# BOREAL FOREST LEAF AREA INDEX (LAI) ESTIMATION USING WIDE OPTICS AIRBORNE WINTER PHOTOS

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## 1. INTRODUCTION

The boreal zone land cover has a very significant influence on the northern hemisphere albedo and is an important component of the northern hemisphere carbon budget [1, 2] and is sensitive to changes in local and global climate [3]. Forest transition zones react to changes in mean temperature and moisture conditions in the long term [4] whereas changes in, for example, forest leaf area index (LAI) through defoliation indicate stress factors in shorter time scale [5]. Also the timing of the phenological phase transitions is an important indicator of global climatological processes [6]. LAI is one of the Essential Climate Variables (ECV) defined in the Implementation Plan for the Global Observing System for Climate in Support of the United Nations Framework Convention on Climate Change (UNFCCC) [7]. The development and validation of satellite based LAI estimation methods require reliable *in situ* measurements of LAI. For large areas of tall vegetation it is difficult to get aerially representative ground truth using direct or indirect methods [8, 9], especially in regions of difficult accessibility.

## 2. MATERIALS AND METHODS

A new airborne method is presented here for leaf area index estimation. The basic technique is the same as used in hemispherical photo analysis [10, 8]. The difference is just that the background is the snow covered terrain instead of the sky. This naturally limits the use of the technique to the areas with annual snow cover. In addition, the method is not directly suited for broadleaved canopies, which are usually without leaves at the time of the snow cover. Boreal forests are typically dominated by coniferous species and the snow covered season is mostly long. Therefore the method is well suited for LAI estimation of boreal forest in larger areas and especially useful in the northernmost regions, where the roads are sparse and it is difficult to access the forests scattered between wetlands.



Figure 1. An example of the wide optics airborne photos taken from a helicopter.

The photos are taken automatically and stored to a laptop during the flights [Figure 1]. The hemispherical analysis is carried out later using the Nobis-Hunziker [11] or Ridler-Calvard [12] thresholding algorithms to separate the vegetation pixels from the background. Possible shadows of trees can be removed using the 2<sup>nd</sup> principal component of the blue channel of the RGB images.

### 3. RESULTS

The R<sup>2</sup> value of the linear regression of the airborne and ground based LAI measurements was 0.89 for the whole test data set and better, when the amount of deciduous species was reduced [Figure 2]. The reason for this is that the ground truth was measured in the autumn, when the leaves were still present, but the airborne data was gathered in winter, when the deciduous trees were without leaves.

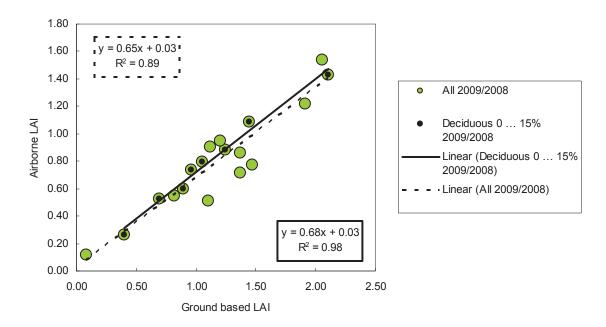


Figure 2. Relationship of the ground based and airborne LAI values. The airborne values were measured in March 13, 2009 and corresponding ground measurements were carried out during August 26 - September 5, 2008.

The angle from the image centre for the airborne camera was about 41° at the corners of the rectangular images and 35° and 28° at the middle of the image edges. The ground based images were taken using a full hemispherical view angle, but only zenith angles 0–75° were utilized in the analysis so as to correspond to measurements by the LAI-2000. This explains why the slope of the ground vs. airborne LAI estimates deviates from unity.

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