



## Evaluating the Effect of Enhancing the Contrast of UAV Images on Photogrammetry Products

**Soroush Motayeb**<sup>1</sup>  
[Soroush.motayyeb@ut.ac.ir](mailto:Soroush.motayyeb@ut.ac.ir)



**Seyed Arya Fakhri**<sup>2</sup>  
[aryafakhri@trn.ui.ac.ir](mailto:aryafakhri@trn.ui.ac.ir)



**Masood Varshosaz**<sup>3</sup>  
[varshosazm@kntu.ac.ir](mailto:varshosazm@kntu.ac.ir)



- UAVs and applications



Archeology



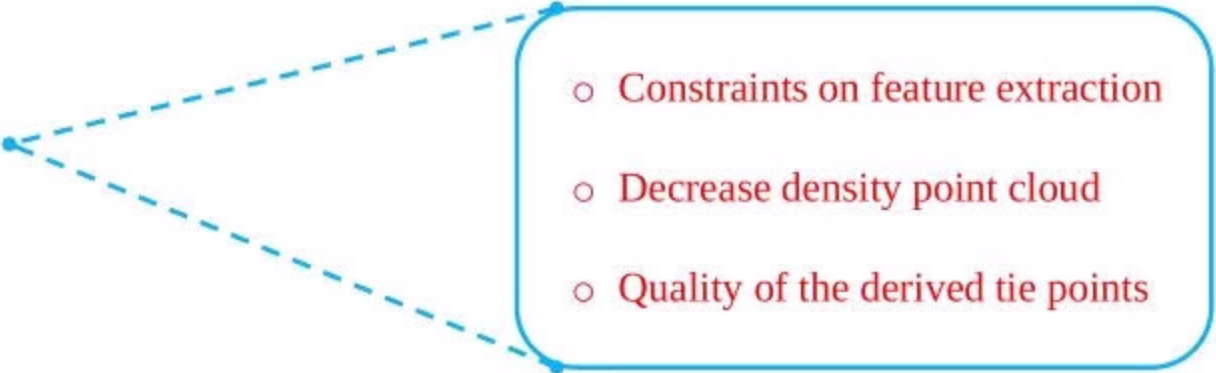
3D reconstruction



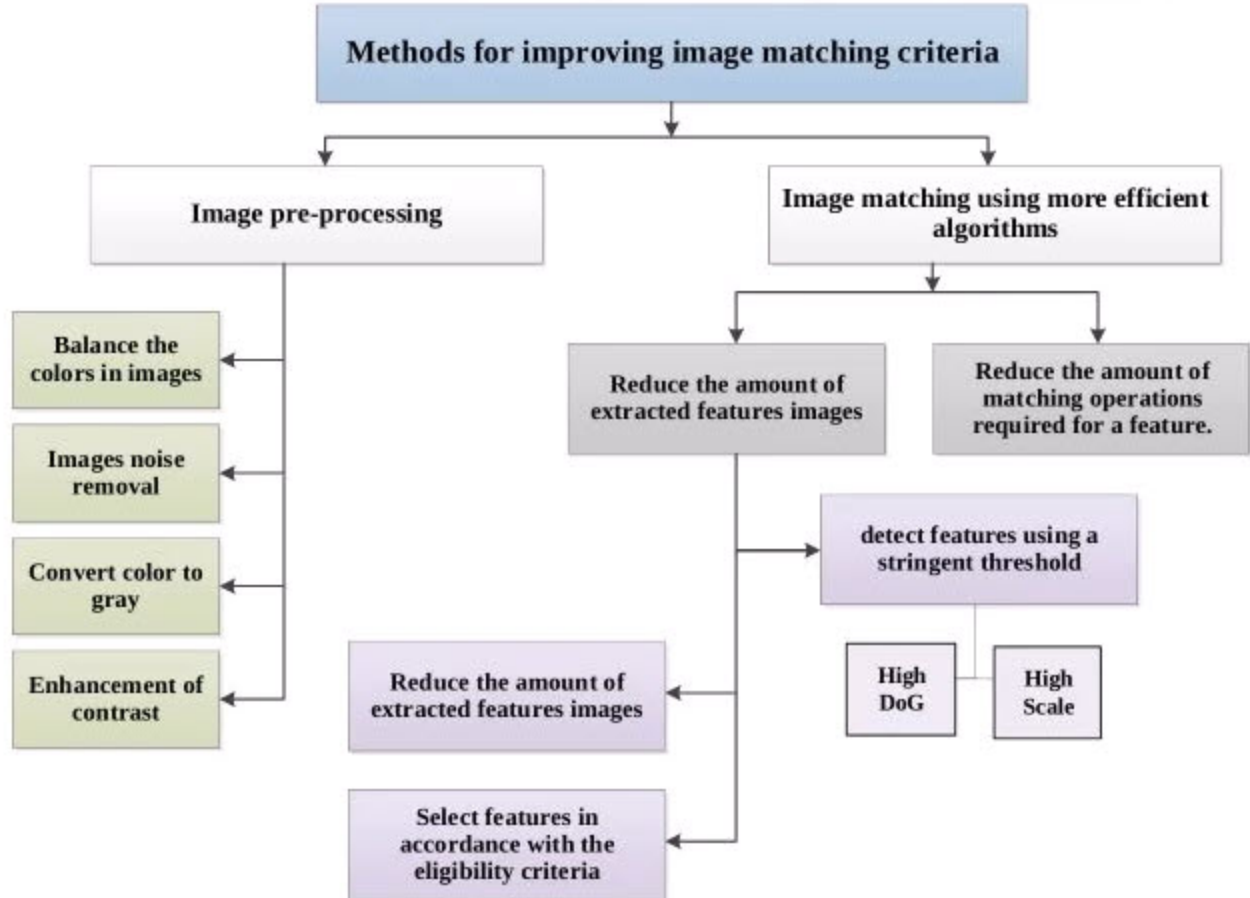
Mapping

## • Challenges of Commercial and Cheap Cameras UAVs

- Image motion
- Bad lighting effects
- Poor texture
- Dead area

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- Constraints on feature extraction
  - Decrease density point cloud
  - Quality of the derived tie points

- Literature review



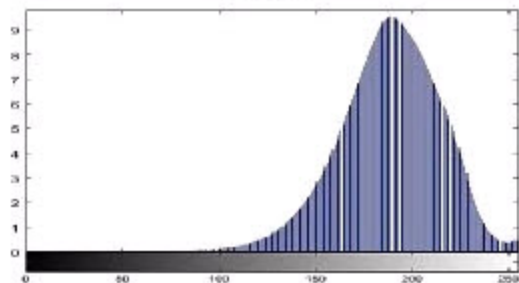


- **The article's objective**

- This paper proposes a contrast enhancement technique to improve the accuracy of a photogrammetric model created using UAV images.



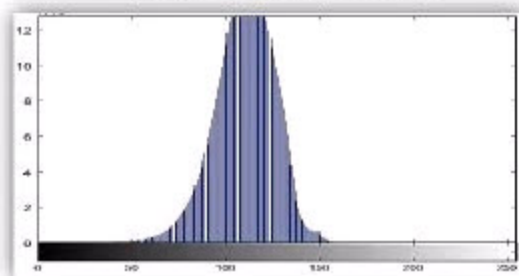
Original



Histogram of original image



Image with a low contrast



Histogram of image with low contrast

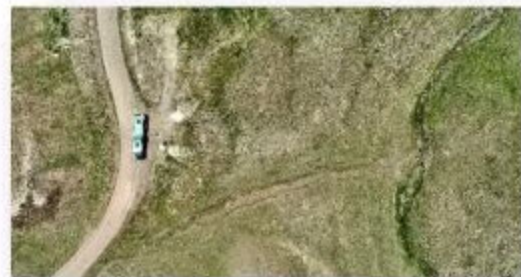
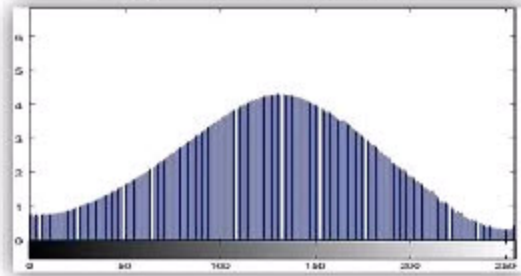
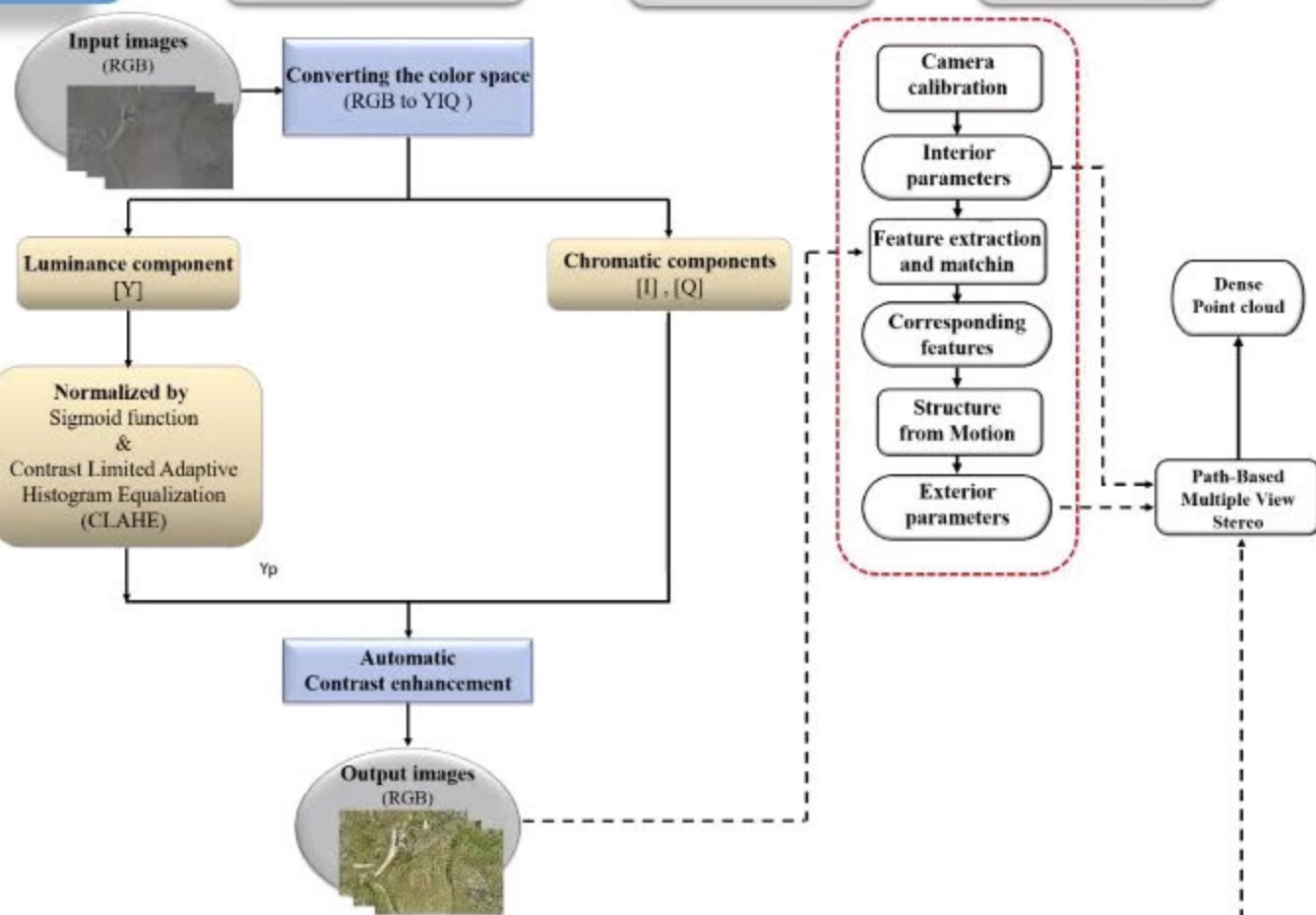


Image with enhanced contrast



Histogram of an enhanced image



## • Proposed method

### ○ Evaluation of the proposed algorithm for contrast enhancement

$$E(I) = -\sum_{k=0}^{L-1} p(k) \log_2(p(k))$$

Shannon entropy (E) (Tsai et al., 2008)

$$SD(I) = \sqrt{\sum_{k=0}^{L-1} (k - A(I))^2 \times p(k)}$$

Standard deviation (SD) (Román et al., 2017)

$$\gamma(I) = \frac{2}{M \times N} \sum_{v=1}^M \sum_{v=1}^N \min\{p_{uv}, (1 - p_{vv})\}$$

The linear blur index (Kaufmann, 1975)

$$CM(I) = \sqrt{(\sigma_\alpha^2 + \sigma_\beta^2)} + 0.3 * \sqrt{(\mu_\alpha^2 + \mu_\beta^2)}$$

Colorfulness (CM) (Susstrunk & Winkler, 2003)

$$PSNR(I, I_E) = 10 \times \log_{10} \frac{(L-1)^2}{MSE(I, I_E)}$$

Peak signal-to-noise ratio (PSNR) (Hore & Ziou, 2010)

$$AMBE(I, I_E) = |A(I) - A(I_E)|$$

Absolute Mean Brightness Error (AMBE) (Phanthuna, 2015)

$$CEF = \frac{\text{colorfulness}(CM) \text{ of output image}}{\text{colorfulness}(CM) \text{ of input image}}$$

Color enhancement factor (CEF) (Susstrunk & Winkler, 2003)



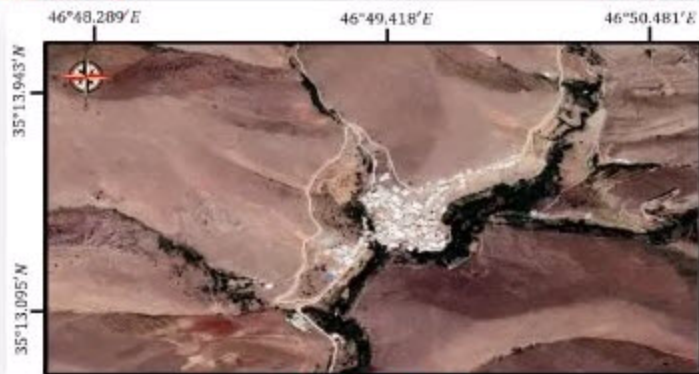
- Datasets**



Northwest of Qazvin city



South area of Sakineh Paradise in Karaj



City of Helwan



- UAV

### Phantom 4 Pro



**Focal length = 8.8 mm**  
**FOV = 70.0 Degree**  
**Image Size = 5472×3648**  
**Sensor size = 13.2×8.8 mm**

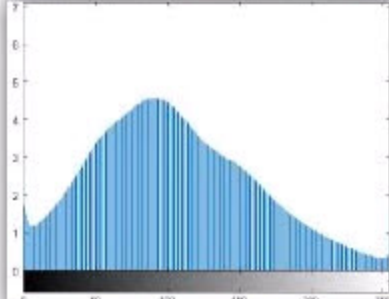
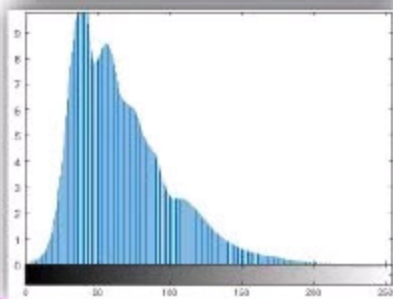
- Proposed contrast enhancement algorithm**

**City of Helwan**

low contrast



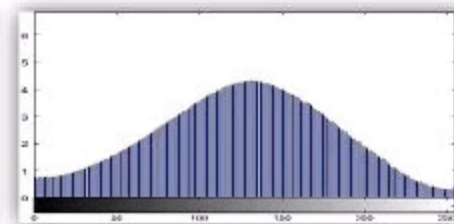
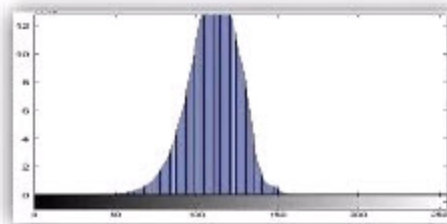
enhanced contrast

**Northwest of Qazvin city**

low contrast



enhanced contrast



- Performance of image contrast enhancement method**

Dataset		E	SD	PNSR	AMBE	$\gamma$	CM	CEF
Sakineh Paradise	Original	5.6998	25.8475	-	-	0.7237	10.1122	-
	Reduced	5.0099	13.8547	10.1139	53.1455	0.7185	6.0003	0.6221
	Enhanced	7.9256	76.9027	20.4598	12.1186	0.3901	26.3608	3.7709
Qazvin	Original	5.6245	22.314			0.7155	10.3145	-
	Reduced	5.0147	14.1731	10.2792	49.3874	0.7273	7.0993	0.5857
	Enhanced	7.9332	76.9040	20.4668	12.2148	0.3946	26.3710	3.7643
Helwan	Original	5.5321	27.145	-	-	0.7321	11.3189	-
	Reduced	-	-	-	-	-	-	-
	Enhanced	7.9358	76.9215	20.4514	12.1511	0.4001	26.1151	3.6778

**Table 1.** Contrast enhancement of images in the data set in comparison to the original data and contrast reduction.

- Performance of image contrast enhancement method**

Methods	E	SD	PNSR	AMBE	$\gamma$	CM	CEF
HE	5.7591	73.6543	12.0922	16.4611	0.4063	–	–
CLAHE	6.9114	29.3949	22.3057★	13.0904	0.6631	–	–
AMCE	7.9599★	75.2166★	12.0413	12.0873★	0.3921★	11.4620	1.6411
<b>Proposed method</b>	7.9358★	76.9011★	20.4663★	12.1138★	0.3911★	26.3610★	3.7743★

**Table 2.** Comparison of the proposed method's performance to that of other commonly used contrast enhancement methods.



The best result



Acceptable result



- The effect of enhancing image contrast on modeling accuracy

Sparse point cloud

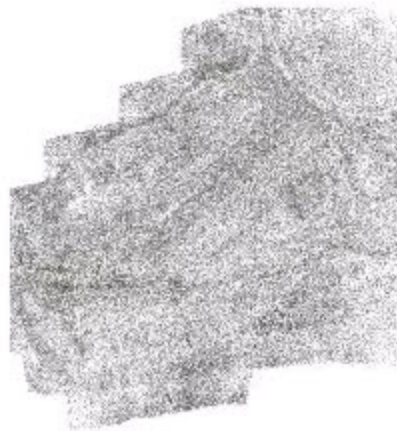


Images with a low contrast



Images with enhanced contrast

Sparse point cloud



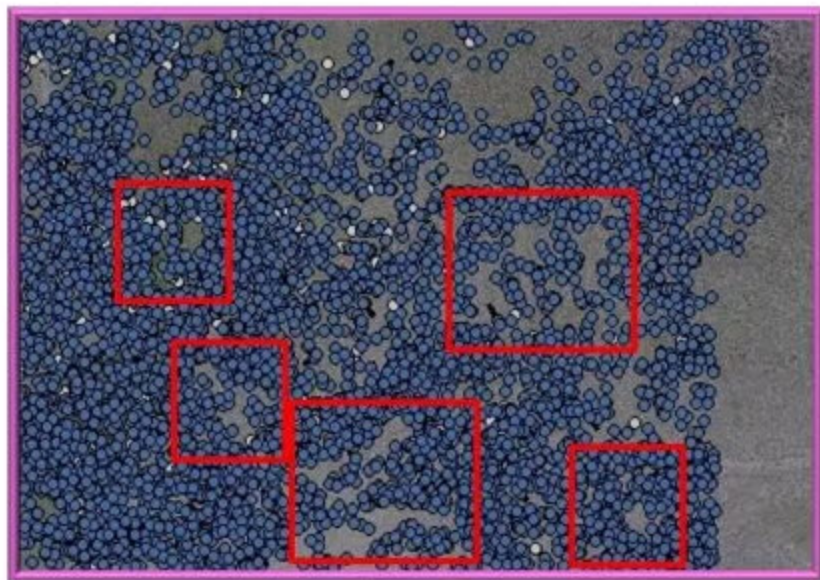
Images with reduced contrast



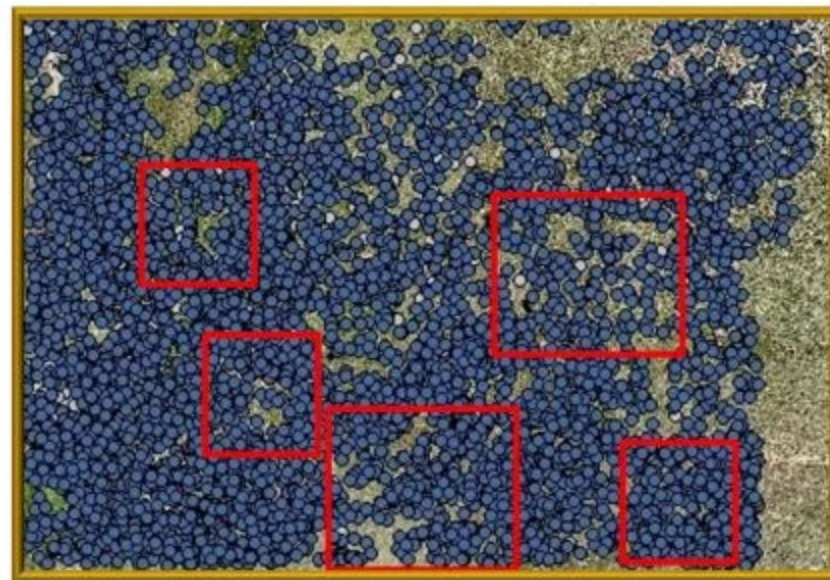
Images with enhanced contrast

- The effect of enhancing image contrast on modeling accuracy

### Comparison of Tie and Keypoints



reduced contrast

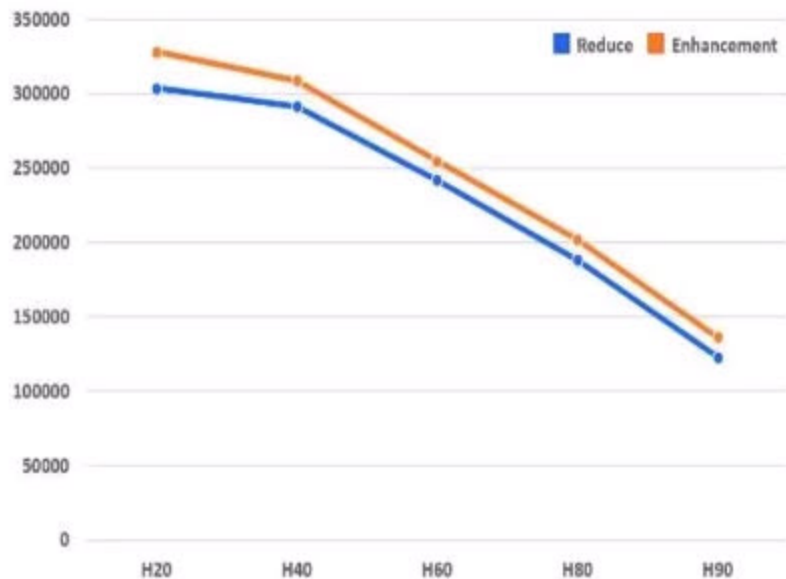


enhanced contrast

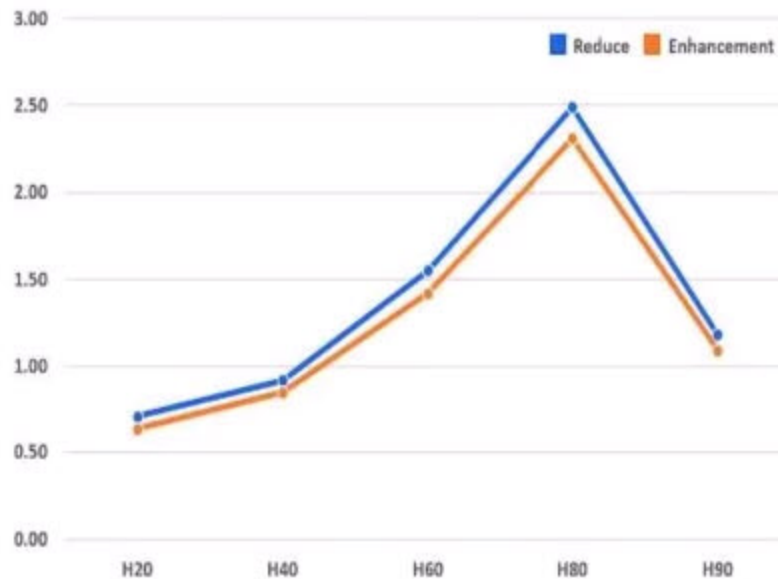


- The effect of enhancing image contrast on modeling accuracy

At different flying altitudes and in low contrast and enhanced modes, the number of tie points and reprojection error is shown in a diagram.



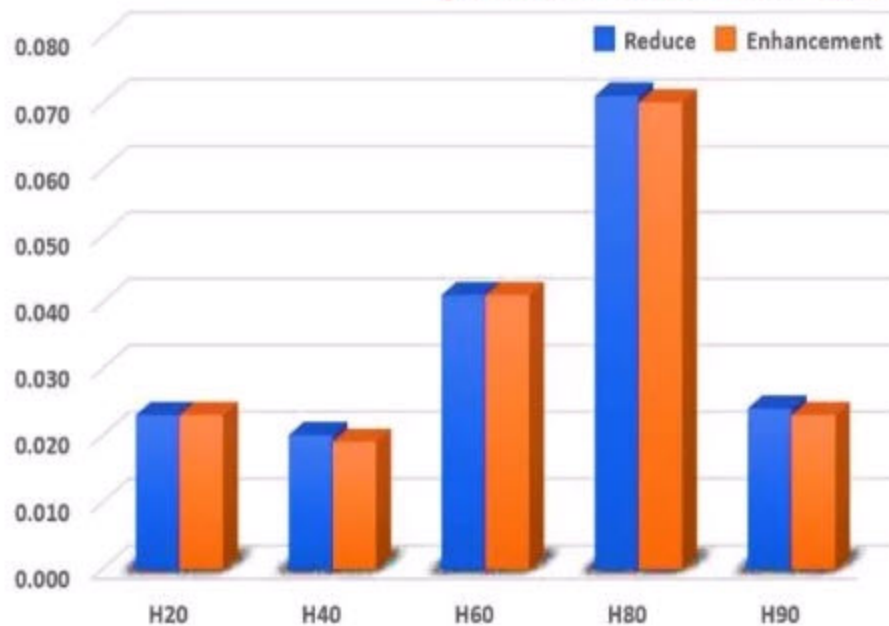
The number of tie points diagram



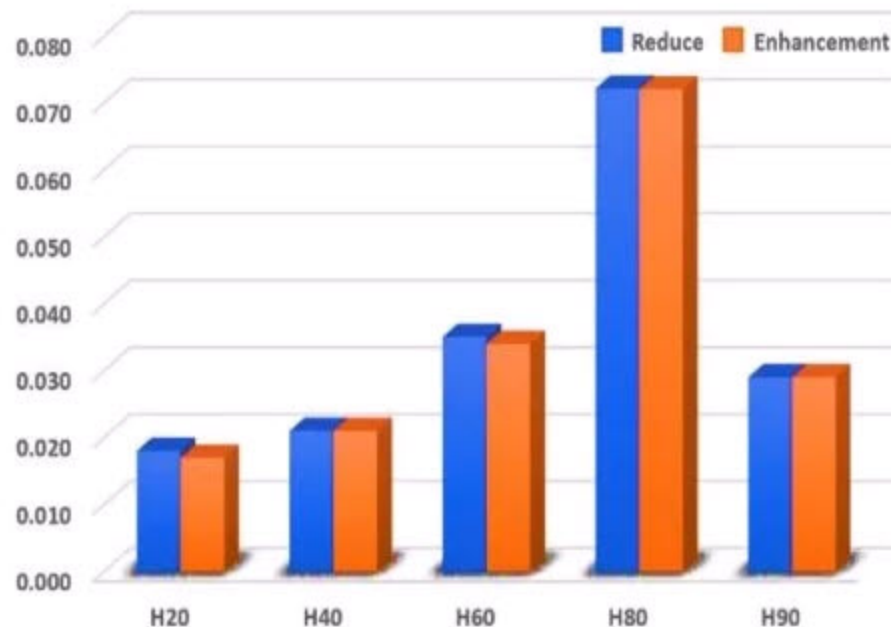
Reprojection error diagram

- The effect of enhancing image contrast on modeling accuracy

Diagram depicting the amount of error obtained on the check points at five different flight altitudes and two modes



The amount of altimetry error

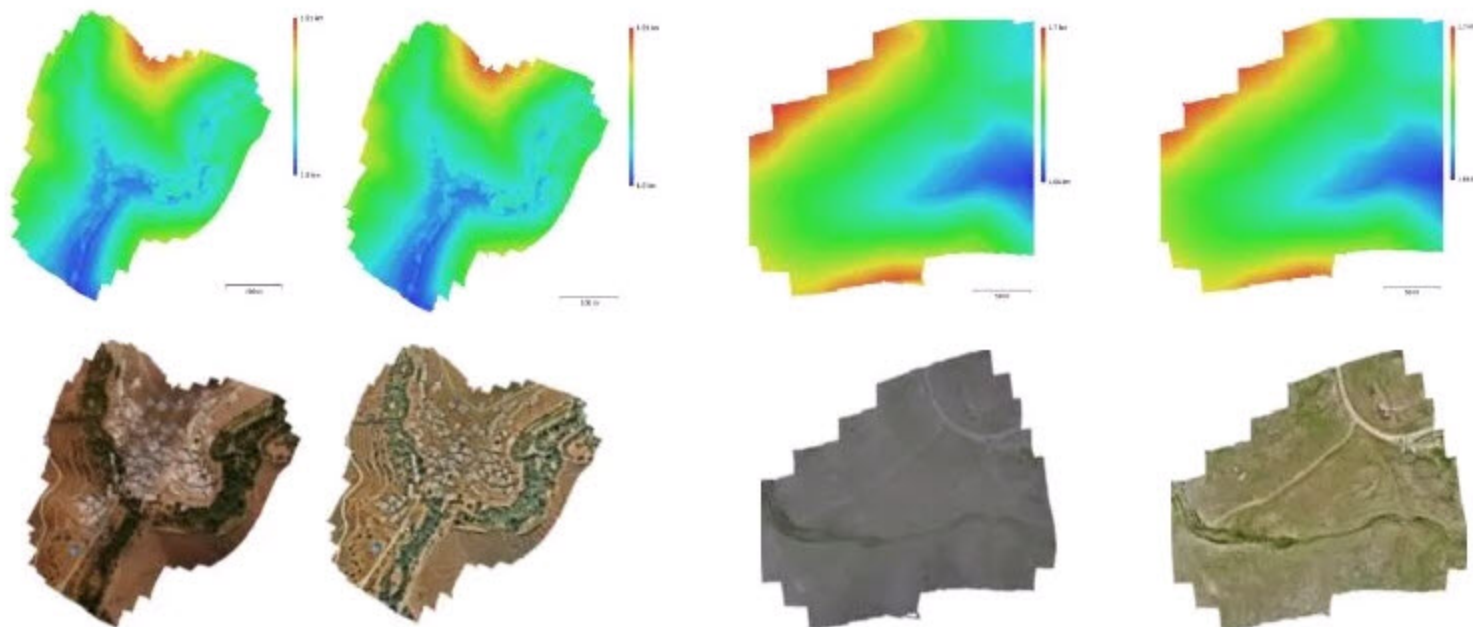


The amount of planimetry error



- The effect of enhancing image contrast on modeling accuracy

### DEM and orthophoto mosaic



Contrast enhancement images

Low contrast images

Contrast enhancement images

Contrast reduction images

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- The effect of enhancing image contrast on modeling accuracy

### Orthophoto mosaic



Low contrast

Enhanced contrast

- The effect of enhancing image contrast on modeling accuracy

Dataset	Reprojection error (px)		Tie points		Check points RMSE(m)				DEM resolution (cm/px)	
	Reduce	Enh.	Reduce	Enh.	XY		Z		Reduce	Enh.
<b>H 20</b>	0.71	0.64	303,709	328,006	0.018	0.017	0.023	0.023	1.35	1.23
<b>H 40</b>	0.92	0.85	291,301	308,780	0.021	0.021	0.020	0.019	6.95	6.47
<b>H 60</b>	1.55	1.42	242,007	254,768	0.035	0.034	0.041	0.041	32.7	30.1
<b>H 80</b>	2.49	2.31	188,242	202,021	0.072	0.072	0.071	0.070	39.5	38.2
<b>H 90</b>	1.18	1.09	122,918	136,322	0.029	0.029	0.024	0.023	61.3	58.4

**Table 3.** Results from the production of photogrammetric products.



- The results indicated that the number of tie points extracted after using the proposed contrast-enhancement technique to low-contrast images **increased by approximately 10%, increasing the density of the point cloud**
- Contrast enhancement of the images also results in a relative gain of **approximately 2 cm/pix** in the **resolution** of the **Digital Elevation Model**.
- Additionally, **reprojection error was reduced by approximately 10%**, although **calibration parameters** and **check point error did not differ significantly** between images with low contrast and images enhanced by the algorithm.



## • Reference

- [1] R. Maini, H. Aggarwal, A comprehensive review of image enhancement techniques, arXiv preprint arXiv:1003.4053.(2010)
- [2] F. Bellavia, M. Fanfani ,C. Colombo, Fast Adaptive Frame Preprocessing for 3D Reconstruction, in: VISAPP (3), 2015, pp. 260-267.
- [3] G. Verhoeven, W. Karel, S. Štuhec, M. Doneus, I. Trinks, N. Pfeifer, Mind your grey tones: examining the influence of decolourization methods on interest point extraction and matching for architectural image-based modelling, in: 3D-Arch 2015: 3D Virtual Reconstruction and Visualization of Complex Architectures, Copernicus Gesellschaft, 2015, pp. 307-314.
- [4] M. Gaiani, F. Remondino, F.I. Apollonio, A. Ballabeni, An advanced pre-processing pipeline to improve automated photogrammetric reconstructions of architectural scenes, Remote sensing, 8(3) (2016) 178.
- [5] A. Ballabeni, F.I. Apollonio, M. Gaiani, F. Remondino, Advances in Image Pre-processing to Improve Automated 3D Reconstruction, International Archives of the Photogrammetry, Remote Sensing & Spatial Information Sciences.(2015)
- [6] C. Wu, Towards linear-time incremental structure from motion, in: 3D Vision-3DV 201 2013 ,3International Conference on, IEEE, 2013, pp. 127-134.
- [7] W. Hartmann, M. Havlena, K. Schindler, Predicting matchability, in: Proceedings of the IEEE Conference on Computer Vision and Pattern Recognition, 2014, pp. 9-16.
- [8] M. Dymczyk, E. Stumm, J. Nieto, R. Siegwart, I. Gilitschenski, Will it last? learning stable features for long-term visual localization, in: 3D Vision (3DV), 2016 Fourth International Conference on, IEEE, 2016, pp. 572-581.



**Thank you for your kind considerations**