

1 **AERIAL CLOSE-RANGE PHOTOGRAMMETRY TO QUANTIFY**
2 **DEFORMATIONS OF THE PILE RETAINING WALLS**

3 **Abstract**

4 Today, as structures with life expectancy of more than 100 years are being constructed, it is
5 vital to gain knowledge about the gradual decline in material properties. Accordingly, to
6 ensure the longevity and safety of these structures, monitoring has been incorporated as a
7 fundamental part of their service life. To monitor structural deformation, various methods
8 have been developed, with the most common being the survey of certain points of a structure
9 during and after construction using a total station. New techniques are now being developed,
10 and one of the most promising ones is photogrammetry because it provides a simple method
11 to monitor a structure using Unmanned Air Vehicles (UAVs). This paper is aimed at sharing
12 the strategic steps followed in monitoring the deflection of a simple secant pile retaining wall
13 during excavation and construction of a basement. The monitoring is performed using a
14 commercial UAV in combination with point cloud formation, georeferencing, and comparison
15 software (cloud compare, I-Site Studio, 3DReshaper etc.). The monitoring results show very
16 good agreement with the traditional inclinometer deflection measurements and numerical
17 analysis, thereby demonstrating the feasibility of the proposed method. The authors believe
18 that in the future, photogrammetry using UAVs can become the standard method for
19 geotechnical monitoring because its speed, lower cost and ease of use, when compared to
20 conventional methods, a non-destructive method, and is easy to learn and use.

21 **Keywords:** Photogrammetry, Monitoring, Unmanned Air Vehicle (UAVs), Image
22 processing, Structural deformation.

24 1. Introduction

25 Structures around the world undergo deformation because of weather conditions,
26 groundwater, seawater, earthquakes, and many other natural factors. Structures requiring deep
27 excavations, terraces on slopes, retaining walls, and embankment slopes along highways and
28 roadways are geotechnical assets, which are a critical part of national infrastructure systems.
29 These geotechnical assets can fail during construction or along their service life, because of
30 various problems including the lack of proper design or maintenance, deterioration of
31 materials, and use of unregulated backfill or poor drainage systems [1–4]. Specifically, in
32 retaining structures, failure mechanisms are triggered by deep-seated movement, overturning
33 motion, bearing capacity, or sliding translation [2, 5]. Therefore, monitoring of these
34 structures is necessary to secure their construction and maintain safety. In addition to structural
35 monitoring during the life cycle of assets, it is important to monitor the deformations during
36 the construction phase. Monitoring the construction phase is an essential process for
37 geotechnical assets because the soils can be extremely heterogeneous; particularly on large
38 construction sites, where design depend on parameters determined using spot site
39 investigations (standard penetration test, cone penetration test, pressuremeter test, etc.), the
40 appearance of unforeseen soil conditions can lead to unexpected responses from the structure.
41 Therefore, structural monitoring, back analysis, and design modification are extremely
42 important steps during the construction of geotechnical structures. Various monitoring
43 techniques have been developed to monitor deformations. These techniques can be
44 categorized as conventional measuring methods (precise leveling or total station surveying),
45 positioning system methods (Global Positioning System (GPS) measurement), satellite radar
46 system methods (Interferometric synthetic aperture radar (InSAR) observation),
47 photogrammetry (satellite, aerial, or earthbound imaging), some traditional geotechnical
48 methods using inclinometers and strain meters and, more recent, fibre optics either Brillouin

49 or Bragg techniques.

50 Table 1 summarises the advantages and disadvantages of certain important above-mentioned
51 monitoring techniques used in the field. Geotechnical monitoring equipment's such as fiber
52 optic strain sensors [42] and inclinometers [43] are widely used in pile deformation
53 monitoring. Even though, using fibre optic Brillouin strain sensors you could obtain three-
54 dimensional deformed shape with high accuracy, they are known to use very expensive
55 analysers. Furthermore, both devices are offering local solutions as they should be installed
56 in/on to the structure and physical contact with the structure is required to obtain the
57 measurements. Contact devices such as conventional surveying equipment [31, 37] and global
58 navigation satellite systems (GNSSs) [13-16, 36] have been used to monitor structural
59 deformation or slope movement, but these devices can be expensive or time consuming, can
60 be limited by physical or traffic accessibility problems, or can have low accuracy in
61 determining real-time movements. The use of Terrestrial Laser Scanners (TLS) [8, 39, 40] has
62 also been incorporated in monitoring; however, it is a costly method but it has been decreasing
63 in price. Interferometric synthetic aperture radar (InSAR) [32-35, 38] observation has also
64 been utilized in the field of displacement measurement however, it experiences some
65 drawbacks in that it is a time-consuming method with limited vertical displacement
66 measurement and a single look direction whose accuracy can be affected by different weather
67 conditions.

68 Therefore, more recently, to reduce the cost and ease the monitoring process, photogrammetry
69 [6, 7, 17, 44] has been utilized. Renee et al. [23] used 3D photogrammetry to assess the failure
70 modes of a sample retaining wall model. This new solution was proposed as a cost-effective,
71 fast, and safe asset management system, which could be an alternative to existing retaining
72 wall monitoring techniques. PhotoScan software was used to produce dense points, compare
73 the locations of common points representing the surfaces for different scenarios, and

74 determine the surface displacements. Additionally, control points that did not move between
75 epochs were used to co-register the point clouds in a coordinate system common to the
76 different epochs. Finally, control points on the moving panels were compared between epochs,
77 and the comparison was also carried out using conventional surveying techniques. The results
78 of this study indicated that the accuracy of displacement between the two methods was within
79 1–3 cm. Photogrammetry provides speed and cost effectiveness to the monitoring process;
80 however, the accuracy of photogrammetry depends on the distance from which the photograph
81 is taken as well as the type of camera. Furthermore, it is difficult to use photogrammetry in
82 areas with restricted access or in large project sites.

83 To overcome the abovementioned disadvantages, photogrammetry with the aid of Unmanned
84 Air Vehicles (UAVs, commonly known as drones) [18-20, 41] have been introduced and used
85 extensively in the field of civil engineering. In a study, Brown [24] used the locations and
86 elevations of surveyed auger holes and the ground surface as control points and aligned two
87 point clouds, which were generated from autonomous flight paths of Unmanned Air Vehicle
88 (UAVs), by picking common points in CloudCompare software. To interpolate a surface from
89 the lowest point, Brown [24] manually cleaned the point cloud in CloudCompare by removing
90 trees and other “noise” that did not represent the ground surface. More recently, Turner et al.
91 [20] monitored possible unfavourable discontinuities in underground excavations using the
92 UAV imagery. Upon successfully generating and georeferencing the point cloud model, they
93 used CloudCompare to align the unregistered RGB, thermal, and multispectral models with
94 the registered LIDAR data from the slopes.

95 In this study, the authors utilized the close-range photogrammetry technique along with the
96 UAV to enable reaching of difficult-to-access areas faster and more economically; the UAV
97 obtained photographs, which were converted to point cloud data, and the deformations
98 occurring on the geotechnical structure were further analysed. Furthermore, the geometry

99 obtained via the point clouds was provided to numerical analysis software to analyse the
100 expected deformations. Finally, the expected deformations calculated via the numerical
101 software and measured with inclinometer were compared against the proposed monitoring
102 data obtained on site.

103 **2. Method**

104 The images collected by the UAV are processed in the following stages: 3D point cloud
105 formation, georeferencing, and point cloud comparison. In photogrammetry, the formation of
106 a 3D point cloud is a process that involves various steps. To accomplish these steps, various
107 software packages can be used. Harwin and Lucieer [21] mentioned commonly used software
108 such as PhotoScan (Agisoft) and PhotoModeler as well as open-source platforms such as
109 Photosynth and Bundler [22]. In addition, software such as CloudCompare, I-Site Studio, and
110 3DReshaper can be used for georeferencing and the comparison of point clouds from different
111 epochs by aligning them using existing reference points in different 3D models [25-27].

112 **2.1.1. Image Collection**

113 Figure 1 shows the steps used for conducting the photogrammetry study on the site discussed
114 in the paper. Flow chart is also aligned with the flow of this study from this point onwards.
115 First, a site walkover survey was conducted, after which a desk study, recording the
116 topography of the study area as well as planning the location of the targets, was undertaken.
117 It should be noted that the desk study was conducted after the walkover survey because input
118 from the site conditions was required for planning the survey and target location. Following
119 the desk study, 10 printed retroreflective targets were placed on site. According to the
120 conditions seen on site, the targets were printed on an A4 sized paper and later laminated to
121 provide more resistance to weather and dust. These steps facilitated easy alignment from one
122 epoch to another. The location as well as the number of targets placed differed from site to

123 site. The location of the targets was heavily dependent on the topography of the study area.
124 As seen on Figure 2 retroreflective targets were also used as ground control points and
125 coordinates of the points have been recorded with an aid of Pentax Series G6 GNSS device
126 (Table 2). This coordinates of ground control points (known points) were recorded in order to
127 improve the accuracy of the point cloud or the Digital Elevation Model (DEM) generated
128 using the UAVs.

129 A UAV (DJI PHANTOM 3 Pro) equipped with a 12-megapixel camera (Sony EXMOR) (see
130 Table 3 for camera specifications) was used to manually capture around 120 pictures from the
131 site on every epoch. The pictures were taken following a simple rule: every picture overlapped,
132 by at least 70%, every surrounding picture. Prior to image collection, the device quality,
133 including the battery life and flashcard memory space, were checked. One battery with a
134 battery life of 25 min was sufficient for monitoring a 200-m-long, 8-m-high retaining wall.

135 **2.1.2. Image Processing**

136 Image processing and alignment were carried out using PhotoScan, which was chosen because
137 it provides an affordable solution for multiview 3D construction. James and Robson [28]
138 stated that the structure-from-motion approach requires multiple pictures of an object from
139 more than one camera angle and an overlapping ratio of at least 70% for accurate 3D
140 reconstruction. At the site, measurements were taken to ensure that the above criteria were
141 met and about 120 photographs were taken at each epoch. Captured images were in .jpg format
142 and their sizes were 4000×3000 pixels. Images were stored on a video speed class (V₉₀) micro
143 SD card to enable fast recording. Images were directly imported from the micro SD card to
144 the computer with a DJI link cable. Prior to uploading the photographs to the software, poor-
145 quality, dislocated and blur images were deleted as they would have reduced the quality of the
146 3D point cloud construction. Within the software environment, camera calibration that would

147 provide a correct point cloud is not necessary because the software estimates the camera
148 calibration parameters automatically using Brown's model [45] for lens distortion; a process
149 known as bundle adjustment. Camera calibration is advantageous in that it enables the user to
150 remove pictures that do not offer good precision. Therefore, manual calibration is not needed
151 if standard optical lenses and a highly redundant image network is used.

152 After loading the taken photographs in PhotoScan, the images are aligned. This process
153 iteratively refines the internal as well as external camera orientations and locations using the
154 least-squares solution. This process takes about 10 minutes to complete. The software then
155 builds a sparse point cloud model and calculates the depth information based on the estimated
156 camera positions. A single dense point cloud can be obtained using the "Build dense point
157 cloud" command. In the case study outlined below, in generating the dense cloud about 10
158 million points were obtained and the process took about 160 minutes. Furthermore, the
159 software allows the user to set the quality and depth for the point cloud generation. Settings
160 for achieving higher quality can also be obtained; however, this will require a longer
161 processing time. The dense point cloud obtained was then cleaned for about 10 minutes by
162 cutting out points that will interfere with analysis. It is worth to mention that the above
163 mentioned durations for processing depends on the computer configuration and in this current
164 case an i7-7700HQ CPU at 2.8GHz with 16GB of RAM and a K5000 graphics card and a 1TB
165 SSD hard drive computer was used.

166 **2.1.3. Data Processing**

167 After data from two different epochs were obtained, the generated point clouds were exported
168 to the CloudCompare software in the LAZ (Lidar Data file) format. CloudCompare is an open-
169 source software that allows operations and comparisons to be performed on 3D point clouds
170 from different epochs. Prior to carrying out any comparison, CloudCompare's Iterative Closed
171 Point Processing algorithm is used to align the two point clouds. Close overlap between the

172 targets is necessary for the best alignment of the point clouds. Girardeau-Montaut [29]
173 reported that noise and points outside the area of interest should be removed before performing
174 the alignment and registration to prevent the degradation of the registered point clouds.

175 Change detection, as described by Singh [30], refers to the process of identifying the
176 differences in an object by observing it at two epochs. While carrying out change detection,
177 the areas in the point cloud where changes occurred were analyzed more closely.

178 In CloudCompare, analysis of change detected areas can be carried out primarily in two
179 different forms—cloud-to-cloud and cloud-to-mesh—both of which are used in this study. In
180 these two methods, first the point cloud is sectioned and these sections are then closely
181 analysed, as shown in Figure 3a. In the cloud-to-cloud comparison, the software calculates the
182 distance between a point on the first cloud and a group of points on the second cloud. The
183 distance displayed is the shortest distance calculated (Figure 3b). In the cloud-to-mesh
184 comparison, a series of planes are fitted to the point cloud and the distance perpendicular to
185 the nearest plane is measured (Figure 3c). The distance from a point to a plane is measured
186 ($X_1, X_2, X_3 \dots X_n$), as shown in Figure 3c. CloudCompare is then used to develop a Gaussian
187 distribution graph that displays the number of points versus the distance measured between
188 epochs (see the section on the case studies for the graph).

189 In this study, a new method of analysis called the strip method is also adopted. This method
190 is similar to the cloud-to-cloud comparison, with the only difference being that the point cloud
191 is cut into a longitudinal thin strip (Figure 3a and 3d). As a benefit in the current practice, the
192 strip method allows the deflection along the length of the pile wall to be seen. After obtaining
193 the deflection data from the CloudCompare, the data is exported to Microsoft Excel, where
194 graphs are drawn; these graphs allow the user to better visualize the amount of deflection
195 observed. Furthermore, the angle of deflection of the pile can similarly be estimated through
196 geometric relations. Considering that the wall length remains the same and no axial load is
197 applied on the pile cap, than there is no axial deformation on the wall; the angle Δ at the base

198 of the wall is twice the angle α , as shown in Figure 3d.

199 **3. Case Study**

200 **3.1. Pile Retaining Wall Monitoring during Deep Excavation**

201 To investigate the use of the proposed method, a cantilever pile retaining wall of the basement
202 of an apartment block was monitored. The authors of this paper were responsible for
203 performing site investigations to obtain the relative soil parameters for the design and
204 monitoring of the retaining wall deformations during the construction phase. The studied
205 apartment block is located in the district of Kyrenia, Northern Cyprus. The proposed structure
206 has seven stories with two basement levels and is constructed using reinforced concrete.
207 Therefore, to construct the basement, an excavation depth of 7.5 m is proposed, and the
208 excavation was performed in four stages.

209 **3.1.1. Study Area**

210 Figure 4 shows the layout of the studied site. At a 5-m distance from the east face of the
211 excavation site, there is a single-story reinforced-concrete structure (A). On the west side,
212 there is a two-lane road (B), which carries heavy traffic to the commercial port, and on the
213 north side, there is a single-lane town road (C), which carries light traffic. On the south side
214 of the excavation site, there is a swimming pool (D) at a distance of 2 m and a two-story
215 reinforced-concrete structure (E) at a distance of 9 m.

216 To obtain the geotechnical parameters for design purposes, five standard penetration tests (one
217 at each of the four corners and one at the centre of the site) and laboratory tests were
218 performed. The encountered soil profiles consisted of sandy clay up to 2 m, silty clay down to
219 5.5 m, stiff clay down to 11 m, and marl down to 20 m. At this level, the investigation was
220 stopped because the marl was assumed to be the bedrock, extending to a depth of 2 km. The

221 water table on site was found to be at 3 m from the ground level. The decision to use a secant
222 pile wall was attributed to the unsafe conditions along the slope on the western side, where
223 the road with the heavy traffic existed. To construct the proposed basement, a cantilever
224 retaining wall (Figure 5) was proposed. To evaluate the lateral earth pressures acting on the
225 wall, an idealized soil profile was formed by adopting a Mohr–Coulomb soil model and using
226 the effective soil parameters obtained from the site investigations and laboratory testing
227 results. The parameters used for each soil layer are listed in Table 4.

228 Finite element modelling software (Plaxis 2D v.8.6) was used to perform two-dimensional
229 analysis on the proposed pile retaining wall under the current loading conditions. A stage-wise
230 construction method was used in the analysis. In the first stage, the initial (geostatic)
231 conditions of the ground were considered; here, just the piles were constructed but no
232 excavation was performed. This stage was followed by four stages, representing the soil
233 excavation and the epochs of monitoring. Therefore, the numerical calculations consisted of a
234 geostatic condition and four consecutive stages of excavation, after which the final condition
235 was reached (Figure 6). Following the analysis, Figure 7a shows the deformations occurred
236 along the analysed area with the deformations occurring on the pile retaining wall. According
237 to the results, the maximum horizontal displacement of 32 mm occurred at the top of the wall.
238 The variations in the horizontal deformations along the pile surface are shown in Figure 7b,
239 which indicates that the deformation reduced as the excavation level progressed downward.

240 Furthermore, an inclinometer was installed at the central bored pile and displacements were
241 recorded at two different dates, starting from the beginning of pile wall construction. It can be
242 seen on Figure 8 that the maximum deformation is at the pile capping beam, reducing with the
243 increase in depth. The maximum displacement measured in two different epochs are at the
244 pile capping beam and correspond to 15mm on 06.09.2017 and 52mm on 17.09.2017. The
245 location of the installed inclinometer is indicated as location B in Figure 9.

246 3.1.2. Results

247 A comparison of the generated point clouds consisted in the computation of the distance
248 between two point clouds from four different epochs. The chosen segments are shown in
249 Figure 9. These segments are labelled as A, B, and C in the horizontal direction, and their
250 relative depths from the top of the capping beam are 0, -2, and -4 m. Based on the visual
251 horizontal deformations, segments were further chosen depending on the performed numerical
252 analysis. Two segments were chosen close to the corners where the expected deformations
253 were much lower because of the corner effect of the retaining structure, and one segment was
254 chosen in the middle, where high deformations were expected.

255 Figure 10 shows the Gaussian distribution of the cloud-to-cloud distances with respect to the
256 depths of 0, -2, and -4 m along the selected pile surface at location C. As expected, the
257 deformation at the top of the pile was 16.88 mm and reduced to 6.94 mm at the depth of -4 m.
258 It was not possible to compare the displacement of the wall at the bottom of the excavation
259 site because the point clouds were generated at different excavation levels.

260 Figure 11 shows the comparison of the cloud-to-cloud distance at location A for the intervals
261 between epochs 1 and 2, 1 and 3, and 1 and 4. As time passed, the deformation of the wall
262 increased from 21 mm in epoch 2 to 63 mm at the final epoch. Figure 12 shows the comparison
263 of the cloud-to-mesh approach used to analyse the deformations at the same location A. The
264 results were in good agreement with those of the cloud-to-cloud comparison at the same
265 location.

266 Table 5 lists the maximum displacements at the pile capping beam along the selected locations
267 at different epochs for both the cloud-to-cloud and cloud-to-mesh methods, showing that both
268 methods are consistent. As time progressed, the deformations at the top of the beam at all the
269 locations increased. Additionally, location A showed the highest deformation among the all

270 locations. Location C showed the least deformation because it was closest to the corner and
271 was influenced by the corner effect.

272 The comparison of the two developed methods indicated that the cloud-to-cloud method gave
273 results that were more logical. As an extension of this method, a cloud-to-cloud comparison
274 method along a strip was developed. Figure 13 shows the comparison of strips from different
275 epochs at location B. To observe the deformations in a more pronounced manner, Figure 14
276 was plotted. This figure focuses on the pile cap section because it was found to show the
277 highest deformations according to the inclinometer measurements and numerical analysis.

278 The progress of the deformations measured via strip, cloud to cloud and inclinometer
279 measurements at the pile capping beam, at different epochs and at location B are shown in
280 Table 6. Displacements measured via each method were plotted against time in days on Figure
281 15. A comparison of the results in Figure 15 and those in Table 6 indicate that the
282 measurements are consistent, showing similar results. The curves for each method seem to
283 adjust in a polynomial curve. Therefore, it is clear that the results of aerial close-range
284 photogrammetry are in good agreement with the inclinometer measurements.

285 **4. Conclusions and Recommendations**

286 In this study, two different methods of deformation monitoring via aerial photogrammetry
287 have been adopted: cloud-to-cloud and cloud-to-mesh methods. A novel strip method has also
288 been proposed as an extension of the cloud-to-cloud method. Among the three adopted
289 methods, the strip method is found to reveal the full deformation profile of the pile and was
290 found to be the easiest and quickest to apply. Additionally, by reducing the number of points
291 relative to the other two methods and using widely known software such as Microsoft Excel,
292 the strip method can eliminate the need for complex analysis on CloudCompare and the
293 requirement of large computational power, often required by these softwares. Furthermore,

294 the results of the photogrammetric study are in alignment with those of the inclinometer
295 measurements during the construction of the wall. For all the numerical, inclinometer and
296 proposed methods, the expected deformations are the greatest at the top of the pile cap and
297 reduce as the excavation progresses down to the bottom of the site.

298 Compared to other available photogrammetry techniques, the proposed method enables close-
299 range photogrammetry to be carried out using a UAV. Therefore, the difficult-to-access areas
300 of geotechnical structures (deep excavations, slopes with stability problems, and retaining
301 structures) can be monitored with high accuracy.

302 Furthermore, it is considerably quicker and easier to obtain data on a geotechnical field using
303 the proposed method than using other available techniques. With the advancements in drone
304 technology, route planning that allows inspection scheduling in advance can be performed; in
305 this case, drones can autonomously fly off and collect data at predefined locations and return
306 to their docking stations. Moreover, the proposed technique records considerable geometric
307 data in a brief period, by procuring pictures using easy-to-use cameras. This permits users to
308 return to the visual records and conduct extra investigations at a later stage.

309 The disadvantage of the adopted methods is that the displacement of the wall at the bottom of
310 the excavation site cannot be compared because the point clouds are generated as the different
311 excavation levels progress. Furthermore, it is recommended that a similar study be conducted
312 by comparing the findings of the proposed methods with the results obtained using known
313 deformation monitoring tools such as GNSSs, inclinometers, and laser scanners so that the
314 accuracy of the proposed methods can be examined.

315

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453 **Figure Captions:**

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464 Figure. 8. Sketch of constructed cantilever retaining wall with inclinometer monitoring results.

465 Figure. 9. Point Cloud of the excavation area with the location of the sections used for
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467 Figure. 10. Gauss distribution of Cloud to Cloud distance comparison at Location C at (a) 0m,
468 (b) -2m, (c) -4m depth from reference point.

469 Figure. 11. Gauss distribution of Cloud to Cloud distance comparison at Location A (a) Epoch
470 1-2, (b) Epoch 1-3, (c) Epoch 1-4.

471 Figure. 12. Gauss distribution of Cloud to Mesh distance comparison at location A (a) Epoch
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473 Figure. 13. Comparison of epochs at location B with strip method.

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476 Figure. 15. Displacement of the pile capping beam at different epochs via Strip, Cloud to
477 Cloud and Inclinometer measurements at location B.

478

479 **Table Captions:**

480 Table. 1. Comparison of different deformation monitoring techniques.

481 Table. 2. Control Point Coordinates taken by GNSS device.

482 Table. 3. Specifications of the camera used in photogrammetry study.

483 Table. 4. Soil parameters adopted in numerical analysis.

484 Table. 5. Maximum displacements at the pile capping beam along the selected locations and
485 different epochs via cloud to cloud and cloud to mesh methods.

486 Table. 6. Maximum displacements at the pile capping beam at different epochs via all adopted
487 methods.

Study	Method	Advantages	Disadvantages
Erol et al. [13]- Viaduct monitoring.	Global Positioning system (GPS) measurement	Provide high accuracy and simultaneous three-dimensional (3D) positioning	Costly
Xu et al. [14]- Preseismic deformation monitoring.		Greater flexibility in the selection of station locations	Time consuming
Luo et al. [15]- Freeze/thaw-induced deformation monitoring.		Can be carried out under different weather conditions	Low accuracy in determining real time movements
Gu et al. [36]- Crustal deformation monitoring.			Limited physical accessibility
Yang et al. [16]- Deformation monitoring.			Limited vertical displacement measurement
Kalooop et al. [31]- Beam deformation monitoring.	Total station surveying	Quick instrument setup	Low accuracy in determining real time movements
Lienhart [37]- Geotechnical monitoring.		Can be carried out under different weather conditions	Relatively costly
			Limited physical accessibility
			Digital elevation model (DEM) errors Accuracy depends on the target type
Massonnet et al. [32]- Earthquake displacement field mapping.	Interferometric synthetic aperture radar (InSAR) observation	Less costly than obtaining sparse point measurements from labor-intensive global positioning system (GPS) surveys	Low temporal sampling intervals
Rosen et al. [33]- Techniques of interferometry, systems and limitations, and applications.		Numerous data points	Single look direction
Yan et al. [34]- Subsidence measurement.			Limited vertical displacement measurement
Thakur et al. [38]- Snow cover area mapping.			
Sefa [35]- Land subsidence measurement.			

Hisham et al. [42]- Secant pile wall.	Fiber Optic Strain Sensing	Full length deflection profile	Local solution
		Can still be monitored long after the construction	Costly
		High accuracy	Affected by weather conditions
		Three-dimensional deformation (vertical and horizontal)	Limited physical accessibility
Xu et al. [43]- Large scale bored pile	Inclinometer	Full length deflection profile	Local solution
		Relatively low-cost	Accuracy is limited
			One-dimensional deformation (horizontal)
			Less stable results
	Limited physical accessibility		
Wang et al. [8]- Landslide monitoring.	Terrestrial Laser Scanners (TLS)	Provides an effective and rapid solution to detect deformation on a large surface	Costly
Gui et al. [40]- Subway deformation monitoring.		Numerous data points	Affected by weather conditions
Xu et al. [39]- Composite structure deformation analysis.		Contact free with the scanned object	
		3 dimensional results	
Valença et al. [44]- Footbridge deformation monitoring.	Photogrammetry	Numerous data points	Accuracy is distance dependent
Han et al. [6]- Retaining wall displacement measurement.		Reduced time of field work	Accuracy is camera dependent
Scaioni et al. [7]- Tunnel monitoring.		3 dimensional results	Affected by weather conditions
Masoodi et al. [17]- Riverbank seepage erosion monitoring.		Cost effective	Limited physical accessibility
		Contact free with the scanned object	
Stalin et al. [41]- Mine modeling and mapping.	Photogrammetry with the aid of an Unmanned Air Vehicle (UAV)	Cost effective	Affected by weather conditions
Yutaka and Yoshihisa [18]- River topography monitoring.		Reduced time of field work	Accuracy is camera dependent

Congress and Puppala [19]- Transport infrastructure monitoring.		Accessibility to different locations	
Turner et al. [20]- Underground excavation mapping.		Can be automatized	
		3 dimensional results	
		Contact free with the scanned object	
		Numerous data points	

488

489 Table. 1. Comparison of different deformation monitoring techniques.

490

491

Control Point	Y	X	Z
1	530188.444	3912026.156	45.799
2	530177.626	3912028.623	45.934
3	530174.532	3912017.127	46.221
4	530171.177	3912000.244	46.451
5	530172.505	3911992.085	46.703
6	530184.839	3911986.874	46.782

492 Table. 2. Control Point Coordinates taken by GNSS device.

493

Sensor	1/2.3" CMOS Effective pixels: 12.4 M (total pixels: 12.76 M)
Lens	FOV 94° 20 mm (35 mm format equivalent) f/2.8 focus at ∞
ISO Range	100-3200 (video) 100-1600 (photo)
Electronic Shutter Speed	8 - 1/8000 s
Image Size	4000×3000 pixels

494 Table. 3. Specifications of the camera used in photogrammetry study.

495

Mohr-Coulomb		1	2	3	4
Type		Sandy-Clay	Silty-Clay	Stiff Clay	Marl
		Drained	Drained	UnDrained	UnDrained
γ_{unsat}	[kN/m ³]	18.71	19.20	19.60	19.60
γ_{sat}	[kN/m ³]	22.26	22.20	22.20	22.60
e_{init}	[-]	0.500	0.500	0.500	0.500
c_k	[-]	1E15	1E15	1E15	1E15
E_{ref}	[kN/m ²]	5372.000	8690.000	14000.000	35708.000
ν	[-]	0.300	0.300	0.350	0.400
G_{ref}	[kN/m ²]	2066.154	3342.308	5185.185	12752.857
E_{oed}	[kN/m ²]	7231.538	11698.077	22469.136	76517.143
c_{ref}	[kN/m ²]	83.00	21.00	135.38	288.00
ϕ	[°]	31.00	33.80	33.53	40.15

497 Table. 4. Soil parameters adopted in numerical analysis.

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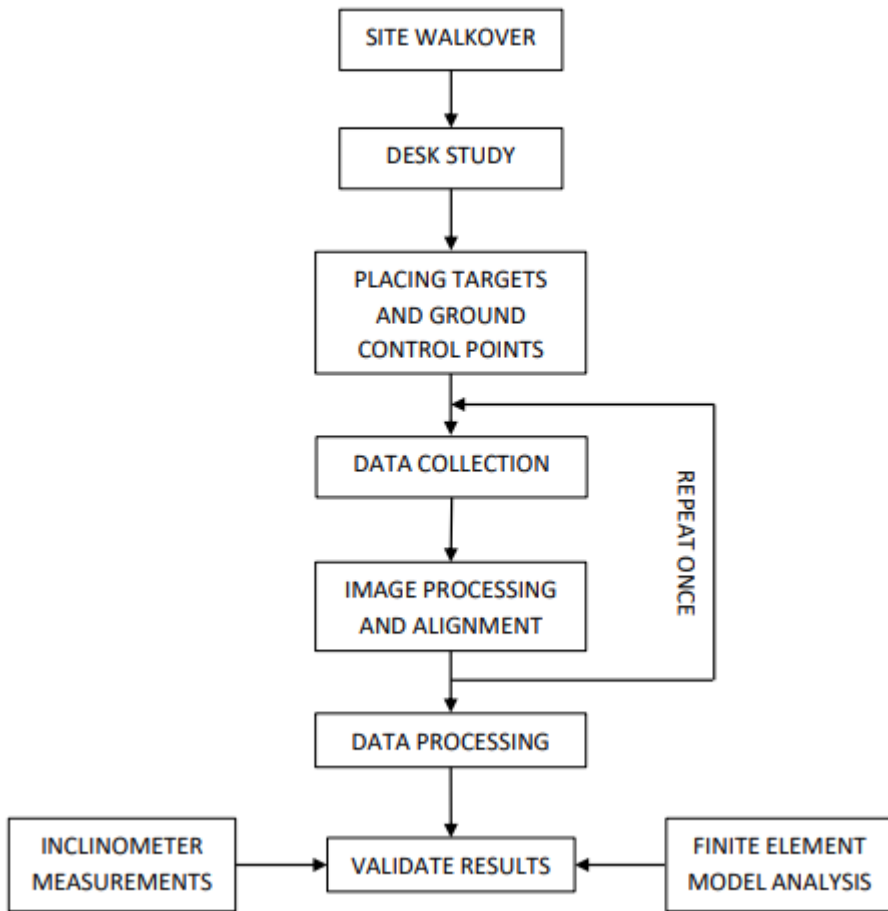
Date of Monitoring	Day(s)	Ref Depth (m)	LOCATION A		LOCATION B		LOCATION C	
			cloud to cloud (mm)	cloud to mesh (mm)	cloud to cloud (mm)	cloud to mesh (mm)	cloud to cloud (mm)	cloud to mesh (mm)
28.08.2017	0	0	0	0	0	0	0	0
06.09.2017	9	0	21	20	14	10	11	7
10.09.2017	13	0	23	24	23	24	12	9
17.09.2017	20	0	63	62	48	47	16	23
17.09.2017	20	-2					9	13
17.09.2017	20	-4					7	9

499 Table. 5. Maximum displacements at the pile capping beam along the selected locations and
500 different epochs via cloud to cloud and cloud to mesh methods.

Date of Monitoring	Day(s)	Ref Depth (m)	LOCATION B		
			Inclinometer (mm)	Cloud to Cloud (mm)	Strip (mm)
28.08.2017	0	0	0	0	0
06.09.2017	9	0	15	14	17
10.09.2017	13	0	-	23	28
17.09.2017	20	0	52	48	57

501 Table. 6. Maximum displacements at the pile capping beam at different epochs via all adopted
502 methods.

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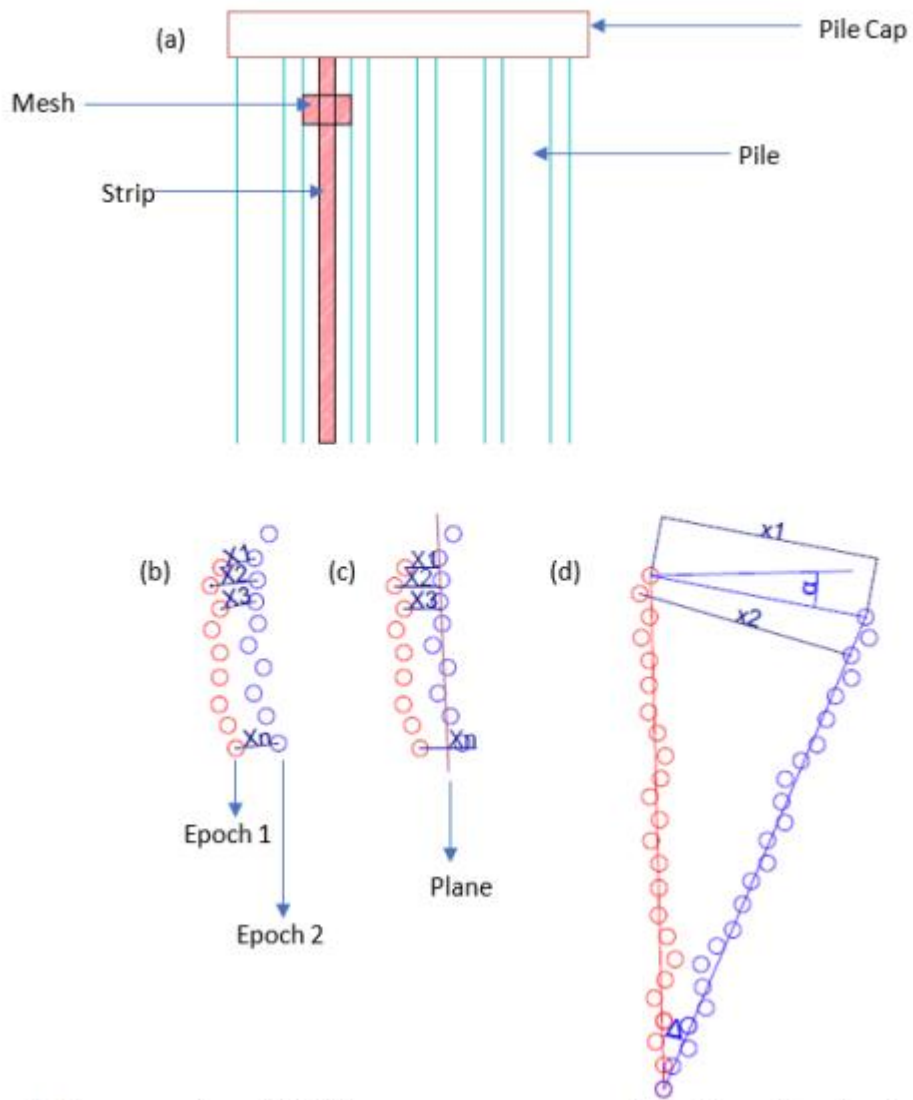


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 505 Figure 1 - Flowchart representing the steps followed in aerial close-range photogrammetry
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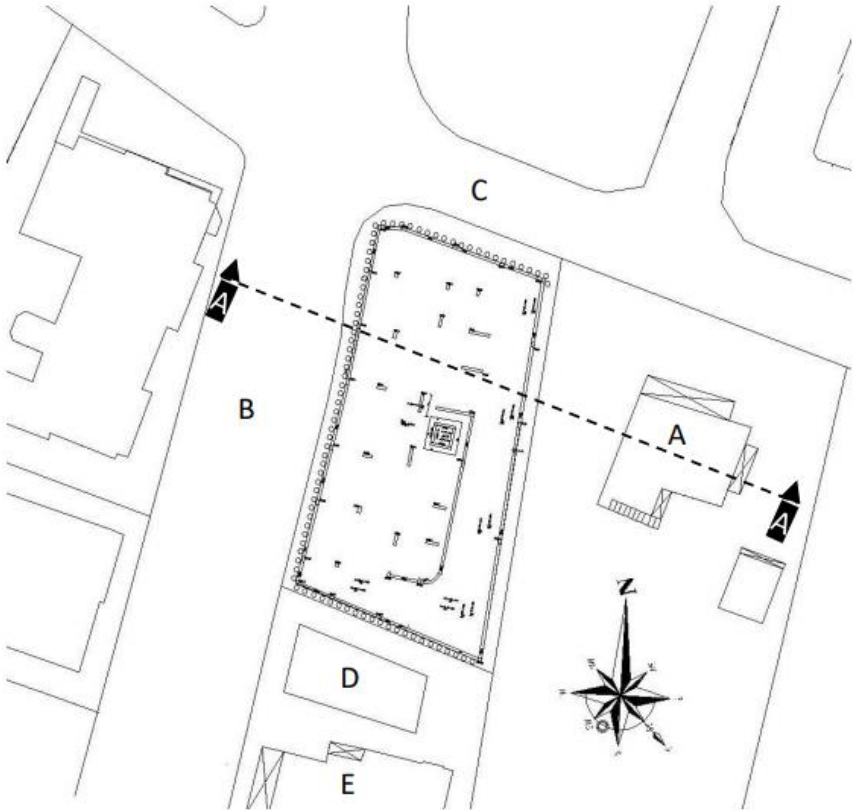


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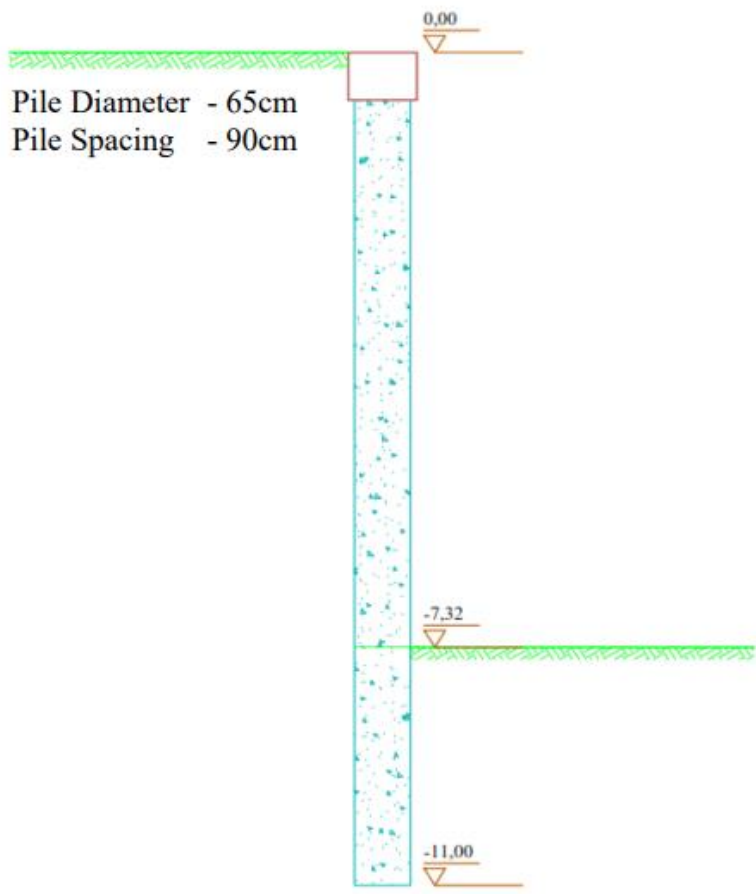
Figure 2 - . Case study area aerial photographs and ground control points.



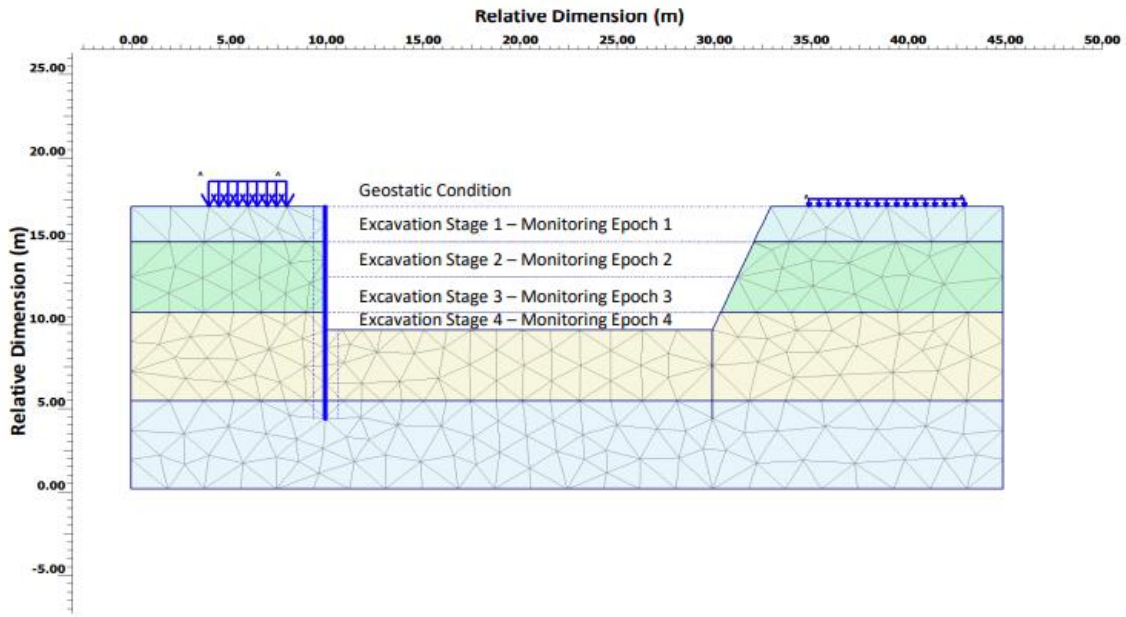
510
 511 Figure 3 - . Representation of (a) Pile arrangement cross section with mesh and strip
 512 sectioning (b) Cloud to cloud (c) Cloud to mesh and (d) Strip
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515 Figure 4 - . Layout of the case study area.

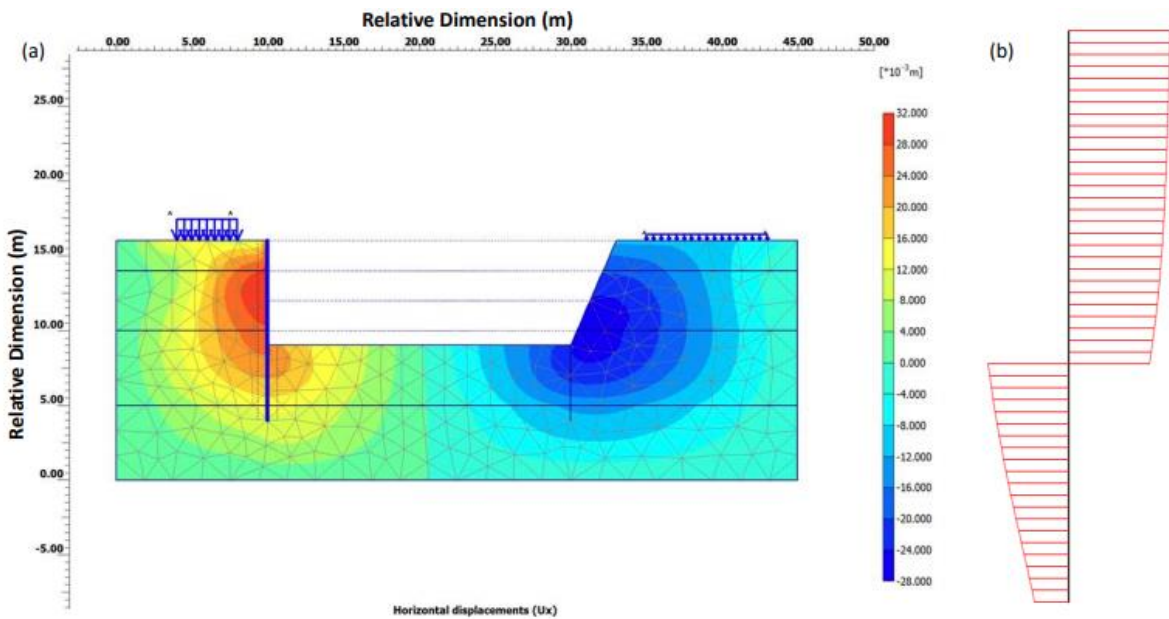


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517 Figure 5 - Proposed cantilever retaining wall
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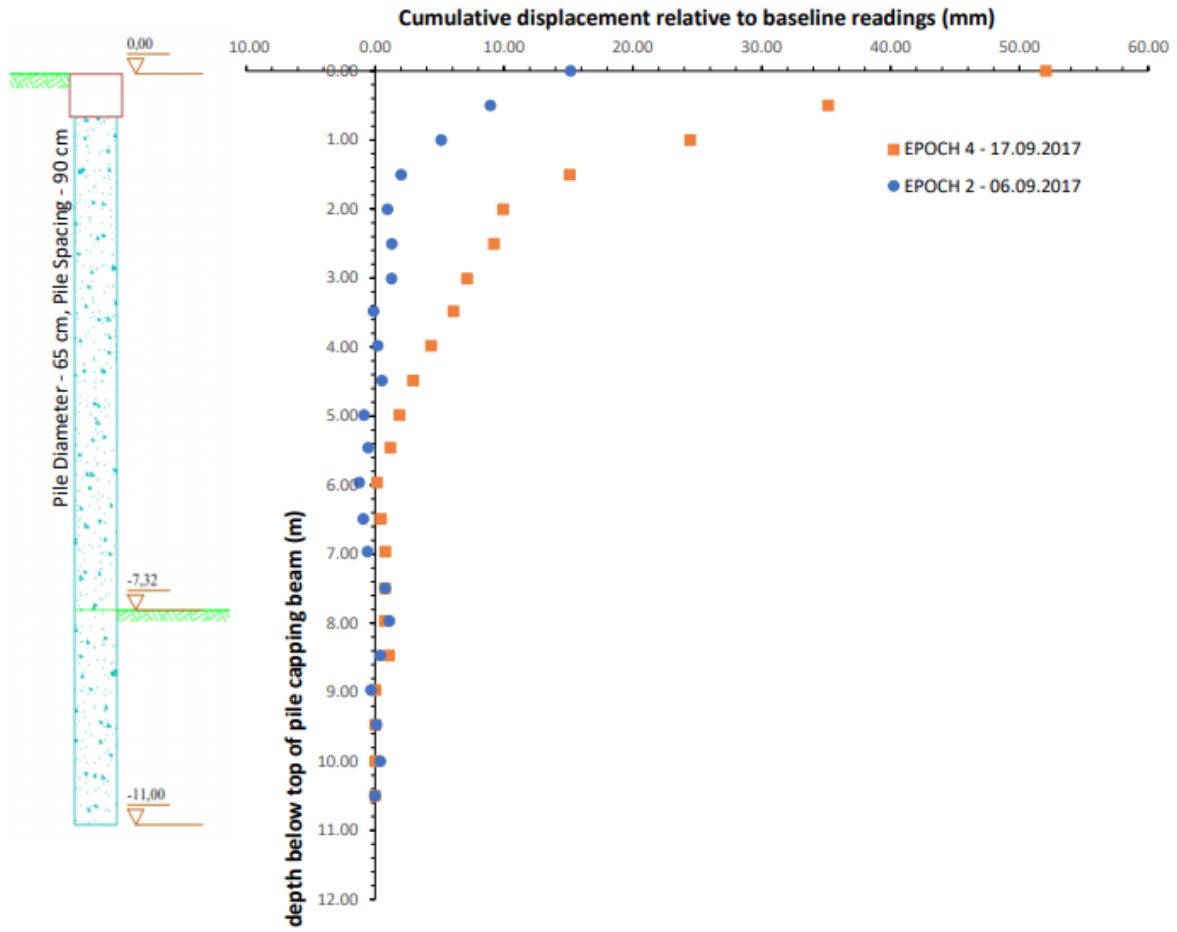


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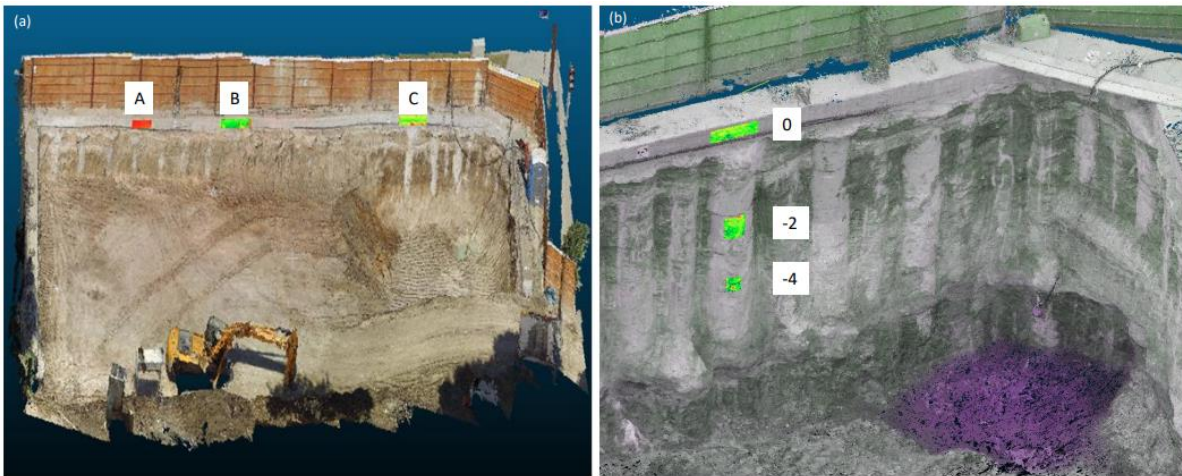
520 Figure 6 - Numerical analysis showing stages of excavation, monitoring and analysis.
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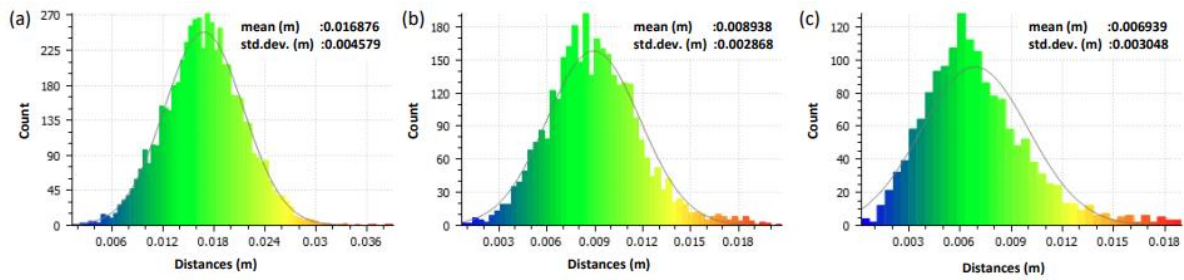
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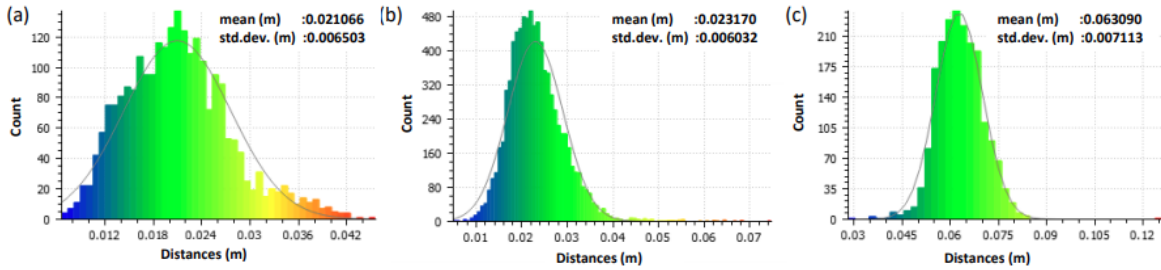
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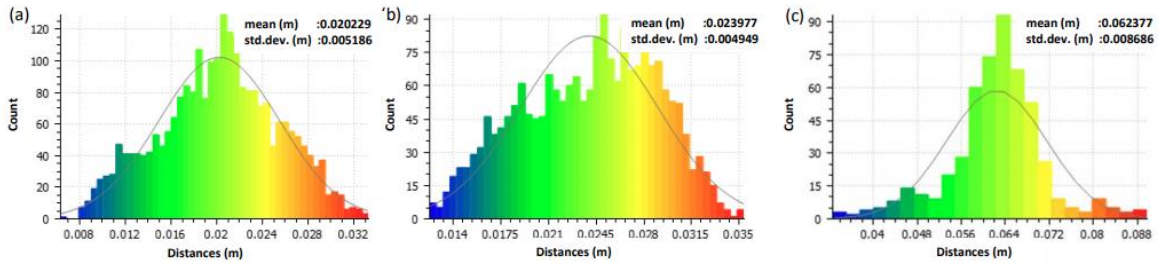
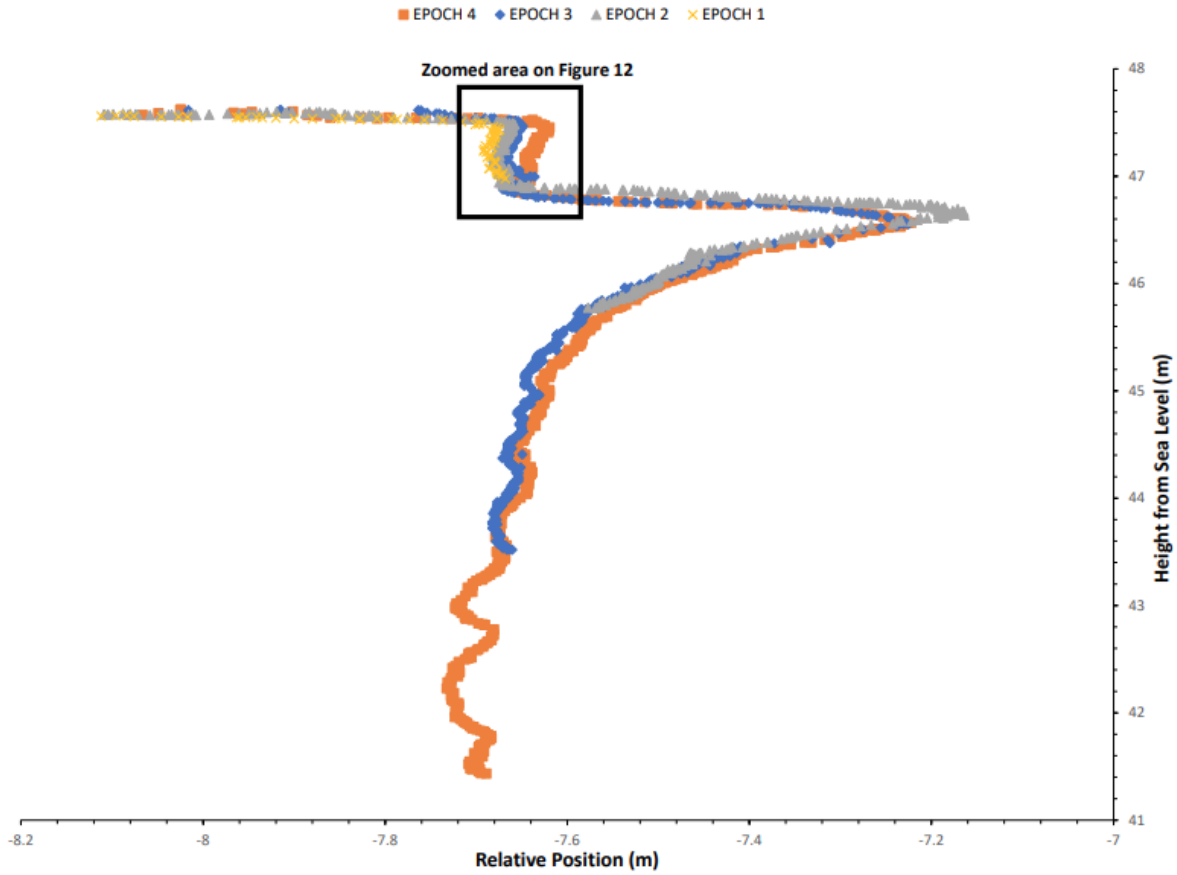


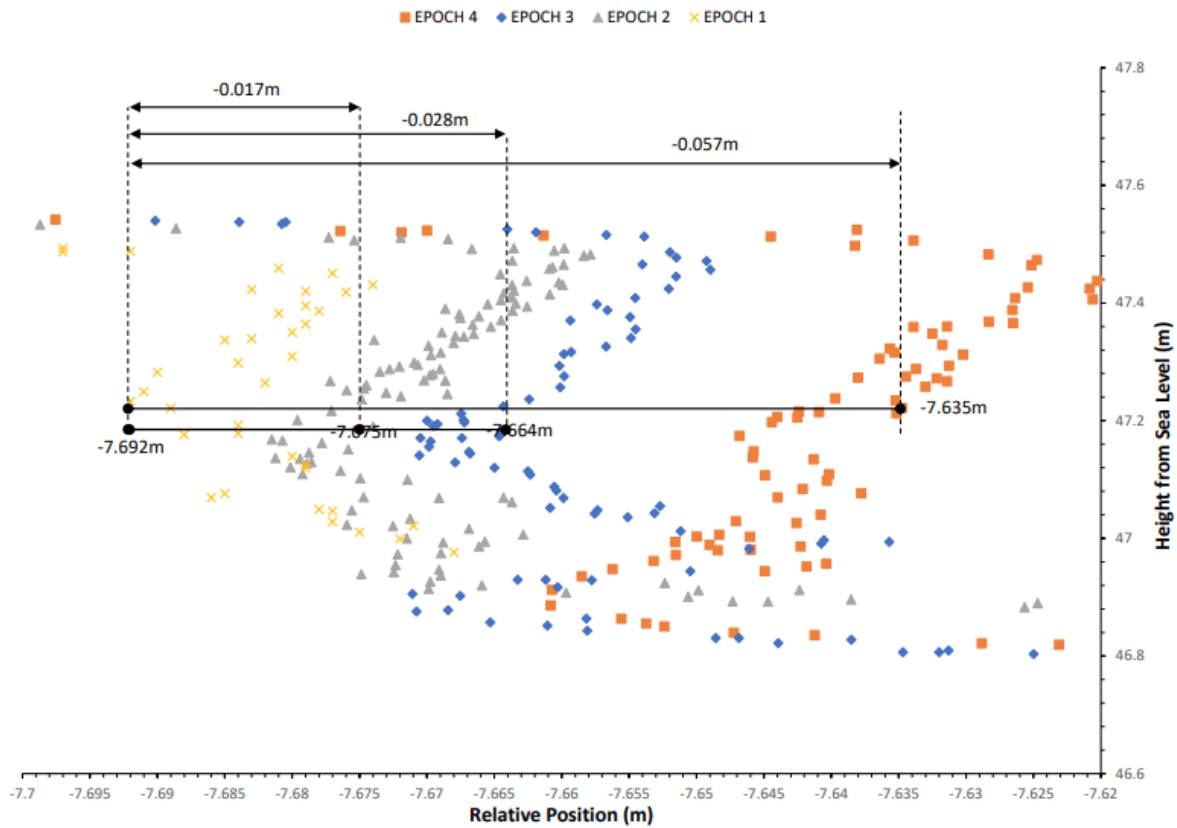
Figure 12. Gauss distribution of Cloud to Mesh distance comparison at location A (a) Epoch 1-2, (b) Epoch 1-3, (c) Epoch 1-4.

541
542 Figure 12- Gauss distribution of Cloud to Mesh distance comparison at location A (a) Epoch
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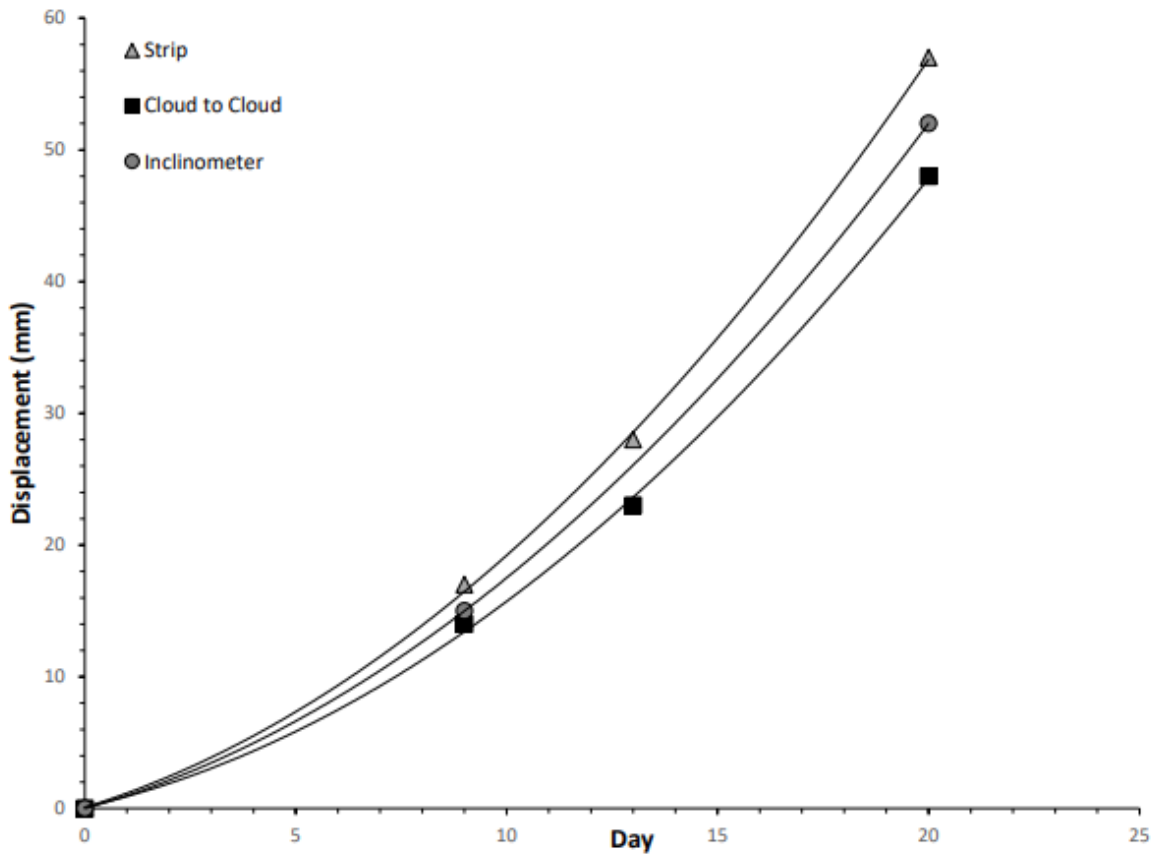
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