## InSAR-derived horizontal velocities in a global reference frame

Milan Lazecky<sup>1</sup> and Andrew Hooper<sup>2</sup>

<sup>1</sup>University of Leeds <sup>2</sup>University of Leeds, COMET

November 24, 2022

## Abstract

Interferometric Synthetic Aperture Radar (InSAR) is used to measure deformation rates over whole continents to constrain tectonic processes. The resulting velocity measurements are only relative, due to unknown integer ambiguities introduced during propagation of the signal through the atmosphere. However, these ambiguities mostly cancel when using spectral diversity to estimate along-track motion, allowing measurements to be made with respect to a global reference frame. Here, we calculate along-track velocities for a partial global dataset of Sentinel-1 acquisitions and find good agreement with ITRF2014 model values. We include corrections for solid-earth tides and gradients of ionospheric total electron content. By combining data from ascending and descending orbits we are able to estimate north and east velocities with average precision of 4 and 20 mm/year, respectively. Although we have calculated these over large 250x250 km areas, such measurements can also be made at much higher resolution, albeit with lower accuracy. These "absolute" measurements can be particularly useful for global velocity and strain rate estimation, where GNSS measurements are sparse.

# InSAR-derived horizontal velocities in a global reference frame

## M. Lazecký<sup>1</sup>, and A. J. Hooper<sup>1</sup>

<sup>4</sup> <sup>1</sup>COMET, School of Earth and Environment, University of Leeds, LS2 9JT Leeds, United Kingdom

## 5 Key Points:

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6	•	We can use Sentinel-1 InSAR to measure along-track velocities over wide areas
7		in a global reference frame
8	•	Horizontal velocity vectors can then be estimated, which generally agree with the
9		ITRF2014 plate motion model
10	•	The updated Sentinel-1 precise orbits introduced in mid-2020 improve the preci-
11		sion and induce a single offset

Corresponding author: Milan Lazecký, M.Lazecky@leeds.ac.uk

## 12 Abstract

Interferometric Synthetic Aperture Radar (InSAR) is used to measure deformation rates 13 over whole continents to constrain tectonic processes. The resulting velocity measurements 14 are only relative, due to unknown integer ambiguities introduced during propagation of 15 the signal through the atmosphere. However, these ambiguities mostly cancel when using 16 spectral diversity to estimate along-track motion, allowing measurements to be made with 17 respect to a global reference frame. Here, we calculate along-track velocities for a partial 18 global dataset of Sentinel-1 acquisitions and find good agreement with ITRF2014 model val-19 ues. We include corrections for solid-earth tides and gradients of ionospheric total electron 20 content. By combining data from ascending and descending orbits we are able to estimate 21 north and east velocities with average precision of 4 and 20 mm/year, respectively. Al-22 though we have calculated these over large 250x250 km areas, such measurements can also 23 be made at much higher resolution, albeit with lower accuracy. These "absolute" measure-24 ments can be particularly useful for global velocity and strain rate estimation, where GNSS 25 measurements are sparse. 26

## 27 Plain Language Summary

It is possible to use repeated radar measurements from satellites to measure movement of 28 the ground towards or away from the satellite very accurately. These measurements do not 29 tell us the absolute movement, however, but rather the difference in movement between 30 any two parts of the ground captured in the same radar image. Using a related technique, 31 we measure horizontal movement of the ground in the flight direction of the satellite, and 32 these are absolute measurements, in global reference frame. By combing measurements 33 from different flight directions, we can estimate the horizontal movement of the ground in 34 any direction. Our estimates largely match what we expect from plate tectonics. These 35 measurements can be useful for large scale mapping of ground movement, which can be 36 used to better understand how the Earth deforms and how earthquake hazard varies across 37 the globe. 38

## <sup>39</sup> 1 Introduction

With the Copernicus Sentinel-1 Synthetic Aperture Radar (SAR) satellites, the geoscience 40 community acquired a unique tool for making precise measurements of tectonic motions. The 41 Centre for Observation and Modelling of Earthquakes, Volcanoes and Tectonics (COMET) 42 LiCSAR system (Lazecký et al., 2020) routinely generates Sentinel-1 differential interfero-43 grams over tectonic and volcanic areas, and carries out interferometric (InSAR) time series 44 analyses to measure surface deformation in the satellite line-of-sight direction. The InSAR 45 measurements can be used to derive vertical and horizontal motion components, but the 46 line-of-sight sensitivity is very low for the N-S motion component, which is typically esti-47 mated using available GNSS data (Weiss et al., 2020). It is possible to estimate along-track 48 displacements, which are sensitive to N-S motions, by exploiting spectral diversity in the 49 azimuth direction (Bechor & Zebker, 2006), although the precision is poor. However, the 50 Terrain Observation with Progressive Scan (TOPS) acquisition mode of Sentinel-1, which is 51 the standard mode over land, provides much greater spectral diversity in burst overlap re-52 gions, allowing estimation with a precision of around 1 mm within whole overlaps (Grandin 53 et al., 2016). Time series approaches have also been developed to estimate along-track ve-54 locities in the burst overlap regions (Hooper et al., 2020; Li et al., 2021). These studies 55 treat the along-track velocities as relative measurements, but here we explore how accu-56 rately we can measure them in a global reference frame, as the along-track measurements 57 are with respect to reference satellite positions, localised within the Earth-centered Earth-58 fixed no-net-rotation framework of the ITRF2014. We estimate the velocities in relatively 59 large blocks containing many burst overlaps, in order to observe large-scale tectonic motion 60 and characterise some of the error sources, such as the solid-earth tides and ionosphere. 61

## <sup>62</sup> 2 Estimating along-track displacements

<sup>63</sup> We extract the Level-1 single-look complex (SLC) data of the standard Sentinel-1 Inter-<sup>64</sup> ferometric Wide Swath burst units, and merge those bursts into larger spatial frames that <sup>65</sup> we have defined. One typical frame consists of 13 bursts in each of the three swaths and <sup>66</sup> covers an area of approx. 250x250 km. We perform a standard procedure to coregister the <sup>67</sup> SLC data for each acquisition towards a reference epoch (Lazecký et al., 2020). During this <sup>68</sup> process, values of the mean subpixel shift in the azimuth direction,  $\Delta a_{px}$ , are estimated.

In detail, we use the Copernicus Sentinel-1 Precise Orbit Determination ephemerides to resample each SLC into the geometry of the reference epoch, considering topography with respect to the WGS-84 reference ellipsoid (Lazecký et al., 2020). We then run several iterations of intensity cross correlation to estimate a refined sub-pixel shift in both slant range (across-track),  $\Delta r_{ICC,px}$ , and azimuth (along-track),  $\Delta a_{ICC,px}$ , directions, with a precision of around 0.01 pixels. Next, we resample the SLC to an intermediate product and iteratively estimate a further refined azimuth coregistration offset  $\Delta a_{SD,px}$  using spectral diversity of burst overlaps (De Zan & Monti Guarnieri, 2006). Burst overlap areas are imaged with multiple lines of sight, and differencing interferograms formed for each lineof-sight cancels the across-track displacement, and leads to an estimate of the along-track offset with a precision of around 0.0005 pixels. To ensure coherence, this offset is estimated between pairs of acquisitions close in time that were previously resampled to the reference epoch, thus already shifted by their along-track offset (Lazecký et al., 2020). The spectral diversity phase is related to azimuth pixel shift by (Yagüe-Martínez et al., 2016)

$$\Delta a_{SD,px} = \frac{\Delta \phi_{SD} PRF}{2\pi \Delta f_{DC}},\tag{1}$$

where PRF = 486.486 Hz is the pulse repetition frequency (azimuth sampling rate) of the Sentinel-1 system, and  $\Delta f_{DC}$  is the Doppler centroid frequency difference in the burst overlap area.

We sum the frame averages of the subpixel offsets into the final frame-wise  $\Delta a_{px}$  values, to provide offsets with respect to the reference frame of the orbit ephemerides, which is the International Terrestrial Reference System in its ITRF2014 realisation since 2017-02-16, *i.e.*, since version 1.3 of the precise orbit generating system (Peter et al., 2021). We also extract other relevant information on a frame basis, such as average ground footprint heading angle,  $\alpha$ , pixel resolution in the azimuth direction,  $r_{azi}$ , average incidence angle within the frame,  $\Theta_{inc}$ , and an average value  $\Delta f_{DC}$  of Doppler frequency difference between burst overlaps, calculated as in (Grandin et al., 2016). We then use  $r_{azi}$  in Eq. 2 to convert the frame-wise azimuth pixel offset shift  $\Delta a_{px}$  to the frame-wise measurement  $\Delta a$  [mm] that directly relates to an along-track (azimuth direction) ground displacement.

$$\Delta a = \Delta a_{px} r_{azi} = \left(\Delta a_{ICC,px} + \Delta a_{SD,px}\right) r_{azi}.$$
(2)

In total, we selected 107,476  $\Delta a$  values from 1,063 LiCSAR frames, that have a minimum count of 30  $\Delta a$  values per frame. As the LiCSAR processing currently concentrates on the Alpine-Himalayan orogenic belt (AHB), we provide outputs of our analyses in both full global dataset and the AHB subset, defined by a bounding box of 25°W-110°W and 25°N-45°N. Acquisitions after 2020-07-30 used orbit ephemerides generated by version 1.7 of the orbit determination system, introducing a major correction (Peter et al., 2021).

## 78 3 Contributions to the azimuth shifts

Several factors contribute to offsets measured in the along track direction:

$$\Delta a = \Delta a_{tecton} + \Delta a_{tide} + \Delta a_{iono} + \varepsilon, \tag{3}$$

<sup>79</sup> where  $\Delta a_{tecton}$  is the motion due to tectonic displacement between acquisitions,  $\Delta a_{tide}$ <sup>80</sup> is displacement due to the difference in the solid-earth tides between acquisitions,  $\Delta a_{iono}$ 

## is due to the change in the along-track gradient of total electron content (TEC) between acquisitions, and $\varepsilon$ is any residual due to orbit inaccuracies and noise.

As our aim is to isolate  $\Delta a_{tecton}$ , we estimate and subtract values for  $\Delta a_{tide}$  and  $\Delta a_{iono}$ . For  $\Delta a_{tide}$  we use a solid-earth tide model (Petit & Luzum, 2013) and calculate motion in the along-track direction for the centre coordinates of each frame from the tidal components  $d_E$ ,  $d_N$  in the east and north, respectively, using Eq. 4.

$$\Delta a_{tide} = d_E \,\sin(\alpha) + d_N \cos(\alpha). \tag{4}$$

To estimate  $\Delta a_{iono}$ , we apply the IRI2016 model (Bilitza et al., 2017), using the inverse of the approach for estimating the ionospheric influence on spectral diversity values (Gomba et al., 2016). For each acquisition, we use the IRI2016 model to estimate the TEC between the satellite and the ground in the centre of the image for a hypothetical forward-looking (A) and backward-looking (B) burst, respectively, *i.e.* in a geometry similar to the solution of (Liang et al., 2019). We calculate the location of the respective points A, B, following the azimuth direction footprint below the ionosphere piercing point located in the line-ofsight at the height of the ionospheric F2 layer peak,  $H_{iono}$ , which is given by IRI2016. We estimate the incidence angle below the ionosphere piercing point  $\Theta_{IPP}$  according to the ionospheric single layer model (Ya'acob et al., 2010) and use it to convert modeled TEC<sub>v</sub> column to the slant (line-of-sight) direction, TEC<sub>s</sub>, as:

$$TEC_s = \frac{TEC_v}{\sqrt{1 - \sin\Theta_{IPP}}^2} = \frac{TEC_v}{\sqrt{1 - (\frac{R\sin\Theta}{R+H_{iono}})^2}},$$
(5)

where R is the radius of the Earth.

The TEC<sub>s</sub> difference approximately corresponds to the ionospheric influence of the SAR carrier wave of frequency,  $f_0$ , modulated by the Doppler effect from the satellite motion and the beam steering during the TOPS acquisition mode in the frequency range  $f_A$ ,  $f_B = f_0 \pm 0.5\Delta f_{DC}$  at the burst edges (Grandin et al., 2016). The phase advance due to propagation through ionosphere is (Gomba et al., 2016):

$$\phi_{iono} = \frac{4\pi K}{cf} TEC,\tag{6}$$

where  $K = 40.308193 \frac{m^3}{s^2}$  is a constant for which we assume a commonly applied value (Hoque & Jakowski, 2012) and c is the speed of light in vacuum. From Equations ??, 1, 2, 6, we can derive  $\Delta a_{iono}$  towards the frame reference epoch as

$$\Delta a_{iono} = \frac{2 PRF K}{c \,\Delta f_{DC}} \left( \frac{\Delta TEC_s(A)}{f_A} - \frac{\Delta TEC_s(B)}{f_B} \right) r_{azi},\tag{7}$$

where  $\Delta TEC_s$  is the difference between the  $TEC_s$  estimate for each acquisition and the reference epoch, and  $\Delta f_{DC} = f_A - f_B$ , which varies significantly between swaths. An influence of the absolute magnitude of  $\Delta TEC$  is not expected on the azimuth shift (Gomba et al., 2016; Fattahi, Simons, & Agram, 2017).

We expect the tide model to be sufficiently precise for this analysis, although updated 88 tide models exist, which also consider ocean tide loading or polar motion (Ducarme & 89 Schüller, 2018; Martens et al., 2019). For the ionosphere, the IRI2016 model is a set of 90 equations using several parameters calibrated based on data available at relatively low fre-91 quency (months), and IRI2016 estimates are considered relatively accurate for investigating 92 monthly averages. We expect this model to be sufficient for reduction of seasonal fluctu-93 ations of  $\Delta a$  caused by ionospheric influence but not for a precise estimate per each  $\Delta a$ 94 sample. 95

Figure 1 demonstrates the influence of the implemented corrections applied to the original  $\Delta a$  values. The time series are based on median-corrected  $\Delta a$  values, filtered by a

## <sup>98</sup> rolling median using 10 samples, and plotted by a colour gradient representing distance of

## <sup>99</sup> each frame centre from the Equator.



Figure 1. Effect of solid-earth tides and ionospheric corrections on time series of  $\Delta a$  values for, left, ascending and, right, descending frames; colour gradient is based on distance from the Equator: a) time series of modeled  $\Delta a$  corrections at the same scale; b)  $\Delta a$  values before and after corrections;  $\Delta a$  values are after correction for updated orbits (see Section 4).

## <sup>100</sup> 4 Effect of updated orbit ephemerides

The orbit emphemerides products of Sentinel-1 changed on 30th July 2020 to version 107 1.7, incorporating a correction of the on-board GPS antenna reference point position, as 108 identified by (Peter et al., 2020). This correction implied a 3-D position change of approx. 109 6 cm which led to a decrease in the the root mean square error (RMSE) of the 3-D position 109 of the satellites to below 1 cm (Peter et al., 2021). The antenna reference point is shifted <sup>106</sup> by 39 mm in the along-track direction of the satellite, see Tables 3-1 and 3-2 in Fernández <sup>107</sup> et al. (2019). We investigate the effect of the reference point shift on the azimuth shift, <sup>108</sup> by comparing acquisitions processed using the old and new orbits. Additionally, as the <sup>109</sup> updated orbits should improve precision of satellite positioning, we explore whether there is <sup>110</sup> a decrease in error of  $\Delta a$  measurements. For the analyses in this section, we use  $\Delta a$  values <sup>111</sup> corrected for both solid-earth tides and ionosphere.

#### 4.1 Estimation of offset due to updated orbits

We expect the use of updated orbits would to cause a constant offset in the linear model of along-track velocities. We split the dataset of  $\Delta a$  values by the date of orbits update, 2020-07-30, and select only values after 2016-07-30 to lower the impact of residual ionosphere. We then estimate preliminary model parameters m of linear velocity v', intercept c, and offset due to orbit change  $\delta \Delta a$  by applying least squares inversion to

where  $\Delta t$  is the acquisition time in years since 2016-07-30, and the final columns is 1 for acquisition times after the orbits change date. After performing the inversion per frame, we remove outliers above 3 RMSE from median, and after re-estimating model parameters, we drop frames having RMSE above 120 mm. The final mean offset value is then estimated from 484 frames as  $-39.9 \pm 3.7$  mm at 2-sigma error, which agrees with the expected shift due to orbit change, of -39 mm, within error. We plot distribution of the estimated offsets per orbital tracks in histograms in Fig. 2a.

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#### 4.2 Impact of updated orbits on $\Delta a$ precision

We extract one-year subsets from the data set for both before and after the orbit change (*pre* and *post* subsets), and ensure there is an equal number of samples per subset. We then calculate RMSE values  $\sigma_{pre}$ ,  $\sigma_{post}$  per subset, and observe median improvement in precision of  $\Delta a$  after the orbit update as  $\overline{\Delta RMSE} = -4.7$  mm, or, from their median values,  $\frac{\sigma_{pre} - \sigma_{post}}{\sigma_{pre}} = 13.9\%$ .

We present distributions of the RMSE values calculated per frame for each subset in the form of histograms in Fig. 2b, including their difference.



Figure 2. Effect of updated orbits: a) histograms of median difference between  $\Delta a$  values before and after the orbits update. The overall mean value of  $\overline{\delta \Delta a} = -39.9 \pm 3.7$  mm agrees, within error, with the given offset of -39 mm for the antenna reference position (Fernández et al., 2019); b) histograms of root mean square errors (RMSE) estimated from equal-size distributions of  $\Delta a$  values from epochs before (*pre*) and after (*post*) the updated orbits, and their difference  $\Delta RMSE$ , with the median  $\overline{\Delta RMSE} = -4.7$  mm.

## <sup>128</sup> 5 Estimation of plate motion

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For the final velocity estimation, we assume that the offset due to the change in orbit products is  $\Delta a_{ARP} = 39$  mm, rather than estimate it, as our analysis in the previous section imples this number is accurate. We decompose the velocities into horizontal displacements and compare to values from the ITRF2014 plate motion model.

### 5.1 Estimation of velocity from $\Delta a$

We invert the corrected dataset of  $\Delta a$  values by the linear regression with Huber loss function (Huber, 2009), applied with parameters alpha=1.0 and epsilon=1.35, per frame. We calculate the mean square error,  $\sigma_{\Delta a}^2$ , assuming two degrees of freedom. We use the mean square error as an estimate of the variance for individual measurements and then apply Eq. 9 to propagate the errors,

$$Q_m = [A^T Q_d^{-1} A]^{-1}, (9)$$

where  $Q_m$  is the variance-covariance matrix of the model parameters,  $Q_d = \sigma_{\Delta a}^2 I_N$  is the NxN variance-covariance matrix of the measurements ( $I_N$  being the NxN identity matrix), and  $A = [t_i, ..., t_N; 1, ..., 1]^T$  is an Nx2 matrix where t is the acquisition time in years. The first element of  $Q_m$  is the estimate of the variance of velocity  $\sigma_v^2$ . Estimates of velocities in ascending and descending tracks are plotted in Fig. 3.

## <sup>139</sup> 5.2 Decomposition to N, E directions

We decompose the final  $\Delta a$ -based estimates of horizontal displacement velocity v in the satellite azimuth direction from descending and ascending tracks, to eastwards and northwards direction components,  $v_E$  and  $v_N$ , respectively. We establish a global grid with a pixel size of approx. 250x250 km, map overlapping frames having their centroid inside the common grid cell, and calculate  $\vec{v}_{EN} = [v_E, v_N]^T$  for pixels with  $\vec{v} = [v_{D,1}..v_{D,i}..v_{A,1}..v_{A,j}]^T$ (i > 0, j > 0 being numbers of overlapping frames from descending and ascending tracks, respectively) by a least squares inversion of

$$\vec{v} = A \, \vec{v}_{EN},\tag{10}$$

where matrix A contains look vector transformation coefficients per each of n = i+j grouped frames as  $A = [\sin \alpha_1 ... \sin \alpha_n, \cos \alpha_1 ... \cos \alpha_n]^T$ . We estimate the precision of the estimates using propagation of errors as before.

As the azimuth direction contains only a small component of eastwards motion, the eastwards velocity estimates are very sensitive to outliers. We therefore filter our dataset of velocity estimates, removing 66 grid cells that have unreasonably large eastwards velocities or standard deviations:  $|v_E| > 200 \text{ mm/year or } \sigma_{v,E} > 50 \text{ mm/year}$ .



**Figure 3.** Global overview of along-track motion estimates extracted from ascending (top) and descending (bottom) tracks, after correction for both solid-earth tides and ionosphere. Projection: Robinson, EPSG: 54030.

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## 5.3 Comparison to ITRF2014 plate motion model and summary

We investigate accuracy of the estimates by comparison with the ITRF2014 plate mo-148 tion model (Altamimi et al., 2017) velocities  $\vec{v}_{PMM} = [v_{E,PMM}, v_{N,PMM}]^T$  in both east-149 wards and northwards directions, averaged per set of coordinates within each of the grid 150 cells. We carry out a statistic evaluation of the quality of our estimates, noting that it will 151 be biased by real differences between the two datasets in plate boundary zones. Median 152 values of v and  $\sigma_v$  for both our full dataset (253 grid cells) and the AHB subset (188 grid 153 cells) are given in Table 1. The ionospheric correction (affecting mainly ascending frames) 154 induced an overall increase of velocity estimates in the eastward component  $v_E$ , and in 155 case of AHB subset, it increased also  $\sigma_{v,E}$ . However, the main component of interest, the 156

northwards velocity  $v_N$ , is closer to the values expected by the plate motion model. The table reports average 2-sigma precision over AHB region 3.6 mm/year northwards and 20 mm/year eastwards.

Additionally, we convert the plate motion model velocities to the azimuth direction of each frame as in Eq. 4 and use them to assess accuracy of the original velocity estimates, per direction of orbital tracks (ascending or descending). Their median values are provided in Table 1 as  $\overline{v_{PMM}}$ .

We visualize the constructed decomposition grid and inverted horizontal velocities by both plate motion model and the final  $\Delta a$ -based estimates after both solid-earth tide and ionosphere corrections in Fig. 4. The figure highlights spatial patterns of a higher deviation from the model that are expected, *e.g.* an increased westward motion of western Turkey (Weiss et al., 2020), but also higher eastwards velocity of the eastern part of the Alpine-Himalayan belt, with respect to the plate motion model.

Fig. 4 also provides a visual comparison of motion vectors from the plate motion model and decomposed  $\Delta a$ -based velocities with and without ionosphere correction, over the AHB region. Including the ionosphere correction gives a generally better fit to the plate motion model in terms of the motion direction, but often leads to an overestimate of velocity magnitude. This is demonstrated quantitatively in Table 1 by the median differences between vector directions and magnitudes before and after ionosphere correction.

**Table 1.** Median values of estimated velocities v,  $v_E$ ,  $v_N$  [mm/year] and their RMSE ( $\sigma$ ) [mm/year] demonstrating impact of solid-earth tides plus ionospheric corrections, and median deviations of vector angle  $\gamma$  and magnitude l of  $v_E$ ,  $v_N$  from the ITRF2014 plate motion model values, in both global dataset and the AHB subset. The subscript tc refers to tide-corrected and tic to tide- and ionosphere-corrected.

global dataset							
direction	$\overline{v_{PMM}}$	$\overline{v}\pm\overline{\sigma_v}$	$\overline{v_{tc}}\pm\overline{\sigma_{v,tc}}$	$\overline{v_{tic}} \pm \overline{\sigma_{v,tic}}$			
ascending track	0.0	$3.2 \pm 4.1$	$3.2 \pm 4.0$	$1.4 \pm 3.9$			
descending track	-7.5	-10.4 ± 3.6	-10.1 $\pm 3.5$	-10.2 ± 3.5			
eastwards	$28.2 \\ 5.7$	$20.1 \pm 13.5$	$22.1 \pm 11.3$	$36.4 \pm 11.4$			
northwards		$9.9 \pm 2.6$	$9.2 \pm 2.2$	$7.4 \pm 2.1$			

	Alpine-Himalayan belt subset			
direction	$\overline{v_{PMM}}$	$\overline{v}\pm\overline{\sigma_v}$	$\overline{v_{tc}} \pm \overline{\sigma_{v,tc}}$	$\overline{v_{tic}} \pm \overline{\sigma_{v,tic}}$
ascending track	0.7	$7.4 \pm 2.8$	$6.7 \pm 2.7$	$2.3 \pm 2.7$
descending track	-11.0	-15.8 $\pm 2.5$	-15.6 $\pm 2.4$	-15.2 $\pm 2.4$
eastwards	$28.5 \\ 6.3$	$20.6 \pm 12.1$	$25.9 \pm 10.2$	$41.0 \pm 10.0$
northwards		$11.9 \pm 2.2$	$12.1 \pm 1.8$	$8.5 \pm 1.8$

median deviations from the ITRF2014 plate motion model

dataset	$\overline{\Delta\gamma_{tc}}$	$\overline{\Delta\gamma_{tic,PMM}}$	$\overline{\Delta l_{tc,PMM}}$	$\overline{\Delta l_{tic,PMM}}$
global	6.7 deg	0.9 deg	1.8  mm/year	11.5 mm/year
AHB	8.5 deg	1.2 deg	- $1.2 \text{ mm/year}$	11.5 mm/year



Figure 4. Comparison of estimated velocity vectors to the ITRF2014 plate motion model for the Alpine-Himalayan belt subset, corrected for solid-earth tides and ionosphere (top) and for solid-earth tides only (bottom). Error ellipses represent  $1-\sigma$  (RMSE) in respective directions, neglecting their possible correlation.

## 176 6 Discussion

The list of factors influencing  $\Delta a$  is not comprehensive. For example we do not estimate  $\Delta a$  due to N-S gradients of large scale tropospheric bodies as monsoons, although it technically is possible to model using *e.g.* GACOS service (Yu et al., 2018). Also, we do not incorporate ocean tidal loading that affects some inland areas significantly (Martens et al., 2019). It is our intention to further elaborate on those terms. We will also improve ionospheric correction by performing estimation per swath rather than using single average parameters frame-wise.

We observe large ionospheric signal in  $\Delta a$  values at the end of the Solar Cycle 24 peak, which are not fully corrected, which is most apparent for ascending (dusk) frames before 2017 in Fig. 1. We expect similar effects in the upcoming years due to the next solar cycle (Pesnell, W. Dean, 2020).

Our observations show an overall along-track motion trend for descending frames, of a higher velocity than expected by the ITRF2014 plate motion model. While northwards motion estimates provide a relatively good fit to the values predicted by the plate motion model, the eastwards component has a large bias. This is especially true after ionospheric correction, which increases the estimated eastward velocity component over most of the Alpine-Himalayan belt region by median of 12.5 mm/year. We admit this bias could be induced by our processing approach and should be further investigated.

The coregistration procedure aims to provide  $\Delta a$  estimates in the precision of up to 7 mm (0.0005 pixels). Due to the cascade strategy of using a frame epoch close in time to estimate spectral diversity, previously resampled to the reference epoch, often with support by data from another such epoch, coregistration errors will propagate in time. We did not
 implement an approach to reduce the error propagation as in (Fattahi, Agram, & Simons,
 200 2017).

Our investigation on the updated orbits in version 1.7 confirms that we can use the reported 39 mm along-track offset of the GPS antenna reference point directly, to perform correction of  $\Delta a$  values after the update of orbits since 2020-07-30, and thus increase the number of data samples, for better estimation of the along-track velocity. Evaluation of the offset in slant range should be also possible, considering the satellite geometry and distance between central points of the GPS and SAR antennas.

## 207 7 Conclusions

We demonstrate the possibility of recovering precise measurements of large-scale hor-208 izontal motion using azimuth shifts estimated from Sentinel-1 data, using average values 209 in 250x250 km cells. The precision significantly improves after incorporating corrections 210 for solid-earth tides and ionospheric propagation, especially at lower latitudes. However, 211 our corrections only remove a part of the non-deformation component of  $\Delta a$  values, partly 212 due to imperfections of the models we use, and the large averaging over input parameters. 213 Indeed, an updated approach per frame swath could significantly improve the ionospheric 214 correction and will be investigated in future work, or in the final version of this article. 215

The  $\Delta a$  estimations can be considered along-track measurements that are attached to 216 the global Earth-centered Earth-fixed no-net-rotation framework by GPS-based positioning 217 of Sentinel-1 satellites. Our  $\Delta a$ -based velocity estimates have average 2-sigma precision of 218 around 4 mm/year northwards and 20 mm/year eastwards (see Table 1). They fit reasonably 219 well with the ITRF2014 plate motion model, although there are discrepancies, some of 220 which are expected at plate boundary deformation zones, and some of which are not; there 221 is shift towards the east over the subset of the Alpine-Himalayan belt, on the other hand 222 our estimates correctly identifies a westward motion of Anatolia that is not included in the 223 model. 224

We investigate and incorporate corrections due to new orbit ephemerides products, which shift  $\Delta a$  values after 2020-07-30 by -39 mm, allowing for a seamless combination of all available  $\Delta a$  values for precise velocity estimates. We estimate the offset as  $-39.9 \pm 3.7$ mm at 2-sigma error. We also observe an increased precision of  $\Delta a$  using the updated orbits, improved by 13.9% or by 4.7 mm in RMSE.

Further research should analyse across-track (range) measurements in combination to the along-track InSAR approach, and include use of other models to decrease along-track residuals - primarily a polar motion and ocean loading tide model, as well as ECMWFderived tropospheric delays, for example by COMET GACOS products (Yu et al., 2018). Finally, the new Sentinel-1 external products known as S1\_ETAD (Gisinger et al., 2021) should provide valuable correction data for Sentinel-1 bursts, including ionospheric, solidearth tide, ocean tide load and other corrections.

We provide data used within this article as an indexed supplementary material, however we also aim to share the original  $\Delta a$  and  $\Delta r$  values within the community in a systematic manner, as an additional new open product of the COMET LiCSAR system.

## 240 Acknowledgments

This work is supported by The Natural Environment Research Council large grant, "Looking inside the continents from Space" (NE/K010867/1). COMET is the NERC Centre for the Observation and Modelling of Earthquakes, Volcanoes and Tectonics, a partnership between UK Universities and the British Geological Survey. This work contains modified Copernicus Sentinel-1 data [2014-2021] analysed by COMET LiCSAR system at JASMIN, the UK's collaborative data analysis environment (https://jasmin.ac.uk), and ARC4, part of the High Performance Computing facilities at the University of Leeds, UK. We used available open-source models to perform corrections on solid-earth tides and ionosphere, and ITRF2014 plate motion model values extracted from UNAVCO website.

The output datasets described here, including an interactive KMZ layer (Google Earth) of  $\Delta a$  time series plots per frame, are available under Creative Commons 4.0 license from DOI:???/zenodo.???? (will be included during final submission). The processing code is available under GNU GPL 3.0 license from https://gitlab.com/comet\_licsar/daz.

The authors wish to thank Dr. Heike Peter, Dr. Pawan Piromthong, Dr. Chris Rollins and Dr. Jonathan Weiss for helpful discussions.

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