Article

Monitoring Mount Sinabung in Indonesia Using Multi-Temporal InSAR

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Abstract : Sinabung volcano in Indonesia was formed due to the subduction between the Eurasian and Indo-Australian plates along the Pacific Ring of Fire. After being dormant for about 400 years, Sinabung volcano erupted on the 29th of August, 2010 and most recently on the 1st of November, 2016. We measured the deformation of Sinabung volcano using Advanced Land Observing Satellite/Phased Array type L-band Synthetic Aperture Radar (ALOS/PALSAR) interferometric synthetic aperture radar (InSAR) images acquired from February 2007 to January 2011. Based on multi-temporal InSAR processing, we mapped the ground surface deformation before, during, and after the 2010 eruption with time-series InSAR technique. During the 3 years before the 2010 eruption, the volcano inflated at an average rate of ~ 1.7 cm/yr with a markedly higher rate of 6.6 cm/yr during the 6 months prior to the 2010 eruption. The inflation was constrained to the top of the volcano. From the 2010 eruption to January 2011, the volcano subsided by approximately 3 cm (~ 6 cm/yr). We interpreted that the inflation was due to magma accumulation in a shallow reservoir beneath Sinabung. The deflation was attributed to magma withdrawal from the shallow reservoir during the eruption as well as thermo-elastic compaction of erupted material. This result demonstrates once again the utility of InSAR for volcano monitoring.

Key Words : Sinabung volcano, surface deformation, InSAR, time-series

1. Introduction

The Island of Sumatra is located along a segment of the "Ring of Fire", on the northern boundary of the Australian plate and the southern boundary of the Eurasian plate (Global Volcanism Program). From the geologic record it is apparent that during the past 2.5 million years, this region has been experiencing significant seismic and volcanic activity. The Island of Sumatra has been the location for three of the world's twelve largest earthquakes all with magnitudes higher than Mw 8.5. The 2004 Sumatra earthquake, which is the third largest earthquake (Mw 9.1), was particularly devastating because it was accompanied by a tsunami that killed more than 227,000 people from 14 countries in South Asia and East Africa. The largest eruption

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event in this region, with a volcanic explosivity index (VEI) of 8, occurred between 69,000 and 77,000 years ago at Toba volcano on the Island of Sumatra, less than 50 km southeast of Sinabung.

Mount Sinabung is a stratovolcano in the northwestern part of the Island of Sumatra in Indonesia (Fig. 1a). The volcano was formed during the Pleistocene to Holocene and consists of andesitic and dacitic lavas. Sinabung's 2,460-m-high conical structure has four overlapping craters (Global Volcanism Program). It is mostly covered with dense vegetation and only the top of the volcano is free of vegetation (Fig. 1b). The four summit vents are elongated from northsouth and range from 60 m to 300 m in diameter (Figs. 1c and d). Little is known about the volcano's eruption history, but the last historical eruption occurred around 400 years ago. Because of this long dormancy, the volcano has been poorly monitored. The latest eruption at Sinabung began on the 29th of August, 2010. This explosive eruption produced ash plumes rising several kilometers above the crater and forced the evacuation of 20,000 to 30,000 people within a 6 km radius of the volcano. Two individual ash plumes from separate vents near the summit were produced during this eruption, one vertical and one horizontal (Figs. 2a and b). Explosions and ash plumes accompanied by strong volcanic tremors, which were felt by residents as far as 8 km away, continued until the 22nd of September. According to the Center of Volcanology and Geological Hazard Mitigation (CVGHM), the ash plume, over the duration of this eruption, reached a maximum height of 5 km above the crater floor on the 7th of September.

The volcano remained dormant for another three years before erupting again on the 15th of September,



Fig. 1. (a) Sinabung volcano, located in the northern region of the Island of Sumatra, Indonesia. (b) Landsat-7 image acquired on May 19, 2003 of the Mount Sinabung area. (c) Averaged SAR amplitude image between January 1, 2007 and January 16, 2011.
(d) Combined Landsat-7 and averaged SAR images. Red arrows indicate the location of multi-craters and the yellow dotted lines delineate the extent of the rocky area.



Fig. 2. Twin ash plumes from Sinabung volcano eruption of 29-30th of August, 2010. Picture by the Jakarta Post on the 29th of August (a) and the 30th of August (b). (c) Landsat 7 image (RGB = 3,2,1) acquired on September 11, 2013.

2013. During this eruption the ash plume rose to an altitude of 6.1 km, and 3,700 people within a 3-km radius of the volcano were evacuated. Moreover, volcanic ash fell as far away as 50 km from the volcano in the northeast direction. Landsat 7 satellite image (Fig. 2c) acquired 4 days before the eruption (September 11, 2013) shows a white ash cloud over the summit of Sinabung and a grey volcanic ash plume on the east side of the volcano.

The size of Sinabung volcano and the frequent and complex nature of its eruptions make it difficult to study the deformation that is occurring here using traditional methods that require surface based instruments. InSAR is an efficient method for measuring surface deformation over large areas (Massonnet and Feigl, 1998; Rignot, 2008; Ng *et al.*, 2009; Lu *et al.*, 2009; Jung *et al.*, 2013a), and has been applied worldwide in the study of volcanic deformation (Pritchard and Simons, 2004; Lu *et al.*, 2010; Lu and Dzurisin, 2014; Chaussard and Amelung, 2012; Ebmeier *et al.*, 2010; Philibosian and Simon, 2011; Furuta, 2009). Because Sinabung is heavily vegetated, there is too much loss of coherence in C-band InSAR imagery. However, Chaussard and Amelung (2010, 2012) processed thirteen L-band ALOS/PALSAR images from Sinabung, acquired before 2010 that show a progressive rate of inflation of 2.2 cm/yr. In this study, we used twenty ALOS/PALSAR data (Table 1) with calibrated radar backscatter at HH polarization, including seven new images acquired in 2010 and January 2011, to study deformation of the volcano.

We applied a small baseline subset (SBAS) InSAR technique (Berardino *et al.*, 2002; Lee *et al.*, 2011) to estimate time-series surface deformation using a multiinterferogram processing approach (Rignot, 2008; Pan and Tang, 2010). Atmospheric artifacts are reduced

Number	Mission (Polarization)	Orbit number	Date (YYYYMMDD)	Perpendicular baseline (m)
1	ALOS/PALSAR(HH)	00702	20070220	0 (M)
2	ALOS/PALSAR(HH)	00707	20070708	181(S)
3	ALOS/PALSAR(HH)	00708	20070823	205(S)
4	ALOS/PALSAR(HH)	00801	20080108	15(S)
5	ALOS/PALSAR(HH)	00802	20080223	194(S)
6	ALOS/PALSAR(HH)	00804	20080409	305(S)
7	ALOS/PALSAR(HH)	00805	20080525	-45(S)
8	ALOS/PALSAR(HH)	00810	20081010	-124(S)
9	ALOS/PALSAR(HH)	00901	20090110	101(S)
10	ALOS/PALSAR(HH)	00902	20090225	-227(S)
11	ALOS/PALSAR(HH)	00907	20090713	449(S)
12	ALOS/PALSAR(HH)	00908	20090828	546(S)
13	ALOS/PALSAR(HH)	00911	20091128	147(S)
14	ALOS/PALSAR(HH)	01001	20100113	-3(S)
15	ALOS/PALSAR(HH)	01002	20100228	189(S)
16	ALOS/PALSAR(HH)	01007	20100716	46(S)
17	ALOS/PALSAR(HH)	01008	20100831	202(S)
18	ALOS/PALSAR(HH)	01010	20101016	154(S)
19	ALOS/PALSAR(HH)	01012	20101201	-165(S)
20	ALOS/PALSAR(HH)	01101	20110116	31(S)

Table 1. Characteristics of ALOS/PALSAR data used in this study

• Perpendicular baseline (m): calculation perpendicular baseline information of Master (M) image corresponding to Slave (S) images respectively.

through spatio-temporal filtering after the mean deformation is obtained (Jung *et al.*, 2013b) and iterative processing can further improve the time-series deformation estimates (Lee *et al.*, 2011). When using this algorithm, the deformation for a specific time period can be calculated more precisely by minimizing all error components (Lee *et al.*, 2012). This technique of a refined SBAS time-series analysis can successfully measure deformation with an error of 0.2 to 0.9 mm in the temporal domain and a root mean square error (RMSE) of 0.66 mm/yr in the spatial domain (Lee *et al.*, 2012).

2. Data processing

We initially applied InSAR processing to our SAR

dataset, and then carried out the SBAS processing and stacking to characterize the surface deformation of the Sinabung volcano in spatio-temporal domain. Using twenty ALOS/PALSAR images from the 20th of February, 2007 to the 16th of January, 2011 (Table 1), we generated 39 interferograms (Fig. 3).

Most of the interferograms had a perpendicular baseline of less than 400 m, but one interferogram had a baseline of 550 m. The best coherence was constrained on the volcano summit. Outside the summit, coherence was maintained only at many scattered patches of rocky and less-vegetated areas (i.e. selected interferograms in Fig. 4). Figs. 4(a)-(k) show interferograms acquired from the 20th of February, 2007 to the 31st of August, 2010, spanning 1 to 3 years. These images show 2 to 6 cm of surface uplift in the direction of the satellite's line of site (LOS) over the



Fig. 3. Thirty-nine high-coherence interferograms according to perpendicular baseline using 20 SAR images.



Fig. 4. (a)-(k) represent surface deformation (inflation) on the summit with a high-coherence area before the eruption. (I) shows surface deformation (deflation) in the opposite direction compared to (a)-(k).

volcano summit while the interferogram from the 31st of August, 2010, to the 16th of January, 2011, that spans the 2010 eruption, show 3 cm of subsidence over the summit area.

3. Results

An averaged surface deformation rate map (Fig. 5) was generated from 39 interferograms using SBAS processing. The areas of each interferogram with the coherence less than 0.4 were excluded from our analysis. The volcano summit (P1) experienced about 9 cm of inflation from the 20th of February, 2007, to the 31st of August, 2010 (Fig. 5). The inflation was likely due to the intrusion of magma from a deep source to the shallow reservoir. At locations P2, P3, and P4, surface deformation was not significant during the observation period (Fig. 5).

This suggests that the inflation at Sinabung was constrained within a radius of about 500 m from the volcano summit. The time-series surface deformation generated by SBAS processing includes two noticeable fluctuations around early and late 2008 at the summit (P(1) in Fig. 6) compared to the stability at other selected points (P(2), P(3), and P(4) in Fig. 6).

This phenomenon may have been caused by the depressurization of the magma chamber due to periodic volcanic degassing at the summit of Sinabung. In accordance with this analysis, surface deformation of the summit area steadily increased from the period of Fig. 7(a) until the period of Fig. 7(o) with a ground uplift pattern. However, Figs. 7(p) and (q) show rapid ground uplift after 138 and 184 days, respectively, from Fig. 7(o). It is especially rapid when compared with Fig. 7(0) at the summit, where there is one fringe (4 cm) of increased surface deformation. The deformation in these interferograms is consistent with the ground movement at P(1) in Fig. 5 between the 13th of January, 2010, and the 31st of August, 2010. On the contrary, Figs. 7(r)-(t) displays clear deformation of one fringe (4 cm) in the opposite direction, away from the



Fig. 5. SBAS-estimated mean surface deformation rate map over high coherence areas (>0.4) exploiting the SAR dataset from 2/20/07 to 1/16/11. P1 represents one of highest deformation areas in the summit. P(2-4) were selected for comparison with a major deformation area (P1). P2 is an additional point separated from the summit area of Sinabung mountain. P(3-4) are far from the summit point P1 within the Sinabung mountain area.



Fig. 6. Time series surface deformation estimated by SBAS processing from 2007 to 2011. Red diamond P(1) shows large surface deformation point on the summit area at Sinabung volcano. Black inverted triangle P(2) represents a reference point in the bare soil zone. Green cross P(3) and purple triangle P(4) display the northern and southern parts of the mountain from Fig. 5.



4 cm/yr

Fig. 7. Cumulative surface deformation maps around summit area (red rectangle in Fig. 5) from the SBAS processing.

sensor, after the August-September 2010 eruption events. Such a large deformation could be due to a combined effects of depressurization of the shallow magma reservoir due to cooling, and thermo-elastic contraction and poro-elastic settling of eruptive deposits (e.g., Lu *et al.*, 2005; Wadge *et al.*, 2006; Lee *et al.*, 2008; Poland, 2010).

4. Discussion and Conclusion

The SBAS technique was used to precisely estimate surface deformation rates and time-series measurements at Sinabung volcano between 2007 and 2011. Sinabung volcano displayed gradual inflation (~1.7 cm/yr) for approximately 3 years and then transitioned to a period of rapid inflation (~6.6 cm/yr) at the summit of the volcano during the 6 months prior to the main eruption event. A similarly rapid period of deflation (~5.8 cm/yr) occurred during the 4 months of the post-eruption period. The greatest surface deformation was measured to be 8-10 cm at the summit of the mountain a few months before the 2010 eruption. The Sinabung volcano has a relatively simple eruption cycle model that includes two primary processes. First, the magma chamber is fed from below, causing surface uplift. The inflation trend is punctuated by episodic deflation caused by depressurization of the shallow magma reservoir due to degassing or other processes. When the resulting pressure in the magma reservoir is sufficient, magma is forced to erupt through the conduit to the surface until the pressure inside the reservoir decreases. Second, the cooling of the magma inside the reservoir as well as the thermo-elastic contraction of the erupted material generated surface deflation as the 2010 eruption. These observations and interpretations are consistent with previous study of volcanic deformation in the area of Sinabung volcano (Chussard and Amelung, 2010, 2012). We can compare InSAR time-series results with GPS observation data from

March 24th 2011 to verify the movement of the surface inflation or deflation with another SAR satellite mission in future work because GPS stations were installed and monitored on Sinabung volcano early of 2011 after 2010 eruption (Kriswati *et al.*, 2014).

This study shows how the use of InSAR and timeseries technique can facilitate the monitoring of dynamic processes on especially hazardous volcanoes. The spatially dense measurements of surface deformation help constrain the causes of the observed deformation and the magma plumbing system. Continuous monitoring of ground deformation at Sinabung and other volcanoes worldwide will help reduce volcanic hazards.

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