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Trans. Nonferrous Met. Soc. China 21(2011) s499-s505

Transactions of Nonferrous Metals Society of China

www.tnmsc.cn

Precise point positioning and its application in mining deformation monitoring

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Received 19 June 2011; accepted 10 November 2011

Abstract: Precise point positioning (PPP)-based deformation monitoring scheme is presented for the use in mining deformation monitoring. Within the solutions of daily observation, outliers are detected and removed to avoid any potential misinterpretation of the results and then the deformation can be extracted by the coordinate differences between the two consecutive solutions. Meanwhile, because of the special location of a rover station in mining areas, the satellite geometry may be insufficient for a reasonable PPP solution, and the multipath impact an also be significant. Therefore, it is necessary to predict the satellite geometry before any daily observation. To evaluate the ability of extracting the deformation using the PPP-based method, various quality measures were introduced. The results of three datasets of the same station show that the precision of deformation monitored by PPP can reach up to cm level and even mm level.

Key words: precise point positioning; deformation monitoring; outlier identification; geometry; multipath

1 Introduction

Deformation monitoring is an important issue in many industry applications due to human life and production safety concerns. For example, rock deformation and landslide because of coal mining may lead to ground subsidence, resulting in the stoppage of the mining production, and the deformation of buildings may be a human safety concern. To predict and prevent these hazards, it is necessary to monitor the deformation by proper geometric surveying methods such as theodolite, leveling and GPS. Nowadays, GPS is the most common method for deformation monitoring because of its high efficiency, high precision and convenience in operations.

Relative GPS positioning based on baseline mode is able to achieve the precision of mm level using hourly GPS carrier phase observations under the beginning operation environment, and thus, it is widely used for establishing geodetic control networks [1]. Based on the same concept, rapid relative GPS positioning is used for daily observation of mining subsidence and its data processing strategy is investigated [2]. The commonly used rapid positioning method is GPS RTK, which can be used for various deformations monitoring such as deformation monitoring of mining area, subsidence of mining area, regional deformation monitoring of open pit mine [3-5]. Although RTK is convenient and feasible under some conditions, it requires the distance between the reference station and a rover station less than 10 km, or much shorter, if such RTK operations are close to the equatorial regions. At the same time, the rover station cannot receive the signals of the reference station under some situations due to the limitations of communication equipment/methods. continuously So. operating reference stations (CORS) or network RTK is developed instead of RTK [6], which satisfies the most requirements of deformation monitoring in a mining area, but it is not practical for the complex terrains, such as mountain areas, because it is difficult to set up the reference stations. Thus, PPP has the advantages for these situations because it has no range limitation and needs only one rover receiver.

2 Precise point positioning

After the end of selective availability (SA),

Foundation item: Projects (40904004, 41074010) supported by the National Natural Science Foundation of China; Project (BK2009099) supported by the Natural Science Fund of Jiangsu Province, China; Project supported by the Priority Academic Program Development of Jiangsu Higher Education Institutions, China; Projects (200802901516, 200802900501) supported by the Ph.D. Programs Foundation of Ministry of Education of China; Project supported by the Qing Lan Project of Jiangsu Province, China

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ionospheric delay is the largest error in GPS point positioning. Its first-order term can be eliminated by a linear combination of two GPS signal frequencies because ionosphere is a dispersive medium. According to this characteristic of ionosphere, ZUMBERGE et al [7] proposed a new iono-free combination model used in PPP which can achieve the precision of the centimeter grade with daily observations. WITCHAYANGKOON [8] and KOUBA and HÉROUX [9] presented the detailed modeling method and the corrections of various errors. In PPP, these errors include the special corrections for satellite orbit, satellite clock, solid earth tide, receiver antenna phase center compensation, satellite antenna phase center compensation, phase wind-up and relativistic effect. Most of the errors can be corrected by modeling except satellite orbit and clock, which are corrected by interpolating the precise ephemeris provided by IGS. In order to get the absolute coordinates with high precision in the international terrestrial reference frame (ITRF), it is necessary to add all these corrections. The flowchart of PPP is shown in Fig. 1.

The ionosphere-free combination model is expressed as

$$P_{\rm if} = \frac{f_1^2}{f_1^2 - f_2^2} P_1 - \frac{f_2^2}{f_1^2 - f_2^2} P_2$$

= $R + c(dt_r - dt_s) + d_{\rm trop} + M_{\rm p} + \varepsilon_{\rm p}$ (1)

$$\Phi_{\rm if} = \frac{f_1^2}{f_1^2 - f_2^2} \Phi_1 - \frac{f_2^2}{f_1^2 - f_2^2} \Phi_2
= R + c(dt_{\rm r} - dt_{\rm s}) + d_{\rm trop} + \lambda_{\rm if} N_{\rm if} + M_{\Phi} + \varepsilon_{\Phi}$$
(2)

where $\rho_{\rm if}$ and $\Phi_{\rm if}$ are the ionosphere-free pseudorange

and carrier phase, respectively; P_1 , P_2 , Φ_1 and Φ_2 are the pseudorange and carrier phases with the frequency of f_1 and f_2 , respectively; R is the geometrical distance between GPS satellites and the rover receiver; c is the speed of light in vacuum; dt_r and dt_s are the receiver clock and satellite clock, respectively; d_{trop} is the tropospheric delay; M_p and M_{Φ} are the sum of other errors in pseudorange and carrier phase, respectively; ε_p and ε_{Φ} are the noises of pseudorange and carrier phase, respectively; λ_{if} and N_{if} are the ionosphere-free wavelength and ambiguities, respectively; N_1 and N_2 are the ambiguities with wavelength of λ_1 and λ_2 , respectively.

$$\lambda_{\rm if} = \frac{f_1^2}{f_1^2 - f_2^2} \lambda_1 - \frac{f_2^2}{f_1^2 - f_2^2} \lambda_2 \tag{3}$$

$$N_{\rm if} = \frac{f_1^2}{f_1^2 - f_2^2} N_1 - \frac{f_2^2}{f_1^2 - f_2^2} N_2 \tag{4}$$

Receiver coordinates, receiver clock, tropospheric delay and float iono-free ambiguities are estimated using Kalman filter. The observation model can be obtained through extending the above equation into the so-called Taylor series and then expressed as:

$$\boldsymbol{z}_k = \boldsymbol{H}_k \boldsymbol{x}_k + \boldsymbol{\varepsilon}_k \tag{5}$$

where z_k is the misclosure between observed and computed distance between GPS satellites and the rover receiver; H_k is the coefficient matrix; x_k is the estimated parameter ε_k is the observation noise and its covariance matrix is R_k .

According to the dynamic characteristic, the discrete



Fig. 1 Flowchart of PPP

linear dynamic model can be expressed as

$$\boldsymbol{x}_{k} = \boldsymbol{\varphi}_{k} \boldsymbol{x}_{k-1} + \boldsymbol{\tau}_{k} \tag{6}$$

where $\boldsymbol{\Phi}_k$ is the transition matrix; $\boldsymbol{\tau}_k$ is the process noise, and its the covariance matrix is Q_k .

The Kalman estimation equations are [10–12]

$$\boldsymbol{P}_{k}^{-} = \boldsymbol{\Phi}_{k} \boldsymbol{P}_{k-1} \boldsymbol{\Phi}_{k}^{\mathrm{T}} + \boldsymbol{Q}_{k}$$

$$\tag{7}$$

$$\boldsymbol{x}_{k}^{-} = \boldsymbol{\varPhi}_{k} \boldsymbol{x}_{k-1} \tag{8}$$

$$\boldsymbol{K}_{k} = \boldsymbol{P}_{k}^{-} \boldsymbol{H}_{k}^{\mathrm{T}} (\boldsymbol{H}_{k} \boldsymbol{P}_{k}^{-} \boldsymbol{H}_{k}^{\mathrm{T}} + \boldsymbol{R}_{k})^{-1}$$
(9)

$$\boldsymbol{x}_k = \boldsymbol{x}_k^- + \boldsymbol{K}_k \boldsymbol{d}_k \tag{10}$$

$$\boldsymbol{P}_{k} = (\boldsymbol{I} - \boldsymbol{K}_{k} \boldsymbol{H}_{k}) \boldsymbol{P}_{k}^{-} (\boldsymbol{I} - \boldsymbol{K}_{k} \boldsymbol{H}_{k})^{\mathrm{T}} + \boldsymbol{K}_{k} \boldsymbol{R}_{k} \boldsymbol{K}_{k}^{\mathrm{T}}$$
(11)

$$\boldsymbol{d}_{k} = \boldsymbol{z}_{k} - \boldsymbol{H}_{k} \boldsymbol{x}_{k}^{-} \tag{12}$$

$$\boldsymbol{Q}_{\boldsymbol{d}_{k}} = \boldsymbol{R}_{k} + \boldsymbol{H}_{k} \boldsymbol{P}_{k}^{-} \boldsymbol{H}_{k}^{\mathrm{T}}$$
(13)

where K_k is the grain matrix; x_k is the state estimates including receiver coordinates, receiver clocks, tropospheric delay and ambiguities; P_k is the covariance matrix of x_k and Q_{d_k} is the covariance matrix of innovation.

2.1 Outlier identification

To correctly extract the deformation, the model is assumed as a linear model with no outliers. However, the observations may be contaminated by outliers due to various reasons, such as cycle slips in carrier phase observations. If the outliers are not excluded, the monitoring results may be mis-interpreted. Although the ground deformation can be appropriately predicted, the practical deformation of each point is unpredicted and the size is uncertain. Therefore, outliers must be identified and excluded because the biases resulting from outliers may be considered deformation.

Most outlier detection methods are based on the residuals from the least squares or the predicted residuals of Kalman filter, which partially reflect the outliers. Under some conditions, the largest residual term does not indicate the location of an outlier. According to the mean shift model, the statistic based on the estimated outlier can be constructed and used for correlated and uncorrelated observations. Instead of the predicted residuals, the Kalman filter residuals are more efficient for outlier identification. So the statistic test is [11, 13]

$$w_i = \frac{\boldsymbol{e}_i^T \boldsymbol{Q}_{\boldsymbol{d}_k}^{-1} \boldsymbol{d}_k}{\sigma_0 \sqrt{\boldsymbol{e}_i^T \boldsymbol{Q}_{\boldsymbol{d}_k}^{-1} \boldsymbol{e}_i}} \tag{14}$$

where e_i is a vector which is equal to 1 for the *i*th element and equal to 0 for the others; σ_0 is the priori standard deviation. This procedure is designed to detect

single outlier, and a multiple outlier detection procedure is discussed in Ref. [14].

2.2 Effects of outliers on state estimates

The effects of outliers on the state estimates are essentially dependent on the redundancy and geometry of the observation system. External reliability describes the effects of undetectable outliers on estimator. It is defined as [11, 15]

$$\nabla_{x} = \boldsymbol{P}_{k}^{-} \boldsymbol{H}_{k}^{\mathrm{T}} \boldsymbol{Q}_{d_{k}}^{-1} \boldsymbol{e}_{i} \frac{\sigma_{0} \delta(s)}{\sqrt{\boldsymbol{e}_{i}^{\mathrm{T}} \boldsymbol{Q}_{d_{k}}^{-1} \boldsymbol{e}_{i}}}$$
(15)

where $\delta(s)$ is the noncentrality parameter which depends on the given false alarm rate and the detectability.

3 Schemes for deformation monitoring

The deformation can be calculated by the difference between the two periods of the same points.

$$\mathrm{d}X = X_i - X_{i-1} \tag{16}$$

where $X_i = [x_i \ y_i \ z_i]$ is the 3D coordinates of the point, $dX = [dx \ dy \ dz]$ is the deformation in three directions.

Deformation includes horizontal deformation and vertical subsidence. Normally, vertical subsidence analysis is almost always based on the normal height system, while the height obtained by PPP is the geodetic height system. To obtain the normal height of daily observation, it is necessary to establish regional height anomaly model through fitting the geodetic height and the normal height of common points, and then the normal height of daily observations can be calculated. Finally, vertical subsidence can be obtained through Eq. (16). The whole scheme is shown in Fig. 2.

Before the monitoring points are observed by GPS,



Fig. 2 Vertical subsidence monitoring based on PPP

it is necessary to predict/select good dilution of precision/geometry to ensure that PPP solutions can achieve a sufficient accuracy. Meanwhile, multipath is considered the random noise in PPP. However, it should be corrected in some areas such as mountain areas. The monitoring stations may be located at the bottom of the valley where the slope and the vegetation on the slope reflect the signals from satellites into the receiver. The interference of reflected signals against the direct signals results in the biases in the PPP solutions. Moreover, although the multipath of each carrier can be considered random noise, the multipath of iono-free combination may become significant.

The precision of the positioning solutions can be evaluated through a given confidence level. Under the given confidence level, various indexes are introduced to evaluate the ability of deformation identification and the solution precision. Because the deformation includes vertical, horizontal and three-dimensional deformation, various quality measures such as horizontal root mean square (HRMS), vertical RMS (VRMS), circle error

> 00 (a) 330 30 15 30 60 300 60 270 90 Elevation 24(120 210 150 180 Azimuth

Fig. 3 Skyplots of satellites in 2008 (a) and 2010 (b)



Fig. 4 Multipath of P code in L1 (a) and L2 (b) carriers

probability (CEP), spherical error probable (SEP) and horizontal error ellipse (HEE) are used.

4 Results and discussion

Three periods of one hour data from the BJFS station provided by the International GNSS Services (IGS) were collected for deformation analysis. The time of the collected data was the March 7th of 2008, 2009 and 2010, respectively. Due to the effects of elevation on the precision of the observations, elevation-dependent weighting is used. The interval of data is 30 s and their satellite position and clock are interpolated using the IGS precise ephemeris with precise orbit at 15 min interval and precise satellite at 30 s interval. All the other errors are corrected by modeling. The elevation mask angle is set to 15° and there are 8 or 9 available satellites (Figs. 3(a) and (b)).

The data collected in 2010 was used as an example for multipath analysis. The multipath of P code in L1 and L2 carriers are both less than 3 m (Figs. 4(a) and (b)) and



the amplitude of innovation or residuals of Kalman filter is about 3 m (Fig. 5). The multipath of both carriers is less than the amplitude of innovation or residuals and can be considered random noise. However, the linear combination of the multipath is individually up to 8 m and about 4 m some times (Fig. 6). If it is considered random noise, the estimated states are significantly biased. Moreover, the interference of the reflected signals may be more serious in some harsh environment.

The w test is used for outlier identification. If the largest w test statistic is larger than the critical value, the observation is considered a contaminated observation.



Fig. 5 Residual (a) and innovation (b) of pseudorange



Fig. 6 Multipath of iono-free combination

Table 1 Ability of deformation identification (Unit: cm)

The critical value can be calculated by the given confidence level. For example, the value is 3.29 at the confidence level of 99.9% (Fig. 7). With the convergence of the solution, the effects of the estimated outliers are convergent to mm level after the convergence. The solution is re-converged during the convergent periods and remains the same after the convergence if the number of satellites increases (Fig. 8).

The convergence time is between 10 and 30 min and the precision reaches up to cm level compared with the ground truth value from the scripps orbit and



Fig. 7 *w* test for observations





Year	HRMS	VRMS	CEP		SEP		HEE	
			50%	99%	50%	99%	Major	Minor
2008	1.8	0.3	2.1	5.3	1.4	3.1	2.5	0.5
2009	1.5	1.4	1.5	3.8	1.7	3.7	2.5	0.5
2010	0.8	0.3	1.0	2.5	0.7	1.6	1.2	0.5



Fig. 9 Estimated coordinate for 2008 (a), 2009 (b) and 2010(c) dataset

permanent array center SOPAC (Fig. 9), so the epoches after half an hour were used for evaluating the ability of deformation monitoring. If PPP is used for vertical monitoring, the vertical RMS is below 2 cm, so is the horizontal RMS (Table 1). RMS describes the fluctuation of estimator in terms of the mean value. The minimum detectable deformation is 2 cm for both horizontal and vertical direction in statistic. To find the direction and its value with the second minimum detectable deformation, HEE is introduced. The second minimum detectable deformation is 2.5 cm and its direction is the semi-major axis of the ellipse given in Fig. 10. Similarly, the smallest ones are 0.5 cm and its direction is the semi-minor axis of the ellipse. CEP and SEP give the probability of the horizontal and the three-dimensional error, respectively. At the conference level of 99%, the radii of the circle are about 5 and 4 cm in horizontal and three-dimensional directions, respectively.

The coordinates from the SOPAC are considered the ground truth value and the computed coordinates are compared with such true values. There are some biases between them (Fig. 9). Although there are biases in the y direction and z direction, the difference between the two different periods is the same as the true deformation in the y and z directions (Table 2). However, because the biases in the x direction change with time, there are biases between the estimated and true deformation.



Fig. 10 Horizontal Error Ellipse

Table 2 Comparison of estimated and true difference from SOPAC between two years (Unit: m)

Voor	<i>x</i>		у		Z	
Teal	Estimated	SOPAC	Estimated	SOPAC	Estimated	SOPAC
2009-2008	-0.017	-0.031	-0.005	-0.006	-0.006	-0.007
2010-2009	-0.010	-0.031	-0.006	-0.006	-0.011	-0.007
2010-2008	-0.027	-0.062	-0.011	-0.011	-0.017	-0.013

5 Conclusions

1) It is necessary to select the observation time before daily observation to ensure the satellite geometry and choose the environment as good as possible due to the special location of the rover station in mining areas. Meanwhile, multipath should be considered when PPP is used for mining deformation monitoring.

2) The outlier detection procedure ensures that there is no effect of an outlier on the solution and the effects of the undetectable bias are at mm level after convergence.

3) Various quality measures show that the precision of deformation monitoring can reach up to cm level and even mm level when PPP is used.

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(Edited by FANG Jing-hua)