# Improvements in the integration of remote sensing and rock slopemodelling

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- 10 Key words:
- 11 Remote sensing, UAV, LiDAR, Slope stability analysis, Conventional and numerical modelling

#### 12 Abstract

Over the last two decades the approach to the investigation of landslides has changed dramatically. The 13 advent of new technologies for engineering geological surveys and slope analyses has led to step-change 14 15 increases in the quality of data available for landslide studies. However, the use of such technologies in 16 the survey and analysis of slopes is often complex and may not always be either desirable or feasible. In 17 this context, this paper aims to improve the understanding of the use of remote sensing techniques for rock mass characterization and provide guidance and on how and when the data obtained from these 18 19 techniques can be used as input for stability analyses. Advantages and limitations of available digital photogrammetry and laser scanning techniques will also be discussed in relation to their cost and the 20 quality of data that can be obtained. A critique of recent research data obtained from remote sensing 21 22 techniques is presented together with a discussion on use of the data for slope stability analysis. This 23 highlights how data use may be optimized to reduce both parameter and model uncertainty in future slope 24 analyses.

## 25 **1 Introduction**

26 The use of remote sensing techniques allows acquisition of detailed information on both the slope and

- 27 discontinuity geometry for study of landslide susceptibility and potential rock slope instability
- 28 mechanisms. Several authors have discussed the use of Digital Photogrammetry (DP) and Laser Scanning
- 29 (LS) in the study of natural and engineered slopes (Ghirotti and Genevois, 2007; Coggan et al., 2007;
- Lato et al., 2009; Sturzenegger and Stead, 2009a, 2009b; Salvini et al., 2013; Francioni et al., 2014 and
- 31 2015, Spreafico et al., 2015). These techniques allow the acquisition of very detailed information on the
- 32 structural setting and slope geometry, particularly important in the case of steep inaccessible slopes. This
- data can provide very useful input parameters for stability analyses, especially when considering the wide
- range of software now available for both conventional and numerical methods of slope analyses (Stead
- and Coggan, 2012; Stead and Wolter, 2015).
- 36 The principal aim of our research is to show the use of remote sensing techniques for providing the
- 37 necessary data for the varied methods of slope analysis. Long and short-range terrestrial laser scanning
- and four approaches to photogrammetric survey will be presented, i.e. tripod, aerostatic balloon,
- 39 helicopter and Unmanned Aerial Vehicle (UAV) or drones. The data obtained from these different survey

40 techniques can be used in conventional (kinematic, limit equilibrium and rockfall) and more sophisticated

41 numerical (continuum, discontinuum and hybrid and rockfall run out) methods of analysis. The potential

- 42 use of other forms of remote sensing in slope investigations including airborne and mobile laser scanning,
- 43 aircraft photogrammetry, thermal and hyperspectral imaging and full waveform analysis will also be
- 44 briefly addressed.

45 Among conventional methods, kinematic analysis remains the simplest method to study rock slope

- 46 stability and can be extremely useful in preliminary assessment of potential instability mechanisms.
- 47 Results from this analysis are strictly related to the geometric orientation of discontinuity surfaces relative
- to the slope. It is important that structural domains be identified and that the measured discontinuity
- 49 parameters representative of the area be assessed. In this context DP and LS are ideally suited to collect
- 50 input data that is more representative of the study area, which may often be inaccessible to conventional 51 methods of discontinuity data collection. As part of the analysis it is essential that the variation in
- 51 interfolds of discontinuity data concerton. As part of the analysis it is essential that the variation in 52 discontinuity sets and their orientation within a slope be assessed and the effect of structural geology on
- slope stability be fully considered. The use of remote sensing methods allows such spatial variations in
- 55 stope stability be fully considered. The use of remote sensing methods allows such spatial variations in 54 structure (with slope height and along the slope) to be investigated more comprehensively and efficiently.
- 55 Francioni et al. (2015) showed how interpolation of remotely sensed data using GIS techniques can be
- 56 used to perform a more rigorous deterministic kinematic analysis of slopes.
- 57 When using limit equilibrium methods the geometry of discontinuities and slopes is considered together
- with force and/or moment equilibrium conditions. DP and LS data can be integrated with conventional
- engineering geological surveys and used for deterministic and probabilistic stability analysis. The
- 60 geometry of the rock blocks and the discontinuities obtained from remote sensing techniques and the
- 61 physical characteristics of discontinuities and rock mass from both engineering geological survey and
- 62 close range LS/photogrammetry can be used to calculate the Factor of Safety of the blocks within the
- 63 slope (Salvini et al. 2011, 2013). Conventional limit equilibrium slope stability analysis can also be
- 64 supplemented by rockfall calculations for risk and hazard assessments. This is particularly important for
- 65 the definition of areas that can be affected by potential rockfall and for the subsequent creation of hazard
- 66 maps (maps highlighting area of potential instability and/or rockfall). DP and LS can play a key role in
- defining the geometry and topography of the slope and the land cover which are all essential input data inrockfall run out simulation.
- 69 Numerical modelling has been increasingly used in recent years for stability analyses (Brideau and Stead,
- 70 2010; Brideau et al., 2011; Stead and Coggan, 2012; Francioni et al., 2014 and 2015; Stead and Wolter,
- 2015, Brideda et al., 2017, Stead and Coggan, 2012, Flandform et al., 2017 and 2019, Stead and Worter, 2015 and Spreafico et al., 2015 and 2017). The reliability of a numerical model is however connected to
- 72 the quality of input data and the assumed constitutive models and failure mode. DP and LS can greatly
- 73 improve the quantity and quality of the available data for slope analysis and can also be used, where
- 74 appropriate, to create sophisticated stochastic Discrete Fracture Networks (DFN) for incorporation into
- 75 numerical models.

#### 76 2 Remote sensing sensors

#### 77 2.1 Digital Photogrammetry

In the last two decades, the availability of new survey techniques and software processing tools hasresulted in a marked increase in the use of DP.

80 Conventional acquisition methods include independent convergent, image fan and image strip models (Figure 1A-C). These methods are explained in detail by Birch (2006) and their application discussed by 81 Sturzenegger and Stead (2009a, 2009b): the choice of method being decided according to site specific 82 slope conditions. Figure 1A shows the independent convergent model; the advantage of this method is 83 84 that almost 100% of the images are used to build the model and if multiple models are required to cover 85 the slope, very little overlap is required between models. Figure 1B shows the image fan method; this is 86 similar to the independent method with the exception that the images are captured from specific camera 87 locations (which are not independent). In this way, there are fewer unknowns to be determined (since the camera positions are the same) and the precision of the models is greater; this can be used also with high 88 89 focal length lenses for long range photogrammetry (Sturzenegger and Stead, 2009a, 2009b; Birch, 2006). 90 The last method is the image strip setup (Figure 1C) where a series of parallel images with a typical 60% overlap is required. The high degree of overlap between images results in precise orientation of the 91 model, significantly reducing the number of control points required. This method, in addition to being 92 suitable for aerial photogrammetry, is also used in terrestrial photogrammetry when the stations and the 93 94 outcrop are not very far apart (as the distance becomes larger, depth accuracy is reduced) and the slope is 95 not very high. A typical example of the use of this method is in the survey of underground tunnels when 96 the distance between the camera and the rock wall is small and the acquisition of a series of parallel 97 images is the easiest way to proceed.

The coordinates of the camera location or the coordinates of ground control points located in the surveyed 98 99 area are required to scale/geo-reference the photogrammetric models. In recent years the use of Structure from Motion (SfM) imaging techniques (and software) has increased significantly making the routine use 100 101 of photogrammetry in engineering practice easier and even more attractive. Although SfM still requires the use of ground control points to scale/geo-reference the model, the creation of the 3D model is much 102 easier and faster. This is due to a highly redundant bundle adjustment based on matching features in 103 multiple overlapping photographs (Figure 1D). An introduction to this technique is given by Westoby et 104 al. (2012) while applications of SfM techniques in engineering practice have been recently presented by 105

106 Lucieer et al. (2014) and Salvini et al. (2016).

107 Another type of acquisition technique is the use of stereo cameras rigidly mounted that allow the

108 acquisition of photographs from two cameras with a known baseline (distance between the cameras)

109 (Firpo et al., 2011; Francioni et al., 2014). In such cases the baseline is known and if the camera is

110 calibrated, it is possible to reconstruct a scaled 3D photogrammetric model.

#### 111 2.2 Laser Scanning

LS allows the remote acquisition of information from an observed object including both morphological

characteristics (altitude, spatial coordinates, etc.) and physical properties, e.g. the intensity of the reflected

signal that can be correlated to the object material, temperature, humidity, etc.

LS can also involve both short and long range acquisition. Long-range laser scanners (up to 6 km) are

116 particularly useful for wide and high rock slopes. It is possible to set up the laser scanner at a considerable

distance from the slope, hence decreasing the number of occlusions when working with very elevated

slopes. Moreover, because of accessibility issues, sometimes it is not possible to set up the instrument

close to the slope, and without a long-range laser scanner, the acquisition would not be possible. The
 recent use of long range LS for landslide analysis is documented by Barbarella et al. (2015).

121 Short range laser scanners are fast and very precise with a wide vertical field of view and for these

reasons have mostly been used in engineering geology in underground mining and for small rock slopes,

where the instrument can (or has to) be set close to the slope (Francioni et al., 2013 and 2014).

124 Time-of-flight and phase difference are the two types of measurement principles by which laser scanners

125 obtain geometric and physical data. An introduction to these techniques, and laser scanner specifications,

are highlighted by Beraldin (2004) and Fröhlich and Mettenleiter (2004). Time-of-flight has been the

most used measurement technique to date; it allows for measuring the geometry and the reflectivity of an

128 object from a few meters to kilometers in distance. The newly available phase difference measurement

terrestrial laser scanners (full waveform LS) have seen considerable research in the last few years. With

this technology it is possible to capture additional metrics of the rock slope surface, which allow

significantly reduced uncertainties in change detection (Afana et al., 2013). Using this approach,

132 geometric and radiometric target surface information can be obtained and, at the same time, retain the

133 spatially rich detailed point-clouds.

134 The advent of full waveform LS make the LS techniques more attractive but it has to be noted that the

135 cost of full waveform LiDAR technology is currently significantly higher than time-of-flight instruments136 and DP.

## 137 **3 Remote sensing platforms**

## 138 3.1 Ground based platforms

139 Ground based remote sensing instrument platforms such as tripods, hand-held devices and vehicles are

140 commonly used in engineering geology. Although these systems are simple to use and cost effective, they

141 have significant limitations related to the slope elevation; when a survey has to be conducted at the

bottom of a high slope, occlusions can seriously compromise the final model (Lato et al., 2009; Francioni

et al., 2014). Sturzenegger and Stead (2009a, 2009b) highlighted the importance of understanding

possible bias related to the use of this technique and how the results can be affected by occlusions.

145 Nevertheless, this method has been successfully used by several authors in the analysis of rock slopes

(Haneberg et al., 2006; Bonilla-Sierra et al., 2015; Havaej et al., 2016). In the following sections, the most
common types of platform for slope surveys are presented.

## 148 3.1.1 Ground based Digital Photogrammetry with hand-held camera or tripod

149 A hand-held camera or tripod are the simplest and most convenient photogrammetric survey methods.

150 The use of a tripod results in acquisition of high quality photographs and reduces the distortions related to

camera vibrations. Another advantage of the use of a tripod is the possibility to perform long range

152 photogrammetry (Sturzenegger and Stead, 2009a; 2009b). It is also possible to use a tripod together with

- a reamed bar in order to maintain a constant line of sight and to precisely control the distance between
- sequential photographs (Salvini and Francioni, 2013). Figure 2A-B shows the application of this
- technique with and without a reamed bar respectively in two case studies, a rock outcrop along the 'Sea to
- 156 Sky Highway' in British Columbia, Canada and in a Carrara marble quarry, Italy.
- A GigaPan (GigaPan, 2016) robotic tripod may be used for both producing high resolution panoramas of
   rock slopes or conventional acquisition of images for photogrammetry.
- 159 The use of hand-held camera survey technique has increased markedly with the advent of SfM techniques

as they overcome some of the limitations related to the position of the camera, and using a consistent

161 number of images it is possible obtain a detailed 3D model of the study area.

#### 162 *3.1.2 <u>Ground based Laser Scanning with tripod</u>*

Ground based LS, or terrestrial LiDAR is a survey technique for rapidly obtaining high precision slope geometry and deriving geological structure. One of the most difficult steps in using terrestrial LS is the point cloud registration which allows for the integration of several point clouds into a unique reference system (Francioni et al., 2014). Francioni et al. (2014) showed how this problem can be solved using an integrated topographic system. Moreover, some of the most recent software for point cloud management have built-in modules for the automatic registration of point clouds based on the recognition of common

points between different point clouds (ICP - Iterative Closest Point, Besl and Mckay, 1992).

170 Figure 3 shows two 3D representations of an outcrop located along the Sea to Sky Highway, BC, Canada

171 obtained using a tripod and a Riegl VZ4000 scanner (very long-range laser scanner with online waveform

processing; Riegl, 2014). Figure 3A shows the 3D model of the road cut visualized using the RGB

information gained from the internal digital camera of the laser scanner. Figure 3B shows the same

- 174 outcrop visualized as the wave amplitude (dB). The use of waveform analysis (in this case wave
- amplitude) allows recognition and highlighting of different rock types. It is clearly shown that the

amplitude generated from the overlying basalt columns in the 3D model have a higher value compared to

- the lower competent formation beneath. Using the same theory as applied in the airborne LiDAR, this
- technology allows for recording different object echoes. Figure 4 shows the acquisition of the
- 179 photographs (Figure 4A), RGB point cloud (Figure 4B) and the visualization of the four echoes registered
- by the Riegl VZ4000 laser scanner (Riegl, 2014) for a geological outcrop located along the 'Sea to Sky

181 Highway' (Figure 4C). This facility is important for filtering the point cloud based on the different

arrivals (first, last or single) and obtaining more information where there is vegetation or objects located

along the LiDAR line-of-sight.

#### 184 3.1.3 Ground based mobile Laser Scanning

185 Mobile LS refers to the use of LS from moving platforms. The common utilization of this technique is

through the use of wheeled vehicles (the instrument is usually mounted on the vehicle roof) for road or

scene mapping purposes. However, mobile laser scanning systems are not restricted to wheeled vehicles

188 as they can be mounted on any moving platforms, such as trains and boats. The main advantage of this 189 technique is the speed with which it is possible to survey entire streets or buildings. Moreover, in case of

190 coastlines, the use of a boat can allow scanning of cliff faces from the sea. Since the LS data are acquired

from a moving platform, georeferencing the data can be more complicated. For this reason, when using

this type of platform LS instruments are supplemented by GPS and an Inertial Measurement Unit (IMU).

193 The use of mobile LS in engineering geology and especially in the study of landslides has been presented

by Michoud et al. (2015) who describe an interesting case study in High Normandy, France. They tested

boat-based LS capabilities by scanning 3D point clouds of unstable coastal cliffs showing the potential

use of boat-based LS to detect rockfalls and erosional deposits including multi-temporal acquisitions, to

197 monitor large slope changes.

198 New generation LS are very flexible and can be also hand-held or used on platforms such as backpacks199 thereby providing the ability to map areas while walking geological traverses.

Hand-held and backpack LS has to date not been widely used in the study of rock slopes but has seen a

201 wide range of general applications including heritage site mapping, crime scene investigations and civil

engineering projects. In engineering geology, the most important application to date is related to

203 underground tunnel surveys (Eyre et al., 2016). Hand-held LS has the advantage of being very rapid and

easy to use but currently results in less precision and resolution than traditional LS. It has limited range,

making it ideal for tunnelling applications, but less applicable to slope and landslide analysis that requiregreater distance.

## 207 **3.2** Airborne platforms

208 Airplane, satellite, aerostatic balloon, helicopter and UAV are the most common airborne platforms

209 currently available. Due to the high spatial resolution achievable with the new digital aerial photo-

cameras and LS devices, airplane and satellite data can be used in the photo-interpretation of geotechnical

211 projects at a large scale. However, despite the high quality of photographs and point clouds, the point of

observation at the nadir is sub-optimal in the study of natural and artificial rock slopes characterised by

very steep or even vertical slope sections. This problem can be overcome using platforms that allow

change of the point of observation such as an aerostatic balloon, helicopter or UAV. This also

significantly reduces most of the occlusion problems highlighted for the ground based platforms.

## 216 *3.2.1 <u>Airborne Digital Photogrammetry using aerial or satellite imagery</u>*

217 Aerial photogrammetry refers to imaging acquired through aerial or satellite platforms. In airplane and

218 satellite photogrammetry the camera is usually pointed vertically towards the ground. Multiple

overlapping photographs of the ground are taken as the aircraft/satellite flies along a flight path. These

220 photographs are processed either using a stereo-plotter or in automated processing for Digital Elevation

Model and orthophoto creation. These techniques are therefore used in numerous types of cartographic application, from military and regional small-scale maps, to that of medium- and large-scale technical maps (topographic, geological, geomorphological, land use, etc.). Airplane/satellite photogrammetry is very useful in regional engineering-geological mapping and for detecting landslide related geomorphic landforms (Wolter et al., 2016; Mantovani et al., 2016, Clayton et al., 2017. Donati et al., 2017).

#### 226 3.2.2 <u>Airborne Digital Photogrammetry using an aerostatic balloon</u>

227 Of the platforms presented, the use of the aerostatic balloon has been far less common in engineering geology. DP with an aerostatic balloon can be carried with one single camera (Take et al., 2007) or stereo 228 pairs (Firpo, 2011, Francioni, 2014). Firpo et al. (2011) and Francioni et al. (2014) show the use of an 229 aerostatic helium-filled balloon carrying an apparatus that consists of an aluminum bar with two camera 230 231 slots for the study of high steep quarry slopes in Carrara (Italy) (Figure 5A, B and C). The geometry and 232 length of the apparatus can vary depending on the baseline that is used and more camera slots for a video camera may be added to capture in real time the slope face during image acquisition (Figure 5B, C) 233 (Firpo, 2011; Francioni, 2014). Four electrical winches are used to drive the balloon (Figure 5D) while 234 235 image acquisition is controlled by a PC-driven radio system which guarantees synchronous data 236 acquisition (Firpo 2011, Francioni 2014). In this way, stereo-pairs can be acquired simultaneously and used to build a scaled photogrammetric model using the image strip (the baseline being perfectly known 237 by using the frame) or independent convergent models. Francioni et al. (2014) describe the use of an 238 239 aerostatic balloon in a complex slope in the Apuan Alps showing the possible use of this technique and 240 highlighting some of the complex procedures involved. Balloon used to date for photogrammetric 241 purposes can reach up to 300 m from the ground (Firpo e al., 2011; Francioni 2014). However, the area to 242 be imaged must be accessible and sufficiently wide (Francioni et al., 2014). Weather conditions can also

- be a major limitation in the use of this method, which is best conducted in the absence of rain and,
- especially, wind.

#### 245 3.2.3 <u>Airborne Digital Photogrammetry using a helicopter</u>

The aerostatic balloon can be used only if appropriate site and weather conditions persist and a suitable 246 247 inexpensive source of helium gas is available. When these conditions are not present or in the case of slopes higher than 300 meters this technique cannot be utilized. In such cases, helicopters can provide an 248 249 ideal data acquisition platform. The photogrammetric equipment described in Salvini et al., 2011 and Salvini et al., 2013, consist of an aluminium or steel frame adapted to fit a helicopter landing skid 250 251 supporting two digital cameras and two GPS antennas at its extremities. The equipment is connected and 252 controlled in real time from operators in the helicopter. In this way, it is also possible to use Differential 253 GPS (the power source being located in the helicopter) which helps to know the position of the camera 254 and the orientation of the frame at the moment of the image acquisition. In this case, stereo pairs are also acquired simultaneously and used to build a scaled photogrammetric model through image strip or 255 independent convergent models. Occlusions can be considerably reduced with a careful work plan as it is 256 possible to check the photograph acquisition in real time from the helicopter. Figure 6 shows the 257 258 photogrammetric equipment developed by Salvini et al. (2013) and utilized in the analysis of a rock slope sited in Northern Italy. 259

- 260 Recent research has seen an increasing use of hand-held cameras in helicopter platforms to obtain high
- quality SfM models (Gauthier et al., 2015). Digital SLR cameras now contain in-built GPS or
- conveniently mounted GPS adaptors. The use of hand-held cameras in the helicopter is well demonstrated
- by Vallet et al. (2000), Copons and Vilaplana (2008), Gauthier et al. (2015).
- Helicopter platforms for DP have two main limitations, the first being the high costs involved and the
- second the difficulty in maintaining the stability and direction of the aircraft throughout the
- 266 photogrammetric survey. Subsequently, this can create problems for the orientation of the photographs.
- However, with the acquisition of a considerable number of images, use of topographic survey to define
- the coordinates of Ground Control Points and SfM software, this problem can be mitigated.

## 269 3.2.4 <u>Airborne Digital Photogrammetry using an UAV</u>

- 270 UAV systems are now routinely used in a wide variety of engineering and geoscience fields and include
- both fixed wing and multi-rotor options. UAV systems are highly flexible and provide an ideal platform
- for the acquisition of high resolution photographic images along pre-programmed flight lines/paths. They
- overcome most of the limitations noted for the other platform providing increased spatial close range
- coverage of inaccessible rock slope outcrops with reduced occlusions. Basically, the use of a UAV allows
- acquisition of areas that could not be surveyed with any other vehicle or methodology. Moreover, remote
- control of the UAV reduces the need for hire of a helicopter and operators, the cost of which may be
- 277 significant. This makes the UAV method less expensive than the aerostatic balloon or helicopter.
- 278 Although UAV-based photography is the most common and inexpensive technique used at present,
- 279 UAVs are increasingly being used to capture thermal, hyperspectral and Light Detection and Ranging
- 280 (LiDAR) imagery. An on-board GPS-IMU system provides the positions of the UAV camera at the
- 281 moment of image acquisition and independent convergent SfM methods are used to build the
- 282 photogrammetric model. Figure 7 shows a Falcon 8 UAV (Figure 7A) used during the survey of the
- Lorano open pit in the Carrara marble district, Italy (Figure 7B) (Francioni et al., 2015).
- The use of the UAV in the earth sciences and engineering geology is well-documented in the recent literature (Haarbrink and Eisenbeiss, 2008; Niethammer et al., 2010; Francioni et al., 2015; Salvini et al.
- 2015a; Assali et al., 2016; Westin, 2017; Donati et al., 2017). The most important disadvantages in using
- the UAV technique is that it can be used only in absence of wind/rain. This can present a major problem
- where local wind eddies exist along high mountain slopes. In case of multi-rotor options it can also be
- difficult to acquire photographs maintaining the same line-of-sight (Francioni et al., 2015) and this can
- 290 generate misalignment of photographs and major potential errors during their orientation. Obtaining a
- large number of photographs and using SfM software can, however, reduce these errors and make the
- 292 UAV technique easier and more attractive. An additional current limitation in the use of the UAV that
- especially affects multi-rotor systems is the often limited battery life which can require the UAV pilot be within always which takes  $\frac{204}{1000}$  within always and the takes  $\frac{204}{1000}$ .
- within close range of the take-off/landing area. Where spatially extensive slopes require surveying,
- multiple battery packs may be essential. The advent of inexpensive UAV systems represents the most
   interesting and promising innovation regarding remote sensing techniques as it provides a very powerful
- and flexible instrument for the acquisition of photographs (Colomina and Molina, 2014; Francioni et al.,
- 2015; Westin, 2017; Donati et al., 2017). Their use will, most likely, become more frequent in the coming
- 299 years, and it is important to continue studies on their utilization in the field of engineering geology.

particularly with respect to change detection/slope monitoring and multi-sensor capabilities. A potential
 future disadvantage in the use of UAV technology is the increasing flight restrictions in their use due to
 abuse of the technology from recreational use. In some countries, it may become increasingly difficult to
 obtain approval for UAV flights.

## 304 3.2.5 <u>Airborne LiDAR</u>

305 Airborne LiDAR devices emit up to 150,000 pulses per second and a sensor measures the amount of time it takes for each pulse to bounce back (or return). An IMU integrated with a differential kinematic GPS 306 provides information about the position and attitude of the sensor. Airborne LiDAR offers advantages 307 compared to traditional measurement systems such as the ability to penetrate vegetation cover, (first-last 308 pulse mode), the possibility to record data at night and over a large survey area. Aerial LiDAR is widely 309 310 utilised in engineering geology for landslide hazard mapping and modeling, change-detection, cliff 311 erosion, and rockfall runout (Jaboyedoff et al., 2012; Lato et al., 2016; Piacentini et al., 2015). The use of this technique to detect geomorphic and major structural features for identifying palaeo-landslides has 312 been recently shown by Clague et al. (2015). Figure 8 provides an example of Airborne LiDAR and GIS 313 for highlighting landslide related geomorphic features at Mount Burnaby, British Columbia, Canada. 314

Recently, as a result of the full waveform systems, aerial LiDAR is also being utilized for the

characterization of surface material from the analysis of the physical backscattering measurements
(Sumnall et al., 2016).

## 318 *3.2.6 <u>Airborne LiDAR using an UAV</u>*

With advent of UAV solutions, small LS devices have been installed with the possibility to scan any type of slope surface. This type of LS acquisition presents the same advantages and limitations discussed in section 3.2.4 for DP with UAV. However, it be noted that accuracy, precision and resolution of this technique are poorer than that obtained using ground based systems. This type of platform offers much more flexibility and overcomes limitations related to occlusion and point of observation. The use of UAV LS in engineering geology is not well documented to date but is an area of significant potential future research.

# **4 Remote sensing and rock slope stability analyses**

327 A remarkable quantity of data can be obtained through the use of terrestrial remote sensing techniques.

328 This information can be used for different types of slope analyses, varying from simple kinematic

admissibility tests, to more complex numerical simulations.

## **4.1 Remote sensing and conventional methods of slope analysis**

Conventional methods of slope analysis can include kinematic analysis, limit equilibrium calculations and
 run out analysis (Stead et al., 2006).

Kinematic analysis investigates the likelihood that unfavourably oriented discontinuities will generate discontinuity-controlled instability such as planar, wedge or toppling slope failures. The kinematic test considers the relative slope and discontinuity orientations and the effective friction angle along the

- discontinuity surfaces to determine whether a block can potentially move or not. This type of analysis can
- be carried out using a stereonet and/or 2D/3D vector analysis applied to 2D/3D rock structure models.
  Although a very simple analysis it is a very useful preliminary tool allowing for a first estimation of
- potential failure and identification of potential key blocks. Stead et al. (2006), Brideau et al (2011) and
- Francioni et al. (2015) note that results of this analysis are influenced to a large degree by reliability of the
- discontinuity survey and the accuracy of the slope topography. Recent developments in available
- 342 commercial software allow for including all the measured discontinuities in the rock slope analysis
- 343 (instead of just considering the mean joint set orientations obtained from joint surveys at the slope toe).
- 344 This makes the use of remote sensing techniques highly relevant because the data from remote sensing are
- representative of the entire slope from the toe to the crest. Figure 9 highlights this concept showing a
- comparison of two kinematic analyses that were performed with engineering geological (Figure 9A) and
- remote sensing data (Figure 9B) in the Lorano open pit (Carrara, Italy) (Francioni et al., 2015). The
  results clearly show the difference in the two data sets in relation to the different spatial areas covered by
- the true remains the experiment and an incruing a calculation for the different spatial areas covered by
- 349 the two surveys. The conventional engineering geological survey was performed only in accessible areas 350 while the remotely sensed data from DP covered the entire slope. Figure 10 shows a photograph of the
- while the remotely sensed data from DP covered the entire slope. Figure 10 shows a photograph of the Lorano open pit (Figure 10A) and the 3D model obtained using UAV and SfM techniques (Figure 10B).
- 352 Recent developments in kinematic software allow highly interactive kinematic stability analysis of slopes
- 353 with semi-probabilistic methods of failure modes. The assigning of discontinuity attributes (roughness,
- persistence, infill, spacing etc.) is also supported. Kinematic analysis of a slope should always consider
- the measured spatial location of major structures as determined using remote sensing; this practice,
- combined with the use of structural domains, avoids the identification of "fictitious" failure modes
- 357 indicated on a stereonet but not observed in the slope face. It is emphasized that wherever possible remote
- sensing methods should be supplemented with field mapping and the use of photographic site
- observations. Oppikofer (2009), Brideau et al. (2011) and Francioni et al. (2015) showed that remote
- 360 sensing and kinematic analysis can be usefully integrated with Geographic Information Systems (GIS) for
- developing thematic maps. These thematic maps can clearly illustrate how the results of a kinematic slope
- 362 failure analysis can change with location in the slope, depending on the topographic detail
- recorded/available. Jaboyedoff et al. (2004), using the same approach, developed a code designed to
- integrate structural data into the digital surface model.
- Limit equilibrium methods are routinely used to identify the slope hazard due to translational and 365 366 rotational movements occurring along a distinct failure surface(s). These analyses consider force and/or moment equilibrium conditions and can be performed by stereonet, or preferably 2D/3D rock structure 367 models. They may also be used to provide a preliminary assessment of rock slope toppling failure. 368 369 Analyses are carried out to calculate either a Factor of Safety (FoS) or, through back analysis, a range of 370 shear strength parameters at failure. The results of this type of calculation are based on the geometry of slope (or potential unstable block, depending on the scale of work), material properties, forces involved 371 372 (water pressure, seismic forces, external forces), and discontinuity mechanical properties. In this context the use of remote sensing techniques play an important role in the definition of the discrete location of the 373 discontinuities that form the failure surface(s) and rear release (tension crack) of unstable blocks (a 374 necessary assumption in the limit equilibrium methods), the shape of the potentially unstable block and 375 376 thereby the true potential failure volume (Salvini et al. 2011; 2013). Figure 11 shows an example of this 377 method applied to a rock slope located in Northern Italy along the Domodossola-Iselle railway (after

Salvini et al., 2011). Using a photogrammetric survey carried out with a helicopter (Figure 11A), detailed
photographs of the rock slopes were acquired (Figure 11B) allowing definition of the geometry of blocks
and discontinuities (Figure 11C). This information was used to calculate the deterministic FoS using limit

381 equilibrium software (Figure 11D).

382 The volume of blocks, together with the location (in term of coordinates) of each potential unstable block 383 can also be used for rockfall simulation. Rockfall analysis is based on the study of the slope geometry and 384 the characteristics of potential falling blocks. It is possible to determine the kinetic energy, velocity, "bounce height", end points and lateral dispersion of potential falling blocks for the entire slope. Having a 385 386 good representation of the slope morphology, potential unstable block geometry and land cover is crucial for this type of simulation. Figure 12 shows an example of combined use of remote DP and rockfall run 387 388 out simulation in the Grotta delle Felci Cliff (Capri Island, Italy). The location (Figure 12A) and geometry (Figure 12C) of rock blocks were determined from a helicopter based photogrammetric survey and the 389 390 data used for an improved understanding of the lateral dispersion of the potentially unstable blocks (Figure 12B) in addition to their kinetic energy, velocity and "bounce height" (Figure 12D). This 391 392 approach can be very important in planning protection work (either active or passive), or proposing monitoring systems (Salvini et al., 2011; 2013). Rockfall modelling represents a very powerful tool for 393 394 the study of risk mitigation, especially where rock slopes are located above infrastructure such as roads, train tracks and working areas. Moreover, multi-temporal survey (e.g. with DP, LS, LiDAR and Radar 395 396 Interferometry) can be used for defining debris volume and for change detection (spatial and temporal) 397 analyses (Rosser et al., 2007; Blasone et al., 2014); thermal images and/or LS data can be used to locate 398 seepage that can be included in both conventional or more sophisticated analyses (Vivas et al., 2013;

Gigli et al., 2014).

#### 400 4.2 Remote sensing and more sophisticated numerical methods of slope analysis

401 Although limit equilibrium methods are the simplest and most widely used slope analysis technique their use should, in general, be limited to uncomplicated case studies. More sophisticated numerical methods 402 403 are better suited for the study of slopes of more complex slope geometry and structural geology. 404 Similarly, material anisotropy, non-linear behaviour, in situ stress, groundwater and brittle fracture can all influence the slope stability and often can only be realistically considered using sophisticated numerical 405 simulations. These techniques of analysis, usually called numerical modelling analyses, can benefit 406 407 significantly from remote sensing data, especially where 3D variations in the slope geometry and 408 structure are important in the slope behaviour. Currently the most widely used 3D numerical codes for slope stability analysis are Continuum (Finite Difference and Finite Element) and Discontinuum (Distinct 409 410 Element) codes. Havaej et al. (2015) describe the application of a recently introduced 3D lattice-spring code that utilizes a lattice-based structure, consisting of point masses (nodes) connected by springs. The 411 lattice-spring model simulates rock fracture through the breakage of springs in shear and tension and once 412 413 the spring fails in either tension (normal spring) or shear (shear spring), the tensile strength and cohesion reduce to zero (Havaej et al. 2015). 414

The advantages of the combined use of remote sensing and 3D Distinct Element Methods (DEM) in rock

- 416 slope investigations have been recently described by Francioni et al. (2014) and Spreafico et al. (2015).
- 417 Figure 13 shows an analysis undertaken using two models (with different spatial resolution) of the same

- slope using a DEM. The principal objective of the study by Francioni et al. 2014 was to highlight the
- advantages and limitations of using terrestrial remote sensing data in a 3D DEM. The first model was
- 420 obtained from a topographic map (Figure 13A, B and C) and the second model from terrestrial LS (Figure
- 421 13D, E and F). These simulations demonstrated that the values of Strength Reduction Factor (SRF)
- obtained from the stability analysis can be significantly influenced by the measured geometry of the slope
- 423 (Francioni et al., 2014).
- 424 The use of remote sensing data and the 3D Finite Difference Method (FDM) was illustrated by Francioni
- 425 et al. (2015) in order to understand the stress-induced damage in surface mined areas. Simulations were
- undertaken using the slope geometry derived from DP and LS. In this case, it was possible to increase the
- 427 understanding of stress-induced damage in the Lorano open pit (Carrara, Italy) due to the excavation
- processes (Figure 14A-B). The detailed information on the structural geological setting of the entire slope
   obtained from DP and LS was also used in DEM analysis. Measured data from a conventional
- 429 obtained from DF and LS was also used in DEW analysis. Measured data from a conventional
   430 engineering geological survey (e.g. scan line or window) can often only be used in discontinuum
- 430 engineering geological survey (e.g. scall line of window) can often only be used in discontinuum
   431 modelling of simple rock slopes assuming continuous or persistent joint sets. The data determined from
- remote sensing techniques however can allow for more sophisticated deterministic (using only joints
- visible on the DP/LS model) or stochastic Discrete Fracture Network, DFN, analyses. Figure 15 shows
- 433 visible on the D1/ES modely of stochastic Discrete Fracture (vetwork, D1 N, analyses, Figure 15 shows 434 the differences between the DEM models created using continuous joint sets (Figure 15 A-B) and a DFN
- 435 (Figure 15 C-D).
- 436 It must be emphasized, however, that the time needed for data processing are significantly longer when
- dealing with accurate and detailed slope geometry and that such detailed data is useful in complex cases
- 438 but may be unnecessary in simple slopes where a large scale topographic map can still be suitable
- 439 (Francioni et al., 2014). Havaej et al. (2016) clearly showed the advantages of using terrestrial
- 440 photogrammetry and LIDAR in developing DFN for a slate quarry slope at Delabole, Cornwall, UK.
- 441 Detailed data were used to investigate the influence of different stochastic generated DFN's on simulated
- slope failure mechanisms, the results agreeing with observed slope behaviour.
- 443 Havaej et al. (2015) showed the use of ground-based photogrammetric and airborne LiDAR data in the
- analysis of the Vajont slide, Italy, using a lattice-spring approach. The landslide model was built using the
- airborne LiDAR data while the sliding surface, discontinuity orientations and locations were derived from
- 446 combined field analysis and long-range terrestrial photogrammetry. The use of this 3D-brittle fracture
- software, together with airborne and terrestrial remote sensing data, allowed the authors to improve the
- understanding of the importance of kinematics, internal damage and groundwater levels on the failure ofthe 1963 Vajont slide.
- 450 Wang et al. (2003) and Lorig et al. (2009) showed the use of particle flow codes for the analysis of rock
- 451 slopes. Although this method showed good results for 2D simulations, its use in 3D modelling remains
- 452 computationally expensive. Eberhardt et al. (2004) used hybrids methods, using a Finite Element mesh to
- 453 represent the intact joint bounded blocks and discrete elements to simulate joint behaviour to explain the
- 454 failure mechanism of the Randa rock slide (Switzerland) and Styles et al. (2011) applied it to the back
- analysis of the Joss Bay Chalk cliff (UK). Vyazmensky et al. (2010) and Styles et al. (2011) incorporated
- discrete fracture networks into hybrid numerical models to realistically simulate rock slope deformation
- 457 in the Palabora, South Africa and Bingham Canyon, US, open pits respectively.

- 458 As previously mentioned, apart from slope geometry information DP and LS can also be used for defining
- discontinuity roughness angles and Joint Roughness Coefficient (Haneberg, 2007; Kim et al., 2015;
- 460 2016). Höfle et al. (2009), Kurz (2012) and Park et al. (2016) recently showed how it is possible use LS
- intensity signal and hyperspectral imagery to locate seepage and rock weathering/alteration zones.
- 462 Moreover, rock mass heterogeneities can also be remotely detected to develop ubiquitous joint rock mass
- 463 models (Sainsbury et al. 2016).

## 464 **5** Final remarks and discussions

In this paper, we show how remote sensing data can be successfully used to define the morphology and
structural setting of both natural and engineered slopes, the shape and volume of potential unstable blocks
and the geometry of the potential failure surfaces.

- 468 The selection of a specific survey technique for a given site remains a complex and challenging problem
- which requires knowledge of the terrain, the objective of the project, the availability of funding and
- technologies approved for use in the region (Lato et al., 2015). For this reason, it is important to recognize
- that the methods described should wherever possible be considered as complementing each other rather
- than being competitive.
- 473 In this context, Table 1 and 2 summarize respectively the DP and LS platforms currently available;
- highlighting their advantages and limitations. Airplane and satellite generated data are not included in
- these tables because as previously mentioned, due the nadir point of observation they are not optimal for
- deterministic study of natural and engineered rock slopes. Figure 16 provides a comparison of the DP
- remote sensing platforms discussed in this paper in relation to their cost, simplicity of use and ability to
- 478 avoid occlusions.
- 479 It has been shown how the information gained using these remote sensing techniques can be usefully
- 480 applied within different types of conventional and numerical analyses, and can play a key role in the final
- results of the model simulations. Figure 17 presents additional information that can be retrieved with LS
- and DP and the improvements in terms of input parameters that these techniques can offer conventional
- 483 and numerical analyses of slopes.
- It should be noted that, wherever possible, integrated use of different remote sensing with conventional
  mapping and monitoring investigation techniques is recommended as this allows for the validation of the
  data and an understanding of the advantages and limitations of the proposed methodology.
- 487 The integration of slope monitoring systems with conventional and numerical analyses is a crucial aspect 488 in the study of landslides. This is highlighted by new research on slope monitoring using remote sensing 489 techniques that have been recently proposed by Sharma et al. (2016), Travelletti et al. (2016), Salvini et 490 al. (2015b) and Kromer et al. (2015a; b). The results obtained from this research will improve the
- 491 understanding of landslide behaviour.

# 492 6 Conclusions

This research presents international examples of the application of remote sensing techniques in the study of rock slopes and landslides and highlights the importance of incorporating the data gained from these

- techniques in subsequent stability analyses. We demonstrate the use of the different methods of remote
- sensing surveys and illustrate how each data set can be important in improving the precision and
- 497 reliability of rock slope analyses.
- 498 With regard to DP, considerations of cost and flexibility often make the use of the hand-held camera or
- tripod the most convenient and effective photogrammetric solution. UAV systems are however
- 500 increasingly seen as the preferred option as they are the least expensive aerial option and also provide the
- 501 maximum ability to avoid occlusions.
- 502 With regard to LS, their use is simple and the results are very precise and reliable (especially in the case 503 of full waveform LS). The cost of the equipment is the main limitation of these techniques especially 504 when compared with DP. Occlusions can still be a problem when dealing with very high slopes and 505 ground based platforms. UAV LS systems can overcome this problem but accuracy, precision and 506 resolution of data decrease considerably when compared with ground-based platforms.
- 507 All the described remote sensing survey techniques can provide data sets suitable for incorporation into
- the varied methods of slope stability analysis. This data can overcome many limitations related to input
- 509 parameters and the difficulties in reducing model and parameter uncertainty. Multiple methods of
- 510 numerical analysis can be performed with remote sensing derived data and stochastic methods can be
- 511 used to perform multiple simulations in order to better calibrate model results.
- 512 In kinematic analysis, the use of remote sensing techniques can result in more representative structural
- 513 geological assessment of rock slopes; with continuing development in kinematic and block theory
- approaches, remote sensing data will be more efficiently utilized in slope design and remediation.
- 515 In limit equilibrium analysis, the use of specific block and discontinuity geometry directly available from
- 516 DP and/or LS will lead to more reliable slope analyses as a result of decreased uncertainty related to the
- 517 block volume and discontinuity inclination. Moreover, the block volume, location and shape, together
- 518 with data concerning the slope geometry and land cover will also allow more detailed and realistic
- rockfall runout simulations and the construction of more reliable hazard and risk maps.
- 520 Remote sensing data when incorporated into more sophisticated numerical models provides improved
- slope geometry input and also the possibility to include deterministic and/or stochastic representation of
- discontinuities (especially relevant to future improvements in the 3D analysis of complex slopes). This
- allows improved analyses and increased scope for model calibration. However, the use of complex
- 524 geometry increases the simulation time significantly and it is important to understand when this approach
- 525 is necessary and when it can and should be avoided.

# 526 Acknowledgements

- 527 The authors wish to thank Ms. Megan Dewit and Ms. Allison Westin (Simon Fraser University, BC,
- 528 Canada) for their support during the remote sensing survey along the See to Sky Highway (BC, Canada).
- 529 We are extremely grateful to Dr. Silvia Riccucci for her assistance during the photogrammetric surveys in
- the Carrara marble district and Northern Italy. Moreover, we would like to express our gratitude to the
- reviewers who provided important and constructive suggestions for improving the quality of the paper.

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## **Figure Captions:**

Figure 1. Photogrammetric acquisition methods (Birch, 2006) and Structure from Motion. A) Independentconvergent model. B) Image fan method. C) Image strip method. D) Structure from Motion.

- Figure 2. Photogrammetric image acquisition using A) a tripod and B) a tripod with a reamed bar.
- Fig 3. Full Waveform LS survey of a road cut along the Sea to Sky Highway, BC, Canada. A) RGB
- colored slope model. B) Wave amplitude colored slope model.
- Figure 4. LS survey. A) RGB photograph. B) RGB point cloud. C) Different registered echoes fromnatural targets.
- Figure 5. Equipment used for Digital Terrestrial Photogrammetry with an aerostatic balloon. A)
- Aerostatic balloon. B) Two metre long photogrammetric frame (Francioni et al., 2014). C) Five metre
- 176 long photogrammetric frame (Firpo et al., 2011). D) Electrical winches for driving the system.
- Figure 6. Equipment used for Digital Terrestrial Photogrammetry with a helicopter. A) Steel frame
- adapted to fit a helicopter landing skid. B) Digital camera and GPS antennas. C) GPS data receivers and
- 779 laptop for real time photos visualization.

- Figure 7. UAV survey (after Francioni et al., 2015). A) Falcon 8 UAV with gyro-stabilized digital camera
  Sony NEX-5N. B) Drone during the flight.
- Figure 8. A) 3D view of Mount Burnaby and Simon Fraser University, situated at the top of the mountain.
- 783 View to the southeast. B) 3D representations of LiDAR aspect maps with highlighted slump blocks on the
- north face of Mount Burnaby. View to the southeast.
- Figure 9. Kinematic slope stability analysis performed using A) Engineering geological data (93
- measurements) and B) Remote sensing data (537 measurements) in the Lorano open pit (Carrara, Italy).
- Figure 10. Lorano open pit. A) Photograph of the open pit buttress and B) SfM 3D model.
- Figure 11. DP used for limit equilibrium analysis. A) Photogrammetric survey with a helicopter. B)
- Example of detailed photographs acquired during the survey. C) Geometry of block and joints gained
  from DP. D) Calculation of block FoS using DP data.
- Figure 12. Use of DP data for defining the rockfall run out simulations. A) Location of potential unstable
- blocks. B) Lateral dispersion of blocks in case of failure. C) Example of block geometry reconstruction
- using the stereoscopy and the 3D modelling. D) 2D Simulation of block fall with possible calculation of
- kinetic energy, velocity and "bounce height".
- Figure 13. 3D rock slope models obtained from DP (after Francioni et al., 2014). A) Initial model from
- topographic map B) 3D Distinct Element Model based on topographic map and C) 2D section, D) Initial
- model from terrestrial laser scanning, E) 3D Distinct Element Model based on terrestrial laser scanning
- and F) 2D section. Colours represent the distinct elements (blocks) generated by interaction between
- different joint sets and the topography.
- Figure 14. 3D rock slope models obtained from DP and LS (after Francioni et al. 2015). A) Initial modeland topography pre and post excavation. B) Stress analysis.
- Figure 15. 3D rock slope models obtained from DP and LS. A) Initial 3DEC model. B) 3DEC model
- using continuous persistent joint sets. C) 3DEC model using a deterministic approach. D) 3DEC model
- 804 using a stochastic DFN approach.
- Figure 16. Comparison between DP platforms.
- Figure 17. Improvement that geomatic techniques can offer in conventional and numerical slope analyses.





















Color	Densi	ty Co	ncer	itrations	
	0.	00	•	1.90	
	1.	90		3.80	
1	3.	80	-	5.70	
	5.	70	1	7.60	
	7.	60	-	9.50	
	9.	50	-	11.40	
	11.	40		13.30	
Cont	13.	.30	Mart	15.20	
Conto	ourbata	POR	vect	ors	
Maximum	Density	14.2	2046		
Contour Dist	tribution	Fish	er		
Counting C	irde Size	1.09	No		
Kinematic Analysis	Planar Skd	ing			
Slope Dip	70				
Slope Dip Direction	165				
Friction Angle	30°				
Lateral Limits	20*				
A.		Crit	ical	Total	9/6
Planar	Siding (Al)	0	)	77	0.00%

Color	Densi	ty Concer	trations	
	<u>0</u> .	- 00	0.70	
	0.	70 -	1.40	
	1.	40 -	2.10	
	2.	10 -	2.80	
	2.	80 -	3.50	
	3.	50 -	4.20	
	4.	20 -	4.90	
	4.	90 -	5,60	
Cont	our Data	Pole vect	ors	
Maximum	Density	5.49%		
Contour Dis	tribution	Fisher		
Counting C	ircle Size	1.0%		
Kinematic Analysis	Planar Sid	ing		
Slope Dip	70			
Slope Dip Direction	165			
Friction Angle	30°			
Lateral Limits	20°			
		Critical	Total	9/6
Planar	Siding (Al)	16	537	2.9896
Planar Silding	(Set 1: K1)	12	135	8.89%















Improvement that geomatic techniques can offer in terms of slope stability analysis input parameters	Type of an inp	nalyses ut para	s and p	ossible
Representative 3D slope geometry is guaranteed even in case of complex geometry. Geometry and location of joints in rock slopes is known so that to ensure a realistic understanding of wedge formation. Combined with GIS techniques a deterministic or probabilistic kinematic analysis of the slope can be undertaken.	lysis		1	
Spatial location of data from remote sensing is representative of the entire slope.	and			
Roughness angles, persistence and spacing can be measured using photogrammetry or LiDAR (Kim et al., 2015 and 2016; Park et al., 2016) and be assigned as disconti- nuity parameters or attributes to the poles on a stereonet allowing a more insightful kinematic analysis.	(inematic	analysis		
Block shape and size can be determined as input for block theory.		E	- 0	
Location, shape and volume of every potential unstable block and brittle fracture can be determined making the analysis more realistic and representative.		libriu	alysi	
The presence of eventual loading/support condition and the influence of blasting can be considered.	1	equi	ut ar	ods
Accurate slope profile may be derived.	1	it i	2	÷
Rear and lateral release as well as failure scars, slope curvature and localized under- cut may be defined.	1	1	Ru	al me
Vegetation and especially roots interacting with potential sliding surface can be locat- ed.	1			neric
Different land covers on the slope can be recognized together with rockfall scars, fac- tors promoting rockfall and evidence of previous failure. Multi-temporal survey (e.g. with DP, LS, LiDAR and Radar Interferometry) can be used for defining debris vol- ume and for change detection (spatial and temporal) analyses (Blasone et al., 2014).				cated nun
Aerial and terrestrial remote sensing and GIS can be used to detect geomorphic and major structural features and for identifying palaeo-landslides (Clague et al., 2015) and constrain geomechanical models (Sharma et al., 2016).				sophisti
Heterogeneities can be detected to develop ubiquitous joint rock mass models (Sainsbury et al., 2016).	1			More
Thermal images and LS can be used to locate seepage in the slope (Vivas et al., 2013; Gigli et al., 2014).	1			-
Thermal and hyperspectral imagery and LS can be used to locate rock weathering and alteration zone (Park et al., 2016).	]			
DFN can be derived and used to understand the role of brittle fracture, persistence, rock bridges, step-paths and connectivity (Elmo, 2006; Tuckey et al., 2013; Hamdi et al., 2015).				

DP with UAV	DP with helicopter	DP with aerostatic balloon	DP DP with hand-held camera and tripod
Overcomes problems related to elevation, steepness and complex slope geometry. Does not require the area to face the object under study. Cheap UAV platforms now readily available. Freely available software for data acquisition, flight planning and data processing.	Overcomes problems related to elevation, steepness and complex geometry of slope. Does not need an accessible area facing the slope under study. It is possible to check the photographs acquisition in real time from the helicopter. Differential GPS and IMU control allows calculation of the position and attitude at the moment of the photograph acquisition. Hardware mounted or hand held cameras can be used.	Overcomes problems related to elevation, steepness and complex geometry of slope. With favourable weather conditions photographs can be acquired with high precision without problems related to the stability of the frame.	Advantages Simple and economic to use. Full control of the camera. In case of tripod, photographs can be acquired with great precision without problems related to vibrations and stability. Wind does not usually affect the survey.
Prone to instability during the photograph acquisition which can result in misalignment of photographs and major error during the orientation process. Acquiring a large number of photographs and using SfM techniques can reduce these errors. Weather conditions can limit the use. Limited battery life requires careful flight planning and may limit application in remote areas. UAV regulations may restrict use or preclude use in some cases. High number of photographs that require processing may necessitate use of high end graphics works station to limit computer run times.	Very expensive in terms of helicopter time requiring careful flight planning. Can be difficult to keep the vehicle stable and in the same direction during data acquisition (this can create major errors during the orientation process; obtaining a large number of photographs and using SfM techniques can reduce these errors). Weather conditions can limit surveys including wind, sun glare on light colour outcrops and restricted visibility due to cloud.	Requires experienced user. Maximum elevation of 300 m. Cannot be used where difficult access exists and the slope area is not viewable. Unfavourable weather conditions prevent data acquisition. Use of helium gas is expensive compared to the use of hand-held camera and tripod methods.	Limitations Presence of occlusions in the case of very high slopes. Not possible to use in case of inaccessible areas not facing the object under study. Lighting conditions and distance to outcrop can compromise the survey

Table 1. DP platforms: advantages and limitations.

LS	Advantages	Limitations
Ground	Simple to use.	The LS instruments are expensive.
based LS	Slope geometry and geological structure can	Presence of occlusions in the case of very
	be rapidly obtained with high precision.	high slopes.
		Not possible to use in case of inaccessible
		areas not facing the object under study.
Mobile LS	Slope geometry and geological structure can	The LS instruments are expensive.
	be rapidly derived.	Presence of occlusions in the case of very
	Survey of long slope section can be very	high slopes.
	fast.	Precision and accuracy of point cloud can be
		lower when compared with ground based
		platforms.
		Registration of point clouds can be
		complicated (Michoud et al. 2015).
LS with UAV	Slope geometry and geological structure can be rapidly obtained.	High cost of LS instruments to be mounted on the UAV.
	Overcomes problems related to elevation,	Precision and accuracy of point cloud
	steepness and complex slope geometry.	decrease significantly when compared to
	Does not need the area to face the object	ground based platforms.
	under study.	Weather conditions can severely limit use.
	UAV platforms now available.	Limited battery life requires careful flight
	Freely available software for data	planning and may limit application in remote
	acquisition, flight planning and data	areas. UAV regulations may restrict use or
	processing.	preclude use in some cases.
Tablas I Cala	therms: advantages and limitations	

Table 2. LS platforms: advantages and limitations.