Combination of UAV and terrestrial photogrammetry to assess rapid glacier evolution and conditions of glacier hazards

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Abstract

12 Tourists and hikers visiting glaciers all year round face hazards such as the rapid formation of collapses at the terminus, typical of such a dynamically evolving environment. In this study, we analysed potential 13 14 hazards of the Forni glacier, an important geo-site located in Stelvio Park (Italian Alps), by describing 15 local surface features and evaluating the glacier melting rate. The analyses were based on point clouds and digital elevation models (DEMs) from two separate surveys of the glacier tongue carried out in 2014 16 17 and 2016 with Unmanned Aerial Vehicles (UAVs), terrestrial photogrammetry (only in 2016) and a DEM obtained in 2007 from an aerial survey. On the area covered by the 2016 survey, average glacier thinning 18 19 rates of -4.15 ma⁻¹ were found in 2007-2016, while the mean thickness change of the glacier tongue in 20 2014-2016 was -10.40±2.60 m. UAV-based DEMs were thus found to be sufficiently accurate with 21 respect to the rates of glacier down-wasting, while terrestrial photogrammetry allowed the reconstruction 22 of the glacier terminus, presenting several vertical and sub-vertical surfaces whose modelling was 23 difficult to obtain from airborne UAV images. The integration of UAV and terrestrial photogrammetry provided a detailed and accurate 3D model of the glacier tongue, which we used to identify hazard areas. 24

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26 **1 Introduction**

- The effects of climate change due to global warming are increasingly seen D igh mountain regions. In the European Alps, temperatures have increased twice the global average over the last century (Auer et al., 2007; Brunetti et al., 2009). Precipitation patterns show contrasting local trends, with an increase in the northern Alps and a decrease on the southern side (Brunetti et al., 2009), while snow cover has
- 31 reportedly decreased in the last three decades (Bocchiola and Diolaiuti, 2010; Diolaiuti et al., 2012). The

most sensitive indicators of climate change in mountain regions are glaciers and permafrost, both showing unequivocal signs of involution. In the Italian Alps, glaciers have lost at least about a third of their area since the 1950s (Smiraglia et al., 2015). A similar retreat has occurred in the Swiss Alps, where Fischer et al. (2014) report a loss of 28% since 1973, and in the French Alps, with a decrease in glacier area of 25% since the early 1970s (Gardent et al., 2014). Warming trends have also been reported at permafrost monitoring sites throughout Europe, with consequent thickening of the active layer (Harris et al., 2009).

39 my ges to glacier and permafrost environments, either by climate variations alone or in combination 40 with anthropogenic activities, have been recognized to promote land-surface instabilities, playing a 41 significant role in the generation of geomorphological hazards evolving in a downstream direction 42 (Keiler et al., 2010). In glacial and periglacial regions, the most severe hazards are generally related to 43 flooding, through the outburst of moraine- or ice-dammed lakes. Climate change has accelerated the 44 formation of glacial lakes and the expansion of new ones, increasing the risk of devastating glacial lake 45 outburst floods (GLOFs), which frequently occur in the Himalayas, Karakorum, Chilean Patagonia and 46 Peruvian Andes (Wang et al., 2015). In recent years, the formation of moraine-dammed lakes has also 47 been reported in the Swiss Alps, with growing concern of possible overtopping of moraine dams 48 provoked by ice avalanches (Gobiet et al., 2014). Outbursts of water from the englacial or subglacial 49 system are equally threatening: in the French Alps, water-filled cavities were recently identified at 50 Glacier de Tête Rousse, which experienced a deadly rupture of a water pocket in the past (Garambois et 51 al., 2016). Other recurrent hazard situations may arise from ice avalanches from hanging glaciers 52 (Vincent et al., 2015), including the complete detachment of sections of the ice body. In Italy, the partial 53 detachment and fragmentation of the Mount San Matteo serac in Stelvio Park limited spring access to 54 the Forni Glacier for skiers and mountaineers in 2005 and 2006 (Riccardi et al., 2010). More recently, Azzoni et al. (submitted) identified two types of collapse features (see fig. $\frac{1}{2}$ n the tongue of Forni 55

56 Glacier, namely normal faults and ring faults, both posing serious hazards to mountaineers. The first 57 occur mainly on the medial moraines and are due to gravitational collapse of debris-laden slopes, whereas 58 the latter develop as a series of circular or semicircular fractures with stepwise subsidence, caused by 59 englacial or subglacial meltwater creating voids at the ice-bedrock interface and eventually the collapse 60 of cavity roofs. The retreat and thinning of glaciers in the Alps, while increasing the likeliness of these 61 collapses, is also a major cause of slope instabilities in combination with permafrost thawing, uncovering 62 and debuttressing rock and debris flanks, increasing mass movement and potentially triggering landslides 63 and rock avalanches (Keiler et al., 2010).

64 **1.1 Remote sensing of glacier hazards**

65 The highly dynamic nature of high mountain environments has led to a widespread use of optical remote 66 sensing for monitoring of glacier-related hazards, with the ability to produce digital elevation models 67 (DEMs) and evaluate changes on the basis of multispectral images. DEMs are particularly useful to detect 68 glacial thickness and volume variations and to identify steep areas that are most prone to 69 geomorphodynamic changes such as mass movements (Blasone et al., 2014). Multispectral images at a 70 sufficient spatial resolution enable the recognition of most glacial- and permafrost-related hazards, 71 including glacier lakes and landslides, their geometric properties and kinematics (Kaab et al., 2005). 72 Indeed, the crucial factors for monitoring of hazard events, which might be localized in small glacial and 73 periglacial areas and evolve over short-time scales, are the revisit time of the sensor and its spatial 74 resolution. In practice, sensors with a high-frequency revisit time often have a coarse spatial resolution 75 (e.g., MODIS), while images from high-resolution optical sensors are costly and with restrictive data 76 access policies (e.g., Pleiades, Worldview). This issue mostly limits data availability to the Landsat 77 TM/OLI family of sensors and Terra ASTER with a maximum spatial resolution of 15 m. Although 78 technological improvements have been made with Sentinel-2, with greater spatial and temporal coverage 79 and finer spectral resolution, cloud cover is still a major issue affecting satellite optical sensors and

80 limiting the acquisition of information over an area of interest. In very recent years, the application of 81 imaging sensors carried by unmanned aerial vehicles (UAVs – Colomina & Molina, 2014, O'Connor et 82 al., 2017) has started to emerge in the glaciological community as a viable low-cost alternative for multi-83 temporal monitoring of small areas, effectively enabling on-demand research and bridging the gap 84 between field observations, notoriously difficult on glaciers, and coarser resolution satellite data 85 (Bhardwaj et al., 2016a).

The use of UAV-based remote sensing for glacier research started in polar environments, in small-scale studies of cryoconite holes (Hodson et al., 2007), and melt ponds (Inoue et al., 2008). During the last decade, UAV photogrammetry (Remondino et al., 2011) has been slowly gaining pace as a tool for the generation of high-resolution DEMs (see, e.g., Rippin et al., 2015). Few studies however have explored the potential of UAVs in high mountain environments, likely due to the following issues:

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- 92 The reduced operating autonomy due to the limited battery support combined with the effects of 93 lower air pressure and temperature;
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 2. The complexity of mountainous terrain, which may make it difficult to find suitable take-off and
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 landing sites; and
- 96 3. Potential Problems in the visibility of GNSS (Global Navigation Satellite System) satellites,
 97 which can hamper UAV navigation (Bhardwaj et al., 2016a) and may introduce errors in geo98 referencing (Santise, 2016).

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100 Notable exceptions include the works of Immerzeel et al. (2014), who generated a high-resolution 101 orthophoto and DEM to study the dynamics of Lirung Glacier (Nepalese Himalaya) and of Fugazza et 102 al. (2015) in their study of an Alpine glacier. The latter authors produced an orthophoto from a UAV 103 survey and mapped small- and large-scale supraglacial features of the Forni Glacier (Italian Alps),

including debris cover, crevasses, en placial lakes and the medial moraines, via object-based image 104 105 analysis (Blaschke, 2010). In Dell'Asta et al. (2017), multiple orthophotos and DEMs were created from 106 UAV data captured over the Gran Sometta rock glacier (Italian Alps); a semi-global matching technique 107 for comparing time-series of both types of raster data was developed in order to detect the surface 108 displacement field. Another technique that has been shown to provide sufficiently accurate point clouds 109 for studying glacier surfaces is terrestrial photogrammetry, although a necessary requirement in this case 110 is that the region of interest must completely observed from ground stations (see, e.g., Piermattei et al., 111 2015; 2016). An overview of state-of-the-art terrestrial photogrammetry for application in geosciences 112 can be found in James & Robson (2012), Westoby et al. (2012), Smith et al. (2015), and Eltner et al. 113 (2016).

In spite of these progresses, an intercomparison of UAV and terrestrial photogrammetry accuracy evaluation of point clouds is still lacking in glacial environments. While Gindraux et al. (2016) estimated the optimal density of GCPs collected with GNSS sensors to produce accurate DEMs from UAV surveys, comparison against consolidated surveying techniques such as LiDAR (Bhardwaj et al., 2016b) and theodolite measurements is still missing over glaciers.

119 In this study, we focused on a rapidly evolving, hazard-prone glacier in a protected area of the Italian 120 Alps. We compared different platforms and techniques for point cloud, DEM and orthomosaic generation: UAV photogrammetry from two distinct aircraft), terrestrial (or close-range) 121 photogrammetry (Luhmann 2014) and terrestrial laser scanning (TLS - Vosselman & Maas, 2010), 122 h the aim of: (1) evaluating the accuracy of UAV- and terrestrial photogrammetric products; (2) 123 investigating ice thickness changes on both long and short-time scales; (3) identifying glacier-related 124 hazards, plarly the ones representing acute hazardous phenomena posing risk for mountaineers 125 126 visiting the glacier during summer.

127 **1.2 Study Area**

The Forni Glacier (see Fig. 1a, b), in the Ortles-Cevedale group, was the largest Italian valley glacier (B) 129 (Smiraglia et al., 2015) until 2015, when the easternmost part of its three ice tongues separated from its 130 accumulation basin. The latest Italian Glacier Inventory (based on 2007 data, i.e., before the separation), reported the total glacier area as 11.34 km² (Smiraglia et al., 2015), an altitudinal range between 2501 131 132 and 3673 m a.s.l. and a North-North-Westerly aspect. The glacier has retreated markedly since the little ice age (LIA), when its area was 17.80 km² (Diolaiuti & Smiraglia, 2010), with an acceleration of the 133 134 retreating trend in the last three decades (Diolaiuti et al, 2012, D'Agata et al; 2014), It gained scientific 135 importance in 2005, when it was chosen as the site of the first Italian supraglacial automatic weather 136 station (AWS1 Forni, see Citterio et al; 2007), included in the SPICE (Solid Precipitation Inter 137 Comparison Experiment) and CryoNet networks of the WMO (World Meteorological Organization). 138 Recent research on this glacier mainly focused on the modeling of the albedo and debris cover via 139 terrestrial photography (Azzoni et al., 2016), satellite remote sensing (Fugazza et al., 2016), and a UAV survey (Fugazza et al., 2015). Beside its scientific relevance, the main reasons behind the choice of this P 141 glacier as a study area are:

The significant retreat of the glacier since the LIA, which sets it as an example of the evolution
 of valley glaciers in the Alps;

144 E The profound changes in glacier dynamics that have taken place in recent years, including the 145 loss of ice flow from the eastern accumulation basin towards its tongue and the evidence of 146 collapsing areas on the eastern tongue (Azzoni et al., submitted). One such area, hosting a large 147 ring fault (see Fig. 2d) prompted an investigation carried out with Ground Penetrating Radar 148 (GPR) in October 2015, but little evidence of a meltwater pocket was found under the ice surface 149 (Fioletti et al., 2016). Since then, a new ring fault appeared on the central tongue, and the terminus 150 underwent substantial collapse (see Fig. 2a,b,c,e); 151 3.—The touristic and mountaineering importance of the site (Garavaglia et al., 2012). In fact, the 152 glacier is included in the list of geosites of Lombardy region (see Diolaiuti and Smiraglia, 2010) 153 and it is located in Stelvio Park, one of Italy's major protected areas. The glacier is frequently 154 visited during both winter and summer months, often by inexperienced hikers unaware of the 155 hazards posed by crevasses and collapsing areas.

156 2 Data Sources: acquisition and processing

157 **2.1 2016 surveys**

158 At the end of August 2016, a data acquisition campaign was carried out with the specific aim of 159 reconstructing the glacier tongue of the Forni Glacier. Multiple techniques were adopted and integrated, 160 to evaluate the performances of different approaches and establish a methodology for future repeat 161 surveys. A UAV-photogrammetric survey with a quadcopter (see Sec. 2.1.1) was conducted to provide 162 a DEM of the glacier surface, to be compared with other DEMs dating back to 2007 and 2014. A 163 photogrammetric survey carried out from ground stations (Sec. 2.1.2) was specifically aimed at 164 reconstructing the glacier terminus. In order to assess the quality of the photogrammetric point clouds, a 165 terrestrial laser scanning (TLS) survey of the same area was concurrently conducted (Sec. 2.1.3). In addition, a set of ground control points (GCPs) was measured with GNSS equipment in order to register 166 167 all the previous point clouds into the mapping frame (Sec. 2.1.4).

168 **2.1.1 UAV Photogrammetry**

The UAV survey took place on two separate days, on 30th August and 1st September 2016, during the central hours of the day, as weather conditions on the glacier were rather unstable (rain, excessive cloud cover) and did not allow morning operation or surveying the glacier on consecutive days. Both surveys were carried out under low cloud cover to avoid direct solar radiation on the glacier surface while preserving diffuse illumination conditions (Pepe et al., 2017, submitted). The UAV employed in this

174 survey was a customized quadcopter (see Fig. Table 1) carrying a Canon Powershot 16 Megapixel Ð digital camera. During experiments prior to the flights on the glacier tongue, it was noticed that the 176 quadcopter drew a significant amount of power for vertical ascension and that it was overly sensitive to 177 vibrations during flight, potentially exposing pictures to motion blur. To deal with the first issue, two 178 different sites were chosen for taking-off and landing. Both places, at elevations above the glacier surface, 179 permitted to gain altitude before take-off and maintain line-of-sight operation with flights at low relative 180 altitude of 50 m, which ensured an average ground sample distance (GSD) of 5.7 cm. The first take-off 181 site was on the eastern lateral moraine (elevation approx. 2700 m a.s.l.), while the second site was a rock 182 outcrop on the hydrographic left flank of the glacier (see Fig. 1b) at an elevation of approx. 2750 m a.s.l. 183 To reduce motion blur, camera shutter speed was set to the lowest possible setting, 1/2000 s, with aperture 184 at F/2.7 and sensitivity at 200 ISO.

Several individual parallel flights were conducted to cover a small section of the proglacial plain and different surface types on the glacier surface, including the terminus, a collapsed area on the central tongue, the eastern medial moraine and some debris-covered parts of the eastern tongue. A 'zig-zag' flying scheme was followed to reduce the flight time. The UAV was flown in autopilot mode using the open-source software Mission Planner (Oborne, 2013) to ensure 70% along-strip overlap and sidelap. In total, two flights were performed during the first survey and three during the second, lasting about 20 minutes each. The surveyed area spanned over 0.59 km².

Processing of data from the 2016 UAV flight was carried out using Agisoft Photoscan version 1.2.4 (www.agisoft.com), implementing a Structure-from-Motion (SfM) algorithm for image orientation (see Barazz et al., 2011) followed by a multi-view dense-matching approach for surface reconstruction (Remoment) et al., 2014). The availability of GNSS navigation data was exploited to start the SfM procedure, shortening the time necessary to register the 288 images acquired by the quadcopter. No pre197 calibration was applied, since the block configuration including strips flown along different directions 198 was optimal for the estimation of camera calibration parameters (Zhang et al., 2017). A total number of 199 38,506 tie points (TPs) were extracted for image orientation, corresponding to an average number of 892 200 TPs per image (see Table 2). The large average number of rays per each TP (6.7) combined with the huge 201 number of TPs offered a sufficient inner reliability for an effective outlier rejection procedure, which is 202 applied during bundle adjustment (Kraus, 1997; Luhmann et al., 2014) in Agisoft Photoscan. This 203 package implements a standard photogrammetric bundle adjustment where GCPs are used as regular 204 weighted observations, unlike most software packages including SfM algorithms where GCPs are only 205 used for estimating a 3D rigid-body transformation for geo-referencing the final point cloud. Eight GCPs 206 (see Fig. 4 and Sec. 2.1.4) were measured for the registration of the photogrammetric blocks and its by-207 products into the mapping frame. The root mean square error (RMSE) of the GCPs was 40.5 cm, which 208 can be used as an indicator of accuracy for the geo-referencing of the photogrammetric block (see Table 209 2).

The point cloud obtained from the 2016 UAV flight was interpolated produce a grid DEM (see Immerzeel et al., 2014), with a cell resolution of 60 x 60 cm. While the high global point density of the point cloud (89 points/m²) could have permitted a higher spatial resolution, the DEM would have to be subsampled when computing the differences with other grids. This spatial resolution was considered sufficient for the analysis of volumetric changes. An orthoimage was also generated from UAV oriented images and the DEM, with a resolution of 15 cm. Both the DEM and the orthoimage were exported in the ITRS2000 / UTM 32N mapping coordinate frame.

217 **2.1.2 Terrestrial photogrammetry**

A terrestrial photogrammetric survey was carried out during the 2016 campaign to reconstruct the topographic surface of the glacier terminus, which presented several vertical and sub-vertical surfaces whose measurement was not possible from the UAV platform in nadir configuration (see Fig. 2e).

221 Images were captured from 134 ground-based stations. Most camera stations were located in front of the 222 glacier, and some on both flanks of the valley in the downstream area, as shown in Fig. 5a. A single-lens-223 reflex Nikon D700 camera was used, equipped with a 50 mm lens, a full-frame CMOS sensor (36x24 mm) composed by 4256x2823 pixels pluting in a square pixel size of 8.4 µm. This photogrammetric 224 225 block was processed using Agisoft Photoscan version 1.2.4, following a similar pipeline as described in 226 Sec. 2.1.1. In this case, no preliminary information about approximate camera stations was necessary, 227 neither pre-calibration. In such a case, when the photogrammetric block has a sparse geometry (i.e., 228 images have not been collected along ordered sequences) and no approximate orientation parameters 229 (e.g., camera station from GNSS navigation, as in UAV-photogrammetry) are available, the SfM 230 procedure is applied first on a block of images at down-sampled resolution. This process may provide 231 approximate orientation, limiting the search space for corresponding points in the final SfM, which is 232 applied to full resolution images (Barazzetti et al., 2010).

233 The geometric configuration of the photogrammetric block of the glacier terminus, including hyper-234 redundant convergent images as well as 90° rolled images, was optimal for the estimation of camera 235 calibration parameters. Seven natural features visible on the glacier front were used as GCPs to be 236 included in the bundle adjustment computation in Agisoft Photoscan. Measurement of GCPs in the field 237 was carried out by means of a high-precision theodolite. The measurement of points previously recorded 238 with a GNSS geodetic receiver (see Sec. 2.1.4) allowed to register the coordinates of GCPs in the 239 mapping frame. The RMSE of 3D residual vectors on GCPs was 34.4 cm, which can be considered as 240 the accuracy of absolute geo-referencing. A very high number (59,157) of tie points (TPs) was found on 241 the images after SfM (see Table 2). In addition, the large mean number of rays per each TP (5.6) resulted 242 in a high reliability of the observations, which mitigates the risk of undetected errors. The final point 243 cloud obtained from the dense matching tool implemented in Agisoft Photoscan covers at a very high 244 spatial resolution the full glacier terminus, with the exception of a few obstructed parts (see Fig. 5b). 245 This part of the Forni glacier has a very complex shape, which evolves at a high dynamic rate. Thus, 246 rather than a quantitative evaluation of the ice bulk, here the main purpose of 3D reconstruction is to 247 allow the morphological analysis of the ice structures and the fracturing and collapsing processes. One 248 working day and two people were required for accomplishing the photogrammetric data acquisition, 249 including operations for measuring GCP coordinates.

250 2.1.3 Terrestrial Laser Scanning

251 A long-range terrestrial laser scanner Riegl LMS-Z420i was used to scan the glacier terminus frontally. This instrument works on Time-of-FQDt mode (www.riegl.com). One instrumental standpoint located 252 on the hydrographic right flanks of the glacier terminus was establish [] Issues related to meteorological 253 254 conditions and to the limited access to unstable areas close to the glacier terminus prevented the operation 255 from a second station on the other flank of the valley. This solution would have resulted in reducing the obstructed areas, as it is usually planned in TLS surveys (see Giussani & Scaioni, 2021). The horizontal 256 257 and vertical scanning resolution were set up to provide a spatial point density of approx. 5 cm on the ice 258 surface at the terminus. Geo-referencing was accomplished by placing five GCPs consisting in cylinders 259 covered by retroreflective paper (see Scaioni et al., 2004). The coordinates of GCPs were measured by 260 using a precision theodolite following the same procedure adopted for terrestrial photogrammetry. 261 Considering the accuracy of registration and the expected precision of laser point measurement, the global accuracy of 3D points was estimated in the order of ± 7.5 cm. Tl \bigcirc ompletion of the TLS survey 262 263 required half working day, including the time necessary for GCP measurements. A team of four to five 264 people was required for the transportation of the instruments (laser scanner, theodolite, at least two
265 topographic tripods and poles, electric generator and ancillary accessories).

266 **2.1.4 GNSS ground control points**

267 Fore the 2016 surveys, eight control targets were placed both outside the glacier and on the glacier tongue (see Fig. 4). Differential GNSS data were acquired at their location for the purpose of accurate 268 269 geo-referencing of UAV, terrestrial photogrammetry and TLS data. While for geo-referencing of UAV 270 data the GCPs were directly visible on the quadcopter images, for terrestrial photogrammetry and TLS 271 they were adopted for the registration of theodolite measurements (for practical details about standard 272 surveying operations see Schofield & Breach, 2007). The targets consisted in a piece of white fabric 80 273 x 80 cm wide, with a circular marker in red paint chosen to provide contrast against the background. 274 Such GCPs were positioned on stable glacier areas or flat boulders (see Fig. 6).

GNSS data were acquired by means of a pair of Leica Geosystems 1200 geodetic receivers working 275 276 in RTK (Real-Time Kinematics) mode, see Hoffman-Wellenhof (2008). One of them was set up as 277 master on a boulder beside Branca Hut, where a monument had been established to be used as reference 278 point for GNSS surveys in the Forni Glacier region. The coordinates of this point were already known in 279 the geodetic/mapping reference frame ITRS2000 / UTM 32N and were used for geo-referencing all other 280 points measured with GNSS. The second receiver was used as a rover, communicating via radio link 281 with the master station. The maximum distance between master and rover was less than 1.5 km, but the 282 local topography prevented broadcasting the differential corrections in a few zones of the glacier. 283 Unfortunately, no mobile phone services were available and consequently the internet network could not 284 be accessed, precluding the use of the regional GNSS real-time positioning service. The theoretical 285 accuracy of GCPs was estimated in the order of 2-3 cm.

286 **2.2 2014 UAV photogrammetric survey**

The first UAV survey conducted over the tongue of Forni Glacier took place on 28th August 2014, using 287 a SwingletCam fixed wing aircraft (see Fig. 3 Chis commercial platform developed by SenseFly, with 288 289 basic technical features reported in Table 1, carries a Canon Ixus 127 HS compact digital camera. The 290 UAV was flown in autopilot mode with a relative flying height of approximately 380 m above the average 291 glacier surface, which resulted in an average GSD of 11.9 cm. The flight plan was organized by using 292 the proprietary software eMotion, by which the aircraft follows predefined waypoints with a nominal 293 along-strip overlap of 70%; sidelap was not regular because of the varying surface topography, but ranged around 60%. Flight operations started at 07:44 AM and ended at 08:22 AM. Early morning operations \bigcirc 295 were preferred as during this time of day the glacier is not yet directly illuminated by the sun, thus diffuse 296 illumination predominates over the glacier surface, and wind speed is at its lowest (Fugazza et al., 2015). Bese conditions are therefore optimal to avoid saturating the camera pictures due to the high reflectivity 297 of ice surfaces as well as to minimize blurring effects due to the UAV motion. In addition, the presence P^{\$} 299 of tourists on the glacier is reduced during this time of the day. Pictures were automatically captured by 300 the UAV platform, selecting the best combination of sensor aperture (F=2.7), sensitivity (between 100 301 and 400 ISO) and shutter speed (between 1/125 s and 1/640 s).

Compared to multi-rotor platforms, fixed wing aircraft are capable of longer flight time on glaciers, due to their simple structure and the ability to exploit aerodynamics to take advantage of gliding and reduce battery consumption (Bhardwaj et al., 2016a). This allowed covering an area of 2.21 km² in just two flight campaigns, with a low altitude take-off (lake Rosole, close to Branca Hut, see Fig. 1b). Both the terminal parts of the central and eastern ablation tongue were surveyed. The considerable difference in area covered during the 2014 and 2016 surveys is due to the reduced battery life of the quadcopter and lower flying height throughout the 2016 survey. Processing of data from the 2014 UAV flight was carried out using Agisoft Photoscan version 1.2.4 in a similar approach to the one applied for UAV-photogrammetry data collected in 2016. Since no GCPs were measured during the 2014 campaign, the registration of this data set into the mapping frame was based on GNSS navigation data only. Consequently, a global bias in the order of 1.5-2 m resulted after geo-referencing, and no control on the intrinsic geometric block stability could be possible. After the generation of the point cloud, a DEM and orthoimage were produced following the methods outlined in Sec. 2.1.1, with the same spatial resolutions of final products of 60 cm and 15 cm, respectively.

316 **2.3 2007 DEM**

317 The 2007 TerraItaly DEM was produced by BLOM C.G.R (Compagnia Generale Riprese Aeree) for 318 Lombardy region. It is the final product of an aerial survey over the entire region, that was conducted 319 with a multispectral pushbroom Leica ADS40 sensor acquiring images from a flying height of 6,300 m 320 with an average GSD of 65 cm. The images were processed to generate a DEM with a cell resolution of 321 2 m x 2 m, and projected in the former national 'Gauss Boaga - Fuso I' coordinate system based on the 322 Monte Mario datum (Mugnier, 2005). Heights were converted from ellipsoidal to geodetic using the 323 official software for datum transformation in Italy (Verto ver. 3), which is distributed by the Italian 324 Geographic Military Institute (IGMI). The final vertical accuracy reported by BLOM C.G.R. is ± 3 m. 325 The only processing step performed within this study was the datum conversion to ITRS2000, using a 326 seven-parameter similarity transformation based on a local parameter set provided by IGMI.

327 **2.4 DEM co-registration**

Several studies have found that errors in individual DEMs, both in the horizontal and vertical domain, propagate when calculating their difference leading to inaccurate estimations of thickness and volume change (Berthier et al., 2007; Nuth & Kaab, 2011). In the present study, different approaches were adopted for geo-referencing all the DEMs (2007, 2014, 2016) used in the analysis of the volume change

of the Forni Glacier tongue. The 2007 DEM was extracted from a regional data set, which required a ¶ € 333 transformation from the old datum 'Gauss-Boaga - Fuso I' to the present datum ITRS2000/UTM 32 N. 334 This transformation has an absolute positional accuracy at cartographic level in the order of 1-2 m, 335 depending on the zone. The DEM obtained from 2014 UAV campaign was geo-referenced on the basis 336 of onboard GNSS navigation data, with an accuracy with respect to the above mentioned mapping datum 337 in the order of 1.5-2 m. On the other hand, the most recent DEM derived from the UAV flight (2016) 338 was geo-referenced using a set of GCPs measured with geodetic-grade GNSS receivers. The average 3D 339 residuals of these GCPs, which is in the order of 40.5 cm, can provide an estimate of the global geo-340 referencing accuracy of the 2016 data set.

341 To compute the relative differences between the DEMs, a preliminary co-registration was therefore 342 required. The method proposed by Berthier et al. (2007) for the co-registration of two DEMS was 343 separately applied to each DEM pair (2007-2014; 2007-2016; 2014-2016). Following this method, in 344 each pair one DEM plays as reference ('master'), while the other is used as 'slave' DEM to be iteratively 345 shifted along x and y directions by fractions of pixel to minimize the standard deviation of elevation 346 differences with respect to the 'master' DEM. Only areas assumed to be stable are considered in the 347 calculation of the co-registration shift. The ice-covered areas were excluded by overlaying the glacier 348 outlines from D'Agata et al. (2014) for 2007 and Fugazza et al. (2015) for 2014. The oldest DEM, which 349 is also the widest in each comparison, was always set as the master. To co-register the 2014 and 2016 350 DEMs with the 2007 DEM, both were resampled to 2 m spatial resolution, whereas the comparison 351 between 2014 and 2016 was carried out at the original resolution of these data sets (60 cm).

All points resulting in elevation differences larger than 15 m were labelled as unreliable, and consequently discarded from the subsequent analysis. Such larger discrepancies may denote errors in one of the DEMs or unstable areas outside the glacier. Values exceeding this threshold however were only found in a marginal area with low image overlap in the comparison between the 2014 and 2016 DEMs, with a maximum elevation difference of 36 m. Once the final co-registration shifts were computed (see Table 3), the coefficients were subtracted from the top left coordinates of the 'slave' DEM; the residual mean elevation difference was also subtracted from the 'slave' DEM to bring the mean to zero.

359 **3 Results**

360 **3.1 Comparison between observ** is from 2016: UAV/terrestrial photogrammetry and TLS 361 The comparison between a sets plected during the 2016 campaign had the aim of assessing the 362 quality of different data sources to be used for subsequent physical analyses. In addition, these 363 evaluations were expected to provide some guidelines for the organization of future investigations in the 364 field at the Forni Glacier and in other Alpine sites.

365 Specifically, in this case the analysis consists in comparing point clouds. It is out of the scope of this 366 article to address this topic in an exhaustive manner. While the reader may refer to other pieces of literature to have a broader view about it (e.g., Eltner et al., 2016), me the aim is to apply some existing 367 criteria an metrics to find out which techniques among UAV photogrammetry (i), terrestrial 368 369 photogrammetry (ii), and TLS (iii) should be privileged for glaciological studies under certain conditions. 370 Of course, comparing two point clouds, which is the simplest case that may be considered, is more 371 complex than comparing coordinates of specific points that have been measured, e.g., with theodolites, GNSS sensors or target-based photogrammetry (Luhmann et al., 2014). In such a case, the analysis is \bigcirc 373 limited to evaluating their discrepancies by merely differencing corresponding coordinates, provided that 374 the points to compare are defined into the same reference frame. The maximum degree of complexity in 375 the case of specific point comparison is to define the minimum departure revealing statistical significance 376 (Teunissen, 2009). In the case of point clouds, no precise point-to-point correspondence generally exists, 377 since 3D points are obtained using different techniques, setups and algorithms. In addition, not only the

'distance' between point clouds should be assessed to check out their spatial accuracy, but other (D) 379 properties need to be considered as well. In particular, point density and completeness of a point cloud 380 are two important aspects that in general do not deserve consideration when dealing with specific points. 381 Thus a first important property to analyse is the point density, which allows verifying whether the whole 382 reconstructed surface may be modelled with sufficient detail on the basis of the surveyed point cloud. Of 383 course, the same point density may be fine for a certain kind of geomorphometry, whilst it may not be 384 sufficient for others, mainly depending on roughness. Secondly, the completeness of a reconstruction 385 indicates if the surface reconstruction presents some holes or missing parts, for example because of 386 occlusions, sensor out-of-range areas, low-texture or low-reflectivity surfaces, and the like. Eventually, 387 the accuracy of a point cloud should be assessed by comparison with a reference surface or with a set of 388 precise points. Different criteria exist for evaluating the spatial 'distance' between two point clouds (see 389 Lindenbergh and Pietrzyk, 2015; Scaioni et al., 2015), depending on the surface morphology, as 390 described at paragraph 3.1.2.

In order to analyse point density completeness and accuracy of point clouds obtained during 2016 campaign by means of techniques (i), (ii) and (iii), five regions shown in Fig. 7 were selected. These regions are mainly located on the glacier and characterized by different geomorphological proties. In addition, they were surveyed by almost all the three techniques. The analysis of local regions was preferred to the analysis of the entire point clouds for two reasons: (1) the partial overlap between point clouds obtained from different methods; (2) the opportunity to investigate the performances of the techniques in diverse geomorphological situations.

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399	1.	Glacial cavity located on the right orographic side of the glacier terminus, composed by sub-
400		vertical and fractured surfaces over 20 m high, and forming a typical semi-circular shape (clearly
401		visible from the top);
402	2.	Glacial cavity located on the left orographic side of the glacier terminus. It is over 10 m high with
403		the typical semi-circular shape as window 1; on top, it is covered by fine- and medium-size rock
404		debris;
405	3.	Vertical fault on the left orographic flank of the glacier terminus, over10 m high;
406	4.	Highly-collapsed area on the central region of the glacier terminus, covered by fine- and medium-
407		size rock debris and rock boulders; and
408	5.	Planar surface with a vertical fault on the left orographic side of the glacier terminus, covered by
409		fine- and medium-size rock debris and rock boulders.
410	Table	4 reports the sipple window as well as the number of points obtained with different
411	techni	ques. In window 1, method (i) could not provide points except on the upper part, because of the
4 <u>12</u>	presei	nce of sub-vertical cliffs that could not be reconstructed from airborne images. Window 5 was not
P	cover	ed by TLS (iii), because it was not included in the field-of-view of the selected standpoint. Looking
414	at the	point number in each window, at a first glance terrestrial photogrammetry resulted in a much
415	consis	tent data set than other techniques. This is mostly motivated by the flexibility of this methodology,
416	which	allows carrying out data acquisition from multiple stations, depending only on the terrain
417	access	sibility in front of the glacier.

418 **3.1.1 Point density and completeness**

419 Point density describes the number of points per unit of surface or volume. Depending on the adopted 420 surveying techniques, it always depends upon the distance between sensor and surface and the adopted 421 spatial resolution. While in the UAV-photogrammetry survey the distance camera-object is almost 422 constant (approx. 180 m) in all sample windows, in the case of terrestrial sensors (TLS &
423 photogrammetry) this distance is greater and therefore it can influence the point cloud reconstruction. In
424 the terrestrial photogrammetry survey, the distances between camera stations and the sample windows
425 ranged from 85 m (window 2) to 137 m (windows 1, 3 and 4), and 206 m (window 5).

In the case of photogrammetry the point cloud reconstruction relies on dense matching, thus the resultingpoint density also depends upon the surface texture.

The evaluation of point density using a global descriptor that is applied to the whole point cloud or on large portions of it cannot provide a useful output in the case of glaciers with complex morphology, since point density may largely change from one portion of surface to another. More significant is the use of local descriptors applied on small windows or in the proximity of each point. Local results can be displayed on maps and summarized by global statistics.

433 I high is study, the number of neighbours N (inside a sphere of radius R=1 meter) divided by the 434 neighbourhood surface was used to evaluate the local point density D:

$$435 \qquad D = \frac{N}{\pi * R^2} \tag{1}$$

436 This function is implemented in the open-source software CloudCompare (www.cloudcompare.org).

Point cloud completeness refers to the presence of enough points to completely describe a portion of surface. A rigorous evaluation of this parameter is possible by interpolating a regular surface and by searching for the presence of points in any sectors of it. Of course, this approach can be easily applied when the morphology of the surface to reconstruct is regular, for example in the analysis of terrain topography. On the other hand, in the case of an Alpine glacier terminus, the geometry is much more complex, and the recourse to this approach is more difficult. Consequently, in this study a heuristic evaluation based on the visual inspection of the obtained windows was preferred.

Mean values and standard deviations of point density in the five windows are shown in Table 5 and $Fi \bigcirc$ 444 8. Thorefollowing general considerations can be made. The values of point density obtained from 445 446 terrestrial photogrammetry (ii) are much higher than others, except in window 5 that features a gentle 447 slope. In such a case, UAV photogrammetry provided results comparable to the ones of terrestrial 448 photogrammetry (only approximately three times smaller). On the other hand, the mean point density 449 achieved when using technique (ii) has a large variability both between different windows, and inside 450 each window as witnessed by the standard deviations of D. Point densities related to UAV photogrammetry (i 2 d TLS (iii) are more regular and constant. In case (i), the regularity is due to the 451 452 structure of the airborne photogrammetric block, which is made up of organized parallel strips looking 453 in nadir direction towards the ground. In case (iii), the regularity is motivated by the constant angular 454 resolution adopted during scanning. In general, each sensor performs better when the surface is 455 orthogonal to the average sensor looking direction. Mainly, this means that terrestrial techniques (ii) and 456 (iii) perform better in vertical and sub-vertical cliffs (windows 1 and 2), and in high-sloped surfaces 457 (windows 3 and 4); on the contrary, UAV photogrammetry provided the best results in the case of window 5 that is less inclined and consequently could be well depicted in nadir photos. \bigcirc 458

In point density obtained with different techniques in the sample 459 460 windows may suffice for a correct representation of the glacier outer surfaces and the surrounding terrain. 461 In order to understand the effect of point density dispersion, the standard deviations were considered. 462 Since the normal distribution of the data sets made up of point density computed inside each sample 463 window cannot be proved, an approach based on the use of Chebichev theorem was applied (see 464 Teunissen, 2009). Based on this theorem, given a population of N members with mean μ and standard 465 deviation σ , the minimum frequency of the elements comprehended in the interval $\mu \pm 2\sigma$ is 75%. This 466 means that in both queues, 25% of the population can be found. Since the inferior part of the population of point density may be too low to guarantee a detailed modelling of the surface, the upper limitcorresponding to the inferior 12.5% percentile was computed and reported in Table 5.

Based on the mere analysis of point density, terrestrial photogrammetry outperformed other techniques. DP In windows 1-4, mean values of this parameter ranged between 1384-2297 points/m², which are 470 471 equivalent to a range between approximately 14-23 points/dm². A lower point density was obtained in window 5 that is exposed upwards, with approximately 500 points/m². Looking at the limit of the inferior 472 12.5% percentile, three windows (1-3) show a very high value between 766-880 points/m², while in 473 window 5 a value of 31 points/m² was obtained. All these values were retained sufficient for the 474 reconstruction of different surfaces in the sample windows, according to their different geomorphic 475 476 complexity, except in the case of window 5.

 $I_{\mathcal{P}}$ e case of UAV photogrammetry (i), similar results about point density were found in all sample 477 windows, especially for the standard deviations that were always in the range 22-29 points/m². Mean 478 values were between 103-109 points/m² in windows 2-4, while they were higher in window 5 (141 479 480 points/m²). Due to the nadir acquisition points, the reconstruction of vertical/sub-vertical cliffs in window 481 1 was not possible. The limit of the inferior 12.5% percentile was between 49-62 points/m² because of sub-vertical orientation of this sample window. A higher value (97 points/ m^2) was found in the case of 482 483 window 5. Results obtained from photogrammetry based on terrestrial and UAV platforms may be retained quite complementary: the former are suitable for the reconstruction of vertically oriented 484 485 regions, the latter for those surfaces looking upwards.

486 M \bigcirc varying results were obtained from the use of TLS. With the only exception of window 5, where 487 no sufficient data were recorded due to the position of this region with respect to the instrumental 488 standpoint, a mean value of point density ranging from 141-391 points/m² could be found. Standard 489 deviations ranged between 69-217 points/m², moderately correlated with respective mean values. On the 490 other hand, in correspondence of the inferior 12.5% percentile, too low values were found (0-29 491 points/m²). These results showed that the adopted long-range TLS instrument was not completely 492 suitable for surveying the glacier terminus.

In Fig Ω and 10, the maps of point density in windows 2 and 3 are shown, respectively. These windows depict some typical problems related to the completeness of surface reconstruction that may be obtained from the adopted techniques. UAV photogrammetry can provide a sufficient point density in all parts of those regions that are exposed upwards, as can be seen also in the global model of the glacier shown in Fig Ω . Results are also satisfyin Ω gently sloped areas, as it can be observed in windows 2 and 3, se Fig. 9 and 10. Vertical and sub-vertical surfaces cannot be investigated, requiring the integration with a terrestrial Ω sor or the installation of the payload camera in oblique configuration.

Textrial photogrammetry offers the chance to gather images from several positions. This results in reducing the effect of occlusions with a consequently more complete reconstruction. On the other hand, this technique is limited when the surface to reconstruct is close to the horizontal orientation. In such a case, the integration with UAV data is required.

504 Deneral, TLS suffers from occlusions as all 3D measurement techniques (see for example results in 505 window 2 in Fig. 9). Besides, these instruments are still quite complex to be carried and setup. These 506 limits prevent the acquisition from several viewpoints as it is possible when using photogrammetry. Data 507 acquisition is also difficult in regions that are close to be parallel to the laser beams and in the presence 508 of wet surfaces. Another problem with the adopted TLS concerned the angular resolution adopted for 509 scanning, which was set up to obtain a linear resolution on the ground surface of approximately 1 point 510 every 5 cm, while keeping the acquisition time at about 40 minutes. Using a smaller angular resolution 511 would have resulted in much longer acquisition time (for example, using half resolution could be possible 512 in four times the acquisition time). On the other hand, the adopted laser scanner instrument still has a slow acquisition speed (approx. 12 kHz) if compared with up-to-date Time-of-Flight lasers which may
work much faster (over 100 kHz).

515 Finally, internal parts of fractures and faults are usually problematic to reconstruct by means of all 516 measurement techniques. However, their presence can be easily detected in the point clouds.

517 **3.1.2 Accuracy**

The evaluation of the accuracy of a point cloud requires a data set of benchmarking observations. When P 519 the geometry of an object is known a priori (for example a planar surface), the accuracy can be evaluated 520 by comparing the point cloud to the mathematical model of the surface itself. On the other hand, in the 521 case of terrain or glacier geomorphology, this solution is clearly not viable. In such a case, benchmarking data are required, for example, another reference point cloud or a set of specific points (see Eltner et al., 522 2016). Due to the fast dynamics of the glacier tongue under investigation, the only available data sets to 523 524 compare are the ones collected during the 2016 campaign, i.e., point clouds derived from UAV and 525 terrestrial photogrammetry, and from TLS. The approach applied to estimate the accuracy was to 526 compare in a pairwise manner the point clouds obtained from different surveying techniques. The analysis was carried out inside the same five on phile windows used for investigating the point cloud 527 528 density. Although each point cloud had been already geo-referenced as described in Section 2, some 529 residual errors could be expected. In order to get rid of these discrepancies that would affect both surfaces to compare, a preliminary co-registration using the ICP algorith (Pomerleau et al., 2016) was 530 531 conducted. Secondly, point clouds in corresponding sample windows were compared using M3C2 532 algorithm implemented in CloudCompare (Lague et al., 2013). The advantage of this algorithm is that it 533 is able to provide a map of signed distances between corresponding and co-registered point clouds. The positive direction of distances goes outside the 'reference' point close. Therefore, when a computed 534 535 M3C2 distance is positive, the compared ('slave') point cloud lies outside with respect to the reference 536 point cloud. Unlike standard algorithm for comparing DEMs that operate along a predefined direction 537 (see, e.g., Scaioni et al., 2013), here the direction of distance depends on the local normal to the point 538 cloud. This method is therefore suitable to compare complex point clouds such as the ones in the sample 539 windows. The point cloud collected using TLS was used as reference, since these measurement sets were 540 retained to be the most accurate, although their point density and completeness may not be the best ones as proved in the previous $\sec \overline{\mathbf{v}}$. When comparing both photogrammetric data sets, the one obtained 541 542 from UAV was used as reference because of the even distribution of point density within the sample windows. \mathcal{D} 543

544 Table 6 reports some statistics on the computed M3C2 distances in terms of mean values and standard 545 deviations. Where no data are shown, the comparison was not possible since one or both point clouds were incomplete rexample, in the case of data sets in windows 1 and 5). The comparison between 546 547 TLS and terrestrial photogrammetry resulted in a high similarity between the accuracy of both point 548 clouds, provided that the TLS point cloud may be assumed as benchmarking surface. No large departu 549 were found between results obtained in different sample windows. In addition, the RMSE are in the order 550 of theoretical precision achievable with photogrammetry techniques under the actual acquisition 551 geometry (Luhmann et al., 2014). This result confirms the small differences between point clouds. 552 Nevertheless, this analysis was carried out after a posteriori ICP-based registration that may have fixed 553 residual geo-referencing errors. By looking at the residuals on GCPs for TLS and terrestrial 554 photogrammetry (7.5 cm and 34.4 cm, respectively) a bias larger than the RMSE found for the distances 555 in different windows were obtained for the latter. Indeed, the identification of natural GCPs on the glacier 556 surface was quite difficult and resulted in low-precision measurements. A solution to improve the quality of geo-referencing in the photogrammetric block should be considered, for example by directly 557 measuring a part of the photo-stations as proposed in Forlani et al. (2014), instead of recur 558 559 on the glacier surface.

The comparison between TLS and UAV photogrammetry provided significantly worse results that may be summarized by the RMSEs in the range 21.1-37.7. These departers may be attributed to two main reasons: (1) these techniques offer the best performances in opposite situations: flat terrain in the case of a UAV survey and vertical surfaces in the case of TLS; (2) the UAV flight was geo-referenced on a set of GCPs obtaining a RMSE of residuals of 40.5 cm, thus the ICP co-registration may have not totally compensated the existing bias.

The comparison between UAV (assumed as reference) and terrestrial photogrammetry provided similar results to the ones obtained in the previous analysis. Indeed, the same reasons may still hold in such a case, since two point clouds obtained from ground-based and airborne camera poses were compared. This makes it possible to fuse both point clouds from photogrammetry to obtain a complete model of the glacier tongue, as reported in Sec. 3.3.

571 **3.2 Glacier Thickness change 2007-20**

572 After DEM co-registration, the resulting shifts reported in Table 3 were applied to each 'slave' DEM, including the entire glacier area. Then the elevations of the 'slave' DEM were subtracted from the 573 574 corresponding elevations of the 'master' DEM to obtain the ΔDEM . Each ΔDEM was then clipped within 575 the glacier outlines to provide pairwise relative estimates of glacier elevation change. First this operation was carried out by considering the largest possible area in each ADEM (see Fig. 11 and Tab), using **P** 577 the oldest outlines available. This operation was aimed at investigating ice lost in areas of glacier retreat. <u>578</u> Secondly, a minimum extension common to all three DEMs was analysed as a means of independently P checking the quality of each surface and finding thinning trends over a reference area. Indeed, while the 580 2007 aerial DEM covers the entire Lombardy region, the coverage of both UAV DEMs (2014 and 2016) 581 is limited. Although the DEM from 2016 has the smallest extent, it is not completely included within the 582 extension of 2014 DEM. In practice, however, the reference area almost completely refers to the extent of the 2014-2016 analysis, covering 0.32 km^2 . For the second comparison, the volume change over the glacier tongue and its uncertainty were estimated as well. The method proposed in Howat et al. (2008) was applied, which expresses the uncertainty of volume change as the combination of the standard deviation computed from the residual elevation difference over stable areas, and the truncation error implicit when substituting the integral in volume calculation with a finite sum, according to Jokinen and Geist (2010).

When comparing over the maximum possible glacier extension, the latter appears clearly inversely related to the thinning rates. However, the comparison between 2007 and 2014 includes sections of the central tongue that only lost an average 15 m of ice. Considering a common reference area, an acceleration of glacier thinning seems to have occurred over recent years over the lower glacier tongue, from -4.55 in 2007-2014 to 5.20 ma⁻¹ in 2014-2016 (see Table 8).

594 The eastern ablation tongue appears the most affected by glacier thinning between 2007 and 2014, with 595 ice thickness changes persistently below -30 m over the period and between -40/-50 m between 2014 596 and 2016. The greatest ice loss between 2007 and 2014 occurs in correspondence with local collapse of 597 ice cavities, localized in small areas of the eastern tongue (see Fig. 11a), with local thinning generally 598 above -50 m and a maximum of -66.80 m. Conversely, between 2014 and 2016 glacier thinning is close 599 to the mean of approximately 10 m on both the central and eastern sections of the tongue. Only in areas 600 of local collapse is this value greatly exceeded, with a maximum of -38.71 m thinning at the terminus 601 and local maxima above -25 m on the medial moraine and left margin of the central tongue (see Fig. 11c). 🔎 602

603 **3.3 Data fusion of point clouds from UAV and terrestrial photogrammetry**

As shown in the previous analysis, data sets obtained from ground-based and UAV photogrammetry are quite complementary. In order to derive a full 3D model of the terminal part of the tongue of Forni Glacier, point clouds were de together. The greed point cloud was subsampled to keep a minimum distance between adjacent points of 20 cm (see Fig. 12). The size of this point cloud was approximately 4.4 million points. RGB information from photogrammetric data sets were used for colouring the point clouds before data fusion he merged point cloud was used for the analysis of glacier hazards and risks reported in Sec. 4.2.

611 4 Discussion

612 **4.1 Evolution of the glacier tongue**

613 The outcomes of the DEM differencing procedure indicate generalized thinning of the Forni Glacier 614 tongue over the entire study period. Independent validation of the thinning rates found in this study is 615 available from Senese et al. (2012), who estimated the specific mass balance at the glacier AWS between 616 2006 and 2009, by calculating ablation via the glacier energy budget and accumulation via a sonic ranger. 617 The authors reported a mean annual mass balance of -4.70 m w.e. between 2005 and 2009, with minimum 618 negative of -4.20 and maximum negative of -4.90 m w.e. In comparison, by calculating the geodetic mass 619 balance using the mean ice density of 0.917 g/cm³, we found mean annual values of -4.17 ± 0.22 m w.e. 620 between 2007 and 2014 and -4.36 ± 0.27 between 2007 and 2016 over the lower part of the glacier 621 tongue, slightly lower but encompassing a wider spatial and temporal range. Besides, our data suggests 622 that thinning over the last two years was higher than between 2007 and 2014.

Although thinning rates are high over the entire tongue, they are not homogeneous, and both the glacier preexisting surface morphology and debris input from the valley walls (Azzoni et al., under revision) played an active role in determining the evolution of the glacier tongue that we identified by means of elevation transects on the three DEM surfaces. In particular, the ice-cored medial moraines changed dramatically. In 1987, they were 12 m tall and 50 m wide at maximum on the glacier tongue (Smiraglia, 1989), but both width and height gradually increased over the years: the eastern moraine is the more prominent of the two, widening asymmetrically towards the terminus, with the left flank being the widest (see Fig. 13). Along of the middle transect, the height of the eastern moraine remained stable at 15 m between 2007 and 2016, while its width increased from 80 to 100 m. During this period, a new moraine also formed on the eastern tongue, reaching a height of approximately 7 m in 2016. East of the this newly formed moraine, ice thinning was above 60 m between 2007 and 2016, likely due to the reduction of mass input from the eastern icefall and the development of a thin debris cover promoting ice ablation (see Fig. 13, middle transect).

Further upvalley, as a result of differential ablation, thinning was lower on the medial moraine than on 636 637 the exposed ice surface. Thus, the height of the eastern moraine increased from 20 to approximately 26 638 m between 2007 and 2016, while its width went from 100 to 145 m. A small new moraine developed, 639 joining the main one in SE-NW direction. The most prominent feature on the central tongue is however 640 the large collapse at the left margin, with 26 m ice thinning between 2014 and 2016 (Fig. 13, bottom 641 transect). At the terminus, the height of the eastern medial moraine decreased between 2007, when it was 642 about 20 m tall, and 2016, when it was approximately 13 m, due to the development of normal faults subparallel to the main medial moraine direction. Conversely, its width gradually increased from 100 to 643 644 130 m in 2016. The glacier surface once flat is now increasingly hummocky both on the central and 645 eastern sections of the tongue (see Fig. 13 top transect).

646 **4.2 Glacier-related hazards and risks**

The collapse of sections of the glacier appears to pose the most significant risk to mountaineers. Collapses are more dangerous than crevasses because of the larger size and relipinvolved. Besides, already collapsed areas could be filled with snow and rendered entirely or partly invisible to mountaineers. Currently, hikers heading to Mount San Matteo during the summer take the trail crossing the Forni Glacier on the central tongue, dangerously close to the collapsing glacier terminus. During wintertime, 652 ski-mountaineers instead access the glacier from the eastern side, crossing the medial moraine and 653 potentially collapsed areas there (see Fig. 14).

654 While most collapsed areas on the glacier tongue are in fact normal faults, two large ring fault systems 655 can be identified: the first, located on the eastern section (see Fig. 2d and 15a), covered an area of 25.6x10³ m² and showed surface lowering of up to 5 m in 2014. This area was not surveyed in 2016, 656 657 since field observation did not show evidence of further subsidence. Conversely, the ring fault that only 658 emerged as a few semi-circular fractures in 2014 grew until cavity collapse, with a vertical displacement 659 up to 20 m and further fractures extending south-eastward (see Fig. 2c and 15b), thus potentially widening 660 the extent of collapse in the future. As regards normal faults, those on the eastern moraine developed rapidly in the vertical domain reaching a relief of 12 m in 2016. The collapse was even more rapid at the 661 662 terminus, leading to the formation of three sub-vertical facies, which could not be analyzed by UAV data 663 alone given the nadir image acquisition. Here, integration of close-range photogrammetry proved 664 necessary to investigate the cliff height, which reaches up to 24 m, while the height of the vault is as low as 10 m. The fast retreat p p of this glacier suggest the terminus will recede along the fault system on 665 the eastern moraine, increasing the occurrence of hazardous phenomena in this area where the 666 667 vulnerability (occurrence of paths followed by mountaineers) is relatively high, thus making glacier risk particularly significant here. Up $\sqrt{2}$, the increased relief of the medial moraine might cause more 668 frequent landslides and rockfalls, which can be dangerous for mountaineers during the summer season. 669 670 Finally, the collapse of the glacier tongue at its margins will further compromise access to the glacier for 671 winter activities.

In these fragile and dynamic areas, the combination of UAV and terrestrial surveys potentially allows following the evolution of glacial hazards (e.g., ring faults, collapsed zones, glacier sectors with a very thin ice layer, etc.) over a summer season or with a higher time frequency than previously possible. This information will be crucial to manage the vulnerability of the area and thus reduce the level of risk. In 676 fact, based on the orthophotos obtained from UAV surveys, it will be possible to identify safer paths 677 where mountaineers and skiers can visit the glacier and reach the most important summits (e.g., Mount 678 San Matteo, etc..) without crossing the most dangerous zones. These safer paths will be identified with 679 the help of local alpine guides and reported in the webpage of the Stelvio National Park and in the 680 Geoportale of the Lombardy Region, to increase the number of citizens potentially visiting the area who 681 will be informed about the dangers and the safest paths. Our surveys also helped describe new categories 682 of glacier hazards and risk (for a review see RGSL, 2003), such as faults and ring faults, which were not 683 considered in the guidelines for the management of environmental risk in the past. Their recent 684 emergence, driven by the present climate change and the subsequent glacier downwasting, requires a 685 new approach to risk management. In this context, it is at present impossible to reduce the glacier hazards 686 and the only chance to lower the risk level is to reduce the vulnerability by changing the tourist paths to 687 safer areas, only possible by applying UAV and terrestrial photogrammetry-based monitoring.

688 **5** Conclusions

In our study, we assessed the potential of UAV and terrestrial photogrammetry to map surface features pertaining to the collapse of a large Alpine glacier (Forni Glacier, Italian Alps), such as ring faults, representing hazards for mountaineers, and reconstruct the thickness changes and variations in topography. We assessed the accuracy of surface elevations by comparing point clouds from UAV and terrestrial photogrammetry against those obtained from TLS and by measuring DEM differences from repeat UAV surveys on stable areas.

By comparing different DEMs of the glacier tongue, we found an increased rate of glacier ablation in recent years, reaching 5.20 ± 1.11 ma⁻¹ between 2014 and 2016, with a maximum surface elevation change of -38.71 m. At the same time, the eastern medial moraine and terminus underwent major changes: the first widened and increased in relief while also experiencing several faults; the second 699 experienced relevant collapses while the glacier surface became increasingly hummocky. We combined 700 point clouds obtained from UAV- and terrestrial photogrammetry to investigate the hazards on the glacier 701 tongue and the risk to mountaineers and skiers following routes to the popular summits of the area. The 702 glacier terminus is at present the most dangerous area, because it hosts vertical cliffs with a relief up to 703 24 m and it is the main gateway to the glacier during the summer. Collapses at the margins of the central 704 tongue also increase the risk for skiers during winter. The scenario of present glacier downwasting, 705 besides potentially increasing mass movements from currently unstable slopes, might further 706 compromise the access to Forni Glacier in the future, modifying the surface topography and increasing 707 the occurrence of collapses.

708 Our results also show that a sufficient level of accuracy can be achieved by using UAVs to monitor the 709 glacier topographic changes over yearly timescales, as the variations that take place are larger than the 710 associated uncertainty. Thus, UAV surveys could be used effectively to investigate the glacier 711 downwasting. The integration with terrestrial photogrammetry is crucial to establish a valid alternative 712 to TLS to monitor recurrent glacier hazards with larger impact on downstream populations, allowing the 713 estimation of volumes involved in the detachment of seracs or hanging glaciers, and measurements of 714 the height of moraine dams to help manage potential GLOFs. Terrestrial photogrammetry may provide better results than TLS in term of point density and point cloud completeness, make to the chance to 715 716 capture images from a high number of camera stations, limiting occlusions. When analyzing the point 717 cloud accuracy, the comparison of photogrammetric outputs with respect to TLS outputs revealed average discrepancies in the order of a few centimeters in the case of terrestrial blocks, and a few 718 719 decimeters in the case of UAV blocks. This result, although quite promising, is not yet sufficient for 720 monitoring of intra-seasonal variations of the glacier topography, or very rapid changes occurring on 721 daily timescales such as those involved in the collapse of ice blocks at the terminus. Beside the 722 combination with terrestrial photogrammetry, improvements to our UAV survey design might include a 723 greater number of GCPs sampled in a dense spatial network, but the glacier dynamics evolving towards 724 a collapse scenario might make this solution highly unpractical over time. As an alternative, our choice 725 of a custom UAV platform adopted in 2016 should ease a low cost switch to an RTK navigation system, 726 reducing the number of GCPs necessary for geo-referencing. While fixed-wing UAVs outperform 727 multicopters in terms of area covered and aircraft stability, the adaptability of our quadcopter platform, 728 together with the flexibility of terrestrial photogrammetric surveys might eventually enable continuous 729 monitoring of the Forni glacier and the provision of rapid hazard detection services for mountain guides 730 and the tourism sector in Stelvio National Park.

731 Competing interests

The authors declare that they have no conflict of interest.

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951 Tables

	2016 Survey	2014 Survey		
Aircraft type	Quadcopter	Fixed wing		
Commercial name	Customized, with Tarot frame	SwingletCam built by		
	650 size, VR Brain 5.2	SenseFly		
	Autopilot & APM Arducopter			
	3.2.1 Firmware			
Digital camera	Canon Powershot ELPH 320	Canon Ixus 127 HS		
_	HS			
Camera technical	16 Megapixel, focal length	16 Megapixel, focal length		
features	4.3 mm	4.3 mm		
GNSS antenna	GPS+GLONASS (Galileo	GPS only		
	compatible)			
Weight (incl. payload)	2.75 Kg	0.50 Kg		
Battery time	20-25 minutes	30 minutes		

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Table 1: Details of UAV platforms employed during the 2016 and 2014 surveys

Block	#Images	Total #valid TPs	Mean # projections per TP	Mean/min # TP per image	Mean/max RMSE reprojection [pixel]	Point cloud # points	Mean GSD[cm]	# GCPs	RMSE on GCPs [cm]
Terrestrial Photogrammetry (Glacier Terminus)	134	59,157	5.6	2,455 / 744	0.30 / 0.73	27.1M	1.5	7	34.4
UAV 2016	288	38,506	6.7	892 / 115	0.21 / 0.31	75.2M	5.7	8	40.5
UAV 2014	85	76,856	4.4	3935 / 2231	0.17 / 0.19	55.7M	11.9	0	n.a.

Table 2: Statistics of photogrammetric blocks (TP: tie points; GCP: ground control points; RMSE: root
mean square error).

DEM pair	Elevation differences	Co-registration shifts		Elevation differences
	without co-registration	X [m] Y [m]		without co-registration
	shifts ($\mu_{\Delta H} \pm \sigma_{\Delta H}$) [m]			shifts ($\mu_{\Delta H} \pm \sigma_{\Delta H}$) [m]
2007-2014	1.96 ± 2.60	1.11	-1.11	$0.00{\pm}1.70$
2007-2016	-0.43±3.48	2.44	-1.11	$0.00{\pm}2.60$
2014-2016	-2.92±3.21	-0.20	-1.30	0.00±2.22

77 Table 3: Statistics of the elevation differences between DEM pairs before and after the application of
78 co-registration shifts.

Sample	Size of sample windows	windows #points in sample windows					
Window	Width x depth x height [m]	(i) UAV	(ii) Terrestrial	(iii) TLS			
		photogrammetry	photogrammetry				
1	49 x 57 x 22	-	1984k	141k			
2	43 x 42 x13	76k	2175k	130k			
3	45 x 11 x14	43k	712k	25k			
4	24 x 28 x 10	62k	557k	33k			
5	55 x 72 x 18	406k	810k	-			

Table 4: Number of points in each sample window.

Sample	Mean and standa	Number	Number of point above the lower			
Window		[points/m ²]		12.5% percentile		
	(i) UAV	(ii) Terrestrial	(iii) TLS	(i)	(ii)	(iii)
	Photogrammetry					
1	-	1654±637	226±100	-	880	26
2	109±29	2297±708	391±217	61	881	0
3	103±27	1978±606	151±60	49	766	31
4	108±22	1384±530	141±69	62	324	2
5	141±22	485±227	_	97	31	_

<sup>Table 5: Mean and standard deviation of point density computed in five sample windows on the Forni
Glacier terminus.</sup>

Sample		Means and Std. Dev.s of M3C2 distances			RMSE of M3C2 distances [cm]			
Window	Ref.	TLS	TLS	UAV	TLS	TLS	UAV	
				Photogramm.			Photogramm	
	Slave	Terrestrial	UAV	Terrestrial	Terrestrial	UAV	Terrestrial	
		Photogramm.	Photogramm.	Photogramm.	Photogramm	Photogramm.	Photogramm	
					•			
1		4.5±7.4	-	-	8.7	-	-	
2		-1.1±10.5	14.8 ± 34.7	-14.5±26.7	10.6	37.7	30.4	
3		8.4±4.1	14.7±15.1	-8.5±18.9	9.4	21.1	20.7	
4		2.8±5.3	9.4±22.2	-2.3±24.9	6.0	24.0	25.0	
5		-	-	-8.5±25.3	-	-	26.7	

Table 6: Statistics on computed M3C2 distances.

DEM pair	Glacier	Area	Mean	thickness	Mean	thinning
	analysed [km ²]		change [m]		rates [ma ⁻	1]
2007-2014	1.03		-25.06 ± 1.7	0	-3.58 ± 0.1	24
2007-2016	0.46		-37.39 ± 2.6	60	$-4.15 \pm 0.115 \pm 0.111$	29
2014-2016	0.32		-10.40 ± 2.2	.2	$-5.20 \pm 1.$	11

970 Table 7: Average thickness change and thinning rates from DEM differencing over the maximum glacier

971 areas for each DEM pair, and corresponding uncertainty.

DEM pair	Mean	thickness	Mean	thinning	Volume	Change
	change [m]		rates [ma	-1]	$[10^6 \mathrm{m}^3]$	
2007-2014	-31.91 ± 1.7	0	-4.55 ± 0	.24	-10.00 ± 0	.12
2007-2016	-42.86 ± 2.6	60	-4.76 ± 0	.29	-13.46 ± 0	.14
2014-2016	-10.41 ± 2.2	.2	-5.20 ± 1	.11	-3.29 ± 0.0)5

973 Table 8: Average ice thickness change, thinning rates and volume loss from DEM differencing over a

974 common reference area of 0.32 km² for all DEM pairs. Uncertainty of thickness change expressed as 1σ

975 of residual elevation differences over stable areas after DEM co-registration. See text for an explanation 976 of the uncertainty of volume changes.



Figure 1: (a) Location of the Forni Glacier, marked with a red star, within Italy and the Central Alps. (b) Perspective view of the glacier and location of the take-off/landing sites for the 2014 and 2016 UAV surveys (in 2016 two different landing sites were used). Base maps courtesy of Bing Maps© and Google Earth©



Figure 2: Collapsing areas on the tongue of Forni Glacier. (a) Faults cutting across the eastern medial moraine; (b) glacier terminus; (c) Near-circular collapsed area on the central tongue; (d) Large ring fault on the eastern tongue at the base of the icefall. Photo courtesy of G.Cola; (e) Close-up of a vertical ice cliff at the glacier terminus.



Figure 3: The UAVs used in surveys of the Forni Glacier. (a) The SwingletCam fixed-wing aircraft
employed in 2014, at its take off site by Lake Rosole; (b) The quadcopter used in 2016 in the lab.



Figure 4: Dense point cloud of the 2016 survey and location of the GCPs recorded with GNSS
equipment.





Figure 5: 3D reconstruction of the glacier terminus using terrestrial photogrammetry: (a) locations of
 camera stations in front of the glacier and 3D coordinates of tie points extracted during SfM for image
 orientation; (b) point clouds of the glacier terminus with positions of adopted GCPs.



- 1007 Figure 6: survey operations of a GCP placed on a flat boulder on the proglacial plain of Forni Glacier.
- 1008 Photo courtesy of Livio Piatta



1011 Figure 7: Sample windows on the glacier terminus area.



1014 Figure 8: Bar plot of mean point density computed in the five sample windows on the Forni Glacier

terminus.



Figure 9: Maps of point density for Window 2.







 1023
 Glacier Outlines 2016
 -9.9 to -9
 -6.9 to -6
 -3.9 to -3
 -0.9 to 0

 1024
 Figure 11: Ice thickness change rates from DEM differencing over (a) 2007-2014; (b) 2007-2016; (c)

 1025
 2014-2016. Glacier outlines from 2014 and 2016 are limited to the area surveyed during the UAV

 1026
 Image: Comparison of the comparison of

1026 campaigns. Base map from hillshading of 2007 DEM.



Figure 12: Merged 3D model of the Forni Glacier tongue, integrating points clouds derived from UAV
and terrestrial photogrammetry, subsampled to keep a minimum distance between adjacent points of

1031 20 cm, and coloured with RGB information from images.



1033 1034 Figure 13: Across-glacier transects of elevation of the ice surface in 2007, 2014 and 2016, based on

the respective DEMs. Base map is the orthomosaic obtained from the 2016 UAV survey. 1035



- 1037
- 1038 *Figure 14: perspective view of the glacier tongue showing summer and winter trails crossing the*
- 1039 glacier. Trails available from Kompass online cartography at https://www.kompass-
- 1040 italia.it/info/mappa-online/. Elevation surface is the merged point cloud obtained from UAV and close-
- 1041 range photogrammetry, with 2x vertical exaggeration.



1044 Figure 15: location of collapse structures on the Forni Glacier, shown on the respective UAV

orthophoto. (a) 2014. The red box marks the area surveyed in 2016. (b) 2016.