (k = 1), since the solar zenith angle was so small. It was also assumed that the scattering does not depend on the direction from which the photon enters the canopy, that is,  $Q = Q_b$ , since the shape of the canopy is not described.

# **Data Availability Statement**

The data are available in the FMI Research Data Repository: http://doi.org/10.23728/fmi-b2share.c6ffb1acf92440a39cbc1ee001aa61c0.

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