

PHOTOGRAMMETRIC ASSESSMENT AND COMPARISON OF DJI PHANTOM 4 PRO AND PHANTOM 4 RTK SMALL UNMANNED AIRCRAFT SYSTEMS

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Commission I/II, ICWG I/II

KEY WORDS: bundle adjustment, camera calibration, drones, photogrammetry, structure-from-motion, SUA, UAS, UAV

ABSTRACT:

Consumer-grade Unmanned Aircraft Systems (UAS), and particularly Small Unmanned Aircraft (SUA) weighing less than 20 kg, have recently become very attractive for photogrammetric data acquisition across a wide range of applications. Compared to other more expensive remote-sensing technology, DJI Phantom series SUA provide a trade-off between cost, sensor quality, functionality and portability. Because of the significant interest in such systems, rigorous accuracy assessment of metric performance is crucial. This research investigates the capabilities of the Phantom 4 Pro (P4P) and the recently launched Phantom 4 RTK (P4RTK) SUA through both laboratory and in-situ assessments with multi-scale photogrammetric blocks. The study adopts self-calibrating bundle adjustments from conventional photogrammetry and from a Structure-from-Motion (SfM)-photogrammetric approach. Both systems deliver planimetric and vertical absolute accuracies of better than one and two pixels ground sampling distance, respectively, against independent check points. This can be achieved if the imaging network configuration includes a mixed range of nadir and oblique imagery and several ground control points are established as reference information. Ongoing analysis is investigating the strength of all bundle adjustment solutions. It is also evaluating the GNSS capabilities of the P4RTK SUA after post-processing raw observations of its trajectory. Findings from a comprehensive accuracy assessment can support non-experts in designing the pre-flight photogrammetric data acquisition plan and aid understanding of the performance of such popular off-the-shelf SUA.

1. INTRODUCTION

Consumer-grade Unmanned Aircraft Systems (UAS), and particularly Small Unmanned Aircraft (SUA) defined by the UK Civil Aviation Authority as weighing less than 20 kg (CAP 393, 2019), in conjunction with off-the-shelf digital cameras have become common-place in providing detailed image capture for geoscientific applications over the last decade (Toth and Józków, 2016). Parallel to the emergence of SUA technology, the Structure-from-Motion (SfM) and Multi-View-Stereo (MVS) photogrammetric processing pipeline has become a common approach for delivering high spatio-temporal resolution digital elevation models (DEMs) from SUA-based imagery (James and Robson, 2014). Such an approach has been widely adopted into commercial software packages (e.g. Agisoft Metashape; Metashape (2018)) that usually offer automated photogrammetric routines designed for use by non-experts. Therefore, comprehensive photogrammetric error assessments and a full understanding of the uncertainties associated with SfM-photogrammetric outputs are still crucial tasks, especially when emerging SUA systems are utilised for applications that may require 3D positional accuracy of centimetre-level or better.

A variety of consumer-grade SUA platforms exist and their suitability depends on the nature of the application and the environmental conditions. Whilst fixed-wing SUA are able to fly efficiently over large areas, rotary-wing SUA are easier to

precisely manoeuvre, take off and land, especially when operating in challenging environments such as water, forests and steep rugged slopes. Recent studies have noted that there has been a significant reduction in purchase costs of commercial rotary-wing SUA fitted with consumer-grade instrumentation since 2010 (e.g. Woodget et al. (2015); Carbonneau and Dietrich (2017); Hese and Behrendt (2017)). Over the last two years, the rotary-wing DJI Phantom series (DJI, 2019) SUA have become increasingly attractive across a wide range of research applications such as: coral reef morphology over shallow waters (Casella et al., 2017); mapping and monitoring of glacier-related geomorphological structures (Ewertowski et al., 2019); crop canopy height monitoring (Malambo et al., 2018); 3D modelling of cultural heritage buildings (Chiabrando and Losè, 2017); and forest tree crown monitoring (Hese and Behrendt, 2017).

The aforementioned case studies demonstrate a growing interest in utilising DJI Phantom series SUA for photogrammetric operations as they provide a trade-off between cost, sensor quality, functionality and portability in comparison to other more expensive fixed-wing SUA or terrestrial laser scanning (TLS) technology (Hese and Behrendt, 2017; Ewertowski et al., 2019). Moreover, significant improvements in Phantom 4 Pro instrumentation are reported in comparison to its former model (Chiabrando and Losè, 2017).

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A number of recent studies have focused on eliminating the labour intensive and costly task of physically establishing GCPs, either through innovative methodologies (e.g. Grayson et al. (2018); Peppas et al. (2018)) and/or through the use of SUA platforms augmented with real time kinematic (RTK) global navigation satellite systems (GNSS) (Carbonneau and Dietrich, 2017; Dall'Asta et al., 2017). Following this trend, in October 2018 DJI launched the Phantom 4 RTK SUA system which provides (a) a direct link with a DJI-manufactured differential RTK-GNSS base station, and (b) the recording of raw GNSS trajectory observations for further post-processing; two components that were not included in any previous Phantom models. Up until now there has been no detailed published work of rigorous assessment of the Phantom 4 RTK (P4RTK) system in relation to photogrammetric data acquisition and performance. However, Fraser (2018) recently reported results from the self-calibrating bundle adjustment application to the Phantom 4 Pro (P4P) system investigating different network geometry rules. The study presented here investigates the capabilities of both the P4P and the new P4RTK systems through both laboratory and in-situ assessments. The assessment makes findings regarding the sensors' internal calibration stability and external geometrical accuracy performance using multi-scale photogrammetric network configurations.

2. METHODOLOGY

The methodological workflow consisted of two main stages. The first stage involved laboratory and in-situ outdoor field surveys to geometrically calibrate the imaging sensors mounted on-board the P4P and P4RTK SUA using an in-house manufactured 3D calibration cube with fixed discrete black and white coded targets. This stage performed sensor calibration and subsequent determination of the targets' 3D coordinates by three different approaches: (a) standard self-calibrating bundle adjustment using only the coded targets as image observations, implemented in the photogrammetric software package VMS (Vision Measurement System, VMS (2018); Shortis et al. (1998)); (b) self-calibrating bundle adjustment incorporated into the SfM-photogrammetric pipeline, as implemented in Agisoft Metashape (AM); and (c) self-calibrating damped bundle adjustment performed with the open-source software package DBAT (Damped Bundle Adjustment Toolbox, Börlin et al. (2018)).

All three software packages have adopted the Brown lens distortion model (Brown, 1971). VMS uses the image observations of the coded targets alongside the surveyed targets' 3D coordinates as external constraints for the photogrammetric network solution. In addition to those, AM and DBAT also include tie point observations from the SfM process detected across multiple image stereopairs. The location of coded targets were automatically detected on imagery in AM. Their image coordinates were then used as input observations in both VMS and DBAT. Following computation, a comparable quantitative analysis of the three outputs was conducted. Outputs estimated by the three bundle adjustments, included: a) the camera's interior orientation parameters (IOP) (i.e. focal length (f), principal point location (x_p , y_p), (K_1 , K_2 , K_3) parameters of symmetrical radial lens distortion, and (P_1 , P_2) parameters of decentring distortion); b) the camera's exterior orientation parameters (EOP); c) the targets' 3D coordinates of the calibration cube; and d) root mean square errors (RMSEs) between surveyed and estimated 3D coordinates of the coded targets.

The second stage involved an in-situ self-calibration assessment with large depth variation in object space and 3D surface model reconstruction (i.e. dense point clouds (DPCs) and DEMs). This stage included quantitative analysis under (a) various imaging network configurations such as standard aerial near-nadir image blocks at different heights with / without the inclusion of oblique imagery, and (b) different GCP configurations of varying number and distribution.

In particular, seven imaging network configurations were designed as follows: 1) nadir imagery at 50 m flying height above ground level (50n); 2) nadir imagery at 75 m (75n); 3) nadir and oblique imagery at 50 m (50n50o); 4) nadir and oblique imagery at 75 m (75n75o); 5) nadir imagery at 50 m and 75 m with oblique imagery at 50 m (50n75n50o); 6) nadir imagery at 50 m and 75 m (50n75n); 7) a combined image block configuration of all acquired images. Regarding GCP configurations, between four and nine GCPs were incorporated into the SfM-photogrammetric bundle adjustment. DBAT and AM were used for the comparison of sensor calibration estimations and AM was used for 3D surface model reconstruction. Error evaluation at 19 independent check points (ICPs) supported the accuracy assessment between the two DJI systems. Finally, to preliminarily assess the enhanced GNSS capabilities, the previous analysis was also performed using only the P4RTK-generated camera exposure stations without GCP inclusion into the SfM-photogrammetric bundle adjustment. Various parameter settings in AM (e.g. tie point/marker accuracies) were kept identical across the aforementioned tests for both methodological stages.

3. DJI SUA SYSTEMS

The P4P and P4RTK SUA are DJI quadcopters, each weighing less than 1.4 kg. Both systems can fly autonomously for up to c. 30 minutes. The P4P SUA is equipped with a single-frequency GNSS receiver and a consumer-grade Micro-Electro Mechanical System-Inertial Measurement Unit (MEMS-IMU) for navigation based on predefined flight paths. Unlike the P4P, the P4RTK carries a multi-frequency GNSS receiver with RTK functionality which enables improved SUA stability and 3D positional accuracy whilst hovering, as stated in DJI P4RTK (2019).

The P4P SUA carries a DJI FC6310 camera with an 8.8 mm nominal focal length, and a 1" CMOS 20 megapixel sensor with 2.41 x 2.41 μm nominal pixel size. The DJI FC6310 camera creates an image of 5472 x 3648 pixels corresponding to 13.2 x 8.8 mm. The P4RTK is equipped with a DJI FC6310R camera which has a glass lens rather than a plastic one, as fitted on the P4P sensor. The remaining specifications of the P4RTK FC6310R camera are identical to the P4P camera, according to DJI P4RTK (2019). However, the P4RTK only records images in jpg format, whereas the P4P also stores raw images in DNG format which are not pre-calibrated. The P4RTK can also capture non-calibrated images but only in jpg format, implying that a form of post-processing is carried out within the DJI system when an image is recorded and saved.

It should be noted that the two systems use different DJI control software to define flight and camera settings, named the Go 4 and the GS RTK for the P4P and the P4RTK, respectively. As the P4RTK SUA has only been recently launched, the GS RTK software version is yet to be updated. Therefore, it provides limited control for camera parameterisation set-up, as opposed to the Go 4 software. For example, at the time of image

acquisition the GS RTK software only allowed for an automatic focus without a description of the captured image size. It is anticipated that future versions of both software will be continually improved, enabling full manual control for setting-up all necessary camera parameters prior to SUA flight.

4. DATA ACQUISITION

4.1 Laboratory and in-situ outdoor SUA campaigns

A first indoor laboratory survey was carried out on 5th December 2018 and included image acquisition with a P4P from 10 camera stations in total, with convergent views of approximately 80 degrees from the centre of the 3D cube (Figure 1a). Inset images in Figure 1a and 1b illustrate the 3D calibration cube when used indoors and outdoors, respectively. In a similar manner, a second indoor lab survey was conducted on 13th March 2019 which included image capture with a P4RTK₂ from 13 camera stations. In both surveys the SUA were manually positioned on a stable surface to ensure sharp image capture. Due to the fitted 3-axis gimbal stabilisation, the SUA were manually rotated to capture images at ± 90 degree roll angles. Camera settings for the P4P and P4RTK₂ laboratory campaigns are reported in Table 1.

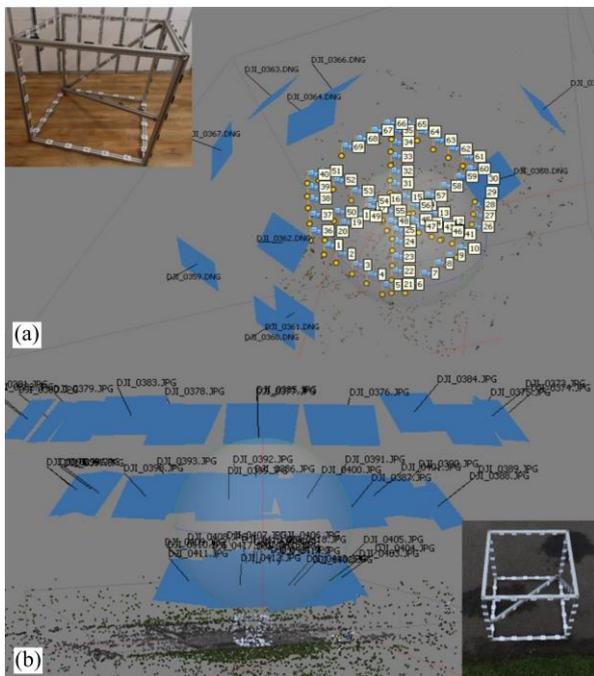


Figure 1. (a) Laboratory and (b) outdoor field surveys of the first methodological stage using the P4P and P4RTK₁.

Two outdoor flights were conducted on 12th December 2018 with image capture following a circular pattern, as seen in Figure 1b, with an average 7 m height variation above the ground. Both flights were operated in manual mode and imagery was captured while the SUA were hovering to minimise image blur. The camera settings, as defined prior to SUA flights, are listed in Table 1. The GS RTK software did not allow to manually set a fixed 1/1000 shutter speed, as adopted on the P4P settings. Moreover, due to the GS RTK software limitations (see Section 3), the P4RTK₁ captured images with different image heights to the P4P imagery, as detailed in Table 1.

38 and 49 images were acquired in total with the P4P and P4RTK₁, respectively. It should be noted that, because of software differences, there was no option to share the same pre-defined flight plan between the two systems, hence the slightly different number of images and configurations. 67 coded targets on the calibration cube, used for both indoor and outdoor tests, were pre-surveyed using a total station to deliver mm-level 3D coordinate accuracy in a local coordinate system. An a priori standard deviation of 5 mm was assigned to coded targets, which corresponds to marker accuracy in the SfM-photogrammetric bundle adjustment in AM.

At this point, it should be noted that the P4RTK₁ system used on 12th December 2018, was loaned by Heliguy, a DJI retail company (Heliguy, 2019), for several days. P4RTK₂, used for the laboratory survey conducted on 13th March 2019, was a different system, which was purchased by Newcastle University that month.

Campaigns	Laboratory	Outdoors	Wards Hill Quarry
Aperture	f/2.8	f/2.8	f/2.8
Shutter speed	1/40 (1/80)	1/1000 (1/640)	1/1000
ISO	100	200	400 (200)
Image size	5472 x 3648 (5472 x 3078)*	5472 x 3648 (5472 x 3078)**	5472 x 3648**
Aircraft speed	0 m/s	0 m/s	5 m/s (3 m/s)

* Refers to P4RTK₂ used on 13th March 2019

** Refers to P4RTK₁ used in December 2018

Table 1. Details of data acquired with the P4P and P4RTK SUA at all campaigns in the two methodological stages. Differences, shown in brackets, correspond to the P4RTK SUA.

4.2 SUA campaign at Wards Hill quarry

An in-situ self-calibration SUA campaign (see second stage of the methodology) was conducted on 13th December 2018 at Wards Hill Quarry, Morpeth, UK (Figure 2a). The quarry is now abandoned but it was actively producing limestone in the 1920s. The site is private, consisting primarily of grassland used for livestock grazing with occasional trees. Due to the considerable ground lowering where the limestone was quarried, the site provides a suitable area to investigate the effect of image scale variations and surface gradients on SfM-photogrammetric outputs.

To ensure that SfM-photogrammetric products from both SUA were georeferenced into a common fixed reference frame (Ordnance Survey Great Britain 1936, OSGB36), 28 targets were surveyed using GNSS rapid static mode with three-minute observations per point (Figure 2b). An average 3D relative accuracy of 0.003 m was estimated after post-processing with GNSS observations from OS Net station MORO.

337 and 575 images were collected in total using the P4P and P4RTK₁, respectively. This included nadir images from 50 m and 75 m flying heights, as well as oblique images within the range of 45 degrees to 75 degrees pitch angle (see combined imaging configuration; Figure 2c). For nadir image capture both systems were operated in automatic mode, whereas oblique images were acquired in manual mode. Because of the GS RTK software early version limitations, and in contrast to the P4P, the P4RTK₁ SUA did not hover to capture images when flying

in automatic mode. For this reason the P4RTK₁ was flying with a minimum constant speed of 3 m/s (Table 1) to minimise motion blur. 80 % forward and 80 % lateral overlap were predefined in both the Go 4 and GS RTK software.

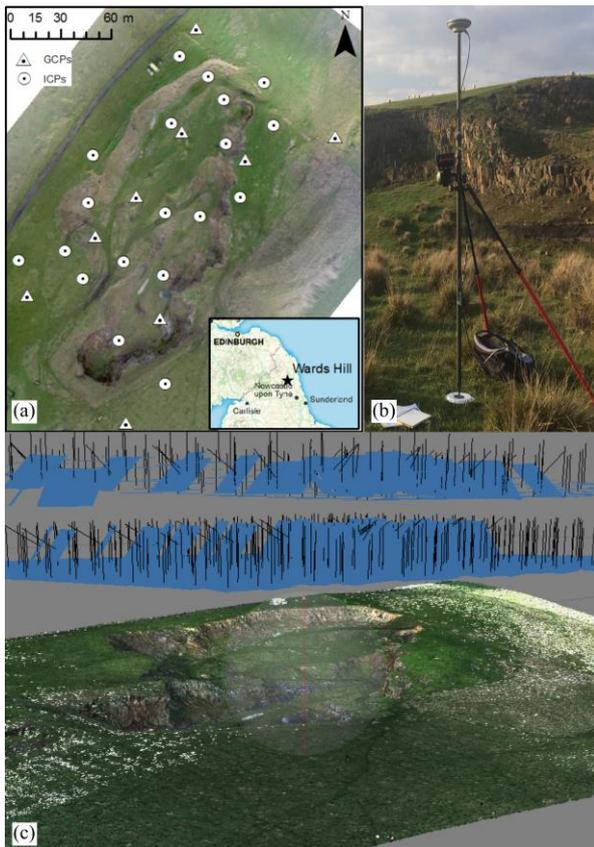


Figure 2. (a) Wards Hill Quarry overview (P4P-generated orthomosaic), (b) GNSS set up over a circular target with partial view of the quarry in the background, and (c) DPC generated from P4RTK₁ imagery with mixed range block geometry (captured at 50 m and 75 m above ground level, including oblique imagery).

5. RESULTS AND DISCUSSION

5.1 Laboratory and in-situ outdoor SUA campaigns

Table 2 presents provisional results for estimated values of the focal length and principal point location of the P4P camera from the indoor laboratory calibration. It also shows planimetric and vertical RMSEs at 41 check points. The remaining 26 targets of the 3D cube, seen in Figure 1a, served as external constraints in the bundle adjustment. According to the DBAT solution, a maximum 24 μm distortion (including radial and decentring distortion) was estimated at the half-diagonal of the P4P image radius (i.e. 7 mm radial distance). An average optical-ray angle generated from the 1700 tie points was 12 degrees, whereas the average optical-ray obtained from the coded targets was 70 degrees. Images acquired with a wider baseline and a better convergent angle would generate more tie points at the corners of each image, in turn strengthening the photogrammetric network solutions.

	AM	DBAT
f [mm]	8.850	8.853
x _P [mm]	0.016	0.017
y _P [mm]	-0.024	-0.021
RMSE XY [mm]	1.179	1.234
RMSE Z [mm]	0.527	0.551

Table 2. P4P calibration outputs obtained with AM and DBAT software from the lab field survey carried out on 5th December 2018 using nine images.

	VMS	DBAT
Laboratory - 13 th March 2019 *		
f [mm]	9.183	9.187
x _P [mm]	-0.007	-0.001
y _P [mm]	-0.065	-0.038
RMSE XY [mm]	2.630	1.774
RMSE Z [mm]	1.469	0.540
Outdoors - 12 th December 2018 **		
f [mm]	9.266	9.283
x _P [mm]	0.044	0.000
y _P [mm]	-0.055	0.000
RMSE XY [mm]	1.823	2.518
RMSE Z [mm]	0.698	0.920

* Refers to P4RTK₂

** Refers to P4RTK₁

Table 3. P4RTK calibration outputs obtained with VMS and DBAT software from the laboratory and in-situ outdoor field surveys. Note that two P4RTK systems were used, as explained Section 4.1.

Provisional P4P results from the in-situ outdoor field survey reported a maximum distortion of 46 μm at the half-diagonal. Maximum distortion differences of 8 μm and 9 μm between the VMS-AM and VMS-DBAT approaches were produced at the outer corners of the image, respectively. All outdoor survey approaches delivered planimetric and vertical RMSEs of the same mm-magnitude as RMSEs at check points of the indoor survey (Table 2). Regarding outdoor survey, VMS and DBAT estimated the values of the focal length and principal point location with maximum differences of 10 μm and 5 μm , respectively. Such discrepancies could be attributed to the two types of bundle adjustments adopted; a standard photogrammetric approach in VMS versus SfM-based in DBAT.

Possibly due to the aforementioned reason, a significant difference of 55 μm was calculated at the principal point y_P coordinate between VMS and DBAT for the P4RTK₁ outdoor survey, as seen in Table 3. Variations in focal length estimated values between the two surveys can be attributed to two factors: a) two different P4RTK systems were used (see Section 4.1) and b) different focus was set up between the indoor and outdoor experiment.

Regarding P4RTK₂ distortion estimation, a 42 μm maximum distortion was calculated at the outer corners of the P4RTK₂ image from the indoor laboratory survey. From the outdoor survey, a 67 μm maximum distortion was estimated at the outer corners of the P4RTK₁ image. It should be noted that for indoor and outdoor tests P4RTK₂ and P4RTK₁ imagery respectively had a different image format size to the P4P imagery (see Table 1). The P4RTK₂ and P4RTK₁ captured images with 13.8 x 7.8 mm width and height of a 2.52 x 2.52 μm pixel size. Moreover, at all calibration tests, a high correlation of over 95%

was observed between K_1 and K_3 radial distortion coefficients. This finding was expected, as K_1 is considered the most critical among all coefficients, especially in the case of compact digital cameras (James and Robson, 2014; Carbonneau and Dietrich, 2017). However, all three coefficients are considered in this calibration analysis to allow comparison with a previous study (Fraser, 2018).

During the ongoing analysis, special consideration is being given to reducing the magnitude of the standard deviations of the estimated IOP values. As Fraser (2018) reports, precision at the μm level is indicative of strong recovery of the estimated IOP values, improving the faithfulness of the photogrammetric calibration output. It should be highlighted that the presented preliminary distortion values were only estimated for the pre-calibrated P4P and P4RTK₁ and P4RTK₂ imagery. As described in Section 3, DJI software applies a pre-correction to the raw captured images and converts them into jpg format. Ongoing work is evaluating the degree of distortion that has been corrected by DJI and examines whether this can be further minimised, essentially through a secondary calibration.

5.2 SUA campaign at Wards Hill quarry

Planimetric and vertical RMSEs at 19 ICPs (Figure 2a) for the seven imaging configurations are shown in Figure 3, as calculated for both P4P and P4RTK₁ systems. These RMSEs were estimated when four GCPs were incorporated into the self-calibrating bundle adjustment in AM as external constraints. Among all P4P solutions, the highest RMSEs were observed in the 50n imaging configuration, which is not the case for the P4RTK₁ results. Interestingly, smaller 2D RMSE values were estimated at 75n rather than the combined solution for the P4P system (Figure 3a). Nonetheless, the inclusion of oblique imagery considerably improved the level of P4P vertical accuracies at ICPs (Figure 3b). When comparing the two systems, the P4RTK₁ provided a better consistency, as smaller variations of RMSEs were observed across all configurations, both in plan and elevation, and both with and without the inclusion of oblique images (Figure 3).

Across all the configurations shown in Figure 3a, the 50n50o delivered the smallest 2D RMSE value for the P4P system, equal to 13.6 mm, 1.7 mm different from the RMSE value of the combined solution. Whereas, the minimum vertical P4P RMSE magnitude was observed at the combined solution, corresponding to 28.7 mm. Regarding the P4RTK₁ results, the best planimetric accuracy was achieved by the 50n75n configuration with a 14.2 mm RMSE, 1.5 mm different from the RMSE value of the combined solution. A 28.8 mm minimum vertical RMSE was calculated at the 75n75o imaging configuration.

Given that a 16 mm ground sampling distance (GSD) was estimated for both P4P and P4RTK₁, the aforementioned planimetric errors correspond to less than 1 x GSD, and agree with results from previous studies. For instance, Chiabrando and Losè (2017) applied a SfM-photogrammetry pipeline with P4P imagery over a historic building using a mixed block of nadir and circular oblique configurations. They calculated a 12.2 mm 2D RMSE and a 17 mm vertical RMSE when comparing the coordinates against GNSS / total station observations (although the estimated GSD was not stated). However, it should be noted that their output values were estimated using only eight ICPs (Chiabrando and Losè, 2017).

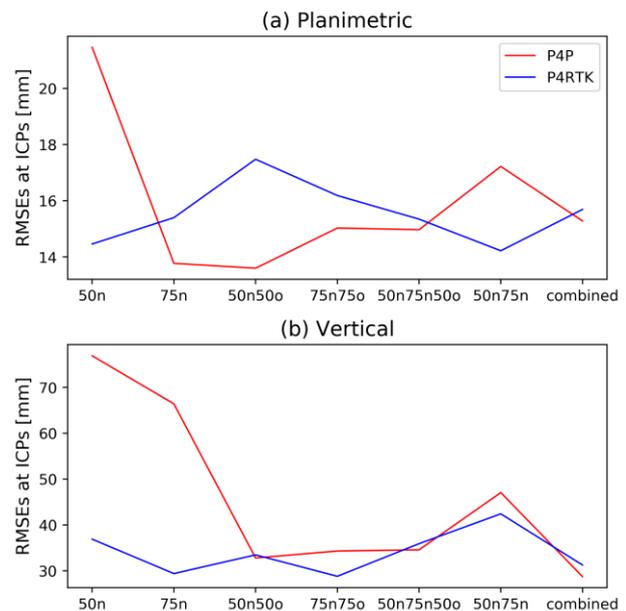


Figure 3. P4P and P4RTK₁ (a) planimetric and (b) vertical RMSEs estimated at 19 ICPs with a SfM-photogrammetric bundle adjustment in AM using four GCPs under various imaging configurations.

In the analysis here, a 1.8 x GSD vertical accuracy (i.e. approximately 29 mm vertical RMSE) was delivered from both P4P and P4RTK₁ SUA. It should be noted that during the SUA flights, lighting conditions were continuously varying (from strong shadow to winter sun glare), therefore imagery was illuminated differently, as depicted in Figure 2c. Such illumination differences could have adversely affected the SfM tie point detection pipeline on overlapping images (Eltner et al., 2016), which in turn potentially degraded the vertical accuracy level.

To estimate the magnitude of 3D error in relation to the flying height, the RMSE values of the combined configuration were transformed into relative error ratios. A ratio of 1:1900 was estimated for both P4P and P4RTK₁ SUA under a multi-scale photogrammetric block configuration. This agrees with reported relative ratios obtained with rotor-wing SUA in previous studies (e.g. Eltner et al. (2015)).

The inclusion of additional GCPs was not found to significantly improve the results of the presented analysis. The terrain depth variations, alongside the varying camera station heights, resulted in a multi-scale photogrammetric network, providing low RMSE values. However, when only camera stations obtained with the P4RTK₁ in the 75n configuration, were utilised as external constraints in the AM SfM-photogrammetry pipeline (i.e. zero GCPs), the absolute accuracy reduced significantly. 1.0 m planimetric and 2.2 m vertical RMSEs were estimated at ICPs, with a systematic bias mainly in the Northing coordinate ($\text{RMSE}_{\text{Easting}}$ equal to 0.031 m and $\text{RMSE}_{\text{Northing}}$ equal to 0.993 m).

Moreover, a bowl-shape vertical distortion was generated, as shown in Figure 4a. This bias was effectively removed (Figure 4b) with the inclusion of four GCPs (established at the corners of the study site) into the AM SfM-photogrammetry pipeline. Therefore, a minimum of a few GCPs is necessary to remove

such a bowl-shape effect, as reported in previous studies (James and Robson, 2014; Carbonneau and Dietrich, 2017). However, even with GCPs as external constraints, variances of higher magnitude than the estimated vertical RMSEs (i.e. 29 mm), were observed at the outer corners of the study site (Figure 4b). This can be caused partly due to the single-scale image photogrammetric block (75 m nadir imagery in Figure 4b). Also, as Fraser (2018) reported, biases in point positions cannot be entirely removed, even with GCP inclusion into the SfM-photogrammetric bundle adjustment, and can often have magnitudes greater than the estimated standard deviations.

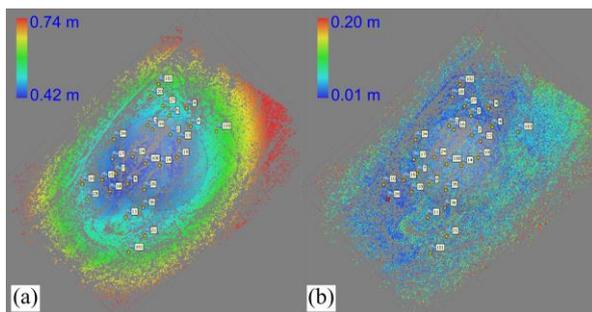


Figure 4. Plan view of estimated variances at tie points from the P4RTK₁ SfM-photogrammetric bundle adjustment in AM with nadir imagery at 75 m and (a) zero GCPs, and (b) four GCPs. Note the different vertical colour scales.

6. CONCLUSIONS AND FUTURE WORK

This paper has presented preliminary investigations of the DJI Phantom 4 Pro and Phantom 4 RTK SUA systems in relation to photogrammetric data acquisition. The analysis includes laboratory and in-situ accuracy assessments obtained with self-calibrating bundle adjustments from VMS, Agisoft Metashape and DBAT software over various imaging block configurations.

Regarding the internal geometry of the two systems, provisional results have indicated that the estimated maximum lens distortion is in the region of 24 μm to 67 μm . This preliminary estimation refers to the pre-calibrated by DJI P4P and P4RTK imagery. Regarding the external geometric accuracy, results have shown that both Phantom DJI systems can deliver planimetric and vertical absolute accuracies of 14 mm and 29 mm at ICPs respectively, corresponding to a relative precision of 1:1900. This can be achieved with an imaging network configuration comprising mixed height range and nadir/oblique capture. The terrain depth variation has also contributed to achieving such accuracy levels. As a result, the inclusion of a few GCPs (e.g. four at the outer corners of the study site) are adequate to remove significant positional distortions and strengthen the self-calibrating bundle adjustment. The presented analysis was based on a greater than standard 60% forward and 40% lateral image overlap, providing high redundancy.

Ongoing analysis is investigating the consistency of the cameras' IOP values, estimated with the various bundle adjustment solutions from laboratory and in-situ surveys for both systems. In particular, the computed correlations between the focal length and the cameras' EOP is currently being analysed. Attention is also being given on the magnitude of the estimated standard deviations of both IOPs and EOPs. Ways to strengthen the bundle adjustment solutions, thereby improving their internal precision, are under investigation. Further

evaluation on estimating the lens distortion of the raw P4P and P4RTK imagery is also scheduled.

Future work includes an additional validation of the RMSEs at ICPs independently from the Agisoft Metashape estimations. Such analysis will compare the ICP 3D coordinates, manually extracted from the reconstructed DPC and/or orthomosaic in a different software package against the surveyed ICP 3D coordinates. Importantly, regarding the RTK capabilities of the Phantom 4 RTK SUA, further post-processing of its trajectory in conjunction with an OS Net base station is also scheduled. This can potentially improve the metre-level accuracy of camera exposure station positions. Error analysis of the cameras' IOP/EOP and computation of RMSEs at ICPs after the RTK post-processing is also planned.

Ultimately, findings from comprehensive accuracy assessments can demonstrate the capabilities and metric performance of these new and popular off-the-shelf DJI SUA systems. Such error analysis can provide non-experts with a better understanding of associated uncertainties and measurement precision levels, thereby supporting the design of pre-flight photogrammetric data acquisition for a wide range of applications.

ACKNOWLEDGEMENTS

This research was supported by UKCRIC - UK Collaboratorium for Research in Infrastructure & Cities: Newcastle Laboratories (EPSRC award EP/R010102/1). The authors would like to thank Heliguy for the loan of the Phantom 4 RTK (P4RTK₁) system on 12th and 13th December 2018.

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