

FIRST ASSESSMENTS ON HERITAGE SCIENCE ORIENTED IMAGE-BASED MODELING USING LOW-COST MODIFIED AND MOBILE CAMERAS

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ABSTRACT:

Three-dimensional modeling of cultural heritage, especially concerning large scale studies, as for example, archaeometry, diagnostics and conservation intervention applications, which usually require high-resolution and multi-spectral analyses, necessitates the use of complicate and often expensive equipment. Recent developments regarding low-cost commercially available spectrally modified digital reflex cameras, smartphones with good quality image sensors, mobile thermal cameras in combination with automated or semi-automated photogrammetric software implementing Structure from Motion (SfM) and Multiview Stereo (MVS) algorithms constitute some cheaper and simpler alternatives. Although, the results of the integration of these types of sensors and techniques are often not evaluated as metric products. The presented research combines the above-mentioned instrumentation and software to implement and evaluate low-cost 3D modeling solutions on heritage science-oriented case studies, but also to perform some first assessments on the resulting models' metric properties, quality of texture and usefulness for further scientific investigations.

1. INTRODUCTION

The necessity of 3D heritage digitization can be attributed to the need for comprehensive documentation, protection, preservation interventions and valorisation. It has been highlighted multiple times in international agreements and directives. Application fields include digital archives, 3D virtual display and restoration, diagnosis, conservation and monitoring (Li et al., 2010). Most cases of large scale modeling and visualization, usually require high-resolution and highly accurate digitization products.

Many heritage sciences fields, as for example archaeometry and diagnostics benefit greatly from three-dimensional modeling utilizing data corresponding to different spectra. The classic photogrammetric modeling approach by visible spectrum (VIS) imagery can provide valuable data to further investigate historic surfaces (Cai, 2017) and to support the overall restoration process (Dellepiane et al. 2017). Direct image-based modeling or post-texturing with non-VIS images can provide 3D records useful for art conservation, since near ultraviolet (UVA) and near infrared (IRA) imaging comprise common non-invasive techniques for the study of wall paintings (Piroddi et al., 2016), artworks (Bendada et al., 2015) and archival documents (Vandermeulen et al., 2018). Long-wavelength infrared (IRC) imaging (thermography) is usually associated with assessment of the state of preservation of historic structures to identify concentrations of moisture, cracks and delaminations (Grinzato, 2012). The last three techniques, which produce non optical data, have also been explored for direct 3D modeling or for texturing heritage digital replicas with various approaches (Adamopoulos et al., 2019). Image-to-model (2D-to-3D) registration with corresponding points, combined Bundle Adjustment (BA), bi-camera systems, registration by photogrammetric tracking on pre-calibrated sensors, cloud-to-cloud and model-to-model (3D-to-3D)

registration with precise models produced by active sensors are some of those approaches.

Despite the undoubtable usefulness of 3D modeling products containing VIS and non-VIS information oriented for heritage science, these products often require expensive instrumentation and software and very time-consuming processing. Although, recently, simple to use automated or semi-automated photogrammetric software implementing Structure from Motion (SfM) and Multiview Stereo (MVS) algorithms, which are becoming extremely popular for heritage applications, in combination with low-cost sensors, have made heritage digitization more feasible (Georgopoulos and Stathopoulou, 2017). More specifically, the availability of low-cost digital and modified digital cameras for UVA, IRA and multi-spectral imaging, that are not any more restricted to very low resolutions has made possible the direct modeling from non-VIS imagery (Grifoni et al., 2018; Webb et al., 2018). It should also be mentioned that many contemporary mobile phone cameras can produce imagery of adequate quality for photogrammetric use and have already successfully been implemented in case studies for rapid cultural heritage mapping (Calantropio et al., 2017). Additionally, commercially available small mobile thermal cameras can be found on the market, which, despite low resolutions can produce radiometrically accurate thermal depictions ($\pm 3\sim 5^{\circ}\text{C}$) and should therefore also be considered for heritage modeling applications.

The current study aims to investigate the feasibility of large-scale multi-spectral image-based heritage digitization, implementing workflows that utilize low-cost equipment, free/ low-cost SfM approach-based software for 3D modeling and free software for point cloud manipulation and post-processing. As mentioned, recent bibliography provides several case studies evaluating smart phone and low-cost digital cameras for heritage VIS 3D

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modeling (Rehany et al., 2017; Santagati et al., 2017) but the non-VIS products are seldom evaluated from a metric point of view; as has been performed for more complicated and expensive spectral acquisition/ photogrammetric reconstruction scenarios (Mathys et al., 2019). Therefore, this study also addresses in detail all parameters of the sensors utilized, acquisition and processing workflows implemented, and performs an extensive comparison on the geometric and the radiometric characteristics of the three-dimensional results produced.

Section 2 of this paper focuses on the case studies, the low-cost equipment used, acquisition scenarios and other characteristics of produced datasets. Section 3 concentrates on software, hardware, processing workflows for image-based modeling and results. In section 4 the results are assessed, metric comparisons are made, and further heritage-science oriented evaluations are described. Finally, in section 5 some concluding remarks and directions for future research are demonstrated.

2. DATASETS

2.1 Case Studies

The study objects of this research included a replica of an Early Cycladic II Spedos-variety marble figurine (approx. 4cm x 4cm x 4cm), a copy of a Roman capital (approx. 45cm x 45cm x 45cm) and part of a façade, at the monumental complex of the Reggia di Venaria in Turin, Italy, located in the former 18th century stables and horse-riding school, designed by Benedetto Alfieri and restored in 2005 for the purpose of hosting "La Venaria Reale" Conservation and Restoration Center (approx. 2.5m x 4.6m), herein referred to as OBJ1, OBJ2 and OBJ3 respectively.

2.2 Instrumentation

The instrumentation used in this research (table 1) consisted of: a Canon EOS Rebel SL1 used DSLR camera (230\$) with a full-spectrum acquisition conversion (275\$) by 'Life Pixel Infrared' and three external filters (76.5\$ each) for VIS, IRA and UVA+ blue imaging; a Canon 1200D DSLR camera (220\$); a Canon EF-S 18-55mm IS II lens (90\$); a Huawei P30 phone (485\$) with a 5.6mm lens camera (Sony IMX650 Exmor RS wide sensor); a FLIR One Pro mobile thermal (IRC) camera for Android smart phones (400\$) with thermal resolution of 160 pixels x 120 pixels (saved at a 1440 pixels x 1080 pixels format), accuracy $\pm 3^{\circ}\text{C}$ and thermal sensitivity 150 mK; a MANFROTTO Tripod (67.5\$) for cameras and smart phones. Additionally, a STONEX F6 handheld scanner was used for further metric assessments on OBJ2, with 0.5-4.5 m effective range, up to 2% upon scanning distance 3D point accuracy and 5mrad resolution.

Type	Small DSLR	Small DSLR	Smart Phone	Thermal camera
Brand	Canon	Canon	Huawei	FLIR
Model	EOS 1200D	REBEL SL1	P30	One Pro for Android
				
Sensing range	380 – 740nm	280nm – 1.4 μm	380 – 740nm	8 – 14 μm
Resolution	17.9 MP	17.9 MP	39.9 MP	1.6 MP
Sensor	CMOS APS-C	CMOS APS-C	CMOS	Uncooled VOx
Pixel size	4.31 μm	4.31 μm	0.93 μm	1.33 μm

Table 1: employed imaging sensors

2.3 Data acquisition

Due to the specific interest in testing and evaluating techniques that differed from established practices on heritage spectral imaging and modeling, the comparability of results was taken into consideration, for planning the acquisition of datasets for image-based approaches with the low-cost sensors. Meaning, that despite following a standard workflow for capturing the image datasets to be processed with SfM approach photogrammetric software, it was attempted to keep as many capturing conditions constant as possible for all sensors and spectra, for every case study. Thus, during the production of the 3D meshes, the main parameters that would vary and therefore be compared would be only the different wavelengths captured and different processing software. More specifically, an effort was made to keep internal and external parameters similar amongst low-cost sensors and spectra and constant during data acquisition, furthermore, taking into consideration ground sampling distances (GSDs) – density of data. In all cases custom white balance was applied and no further photographic equipment was used. Especially, thermal images were acquired on short spans of time, on stable climatic conditions maintaining same minimum - maximum temperatures of the visualisation scale, to collect uniform IRC data. During thermal acquisition, optical images of the same scenes were stored as well. Moreover, point cloud acquisition of OBJ2 with the handheld scanner was performed taking into consideration the final density. All photo acquisition conditions are summarized in tables 2-4. For OBJ3 a set of 18 control and check points were measured with a GeoMax Zoom30 3", producing results of 5-6 mm accuracy at x, 2-3 mm at y and 4-5 mm at z axis.

camera	f [mm]	distance [m]	GSD [mm]	spectrum	no. images	f-stop	exposure [s]	ISO
SL1	18	0.20	0.048	VIS	45	8	1/20	200
SL1	18	0.20	0.048	full	45	8	1/20	200
SL1	18	0.20	0.048	UVA _b	45	8	1/2	200
SL1	18	0.20	0.048	IRA	45	8	1/2	200
P30	5.6	0.25	0.044	VIS	45	8	1/20	200

Table 2: details of image datasets for OBJ1

camera	f [mm]	distance [m]	GSD [mm]	spectrum	no. images	f-stop	exposure [s]	ISO
SL1	18	0.75	0.18	full	40	11	1/5	200
SL1	18	0.75	0.18	UVA _b	40	11	1	200
SL1	18	0.75	0.18	IRA	40	11	1	200

Table 3: details of image datasets for OBJ2

camera	f [mm]	distance [m]	GSD [mm]	spectrum	no. images	f-stop	exposure [s]	ISO
I200D	18	1.50	0.36	VIS	55	11	1/15	200
SL1	18	1.50	0.36	full	55	11	1/15	200
SL1	18	1.50	0.36	IRA	55	11	1/5	200
SL1	18	1.50	0.36	UV-B	55	11	1/5	200
P30	5.6	2.00	0.35	VIS	55	1.8	1/500	200
FLIR	1.5	1.75	1.55	VIS	110	-	-	-
FLIR	-	-	-	IRC	110	-	-	-

Table 4: details of image datasets for OBJ3

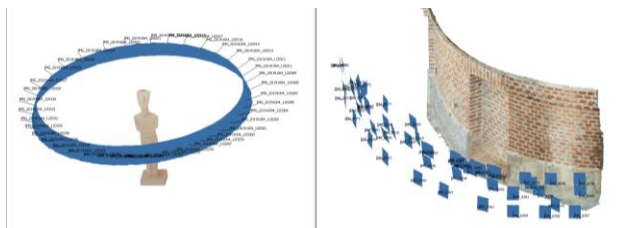


Figure 1: data acquisition scenarios OBJ1(left) and OBJ3(right)

3. PROCESSING

3.1 Software and Hardware

The software employed for SfM image-based modeling included commercial solutions Agisoft Metashape Standard (179\$) (AM), 3D Flow Zephyr Lite (165\$) (FZ) and a pipeline combining open/free tools: VisualSfM (VSfM) (Wu, 2013), CMVS (Furukawa et al., 2010) and MeshLab. For the processing of datasets, a SANTECH customized portable laptop was used, with a 6-core Intel i7-8750H CPU at 2.2 GHz (Max 4.1 GHz) with 32 GB RAM and NVIDIA GeForce RTX 2070 GPU.

3.2 Image-Based Modeling Approach

A standard semi-automatic photogrammetric procedure for large-scale heritage documentation was followed for all datasets, maintaining same processing parameters in each software and as similar as possible between software, to be able to compare not only the quality and accuracy of produced clouds and models, but additionally algorithms used, processing times and volumes of produced data. For OBJ1 masking and the highest parameters available were used for clouds and meshes generation. For OBJ2 and OBJ3 an overview of the processing parameters is presented in the following table (table 5). For the first two objects scaling was performed with use of multiple scales; for OBJ3 referencing was performed using 9 points with known coordinates at a local x,y,z system as control points and 9 for later check. For texture generation a 16,384 x 16,384 resolution JPEG format was chosen in Metashape, Zephyr and MeshLab with mosaicking blend type.

PARAMETERS	Agisoft Metashape		3DFlow Zephyr	
	OBJ2	OBJ3	OBJ2	OBJ3
Matching & Alignment				
Key point density	high	high	high	high
Pair preselection	generic	unordered	generic	unordered
Key point limits	50 K	50 K	50 K	50 K
Tie points limits	50 K	accurate	50 K	accurate
Dense Matching				
Masking	no	no	no	no
Point density	high	high	medium	medium
Depth filtering	moderate	moderate	moderate	moderate
Mesh Generation				
Max faces number	10 M	10 M	10 M	10 M
Interpolation	disabled	disabled	disabled	disabled

Table 5: photogrammetric processing parameters

3.3 Processing Results

	P30	SLI VIS	SL1 full	SL1 UVAb	SL1 IRA
Tie points	20,080	35,825	38,571	10,462	21,460
Projections	56,841	110,060	115,167	28,862	55,590
Repr. error [pixels]	0.454	0.300	0.328	0.704	0.822
GSD [mm/pix]	0.037	0.054	0.058	0.055	0.061
Dense cloud points [1,000]	2,782	1,281	1,165	1,288	1,170
Mesh faces [1,000]	5,000	3,133	2,849	3,114	2,797
Mesh quality	high	high	high	medium	medium
Texture quality	very high	very high	very high	medium	medium
Total time [mm:ss]	16:56	15:37	15:45	12:42	08:01
Check scales' error [mm]	0.171	0.122	0.155	0.110	0.207

Table 6: Agisoft Metashape results OBJ1

	P30	SLI VIS	SL1 full	SL1 UVAb	SL1 IRA
Tie points	50,335	16,492	17,525	15,866	13,365
Projections	228,832	76,052	80,684	74,034	60,798
Repr. error [pixels]	0.639	0.441	0.463	0.680	0.688
GSD [mm/pix]	0.042	0.057	0.057	0.057	0.057
Dense cloud points [1,000]	750	287	311	351	347
Mesh faces [1,000]	1491	566	620	697	685
Mesh quality	very high	very high	very high	low	low
Texture quality	very high	very high	very high	medium	medium
Total time [mm:ss]	75:16	24:33	26:31	24:43	24:01
Check scales' error [mm]	0.171	0.197	0.178	0.158	0.166

Table 7: 3DFlow Zephyr results OBJ1

For OBJ1, VSfM was not able to reconstruct the scene for any spectra, but AM and FZ were able to orient all images (tables 6,7). AM produced denser sparse clouds by SL1 VIS and SL1 full spectrum results and significantly sparser for other datasets. However, the density of produced dense cloud and 3D mesh for P30 datasets was almost double in volume than spectral datasets from SL1. Total processing times were similar. FZ produced very dense tie points, dense cloud and mesh results for P30 dataset comparing to SL1 ones, which in fact were very similar between them while comparing volumes. Subsequently, also processing time for P30 dataset was three times comparing the amount of time needed for SL1 spectral datasets. In all scenarios for OBJ1 the RMSE for scaled bars used for check was < 0.25 mm. UVAb and IRA point clouds contained a low amount of noise.

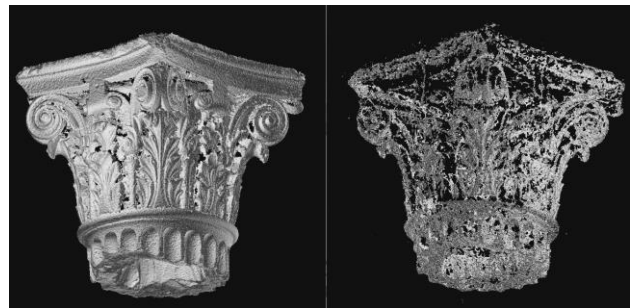


Figure 2: Partially reconstructed scenes of full spectrum (left) and UVAb (right) datasets of OBJ2 with 3DFlow Zephyr

	SL1 full	SL1 UVAb	SL1 IRA
Images Aligned	40/40	40/40	40/40
Tie points [1,000]	45	15	16
Projections [1,000]	111	32	36
Repr. error [pixels]	0.703	1.510	1.910
GSD [mm/pix]	0.162	0.174	0.193
Dense cloud points [1,000]	11,197	8,385	9,515
Mesh faces [1,000]	9,913	9,804	10,000
Mesh quality	high	medium	low
Texture quality	very high	high	high
Total time [mm:ss]	28:56	12:05	11:45

Table 8: Agisoft Metashape results OBJ2

	FZ			VSfM+CMVS		
	SL1 full	SL1 UVAb	SL1 IRA	SL1 full	SL1 UVAb	SL1 IRA
Images Aligned	40/40	40/40	40/40	40/40	40/40	40/40
Matching time [mm:ss]	16:21	08:22	06:21	01:38	00:58	00:56
Alignment time [mm:ss]	00:14	00:12	02:45	00:38	01:11	00:44
Tie points [1,000]	15	9	9	27	13	13
Projections [1,000]	64	32	32	94	36	36
Repr. error [pixels]	0.958	1.083	1.228			
GSD [mm/pix]	0.161	0.170	1.850			
Dense cloud time [mm:ss]	32:22	20:22	22:03	10:24	07:59	06:08
Dense cloud points [1,000]	1,869	740	477	1,575	927	480

Table 9: 3DFlow Zephyr and VSfM+CMVS results OBJ2

For OBJ2, ZA and VSfM were able to only partially reconstruct the scene (figure 2) and produced relatively sparse results. For all processing scenarios for OBJ2 full spectrum sparse clouds had three times the density comparing to those produced by UVAb and IRA images, but dense clouds were of similar densities.

	1200D	SL1 full	SL1 IRA	SL1 UVAb	P30	FLIR VIS
Sparse Cloud						
Images Aligned	55/55	55/55	55/55	55/55	55/55	110/110
Matching time [mm:ss]	00:45	00:48	00:38	00:44	01:44	00:09
Alignment time [mm:ss]	00:40	00:34	01:35	00:33	00:58	01:25
Tie points [1,000]	259	275	254	248	211	64
Projections [1,000]	942	849	920	880	659	251
Repr. error [pixels]	0.504	0.526	0.372	0.458	0.676	0.610
Ground-res [mm/pix]	0.374	0.356	0.376	0.391	0.303	1.560
Average distance [m]	1.56	1.67	1.69	1.73	1.77	1.93
Dense Cloud						
Time [mm:ss]	06:53	04:21	05:29	05:03	13:08	02:58
Point count (1,000)	6,257	8,135	7,273	6,709	11,555	482
Mesh						
Time [mm:ss]	01:55	03:05	02:06	01:54	03:41	00:03
Face count (1,000)	9,976	9,998	9,981	9,996	9,763	1,167
Quality	very high	very high	very high	very high	high	medium
Texture						
Time [mm:ss]	09:06	08:15	08:34	09:11	20:37	01:27
Quality	very high	high	high	high	high	low
Total time [mm:ss]	19:19	17:03	18:22	17:25	40:08	06:02
Control points RMSE [mm]	1.306	1.693	1.602	1.749	3.836	3.645
Check points RMSE [mm]	1.089	1.954	1.434	1.619	2.663	3.133

Table 10: Agisoft Metashape results OBJ3

For OBJ3, AM was able to reconstruct entirely the scene with similar results for the reprojection errors, the density of tie points and densified clouds and the time needed for each processing step of the photogrammetric procedure of all datasets, barring for total time of P30 dataset processing. Control and check points RMSE for 3D coordinates remained below 2 mm for all spectral imagery captured by the two DSLRs and below 4 mm for both the data

captured by the Huawei P30 camera and the visible sensor of the FLIR One Pro thermal camera. All those errors were lower than the accuracy of performed topographic measurements. Although, the imagery from the latter sensor was included in the photogrammetric procedure only to be able to use the computed orientations to texture with thermal data the high-quality 3D mesh produced by the EOS 1200D VIS image dataset. This was performed without optically calibrating the IRC sensor, considering that any distortions would be insignificant on the approximately 5 cm GDS thermal images. However, the optical sensor of FLIR One Pro was calibrated with the Single Camera Calibrator App of MATLAB.

	1200D	SL1 full	SL1 IRA	SL1 UVAb	P30
Sparse Cloud					
Images Aligned	55/55	55/55	55/55	55/55	55/55
Matching time [mm:ss]	23:19	12:56	15:43	12:56	19:22
Alignment time [mm:ss]	00:53	00:29	00:22	00:22	00:23
Tie points [1,000]	33	37	33	36	46,614
Projections [1,000]	208	147	177	186	277
Repr. error [pixels]	0.852	0.827	0.873	1.039	1.761
Ground-res [mm/pix]	0.428	0.396	0.412	0.488	0.324
Average distance [m]	1.687	1.654	1.721	1.738	1.964
Dense Cloud					
Time [mm:ss]	40:03	46:08	41:17	40:55	107:00
Point count (1,000)	2,963	2,924	2,934	2,353	2,550
Mesh					
Time [mm:ss]	00:29	00:33	00:30	00:29	00:30
Face count (1,000)	5,897	5,795	5,450	4,646	5,025
Quality	high	high	high	high	medium
Texture					
Time [mm:ss]	06:13	07:49	06:39	05:39	10:44
Quality	high	high	high	high	medium
Total time [mm:ss]	70:57	67:55	64:31	60:21	2:17:59
Control points RMSE [mm]	2.068	1.551	2.131	1.606	1.160
Check points RMSE [mm]	1.940	1.668	2.318	1.665	1.279

Table 11: 3DFlow Zephyr results OBJ3

FZ was also able to fully reconstruct OBJ3 producing similar volumes for point clouds and meshes for the datasets from all sensors and spectra. However, tie point count together with reprojection errors were higher for the Huawei P30 imagery and additionally, double the processing time was needed for the full 3D reconstruction from that dataset. In all cases xyz RMSEs for OBJ3 with FZ were smaller than 2.5 mm.

As presented in images 3-5, VSfM was able to reconstruct only parts of OBJ3, nevertheless in high detail.

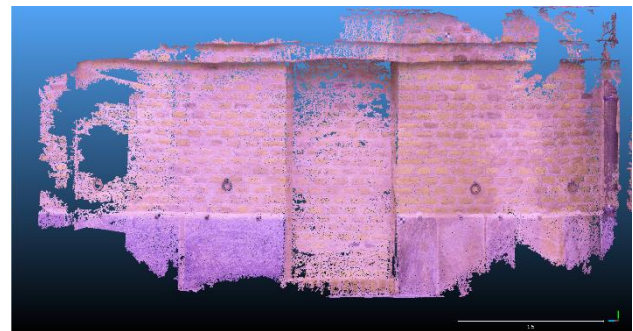


Figure 3: VSfM UVAb dense point cloud OBJ3



Figure 4: VSfM full spectrum dense point cloud OBJ3



Figure 5: VSfM IRA dense point cloud OBJ3

4. EVALUATION

The evaluations conducted regarded quality of produced meshes and textures; considered completeness, preservation of surface details, level of noise, roughness, visual fidelity and radiometric sharpness. Further geometric accuracy tests were performed by comparisons, with SL1 VIS results for OBJ1, with SF6 and very-high-resolution photogrammetric results (produced by SfM image-based approach from a Canon 5DS-R 51 MP dense VIS imagery, decimated for this use) for OBJ2 and with very-high-resolution photogrammetric results (produced by SfM image-based approach from a Nikon D800E 36 MP dense VIS imagery, decimated for this use for OBJ3). The comparisons were performed in CloudCompare, by computing Hausdorff distances of 10% sampled meshes to the reference dense clouds (after ICP Fine registration between them for unreferenced scenes). For OBJ1, both commercial image-based solutions constructed high-to-very high quality meshes and textures for VIS imagery from SL1 and P30 sensors as well as full spectrum data; for UVAb and IRA imagery the reconstructed geometries contained a low amount of noise. The significant geometric differences computed between SL1 VIS mesh and others can be attributed to the inability of the software to precisely reconstruct the shape of an object with almost flat featureless and colorless surface.

SL1 VIS	P30	SL1 full	SL1 UVAb	SL1 IRA
AM	0.72/0.84	0.10/0.41	1.12/1.37	1.07/1.49
FZ	0.44/1.46	0.90/0.40	0.23/1.40	0.24/1.50

Table 12: comparisons between SL1 VIS dense cloud and spectral models for OBJ1 (mean/RMS distances in mm)



Figure 6: Agisoft Metashape OBJ1 meshes (from left to right) P30, SL1 VIS, SL1 full, SL1 UVAb, SL1 IRA

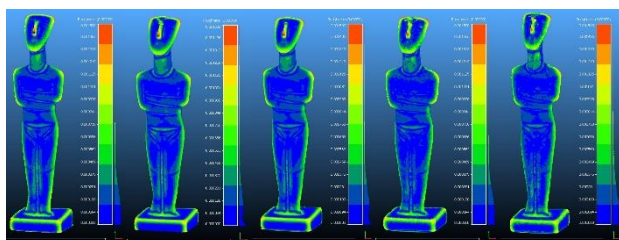


Figure 7: Agisoft Metashape OBJ1 meshes roughness index maps (from left to right) P30, SL1 VIS, SL1 full, SL1 UVAb, SL1 IRA (calculated for neighbourhoods of 0.5 cm²)

For OBJ2, AM produced very high-quality 3D mesh and texture results from full spectrum imagery, medium quality results from UVAb imagery and low-quality results from IRA imagery. For UVAb and IRA imagery the reconstructed geometries contained a very high amount of noise. The inability to autofocus on the object, for a significant part of the data acquisition for these scenarios, under interior lighting conditions certainly contributed to this amount of noise. All mean differences were < 0.5 mm and RMS < 3 mm, with also 90% differences < 3 mm in all cases, which equals to 6% max error regarding the objects' dimensions.

	SL1	SL1 UVAb	SL1 IRA
Canon REBEL-SL1	-	0.172/1.972	0.656/2.580
Canon EOS5DS R	-0.387/1.941	-0.068/2.368	0.523/2.817
SONEX F6	-0.095/1.923	0.010/2.467	0.565/2.942

Table 13: geometric comparisons for OBJ 2 (mean/RMS distances in mm)

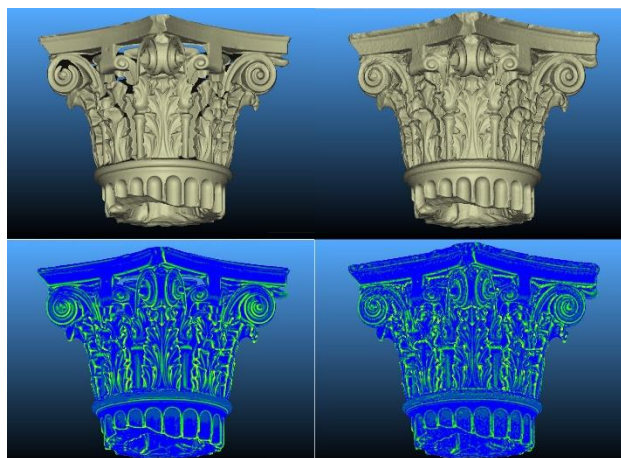
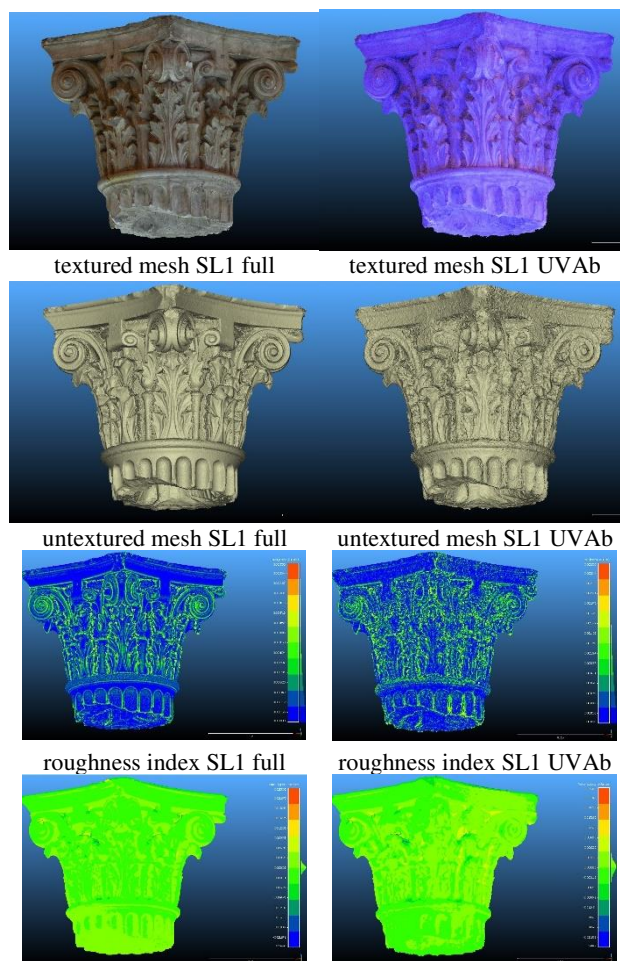


Figure 8: reference models for OBJ 2, meshes (up), roughness index maps (down), SF6 (left), SDS R VIS (right)



Hausdorff distances SL1 full spectrum mesh from SF6 cloud Hausdorff distances SL1 UVAb mesh from SF6 cloud

Figure 9: Agisoft Metashape OBJ2 results for full spectrum imagery (left) and UVAb imagery (right)

For OBJ3, both AM and FZ produced high-to-very high-quality 3D meshes and texturing results for all sensors and spectra. Furthermore, P30 imagery produced a very low amount of noise, but for all comparisons with the SL1 VIS data, mean distances were < 1 mm for both software and RMS < 4 mm for AMP, < 6 mm for FZ, which correspond to approximately 2% of the smaller dimension of the reconstructed object and, additionally, are lower than the accuracy of the ground control points used for referencing the scene.

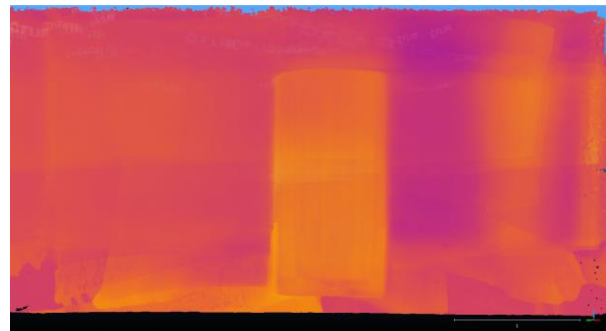
1200D	P30	SL1 full	SL1 UVAb	SL1 IRA
AM	-0.572/3.589	0.284/2.206	-0.946/2.053	0.116/2.190
FZ	-0.020/3.882	-0.284/5.128	0.307/4.129	0.085/4.323

Table 14: geometric comparisons for OBJ3 (mean/RMS distances in mm)

Meshes produced from DSLR and mobile phone camera image datasets had similar levels of roughness, high preservation of surface details on the final mesh and sharp textures. Moreover, on UVAb and IRA models of the façade, areas of high moisture content, delamination and biodecay are easily distinguishable. The high accuracy 3D model with the low-res thermal texture produced can also assist a more abstract identification of the areas with high surface humidity.



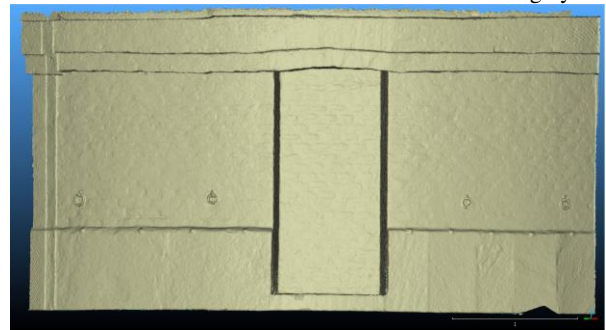
1200D textured mesh



1200D mesh textured with FLIR One Pro IRC imagery



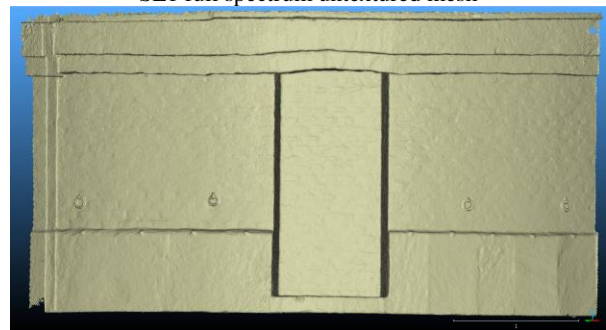
SL1 full spectrum textured mesh



SL1 full spectrum untextured mesh



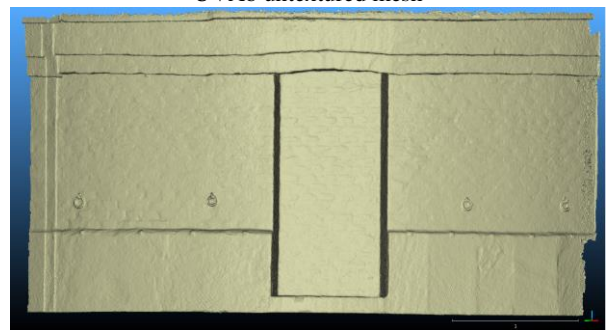
UVAb textured mesh



UVAb untextured mesh



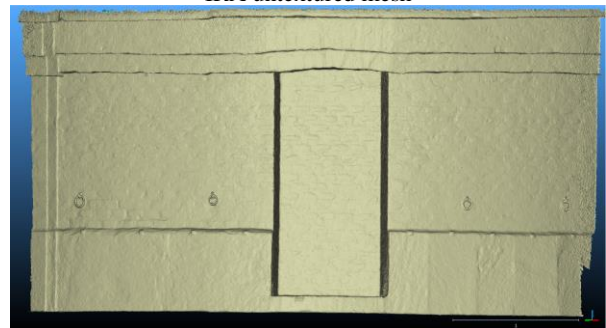
IRA textured mesh



IRA untextured mesh



P30 textured mesh



P30 untextured mesh

Figure 8: Agisoft Metashape results for OBJ3

5. CONCLUSIONS AND PERSPECTIVES

The study presented here, aimed to evaluate the use of low-cost photographic and mobile equipment with SfM approach image-based modeling software, for multi-spectral heritage studies and the first results produced, indeed proved the feasibility of that combination. As anticipated, conditions of data acquisition and characteristics of the case studies, have even greater effect on the photogrammetric pipelines implemented and on the 3D results produced, than when applying standard optical photogrammetric approaches, for large-scale heritage applications. Especially, sharpness, radiometric uniformity and overlaps of the photos are some of the parameters that impacted the quality of spectral meshes produced. The internal alterations of a low-cost DSLR, when modified to be able to capture multi-spectral imagery, mainly regarding focusing, are significant and will further be investigated by the authors along with the impacts of different external filters, lenses and denser image capturing. Even though Metashape was able to fully reconstruct all datasets for case studies involved, other software implemented did not succeed to do so (despite the use of similar algorithms by Zephyr), therefore they should also be further evaluated for low-cost VIS and non-VIS imagery of tangible heritage with denser datasets, other real-life heritage applications and, mainly, on cases where there are significant textures because of deterioration or pigments or deterioration by-products, which have very adverse responses on various spectra. In conclusion, the use of the low-cost equipment implemented here proves promising, considering the very high-quality meshes and textures produced by cell phone camera, the ability to distinguish colorings, delaminations, biodecay and moisture from the DSLR non-VIS meshes and moisture content from the model produced with thermal textures (from FLIR One).

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