# CALIBRATION AND ACCURACY TESTING OF MOBILE PHONE CAMERAS

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**ABSTRACT:** This paper examines the potential of mobile phones to be used as a front-end sensor for photogrammetric procedures and applications. For this purpose we are currently calibrating various mobile phones over our indoor 3D testfield, using self-calibration. Using the same testfield we are performing accuracy tests in order to evaluate the metric performance. This paper reports about first experiences in calibration and accuracy validation of mobile phone cameras.

#### **1. INTRODUCTION**

With the availability of very affordable and good resolution CCD/CMOS cameras and other offthe-shelf devices, including compact computers (of laptop type) the potential of building efficient mobile, low-cost, high-performance systems has substantially improved. Among various hardware and software components mobile phones constitute an interesting component for image data acquisition for obvious reasons: They are very inexpensive, light and handy and have CMOS cameras integrated of currently up to 10 Mpixels image format.

Due to very limited size and restricted material and equipment costs, the production of mobile phone cameras is a challenge. The impact of their production specifications on the stability of interior orientation and 3D object reconstruction capabilities has not adequately been studied in the literature. This work investigates the accuracy potential of two recent mobile phone cameras and compares them with respect to two off-the-shelf digital still video cameras.

The next chapter introduces the cameras and the calibration/validation testfield. The third chapter gives the results of the accuracy test for all four cameras and a test, which analyses the effect of JPEG compression. The fourth chapter discusses the results.

#### 2. CAMERAS AND THE TESTFIELD

#### 2.1 Cameras

Four cameras are used (Fig. 1). Two of them are mobile phone cameras (Sony Ericsson K750i and Nokia N93) and two of them are off-the-shelf digital still video cameras (Sony DSC W100 and Sony DSC F828). The mobile phone cameras have CMOS sensors of smaller size than the CCD chips in the off-the-shelf cameras and partly much smaller lenses. The technical specifications of all four cameras are given in Table 1.



Fig. 1. Cameras used in our tests. (a) Sony Ericsson K750i, (b) Nokia N93, (c) Sony DSC W100, (d) Sony DSC F828.

	K750i	N93	W100	F828		
Sensor	CMOS, 1/3.2"	CMOS, 1/3.2"	CCD, 1/1.8"	CCD, 2/3"		
	4.5 x 3.4 mm	4.5 x 3.4 mm	7.2 x 5.3 mm	8.8 x 6.6 mm		
Pixel size	2.8 micron	2.2 micron	2.2 micron	2.7 micron		
Image format	1632 x 1224	2048 x 1536	3264 x 2448	3264 x 2448		
	2 Mpixel	3.2 Mpixel	8 Mpixel	8 Mpixel		
Lens	No information	Carl Zeiss	Carl Zeiss	Carl Zeiss T <sup>*</sup>		
		Vario-Tessar	Vario-Tessar	Vario-Sonnar		
<b>Focal length</b>	4.8 mm	4.5 – 12.4 mm	7.9 – 23.7 mm	7.1 – 51.0 mm		
<b>Optical zoom</b>	No	3X	3X	7X		
Auto focus	Yes	Yes	Yes	Yes		
Aperture	F2.8 (fixed)	F3.3 (fixed)	F2.8 - 5.2	F2.0 - 8.0		
Output format	Only JPEG	Only JPEG	Only JPEG	JPEG and TIFF		

Table 1: Technical specifications of the cameras.

# 2.2 Testfield



Fig. 2. The 3D testfield and the Axyz system.

The photogrammetric calibration field at the Institute of Geodesy and Photogrammetry (HIL C57.3, ETH Zurich) was used. It is 3.4 x 2.0 x  $1.0 \text{ m}^3$  in size. The 3D coordinates of 87 well distributed control points (GCP) were measured using a Leica Axyz system. The Leica Axyz system consists of two Leica total stations (TC 3000 and TC 2002) and one processing computer unit, which is connected to them (Fig. 2). After an initialization step, operators simultaneously two measure the vertical angles and horizontal directions of the targeted point. The system calculates the 3D coordinates (by spatial intersection)

and the precision values in real-time. The scale of the object space was given by measuring a bar whose length was accurately defined by interferometry. The average precision values of the GCPs are  $\pm 0.03$ ,  $\pm 0.05$  and  $\pm 0.03$  mm for X, Y and Z axes, respectively.

# **3. ACCURACY TESTS**

For the calibration of the K750i, eighteen images from three locations, i.e. left, centre and right, (each of which has three stations, i.e., down, middle and up) were taken in a convergent geometry mode. Nine images are in normal mode. At each central station (central-down, central-middle and central-up) three more images rotated as  $-90^{\circ}$ ,  $+90^{\circ}$  and  $180^{\circ}$  were taken.

For the calibration of the N93, W100 and F828 cameras an image acquisition geometry with thirteen images was used. Nine images were taken in normal mode. The rest four images are rotated  $(+/-90^{\circ})$  images at arbitrary stations of central location.

The image measurements were performed with the Least Squares template matching (Gruen, 1985) using the in-house developed software BAAP. Another in-house developed software SGAP (Beyer, 1992) was used for the bundle block adjustment with self-calibration.

The imaging quality differs among the cameras. In Fig. 3a, 3b and 3c, low-level image enhancement effects are strongly visible at the edges of the points. The F828 has the best overall

image quality considering all images from all stations. On N93 images (Figure 3b and 3f) strong JPEG artifacts are visible (Figure 4).



Fig. 3. Image quality of the cameras. (a), (b), (c) and (d) are cropped images at station centralmiddle from K750i, N93, W100 and F828, respectively. The signalized point approximately locates at the centre of the image. Image scales are 1/863, 1/829, 1/460 and 1/513 for (a), (b), (c) and (d), respectively. (e), (f), (g) and (h) are cropped images at station central-down from K750i, N93, W100 and F828, respectively. The signalized point approximately locates at the upper left part of the full image. Image scales are 1/977, 1/961, 1/550 and 1/583 for (e), (f), (g) and (h), respectively.



Fig. 4. 3X zoom-in of the upper left part of Fig. 3f. JPEG artifacts are visible.

The K750i, N93 and W100 have only the JPEG output option. Their image measurements were carried out on their original JPEG images. For the F828, TIFF output images were used for the image measurements.

## 3.1 Accuracy test of K750i

The 18 images version gives a sigma0 value of about half a pixel (version 10 in Table 2) and highly systematic residual patterns at some images (Fig. 5, first column), even after self-calibrating bundle adjustment with block-invariant additional parameters.

The six most deteriorated images among the rotated ones were then excluded. These reduced twelve images versions (versions 11, 12, 13, 14 and 15 in Table 2) give better sigma0 and precision values. However, a systematic pattern of the image

coordinate residuals still remains, varying from image to image. Note that version 15 stands for the free network adjustment.

Ver	GCP	CHK	TIE	APs	Rej	Sigma0	STD-X	STD-Y	STD-Z	RMSE-X	RMSE-Y	RMSE-Z
						(µm)	of CHK	+TIE poir	nts (mm)	at only	ts (mm)	
10	87	0	90	10	0	1.20	0.291	0.558	0.251	N.A.	N.A.	N.A.
11	87	0	80	10	26 <sup>(1)</sup>	0.65	0.187	0.307	0.161	N.A.	N.A.	N.A.
12	87	0	80	44	26 <sup>(1)</sup>	0.64	0.185	0.304	0.159	N.A.	N.A.	N.A.
13	44	43	80	10	25 <sup>(1)</sup>	0.64	0.188	0.312	0.163	0.280	0.498	0.201
14	10	77	80	10	$27^{(1)}$	0.61	0.196	0.318	0.173	0.499	1.048	0.501
15	167		-	10	30 <sup>(1)</sup>	0.59	0.174	0.283	0.151	N.A.	N.A.	N.A.
Ver		:	Versi	on nui	nber							
GCP	P/CHK	TIE :	Numt	per of	contro	l points / i	independe	ent check	points / tie	e points, res	spectively	
APs		:	Numb	ber of	additic	onal paran	neters					
Rej		:	Rejec	ted rag	ys by d	lata-snoo	ping, reje	ction rule	for <sup>(1)</sup> : re	ject all resi	duals $>= 4x$	xSigma0
Sign	na0	:	Stand	ard de	viation	n of image	e observat	tions a pos	steriori			
STD	)	:	Avera	ige the	eoretic	al precisio	on values	of CHK/1	TIE coordi	inates		
RMS	RMSE · Empirical accuracies of CHK coordinates											

Table 2: Absolute accuracy test of K750i.



Fig. 5. Systematic residual patterns after self-calibrating bundle adjustment.

After Brown's 10 additional parameter set, Gruen's (1978) 44 additional parameter set was applied. The block-invariant 44 additional parameters did not compensate the systematic errors as well (version 12).

#### 3.2 Accuracy test of N93

The accuracy test of N93, also based on block-invariant APs, apparently gives better results. The sigma0 is a quarter of a pixel. A systematic error pattern still remains in the residuals (Fig. 5, second column), however, the magnitude is much less than in K750i's case. It has clearly achieved sub-millimeter accuracy in object space (versions 22 and 23 in Table 3) in all coordinate directions.

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Ver	GCP	CHK	TIE	APs	Rej	Sigma0	STD-X	STD-Y	STD-Z	RMSE-X	RMSE-Y	RMSE-Z	
						(µm)	of CHK+TIE points (mm)			at only CHK points (mm)			
21	87	0	99	10	0	0.55	0.165	0.312	0.139	N.A.	N.A.	N.A.	
22	44	43	99	10	0	0.52	0.157	0.286	0.133	0.449	0.617	0.225	
23	10	77	99	10	0	0.50	0.161	0.284	0.140	0.701	0.816	0.203	
24	186			10	0	0.47	0.144	0.250	0.120	N.A.	N.A.	N.A.	

Table 3: Absolute accuracy test of N93.

#### 3.3 Accuracy test of W100

The W100 gives slightly better theoretical precision and empirical accuracy values than the N93 (Table 4). The standard deviation of image observations is in the same range with the N93, i.e. one quarter of a pixel. The W100 reveals similar residual errors like the N93 regarding the magnitude (Fig. 5, third column).

Ver	GCP	CHK	TIE	APs	Rej	Sigma0	STD-X	STD-Y	STD-Z	RMSE-X	RMSE-Y	RMSE-Z	
						(µm)	of CHK+TIE points (mm)			at only CHK points (mm)			
31	87	0	92	10	0	0.59	0.114	0.203	0.094	N.A.	N.A.	N.A.	
32	44	43	92	10	0	0.55	0.104	0.181	0.084	0.298	0.369	0.221	
33	10	77	92	10	0	0.47	0.100	0.168	0.085	0.501	0.421	0.443	
34	179			10	0	0.44	0.083	0.140	0.067	N.A.	N.A.	N.A.	

Table 4: Absolute accuracy test of W100.

## 3.4 Accuracy test of F828

The F828 gives the best performance and remarkably superior numbers compared to the other cameras (Table 5). Sigma0 goes down to 1/10 of a pixel. Also, the empirical RMSEs are here in much better agreement with the theoretical standard deviations.

Table 5: Absolute accuracy test of F828.

Ver	GCP	CHK	TIE	APs	Rej	Sigma0	STD-X	STD-Y	STD-Z	RMSE-X	RMSE-Y	RMSE-Z	
						(µm)	of CHK	+TIE poir	nts (mm)	at only CHK points (mm)			
41	87	0	81	10	0	0.27	0.048	0.084	0.041	N.A.	N.A.	N.A.	
42	44	43	81	10	0	0.27	0.047	0.082	0.040	0.076	0.125	0.058	
43	10	77	81	10	0	0.26	0.049	0.084	0.043	0.097	0.144	0.134	
44	168			10	0	0.25	0.043	0.074	0.037	N.A.	N.A.	N.A.	

# 3.5 JPEG test with F828

The use of JPEG images for the image measurements of K750i, N93 and W100 raised the question whether the JPEG compression has an effect on the results. The original TIFF images of the F828 were converted to quality level 100 (maximum quality) and 70 JPEG images, using the free software IrfanView (version 3.98, <u>http://www.irfanview.com</u>). Table 6 gives the results. The loss of empirical accuracy due to  $\sim$  42 times JPEG compression is only 12 microns in depth (version 51 and 53 in Table 6). The other coordinates are of the same accuracy. Our results are controversial to those results given in Lam et al. (2001), Li et al. (2002) and Shih and Liu (2005). However, their tests are on aerial images, while we have a close-range test object under good illumination conditions.

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Ver	Compression	APs	Rej	Sigma0	STD-X	STD-Y STD-Z RMSE-X			RMSE-Y	RMSE-Z		
				(µm)	of CHK+TIE points (mm)			at only CHK points (mm)				
51	Original (TIFF)	10	0	0.26	0.047	0.082	0.040	0.077	0.120	0.059		
52	5.5 (Q100)	10	0	0.26	0.047	0.082	0.040	0.078	0.124	0.059		
53	41.6 (Q70)	10	0	0.26	0.047	0.082	0.040	0.077	0.132	0.060		

Table 6: JPEG compression test with F828 (GCP/CHK/TIE are 44/43/81 respectively).

# 4. ANALYSIS OF RESULTS

In spite of giving the worst results in the test, the K750i still can offer sub-millimeters accuracy in the object space. Both block-invariant 10 and 44 additional parameter sets cannot compensate the systematic errors fully.

The first three cameras of the test K750i, N93 and W100 give identical standard deviation values for the image observations (between 1/4 - 1/5 pixel). They all apply a chip level image enhancement for sharpening the images. This effect is visible in Figures 3a, 3b and 3c. This low level image enhancement, while improving the visual quality, is probably reducing the geometric quality of the cameras. They show noticeably block-variant systematic errors after the self-calibrating bundle adjustment with block-invariant additional parameters.

The N93 and W100 have same lens systems (Zeiss, Vario-Tessar). The W100 has a CCD sensor of larger size with 8 Mpixels. It is 2.5 times larger than the CMOS sensor of N93. According to

theoretical expectations, the N93 should give an accuracy of factor 1.6 (square root of 2.5) worse compared to the W100. The N93 almost strictly meets this expectation by giving 1.7-1.9 times worse numbers than the W100. On the other hand, there is a large difference between those two cameras, considering the size of the imaging system and the cost of the materials used in the construction. In this respect, the accuracy performance of the N93, as compared to the W100, is noteworthy.

Although the W100 and F828 have the same image format with 8 Mpixels, the expectation of equal accuracy does not hold here. The W100 gives substantially worse accuracy numbers (almost 3 times) than the F828. This is mainly due to a better lens system of the F828 and (possibly) the degrading chip level image enhancement operation of the W100.

## **5. CONCLUSIONS**

We have metrically calibrated and we have tested the metric accuracy of four consumer-grade imaging devices: Two mobile phone cameras (Sony Ericsson K750i and Nokia N93) and two still video cameras (Sony DSC W100 and Sony DSC F828). The tests were performed by using our in-house 3D testfield. We have found unwanted effects from image enhancement (sharpening) in the K750i, N93 and W100 cameras and JPEG compression artifacts in the N93. In all four cases we have used (more or less) the same imaging geometry, and imaging conditions in order to make the results comparable.

With the given strong geometrical set-up of course all parameters for the interior orientation could be calibrated reliably.

The accuracy tests showed that in all cases the theoretical expectations, as defined by the average standard deviations of the object space coordinates, could not be achieved by the empirical RMSEs, computed from checkpoints. The deviations range from factor 3.3 (K750i) to factor 1.7 (F828). While the sigma0 values of the K750i, N93 and W100 are all at a 1/5 pixel level, they drop down to 1/10 pixel with the F828. This improvement in sigma0 is matched by the better behaviour of the post-adjustment image residuals. Only in case of the F828 do we get an almost random distribution. The other cameras, in particular the K750i, suffer from strong image-variant systematic errors. Since we have used in our self-calibration only block-invariant additional parameters these errors could not be compensated. The error patterns are also not in agreement with what we are used to in photogrammetry. Therefore, our standard additional parameter functions cannot compensate these defects. So far we cannot explain the reasons for these errors. Could they lie in the image enhancement procedure or any other shortcomings in the electronic circuits?

Nevertheless, and despite these problems, we could reach relative accuracies of 1:8 000 in-plane and 0.03% of average depth with the K750i and 1:34 000 in-plane and 0.005% of average depth with the F828, using in both cases 10 control points. This superior behaviour of the F828 can only partly be explained by the larger image format (8 Mpixels versus 2 Mpixels), which theoretically should only lead to an improvement of factor 2.

If we apply to both cameras a free network adjustment by minimizing the trace of the covariance matrix for the object space coordinates we get the following values: 1:25 000 and 0.009% for the K750i and 1:99 000 and 0.0025% for the F828. This shows roughly the same relationship between both cameras, it gives however a better indication of the potential system accuracy. It is worthwhile to note that, compared to the film-based large format aerial photogrammetric block adjustment accuracy, we can achieve here the same and better accuracies in height and almost the same in planimetry, if we consider for the aerial case an object area of one image coverage only (like in our close-range case). This definitely indicates the great potential of consumer-grade and even mobile phone cameras for photogrammetric processing. The main remaining problem is to find a convincing explanation for the image-to-image varying systematic error pattern in some of the mobile phone cameras.

In a final test we also checked the effect of JPEG compression on the metric system accuracy for the F828 camera. Even when going up to a factor of 42 compression rate we did get only a small reduction in accuracy (9% in depth direction). This can be considered harmless.

Our future plans are to spread these tests over a longer time period in order to check the temporal stability of the calibration and also invest some more work into image quality studies.

In conclusion we can state that mobile cameras do give us a very interesting option for doing "mobile photogrammetry", in terms of accuracy, costs and flexibility.

The integration of GPS receivers and motion sensors will further broaden their applicability.

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