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# Mapping snow depth in alpine terrain with unmanned aerial systems (UAS): potential and limitations

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## Abstract

Detailed information on the spatiotemporal distribution, and variability of snow depth (HS) is a crucial input for numerous applications in hydrology, climatology, ecology and avalanche research. Nowadays, snow depth distribution is usually estimated by combining point measurements from weather stations or observers in the field with spatial interpolation algorithms. However, even a dense measurement network is not able to capture the large spatial variability of snow depth present in alpine terrain.

Remote sensing methods, such as laser scanning or digital photogrammetry, have recently been successfully applied to map snow depth variability at local and regional scales. However, such data acquisition is costly if manned airplanes are involved. The effectiveness of ground-based measurements on the other hand is often hindered by occlusions, due to the complex terrain or acute viewing angles. In this paper, we investigate the application of unmanned aerial systems (UAS), in combination with structure-from-motion photogrammetry, to map snow depth distribution. Such systems have the advantage that they are comparatively cost-effective and can be applied very flexibly to cover otherwise inaccessible terrain. In this study, we map snow depth at two different locations: (a) a sheltered location at the bottom of the Flüela valley (1900 m a.s.l.) and (b) an exposed location on a peak (2500 m a.s.l.) in the ski resort Jakobshorn, both in the vicinity of Davos, Switzerland. At the first test site, we monitor the ablation on three different dates. We validate the photogrammetric snow depth maps using simultaneously acquired manual snow depth measurements. The resulting snow depth values have a root mean square error (RMSE) better than 0.07 to 0.15 m on meadows and rocks and a RMSE better than 0.30 m on sections covered by bushes or tall grass. This new measurement technology opens the door for efficient, flexible, repeatable and cost effective snow depth monitoring for various applications, investigating the worlds cryosphere.

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# 1 Introduction

Information on the spatiotemporal distribution of snow depth is important for numerous applications: As it is a robust indicator for the amount of water stored as snow (snow water equivalent – SWE) (Jonas et al., 2009), it has a substantial impact on water supply and hydropower; the quality of hazard forecasting for floods and snow avalanches depends substantially on snow depth information (Bavay et al., 2009; McClung and Schaerer, 2006); the growth and habitat patterns of alpine flora and fauna is linked to the seasonal snow depth distribution (Bilodeau et al., 2013; Mysterud et al., 2001; Wipf et al., 2009); annual changes in snow depth over the winter season have strong impact on alpine tourism as more and more ski resorts depend on technical snow production.

Numerous studies report a very high spatial variability of snow depth within small distances, in particular in alpine terrain (Egli et al., 2011; Elder et al., 1998; Grünewald et al., 2010; Schweizer et al., 2008). Remote sensing is a promising tool to monitor this spatial variability, because it can provide spatially continuous measurements at a high spatial resolution of otherwise inaccessible areas. We define snow depth (HS) according to Fierz et al. (2009) as the vertical distance from the base to the snow pack surface at a specific location.

Terrestrial laser scanning (TLS) has been successfully applied in many case studies to measure HS distribution in small catchments with high vertical accuracies in the range of 0.10 m (Deems et al., 2013; Grünewald et al., 2010; Melvold and Skaugen, 2013; Mott et al., 2010; Prokop, 2008; Schaffhauser et al., 2008). A recent study by Deems et al. (2015) uses TLS to visualize the HS distribution in avalanche release zones for the education of ski resort staff and assesses the different error sources. However, TLS-accuracies suffer from acute illumination angles, resulting in unfavorable laser footprints, in particular within flat areas. Furthermore, terrain sections behind convex landforms such as hills or moraines cannot be covered. Airborne laser scanning (ALS) on the other hand is still very costly (e.g. Bühler et al., 2015a). Therefore,

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plete photogrammetric workflow with special emphasis on multi-view reconstruction with UAS-based images. The tie point matching of PhotoScan allows the estimation of the internal and external camera orientation parameters and is followed by adding georeference information (coordinate system and ground control points). The resulting model is linearly converted using the Helmert-Transform with 7 parameters and therefore compensates only for linear misalignment. Non-linear deformations from the model are removed by optimizing the estimated point cloud and camera parameters using 4 radial and 4 tangential distortion coefficients (Agisoft PhotoScan User Manual, <http://www.agisoft.com/downloads/user-manuals/>). During creation of the dense point cloud the estimated camera positions are used to calculate depth information for each camera and will be combined into a single dense point cloud. Two parameters of the dense cloud processing step have the strongest impact on the resulting point cloud:

1. “Quality” defines the desired reconstruction detail level. Higher quality settings can be used to obtain more detailed and more accurate geometry, but can result in significantly longer time for processing.
2. “Depth filtering” allows removing outliers from the point cloud, which are caused by poor texture of the scene, noisy or blurry images. Depending on the complexity of the scene geometry, different depth filtering modes can be applied. The accuracy of the exported product needs to be analyzed to estimate the complexity in the model and thus select an appropriate depth-filtering mode.

### 3 Test sites and data acquisition

To test the feasibility of UAS-based HS change mapping, two well-accessible test sites in the region of Davos, Switzerland have been chosen and represent typical locations for HS studies in high alpine environment (Fig. 1).









hydrological applications it is also important to gain information on the standard deviation  $\sigma$  of HS within a specific plot. Even though the reference plots are only 1 m<sup>2</sup> we find  $\sigma$  values up to 0.2 m. The RMSE of  $\sigma$  is 0.04 m and there is no significant difference between the two investigated classes.

## 4.2 Brämabühl: mountain top

The HS map with a spatial resolution of 0.1 m shows different characteristics compared to the Tschuggen test site. The expected higher HS values of up to 5 m are clearly visible in Fig. 6. The close-up of the central part reveals interesting details such as the linear feature of buried hiking paths in the northwest or the snow grooming on the ski tracks. Over the entire area we calculate a mean HS  $\bar{x} = 1.41$  m and  $\sigma = 0.78$ . Both  $\bar{x}$  and  $\sigma$  are more than twice as high as at the Tschuggen test site. The high spatial variability gets even more obvious in the 3-D view. We provide an animation of this 3-D visualization as Supplement to the paper (mp4 3-D movie). Snow filled bowls lay directly next to ridges where nearly all snow has been blown off. HS differences reach up to 5 m within only a few meters in horizontal distance. Artificial terrain features such as hiking paths and the edges of the ski track can easily be identified in the HS map. The gray features on the top and on the left side are the station building of the chairlift Brämajet and its masts. This visualization highlights the role of wind in combination with small terrain features for the spatial variability of HS.

The mean HS distribution classified by the terrain expositions confirms the visual impression that the south facing slopes have much lower HS values than the north facing slopes (Fig. 7). Also the standard deviation of the mean HS shows a tendency to be smaller at southern expositions (SE, S, and SW). This slope aspect analysis was performed on the snow-free DSM, which was resampled to 1 m to filter out small exposition changes. Such statistical evaluation enables a more detailed analysis of mountain HS distribution on local to regional scale.

The comparison of the photogrammetric HS with manual HS measurements results in a RMSE of 0.15 m and a very high correlation coefficient of  $R^2 = 0.99$  (Fig. 8). The

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photogrammetric HS values are, on average, 0.11 m lower than the manual measurements. The summer vegetation can at least partly explain difference, as dense grass and small bushes cover the peak of Brämabühl. The comparison of the standard deviations within a reference plot results in a mean deviation of 0.03 m; the RMSE is 0.06 cm.

5 These results confirm the high accuracy of the photogrammetric HS measurements we found at the Tschuggen test site.

## 5 Discussion

Based on the experience gained at the two presented test sites, the following key points require a more detailed discussion because they are crucial for the application of UASs in high alpine terrain.

### 5.1 UAS applied in high alpine terrain

Steep terrain, high altitudes, low temperatures and often wind speeds of more than  $10 \text{ m s}^{-1}$  are typical for high alpine regions. To successfully apply UASs, platform and sensor must be able to handle such conditions and have to be easily transportable in a backpack on foot or on skis. The key limitation of the applied Falcon 8 UAS is the comparably short flight time of 6 to 10 min with one battery at elevations above 2000 m a.s.l. This also limits the range of the UAS. As a consequence, the pilot position has to be close to the area of interest, which is often difficult or even impossible for example if snow avalanche release zones have to be mapped. A big advantage of a multicopter UAS is that they can be started and landed by hand, which is the appropriate starting/landing procedure we apply in alpine terrain. This is in contrast to the application of winged UASs, which require large flat areas to safely land but such areas are typically missing in high alpine regions. Cold temperatures of down to  $-30^\circ\text{C}$  are a major problem for battery transportation. As soon as the battery is deployed and running in the UAS there is self-heating. Therefore it is critical that the batteries are transported

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in a heated environment for example close to the body, otherwise they will lose a big part of their performance before taking off significantly reducing the already short flight time. On the other hand, our experiences with the UAS regarding high wind speeds were surprising. Even under foehn conditions with gusty wind speeds up to  $20 \text{ m s}^{-1}$  the acquired imagery was of high quality and the flight plan and its specific overlap could be accomplished. Fixed-wing UAS achieve significantly longer flight times per battery (20–60 min), but are less stable in windy conditions, are less easy to transport and to fly and they need gentle terrain to land. In our opinion, this limits their successful application in alpine terrain considerably in particular on missions in alpine terrain.

## 5.2 Photogrammetry on snow covered terrain

For a long time, photogrammetry on snow-covered terrain was considered unfeasible, due to low contrast, a limitation only recently overcome as highlighted in current studies (Bühler et al., 2015a; Lee et al., 2008; Nolan et al., 2015). However, the smoother the snow surface is, the harder it gets for the structure-from-motion software to identify meaningful matching points. This gets obvious if we look at homogenous areas within the hillshade DSM at shadowed and at well-illuminated snow covered locations (Fig. 9). In shadowed areas (e.g. shadow of the chapel tower) the clearly visible noise introduced into the DEM gets amplitudes of up to 0.40 m. In the bright, very homogenous areas the noise shows amplitudes of up to 0.15 m. This indicates that a fresh snow surface is less suitable than an older, weathered surface. But due to strong winds and large differences in radiation, alpine snow surfaces develop detectable features such as sastrugis or wind ripples already during or very quickly after fresh snowfall. However, very homogenous snow surfaces occur only within very small parts of our test sites.

Additional problems occur if reflections of the sun on the snow saturate the camera sensor. Therefore it is recommended that the camera exposure time is properly set and the imagery is stored in raw format using the full bit depth of the sensor, typically 10 to 14 bits. Standard JPEG image compression, which is the default storage setting

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for most cameras, is limited to 8 bits storing only 256 gray scale values per band. To acquire an optimal contrast on homogenous snow surface we recommend using RAW image storage format with 12 bit. However, further investigations have to quantify the benefit of 12 bit image storage over the 8 bit JPEG compression on snow covered areas.

As snow absorbs more energy in the near infrared NIR part ( $\lambda \approx 760\text{--}2500$  nm) of the electromagnetic spectrum than in the visible part ( $\lambda \approx 400\text{--}700$  nm) and the reflection is sensitive to snow grain size (Warren, 1982) at the snow surface, additional features are expected to be discriminated if NIR data can be used (Bühler et al., 2015b). However, further studies have to investigate the real benefit of NIR bands for photogrammetric HS mapping in more detail. This might only be significant if multi-imager cameras with narrow NIR bands and simultaneous band acquisition are applied.

### 5.3 Orthorectification

Exact relative georeferencing (coregistration) between the two DSMs is essential for correct HS calculation (snow-covered DSM minus snow-free DSM). Even small shifts in  $x$  and  $y$  can lead to large differences in  $z$  direction on steep terrain. The following referencing approaches exist:

- a. absolute referencing with artificial GCPs measured with differential GNSS;
- b. relative referencing with natural GPSs that are well visible in the snow-free and the snow-covered imagery;
- c. absolute referencing of one DSM with differential GNSS and then relative referencing of the second DSM by identifying well visible points in the second DSM.

A major drawback of method (a) is that all reference points have to be manually deployed and measured with differential GNSS devices to achieve accuracy in the range of centimeters to a decimeter. They should be distributed equally over the entire area of interest and all elevation bands. In high alpine terrain this is often not possible for

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example due to avalanche danger. The methods (b) and (c) exclude the possibility of a potential GNSS shift but are only applicable if areas with distinct terrain features exist that are not covered by snow. This was the case at our test sites but might not be feasible in winters with exceptionally high amounts of snow. The referencing strategy has to be evaluated carefully prior to a UAS HS mapping campaign. A direct matching of the snow-covered to the snow-free point cloud (Gruen and Akca, 2005) is not feasible as the terrain shows large differences over most parts due to the snow cover.

## 5.4 Underlying vegetation

Within the accuracy range of 0.05–0.15 m, the vegetation at the base of the snow cover has a significant influence on the results. At the test site Tschuggen small bushes, mainly alpine rose, juniper and erica, rise up to 0.50m above ground in summer (Fig. 10a). In winter they are pressed down to the ground by the snowpack but form a snow-free layer at the bottom of the snowpack which can have a depth of a few centimeters to decimeters (Feistl et al., 2014). This leads to a systematic underestimation of HS mapped with photogrammetry (snow-free DSM is too high) as well as a systematic overestimation of HS measured manually with the avalanche probe because the probe penetrates the snow-free bottom layer and sometimes even the first layers of the ground. The “real” HS is most probably a value between the manual probe and the photogrammetric measurements. High grass on the other hand is usually pressed down to the ground completely only leaving a snow-free layer of less than some centimeters (Fig. 10b). This makes the probe measurements more reliable but can falsify the photogrammetric measurements significantly if the grass is high during the snow-free data acquisition. Alpine meadows should therefore be surveyed right after mowing or late in autumn while the grass is low. From our experience it is very difficult to correct the photogrammetric HS based on underlying vegetation because the elevation differences vary very much within short distances. A possibility might be to apply a vegetation classification based on the orthophotos to correct the underestimation of HS in areas with many bushes. But there is a high risk to introduce new errors and this possibility has to

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be investigated in more detail in the future. Photogrammetric HS mapping is impossible above and around trees as trees are nearly always moved by wind and the resulting ambiguous tree top positions interfere with image matching. Additionally areas below trees are not visible in the nadir imagery. Therefore laser scanning, measuring first and last returns or even full wave form signals, is still the best choice for investigations where trees play a major role (Moeser et al., 2015).

## 6 Conclusions

UAS-based digital photogrammetry is able to map the spatial variability of alpine HS with accuracies of 0.07 to 0.15 m RMSE compared to traditional manual measurements with avalanche probes. These accuracies are in the same range as HS measurements acquired by terrestrial laser scanning (Deems et al. 2013) and reported in the manned airplane based study by Nolan et al. (2015) and the UAS based study by Jagt et al. (2015). It is significantly better than the RMSE of 0.30 m reported by Bühler et al. (2015a), using an ADS80 survey camera mounted on a manned airplane, but can only cover considerably smaller areas. Fixed-wing UAS, flying at high altitudes above ground, would be able to cover larger areas of several square kilometers. Future investigations have to clarify how accurate the results from such platforms can get as the spatial resolution of the input imagery is worse and the results might get much more affected by wind.

UASs enable fast, flexible, repeatable and detailed analysis of the spatial distribution of the mountain snow cover. We successfully applied a complete photogrammetric workflow at a sheltered test site at the valley bottom (Tschuggen) and at an exposed test site at a mountain top (Brämabühl) mapping extreme HS variability of up to 5 m within less than 3 m distance, confirming the important role of wind and terrain features on HS distribution in alpine regions (Mott et al., 2010).

A key to robust photogrammetric HS measurements is the accurate co-registration of the snow-free and the snow-covered digital surface models (DSM). Even small shifts

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in  $x$  and/or  $y$  direction can lead to large shifts in  $z$  in particular within steep terrain. To avoid shifts introduced by global navigation satellite system measurements (GNSS) we propose to reference the snow-covered DSM directly on the snow-free DSM. But this is only possible if snow-free areas exist, that contain well visible point- or linear features.

Another important point is that alpine vegetation, such as bushes and tall grass, lead to a significant overestimation of snow-free DSM elevations, resulting in underestimated HS values. This can introduce errors in HS values of up to 0.50 m.

We identify numerous promising applications where UAS have not yet been applied:

- precise water resource prediction for hydropower and flood warning in alpine catchments (Jonas et al., 2009);
- validation of snowpack and snow hydrology models (Bartelt and Lehning, 2002; Mote et al., 2003);
- survey of snow distribution in ski resorts to improve the track management (Damm et al., 2014);
- precise documentation of specific avalanche release and deposition to validate and calibrate numerical avalanche simulations (Christen et al., 2010) and to generate precise, up-to-date DSMs e.g. after an avalanche event blocks a channel, as base for such simulations (Bühler et al., 2011);
- identification of representative locations for automated weather stations (Grünwald and Lehning, 2015);
- survey of avalanche defense structures to prevent ineffectiveness due to potential overfill (Margreth and Romang, 2010);
- ideal positioning of artificial avalanche release trigger points (Stoffel and Margreth, 2009);
- identification of wind blown snow packets prone to snow avalanche release (Schweizer et al., 2008).

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In our opinion the number of investigations applying UAS based digital photogrammetry will rise quickly within the next years and change the way of collecting spatial information within alpine terrain sustainably.

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**Table 1.** Technical specifications of the Falcon 8 UAS.

UAS type	V-form octocopter
Dimensions	770 × 820 × 125 mm
Engines	8 electrical, brushless (sensor less) motors
Rotor diameter	8" (~ 0.20 m)
Number of rotors	8
Rotor weight	6 g
Empty weight	1.1 kg
Max. take off weight	2.3 kg
Max. payload weight	0.8 kg
Max. flight time per Battery	12–22 min
Max. range	1 km
Tolerable wind speed	12–15 m s <sup>-1</sup>
Navigation sensors	AscTec Trinity (IMU, barometer and compass) AscTec High-Performance GPS (GNSS)
Max. airspeed	Manual mode 15 m s <sup>-1</sup> Height mode 15 m s <sup>-1</sup> GPS mode 4.5–10 m s <sup>-1</sup>
Max. climb/sink rate:	Manual mode 6–10 m s <sup>-1</sup> Height mode 3 m s <sup>-1</sup> GPS mode 3 m s <sup>-1</sup>
Wireless communication	2 independent (diversity) control/data links 2.4 GHz FHSS link (10 to 63 mW) 1 analogue diversity video receiver 5.8 GHz (25 or 100 mW)
LiPo battery	PP 6250, 3 Cells 6250 mAh (~ 426 g)

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**Table 2.** Data acquisition parameters for Tschuggen.

Acquisition date	Images	Covered area	Mean flight height above ground	Average points per m <sup>2</sup>	Reference measurements
11 March 2015 close to peak of winter	43	57 000 m <sup>2</sup>	97 m	772	12 plots (60 single points)
24 April 2015 snow melt ongoing	55	87 000 m <sup>2</sup>	126 m	469	19 plots (95 single points)
12 March 2015 snowmelt nearly completed	55	91 000 m <sup>2</sup>	130 m	439	19 plots (95 single points)
28 September 2015 completely snow free	99	128 000 m <sup>2</sup>	113 m	563	–

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**Table 3.** Data acquisition parameters for the Brämabühl test site.

Acquisition date	No. of images	Covered area	Mean flight height above ground level	Average points per m <sup>2</sup>	No. of reference measurements
14 April 2015 close to peak of winter HS accumulation	85	285 000 m <sup>2</sup>	157 m	274	22 plots (110 single points)
21 September 2015 completely snow free	274	363 000 m <sup>2</sup>	133 m	386	–

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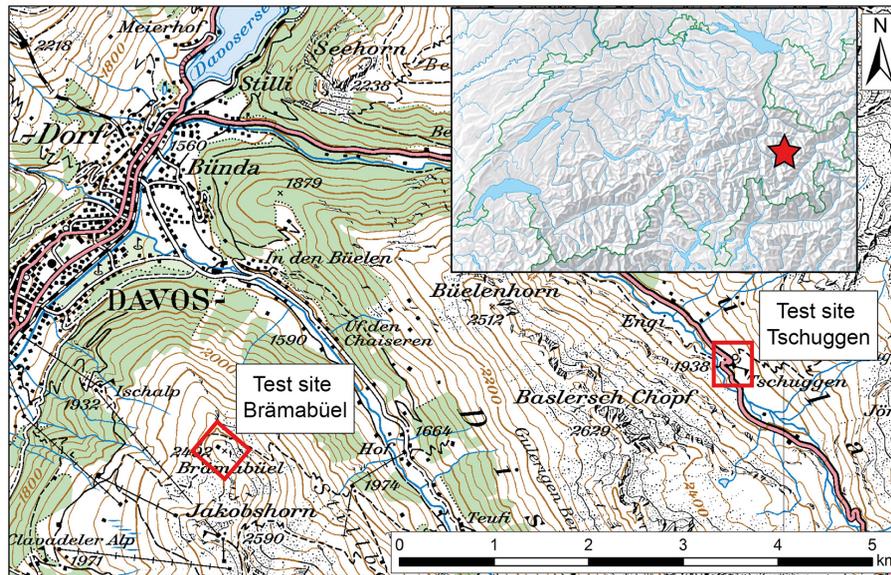
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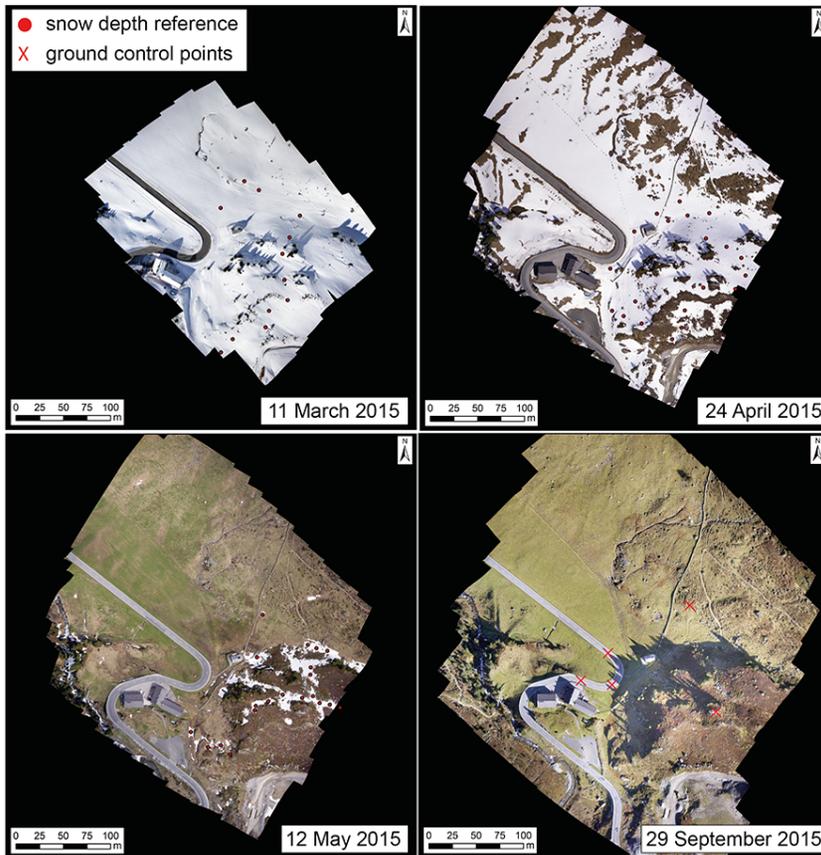
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**Figure 1.** Location of test sites Tschuggen and Brämabüel close to Davos, Switzerland, Pixmap<sup>®</sup> 2015 swisstopo (5 704 000 000), reproduced by permission of swisstopo (JA100118).



**Figure 2.** Orthophotos of the four different data acquisitions at Tschuggen depicting the change in snow coverage overlaid by the locations of the manual HS measurements and the applied ground control points.

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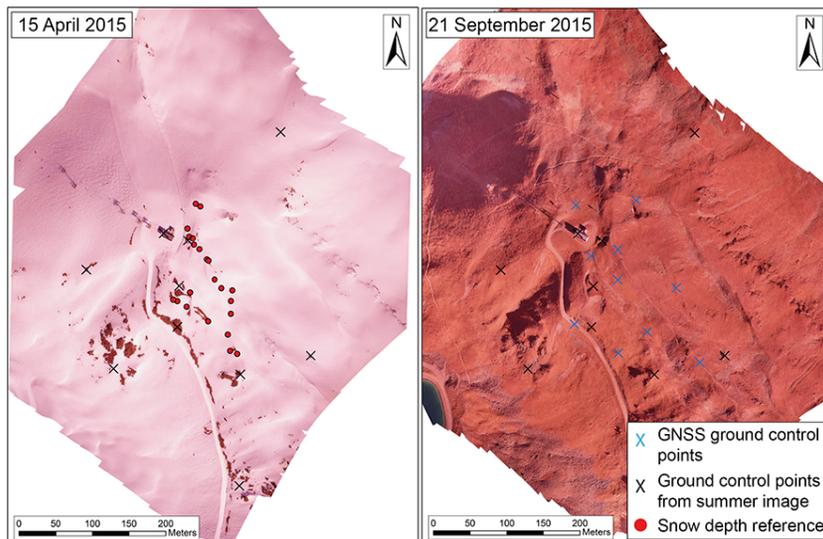
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**Figure 3.** Near infrared orthophotos snow-covered (left panel) and snow-free (right panel), acquired over the Brämabühl test site including the applied ground control points and reference HS measurements.

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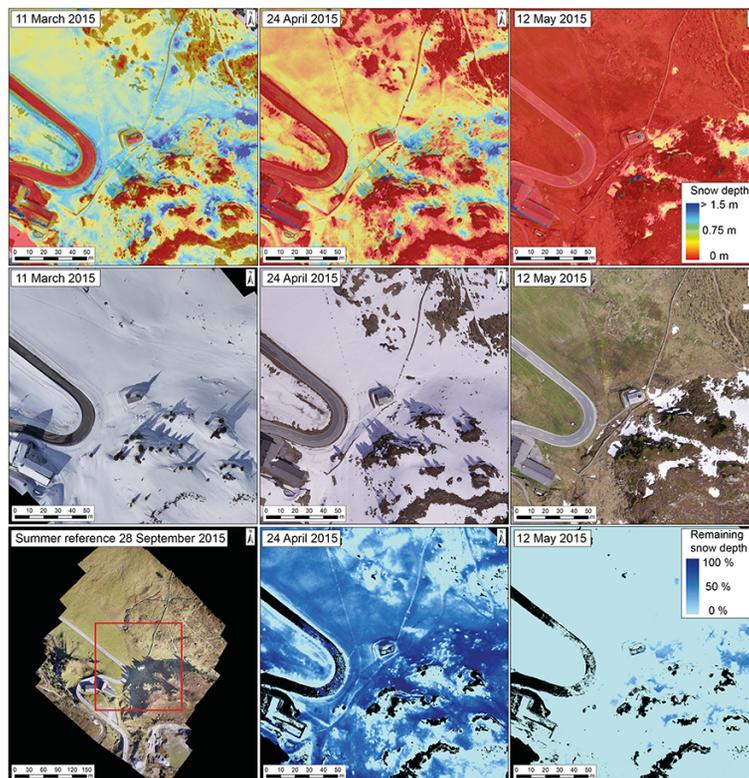
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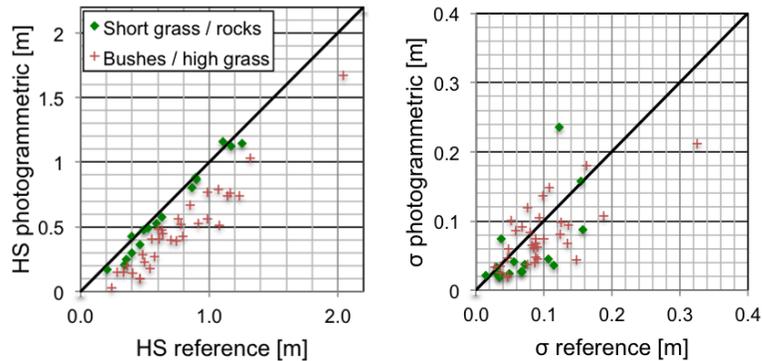


**Figure 4.** HS maps (top panels) and corresponding orthophotos (middle panels) of the area around the chapel in the center of the test site. At the bottom the orthophoto of the snow-free reference (bottom left panel) and the spatial distribution of melt rates as percentage of remaining snow compared to the peak of winter (11 March 2015) are depicted. Black areas are no data values.

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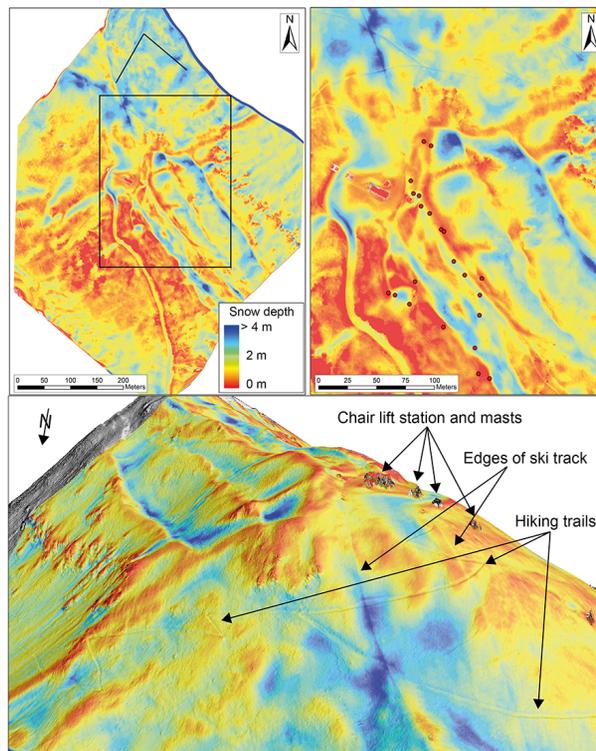


**Figure 5.** Statistical evaluation of the HS measurements (left panel) and the standard deviations  $\sigma$  of HS within a specific reference plot (right panel). The overall correlation coefficients  $R^2$  is 0.84 ( $R^2 = 0.98$  for the class *short grass/rocks* and  $R^2 = 0.92$  for the class *bushes/high grass*).

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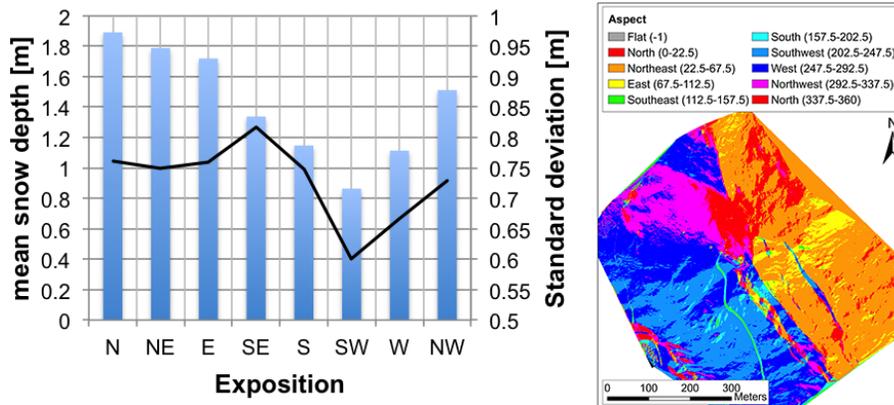


**Figure 6.** Overall HS map of the Brämabühl test site (top left panel) and close-up of the central part (top right panel). The locations of the reference plots are displayed as red circles. 3-D view of the HS draped over the hillshade of the snow-free DSM looking from north to south (bottom panel).

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**Figure 7.** Statistical evaluation of the mean HS and its standard deviation, classified by the exposition (left panel) and exposition map (right panel).

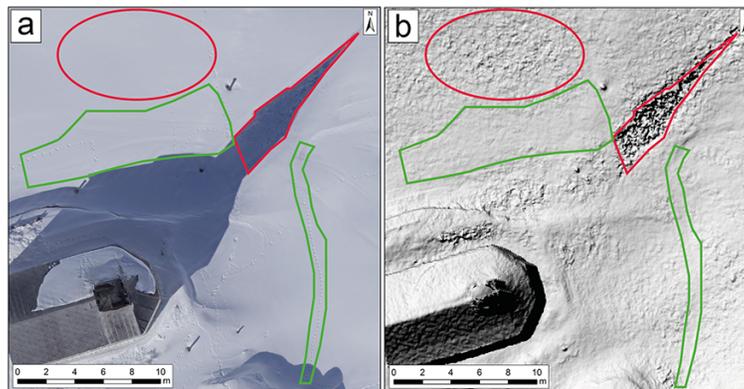
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**Figure 9.** Winter orthophoto of the area close to the chapel within the test site Tschuggen **(a)** and hillshade of the derived DSM **(b)**. Areas in red show very homogeneous snow surfaces either in cast shadow or nearly saturated areas. Areas marked in green are areas with better contrast at the snow surface due to tracks of animals or wind features.

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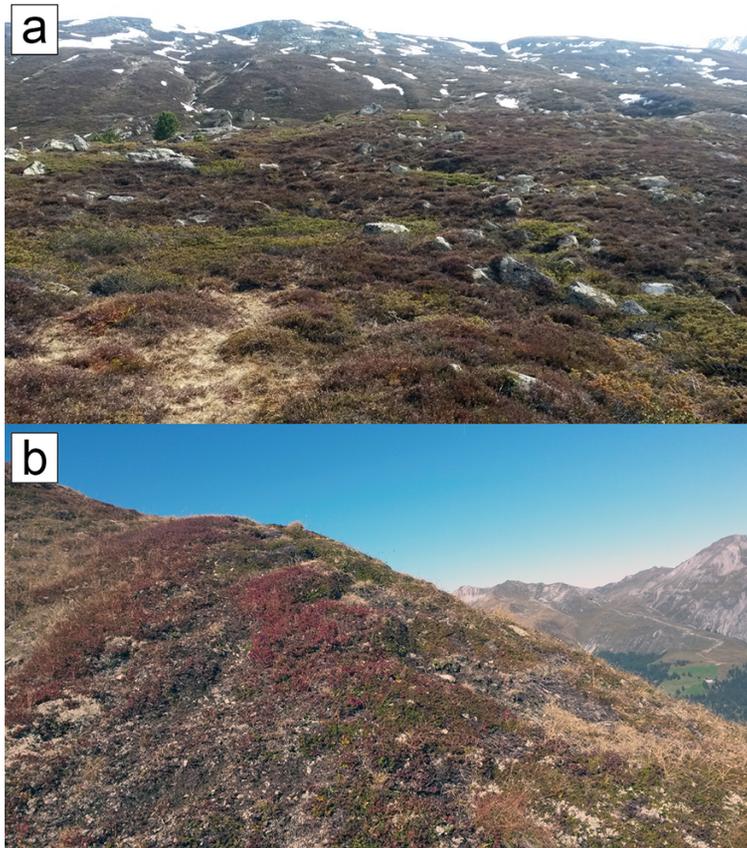
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**Figure 10.** (a) Photograph of the bushes that rise up to 0.50 m above ground and patches of low grass at the test site Tschuggen. (b) Photograph of the shallow vegetation at the test site Brämabühl with maximum elevation of approximately 0.15 m.

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