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Chapter Title	Sar Interferometry	
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Comp. by: KArunKumar Stage: Proof Chapter No.: 97 Title Name: ESEG Page Number: 0 Date:6/11/10 Time:22:10:38

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SAR INTERFEROMETRY

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5 Synonyms

- 6 Differential InSAR (abbreviated as D-InSAR); Interfero-
- 7 metric SAR (abbreviated as InSAR); Radar interferome-
- 8 try; SAR interferometry

9 **Definition**

- 10 Radar. Acronym standing for Radio Detection and Rang-
- ing. A technique to detect any targets and measure the dis-
- tance to them, based on the round-trip time of microwave
- 13 (radio wave) pulses between the antenna and the targets.
- 14 SAR. Acronym standing for Synthetic Aperture Radar.
- A technique to image any ground surfaces, using airborne or spaceborne radar sensor. Its high spatial resolution is
- achieved by collecting numerous return pulses from each
- 18 target in sight and by effectively synthesizing large
- 19 antenna size.
- 20 InSAR. Acronym standing for Interferometric SAR.
- 21 A technique to image surface topography and ground dis-
- 22 placements, using phase values of two or more SAR
- 23 images.

24 Introduction

- 25 Crustal deformation data have been traditionally acquired
- by ground-based geodetic techniques such as leveling, tri-
- 27 angulation, and electro-optic distance measurement. More
- 28 recently, global positioning system (GPS) has become
- 29 a standard tool for high-precision crustal deformation
- 30 measurement, and provided us with a wealth of data to
- 31 study plate tectonics, earthquakes, volcanic activities,
- 32 and atmospheric and hydrological loading deformation.
- All these techniques, however, require in situ benchmarks,

and thus prevent us from observing inaccessible areas. 34 Interferometric SAR (InSAR) was, therefore, regarded as 35 a surprising and revolutionary technique when Massonnet 36 et al. (1993) first showed an image of the co-seismic deformation associated with the 1992 M7.3 Landers earth 38 quake, because the raw data was completely acquired on 39 a spaceborne sensor. Another big surprise for the community was its incredibly high spatial resolution, which no 41 other geodetic techniques were possible to achieve in 42 practice.

Nowadays, InSAR users have proliferated in 44 a worldwide community and applied to a variety of geo-45 physical problems. A number of excellent and extensive 46 reviews for advanced students and researchers are already 47 published (Bamler and Hartl, 1998; Massonnet and Feigl, 48 1998; Burgmann et al., 2000; Hanssen, 2001; Pritchard, 49 2006; Simons and Rosen, 2007; Zhou et al., 2009). 50 I therefore tried to make this article much shorter and more 51 introductory, but it still includes necessary and useful concepts, ranging from the fundamentals of SAR/InSAR 53 imagery to more up-to-date topics.

Fundamentals of SAR imaging and SAR data

SAR satellite flies over at an altitude of hundreds of km, 56 repeating transmission and reception of microwave 57 pulses. The along-track and across-track axes are almost 58 identical to the *azimuth* and *range* axis in the acquired 59 radar image. The area illuminated on the ground is called 60 *swath*, whose width spans roughly 50–100 km in the stan-61 dard *stripmap* (or *strip*) mode with an incidence angle of 62 20–50° (Figure 1). While previous SAR applications are 63 mostly derived from the stripmap mode, another imaging 64 mode, *ScanSAR*, is also promising because it covers much 65 wider swath width, 300–500 km, by illuminating multiple 66 swaths at the expense of reducing the resolution. 67 ScanSAR is useful for imaging long-wavelength signals 68

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associated with, for instance, a magnitude-8-class earthquake (Motagh et al., 2008).

Although it was not strictly necessary, satellite-based SAR system has been often placed on a sun-synchronous and near-polar orbit with an inclination angle of slightly greater than 90°. When the satellite moves to the north (south), we call it is in ascending (descending) orbit.

The raw data acquired on SAR sensor are impossible to visually interpret, and require a bit involved processing algorithms; those algorithms are detailed in a couple of text books (e.g., Curlander and McDonough, 1991; Cumming and Wong, 2005). The first interpretable SAR image is a single-look-complex (SLC) image, whose important difference from other optical images is that each pixel consists of a complex (real and imaginary) value, i.e., amplitude and phase. This is because the waveform of each repeated pulse is precisely controlled to be identical, and hence the received pulse provides us with not only a scattering (reflection) intensity but also a phase. The phase data do contain the geometric information from the antenna to the ground targets, and are fully exploited in generating InSAR image as discussed later. However, the phase image itself is usually not as useful as the intensity image because it is again impossible to visually interpret the physical meaning. Meanwhile, the intensity image is often useful and derived from a square-root magnitude of SLC data with spatial averaging called *multi-looking*. By single-look, it means the finest spatial resolution for both range and azimuth axis. In the standard stripmap mode, the range and azimuth resolutions are derived as,

$$\Delta r = \frac{c}{2B}$$
, and $\Delta a = \frac{L}{2}$, (1)

respectively; the c, B, and L are the speed of light, the fre-99 quency bandwidth of the microwave pulse, and the 100 antenna length along azimuth axis, respectively (Curlander and McDonough, 1991; Cumming and Wong, 2005). The waveform of each microwave pulse is called 103 chirp signal, whose instantaneous frequency linearly 104 changes by as much as the frequency bandwidth B over 105 the duration of each pulse. It should be noted that the spatial resolution depends neither on the sensor altitude nor the carrier frequency of microwave. Intensity images are 108 often shown in gray scale images, in which strongly 109 (weakly) reflected objects/areas are usually colored as 110 bright (dark). Although they simply look like black-and-111 white photographs, we should keep in mind that they 112 could be acquired regardless of weather and time because 113 SAR is actively transmitting and receiving microwaves. 114 Also, intensity images are indispensable for highprecision image matching prior to a generation of InSAR 117 image.

Fundamental principles of InSAR

Interferometric SAR (InSAR) is a technique to generate a digital elevation model (DEM) or a ground displacement image from a pair of SLC images. The term interferogram is often used to represent InSAR image. We can under- 122 stand the principle of InSAR, recalling the classical Young's experiment that is known to be a proof of the wave characteristics of the light (Ghilia and Pritt, 1998). 125 Two coherent waves out of the slits will generate "stripes" on the wall, called interference fringe (Figure 2a). We can 127 simulate the fringe if we know the separation of the slits. 128 the distance from each slit to the wall, and the wavelength 129 of the coherent wave. Depending on the path difference, 130 the two coherent waves are in-phase or out-of-phase when 131 they reach the screen. Namely, the difference of the phases 132 generates the interference fringe. We may regard the imaging geometry of InSAR as the 3-D Young's experiment (Figure 2b). The repeat orbit tracks, the ground surface, and the microwave correspond to the double slits, the 136 screen, and the coherent wave, respectively. Once we get 137 two SLC images, we can generate an initial interferogram, 138 multiplying one SLC image with the complex conjugate 139 of the other SLC image. We then observe similar fringes in the initial interferogram as illustrated in Figure 2b, which is literally a map of the difference of two SLC phases. For descriptive purposes, the former SLC image is often denoted as *master*, and the latter SLC image is called *slave*. At this moment, the slave image must be precisely co-registered (or matched) to the master image 146 (Figure 3); we will come back to this *image co-registra*tion (or image matching) procedure later on.

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While Figure 2b shows an initial interferogram over flat 149 areas with parallel orbits, the fringe will appear undulated if the areas are not flat. The fringe over flat areas is called flat Earth fringe (or, orbital fringe), and can be precisely simulated from the pair of orbit data. If we subtract the flat Earth fringes from the initial interferogram, we can extract 154 topographic fringe that can be used to generate DEM. The 155 Shuttle Radar Topography Mission (SRTM) was carried out along this idea in 2001, and generated 3-s resolution 157 DEM over $\pm -60^{\circ}$ latitudes (Farr et al., 2007). In the case 158 of SRTM, they carried two SAR antennas on the same platform, and thus were able to generate DEM without repeating the previous orbit track. In contrast, all the present SAR satellite systems carry only one antenna with a repeat-pass period of several weeks, which are 11 days 163 for TerraSAR-X, 16 days for COSMO-SkyMed, 24 days 164 for Radarsat-1/2, 35 days for Envisat, and 46 days for 165 ALOS. Therefore, if ground surface undergoes significant 166 deformation during the repeat orbit cycles due, for 167 instance, to earthquake and volcanic eruption, the interferogram will include *deformation fringe* as well. To extract 169 deformation fringe, we must take out both orbital fringe 170 and topographic fringe, which can be simulated from satellite orbit data and DEM. The deformation fringes repre- 172 sent slant range changes along the radar line-of-sight 173 (LOS), and thus projections of the 3-D displacement vec- 174 tor on the ground along the unitary vectors toward the 175 radar LOS (Figure 4). The range changes should be 176 interpreted as relative displacements to the reference 177 point(s) inside each interferogram. Depending on litera- 178 tures, they denote differential interferometric SAR 179

(D-InSAR) when the technique is used to detect deformation signals. Recently, however, the term InSAR is often and simply used to represent D-InSAR. 182

Even if no significant ground displacements take place during the repeat-pass period, however, we usually encounter other non-negligible fringes due to the spatial heterogeneities in the propagation delay of microwaves through the atmosphere, the errors in satellite orbit data, and those in DEM. Because these fringes limit the precision and accuracy of SAR-based crustal deformation measurement, a couple of correction approaches have been proposed. More advanced time-series analysis techniques have also been developed to overcome the issues, which will be introduced in the last section.

194 InSAR processing

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Image registration (Matching): Before we get an initial interferogram, we must register (or, match) each imaged target in one SLC image to the same target in the other SLC image with a sub-pixel level accuracy, because any ground objects do not usually locate at the same pixel coordinates in each SLC image. This pre-processing is called image registration (or image matching) and prerequisite to be performed prior to generating an initial interferogram. Although a simple polynomial transformation between the range and azimuth coordinates of two SLC images is sufficient in most cases, we need to take into account the effects of 3-D topography when the terrain surface is rugged to eliminate a stereoscopic effect (Michel et al., 1999).

When large ground displacements on the order of meters or more take place locally, and if we correct for the long-wavelength image distortion using the polynomial transformation, we can detect and quantify those localized displacements as a by-product of image registration without viewing InSAR image (Figure 3; Tobita et al., 2001a). This approach to detect large displacements is called pixel offset or feature tracking technique, and has been applied to earthquakes, volcanic eruptions, and glacier movements. The advantages of pixel-offset data are twofolds. First, pixel-offset data can quantify large displacements even in such areas that completely loses interferometric coherence, where InSAR data cannot be unwrapped; we describe coherence and unwrapping later below. Secondly, in contrast to InSAR data, pixel-offset data provide us with not only range offset but also azimuth offset component. While the range offset has the same sensitivity to the 3-D displacement vector as InSAR data (Figure 4), the azimuth offset is a projection of the displacement vector onto the unitary vector perpendicular to the LOS. Hence, the azimuth offset data are complementary to the range offset or InSAR data. Taking advantage of this property, Fialko et al. (2001) derived a full 3-D displacement map for the 1999 M7.1 Hector Mine earthquake, combining the InSAR data from both ascending and descending track with the azimuth offset data. Using pixel-offset data from both descending and ascending

track, Tobita et al. (2001a,b) inferred a 3-D displacement 236 map associated with the 2,000 eruption episode at Usu 237

Interferometric phase and its relation to geometry: 239 Suppose we have two co-registered SLC images, E_1 240 and E_2 , acquired from different ranges r_1 and r_2 : 241

$$E_1 = e^{j\phi_{Scatter}} e^{-\frac{4\pi r_1}{\lambda}} \tag{2a}$$

$$E_2 = e^{j\phi_{Scatter}} e^{-\frac{4\pi r_2}{\lambda}} \tag{2b}$$

Here we assume that the reflection magnitude and scat- 242 tering phase are constant during the data acquisition time. 243 Then, the interferometric phase ϕ is derived as

$$E_1 E_2^* = e^{-\frac{4\pi(r_1 - r_2)}{\lambda}} \tag{3}$$

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$$\phi = \frac{4\pi}{\lambda}(r_1 - r_2) \tag{4}$$

The last one is the fundamental equation for InSAR, 246 which describes "unwrapped" phase in the initial interfer- 247 ogram. The actual phase in the initial interferogram is 248 wrapped" into an interval $[-\pi, \pi]$, and thus has ambigu- 249 ities of $2\pi N$; N is integer. In order to quantify the ground 250 displacement along radar LOS, we have to perform 2-D phase unwrapping on the interferogram, which is not necessarily straightforward (Bamler and Hartl, 1998; Ghilia 253 and Pritt, 1998). While the interferometric phase is strictly 254 a phase "difference" of two SLC phases, it is conventional 255 to simply call phase. The factor 4 is to take into account 256 the round-trip distances.

Figure 5 is a cross section that is perpendicular to the 258 satellite repeat tracks and passes through the Earth's center, and shows a geometry of InSAR data acquisition. The spatial separation of the repeating orbits is termed baseline (or spatial baseline), B; the temporal separation 262 of data acquisition is sometimes called temporal baseline. 263 Because the baseline B is usually much shorter than the 264 ground range distance R, a parallel ray approximation 265 holds (Zebker et al., 1994) and the fundamental Equation 4 266 can be approximated as follows: 267

$$\phi = \frac{4\pi}{\lambda}(r_1 - r_2) \approx -\frac{4\pi}{\lambda}B_{//} = B \sin(\theta - \alpha), \quad (5)$$

where θ and α are defined in Figure 5, and $B_{//}$ (or B_{para}) is 268 a baseline component parallel to the radar LOS. The angle 269 θ is called *off-nadir angle*, and is identical to incidence 270 angle if the Earth's curvature is negligible. The other base- 271 line component B_{\perp} (or B_{perp}) is perpendicular to radar 272 LOS and gives us an important criterion for successful 273 InSAR processing as we discuss below.

Decorrelation (Coherence): In the actual InSAR data 275 processing, we do not necessarily get clear fringes over 276 the entire area. Depending on the data pairs and places, it 277 is not uncommon that no fringes are observed. To detect 278 283

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clear fringes, the reflected waves received at master and slave acquisitions must be more or less correlated to each other. The degree of correlation is quantified as coherence, 281 and there are two independent decorrelation sources.

The first source of decorrelation originates in the imaging geometry. As Figure 6 indicates, we observed higher (fewer) fringe density as becomes longer (shorter); imagine the case of zero baseline length. The fringe density can be derived from the gradient of phase (Equation 5) along the range axis:

ong the range axis:
$$\frac{\partial \phi}{\partial R} = -\frac{4\pi B_{\perp}}{\lambda R \tan \theta} + \frac{4\pi B_{\perp}}{\lambda (r_e + H) \sin \theta} \approx -\frac{4\pi B_{\perp}}{\lambda R \tan \theta}. \quad (6)$$

Namely, the fringe density is proportional to the perpendicular baseline B_{\perp} , and inversely proportional to the wavelength λ ; see Simons and Rosen (2007) for the case with topography. If the fringe density becomes too high to be counted within a range resolution of SAR image, we will not be able to identify any orbital fringes. This type of decorrelation is termed baseline decorrelation (or spatial decorrelation). The critical baseline is given as such a perpendicular baseline that gives a phase gradient 2π over the range resolution Δr ;

$$B_{\perp}^{c} = \frac{\lambda R \tan \theta}{2 \Delta r}.$$

For a typical value of ALOS/PALSAR with 299 $\lambda = 23(cm), R = 870(km), \theta = 34^{\circ}, \Delta r = 5(m), \text{ the crit-}$ 300 ical baseline becomes $B_{\perp}^{c} = 135,000(m)$, which gives an 301 upper limit of B_{\perp} . However, we practically prefer much shorter B_{\perp} , generally less than $\sim 2,000$ m for ALOS/ 303 PALSAR, because in more realistic situations the effect 304 of topography also comes in. The longer the B_{\perp} , the more 305 sensitive to rugged terrain as Figure 6 indicates. To eliminate topographic fringes, we need more accurate and higher resolution DEM if the B_{\perp} becomes longer. 308 Massonnet et al. (1996) proposed an alternative approach 309 that could effectively reduce the B_{\perp} by a combination of 310 integer multiplied (wrapped) interferograms. For instance, 312 if one interferogram with perpendicular baseline of 300 m is combined with the other interferogram with per-313 pendicular baseline of 290 m with factors 1 and -1, the 314 effective perpendicular baseline becomes 10 m. The scal-315 ing operation, however, also scales the amount of noise, 316 and thus the approach is limited to small integer numbers. 317

The second type of decorrelation is termed temporal decorrelation, which is related to the scattering phase in 319 the Equation 2a, and originates in how the microwave pulses interact with the physical objects near the ground. We often encounter the temporal decorrelation problem over vegetated areas with C-band (shorter-wavelength) SAR data and/or snow-covered areas; see Figure 7. It should be recalled that each pixel value in SLC image is a superposition of all the reflected microwaves from all scatterers inside each resolution cell (\sim 5 × \sim 10 m). Short-wavelength microwave pulses tend to be reflected on the vegetation canopies before reaching the ground surface, and their random motion will result in different 330 scattering phases at different acquisition time, causing 331 temporal decorrelation. On the contrary, long-wavelength 332 microwave pulses can more easily reach the ground, 333 which does not move as rapidly as vegetations, and thus 334 the resulting scattering phases will be also stable over 335 time. Besides the selection of wavelength, the polarization 336 of microwave is also essential for better coherence over 337 time. While, most presently, operated satellite-SAR sen- 338 sors are capable of multi-polarization modes, it was shown 339 that HH-polarization gives better coherence than VVpolarization (Cloude and Papathanassiou, 1998). This is 341 because the HH-polarized pulses can more easily penetrate through vegetations. 343

Outlook for InSAR geodesy

Limitations of present InSAR: Although it has a potential to detect tens of km-scale or even larger-scale secular 346 deformation signals on the order of mm/year, InSAR technique has been most successfully applied to detection of 348 spatially localized signals on the order of centimeters or more, such as those associated with earthquakes, volcanic eruptions, and ground subsidence. This is because the artifacts due to inaccurate satellite orbit data and/or microwave propagation delays (advances) in the troposphere (ionosphere) can mask small-amplitude, long-wavelength 354 deformation signals that are similar in both their amplitude 355 and the spatial scale.

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Although high-precision orbit data are indispensable to correct for the orbital fringes in the initial interferograms, their errors even on the order of 10 cm or less will generate non-negligible long-wavelength artifacts, which usually look like curved surfaces in the entire interferogram (e.g., Hanssen, 2001). Conventionally, they are fitted with low-order polynomials and simply taken out unless any sort of stacking or time-series analysis discussed below is applied. While this procedure works to eliminate the 365 artifacts due to orbit errors, it will also take out any longwavelength geophysically interesting signals such as the inter-seismic, post-seismic, ocean tidal loading, solid-Earth tide, and post-glacial rebound signals. Alternatively, if the ground control points (GCP) are available, where the 370 precision ground deformation data are available, we can 371 reestimate the baseline, based on those GCP data (e.g., 372 Rosen et al., 1996), but such data are often unavailable 373 in remote areas.

One approach to correct for the tropospheric delay sig-375 nals is to employ the other independent estimates derived from either the GPS-based tropospheric delay estimates (e.g., Onn and Zebker, 2006) or the output results from high-resolution numerical weather model (e.g., Foster et al., 2006). These so-called calibration approaches are, however, not easily applicable. The dense ground-based 381 GPS network is limited to a few areas in the world. Also, 382 high-resolution numerical weather model still needs 383 significant computational resources.

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Besides the tropospheric delay problem, the effects of ionosphere on both interferograms and pixel-offset images were clearly recognized in the results of the 2008 Wenchuan earthquake (Mw7.9), China, derived from ALOS/PALSAR (Kobayashi et al., 2009; Raucoules and de Michele, 2010), although they were pointed out in polar region many years ago (e.g., Matter and Gray, 2002). It is well known that the lower the carrier frequency is, the more significant the ionospheric dispersion impacts on the propagation delay. Thus, in many of the previous applications of C-band SAR data, the effects of ionosphere could have been neglected. While GPS also employs L-band, the high-precision GPS geodetic survey corrects for the ionospheric effect with the use of dual frequency, L1 and L2, observation data. In contrast, PALSAR is a single frequency SAR sensor and incapable of the standard ionosphere-correction approach. Empirically, however, we will encounter the ionospheric signals more frequently in the ascending data acquired in the local nighttime than in the descending data acquired in the local daytime. We also recall that the JERS, the other L-band SAR operated during 1992–1998, did not reveal any significant ionospheric signals at least in mid-latitude regions, and that most of the JERS data were acquired in the descending track. Besides the latitude, the effects of ionosphere on SAR image might, therefore, significantly depend on the data acquisition time. Like the tropospheric effects, detailed studies of ionospheric impacts on the SAR data are also currently underway.

A simple approach to eliminate those noises is *stacking*, which several interferograms are stacked to isolate small-amplitude signals, because those noises can be regarded as temporally random, whereas the deformation signals are spatially persistent. Two important prerequisites for successful stacking are: (1) the data acquisition dates of those interferograms should not be overlapped, in order not to enhance the noises of any particular acquisition date(s), and (2) each temporal baseline should be as long as possible so that each interferogram can include as much deformation signals as possible. In reality, it is not easy to gather many independent interferograms that have desirably long temporal baselines because the available data often encounter the spatial and temporal decorrelation. Also, the simple stacking approach inherently assumes temporally linear evolution in the ground deformation, preventing us from deriving time-series data.

Time-Series Analysis: Ferretti et al. (2000, 2001) proposed a new analysis technique called *Permanent Scatterer InSAR* (*PS-InSAR*), in which they take advantage of even such data pairs whose spatial baselines are longer than the critical values. Thereby, they could expand the temporal coverage, and thus could estimate the long-term deformation signals on the order of mm/year. Key idea of PS-InSAR is to pick up only such pixels that will exhibit long-term coherence due to the existence of corner-reflector-like targets, which Ferretti et al. called "permanent scatterers." Based on those pixels alone, they generate a stack of differential interferograms, using

available DEM and orbit data. The phase values include 443 not only deformation signals, but also such topographic 444 signals that were not initially taken into account, because 445 the longer spatial baseline pairs are so sensitive to the 446 topography that the available DEM could not account 447 for. In PS-InSAR and its variants (Werner et al., 2003; 448 Hooper et al., 2004), they fit the differential interferogram 449 stack to a phase model that describes not only temporal 450 evolution of deformation but also corrections to the avail- 451 able DEM. Deviations from the phase model can be fil- 452 tered into either non-linear deformation or atmospheric 453 signals because the former signals are correlated and thus 454 low-pass filtered along temporal axis, while the latter signals are temporally random; the orbit data must be 456 assumed to be correct. A known limitation of PS-InSAR 457 is its rather lower sampling density over non-urban areas. 458 However, despite a lack of man-made objects, Furuya 459 et al. (2007) succeeded in detecting active salt tectonic 460 motion, applying a similar technique to Canyonlands 461 National Park, Utah, presumably because the area was 462 non-vegetated and the exposed surface rocks behaved like 463 corner-reflector-like targets.

Another time-series analysis approach was devised and 465 known as small baseline subset (SBAS) algorithm 466 (Berardino et al., 2002). Key idea of the SBAS algorithm 467 is least-squares inversion of unknown deformation at each 468 SAR data acquisition epoch, based on the available 469 unwrapped differential interferograms (e.g., Lundgren 470 et al., 2001; Schmidt and Burgmann, 2003). Using small 471 baseline interferometric pairs, the SBAS approach is free 472 from spatial decorrelation and allows us to take advantage 473 of the fine spatial resolution of InSAR data. If the number 474 of interferograms is greater than or equal to the number of 475 SAR acquisitions, the inversion problem becomes an 476 over-determined or well-determined problem, and can be 477 easily solved in a least-squares approach. It is uncommon, 478 however, that all the available interferometric pairs have 479 short baselines, and accordingly the temporal sampling 480 rate will decrease. Berardino et al. (2002) proposed to employ several groups of "small baseline subset" to overcome the lower temporal resolution issue, and solved the 483 rank-deficient problem with the use of singular value 484 decomposition (SVD) technique. The SVD gives the min- 485 imum-norm least-squares solution, which is equivalent to 486 minimizing the estimated velocities at any time intervals. 487

Time-series analysis of SAR data is a promising technique, but almost all previous analyses are based on the 489 C-band ERS1/2 and Envisat data, because not only 490 more-than-decade-long data but also high-precision, 491 well-controlled satellite orbits are available for these satellites. As noted before, not all geophysically interesting phenomena could be detected by C-band and shorterwavelength SAR data. If the L-band ALOS/PALSAR data are archived for a much longer time, and if the follow-on 496 ALOS-2 and the DESDynI are launched as scheduled, 497 the time-series analysis of SAR data will become feasible even in areas that have never been monitored before. The 499 time-series analysis with ScanSAR data should also be 500

possible. Long-term continuous monitoring with L-band

- SAR will provide us with more opportunities for new
- discoveries.

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-	Inverse Theory, Singular Value Decomposition Inverse Theory: Linear Remote Sensing and GIS Techniques for Tectonic Studies Remote Sensing, Applications to Geophysics



Near range

Far range

Stripmap mode

Stripmap mode

H

OB

Azimuth direction

H

OB

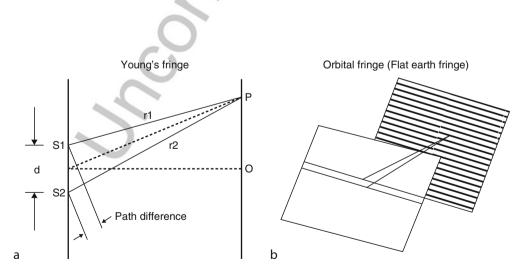
Azimuth direction

Sag Interferometry, Figure 1 Geometry of SAR imaging. SAR sensor transmits microwave pulses in slant range direction, and receives their reflected pulses. While stripmap mode achieves high spatial resolution with a fixed off-nadir angle, ScanSAR mode achieves wider imaged area (swath) with multiple off-nadir angles at the expense of the resolution.

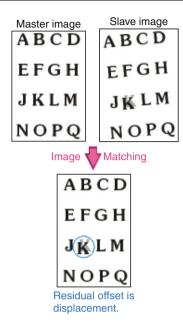
Ground range

Swath width

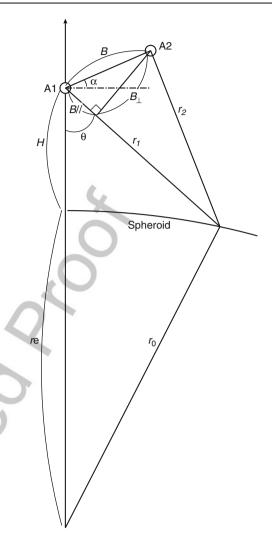
Far range



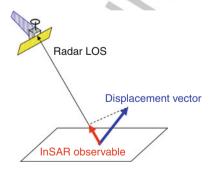
Sag Interferometry, Figure 2 (a) Geometry of the Young's experiment. Depending on the path difference, the two coherent waves from the slit, S1 and S2, are in-phase or out-of-phase on the screen, and interference fringes are observed on the right screen. (b) Orbital fringe (flat earth fringe) can be regarded as a 3-D analogue of the Young's experiment.



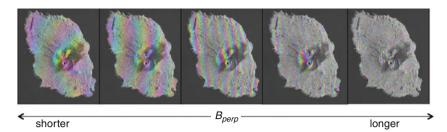
Sar Interferometry, Figure 3 Image registration (matching) of the master and slave images prior to interferogram generation, and the principle of pixel-offset technique to derive large displacements. While long-wavelength distortion can be corrected, localized huge displacement remains as residual offset. Courtesy of Tobita et al. (2001a).



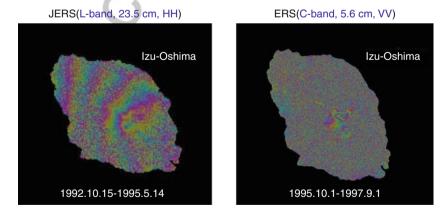
Sar Interferometry, Figure 5 Geometry of InSAR data acquisition and its relation to the baseline. The A1 and A2 are the satellite's repeat orbits, and the spatial distance between the A1 and A2 is the baseline B. The initial InSAR phase is proportional to the difference between the ranges, r_1 and r_2 , and hence the *Bpara* (eq. 5). The fringe rate (density) along the range axis is proportional to the *Bperp* (eq. 6).



Sar Interferometry, Figure 4 InSAR observable is a projection of the displacement vector along the radar line-of-sight (LOS) direction.



Sar Interferometry, Figure 6 The fringe rate (density) depends on the *Bperp*; see eq (6). The shorter the *Bperp*, the fewer the observed fringes, and thus better to detect deformation signals. In order words, there is a limit in the *Bperp* over which we cannot count the number of fringes. The InSAR image is based on JERS data over Izu-Oshima volcano island, Japan. Original SAR data is copyrighted by JAXA and MITI, Japan.



Sar Interferometry, Figure 7 Comparison of two interferograms at Izu-Osima volcano, derived from (left) L-band HH JERS data and (right) C-band VV ERS data. While clear fringes are observed to the left even with 2.5 years temporal baseline, we can recognize the fringes only around the caldera that are covered with few vegetations.