



## Abstract

Interferometric Synthetic Aperture Radar (InSAR) has shown unique capabilities in numerous applications for deformation monitoring. However, InSAR will lose effectiveness with large-gradient deformation due to the limitation of maximum detectable phase gradient and the phase unwrapping step of InSAR. Coalfield is the exact object providing such challenges for InSAR technique. Strong mining activities often induces large scale non-linear deformation with large gradient. This paper integrates offset tracking technique based on Corner Reflector (CR) and InSAR to overcome relevant problems. By applying offset tracking to high resolution TerraSAR-X intensity images, the coarse estimation of large deformation was obtained and extracted, allowing the following InSAR processing to carry out phase unwrapping correctly. Finally, the fine estimation of deformation was done by the Persistent Scatterer InSAR (PSI) technique. The detected deformation time series indicated good root-mean-square errors (RMSE), validated by GPS in situ investigation. All InSAR data were processed in the open source software StaMPS and one in-house InSAR package.

## 1 Introduction

Interferometric Synthetic Aperture Radar (InSAR) measures the phase differences between two or more SAR images over vast areas with high accuracy (Bamler and Hartl, 1998; Massonnet et al., 1993). In the past 10 years, various advanced InSAR techniques have been developed in order to detect slow deformation over a long time span or sudden displacements due to earthquakes and so on (Berardino et al., 2002; Lanari et al., 2004; Lu et al., 2004; Hooper et al., 2004; Kampes and Usai, 1999; Bechor, 2006; Li et al., 2011; Zhu and Bamler, 2010; Bachofer et al., 2014). The well-known methods Persistent Scatterers Interferometry (PSI) and Stanford Method for Persistent Scatterer (StaMPS), which perform analysis of “persistent scatterer” pixels on a succession of time-ordered images have been employed in different fields, both

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construction of displacement and extraction before unwrapping phase was performed quite well in Tehran Basin (Sadeghi et al., 2013). Unfortunately, this works only when linear deformation component dominates in the InSAR phases. Some important work with regard to precise analysis of offset tracking integrated with SBAS analysis have been addressed successfully (Casu et al., 2011; Manconi and Casu, 2012). The so-called Pixel Offset (PO)-SBAS technique and relevant applications to volcanos have indicated a more correct evaluation than other techniques of mapping large deformation on the ground by satellite SAR (Manconi and Casu, 2012). Moreover, research about rapid measurements of landslides by PO approach was also well presented, which pointed out an exciting possibility for Earth hazards early warning system (Manconi et al., 2014).

In this paper, we proposed a StaMPS/InSAR approach integrated with offset tracking method by means of Corner Reflectors (CR). On one hand, considering that SAR sensors with short wavelength could decrease the maximum Detectable Deformation Gradient (DDG), it may be concluded that SAR images with long wavelength are more suitable for large-gradient deformation monitoring using phase measurements. In another respect, DDG might be increased by using high resolution SAR data through the much smaller pixel size. Moreover, TerraSAR-X has a much shorter revisit cycle (11 days or even shorter) than other SAR sensors, which dramatically increases the sampling rate of deformation monitoring. In this study, the approach was applied to a coal mining area by using the high resolution TerraSAR-X images and two time series of large-gradient and nonlinear deformation induced by mining excavation were extracted with centimetre-level precision validated by in situ investigation.

## 2 Methodology

Offset tracking deals with offsets of two SAR images and detects the pixel change in both range and azimuth directions when the normalized cross-correlation is performed on each pixel by using a moving window (Strozzi et al., 2002). For co-registration of



displacement model and thus is advantageous in terms of utilizing in monitoring natural phenomena. The topographic corrected phases of each reselected PS points are composed with several terms:

$$\psi_{\text{corrected}}^i(k) = W \left\{ \phi_{\text{def}}^i(k) + \phi_{\text{atm}}^i(k) + \phi_{\text{orb}}^i(k) + \phi_{\text{noise}}^i(k) \right\}. \quad (3)$$

5  $W\{\cdot\}$  is the wrapping operator,  $\psi_{\text{corrected}}$  means the wrapped topographic corrected phase.  $\phi_{\text{def}}$  means the deformation phase term,  $\phi_{\text{atm}}$  means the phase contributed to atmospheric effect,  $\phi_{\text{orb}}$  denotes the phase component that results in inaccurate orbital data, while  $\phi_{\text{noise}}$  represents the phase contribution generated from other noise terms. In the following step, the first estimation of deformation phase component is extracted from the topographic phase:

$$\begin{aligned} \psi_{\text{res}}^i(k) &= W \left\{ \psi_{\text{corrected}}^i(k) - \phi_{\text{def},0}^i(k) \right\} \\ &= W \left\{ \phi_{\text{def}}^i(k) - \phi_{\text{def},0}^i(k) + \phi_{\text{atm}}^i(k) + \phi_{\text{orb}}^i(k) + \phi_{\text{noise}}^i(k) \right\}. \end{aligned} \quad (4)$$

15 As long as the major part of deformation phase is extracted, the wrapped residual phase can be successfully unwrapped in spatial and temporal domains. Then, the coarse estimation of deformation phase is added back on the unwrapped residual phase to get the unwrapped topographic corrected phase  $\phi_{\text{res}}^i(k)$ :

$$\phi_{\text{corrected}}^i = \phi_{\text{res}}^i(k) + \phi_{\text{def},0}^i(k) = \phi_{\text{def}}^i(k) + \phi_{\text{atm}}^i(k) + \phi_{\text{orb}}^i(k) + \phi_{\text{noise}}^i(k). \quad (5)$$

20 In order to reconstruct the deformation series from the unwrapped topographic corrected phase, temporal and spatial domain filtering, using window 7 and 16 respectively were conducted. Since the atmosphere phase has the property of high-frequency in time and low-frequency in space, such filtering can estimate atmosphere phase. Subtracting this component from Eq. (5) leaves just  $\phi_{\text{def}}^i$  and spatially uncorrelated error terms which can be modeled as noise. Using the separated  $\phi_{\text{def}}^i$ , the deformation series can be generated.

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### 3 Experiment area and SAR data

The Area Of Interest (AOI) of this study is located in Xishan coal mine, Gujiao city, Shanxi Province of China (Fig. 1b). It is the second largest coking coal mine of the world. Most of this area has large mountains with steep slopes and ravines which are mainly composed of Carboniferous, Permian sandstone, shale and Quaternary loess (Liu et al., 2013, 2014).

This area is full of trees, grasses and bushes which might bring a lot of coherence loss to InSAR observation. Heavy underground mining excavation is quite common in this coalfield inducing lots of surface deformation. According to previous study, the maximum subsidence can reach to meters in months.

Since the algorithm of offset estimation in this study is based on the intensity cross-correlation algorithm, the quality of SAR backscatter intensity images is the primary issue we have to take into account. Metallic trihedral corner reflectors with 1 m right-angle side were employed here because of its accurate measurement of backscatter coefficients along with GPS surveying (Fig. 1c and d) (Liu et al., 2014, 2013; Ye et al., 2004). Both the offset tracking and PSI are carried out on CR points and other PS candidates rather than on the whole image.

A total of 21 X-band TerraSAR-X images in strip map mode were acquired in 2012 for this study (Table 1). Most perpendicular baselines were between 3 m and 150 m, which mean they are obviously beneficial for deformation monitoring. A steep incidence angle of  $26^\circ$  was used to avoid strong shadow effects in this mountainous area.

### 4 Results and analysis

As discussed previously, the full definition of the DDG in terms of the coherence value is defined by the wavelength and the pixel size (Baran et al., 2005). It is naturally obvious to use small looks for mapping large-gradient deformation field. Therefore, the multilook

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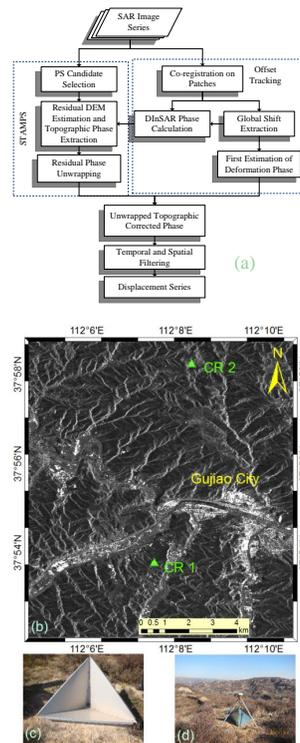
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**Table 2.** RMSE of different approaches comparing to GPS observation.

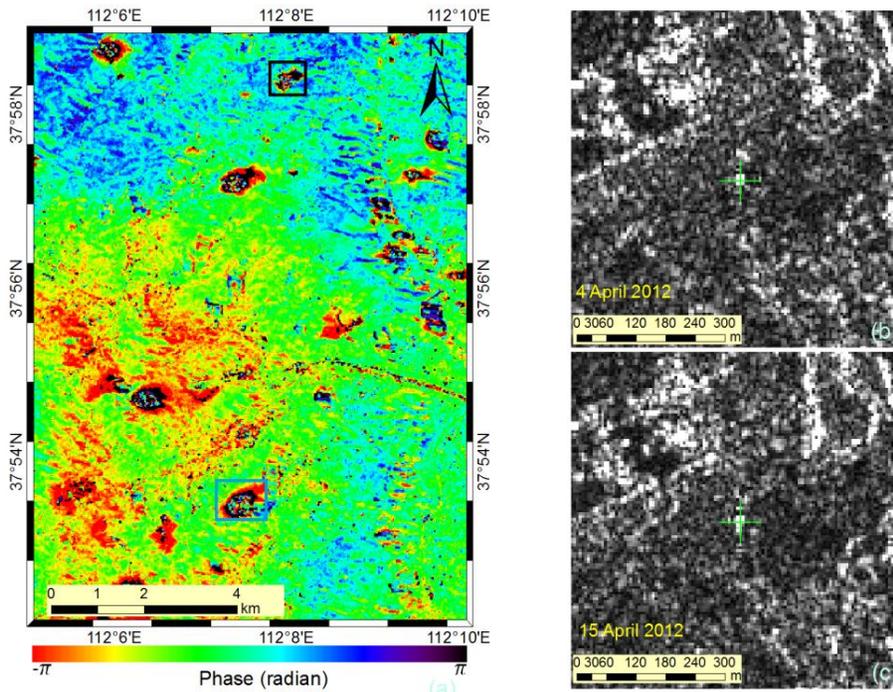
	Integrated InSAR	InSAR	Offset tracking
CR 1	0.069	1.62	0.169
CR 2	0.032	1.77	0.109

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**Figure 1.** (a) Flow chart of the proposed approach presenting the integration of StaMPS and offset tracking; (b) the study area shown on a TerraSAR-X amplitude image, taken on 15 April 2012. Approximate location of two Corner Reflectors (CR) presented by green triangles; (c, d) photos of CR and relevant GPS survey at this coalfield.



**Figure 2.** (a) Wrapped interferogram of AOI generated by TerraSAR-X images taken on 4 April 2012 and 15 April 2012, where the CR1 and CR2 locate in blue rectangle and dark rectangle, respectively; (b, c) a part of AOI taken from the blue rectangle area in (a). The green cross locates CR1 on SAR intensity images taken on 4 April 2012 and 15 April 2012, respectively. The offset is then calculated to be 14 cm.

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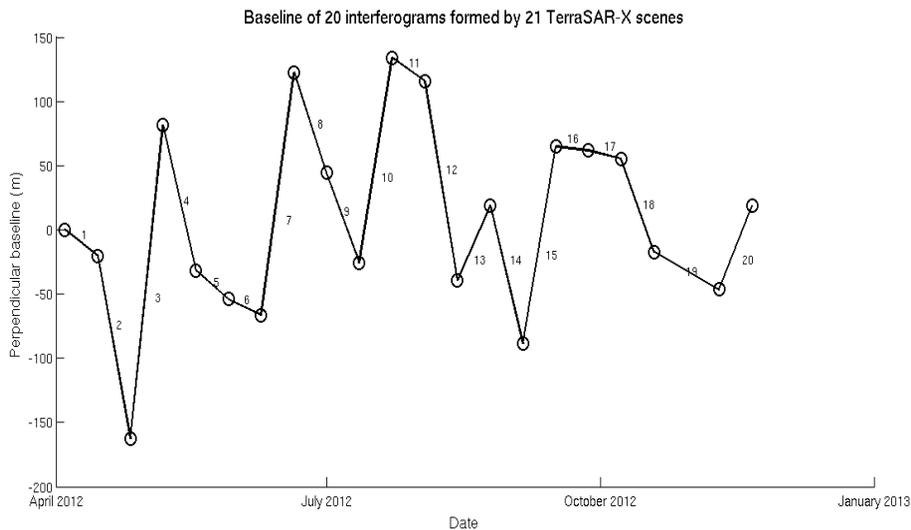




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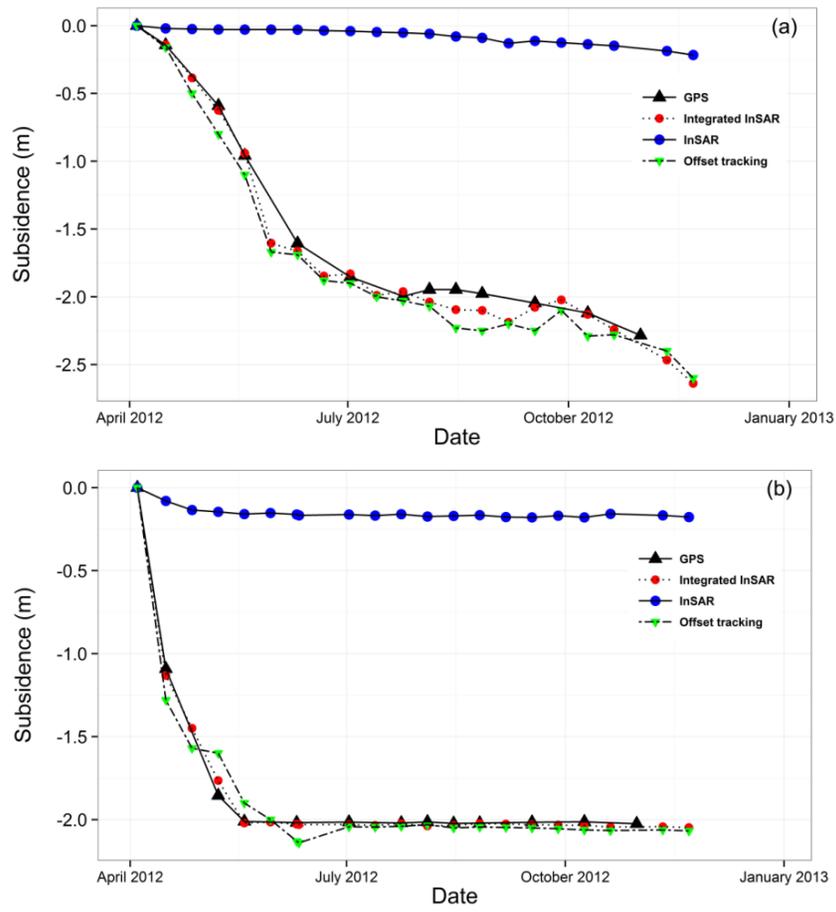


**Figure 4.** Interferogram pairs used in this study. Circles indicate SAR images while lines connecting them are baselines.

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**Figure 5.** Time series of deformation derived from InSAR, offset tracking and integrated InSAR approach, with GPS validation. **(a)** time series at CR1; **(b)** time Series at CR2.

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