# Autofocusing SAR images via local estimates of flight trajectory 

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#### Abstract

High－resolution imaging with an airborne synthetic aperture radar（SAR）calls for precise trajectory measurements that can hardly be achieved with common navigation systems．In this paper，an efficient method called the local－quadratic map－drift autofocus is developed for the estimation of residual（uncompensated）motion errors directly from the received radar data． The map－drift autofocus is applied locally on short time intervals to estimate the cross－track components of the aircraft accel－ eration．The estimated acceleration is then integrated to evaluate the residual trajectory errors on the whole data frame inter－ val．The method has been successfully tested with an X－band airborne SAR system．


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## I．INTRロロபCTIロN

Airborne synthetic aperture radar（SAR）systems are capable of high－resolution imaging of earth surfaces that is required in many practical applications．The quality of SAR images essentially depends on the precision of the aircraft trajectory measurements［1－3］．Uncompensated motion errors cause range delays and phase errors in the received radar data result－ ing in distortions of SAR images．However，the accurately measured deviations of the trajectory from the reference straight line can be compensated［2－5］with minor deteriora－ tions of image quality．The problem is that in the case of a very high resolution and／or a light－weight aircraft platform，even expensive navigation systems do not guarantee the required accuracy of measurements．For such situations，autofocus methods have been developed for precise estimation of the motion errors directly from the received radar data［1－4］．

Autofocus techniques can be divided into two general classes－parametric and nonparametric．The parametric auto－ focus methods use some model for the platform motion．The aim of the methods is to estimate the parameters of the model． The map－drift autofocus（MDA）［ $1,3,6-9$ ］is a widely known parametric method．It estimates the quadratic phase error in the data by measuring the linear shift between two SAR images built by dividing the azimuth processing interval on two halves．The multiple－aperture MDA［3，10］estimates the phase error as a higher－order polynomial．Other models， such as a Fourier series，have also been proposed［10－12］． The problem is that the parametric autofocus methods are restricted by the models applied．

[^0]The nonparametric methods do not use approximation models for phase errors．One of the most powerful non－ parametric methods is the phase gradient autofocus（PGA） ［3，13，14］．It estimates the first derivative（the gradient）of the azimuth phase error function from signals backscattered from isolated point targets．However，the PGA is intended mainly for the spotlight SAR mode．In this SAR mode，the signal from every point target on the scene is presented in each radar pulse，and the phase error is almost independent on range．In the strip－map SAR mode，the application of the PGA method is complicated because the target echoes are pre－ sented in the data only during the time required for the target to cross the antenna beam．It means that the signal of each selected point target contains only a small part of the complete phase error function．Moreover，in the strip－map mode，the range dependence of the phase errors can be significant and should be taken into account when averaging the autofocus estimates across the swath．

In this paper，a new approach to the strip－map SAR auto－ focus is presented．The method is called the local－quadratic MDA（LQMDA）．The idea of the method is to estimate the local quadratic phase errors on short azimuth intervals． Such estimates are performed independently for a number of range blocks across the swath．Using the range dependence of the phase errors，the uncompensated cross－track compo－ nents of the aircraft acceleration are evaluated for each short azimuth time interval．Finally，the residual trajectory devia－ tions are obtained by double integration of the estimated acceleration．The proposed method is non－parametric allow－ ing the estimation of an arbitrary smooth range－dependent phase error function．The LQMDA method has similarities with the reflectivity displacement method［15－17］．Both methods use local estimates of the motion errors and the inte－ gration steps to evaluate the phase error function．

The proposed LQMDA method does not require the presence of bright points on the scene and can be used both in the
strip－map and spotlight SAR modes．This method refines the air－ craft trajectory to a high precision so that high－quality multi－look SAR images can be produced．The developed autofocus tech－ nique has been successfully tested on practice using radar data obtained with the X－band airborne SAR system［5，18］．Main characteristics of the SAR system are listed in Table 1．Some early results on the LQMDA technique have already been pub－ lished［19］and presented in several conferences［20－24］．

The paper is organized as follows．In the next section，the frame－based SAR processing and common motion error com－ pensation（MOCO）procedures are discussed．Section III describes the developed LQMDA in detail，including the incorporation of the method within the framework of the range－Doppler algorithm（RDA）．Experimental results are presented and discussed in Section IV，and a brief conclusion is given in Section V．

## II．FRAME－BASED SAR PRロCESSING AND MロCロ

The SAR data processing is commonly organized on a frame－by－frame basis；each data frame counts many intervals of synthesis．A scheme with half－overlapped frames is illustrated in Fig．1．In such scheme，each backscattered pulse is put in two frames，and these two frames are processed independently and simultaneously，in parallel，in the hardware．Each frame is pro－ cessed with its own reference straight flight trajectory，the refer－ ence aircraft flight altitude，velocity，and orientation．The SAR images obtained from the sequence of data frames are then stitched together to form a longer strip－map SAR image．

The SAR image of each frame has invalid zones at its azimuth edges，where the image brightness decays to zero． This is because these areas of the scene are only partly illumi－ nated by the antenna beam during the data frame acquisition time．Neighbor frames have significant overlapped areas．It

Table 1．Main characteristics of the RIAN－SAR－X system．

| System parameter | Parameter value |
| :--- | :--- |
| Transmitter type | Solid－state power amplifier |
| Peak power | 120 W |
| PRF | $3-5 \mathrm{kHz}$ |
| LFM pulse bandwidth | 100 MHz |
| LFM pulse duration | $5-6 \mu \mathrm{~s}$ |
| Receiver bandwidth | 100 MHz |
| Receiver noise figure | 2 dB |
| Analog－to－digital converter（ADC） | $200 \mathrm{MHz} / 14$ bit |
| $\quad$ sampling frequency／capacity |  |
| Antenna beam width in azimuth／ | $10^{\circ} / 40^{\circ}$ |
| $\quad$ elevation |  |
| Antenna gain | 20 dB |
| Aircraft flight velocity | $30-80 \mathrm{~m} / \mathrm{s}$ |
| Aircraft flight altitude | $1000-5000 \mathrm{~m}$ |
| Range resolution | 2 m |
| Range sampling | 1.5 m |
| Number of range gates | $2048(4096$ raw） |
| Range swath width | 3072 m |
| Azimuth resolution | 2 m |
| Maximum number of looks | 35 looks |
| Raw data recording | Uncompressed raw data |
| Recorded raw data rate | at the full PRF rate |



Fig．1．SAR processing with half－overlapped data frames．
helps image stitching and guarantees continuous surveillance of the strip without gaps despite of possible motion instabilities．

Due to the frame－based processing，the trajectory devia－ tions and orientation errors are kept relatively small within the frame，and many approximate algorithms for MOCO can be used．

The navigation system of the airborne RIAN－SAR－X system $[5,18]$ is designed as follows．The hardware part of the navigation system is based on a simple global positioning system receiver capable of measuring the aircraft position and velocity．The position is measured with accuracy of an order of several meters and used to link the obtained SAR images to ground maps and also to get the flight altitude above the ground．The accuracy of the velocity measurements is as high as $0.05 \mathrm{~m} / \mathrm{s}$ ．

The accurate aircraft flight trajectory is integrated from the measured aircraft velocity to perform MOCO in real time．The achieved accuracy is sufficient to produce full－resolution（up to 2 m ）SAR images（X－band）with up to 15 looks（except some cases of very rough flight conditions）．Later，at the data post－processing stage，the aircraft trajectory is further refined by using an autofocusing method described in this paper that allows processing the full Doppler bandwidth and forming high－quality SAR images with up to 35 looks at 2 m resolution．

The antenna beam orientation in the RIAN－SAR－X system is evaluated from the measured Doppler frequency of the backscattered radar signals in real time［5］．With such tech－ nique，the angles are determined with respect to the current aircraft velocity vector（regardless of the orientation of the air－ craft construction axes）．The estimated pitch and yaw angles are averaged during the data frame acquisition time and used as the reference angles both for motion compensation and for aperture synthesis．Due to the averaging，the reference angles are assumed to be defined with respect to the reference flight line．Such angle estimation is a kind of clutter－lock pro－ cessing allowing us to adjust our SAR data processing algo－ rithms for each data frame in real time to track variations of the antenna beam orientation and avoid significant radiomet－ ric errors．The variations of the antenna pitch and yaw angles within the data frame caused by the aircraft orientation errors， as well as the aircraft drift and flight direction deviation effects are ignored in real time，but can be compensated via the multi－ look radiometric correction with extended number of looks ［5］at the post－processing stage if necessary．

The MOCO procedure typically includes data interpolation and phase correction steps．The along－track trajectory errors are equivalent to non－uniform spatial sampling of the data． These errors can be compensated by data interpolation in
the azimuth direction. Alternatively, the pulse repetition frequency (PRF) can be adjusted from pulse to pulse according to the current aircraft velocity in order to keep the inter-pulse aircraft path constant. The first approach was implemented in the airborne RIAN-SAR-X system and the second one in the RIAN-SAR-Ku system [5].

The along-track error compensation is followed by the slant range (or the line-of-sight) error correction. The geometry of the motion compensation problem is illustrated in Fig. 2. The point $A(0,0, H)$ indicates the expected position of the aircraft on the reference straight line trajectory. The local coordinate system $(x, y, z)$ is sliding along the data frame coordinate system $(X, Y, Z)$. The point $A_{E}\left(\Delta x_{E}, \Delta y_{E}\right.$, $H+\Delta z_{E}$ ) corresponds to the actual position on the real trajectory; the vector $\overrightarrow{\mathbf{r}}_{E}=\left(\Delta x_{E}, \Delta y_{E}, \Delta z_{E}\right)$ describes trajectory deviations. Despite the along-track error compensation by interpolation, some small along-track errors $\Delta x_{E}$ can still be presented.

The coordinates of the point $P\left(x_{R}, y_{R}, o\right)$ (Fig. 2) located on the Doppler centroid line at range $R$ are

$$
\begin{gather*}
x_{R}=H \tan \alpha \cos \beta+\sin \beta \sqrt{R^{2}-H^{2}-(H \tan \alpha)^{2}}  \tag{1}\\
y_{R}=-H \tan \alpha \sin \beta+\cos \beta \sqrt{R^{2}-H^{2}-(H \tan \alpha)^{2}} \tag{2}
\end{gather*}
$$

Here $\alpha$ and $\beta$ are the reference antenna beam pitch and yaw angles. The pitch angle $\alpha$ is the angle between the nadir direction $A O$ and the perpendicular line $A B$ plotted to the Doppler centroid line $C P$, which is the intersection of the ground plane and the elevation plane of the antenna beam pattern. The yaw angle $\beta$ is the angle between the Doppler centroid line $C P$ and the $y$-axis.

The slant range error for the synthetic beam directed to the point $P\left(x_{R}, y_{R}, o\right)$ is calculated as

$$
\begin{gather*}
\Delta R_{E}\left(x_{R}, y_{R}\right)=R_{E}\left(x_{R}, y_{R}\right)-R,  \tag{3}\\
R_{E}\left(x_{R}, y_{R}\right)=\sqrt{\left(\Delta x_{E}-x_{R}\right)^{2}+\left(\Delta y_{E}-y_{R}\right)^{2}+\left(H+\Delta z_{E}\right)^{2}} . \tag{4}
\end{gather*}
$$



Fig. 2. Slant range MOCO.

The corresponding range migration error is compensated by interpolation in the range direction. The corresponding phase error

$$
\begin{equation*}
\varphi_{E}\left(x_{R}, y_{R}\right)=-\frac{4 \pi}{\lambda} \Delta R_{E}\left(x_{R}, y_{R}\right) \tag{5}
\end{equation*}
$$

is compensated by complex conjugate multiplication.
The motion error correction should not interfere with the range and azimuth compressions. Any range-dependent motion compensation cannot be applied before the range compression ( $\mathrm{RC} \mathrm{)} \mathrm{of} \mathrm{the} \mathrm{received} \mathrm{radar} \mathrm{pulses}. \mathrm{Otherwise}$, the range linear frequency modulation (LFM) waveform of the radar pulses will be distorted. Moreover, the rangedependent compensation cannot be applied before the range migration correction step of the SAR processing algorithm. Otherwise, different corrections applied for the neighbor range bins will introduce phase errors in the azimuth direction after the range migration correction.

To cope with the above problems, the motion compensation procedure for the range-Doppler algorithm (and similar fast Fourier transform (FFT)-based algorithms) [5] is usually divided into two steps [2]:

1. First-order range-independent motion compensation.
2. Second-order range-dependent motion compensation.

The first-order motion compensation includes the range delay of the received pulses (with interpolation) and the phase compensation, which are calculated for some reference range, for example, for the center range of the swath $R_{C}$,

$$
\begin{equation*}
\phi_{E}^{(I)}\left(R_{C}, t\right)=\exp \left[-i \frac{4 \pi}{\lambda} \Delta R_{E}^{(I)}\left(R_{C}, t\right)\right] . \tag{6}
\end{equation*}
$$

Here $t$ is the flight time. The first-order motion compensation can be incorporated into the RC step but it should be performed before any processing step in the azimuth, in particular, before the range migration correction in the range-Doppler algorithm.

The second-order range-dependent motion compensation is performed after the RC and the range migration correction steps,

$$
\begin{align*}
\Delta R_{E}^{(I I)}(R, t) & =\Delta R_{E}(R, t)-\Delta R_{E}^{(I)}\left(R_{C}, t\right),  \tag{7}\\
\phi_{E}^{(I I)}(R, t) & =\exp \left[-i \frac{4 \pi}{\lambda} \Delta R_{E}^{(I I)}(R, t)\right] \tag{8}
\end{align*}
$$

It includes the phase compensation and may include the range interpolation if necessary.

Since the motion errors depend on time, the data after the range migration correction should be transformed from the range-Doppler domain back to the time domain to apply the second-order motion error correction and then again to the range-Doppler domain to perform the azimuth compression.

After the MOCO, the data seem to be collected from the reference straight line trajectory, and the range-Doppler processing is performed by using the reference parameters of the data frame.

## II．LロCAL－QUADRATIC MAP－DRIFT AUTロFロCபS

In this paper，an efficient autofocusing technique is described for the estimation of the residual trajectory deviations directly from the SAR data．The method is called the LQMDA．The idea of the method consists of estimating the local quadratic phase errors on small time intervals using the well－known map－drift principle［2，4］．It has been shown that the local quadratic phase errors are related to the cross－track compo－ nents of the aircraft acceleration．The range dependence of the phase errors is essentially used in the algorithm to resolve the vertical and horizontal acceleration components． The uncompensated trajectory deviations for the whole data frame are then derived by double integration of the evaluated acceleration．Below，the LQMDA method is described in detail．

The SAR image formed from the data collected on a short time interval shows the part of the scene illuminated by the real antenna beam during this short time．For autofocusing， the duration of the short time intervals $T_{S}$ is assumed to be much smaller than the time required for the target to cross the real antenna footprint．In this case，the illuminated part of the scene is approximately equal to the antenna footprint area．For example，for the azimuth antenna beam width $\theta_{A}=10^{\circ}$ ，the antenna footprint on the ground at a slant range $R=4 \mathrm{~km}$ is $L_{A} \approx R \theta_{A} \approx 700 \mathrm{~m}$ ．The synthetic aperture length required to achieve a moderate azimuth resolution $\rho=$ 3 m is only $L_{S} \approx K_{w} \lambda R /(2 \rho) \approx 26 \mathrm{~m}$（for $\lambda=3 \mathrm{~cm}$ and the weighting window coefficient $K_{w}=1.3$ ）that is indeed a small fraction of the antenna footprint size．

Assuming that the intervals are short enough，the residual phase error function within each interval can be approximated by the second－order polynomial：

$$
\begin{equation*}
\phi_{E}\left(R, t_{n}+\tau\right) \approx \phi_{E}\left(R, t_{n}\right)+\phi_{E}^{\prime}\left(R, t_{n}\right) \tau+\phi_{E}^{\prime \prime}\left(R, t_{n}\right) \tau^{2} / 2 \tag{9}
\end{equation*}
$$

The variable $\tau$ represents the time within the short interval $-T_{S} / 2<\tau<T_{S} / 2$ ．The described local representation can be efficiently used for the estimation of an arbitrary residual phase error function．We propose to estimate the local quad－ ratic phase error coefficients $\varphi_{E}^{\prime \prime}\left(R, t_{n}\right)$ on each short interval separately by using the map－drift principle．According to this autofocus technique，the short processing interval is divided into two parts，and two SAR images are built．The presence of the quadratic error shifts the images in the azimuth in the opposite directions by $\Delta t_{\max }=\Delta x_{\max } / V, V$ is the aircraft velocity．The shift can be measured from the pos－ ition of the maximum of the correlation function of two images．The local quadratic phase error coefficient is given by

$$
\phi_{E}^{\prime \prime}\left(R, t_{n}\right)=2 \pi F_{D R}^{E}\left(R, t_{n}\right)=2 \pi F_{D R}(R) \Delta t_{\max } /\left(T_{S} / 2\right)
$$

where $F_{D R}$ is the Doppler rate of the SAR matched filter．
Thus，by using the map－drift principle，the local quadratic phase error coefficient $\varphi_{E}^{\prime \prime}\left(R, t_{n}\right)$ can be estimated．The con－ stant term $\varphi_{E}\left(R, t_{n}\right)$ does not affect the estimation and can be omitted，as well as the linear term $\varphi_{E}^{\prime}\left(R, t_{n}\right) \tau$ that only shifts the two SAR images in the azimuth in the same direc－ tion．So，we can estimate the samples of the second derivative
of the error function and then reconstruct the error function by double integration．

On the one hand，the length of the short intervals should be chosen to provide a sufficient precision of the parabolic phase error approximation．On the other hand，the length should be increased iteratively up to the length of synthesis required to achieve the desired high azimuth resolution on the final SAR image．

In order to reduce the number of computations，the dechirp method $[3,4]$ can be used for the SAR image forma－ tion on the short time intervals．According to this technique， the pair of images can be obtained as follows：

$$
\begin{gathered}
I_{1}(f)=\frac{2}{T_{S}} \int_{-T_{S} / 2}^{0} w_{S}\left(\tau+T_{S} / 4\right) s(\tau) h^{*}(\tau) \exp [-2 \pi i f \tau] d \tau \\
I_{2}(f)=\frac{2}{T_{S}} \int_{0}^{T_{S} / 2} w_{S}\left(\tau-T_{S} / 4\right) s(\tau) h^{*}(\tau) \exp [-2 \pi i f \tau] d \tau
\end{gathered}
$$

Here $w_{S}(\tau)$ is the weighting window．The reference func－ tion $h(t)$ is given by

$$
\begin{equation*}
h(t)=\exp \left[2 \pi i\left(F_{D C} t+F_{D R} t^{2} / 2\right)\right] \tag{13}
\end{equation*}
$$

where $F_{D C}$ and $F_{D R}$ are the known Doppler centroid and Doppler rate．The spatial frequency $f$ is related to the azimuth time as $f=F_{D R} t$ ．Due to the dechirp processing （11）and（12），one can form the SAR image from each half－ interval by using a single short Fourier transform．

In the presence of a local quadratic phase error，the SAR images will be defocused and shifted in the azimuth in the opposite directions．The shift is described by the following equation：

$$
\begin{equation*}
\Delta f_{\max }=f_{1 \max }-f_{2 \max }=F_{D R}^{E} T_{S} / 2 \tag{14}
\end{equation*}
$$

The common way to measure the shift is to calculate the cross－ correlation function of the pair of SAR images．For a particu－ lar range gate，it is determined as

$$
\begin{equation*}
R_{C C}(R, \Delta f)=\int\left|I_{1}(R, f)\right|^{2}\left|I_{2}(R, f+\Delta f)\right|^{2} d f \tag{15}
\end{equation*}
$$

One should note that the efficiency of such measurement sig－ nificantly depends on the images content．In particular，the low image contrast can lead to inaccurate estimation of the peak position．In order to improve the estimation quality， several pre－processing steps should be performed．At first， the images are recalculated into a logarithmic scale and the dynamic range is narrowed．It allows balancing the contribu－ tions from bright and dark image features．After that，the local centering is performed，enhancing the local contrast of image details and significantly narrowing the correlation peaks．The image pre－processing significantly improves the precision of the peak position estimation．

The problem is that the motion errors in the data are range dependent．It means that the phase error functions have to be estimated for each range gate．In order to take into account the range dependence，we propose to estimate the cross－track components of the aircraft acceleration，$a_{Y}\left(t_{n}\right)$ and $a_{Z}\left(t_{n}\right)$ ， which are responsible for the local quadratic phase errors
and related to the estimated values $\varphi_{E}^{\prime \prime}\left(R, t_{n}\right)$. We expect that the along-track component of the acceleration is measured by the SAR navigation system more accurately than the crosstrack components. Therefore, the residual (uncompensated) along-track acceleration $a_{X}\left(t_{n}\right)$ is assumed to be negligibly small compared with the cross-track ones. The details of the approach are as follows.

Let us approximate the aircraft trajectory on a short time interval as

$$
\begin{equation*}
\overrightarrow{\mathbf{r}}_{A}\left(t_{n}, \tau\right)=\overrightarrow{\mathbf{H}}+\overrightarrow{\mathbf{V}}\left(t_{n}\right) \tau+\overrightarrow{\mathbf{r}}_{E}\left(t_{n}, \tau\right) \tag{16}
\end{equation*}
$$

$$
\begin{equation*}
\overrightarrow{\mathbf{r}}_{E}\left(t_{n}, \tau\right) \approx \overrightarrow{\mathbf{r}}\left(t_{n}\right)+\overrightarrow{\mathbf{v}}\left(t_{n}\right)\left(t_{n}+\tau\right)+\overrightarrow{\mathbf{a}}\left(t_{n}\right)\left(t_{n}+\tau\right)^{2} / 2 \tag{17}
\end{equation*}
$$

Here $\overrightarrow{\mathbf{r}}_{E}\left(t_{n}, \tau\right)$ represents the residual trajectory deviations; $\overrightarrow{\mathbf{H}}=(\mathrm{o}, \mathrm{o}, H)$ and $\overrightarrow{\mathbf{V}}=(V, \mathrm{o}, \mathrm{o})$ are the reference flight altitude and velocity vectors. The Doppler rate of the backscattered signal under such motion, assuming that


Fig. 3. LQMDA incorporated within the framework of the range-Doppler algorithm.

$$
\begin{align*}
& \left|\overrightarrow{\mathbf{r}}_{E}\left(t_{n}\right)\right| \ll R, \text { is } \\
& F_{D R}\left(R, t_{n}\right) \approx \\
& \quad-\frac{2}{\lambda}\left[\frac{1}{R}\left(\left|\overrightarrow{\mathbf{V}}+\overrightarrow{\mathbf{v}}\left(t_{n}\right)\right|^{2}-\left(\frac{\overrightarrow{\mathbf{R}} \cdot\left(\overrightarrow{\mathbf{V}}+\overrightarrow{\mathbf{v}}\left(t_{n}\right)\right)}{R}\right)^{2}\right)-\frac{\overrightarrow{\mathbf{R}} \cdot \overrightarrow{\mathbf{a}}\left(t_{n}\right)}{R}\right], \tag{18}
\end{align*}
$$

where $\overrightarrow{\mathbf{R}}=\left(x_{R}, y_{R},-H\right)$ is the slant range vector.
The estimated local quadratic phase errors are related to the Doppler rate errors. The main contribution to these errors is introduced by the uncompensated cross-track acceleration:

$$
\begin{equation*}
F_{D R}^{E}\left(R, t_{n}\right) \approx \frac{2}{\lambda} \frac{\overrightarrow{\mathbf{R}} \cdot \overrightarrow{\mathbf{a}}\left(t_{n}\right)}{R} \approx \frac{2}{\lambda} \frac{y_{R} a_{Y}\left(t_{n}\right)-H a_{Z}\left(t_{n}\right)}{R} \tag{19}
\end{equation*}
$$

The uncompensated velocity $\overrightarrow{\mathbf{v}}\left(t_{n}\right)$ has a minor influence; it is accounted implicitly during iterations of the autofocus procedure. From the above formula one can easily write a system of linear equations that provide the mean-square-error


Fig. 4. Steps of the LQMDA.


Fig. 5. (a). A 25 -look 2 m resolution SAR image before autofocusing. (b). A 25 -look 2 m resolution SAR image after autofocusing.
(MSE) estimates for the acceleration components:

$$
\begin{align*}
& \operatorname{MSE}\left(a_{Y}\left(t_{n}\right), a_{Z}\left(t_{n}\right)\right)= \\
& \quad \sum_{m=1}^{M_{R}} w_{m}\left[\frac{2}{\lambda} \frac{y_{R_{m}} a_{Y}\left(t_{n}\right)-H a_{Z}\left(t_{n}\right)}{R_{m}}-F_{D R}^{E}\left(R_{m}, t_{n}\right)\right]^{2} \tag{20}
\end{align*}
$$

where $w_{m}$ are weighting coefficients which are determined as the values of the cross-correlation functions maxima. Such choice can be justified. The value of the cross-correlation peak is proportional to the image contrast. The higher the contrast of the range block the better is the estimation precision, and vice versa. Therefore, such weighting improves the overall performance of the MSE scheme and leads to a more precise cross-track acceleration evaluation.

The MSE estimator equations are

$$
\begin{align*}
& a_{Y}\left(t_{n}\right) \sum_{m=1}^{M_{R}} w_{m}\left(\frac{y_{R_{m}}}{R_{m}}\right)^{2}-a_{Z}\left(t_{n}\right) \sum_{m=1}^{M_{R}} w_{m}\left(\frac{y_{R_{m}}}{R_{m}} \frac{H}{R_{m}}\right)=  \tag{21}\\
& \quad \frac{\lambda}{2} \sum_{m=1}^{M_{R}} w_{m} F_{D R}^{E}\left(R_{m}, t_{n}\right) \frac{y_{R_{m}}}{R_{m}}, \\
& a_{Y}\left(t_{n}\right) \sum_{m=1}^{M_{R}} w_{m}\left(\frac{y_{R_{m}}}{R_{m}} \frac{H}{R_{m}}\right)-a_{Z}\left(t_{n}\right) \sum_{m=1}^{M_{R}} w_{m}\left(\frac{H}{R_{m}}\right)^{2}=  \tag{22}\\
& \quad \frac{\lambda}{2} \sum_{m=1}^{M_{R}} w_{m} F_{D R}^{E}\left(R_{m}, t_{n}\right) \frac{H}{R_{m}} .
\end{align*}
$$

By solving this system independently for each short time interval with the center at $t_{n}$, the sequence of the estimated
acceleration $a_{Y}\left(t_{n}\right), a_{Z}\left(t_{n}\right)$ is obtained. The residual trajectory deviations are calculated by double integration and used for the motion compensation.

The LQMDA technique can be easily incorporated into the conventional SAR processing algorithm such as the RDA, as illustrated in Fig. 3. At first, the received raw data are compressed in range and the first-order range-independent motion compensation is applied. The range-compressed data can be pre-filtered and decimated in the azimuth direction from a high PRF to a lower azimuth sampling frequency that corresponds to the Doppler bandwidth determined by the antenna beam width. Then, the range cell migration correction (RCMC) is performed in the range-Doppler domain. After that, the second-order rangedependent motion compensation is accomplished. For the first time, the motion compensation steps are based on the flight trajectory measured by the SAR navigation system. After these steps, the data is ready for the application of the LQMDA, which is intended to estimate the residual trajectory deviations.

The main steps of the LQMDA algorithm are illustrated in Fig. 4. The whole data frame after RC and RCMC is divided on short data blocks in the azimuth direction. Each data block is split into two halves and two SAR images for the MDA estimation are formed using the dechirp-based processing (11) and (12). From the image shifts (15), the local quadratic phase errors and the corresponding Doppler rate errors (14) are evaluated for each azimuth block for a set of range blocks. By using the described MSE fitting procedure (20)-(22), the cross-track accelerations are estimated. After that, by double integration, the residual trajectory deviations are derived for the whole processed data frame. Finally, the refined aircraft trajectory is
accounted by introducing corrections to the first- and second-order MOCO steps (see Fig. 3).

The described autofocusing procedure should be iterated several times for the best result. With the iterations, the aircraft trajectory is refined, and the motion compensation procedures are repeated, reducing the residual motion errors. Moreover, the length of the short intervals is enlarged (e.g. doubled) iteratively, increasing the resolution of the pair of SAR images and, consequently, improving the accuracy of the MDA estimation.

After the application of the LQMDA technique, the data is ready for the conventional multi-look synthesis in the range-Doppler domain (Fig. 3), producing the well-focused SAR image.

The described LQMDA technique has been realized as a post-processing procedure applied to the recorded SAR data. However, all computations can be efficiently optimized via parallel processing in azimuth, in range, in frequency. Therefore, the real-time implementation of the algorithm might be possible depending on the computation power of the data-processing hardware.

## IV. EXPERIMENTAL RESULTS

The developed LQMDA method has been successfully applied to radar data obtained with the airborne RIAN-SAR-X system [ 5,18 ]. A 25 -look SAR image with a 2 m resolution built without autofocusing is shown in Fig. 5(a). One can see that the image is significantly defocused. The well-focused SAR image built with the proposed LQMDA algorithm is shown in Fig. 5(b). The image shows significant improvement. One can now recognize lots of fine details, sharp edges, and readable radio-shadows. The provided example demonstrates the high efficiency of the LQMDA method.


Fig. 6. Fragment of the ground scene built with a set of different azimuth resolutions.


Fig. 7. Azimuth profiles of the point-like targets 1 and 2 (Fig. 6) built with a set of different azimuth resolutions of $0.5,1,2$, and 4 m .

The potential of the proposed LQMDA technique has also been demonstrated in the following way. A fragment of the ground scene indicated by a dash line in Figs 5(a) and 5(b) has been rebuilt with a set of different azimuth resolutions of $4,2,1$, and 0.5 m . The corresponding images are shown in Fig. 6. The number of looks is changed as $49,25,13$, and 7 , respectively, in accordance to the resolution to keep constant the multi-look processing interval. The images are given in the ground plane coordinates: the vertical direction is the ground range and the horizontal direction is the azimuth. The pixel size is $0.25 \times 0.25 \mathrm{~m}$. The ground range resolution is limited to 3 m in these images because of the 2 m slant range resolution of the SAR system. Going from 4 m to 2 m , and then to 1 m , and 0.5 m azimuth resolutions one can distinguish many point-like targets in the images. Two illustrative targets have been selected and labeled as 1 and 2 in Fig. 6. The azimuth profiles of these targets are shown in Figs 7(a) and 7 (b), respectively. The peak of the target 1 in Fig. 7(a) becomes narrower for a finer resolution as it is expected for a point target. The target 2 looks like a "point target" at the 4 m resolution, however, it is actually composed of five individual point scatterers as clearly resolved at the 0.5 m resolution, as shown in Fig. 7(b). This demonstration proves that the LQMDA technique does provide the accuracy of the trajectory estimation sufficient to achieve the azimuth resolution up to 0.5 m with seven looks.

## V. CロNCLUSIロN

The efficient LQMDA technique for airborne SAR systems has been developed and tested. The method estimates the crosstrack components of the aircraft acceleration locally on short time intervals. After that, the residual trajectory deviations for whole data frame are evaluated by double integration. The high efficiency of the method has been confirmed by processing the airborne SAR data. The method is especially useful for SAR systems operated from light-weight aircrafts.

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