

Three-dimensional (3D) reconstructions of the coastal cliff face in Normandy (France) based on oblique Pléiades imagery: assessment of Ames Stereo Pipeline® (ASP®) and MicMac® processing chains

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- 1 Three-dimensional (3D) reconstructions of the coastal cliff face in
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Three-dimensional (3D) reconstructions of the coastal cliff face in Normandy (France) based on oblique Pléiades imagery: assessment of

16 Ames Stereo Pipeline[®] (ASP[®]) and MicMac[®] processing chains

- 17 Images from agile (viewing angle over 40°) and very high spatial resolution 18 satellites (inferior to 1 m) can be useful for monitoring cliff faces, which is the 19 best proxy to better understand coastal cliff dynamics. However, these images 20 with a specific configuration are rarely used, partly because it is cumbersome to 21 process them. Based on Pléiades images of the coastal cliff face along the coast 22 of Normandy, with a high angle of incidence (up to 40°) and taken on multiple 23 dates, the paper aims to identify i) the best open-source processing chain to 24 reconstitute three-dimensional (3D) cliff faces by stereo restitution ii) the reasons 25 behind its best performance and iii) the key parameters to change depending on 26 the image datasets or processing chains so as to facilitate transposition. The 27 Ames Stereo Pipeline[®] (ASP[®]) and MicMac[®] software programmes were tested 28 using different parameters (matching algorithm, size of correlation window, etc.) 29 for the 3D reconstructions. MicMac[®] provides the best performance using 30 GeomImage (1-2 pixel matching) with a size of correlation window of 3×3 or 31 7×7 associated with a regularization parameter of 0.10. With these parameters, 32 the point clouds of the cliff face have an average point density of 1.70 point m⁻², a 33 mean distance from Unmanned Aerial Vehicle (UAV) ground truth data of 34 0.04 m and a standard deviation of 1.72 m. With these characteristics, the 35 threshold of rockfall detection using a multi-source comparison is assessed at 100 36 m^3 , which involves that the large majority of rockfalls (69%) around the study 37 area could be detected by a diachronic approach. Considering the daily Pléiades 38 revisiting time, this method offers a great opportunity to monitor erosion and to 39 better understand coastal cliff dynamics.
- 40 Keywords: Pléiades satellites, oblique images, 3D restitution, cliff face, coastal
 41 erosion.

42 Introduction

43 Starting in the 2000s, the new generations of very high spatial resolution (less than 1 m

- 44 in panchromatic mode) and agile satellites with short revisit time (QuickBird,
- 45 WorldView, GeoEye, Pléiades, until around 40°) offer a greater scientific potential to
- 46 combine large scale, high-resolution studies (Poli et al. 2015; Collin et al. 2018), and to

47 do three-dimensional (3D) topographic reconstructions from pairs or triplets of images

- 48 from different viewing angles. Some topics in geosciences have explored the potential
- 49 of these new datasets. Elevation changes in glacier topography can be studied thanks to

50 Pléiades stereo imagery (Berthier et al. 2014), height changes due to earthquakes can be 51 determined by stereo and tri-stereo reconstructions with a precision of a few decimetres 52 (Zhou et al. 2015), lava flow volume can be estimated with Digital Elevation Model 53 (DEM) of Difference (DoD) computed from Pléiades triplet images (Bagnardi, 54 González, and Hooper 2016). 55 To observe all the changes of the coastal cliff, the entire cliff face (from the foot 56 of the cliff to its top) should be observed. This means that the best point of view is 57 horizontal. However, cliff face surveys are quite rare given that few datasets use this 58 point of view. Until recently, most datasets had a vertical point of view (aerial 59 photographs, aerial Light Detection And Ranging (LiDAR), satellite imagery, etc.), and 60 therefore the most common proxy to determine the evolution of the cliff was the cliff 61 top (e.g. Costa 1997; Zviely and Klein 2004; Foyle and Naber 2012). The arrival of 62 agile (i.e. satellites able to observe the field from a high angle of incidence) and very 63 high spatial resolution satellites, Terrestrial Laser Scanners (TLS), terrestrial 64 photogrammetry, mobile laser scanners set up on a boat have made it easier to observe 65 the cliff face and therefore to record its changes (e.g. Letortu et al. 2020; Gulyaev and 66 Buckeridge 2004; Letortu et al. 2018; Michoud et al. 2014, respectively). Whereas i) 67 coastal cliffs likely exist on roughly 52% of the global shoreline (Young and Carilli 68 2019) ii) many people, houses, companies, infrastructure are/could be threatened by the 69 risk of coastal erosion iii) there are high societal and political demands for reliable, 70 homogeneous, perennial and low-cost data on long stretches of coastline in order to 71 better understand erosion and protect inhabitants iv) various agile and very high spatial 72 resolution satellites are available (e.g. QuickBird, GeoEye, WorldView and Pléiades), 73 this research topic is still in its early stages with a unique paper (Letortu et al. 2020).

74	Pléiades-HR (High-Resolution Optical Imaging Constellation) is a two-
75	spacecraft constellation of CNES (the French Space Agency). The Pléiades 1A and 1B
76	satellites were launched (16 December 2011, 02 December 2012, respectively) by the
77	Soyuz launcher from the French Guiana Space in Kourou. The Pléiades satellites have
78	six main qualities that are useful for coastal cliff studies (ASTRIUM 2012):
79	(1) The very high spatial resolution of their images (e.g. a ground sampling distance
80	of 0.70 m at the nadir for panchromatic images);
81	(2) A high level of agility, with a theoretical viewing angle up to 47° ;
82	(3) The daily revisit frequency;
83	(4) A swath width of 20 km at the nadir, in line with the coastal management scale,
84	i.e. the hydro-sedimentary cell (from hundreds of metres to hundreds of
85	kilometres);
86	(5) A mission lifetime of ten years and a continuity of measurements between the
87	next versions of the satellites (Pléiades Neo constellation);
88	(6) Free access to the images under certain conditions for research institutes.
89	The EROFALITT (erosion of coastal cliffs) project was funded by CNES (2016-
90	2020) in order to explore the potential of Pléiades images to monitor the evolution of
91	coastal cliffs by observing the cliff face proxy. With Pléiades images with a high angle
92	incidence, 3D reconstitutions of cliff faces along the coast of Normandy (NW France)
93	were performed. This project was challenging because:
94	• It is located in Varengeville-sur-Mer (Seine-Maritime), where disturbed weather
95	and the NNE orientation of the cliff face can alter the image quality (due to

4

clouds and shadows, respectively);

97	•	It has uncommon image acquisition modalities: because of the NNE orientation
98		of the cliff face, it was shown that the standard stereo or tri-stereo acquisition
99		was unsuitable. Another acquisition modality was proposed: a multi-date survey
100		over several consecutive days. As the orbital pass position of the Pléiades
101		satellites changes daily, a mono-acquisition up to an incidence angle of 40°
102		(across-track) acquired on successive days (around 13:20 in local time,
103		Universal Time Coordinated (UTC) $+ 2$) can be used to observe the cliff face at
104		various viewing angles to reconstruct it in 3D via stereo restitution. To assess
105		the impact of the angle of incidence, two sets of images were simultaneously
106		requested each day: one with a pitch imaging angle of 40° and a second one with
107		a pitch imaging angle between 0° and 10° (more details in Letortu et al. 2020);
108	•	There is a limited choice of image processing software programmes as this is an
109		unusual image dataset.
110		The objectives of this paper are to answer two main questions:
111	•	What is the best processing chain to obtain a 3D reconstitution of the cliff face
112		between Ames Stereo Pipeline [®] (ASP [®]) and MicMac [®] from our image dataset?
113		Why?
114	•	What are the key parameters that depend on the images or the processing chain
115		per software in order to facilitate any transposition of our method to other sites
116		or images (no need to test all the parameters, but only a few)?
117		A high angle of incidence and multi-date images acquired by a push broom
118	sensor	limit the number of software programmes that can be used to process images
119	(e.g. A	ASP [®] , ERDAS IMAGINE [®] , Satellite Stereo Pipeline [®] (S2P [®]), MicMac [®] , Agisoft

- 120 Metashape[®]). Previously, we used ERDAS IMAGINE[®] (Letortu et al. 2020); however
- 121 open-source software and well-documented processing were important criteria in our
- 122 choice of which software to test. Our goal is to understand why one software package or
- 123 processing parameter works better than another, therefore we must avoid the 'black
- box' effect. Consistent with these requirements, we selected the ASP[®]
- 125 (https://ti.arc.nasa.gov/tech/asr/groups/intelligent-robotics/ngt/stereo/; Shean et al.
- 126 2016) and MicMac[®] (https://micmac.ensg.eu/; Rupnik, Daakir, and Pierrot Deseilligny
- 127 2017) software programmes and the test will focus on the parameters used in stereo

128 matching algorithms. The tests are based on the best images in our set acquired in June

- and July 2017 with pitch imaging angles of 40° and between 0° and 10° (Letortu et al.
- 130 2020).
- 131 First, the material and methods including the study area will be described, then
- 132 the results of our software and processing chain comparison will be presented and

133 discussed.

134 Materials and methods

135 Study site

136 Located in Normandy (Seine-Maritime, NW France) along the English Channel,

137 Varengeville-sur-Mer (1°00'27.34"E; 49°54'59.77"N) is characterized by sub-vertical

138 coastal cliffs (70° to 90°) carved in Upper Cretaceous chalk with flints (part of the Paris

- 139 Basin; Pomerol et al. 1987; Mortimore et al. 2004). The study area stretches over 600
- 140 m, extending 300 m on both sides of the dry valley, called Petit Ailly (Figure 1). These
- 141 cliffs are mainly white in colour (chalk), but are darkened (brown colour) by a bed
- 142 comprised of clay and sand sediment from the Tertiary Period (Palaeogene). These
- 143 cliffs are very prone to erosion $(0.36 \text{ m year}^{-1} \text{ between } 2010 \text{ and } 2017 \text{ (Letortu et al. } 100 \text{ m year}^{-1} \text{ between } 2010 \text{ and } 2017 \text{ (Letortu et al. } 100 \text{ m year}^{-1} \text{ between } 2010 \text{ and } 2017 \text{ (Letortu et al. } 100 \text{ m year}^{-1} \text{ between } 2010 \text{ and } 2017 \text{ (Letortu et al. } 100 \text{ m year}^{-1} \text{ between } 2010 \text{ and } 2017 \text{ (Letortu et al. } 100 \text{ m year}^{-1} \text{ between } 2010 \text{ m$

- 144 2019) whereas the average county retreat rate is 0.15 m year⁻¹ (between Cap d'Antifer
- and Le Tréport, during the 1966-2008 period (Letortu et al. 2014)), with many rockfalls
- 146 of several cubic metres to hundreds of thousands of cubic metres (Letortu et al. 2015).
- 147 A fatality occurred in August 2015 in Varengeville-sur-Mer due to falling rocks.



- 149 Figure 1. Presentation of the study area of Varengeville-sur-Mer (Seine-Maritime,
- 150 Normandy, France).
- 151

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152 Climatically, the study area belongs to the western part of Europe, which is
153 particularly exposed to the influences of low oceanic pressures, and thus, to the types of
154 disturbed weather that dominate approximately 2/3 of the year (Pédelaborde 1958;
155 Trzpit 1970).
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156	The average tidal range is 8 m (macrotidal environment). At low tide, the
157	foreshore is characterized by a wide shore platform slightly inclined to the sea covered
158	by sand and with a gravel barrier near the contact with the cliff foot. The average
159	altitude of the Varengeville-sur-Mer cliffs is approximately 30 m and the coastline is
160	relatively jagged due to rockfall scars that exploit pre-existing fracturing. The cliff face
161	is oriented toward the NNE (Figure 1).
162	This site, found on both sides of the dry valley of Petit Ailly, was chosen
163	because the cliff dynamics are frequently monitored (e.g. Costa et al. 2019; Letortu et
164	al. 2019). Since 2010, it is surveyed by terrestrial laser scanners (3 to 4 times a year),
165	Unmanned Aerial Vehicle (UAV) (up to once a year), and aerial topo-bathymetric
166	LiDAR (every 3 years). Since 2014, it belongs to the French Observation National
167	Service DYNALIT (coastal dynamics), which encompasses various coastal sites of
168	scientific interest to better understand the coastal dynamics.
169	The acquisition of oblique and multi-date images from satellites in this study
170	area is challenging for four reasons:
171	(1) cloudy and rainy weather is frequent because it is located in mid-latitudes where
172	disturbed weather dominates, and therefore it can be rare to have good
172	distuibed weather dominates, and therefore it can be fare to have good
173	conditions for image acquisition;
174	(2) while the Pléiades satellites have a meridian orbit, the NNE orientation of the
175	cliff face makes it difficult to acquire the image;
176	(3) the cliff face is sub-vertical (70° to 90°) and, due to its orientation, it is in the
177	shadow cast by the cliff at the time the satellite passes over, even during summer
178	(Figures 2 and 3);

179 (4) a high tidal range may hide the cliff foot whereas the whole cliff face is needed.

180 **Data**

181	Images were acquired in autumn 2016 (four stereoscopic pairs), in summer 2017 (five
182	stereoscopic pairs) and in winter 2017/2018 (five stereoscopic pairs), covering the 20 km-
183	long cliff line from Quiberville to Berneval-le-Grand (Figure 1). Out of these 28 images,
184	the most relevant stereoscopic pairs for the 3D reconstitution are from June to July 2017
185	as the weather was sunny and there were few shadows on the cliff face (Letortu et al.
186	2020).
187	We decided to focus on six relevant images (10 June 2017, 15 June 2017, 06
188	July 2017 with incidence angles of 0° to 10° and 40°) and therefore we reduced the
189	study area to only around the dry valley of Petit Ailly at Varengeville-sur-Mer (600 m
190	long), where validation data are available. Over this spatially limited area, a large
191	number of tests on the image processing workflow can be considered in terms of

192 computing resources and computing time (Figures 2 and 3).

Image date	Local time of satellite pass (UTC+2)	Solar zenith angle (°)	Image incidence angle (°)		
10 June 2017 and 15 June 2017	13:20 and 13:31	62.1 and 62.9	40		
10 June 2017 and 15 June 2017	13:21 and 13:33	62.2 and 62.7	0 to 10		
10 June 2017	13:21 and 13:20	62.2 and 62.1	0 to 10 and 40		
15 June 2017	13:33 and 13:31	62.7 and 62.9	0 to 10 and 40		
15 June 2017 and 06 July 2017	13:31 and 13:20	62.9 and 61.5	40		
15 June 2017 and 06 July 2017	13:33 and 13:21	62.1 and 61.5	0 to 10		







¹⁹⁵ images selected for the tests.



196

Figure 3. Complete spatial extent of the Pléiades panchromatic image (wavelengths
between 470 and 830 nm of the visible spectrum) acquired on 15 June 2017 (0° to 10°)
and cropped images around the study area in Varengeville-sur-Mer with incidence
angles of 0° to 10° and 40°.

201

202 Ground truth data in this paper are from the UAV 3D reconstruction. This 203 survey was ordered for the RICOCHET (multi-risk assessment on coastal territory in a 204 global change context) project and performed by Azur Drones company on 26 June 205 2017. With a Sony A7R – 36 Mp sensor mounted on an octocopter Mikrokopter, image 206 acquisition were oblique with manual framing. The 3D reconstruction was based on 207 1740 photographs (spatial extent of about 400 m on both sides of the dry valley of Petit 208 Ailly) and 11 targets located to the ground and measured by Differential Global 209 Positioning System (DGPS). It was projected in an absolute coordinate system, in 210 Lambert-93 and associated Réseau Géodesique Français 1993 (RGF93) and

211	Nivellement Général de la France-Institut Géographique National69 (NGF-IGN69),
212	which is the official reference system in France (European Petroleum Survey Group
213	(EPSG) registry: 2154). The 3D reconstruction error was of 2.11 cm, with a sampling
214	distance of 3 cm.
215	TLS ground truth data are also used in this paper. The raw TLS point cloud was
216	obtained from a RIEGL VZ-400 (laser pulse in the near-infrared (1550 nm)) on 25
217	September 2015, which provides scan data acquisition with theoretical 0.005 m
218	accuracy and 0.003 m precision at a range of 100 m (RIEGL Laser Measurement
219	Systems 2014). In Varengeville-sur-Mer, two scanner stations (located at about 75 m
220	from the cliff face) provided each a dense 3D point cloud (more than 22.5 million
221	points). Twenty-one reflective targets (10 cm high cylinders) with different distances
222	from the scanner were used to georeference the point cloud because they were measured
223	by a total station (Trimble M3). The point cloud (spatial extent of about 150 m on both
224	sides of the dry valley of Petit Ailly) was thus projected in Lambert-93 and associated
225	RGF93 and NGF-IGN69. The TLS data processing encompassed three steps : i)
226	georeferencing and point cloud assembly (RiscanPRO®) ii) manual point cloud filtering
227	including areas without overlap with previous TLS data, noise and vegetation
228	(Fledermaus®) and iii) Delaunay two-and-a-half-dimensional (2.5D) meshing (best fit
229	plane, Cloudcompare®) (more details in Letortu et al. 2018). The 2.5D mesh was used
230	for dataset comparison.
231	Both methods proved to be relevant in coastal cliff erosion studies thanks to
232	their high resolution and their centimetre precision (Letortu et al. 2018).

233 Methods

234 <u>Software packages</u>

- 235 The image processing workflow of each software mainly follows the traditional stereo
- restitution steps for 3D reconstructions (Figure 4): input data, cropped data, image
- alignment, correlation and 3D point cloud generation (NASA 2019; Rupnik et al. 2020).



238

- - Step not compulsory; *Rational Polynomial Coefficient; *Matching algorithm parameters to test

Figure 4. Image processing workflow of ASP[®] and MicMac[®] to obtain a 3D point cloud
(NASA 2019; Rupnik et al. 2020).

241

Since the images are taken from different viewpoints, the apparent motion of the scene between the views is computed (called "disparity" in the case of stereo-rectified image pairs) (Hartley and Zisserman 2003). Stereo matching in the correlation step is the core of the image processing workflow (Figure 4). It involves identifying pixel correspondences between the left and right epipolar images. Our tests focused on this correlation step, which is different between ASP[®] and MicMac[®].

248

263

In ASP[®], three matching algorithms are possible (Figures 4 and 5):

249 •	Local Search Window (LSW), which is the default ASP [®] correlation algorithm.
250	A disparity value is computed by correlation for each valid pixel identified in the
251	input image. As the search window size is a key parameter of the correlation step
252	and in order to be efficient in larger search ranges, a Gaussian pyramid approach
253	is applied, that is to say disparities are first estimated using sub-sampled images,
254	and are gradually refined at higher resolution.
255 •	Semi-Global Matching (SGM), introduced in Hirschmuller (2008). The
256	"classical" SGM algorithm has undergone two important changes in $\text{ASP}^{\text{\tiny{(B)}}}$ in
257	order to include unrectified, larger images (NASA 2019): i) two-dimensional
258	(2D) disparity search is performed, similarly to what is done in the Neighbor-
259	Guided Semi-Global Matching algorithm (Xiang et al. 2016) and ii) ASP [®] uses a
260	multi-resolution hierarchical search combined with a compressed memory
261	scheme similar to what is used in the SGM algorithm (Rothermel et al. 2012).
262	This SGM algorithm is based on multi-directional dynamic approaches. Even if it

- algorithm appears to be more effective in images with less texture and can
- 265 discern finer resolution features than LSW since it tends to use much smaller

can be time-consuming because of significant memory requirements, SGM

- 266 matching kernels. However, SGM is prone to generate artefacts at tile boundaries
- and to produce inaccurate results in textureless regions. The ASP developers
 recommend using it cautiously in order to minimize these drawbacks (NASA
 269 2019).
- More Global Matching/Smooth Semi-Global Matching (MGM/SSGM):
 introduced in Facciolo, Franchis, and Meinhardt (2015), the MGM algorithm

272	(also called SSGM algorithm) reduces the amount of high-frequency artefacts in
273	textureless regions in the output image but at the expense of a longer computing
274	time. A hybrid SGM/MGM mode is also proposed in ASP [®] where MGM only is
275	used for the final resolution level which obtains results somewhere between the
276	pure SGM and MGM options (NASA 2019).

In ASP[®], the cost-mode variable (Figure 5) allows the user to choose the cost
function used during the correlation step:

Normalized Correlation Coefficient (NCC) (cost mode 2): the traditional area based matching cost is the square difference of the pixel intensities. NCC often
 accomplishes the matching cost aggregation. This is a window-based matching
 technique that accounts for compensating gain changes. The disparity is then
 determined by a local winner-take-all operation in a small search window and
 checking with a simple threshold. The last step is characterized by sub-pixel
 interpolation and other post processing (Hu et al. 2016).

286 Census Transform (cost mode 3): it associates a binary string to each pixel that • 287 encodes whether or not the pixel has a smaller intensity than each of its 288 neighbours. Not only does it store the intensity ordering but also the spatial 289 structure of the local neighbourhood (Hirschmuller and Scharstein 2008). It performs well for outdoor environments with uncontrolled lighting. ASP[®] allows 290 291 the application of census transform only with the SGM correlator (NASA, 2019). 292 Ternary Census Transform (cost mode 4): A modification of the census • 293 transform, which is more stable on low contrast terrain. The difference of the two 294 census transform matching costs lies in the encoding of the results. For any given

Letortu P., Jaud M., Taouki M, Costa S., Maquaire O., Delacourt C., 2021. Three-dimensional (3D) reconstructions of the coastal cliff face in Normandy (France) based on oblique Pléiades imagery: assessment of Ames Stereo Pipeline® (ASP®) and MicMac® processing chains. International Journal of Remote Sensing. https://doi.org/10.1080/01431161.2021.1892857 295 rectangular window, a pixel will be encoded into a bit string in the Census 296 Transform and into two bits in the Ternary Census Transform (Hu et al. 2016). 297 298 In MicMac[®], the Malt tool proposes two semi-global matching algorithms, 299 where the choice of the cost function is included in the step performed to choose a 300 matching algorithm (Rupnik et al. 2020) (Figures 4 and 5): 301 UrbanMNE is for a matching adapted to the urban digital elevation model. It 302 handles matching in ground geometry, adapted to a scene that can be described 303 by a single function Z = f(X,Y) (where X, Y, Z are Euclidean coordinates).

304 Having the output geometry equal to the input geometry, UrbanMNE is

305 perfectly adequate for modelling quasi-planar objects.

306 GeomImage is for matching in ground image geometry (Rupnik, Pierrot-• 307 Deseilligny, and Delorme 2018). In this case, matching is performed by using the 308 'ground image geometry', which is more flexible and better suited for the 309 modelling of fully 3D objects. With this mode, the geometry of the modelling is 310 adapted to a selected point of view, consistent with the acquisition. In addition, 311 Malt GeomImage handles a 'One-Two-Pixel multi-view image matching' (1-2 312 pixel matching) method, which is a new matching cost function that produces 313 surfaces with enhanced resolution compared to the window-based semi-global 314 matching technique, where the data term is replaced by a multi-view single pixel 315 similarity measure, and a two-pixel window (Rupnik and Deseilligny 2019; 316 Rupnik et al. 2020).

Because of different processing workflows, it could be difficult to standardizethe processing parameters within the software itself and between software packages. We

- 319 tried to optimize the consistency of the comparison (Figure 5). As the area of interest
- 320 corresponds to steep slopes, we used small correlation windows (5 \times 5 pixels, 7 \times 7
- 321 pixels, 9×9 pixels), but the small size of the windows may introduce more false
- matches or noise (NASA 2019). For LSW, a larger correlation kernel is used (15×15)
- 323 due to its difficulty to find tie points on the cliff face. The regularization factor adds a
- 324 constraint on the a priori position of the reconstructed points. The higher the factor, the
- 325 more regular the result.



Figure 5. Parameters for the matching algorithms tested in (*a*) $ASP^{\textcircled{B}}$ and (*b*) $MicMac^{\textcircled{B}}$.

328

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While running MicMac<sup>®</sup> as ASP<sup>®</sup>, no Ground Control Points (GCPs) were
provided. The Rational Polynomial Coefficients (RPCs) provide an approximate
localization model used for geometric processing and orthorectification (ASTRIUM
2012). Bundle adjustment without GCPs ensure good results and do not introduce
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undesirable deformations (Rupnik et al. 2016). Because of frequent georeferenced point
clouds (coming from UAV or TLS) as ground truth data, the roughly georeferenced
satellite point clouds are then realigned by Iterative Closest Point (ICP) co-registration
algorithm (CloudCompare[®]).

337 *Quality Assessment*

338 A relative precision criterion is compulsory in order be able to assess the 3D 339 reconstruction quality and therefore the relevance of our data to make single-source or 340 multi-source comparisons (TLS data or UAV data). Thus, 3D reconstructions from the 341 Pléiades images were filtered (artefact removal), georeferenced and compared to ground truth data at Varengeville-sur-Mer, acquired on 26 June 2017 using UAV. These 342 343 synchronous surveys (UAV and satellites) allow to limit errors due to erosion events. 344 The UAV and Pléiades point clouds were cut in order to have the same spatial extent 345 (53700 m²) and the UAV point cloud was subsampled at 5 cm. A semi-automatic co-346 registration (ICP in CloudCompare[®]) using a rigid-body transform was performed to 347 georeference the Pléiades point clouds by fitting on the UAV mesh (considered as the reference). This co-registration is efficiently constrained vertically (shore platform, 348 349 plateau) and alongshore. Thus, the precision error of the Pléiades 3D reconstructions is 350 assessed in comparison with Root Mean Square Error (RMSE in m) of the co-351 registration. Precision error is assessed in the cross-shore direction (which is the 352 direction of erosion on the cliff face), based on the relative distance (normal of the cliff 353 face) after fitting. 354 The georeferencing error (absolute error) is of lesser importance because we

have frequent perfectly georeferenced and very high resolution surveys (TLS or UAV)

that allow to align the point clouds coming from the Pléiades images.

357 **Results**

- 358 Criteria for 3D reconstruction ranking
- 359 Based on 146 tests performed with ASP[®] and MicMac[®] on different pairs of images, we
- 360 sorted our results based on the:
- Relative precision in comparison with UAV data (mean distance which allows to
- 362 calculate the distance relative to the mesh of the UAV data, and standard
- 363 deviation to assess point dispersion);
- Point density of the clouds;
- Quality assessment of the reconstructions (not satisfactory, few satisfactory,
- 366 satisfactory) taking into account the homogeneity of the reconstructed point
- 367 distribution over the cliff face, artefacts and noise (Figure 6). Satisfactory
- 368 reconstructions provide visibility of structural discontinuities from the cliff foot
- 369 to the cliff top in order to observe rockfalls irrespective of their locations over
- the cliff face.



371

372	Figure 6. Cliff face reconstructed from UAV data (RICOCHET project, 26 June 2017)
373	(a) and quality ranking of the 3D reconstructions from Pléiades images at Varengeville-
374	sur-Mer: (b) not satisfactory result (10 June 2017 and 15 June 2017 at 40° , MicMac [®] ,
375	UrbanMNE, size of correlation window: 5×5 , regularization factor: 0.20), (c) few
376	satisfactory result (10 June 2017 and 15 June 2017 at 40° , ASP [®] , Local Search
377	Window, cost mode: 2, correlation kernel: 15×15 , subpixel kernel: 41×41), (d)
378	satisfactory result (10 June 2017 and 15 June 2017 at 40°, MicMac®, GeomImage, multi
379	scale correlation: 1, size of correlation window: 3×3 , regularization factor: 0.05).
380	

Unsurprisingly, and regardless of the software used, satisfactory reconstructions (48/146) have a minimum of one image with an incidence angle of 40°. When the 3D reconstruction uses two images with angles of 0° to 10°, the cliff face reconstruction is, at best, assessed as 'few satisfactory', i.e. with noise, artefacts or holes (Table 1) due to the acquisition geometry which is not adapted to the sub-vertical cliff face (Jaud et al. 2019; Letortu et al. 2020). There are more satisfactory reconstructions of the cliff face when the stereo restitution uses two images with an angle of 40°.

388	Among the 146 tests, the best 3D reconstruction per image pair was selected
389	based on the three parameters described below. The objective was to select a
390	satisfactory 3D reconstruction, with the best compromise between low mean distance
391	and standard deviation values, and a high point density value (Table 1). The best
392	reconstructions were selected and there are ten (Table 2). Taking only the mean error
393	and standard deviation values into account, the reconstructions from the 0° to 10°
394	datasets may seem more precise than the 40° stereo pairs, but in reality, this is weighted
395	by the fact that most of the points reconstructed at 0° to 10° are located on the top of the
396	cliff and less on the cliff face.

- 397 Table 1. Extract of the original table of the 146 tests with the selection of the best 3D
- reconstruction per pair (e.g. 10 June 2017 and 15 June 2017 at 40° using MicMac[®]).

Software	Date of image pair	Angle of Incidence (')	Matching algorithm	Specifications of each sofware ASP®: cost mode / correlation kernel (subpixel kernel) MicMac®: size of correlation window / regularization parameter	F	'oint density (number of points m ⁻²)	Mean distance (m)	Standard deviation (m)	Quality assessment of 3D reconstruction (the best one per pair in bold)	
		40	UrbanMNE	3×3/0.02		0.44	0.17	4.54	not satisfactory	
		40	UrbanMNE	3×3/0.20		0.44	0.22	2.92	not satisfactory	
		40	UrbanMNE	5×5/0.02		0.53	007	2.99	not satisfactory	
		40	UrbanMNE	5×5/0.20		0.47	0.29	3.74	not satisfactory	
		40	UrbanMNE	7×7/0.02		0.52	0,08	3.17	not satisfactory	
		40	UrbanMNE	7×7/0.20		0.47	0.20	3.13	not satisfactory	
		40	Geomimage (CorsMS: 1)	3×3/0.02		1.64	-0.07	2.60	satisfactory	
		40	Geomimage (CorsMS:1)	3×3/0.05		1.71	0,00	2.37	satisfactory	
Michdoom	10 June 2017 and	40	Geomimage (CorsMS: 1)	3×3/0.10		1.72	d.15	2.12	satisfactory	
Tellorelac o	15 June 2017	40	Geomimage (CorsMS: 1)	5×5/0.02		1.83	d.13	2.20	satisfactory	
		40	Geomimage (CorsMS: 1)	5×5/0.05		1.84	d.16	2.30	satisfactory	
		40	Geomimage (CorsMS: 1)	5×5/0.10		1.82	d.19	2.28	satisfactory	
		40	Geomimage (CorsMS: 1)	7×7/0.02		1.76	0,08	2.12	satisfactory	
		40	Geomimage (CorsMS: 1)	7×7/0.05		1.81	-0.09	2.06	satisfactory	
		40	Geomimage (CorsMS: 1)	7 × 7 / 0.10		1.79	-0.09	2.03	satisfactory	
		40	GeomImage (one-two pixel matching)	3×3/0.10		1.70	-0.05	1.83	satisfactory	
		40	GeomImage (one-two pixel matching)	5×5/0.10		1.75	-0.08	1.92	satisfactory	
		40	GeomImage (one-two pixel matching)	7×7/0.10		1.67	d.14	2.46	satisfactory	

400	Table 2	The heet	cliff face	3 D	reconstru	ctione	ner	image	nair	haced	on	1/16	tecte
400						Specif	fications	of each					

	Software	Date of image pair	Angle of Incidence (°)	Matching algorithm	Specifications of each software ASP [®] : cost mode / correlation kernel MicMac [®] : size of correlation window / regularization parameter	Point density (number of points m ⁻²)	Mean distance (m)	Standard deviation (m)	Quality assessment of 3D reconstruction
_	ASP [®]	10 June 2017 and 15 June 2017	40	MGM/SSGM	3 / 7 × 7	0.93	0.01	2.97	satisfactory
		10 June 2017 and 15 June 2017	0 to 10	MGM/SSGM	4 / 7 × 7	0.89	0.06	2.94	few satisfactory
		10 June 2017	0 to 10 / 40	MGM/SSGM	4 / 7 × 7	0.49	-0.30	2.50	satisfactory
		15 June 2017 and 06 July 2017	40	MGM/SSGM	3 / 7 × 7	0.95	0.13	1.91	satisfactory
		15 June 2017 and 06 July 2017	0 to 10	MGM/SSGM	3 / 5 × 5	0.50	0.07	1.68	few satisfactory
-	MicMac [®]	10 June 2017 and 15 June 2017	40	GeomImage (1-2 pixel matching)	3 × 3 / 0.1	1.70	-0.05	1.83	satisfactory
		10 June 2017 and 15 June 2017	0 to10	GeomImage (1-2 pixel matching)	3 × 3 / 0.1	1.46	0.06	1.21	few satisfactory
		10 June 2017	0 to 10 / 40	GeomImage (1-2 pixel matching)	$7 \times 7 / 0.1$	1.61	0.07	1.96	satisfactory
		15 June 2017 and 06 July 2017	40	GeomImage (1-2 pixel matching)	3 × 3 / 0.1	1.79	0.11	1.38	satisfactory
		15 June 2017 and 06 July 2017	0 to10	GeomImage (CorsMS: 1)	3 × 3 / 0.2	1.28	-0.06	1.72	few satisfactory

401

402 Identification of the best image processing chain for the 3D cliff face

- 403 reconstruction
- 404 The comparison is made on the satisfactory results obtained with ASP[®] and with
- 405 MicMac[®] (Table 2). The precision of the cliff face reconstruction is slightly better with
- 406 MicMac[®] than with ASP[®] (average relative distance of 0.04 m and -0.05 m,
- 407 respectively) along with the standard deviation, which is lower with MicMac[®] than with
- 408 ASP[®] (average standard deviation of 1.72 m and 2.46 m, respectively). Furthermore,
- 409 point clouds with MicMac[®] present a higher density (1.57 point m⁻² on average) than
- 410 with ASP[®] (0.75 point m⁻² on average). With a better average precision associated with
- 411 a lower error dispersion on the cliff face and a higher point density, the 3D
- 412 reconstruction with MicMac[®] provides the most reliable dataset.
- 413 The relative differences in the 3D restitution from the image sets at 40° are distributed
- 414 randomly over the entire cliff face (Figure 7). These are mainly artefacts or noise that

415 have not been removed during manual filtering.





429

430 Figure 8. Best parameters (in bold) for satisfactory 3D reconstructions of the cliff face 431 at Varengeville-sur-Mer with (*a*) $ASP^{\textcircled{B}}$ and (*b*) MicMac^{\textcircled{B}}.

432

In MicMac[®], GeomImage matching algorithm has better results than 433 434 UrbanMNE one due to the topography of the cliff face and the acquisition geometry. As 435 illustrated in Figure 8, the SGM methods provide better results as they are solved with 436 multi-directional dynamic programming techniques, and thereby do not impose any 437 constraints on the regularity term. The optimization is thus resolved along independent 438 lines of pixels. These approaches provide robust reconstructions within a reasonable 439 processing time (around 30 min for images of 1 million pixels). The reconstructed 440 surfaces are morphologically preserved because the template windows chosen are small 441 $(3 \times 3, 7 \times 7)$ in the optimization process. In the SGM approach, occlusions are 442 typically predicted by performing a symmetric consistency check in a stereo pair.

443 **Discussion**

444 Potential of this approach for diachronic monitoring

The presented dataset is rather original and challenging given its unusual
configuration (high imaging angle, multiple dates) and the fact that the images present
shadows over the area of interest. Thus, this study highlights the flexibility of the tested
processing chains.

449 At this stage, a first quantification of the eroded volume can be estimated by 450 using a 'satisfactory' cliff face reconstruction and an older dataset collected in 2015 451 using TLS. A difference was calculated between the point cloud of the stereoscopic pair on 10 June 2017 and 15 June 2017 at 40° and the TLS mesh collected on 25 September 452 453 2015. On the eastern part of the cliff face, where there is an erosion area, the Pléiades-TLS comparison calculates an eroded volume of 796.5 m^3 for a surface area spanning 454 455 4752.5 m². This calculation is then compared with the result of the differences between 456 the TLS mesh (25 September 2015) and the UAV point cloud (26 June 2017) which leads to an eroded volume of 1134.4 m³ (over the same surface, knowing that the 457 458 surface affected by the rockfall is of 543 m^2) (Figure 9). The difference in the two 459 volumetric estimations demonstrates that it is possible to quantify erosion by using 460 Pléiades satellite photogrammetry within a margin of error of approximately 0.071 m³ 461 m⁻².



462

463 Figure 9. (*a*) Relative distance (m) of the cliff face between the TLS mesh (25

464 September 2015) and (*b*) the UAV data (26 June 2017) with detected erosion at
465 Varengeville-sur-Mer.

466

467 For highly erosive areas, high angle of incidence images from the Pléiades 468 satellites provide a new approach for a first order quantification of erosion on large 469 portions of cliff lines (in line with the hydro-sedimentary cell), with high repeatability, 470 satisfactory resolution and precision, and at low cost. This method therefore provides 471 major opportunities for improving the knowledge about coastal cliff dynamics thanks to the rockfall detection threshold assessed at 100 m³, which corresponds to 69% of 472 473 rockfalls censed around the study area (Letortu et al. 2015). The creation of a 474 considerable rockfall database on large stretches of coasts is thus possible, which could 475 help to better understand rockfall triggers and, ultimately, to protect people (Naylor, 476 Stephenson, and Trenhaile 2010).

477 Contribution of tri-stereo reconstruction

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478 MicMac<sup>®</sup> gives the best results in stereoscopic reconstruction and, unlike ASP<sup>®</sup>,
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- 479 it can also be used to perform tri-stereoscopic reconstructions. Eighteen tri-stereo tests
- 480 were carried out with $MicMac^{(0)}$ from images with an incidence angle of 40° (10 June
- 481 2017, 15 June 2017 and 18 June 2017, Table 3), they are mostly satisfactory (11/18).
- 482 Compared with stereoscopic pairs, the point density is slightly higher with a
- 483 stereoscopic triplet (1.82 point m^{-2} versus 1.70 point m^{-2}), the mean distance is lower
- 484 (0.01 m versus 0.04 m) but has a higher data dispersion (standard deviation of 2.14 m
- 485 versus 1.72 m) due to the presence of a higher number of artefacts.
- 486 Table 3. 3D reconstruction tests based on tri-stereo matching in MicMac[®] (triplet
- 487 images: 10 June 2017-15 June 2017-18 June 2017).

Date of image triplet at 40°	Tri-stereo matching algorithm	Size of correlation window / regularization parameter	Point density (number of points m ⁻²)	Mean distance (m)	Standard deviation (m)	Quality assessment of 3D reconstruction (the best one in bold)
	UrbanMNE	$3 \times 3 / 0.02$	0.48	0.38	4.18	not satisfactory
	UrbanMNE	3 × 3 / 0.20	0.38	0.15	2.82	not satisfactory
	UrbanMNE	5 × 5 / 0.02	0.45	0.42	3.11	not satisfactory
_	UrbanMNE	5 × 5 / 0.20	0.35	0.78	3.99	not satisfactory
_	UrbanMNE	$7 \times 7 / 0.02$	0.47	0.20	2.71	not satisfactory
-	UrbanMNE	7 × 7 / 0.20	0.39	0.25	2.94	not satisfactory
	GeomImage (CorsMS: 1)	$3 \times 3 / 0.02$	2.31	0.31	3.21	satisfactory
10 June 2017 15	GeomImage (CorsMS: 1)	3 × 3 / 0.05	1.98	0.05	2.45	satisfactory
10 Julie 2017, 15	GeomImage (CorsMS: 1)	3 × 3 / 0.10	1.72	0.06	1.54	satisfactory
18 June 2017 and -	GeomImage (CorsMS: 1)	5 × 5 / 0.02	1.71	0.08	1.51	satisfactory
18 Julie 2017	GeomImage (CorsMS: 1)	5 × 5 / 0.05	1.70	0.07	1.50	satisfactory
-	GeomImage (CorsMS: 1)	5 × 5 / 0.10	1.98	0.06	2.75	satisfactory
_	GeomImage (CorsMS: 1)	$7 \times 7 / 0.02$	1.66	0.09	1.54	satisfactory
_	GeomImage (CorsMS: 1)	7 × 7 / 0.05	1.63	0.10	1.52	satisfactory
_	GeomImage (CorsMS: 1)	7 imes7 / 0.10	1.58	0.13	1.57	satisfactory
-	GeomImage (1-2 pixel matching)	3 × 3 / 0.10	1.97	0.35	3.31	satisfactory
-	GeomImage (1-2 pixel matching)	5 × 5 / 0.10	1.72	0.05	1.74	satisfactory
	GeomImage (1-2 pixel matching)	$7 \times 7 / 0.10$	1.89	0.33	3.06	few satisfactory

488

489 Conclusions

- 490 As previously mentioned (Jaud et al. 2019; Letortu et al. 2020), a stereo restitution of
- 491 the cliff face based on images with an angle of incidence of 0° to 10° appears not
- 492 adapted to the sub-vertical slope (70° to 90°) whereas images with an angle of incidence

493	of 40° allow satisfactory results to be achieved. Between ASP [®] and MicMac [®] , the best
494	open-source stereo restitution software to use high angle incidence and multi-date
495	images is MicMac [®] and the best performance is obtained using GeomImage (1-2 pixel
496	matching) with a size of correlation window of 3×3 or 7×7 associated with a
497	regularization parameter of 0.10. With these parameters, 3D cliff face reconstructions
498	have an average point density of 1.70 point m ⁻² , a mean distance from UAV ground
499	truth data of 0.04 m and a standard deviation of 1.72 m. The ASP® software with the
500	MGM/SSGM stereo matching algorithm is the second-best option, with cost mode 3 or
501	4 and a correlation kernel of 7×7 . These parameters provide point clouds with an
502	average point density of 0.79 point m ⁻² , a mean distance of -0.06 m and a standard
503	deviation of 2.46 m. These point cloud characteristics used in a diachronic approach can
504	detect rockfalls above 100 m ³ , which includes the large majority of rockfalls (69%)
505	around the study area (Letortu et al. 2015). Pléiades oblique images appear to be a great
506	opportunity for monitoring cliff faces, for quantifying erosion over large spans of
507	coastline and for creating a rockfall database which could help to better understand
508	rockfall triggers (in order to people prevention/protection).
509	Future projects aim at developing new approaches to optimize the detection and

Future projects aim at developing new approaches to optimize the detection and 509 quantification of cliff face erosion using Pléiades images (including the Pléiades Neo 510 511 constellation that will be launched in 2021 and 2022, with a spatial resolution of 512 panchromatic images of 0.30 m at the nadir). To achieve this goal, images should have 513 an angle of incidence from 20° to 30° (the best imaging angles for cliff face survey 514 (Jaud et al. 2019) when cliffs have a sub-vertical slope (70° to 90°) as in Varengeville-515 sur-Mer) and should be acquired in a favourable environment (few cloud cover and cliff 516 face orientation parallel to the Pléiades orbit). About the method, instead of relying on a 517 3D reconstruction of the entire cliff face by stereo- and tri-stereo restitution, new

- 518 methods will be based on a prior change detection on the cliff face in order to identify
- 519 erosion areas. A diachronic 3D reconstruction of these areas should improve the
- 520 quantification of the cliff erosion.

521 Author Contributions

- 522 Pauline Letortu and Marion Jaud conceived and designed the data acquisition and data
- 523 analysis methods. Roza Taouki processed the images. Roza Taouki, Marion Jaud and
- 524 Pauline Letortu contributed to the data analysis. Pauline Letortu, Roza Taouki and
- 525 Marion Jaud wrote and illustrated the paper. Stéphane Costa and Olivier Maquaire
- 526 organized the UAV survey, used as ground truth data. Pauline Letortu, Marion Jaud and
- 527 Christophe Delacourt are responsible for the project administration.

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