1 Current and future role of instrumentation and monitoring in the

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25 Abstract

- 26 Instrumentation is often used to monitor the performance of engineered infrastructure slopes. This
- 27 paper looks at the current role of instrumentation and monitoring, including the reasons for
- 28 monitoring infrastructure slopes, the instrumentation typically installed and parameters measured.
- 29 The paper then investigates recent developments in technology and considers how these may
- 30 change the way that monitoring is used in the future, and tries to summarise the barriers and
- 31 challenges to greater use of instrumentation in slope engineering. The challenges relate to
- 32 economics of instrumentation within a wider risk management system, a better understanding of
- the way in which slopes perform and/or loose performance, and the complexities of managing and
- 34 making decisions from greater quantities of data.
- 35

36 Notation

- 37 AGS-M Association of Geotechnical and geoenvironmental Specialists Monitoring standard
- 38 CRI Capacitive Resistivity Imaging
- 39DEMDigital Elevation Model
- 40 ERT Electrical Resistivity Tomography
- 41 GPR Ground Penetrating Radar
- 42 LiDAR Light Distance and Ranging
- 43 MEMS Micro Electrical Mechanical System
- 44 Radar Radio Detection and Ranging
- 45

46 **1. Introduction**

- 47 Linear earthwork assets in the form of cuttings and embankments are a major component of
- 48 modern transport systems, and their performance is critical to ensuring transport operations are
- 49 safe and reliable. Earthwork slope failures pose significant hazard: failures in embankments may
- 50 undermine roads and railways, slips in cuttings may cause material to obstruct transport routes
- 51 posing risks to drivers and derailment of trains (e.g. Table 1), and there are numerous locations
- 52 where road and rail routes span large, and often slow moving, landslides. Across Europe, field
- 53 monitoring is widely used to help understand mechanisms of movement and deterioration, assess
- 54 condition and risk, and provide design parameters for repair of slopes.
- 55 Geotechnical monitoring is usually only applied to earthworks or natural slopes that are causing or 56 showing specific problems, often in the form of excessive displacements. A common approach is to
- 57 drill boreholes and install instrumentation to measure soil displacement and groundwater levels:

- these may be used in assessment of potential risk or early warning (if movements accelerate), or in
- analysis of stability or design of remedial measures. Accessing steeply sloping ground to drill
- 60 boreholes for instrumentation can be costly, and monitoring of this type can only be applied to
- 61 slopes causing significant hazard.

62 Regular assessment can identify slopes that may be at risk of failure: this is often carried out by visual inspection (looking for signs of movement), combined with information on the slope angle, 63 64 and the nature of ground and potential ground water conditions. There are limitations to such 65 assessments: vegetation can often obscure signs of ground movement; slopes may not always show 66 signs of distress and instead fail in a brittle and rapid manner; the exact nature of ground and water 67 conditions is often estimated. Visual inspections may have limited usefulness in predicting the onset 68 of instability, as they provide little or no information on subsurface processes that are a precursor to 69 slope failure. Slopes that are not necessarily known to be a hazard can fail unexpectedly, presenting 70 problems for the safe operation of transport systems. As a result, there is growing interest from 71 asset owners in more pervasive approaches that would enable more widespread condition 72 monitoring of geotechnical assets. Such approaches rarely involve drilling boreholes as this would be 73 too costly to apply to long lengths of asset; instead many apply monitoring of surface displacements 74 or strain, soil water content, or climate. A network of sensors can also be linked by wireless 75 connections, with data uploaded to the internet. Geophysical monitoring (e.g. by means of ERT 76 (Electrical Resistivity Tomography) and seismic methods), remote sensing using satellites, or ground 77 based radar or LiDAR (Light Distance And Ranging), all provide alternative pervasive approaches. 78 However, many such systems are relatively untried for monitoring of engineered slopes, and it is not 79 completely clear how monitored parameters such as surface displacements or soil moisture content 80 should be used in indication of increased risk or incipient failure; there is often insufficient 81 knowledge about slope processes to link physical parameters with risk of failure.

82 Where problem slopes are large, or are in very challenging terrain, continual monitoring and assessment may be applied instead of remedial measures, which may simply be impractical due to 83 84 excessive size or cost. Monitoring can be used to gauge the likelihood of incipient failure, and 85 provide early warning. In such circumstances, monitoring needs to be continuous, reliable, reported 86 in near 'real time', with clear criteria to suit the level of expertise needed to make a judgement 87 (Stahli et al., 2014). Asset owners commonly differentiate their monitoring systems depending on 88 function, so that a safety critical system would be defined as an "alarm" system and would have 89 additional stipulations on its set up and use compared with a conventional "monitoring" system. For 90 large time-series data sets, for which manual interrogation is impractical, automated systems may 91 process and analyse data to determine when critical predefined thresholds have been exceeded (e.g. 92 Smith et al., 2014b). The reliability of an instrumentation system is dependent on continued 93 operation of instruments often placed in challenging environmental conditions, and the setting of 94 suitable thresholds. False alarms can be costly in terms of money, confidence and reputation if they 95 unnecessarily halt rail and road traffic.

- 96 Instrumentation may also be used for research, to provide long records of how slopes may
- 97 progressively deteriorate with time, or how long periods of climate may influence pore pressures
- 98 and movements (e.g. Smethurst *et al.*, 2012; Springman *et al.*, 2012a). This information obtained
- 99 from instrumentation may be vital in understanding deterioration and modes of failure (of which
- 100 there may be many); this information can feed back into improved conceptual and numerical models

- 101 that seek to identify assets that may be at risk. In some geologies and environments, deterioration
- 102 mechanisms are complex, and there is considerable progress still to be made in working out how to
- 103 monitor these and incorporate them in models (Dijkstra and Dixon, 2010; Springman *et al.*, 2012;
- 104 Briggs *et al.*, 2016).

105 Climate change presents an increased risk to slopes. Research starting to investigate the impact the

- 106 climate change may have on transport slopes indicates that more extreme periods of climate,
- 107 coupled with aging assets, may cause a higher rate of failures. Climate changes that pose a threat to
- 108 engineered slopes include more extreme rainfall events (both heavy showers and long periods of
- rain), drought and increased freeze-thaw cycles (Springman *et al.*, 2009; Clarke and Smethurst, 2010;
- Bles *et al.*, 2014). A greater use of instrumentation may help to manage the risk that climate change
- 111 poses to transport systems.
- 112 There is evidence that proactive management of slopes can be much more cost effective than
- reactive repairs following failure (Glendinning *et al.*, 2009). Instrumentation and monitoring can
- 114 form an important component of a long-term earthworks asset management strategy. Asset owners
- are often required by regulatory bodies to show continual improvement in asset management and
- safety; this has included investing in greater use of monitoring to control and manage risk. Thus the
- 117 opportunities to use and develop techniques for condition monitoring are now very favourable.
- 118 In summary, there are several uses for instrumentation and monitoring in geotechnical asset
- 119 management; and a plethora of challenges. This state-of-the-art review seeks to consider existing
- 120 conventional approaches to instrumentation for slopes (what to monitor for a range of applications);
- 121 to look at new instrumentation and technology that may seek to change monitoring approaches for
- slopes (with examples of several systems under development/trial); and seek to 'futuregaze' at the
- 123 next set of challenges that new technology will pose, and suggest how instrumentation should be
- 124 developed in the future.
- 125

126 **2. Applications for monitoring**

- 127 A number of applications for instrumentation and monitoring of infrastructure slopes have been
- 128 considered in the introduction, and these will be described in further detail here. These may be
- summarised as: i) monitoring the condition of slopes (which may include earthworks that are subject
- 130 to significant changes in loading or profile, and verifying the performance of remedial measures); ii)
- 131 obtaining parameters for use in design of remedial schemes (in combination with a model); iii) early
- 132 warning systems to provide alarm or indication of incipient failure; iv) monitoring slopes to manage
- risk at the infrastructure corridor scale; v) monitoring slopes to understand mechanisms of
- 134 degradation and response to trigger events, to provide better conceptual models of slope
- 135 performance; and vi) in development and testing of new instrumentation. This list may not be
- exhaustive, but many monitoring needs should fall within one of these categories.
- 137 All applications for monitoring should have an overarching aim of assisting asset management,
- 138 which may be defined as: 'co-ordinated activities and practices through which an organisation
- 139 optimally and sustainably manages its assets and asset systems, their associated performance, risks
- 140 and expenditure over their life cycles for the purpose of achieving its organisational strategic plan'

- 141 (Hooper et al., 2009). However, each of the applications listed above may address different parts of
- an asset management strategy, and thus have a differing specific aim for which the type of
- 143 instrumentation, reading intervals and duration, volume and processing of data, and analysis and
- decision making process may all be very different (Dunnicliff, 1993). Table 2 provides further
- consideration of these common applications. Note that Table 2 may not cover all applications, and
- there are also other ways of categorising monitoring approaches and systems (e.g. see Hooper *et al.*,
- 147 2009).
- 148 Members of the COST Action have provided details for a number of key example case histories, for
- 149 which extensive monitoring data sets are available, covering a range of the applications above. Some
- are referenced in the 'example case histories' column of Table 2, and full details of the sites,
- 151 including owners of the datasets are given on the Action website <u>www.bgs.ac.uk/cost1202/</u> (where
- 152 they are labelled "WG2 completed proformas".
- 153

154 **3. What to monitor**

155 An instrumentation and monitoring scheme should be designed and set up to achieve specific aims

- 156 (Dunnicliff, 1993; Chapman *et al.*, 2012): six applications with different aims have been considered in
- 157 Section 2. The intended aims of the scheme should dictate the monitoring objectives, which lead to
- detailed design of instrumentation type, number of instruments, method of installation, data
- 159 collection approach and reading interval, and how the data is stored, analysed and interpreted. The
- design of a monitoring scheme should be guided by previous site investigation information, and insome cases a detailed ground model (Fookes, 1997) and the predicted hazard.
- 162 This paper does not intend to be an exhaustive guide to all available types of instrumentation,
- 163 however suggestions for the parameters that could be monitored for each of the applications of
- 164 monitoring are given in Table 2. These are only indicative, and may vary considerably for the wide
- 165 range of possible sites and geology that could fall into each category.
- 166 The commonly measured parameters are:
- 167 • Ground displacements. These are commonly measured using inclinometers, extensometers, 168 tilt meters, and crack meters (measuring lateral, vertical, rotational and extensional movements respectively). There are also many approaches to measurement of surface 169 170 displacement, such as using photogrammetry, radar interferometry and LiDAR. 171 Displacement or strain tends to be fairly easy to measure, and in-ground instruments in particular can do so with considerable precision, if installed and read carefully. 172 173 Measurements can show if ground displacements are taking place, to what depth 174 movements occur, and the magnitude of displacements. It is notable that slope stability is 175 controlled by stress (the strength of soil and rock materials, as input into a stability analysis), 176 but stresses in the ground are difficult to measure and may be dependent on the stress 177 history of the soil, which is often unknown. Strains (or displacements) are measured instead. However, to gain understanding of the failure mechanism from these measurements there is 178 generally a need to understand the stiffness and deformation behaviour of the soils 179

concerned. Trying to judge incipient failure using displacements in very stiff (or very soft – in
 the case of some glaciomarine clays) brittle materials, may be difficult.

- Ground water pressures. Increased strain or complete failure in many slopes is caused by
 changes in effective stress, in turn caused by increases in pore water pressure. Thus pore
 water pressures are commonly monitored, using a range of differing types of piezometer. In
 partially saturated slopes, stability may be aided by pore water suctions, and instruments
 that can measure suction or loss of suctions may be important (see Ridley *et al.*, 2003;
 Springman *et al.*, 2012).
- 188 Climate or weather. Rainfall is commonly monitored, as this has a direct influence on 189 saturation of the ground and soil pore water pressures. Depending on the nature of the 190 ground, periods of prolonged heavy rainfall, over hours, days or months will cause pore 191 water pressures to rise, possibly triggering failure. Longer term records of rainfall, often 192 combined with evaporation or evapotranspiration to give effective rainfall, can be used as an 193 indication of increased periods of risk of slope instability (Clarke and Smethurst, 2010). Very 194 short high intensity rainfall events can trigger slope failure, and are also often of interest. 195 Temperature, and in colder climates, ground temperature, is also important; for example, 196 thawing of frozen ground can lead to increased water pressures which may destabilise 197 slopes.
- There are a wide selection of monitoring approaches available for slopes, including different modes of sensor deployment (explored further in Section 4), the measurement of parameters not listed above, and use of techniques that are less well established and/or still in development. The selection of instrumentation to meet the specific objectives of a monitoring scheme usually considers the accuracy, precision, sensitivity, reliability and spatial and temporal resolution of different techniques (Dixon *et al.*, 2015). Detailed descriptions of well-established geotechnical instrumentation
- approaches are given by Dunnicliff (1993), and are also categorised in the recent European
- 205 geotechnical monitoring standard (BS EN ISO 18674-1, 2015). Novel monitoring approaches will be
- 206 considered in Section 5.
- 207 Comments on the frequency of readings, and interpretation of resulting data, for the six different
- categories of monitoring application, are given in Table 2. Some of the applications that require large
- 209 quantities of data to be analysed rapidly remain quite challenging, and some of the issues
- surrounding these will also be discussed in Section 5.
- 211

212 4. How to monitor

- 213 Monitoring can be carried out using a wide range of modes of sensor deployment for example,
- from repeated manual measurements within a borehole for determining changes at a site scale, to
- 215 satellite-based sensors for monitoring ground surface displacements at a regional scale. Key
- 216 distinctions include: i) ground based versus remotely located sensors (airborne/satellite); ii) static
- 217 versus dynamic (moving) sensors; iii) surface versus subsurface information; iv) point sensors verses
- 218 spatial or volumetric monitoring technologies; v) permanently deployed sensors versus manually
- repeated measurements with temporary sensors; and vi) telemetric versus manual data retrieval.
- 220 The mode of deployment has major implications for coverage, spatial and temporal resolution, and
- the cost of monitoring.

- 222 Remote sensing techniques using airborne and satellite based sensors can provide a very cost
- 223 effective means of acquiring high resolution information of the ground surface over very large areas
- (Castagnetti et al., 2013; Cigna et al., 2014; Hardy et al., 2012; Hugenholtz et al., 2015; Miller et al.,
- 225 2012; Wasowski *et al.*, 2014), but are generally limited in terms of temporal resolution (which is
- based on satellite orbits or flight schedules) and provide only surface or very near-surface
- 227 information. For smaller infrastructure slopes (versus large landslides) spatial resolution may also be
- insufficient, and remote sensing techniques can also be impeded by the dense vegetation cover
- 229 present on some infrastructure slopes (e.g. Miller *et al*. 2007).
- 230 Dynamic ground based sensing systems, such as terrestrial LiDAR (Light Detection and Ranging; Fan
- et al., 2014; Lato et al., 2009 and 2012; Marjanovic et al., 2013), radar inferferometry (Springman et
- 232 al., 2012; Caduff et al., 2014), ground penetrating radar (GPR; Donohue et al., 2011 and 2013; Silvast
- et al., 2013) and capacitive resistivity imaging (CRI; Kuras et al., 2007) can obtain greater spatial and
- 234 subsurface information, but are limited in terms of temporal resolution by the need for manual data
- 235 collection, and therefore can be expensive when frequent (i.e. high temporal) resolution monitoring
- is required.
- 237 Point sensors can give very good resolution and accuracy, but are inherently limited in coverage (i.e.
- 238 they measure only within the immediate vicinity of the sensor) but spatial imaging techniques,
- such as electrical resistivity, seismic methods, and ground penetrating radar (Donohue *et al.*, 2011;
- Loke et al., 2013) can complement point information and help with interpretation in
- 241 ground/groundwater conditions that are heterogeneous. Wireless sensor networks (Gong et al.,
- 242 2013) and fibre-optic approaches (Zhu *et al.,* 2015) have been developed that can also provide
- 243 information at increasing spatial scale. Permanently deployed point sensors coupled with low power
- 244 electronics and data telemetry can achieve very high temporal resolution and near-real-time
- information delivery (Chambers *et al.,* 2014; Smethurst *et al.,* 2006). Systems that operate remotely
- and automatically and interface with a wide range of permanently deployed sensor types are
- 247 becoming increasingly well developed (Intrieri *et al.*, 2012).
- 248

249 **5. New Instruments and innovation**

250 New forms of instrumentation and the increasing ability of computing and the internet to distribute, 251 manage and process large amounts of data provide exciting opportunities, as well as challenges, for 252 slope monitoring. This section looks at a number of developing monitoring technologies, their 253 maturity (whether they are at early phases of development, or becoming increasingly established 254 e.g. with numerous field trials), and the changes that they will or may provide in monitoring of 255 infrastructure slopes for a wide range of purposes. It also considers potential changes that more 256 sophisticated montoring systems may have on management of data, decision making and 257 communication.

258 New measurement technologies

- A range of new monitoring technologies are being used or developed for monitoring of slope
- stability, and a number of these, with their abilities, limitations and maturity, are described in Table
- 261 3. It should be noted that Table 3 is not exhaustive, as turning to landslide monitoring gives other

- 262 novel approaches, such as using extensometers running parallel with the slope surface (Wang et al.,
- 263 2008). The constraints on space also mean that it is not possible to include all advantages or
- 264 limitations, particularly those relating to very specific applications.
- The novel forms of instrumentation in Table 3 seek to provide a range of improvements overconventional techniques, including:
- Higher resolution data, both in time and space
 Lower costs, including both the cost of the instrumentation and installation particularly the need to drill fewer or smaller boreholes, or in the case of some remote sensing approaches, drill no holes at all. Cost can be a major driver in instrument/technique selection.
- Automated monitoring systems that collect and transmit data, and in some cases
 automatically process and compare it with thresholds to provide an alarm (e.g. of increasing
 displacements). Automated systems also reduce the need for manual measurements and
 the need to put personnel in potentially hazardous environments.
- Greater life-span for instrumentation for example, localised shear surface displacements of about 50 to 100 mm can render inclinometer casings unusable; in contrast, shear surface displacements in excess of 100's of mm have been recorded using Shape Acceleration Array (SAA) systems (Buchli *et al.*, 2013; Dasenbrock, 2014) and active waveguide AE monitoring systems (Smith *et al.*, 2014).
- 280 Several of the techniques in Table 3 are reaching maturity, and are starting to be commonly adopted
- for geotechnical and structural monitoring (e.g. the Shape Array), while others are still in the earlier
- stages of development. Some are well established monitoring techniques, but their use for
- 283 infrastructure slopes has been limited (e.g. optical fibres), and they still require application specific
- 284 development, with careful trials before wider application to the transport network.
- 285 Several of the relatively new techniques are being actively developed by members of COST TU1202:
- the British Geological Survey have been developing ERT for earthworks moisture monitoring (e.g.
- 287 Chambers et al., 2014; Gunn et al., 2015), and Loughborough University, UK, have been developing
- and are now starting to commercialise an acoustic system for monitoring slope displacement rates
- 289 (called ALARMS; Smith *et al.*, 2014a; Smith *et al.*, 2016). Both of these systems show considerable
- 290 promise: ERT as a means of imaging moisture changes in earthworks, and ALARMS as a low cost
- warning system for slope movement. Both have been installed in an embankment research facility at
 Nafferton, Northumberland, UK, to test their abilities against conventional instrumentation (Fig. 1;
- for further details, see Hughes *et al.*, 2009; Glendinning *et al.*, 2014); such facilities are valuable for testing new approaches in a controlled environment
- testing new approaches in a controlled environment.
- Table 3 identifies three techniques that have been little used so far for monitoring infrastructure
 slopes and which all show some promise, particularly as more pervasive approaches for condition
 monitoring of long-lengths of asset at relatively low cost. These are:
- Optical fibres used to measure surface strain in slopes (rather than in a borehole). As the monitored fibre can be long, the technique is potentially suited to monitoring significant lengths of asset. Fibres could be buried longitudinally, a short distance below the crest of a slope. The limitations and challenges are the relatively high cost of the equipment needed to read the strain in the fibre (although this is reducing in price), the need to correct for

- temperature effects, and the uncertainty as to how the fibre will deform in response to
 slope movements. Time domain reflectometery (TDR) does not measure strain, but can
 identify the location where distortion takes place within a coaxial cable, and thus may be
 able to perform similar role, potentially at lower cost.
- 307 Remote sensing technologies such as LiDAR, and photogrammetry, using data from • 308 satellites, aerial vehicles or terrestrial systems. Both techniques are becoming common for 309 terrain mapping and monitoring surface change for large landslides and rock slopes. The methods could be used to measure surface deformation of infrastructure slopes, but 310 311 challenges include developing a suitable monitoring platform (rail or road vehicles, or an 312 aerial approach), a system for handing large quantities of data (point cloud data from LiDAR; 313 images for photogrammetry), and the resolution and accuracy of surface change detection 314 including in the presence of vegetation.
- Wireless sensor systems, with wirelessly networked probes such as tiltmeters and moisture
 content probes used across/along an asset. These are already being developed for slope
 monitoring applications, particularly to provide alarm of slope movements (Network Rail,
 2015). If a record of measurements is required for condition monitoring, transmission of
 large quantities of data has significant power demands, and there is still some uncertainty as
 to how surface or near-surface point measurements can be used to indicate deterioration or
 incipient failure of a slope.
- All of the above require further investigation and then potentially development and testing for use with infrastructure slopes. In development of new approaches, collaboration between asset owners, instrumentation contractors and research institutions is important to ensure any new methods align to practical monitoring/asset management needs.

326 Datalogging and transmission

Not included explicitly in Table 3 are recent advances in datalogging and transmitting technologies,which may be summarised as follows:

- 329 Use of less power - commercial datalogging systems can operate with low power • 330 consumption, particularly to monitor instruments and store data, such that it is possible to 331 run small dataloggers for many months or even years from a single small battery cell. Transmission of data wirelessly has a greater power need, and batteries then need charging 332 333 systems such as fuel cells or photovoltaic panels, although approaches to careful use of 334 power, such as turning on only once every hour to transmit data, can be adopted. Energy harvesting from vibration is also used, for which a number of commercial systems are 335 336 available (e.g. Perpetuum, 2016).
- Ability to transmit greater quantities of data at speed new 3rd and 4th generations of
 mobile data technology means it is now possible to send significant quantities of data via
 mobile phone networks. Local wireless data networks that transmit between adjacent
 monitoring nodes are also becoming commonplace, and are particularly helpful in
 geographically diverse systems.
- On-site data processing the reducing cost of computing power and bespoke circuitry mean
 that it is now possible to have systems that monitor and process data continuously. This has

- 344 been critical for the development of some novel systems, e.g. acoustic emission monitoring (Dixon et al., 2015), and monitoring by geophones and accelerometers. 345
- 346 All of the above allow systems that require less human intervention, in readings, downloading data, 347
- and in maintenance (e.g. changing batteries). This is likely to reduce costs, and avoid the need to put
- 348 people into remote and potentially hazardous environments.

349 Data management

- 350 The reducing cost of electronic in-place sensors and improved datalogging systems mean that it is 351 now possible to both install more sensors and take and store many more readings from instruments 352 than was possible in the past. This enables a much better granularity of spatial and time-based 353 information; for example, readings every few minutes rather than days or even weeks apart can 354 provide truer representations of physical processes, such as how water pressures may react to 355 extreme short-duration rainfall events. This level of detail can be helpful in assessing risk, as well as
- 356 in understanding the physical processes that take place. Such short-interval readings are essential to
- 357 real-time alarm systems.
- 358 The disadvantage is more data to transmit, store and process. However there are increasingly 359 sophisticated commercial systems that collect and store data, process it into engineering units, and 360 post it onto secure web portals where it can be viewed. Alarms can be set to alert key decision 361 makers if certain pre-set trigger levels are exceeded. Standardised data formats such as AGS-M, 362 which enable easier sharing of information, are becoming common (Richards et al., 2003). These are 363 likely to become more important as assets are monitored over longer periods, giving flexibility in updating hardware and software and interoperability between proprietary systems. There have also 364 365 been advances in commercialisation of techniques for processing data – such as in software for 366 photogrammetry applications.
- 367 Collection and monitoring of more information is part of a technological trend towards 'big data', 368 which is becoming increasingly important across wide areas of the European economy. Data on 369 engineered slopes may be generated during design, construction and operational phases, i.e. the 370 whole life cycle of the asset; geotechnical monitoring information may be a part of this data-set. 371 Many large highway and railway infrastructure owners increasingly store information on their assets 372 within large databases, many of which are linked to geographical information systems (GIS). These 373 are a digital representation of the physical and functional characteristics of assets, and act as a 374 resource for sharing and visualising information and knowledge. For example, the United Kingdom 375 highway agencies have a system known as HAGDMS (Highways Agency Geotechnical Data 376 Management System; Morin et al., 2014), in which information is associated with relevant assets in 377 geographical space. These systems share many similarities with Building Information Modelling 378 (Eastman et al., 1974), although there are differences, for example the linear nature of the 379 infrastructure makes 2D rather than 3D representation of an asset more appealing.
- 380 Traditional monitoring approaches produce periodic reports, which might be attached to an asset within the GIS system. The capability of current systems to hold large data sets is less certain, and 381 382 may become challenging as the number of sensors and frequency of readings increases. However, GIS systems that distribute on a fine spatial scale risk information, often in real time (for example, 383
- 384 linked to antecedent and forecast rainfall), are becoming more commonplace, and it is plausible that

- in the future this could include near real-time weather or asset monitoring data (e.g. local rainfall, or
 soil water content). A good example of this is the Norwegian national system XGEO (Fig. 2;
- 387 www.xgeo.no).
- 388

389 6. Decision making and communication

- 390 Monitoring data is commonly used to make a range of decisions about infrastructure slopes,
- including assessing risk of failure, and the need for interventions such as stabilisation works. Where
- 392 monitoring is already in place the asset will usually have already been identified as being at risk and
- there may be a requirement to make decisions (such as to reduce traffic speed or completely close a route) rapidly to maintain safe operations. Formal frameworks for these decisions vary according to
- operator (Highways Agency, 2010; IPWEA, 2006; CEDR, 2011) and are usually linked directly to risk
- assessment frameworks (either generic or site specific; ERA-NET, 2010). In some instances,
- 397 exceedance of a particular threshold value(s) will result in automatic responses, which will then be
- 398 validated by a responsible engineer. It is important that a control/decision making framework
- 399 carefully sets out the responsibilities of personnel that will be involved, and that decision makers
- 400 have appropriate experience and confidence to ensure good judgements.
- 401 Setting or choosing appropriate thresholds against which to assess monitoring data can be difficult,
- 402 as many infrastructure slopes are unique in construction history, geometry and geological
- 403 conditions. Where the ground is actively moving, rates of displacement can be monitored, but it can
- 404 nonetheless be difficult to decide the risk posed by an increased rate of movement. Predicting the
- 405 transition from slow acceptable movement to rapid catastrophic movement is difficult. Sometimes it
- 406 is necessary to monitor slopes over a period of time to assess movements in response to
- 407 hydrological changes to understand how local thresholds may be set (e.g. Reid *et al.*, 2008;
- 408 Eberhardt *et al.*, 2008); this observational approach is common in managing uncertainty in
- 409 geotechnical engineering (Chapman *et al.*, 2012). Thresholds levels can be set using a
- green/amber/red system of increasing risk with colour (e.g. the XGEO system in Fig. 2 uses this in
- 411 context of national hazard mapping). Thresholds are often based on safety or performance criteria,
- 412 such as the need to maintain railway track line and level.
- 413 Where monitoring systems play a critical safety role, reliability of the instrumentation and
- 414 monitoring system is particularly important. False alarms can be a major issue, particularly if these
- result in rail and road traffic being halted unnecessarily, or are in remote sites that take an engineer
- 416 a long time to reach. It is important that instrumentation systems are designed to be robust, and
- 417 that may include incorporating redundancy, or providing other means by which alarms can be
- 418 rapidly checked by experienced personnel such as providing video or images of the site accessed via
- 419 the internet (e.g. Network Rail, 2015).
- 420 In the context of engineered slopes, important decision makers will include the earthworks
- 421 engineering/asset management team, who are typically responsible for the performance and safety
- 422 of assets in a particular region of the transport network, and operations personnel involved with
- 423 ensuring the smooth running of transport systems. Others potentially using monitoring information
- 424 to make decisions include strategic transport planners within government who will make investment
- 425 decisions for major upgrade programmes or for new routes, and the general public who will make

- 426 decisions on journey planning when provided with appropriate information, e.g. enhanced risk of
- 427 disruption due to extreme weather.

428 Forecasting and communicating periods of enhanced risk

429 Risk is often assessed at the corridor or network scale, where there may be an increased risk of 430 failure and thus disruption to operations during and after long periods of heavy rainfall, or prolonged 431 very dry periods (which may cause shrinkage of clay earthworks). There are established 432 methodologies for assessing geotechnical risk over lengths of corridor (Gavin et al., 2016) and these 433 can incorporate antecedent conditions and/or forecast weather, combined with geological and 434 topographical information. The Norwegian XGEO system uses hydrological (soil water content) 435 information to assess potential risk of landslips on 1 km grid squares at a national scale (Fig. 2; Boje 436 et al., 2015; Devoli et al., 2014), and a demonstrator system is being developed for the UK London to 437 South West rail routes (Sadler et al., 2015) that determines earthworks risk based on geology, soil 438 moisture conditions and forecast rainfall. More sophisticated systems could incorporate underlying 439 slope failure models based on approximate soil properties and the geometry of the earthworks, 440 although it could be challenging to predict failure within individual slopes as key data (geometry, 441 geology, condition) and models of failure are often insufficient or too simplistic (Glendinning et al., 442 2015; Elia et al., 2016). Nonetheless, such a system could be valuable if coupled with near-future 443 weather data (e.g. impending storms) to assess the broader probability of slope failure causing 444 disruption to transport operations. Local monitoring data could also be incorporated within a system 445 to improve estimates of risk, although this may require processing of large amounts of data through 446 multiple iterations of models, requiring significant computational resources.

447 XGEO is publically available in Norway, and is used to help communicate risk and thus the potential

448 for travel disruption (from a range of hazards including geotechnical failure) to the general public.

449 This information provision can be key in helping the public to make informed decisions about how

450 and when to travel.

451

452 **7. The future – where do we go next?**

453 Many European countries have mature road and rail systems, some of which are now quite old; for 454 example, many rail earthworks have been used for 100 years or more. Despite their age, the 455 demand for travel is growing in many European countries: for example, rail use in the UK has grown 456 by more than 50% since 2000 (Powrie, 2014) and is expected to double in the next 25 years. The 457 public expectation for performance and reliability is also greater, and this poses challenges for linear 458 infrastructure systems in which elemental failure can cause disruption to large lengths of route. 459 Increasing safety is also expected of public infrastructure systems; in the United Kingdom during 460 periods of adverse wet weather failure of earthworks infrastructure can pose a safety risk to the 461 travelling public and railway staff greater than for other infrastructure types (such as track, signalling and bridges) combined (Hutchinson, 2015). Climate change may also affect asset performance. The 462 463 main driver for slope failure is rainfall, and it is possible that a hotter future European climate will 464 see rainfall arrive in more intense storm events. Drier summers may also pose difficulties for 465 earthworks, causing cracking and shrinkage problems in clay soils (Clarke and Smethurst, 2010). Both

- the public and transport operators want safe and disruption free systems, and this is likely to be adriver for change to the way that assessment and monitoring of geotechnical assets is approached.
- 468 Monitoring data is also needed to help understand and reduce failure in newly built infrastructure.
- 469 New road and rail systems often operate at higher speed, and the hazard posed by running into
- 470 slipped debris (causing derailment or crash) is greater. The lessons from understanding deterioration
- 471 and failure in older systems is needed to help design, monitor and maintain new geotechnical assets.
- 472 This is also an exciting time for monitoring technologies. The emergence of the internet, increasingly
- 473 powerful wireless transmission and data recording technologies, cheaper sensors, enhanced remote
- 474 sensing technologies, the ability to process large amounts of data in real time, and greater
- 475 commercialisation of monitoring technology across domains, are all making possible things not
- available to us even a few years ago. All of the above are feeding into new technology development
- 477 in geotechnical monitoring; the above sections in this paper detail some novel approaches being
- 478 developed by COST Action members, although there are also many others.
- 479 Specific slopes with known stability problems require careful monitoring using more conventional
- 480 instrumentation (inclinometers, piezometers) to manage the risk that they present. However,
- 481 generally the majority of earthworks will not be monitored, subject at best only to visual inspection
- 482 by experienced personnel at frequencies between annual and 10 yearly. Some of these slopes do
- 483 and will fail unexpectedly, causing disruption, at considerable cost to the economy. In order to try
- 484 and monitor longer lengths of earthwork, operators are increasingly keen on more pervasive
- 485 condition monitoring approaches (i.e. those that monitor surface displacement and soil water
- 486 content etc. over long lengths of asset at low cost), that may be able to highlight earthworks which
- 487 are showing initial distress. Such systems could require little human intervention; remote sensing,
- 488 wireless and internet technologies may all allow systems that are significantly automated.
- 489 There is also considerable potential to enhance the way that we view, manage and disseminate
- 490 monitoring data using the internet; this paper has looked at two examples in the Norwegian XGEO
- 491 and UK London and South-West demonstrator systems. Condition monitoring data could be used in
- the future to determine earthwork risk along significant lengths of route using physically based
- 493 models; this has the potential to be updated in near-real time with, for example, forecast weather to
- 494 show future probabilities for earthwork failure and thus disruption to transport operations.
- While such systems are very desirable, there are of course significant challenges to achieving thesetypes of monitoring systems. These can be summarised in three points:
- 497 The assets: earthworks are difficult. They can be very variable in terms of geometry and material 498 properties, there can be local 'defects', they are often covered with vegetation that can make 499 assessment and condition monitoring difficult, and there are multiple modes of failure, some of 500 which are complex and not well understood (Tang et al., 2016). Generally we need a much better 501 understanding of the condition of these assets and the way in which they perform (or fail). This is 502 also needed for the development of more pervasive monitoring approaches – for long lengths of 503 asset what are the indicators of loss of performance? Instrumentation and monitoring data 504 fundamentally underpin the models of physical asset behaviour, and risk, that are being explored further in other parts of the COST Action. The collection, storage, analysis and dissemination and 505 506 sharing of more and better quality monitoring data can provide the information and models to

- properly understand modes of failure and deterioration, and the level at which to set thresholds for
 intervention. Any future automated system relying less on human input will be dependent on better
 models. The COST Action provides opportunities for closer collaboration and sharing of data
- 510 between, for example, asset owners and research bodies.

511 The economics: new monitoring technologies and pervasive condition monitoring approaches offer 512 promise, but there must be a good economic case for their use. Investment in more widespread use 513 of monitoring needs be based on savings to the economy from fewer failed earthworks and less 514 disruption. It is doubtful that thus far the case is made in its entirety – the technologies and 515 understanding of earthworks required to make these monitoring approaches work are incomplete, 516 and asset owners often don't have data on delay costs needed. This will change, as the technology 517 and our expectations of aging infrastructure systems also change. Regulatory bodies, government 518 and public expectation will play a role in challenging operators to show continual improvement in 519 safety and management systems. Many of the new instrumentation approaches described above 520 have also been developed using national government and European Union grants, with financial and 521 other support from road and rail asset owners. Continued strong investment in the development of 522 technology for monitoring of earthworks, and a pro-active approach to seeking to prevent failure, 523 will be key.

524 Technological and human systems: the paper has described the developments in instrumentation for 525 monitoring earthworks, with many systems providing enhancements in monitoring ability, reliability, 526 longevity, cost, and the quality and quantity of data obtained. Several new techniques are very 527 promising, but need further development for use in infrastructure slope monitoring. The ability to 528 monitor more slopes at greater spatial and temporal resolution also requires handling, processing 529 and analysis of significantly more data. This follows the economic trend for understanding systems 530 using 'big data'. Automated systems that analyse large quantities of data are desirable, although 531 their application may have limits – it could still best to have human judgement of the data in major 532 decision making processes (e.g. before stopping traffic). This introduces the need to have enough 533 suitably trained people to understand and review situations and make good/consistent decisions, 534 and, where appropriate, the use of standardised monitoring (avoiding having large numbers of 535 highly bespoke systems) and centralised control. The human influence in decision making requires 536 careful processes and clear risk/decision/response plans are an essential part of major monitored 537 systems.

These are all significant challenges, and it will require time and investment to achieve enhanced
monitoring of European transport systems. These can be overcome more easily if we collaborate,
and share ideas and data as European partners – something the COST Action has been trying to
achieve.

542

543 8. Conclusions

544 i. This paper has explored the context and background to instrumentation and monitoring of
545 infrastructure slopes in Europe. It has considered typical applications for monitoring,
546 spanning from systems to warn of imminent failure, to monitoring for research to better
547 understand the physical processes that take place in slopes.

- ii. A number of novel instrumentation approaches have been described; some of these are
 gaining widespread use, and others are at the research and development stage. New
 technologies and systems are providing enhancements in monitoring ability, reliability,
 longevity, cost, and the quality and quantity of data obtained.
- iii. There is considerable potential for the changing demands and expectations of infrastructure
 systems and new monitoring technologies to completely change the way that slopes are
 monitored in the future. It will likely be possible to monitor greater lengths of earthwork,
 with the intention of providing warning of and reducing incidences of unexpected failure (i.e.
 condition monitoring), rather than the fairly reactive monitoring approaches commonly seen
 today.
- iv. Several new techniques for monitoring longer lengths of slope are promising, but need
 application specific development before use for infrastructure slope monitoring. These
 techniques include optical fibres, LiDAR and photogrammetry, and wireless sensor networks.
- v. The ability to monitor more slopes at greater spatial and temporal resolution requires
 handling, processing and analysis of significantly more data. Automated systems that
 analyse large quantities of data are desirable, although human judgements in conjunction
 with careful decision making frameworks will still be required.
- vi. Improved modelling of risk at the route scale, and improving database and internet systems
 may allow the possibility of hazard or risk maps that update continually with asset condition monitoring data and current or forecast climate. Such systems could prove invaluable to
 transport operators, as well as communicating risk to the travelling public. This paper has
 looked at examples of such systems in use and in development.
- vii. To enable more widespread monitoring and better communication of risk, improved models
 of slope performance and failure are required, as well as a better financial case. Parts of this
 are discussed in more detail in other papers from COST Action TU1202. Both will be
 underpinned by improved quality, collection, analysis and communication of monitoring
 data from infrastructure slopes.
- viii. Greater communication and sharing of data and ideas between European nations and
 continued investment in monitoring technologies by European transport operators and
 governments is required to aid the monitoring challenges elucidated above.
- 578

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588

589 Other papers within this thematic set:

590

591 G. Elia, F. Cotecchia, G. Pedone, J. Vaunat, P. J. Vardon, C. Pereira, S. M. Springman, M. Rouainia, J.

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929	Figure captions
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931 932 933	Figure 1. BIONICS research embankment, Northumberland, UK. The facility has been used to understand earthworks behaviour in relation to climate and test new instrumentation approaches. (Photo curtesy of Dr Ross Stirling, Newcastle University, UK).
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935 936	Figure 2. Norwegian XGEO system, showing colour coded landslide hazard determined from rain and snowmelt, and soil saturation data. The hazard map is updated four times a day.
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Figure 2. Norwegian XGEO system, showing colour coded landslide hazard determined from rain
and snowmelt, and soil saturation data. The hazard map is updated four times a day.

	Embankments	Soil cuttings	Rock cuttings
Number of formally recorded failures	307	485	488
Number of derailments caused by earthworks failure	2	11	4
Average probability of derailment given failure (%)	0.7	2.3	2.1

Table 1: Recorded earthwork failures in the UK Network Rail system 2003 to 2014 (re-drawn from Abbott et al., 2014).

Table 2: Applications for instrumentation and monitoring of infrastructure slopes

Application	Objectives of monitoring scheme	What to monitor? And number of instruments	Frequency of readings, and duration of monitoring	Analysis and interpretation of data	Example case histories
i) Monitoring the condition of problem slopes (including earthworks that are subject to significant changes in loading or profile, and ensuring function of remedial measures)	 To understand the depth and extent of an existing failure, and the conditions (such as pore water pressure) that may have caused it To ensure that any ongoing displacements of materials that have already slipped remain small To demonstrate if remedial works are (or are not) required To check the performance of remedial measures 	 Displacements with depth using inclinometers; pore water pressure using piezometers; weather/climate For large areas of instability, ground surface displacements may be monitored using large-area approaches such as satellite based LiDAR 	 If the hazard posed by the slope is low, and initial displacements small, readings could be relatively infrequent, and data may not need to be logged continuously Duration may depend on hazard posed; may be months or years if monitoring is needed to limit risk to infrastructure 	Readings may be plotted and analysed on a periodic basis, for example once a week or month	Monitoring of earthwork pore water pressures and displacements (Hughes <i>et al.</i> , 2016; Smethurst <i>et al.</i> , 2015)

ii) Obtaining parameters for use in design of remedial schemes	To understand the depth and extent of an existing failure, and ground water conditions	Displacements with depth using inclinometers; pore water pressure using piezometers; weather/climate parameters (precipitation, temperature)	 If the hazard posed by the slope is low, readings could be relatively infrequent, e.g. monthly. Duration needs to be sufficient to make a reasonable assessment of extent of failure and likely worst pore water pressure conditions 	Readings can be plotted and analysed on a periodic basis, for example once a week or month	For example, in stabilisation of earthworks using piles, see O'Kelly <i>et al.</i> (2008), and Smethurst and Powrie (2007)
iii) Early warning systems to provide alarm of actual failure, or indication of incipient failure	 To warn of actual or incipient failure that may pose a direct risk to safety of transport systems 	 Displacement is the obvious indicator of incipient failure in many non-brittle materials; commonly assessed using inclinometers or tilt meters. Climate, pore water pressures/suctions and soil moisture content may be secondary indicators 	 Frequency of readings may be high, to attempt to assess risk in 'real time' if failure may occur rapidly. This would lean towards in- ground instrumentation, or tilt meters fixed to points on the slope surface, that are continuously datalogged. 	Data may need to be interpreted rapidly, and in- part by machine (computer or datalogger), assessing monitoring data against pre-determined thresholds	A review of early warning systems is given by Stahli <i>et al.</i> (2014). Details of a system using acoustic emission monitoring in a cutting slope are given by Dixon <i>et al.</i> (2015)
iv) Monitoring slopes to manage risk at the infrastructure corridor scale	 To investigate changes in key parameters along significant lengths of asset To warn of incipient failure that may pose a direct risk to safety 	 Large numbers of instruments may be used along significant lengths of transport corridor The need to contain cost leads to measurements of ground surface displacement, or near- surface changes in pore water pressure/ suction, or parameters such as soil moisture content. Ground surface displacements may be monitored using large- area approaches such as satellite based LiDAR 	 Frequency of readings may be high (every few minutes), if there is a need to assess risk in real time because failure may occur rapidly Condition monitoring may take place over many years 	Large volumes of data may need to be interpreted rapidly, and thus likely in- part by machine (computer or datalogger), assessing monitoring data against pre-determined thresholds	Utili <i>et al.</i> (2014) describe the use of monitoring information to consider the stability of longer lengths of asset. An overview for consideration of slopes at the corridor scale is given by Dijkstra <i>et al.</i> (2014)
v) Research: monitoring slopes to understand mechanisms of degradation and failure	 To investigate particular modes of deterioration or failure To investigate processes (such as changes in pore water pressure) that lead to 	A wide range of instrumentation may be used, including more unusual types to determine less commonly measured parameters (e.g. permeability)	 Frequency of readings from instruments is likely to be high (hourly or sub- hourly), to obtain high- quality temporal data-sets. Duration of monitoring may 	Readings may be collected and analysed infrequently, to the needs of the research programme	 Examples include: Long-term variations of pore water pressure (Smethurst <i>et al.</i>, 2012; Glendinning <i>et al.</i>, 2014) Investigations of extreme

	failure	•	Instrumentation may be extensive to obtain a detailed profile of variation with, for example, depth		be long, to assess, for example, long-term changes in pore water pressures over several years of climate			•	wet winter pore water pressures (Briggs <i>et al.</i> , 2013) Investigation of suctions supporting silt / silty sandy slopes (Casini <i>et al.</i> , 2013; Westerberg <i>et al.</i> , 2014, 2016) Controlled failure of a full- scale test embankment (Lehtonen <i>et al.</i> , 2015) Understanding rainfall infiltration driven failure (Akca <i>et al.</i> , 2011; Askarinejad <i>et al.</i> , 2012)
vi) Development and testing of new types of instrumentation	 To understand the performance of new instrumentation systems Calibration and validation of instruments 	•	A mix of conventional and new instruments	•	Frequency of readings is likely to be high (hourly or sub-hourly), to obtain high- quality temporal data-sets Duration of monitoring may be longer, if new instrumentation needs to be proved in full range of conditions	•	Readings may be collected and analysed infrequently, to the needs of the research programme	Rese Hill, (Ch Naf Nor (Gle beir pert inst Exa inst and usir tom al., Leh <i>et a</i> moi emii (Sm	search sites such as Hollin North Yorkshire, UK ambers <i>et al.</i> , 2011) and ferton embankment, thumberland, UK endinning <i>et al.</i> , 2014) are ng used to assess the formance of new monitoring ruments and techniques. Amples of new rumentation include moisture I displacement monitoring ng electrical resistivity lography (ERT) (Chambers <i>et</i> 2014; Gunn <i>et al.</i> , 2015; Imann et al., 2013; Wilkinson <i>I.</i> , 2010), and movement nitoring using acoustic ssion (AE) monitoring nith <i>et al.</i> , 2014b)

Table 3: New monitoring technologies

Instrument/	Description	Accuracy	Resol	ution	Other Notes
technique			Temporal	Spatial	
Surface deformation	monitoring				
Global positioning system (GPS)	 GPS system receives time signals from orbiting satellites and positioning is based on signal travel times. Minimum of 4 satellites required for position calculation (i.e. x, y, and z) accurate to ~15 m. Accuracy improvements can be achieved by using: Differential GPS: correction of atmospheric disturbances from comparison of GPS position with known fixed position of a base station; accuracy ~ 0.1 m Real Time Kinematic (RTK) GPS: for positioning the carrier phase of the signal is used rather than the actual time signal; accuracy < 0.01 m Accuracy of RTK-GPS is required for monitoring of mass movements (Millis <i>et al.</i>, 2008). 	m to mm	 Low: manual repeated surveys High: continuous monitoring on spatially fixed receivers 	High: depending on number of monitoring locations	 Dependent on satellite coverage; reception limited in strong topographic depressions (e.g. alpine valleys) Affected by signal scattering: limited accuracy in forested areas Considerable time requirement for full site surveys Instrumentation and processing software are of high cost Permanent installations have been used to monitor movements of large natural landslides causing damage to transport infrastructure (e.g. Massey <i>et</i> <i>al.</i>, 2013) Most likely to be used for applications i, iii, iv and v in Table 2
Photogrammetry	 3D reconstruction of surface topography from overlapping photographs taken from different positions (at least 2). Accuracy mainly dependent on photograph resolution and number of overlapping photographs (i.e. number of shot positions per covered area, Bemis <i>et al.</i>, 2014). Both aerial (e.g. using manned or unmanned aircraft/aerial vehicles) and terrestrial photogrammetry can be used. 	m to mm	 Low: restricted by time requirements for photograph acquisition and data processing High: continuous monitoring on permanently installed cameras 	High: high accuracy point cloud/DEM, deformation monitoring for entire study site	 Application limited by high cost and time requirements Post-processing of data relatively complex (e.g. see Akca <i>et al.</i>, 2011) Widely used for digital terrain mapping and monitoring surface change for natural rock slopes and landslides; a small number of examples of application to infrastructure slopes (e.g. Jang <i>et al.</i>, 2008) Most likely to be used for applications i, iv, and v in Table 2

Remote sensing	•	 Terrestrial-, aerial-, or satellite-based recording of reflected electromagnetic energy from the earth's surface. Typical examples used in investigations of surface deformation (Petley <i>et al.</i>, 2005; Scaioni <i>et al.</i>, 2014): LiDAR (Light Detection and Ranging): distance measurement employing backscattered energy of laser beam, used to create Digital Elevation Models InSAR (Interferometric synthetic aperture radar): Mapping of phase differences between reflected radar waves of different acquisition times, representative of surface deformation. 	m to mm	•	Medium to low: restricted by time required for survey (i.e. in case of terrestrial and aerial surveys) and processing	•	High: high accuracy point cloud/DEM, deformation monitoring for entire study site	• • • •	Application limited by high cost and time requirements (i.e. terrestrial and aerial surveys) Post-processing of data relatively complex Temporal resolution dependent on satellite orbit (i.e. time between repeated data acquisition over same location) Accuracy dependent on signal wavelength and atmospheric condition Positioned reflectors may be required to overcome seasonal changes in vegetation Aerial surveys (e.g. Miller <i>et al.</i> , 2012) have been used to characterise and look at longer duration changes within infrastructure earthworks Most likely to be used for applications i, iv, and v in Table 2
Fibre optics (e.g. Brillouin Optical Time Domain Reflectometry – BOTDR)	•	Determination of locally applied strain to a single optical fibre cable by time-domain analysis of frequency spectra of backscattered light pulses (Thévenaz, 2010). Frequency shifts caused by changes in fibre density. Time-domain analysis allows for determination of strain/deformation location. Other optical fibre strain measurement approaches can be used, e.g. Bragg gratings (Glisic and Inaudi, 2007)	Strain measurement: 0.2% (e.g. 2 mm for 1m spatial resolution)	•	High: continuous monitoring of permanent installations	•	High: cable layout can be adapted to site conditions to optimize coverage and resolution	• • • • •	No absolute measure for displacements Relatively high cost Need for correction of temperature effects Complex processing required Can also be used subsurface, such as in a borehole Widely used to measure strain in structural elements, but no known applications to unreinforced transport infrastructure slopes Most likely to be used for applications i, iii, and iv in Table 2
Accelerometer, Geophone	•	Recording of ground surface acceleration in response to:	Acceleration: 0.1 m/s ²	•	High: continuous monitoring of permanently installed sensors	•	Low to high: dependent on number and distribution of acceleromet ers or geophones	•	Recording of movement changes only; limited detection capability of low velocity ductile movements (e.g. creep) Extraction of movement periods from background noise may be difficult Requires complex post-processing No known applications for transport infrastructure slopes Most likely to be used for applications i and iii in Table 2

Electrode tracking using electrical resistivity monitoring	 Resistivity measurements are sensitive to the subsurface resistivity distribution and electrode separations Monitoring installations usually consist of either a line or grid of electrodes, with electrode spacing ranging from 0.5m to 5.0m Measured resistivities can be inverted to track electrode, and thus landslide movement (Wilkinson <i>et al.</i>, 2010; Wilkinson <i>et al.</i>, 2015), along a line or surface grid 	5% to 10% of electrode spacing (e.g. 0.025 m to 0.5 m, dependent on electrode layout)	•	Medium to high: dependent on measurement layout; 2D lines can be measured hourly, 3D grids usually daily	•	Medium to high: dependent on measureme nt layout	Accuracy dependent on resistivity data quality Other data streams required to calibrate/confirm measurements Requires complex installation and post-processing High cost measurement system The approach has been demonstrated using an installation installed within a natural landslide (Wilkinson <i>et al.</i> , 2010) Most likely to be used for applications i and v in Table 2
Subsurface deformat	ion monitoring						
Time domain reflectometry (TDR)	 Deployment of coaxial cables (or optical; see BOTDR) in vertical boreholes Measurement of reflections along a conductor Localized deformation of coaxial cable leads to local impedance contrast at which a pulse is reflected Time-domain analysis allows for determination of deformation location Rate of impedance change is indirectly proportional to ground movement rate (Kane <i>et al.</i>, 2001; Millis <i>et al.</i>, 2008) 	cm to mm (dependent on cable length)	•	Low: manual surveys using portable pulse generators High: continuous monitoring of permanently installed systems	•	Low to medium: depending on whether used in single borehole or borehole network	No direct measurements of deformation or deformation rate Costs range from low (infrequent, manual surveys) to high (continuous, permanent monitoring or borehole network) Sold as a commercial system, and has been installed into numerous natural and engineered slopes (Kane <i>et al.</i> , 2001) Most likely to be used for applications i, ii, iii, and v in Table 2
Shape Acceleration Array (SAA)	 Comprises a string of MEMS (micro-electro-mechanical systems) sensors, installed inside boreholes Sensors are placed at regular intervals. Each sensor measures 3-dimensional displacements (Abdoun <i>et al.</i>, 2013) 	± 1.5 mm per 30 m array length	•	High: continuous monitoring	•	Low to medium: depending on whether used in single borehole or borehole network	Instrumentation and processing software are of high cost SAA string can be retrieved from the borehole Can provide early warning of slope instability Care should be taken with processing software (Buchli <i>et al.</i> , 2016) Sold as a commercial system and has been used quite widely in stable and unstable infrastructure slopes (e.g. Dixon <i>et al.</i> , 2015) Most likely to be used for applications i, ii, iii, and v in Table 2
Active waveguide and Slope ALARMS sensor (i.e. acoustic emission monitoring)	 Comprises a steel waveguide (i.e. as conductor for acoustic emission signals) and angular granular backfill Host slope deformation causes deformation of granular backfill, creating high energy acoustic emission (AE) signals travelling along the waveguide (Dixon <i>et al.</i>, 2003) AE rates are proportional to slope movement rates, 	Differentiation of movement rates that differ by an order of magnitude (.e.g. 0.01 mm/h and 0.1 mm/h)	•	High: continuous monitoring	•	Low to medium: depending on whether used in single borehole or borehole	Sensitive to slow rates and small displacements Most applicable to slopes failing along a defined shear surface Relatively low cost instrumentation Can provide early warning of slope instability Emerging technology; has been trialled in a clay cutting slope (Dixon <i>et al.</i> , 2015) and at the

	highlighting accelerations and decelerations of movements (Smith <i>et al.</i> , 2014; Smith and Dixon, 2015; Dixon <i>et al.</i> , 2015)			network	 BIONICS facility (Glendinning <i>et al.</i>, 2014), with a number of other installations in natural landslides. Most likely to be used for applications i and iii in Table 2
Electrical resistivity tomography (ERT)	 ERT measurements consist of electrodes placed at the surface and/or in boreholes Resistivity is sensitive to the subsurface lithology, e.g. clay content; inverted resistivity models represent a volumetric image of the local lithology Temporal changes in the resistivity distribution can inform about mass movements. Changes can be quantified using emerging boundary extraction algorithms (e.g. Chambers <i>et al.</i>, 2015; Uhlemann <i>et al.</i>, 2016) 	m to cm dependent on data quality and depth of changes	Medium to high: varies between daily and hourly, depending on measurement layout	Medium to high: depending on measureme nt layout (i.e. 2D or 3D acquisition)	 Measurement sensitivity reduced with increasing distance to electrodes Complex installation and processing required Used to measure ground movements for a range of applications, including natural landslides; no known applications to transport infrastructure slopes Most likely to be used for applications i, ii and v in Table 2
Subsurface condition	monitoring				
Conventional soil moisture probes	 Based on relative permittivity measurements, which is related to moisture content using Topps equation (Topp <i>et al.</i>, 1980) Main techniques: Time-domain reflectometry (TDR): Relative permittivity derived from the travel time of an electro-magnetic pulse through a waveguide Capacitance sensors: Relative permittivity determined based on the charging time of a capacitor, employing the soil as dielectric 	Relative permittivity: ±1 Moisture content: ±3% of measurement	High: continuous monitoring on permanently deployed sensors	Low to medium: sensor samples only surrounding medium, can be increased if used in sensor networks	 Moisture content derived through empirical relationships Usually requires calibration Robust and reliable sensor technology Latest developments include web-based real-time delivery of multi-location moisture data from sensor networks at field sites Several commercially available devices; quite widely used to measure soil moisture content in the near-surface zone of infrastructure slopes (e.g. Smethurst <i>et al.</i>, 2012; Glendinning <i>et al.</i>, 2014) Most likely to be used for applications i, iii, iv and v in Table 2
Electrical resistivity tomography (ERT) monitoring of soil moisture	 The resistivity of a formation depends mainly on its mineralogy and degree of saturation Laboratory-derived relationships can be used to translate resistivity into moisture content Repeated ERT surveys on permanently installed electrodes can be used to image volumetric moisture movements (e.g. Chambers <i>et al.</i>, 2014, Gunn <i>et al.</i>, 2015) ERT could also be used to monitor cavity development 	Moisture content: <±5%	Medium to high: varies between daily and hourly, depending on measurement layout	Medium to high: depending on measureme nt layout (i.e. 2D or 3D acquisition)	 Measurement sensitivity reduced with increasing distance between electrodes Complex installation and processing required Measurement accuracy dependent on resistivity data quality Several installations have been used to image moisture changes in clay infrastructure slopes (Glendinning <i>et al.</i>, 2014; Gunn <i>et al.</i>, 2015). Many other examples of use in natural slopes. Most likely to be used for applications i, iv and v in Table 2

High-capacity pore water suction probes	 Probes consist of Filter, acting as interface between soil and measurement device Water reservoir Pressure measuring device Recent improvements of measurement range and accuracy through reduction of water reservoir and higher air entry pressures of the ceramic filter (Toll <i>et al.</i>, 2011, 2013) Allowing for suction measurements ranging from 0 – 2000 kPa 	Pore water pressure/suction : > ± 5 kPa	High: continuous monitoring of permanently installed sensors	Low to high: dependent on number and distribution of probes	 Limited accuracy if applied at low suctions Long-term measurement drift may occur Laboratory re-saturation necessary if water reservoir dries out Probes have been trialled in a clay embankment in the UK (Toll <i>et al.</i>, 2011, 2013) Most likely to be used for applications i, iii, iv and v in Table 2
Probes for indirect measurements of pore water suction	 Probes consist of a soil moisture device encapsulated within a porous ceramic of known water retention properties. Soil moisture in ceramic measured, and related to suction in the soil Accuracy is dependent on correct calibration between suction and moisture content of ceramic (Smethurst <i>et al.</i>, 2012) 	Pore water suction: high readings ± 10%	 High: continuous monitoring on permanently deployed sensors 	Low to medium: sensor samples only surrounding medium, can be increased if used in sensor networks	 Requires careful calibration Generally robust sensor technology Latest developments include web-based real-time delivery of multi-location suction data from sensor networks at field sites Several commercially available devices; quite widely used to measure pore water suction in the near-surface zone of infrastructure slopes (e.g. Smethurst <i>et al.</i>, 2012; Glendinning <i>et al.</i>, 2014) Most likely to be used for applications i, iii, iv and v in Table 2
Ground penetrating radar (GPR)	 Measurement based on the propagation of electromagnetic waves in the subsurface, i.e. wave speed dependent on dielectric properties Use on non-guided waves (in contrast to TDR where guided waves are used) Properties of reflected, ground, and cross-borehole waves can be used (Huisman <i>et al.</i>, 2003; Steelman <i>et al.</i>, 2012) GPR could also be used to characterise (Di Prinzio <i>et al.</i>, 2010) and monitor cavity development 	Moisture content: > ± 0.02 m³m⁻³	Low to medium: manual surface or borehole surveys	Medium to high: depending on measureme nt layout and employed frequency	 High cost measurement system Requires complex post-processing Limited applicability in high conductive soils (i.e. clay) due to attenuation of the GPR signal Commonly used to establish ballast depth in railway formations. Used by Donohue <i>et al.</i> (2011, 2013) to investigate an old clay railway embankment Most likely to be used for applications i, iv, and v in Table 2