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# Overestimation and adjustment of Antarctic ice flow velocity fields reconstructed from historical satellite imagery

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**Abstract.** Antarctic ice velocity maps describe the ice flow dynamics of the ice sheet and are one of the primary components used to estimate the Antarctic mass balance and contribution to global sea level changes. In comparison to velocity maps derived from recent satellite images of monthly to weekly time spans, historical maps, from before the 1990s, generally cover longer time spans, e.g., over 10 years, due to the scarce spatial and temporal coverage of earlier satellite image data. We found velocity overestimations (OEs) in such long-span maps that can be mainly attributed to velocity gradients and time span of the images used. In general, they are less significant in slow-flowing grounded regions with low spatial accelerations. Instead, they take effect in places of high ice dynamics, for example, near grounding lines and often in ice shelf fronts. Velocities in these areas are important for estimating ice sheet mass balance and analyzing ice shelf instability. We propose an innovative Lagrangian velocity-based method for OE correction without the use of field observations or additional image data. The method is validated by using a set of ground truth velocity maps for the Totten Glacier and Pine Island Glacier which are produced from high-quality Landsat 8 images from 2013 to 2020. Subsequently, the validated method is applied to a historical velocity map of the David Glacier region from images from 1972–1989 acquired during Landsat 1, 4, and 5 satellite missions. It is demonstrated that velocity overestimations of up to 39 m a<sup>-1</sup> for David Glacier and 195 m a<sup>-1</sup> for Pine Island Glacier can be effectively corrected. Furthermore, temporal acceleration information, e.g., on basal melting and calving activities, is preserved in the corrected velocity maps and can be used for long-term ice flow dynamics analysis. Our experiment results in the Pine Island Glacier (PIG) show that OEs of a 15-year span can reach up to  $1300 \,\mathrm{m \, a^{-1}}$  along the grounding line and cause an overestimated grounding line (GL) flux of 11.5 Gt a<sup>-1</sup> if not corrected. The magnitudes of the OEs contained in both velocity and mass balance estimates are significant. When used alongside recent velocity maps of 1990s-2010s, they may lead to underestimated long-term changes for assessment and forecast modeling of the global climate change impact on the Antarctic ice sheet. Therefore, the OEs in the long-span historical maps must be seriously examined and corrected. We recommend that overestimations of more than the velocity mapping uncertainty  $(1\sigma)$  be corrected. This velocity overestimation correction method can be applied to the production of regional and icesheet-wide historical velocity maps from long-term satellite images.

### 1 Introduction

Ice flow velocity fields on the Antarctic ice sheet (AIS) have been mapped by using synthetic-aperture radar (SAR) and optical satellite images to study ice-sheet-wide ice flow dynamics and AIS responses to global climate changes (Rignot et al., 2011a; Gardner et al., 2018; Shen et al., 2018; Greene et al., 2020). An important direct use of such velocity fields is to estimate the ice discharge from the AIS to the Southern Ocean and perform mass balance analyses (Shepherd et al., 2012, 2018; Gardner et al., 2018; Shen et al., 2018; Rignot et al., 2019). Any errors in the reconstructed velocity fields can cause uncertainties in the estimated AIS mass balance

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and associated contribution to global sea level (GSL) change (Rignot et al., 2011b; Church et al., 2013; DeConto and Pollard, 2016; IPCC, 2019).

The state of the reconstructed velocity fields can be represented by a series of velocity maps that are derived from periodical satellite images. The variations of the available satellite images in both spatial and temporal coverage determine the extent and time span of the velocity maps. While icesheet-wide annual velocity maps, e.g., in the Inter-mission Time Series of Land Ice Velocity and Elevation (ITS\_LIVE) project (Gardner et al., 2018, 2019), have been produced from recent satellite images (Storey et al., 2014; Lillesand, 2015; Li and Roy, 2017; Sabins and James, 2020), regional velocity maps at a seasonal or monthly scale have been generated from optical and SAR images (e.g., Landsat and Sentinel; Frezzotti et al., 1998, 2000; Nakamura et al., 2010; Zhou et al., 2014; Greene et al., 2017, 2018, 2020; Moon et al., 2021; Wulder et al., 2019). Furthermore, a weekly ice velocity mapping scheme based on multi-mission satellite images was proposed in Altena and Kääb (2017). However, owing to low image quality, large geolocation errors, and low temporal and spatial coverage, satellite images prior to 1990 are generally less available; appropriate images for ice-sheetwide or large regional velocity mapping with a shorter time span (e.g., seasonal or annual), especially from 1960s and 1970s, are scarce. Therefore, earlier velocity maps have been produced with a limited extent and a longer time span. For example, combinations of first-generation film-based AR-GON images of 1963 (Ruffner, 1995; Kim, 2004), early Landsat MSS images of 1970s, and TM images of 1980s (Chander et al., 2009) have been used to create regional velocity maps with a time span ranging from 1 to 23 years (Bindschadler and Scambos, 1991; Bindschadler et al., 1996; Wang et al., 2016; Cheng et al., 2019; Rignot et al., 2019), although the unique case of a 1963 velocity map of the Rayner Glacier from two ARGON stereo image pairs has been presented (Li et al., 2017). Such a long time span is problematic when we use the feature-matching technique for velocity mapping. For example, at time 1 a feature, with an initial velocity  $v_0$  at the first location, is taken in the first image. The same feature is tracked in the second image taken at time2 after traveling at the velocity  $v_0$  and an acceleration a for a time span of  $\Delta t$  (time2-time1). Thus, the velocity  $v = v_0 + a \Delta t$  increases along with the time span  $\Delta t$  if acceleration a exists. Given a constant acceleration, the velocity can be overestimated if the time span is long or the velocity overestimation is proportional to the time span. With a 10-year span, an overestimation of  $\sim 70 \, \mathrm{m \, a^{-1}}$  (or  $\sim 10 \, \%$ ) was estimated for an area near the grounding line of Totten Glacier (Fig. A1) (Chad A. Greene, personal communication, 2020). Berthier et al. (2003) compensated for the overestimations in a Mertz Glacier mapping study with an image span of 11 years by assigning the overestimated velocities to middle points of traveled segments. This technique should have corrected a large portion of the overestimation given the relatively weak

spatial velocity gradient along the main trunk of the glacier. Although it has not been brought to further attention in publications, given its nature and magnitude, this velocity overestimation issue should be fully understood, and a comprehensive correction method should be developed so that corrected historical velocity maps can be analyzed alongside modern maps to create a long record of cohesive ice flow dynamics. Furthermore, this capability of building a long record of AIS ice flow dynamics is important for estimation of long-term AIS mass balance and prediction of the future GSL contribution (Rignot et al., 2019).

This study is a part of our efforts to develop an ice velocity map of East Antarctica for 1963 to 1989 (Li et al., 2017; Ye et al., 2017; Cheng et al., 2019). In this paper we prove the existence of ice velocity overestimation in longterm historical velocity maps and present an innovative correction method. The proposed correction method is based on the Lagrangian velocity that can be calculated from the overestimated velocity map itself and thus does not require any field observations or additional satellite images. We used a set of ground truth velocity maps with time spans of 1 to 7 years derived from recent Landsat 8 images of 2013 to 2020 from the Totten Glacier (TG), East Antarctica, to validate the correction method. We then applied the validated method to a historical velocity map in the David Glacier region, East Antarctica, which was produced from images from 1972 to 1989 acquired during satellite missions of Landsat 1, 4, and 5. We show that the 17-year velocity overestimation can be successfully corrected to within the uncertainty  $(1\sigma)$  of the 1-year map. Another experiment at the Pine Island Glacier (PIG), one of the most dynamic glaciers in Antarctica, was carried out to demonstrate that the overestimation correction method can effectively adjust the overestimated velocities as large as  $195 \,\mathrm{m\,a^{-1}}$ , while preserving the velocity change signature caused by temporal accelerations due to basal melting and calving activities for long-term ice flow dynamics analvsis.

### 2 Methods

### 2.1 The velocity overestimation issue

We describe an acceleration-induced overestimation using a typical scenario in AIS (Fig. 1a) where ice flow accelerates over a long slope from several glaciers originating from the inland interior, running through the main trunk, and discharging to the ocean (Bamber et al., 2000; Cuffey and Paterson, 2010; Rignot et al., 2011a). In order to quantify the velocity overestimation, for any point  $P_0(x_0, y_0)$  on a glacier (Fig. 1a), we define its velocity in two different frameworks, Eulerian and Lagrangian (Chu and Fan, 2014; Chenillat et al., 2015; Altena and Kääb, 2017). First, the velocity in the Eulerian framework (E velocity) is defined as  $V^E = D/dt$ , the straight-line distance (D) divided by the time span (dt). Note

that for simplicity in equation derivation and discussion, we interchange a vector with its scalar; thus, velocity and speed are not strictly distinguished in this paper. Hence a velocity field described by a velocity map is also defined in the Eulerian framework. In reality, the start point of D is measured on the first image and end point on the second image; the two images are taken with a time span of dt apart (Li, 1998; Mc-Glone, 2013). The reconstructed velocity map is stored as velocity components  $(V_x^E, V_y^E)$  in the x and y directions, from which the velocity field can be reconstructed. The velocity, represented by a velocity map, may indicate an instantaneous or average velocity depending on the time span dt (Cuffey and Paterson, 2010; Rignot et al., 2011a). Second, the velocity in the Lagrangian framework (L velocity) is defined as  $V^L = S/dt$ , the curved distance traversed along the flow line (S) divided by the time span (dt; Altena and Kääb, 2017). Given a time span and an initial point  $P_0(x_0, y_0)$  (Fig. 1a), its L velocity can be determined by tracking the point using a velocity map (Chu and Fan, 2014; Chenillat et al., 2015). Operations in the Lagrangian framework are often performed to estimate advected ice features (Altena and Kääb, 2017) or forecast future events in earth science applications, e.g., mud and debris flow of landslides (Debella-Gilo and Kääb, 2013; Feng et al., 2016), ocean currents at different depths (Glenn et al., 2016; van Sebille et al., 2018), and storm center motion of a typhoon or hurricane (Cram et al., 2007; Euler et al., 2019).

Assume that we use a set of n+1 images (Image<sub>i</sub>,  $i=0,1,\ldots n$ ) that are taken with a time interval of 1 year to produce n velocity maps,  $V_{0-i}$ , each derived from an image pair (Image<sub>0</sub>, Image<sub>i</sub>). The time span of the maps increases from 1 to n years. These maps are defined in the Eulerian framework (Fig. 1b). For  $P_0(x_0, y_0)$  its location after i years,  $P_i(x_i, y_i)$ , is determined in Image<sub>i</sub>; its Eulerian distance  $D_{0-i}$  is measured using both Image<sub>0</sub> and Image<sub>i</sub> ( $i=1,2,\ldots n$ ). Consequently, the E velocity of a i-year span ( $\Delta t_{0-i}$ ) at  $P_0(x_0, y_0)$  is

$$V_{0-i}^E = \frac{D_{0-i}}{\Delta t_{0-i}}. (1)$$

As the time span increases at a fixed rate of 1 year, the traversed straight-line distance  $D_{0-i}$  (red lines in Fig. 1b), correspondingly E velocity  $V_{0-i}^E$ , increases rapidly because of the acceleration over the traverse (Fig. 1c). In principle, every  $V_{0-i}^E$  ( $i=1,2,\ldots n$ ) value represents the velocity at the same point  $P_0(x_0,y_0)$  (Fig. 1a) in these n velocity maps. In the cases where Imagei was not available and thus the maps  $V_{0-i}$  ( $i=1,\ldots n-1$ ) were not produced, we only had the map  $V_{0-n}$  with the longest span of n years. It is obvious that at  $P_0(x_0,y_0)$  its n-year velocity  $V_{0-n}^E$  is significantly larger than the 1-year velocity  $V_{0-1}^E$  (Fig. 1c). In general, we define the velocity overestimation of a i-year E velocity as

$$OE_{0-i} = V_{0-i}^E - V_{0-1}^E. (2)$$

Here we use a velocity map of a 1-year span as a baseline (overestimation-free) throughout the paper for simplicity, which can be changed for glacier regions of different ice flow dynamics (spatial acceleration, mainly caused by bed topography and slopes). For example the baseline span is 1 year for TG in Experiment 1 and 3 months for PIG in Experiment 3. We require that the overestimation of the baseline map is negligible or smaller than  $\sigma$  (velocity mapping uncertainty).

# 2.2 Overestimation correction based on Lagrangian velocity

We propose a method for correction of overestimation in a long-term velocity map based on its Lagrangian velocities. The velocity field described by the baseline map is used to calculate trajectories of ice mass and L velocities. The objective is to calculate the overestimation  $OE_{0-i}$  in  $V_{0-i}^E$  ( $i=2,\ldots n$ ) so that these velocities of longer spans are corrected using Eq. (2) and describe the same velocity field as the 1-year  $V_{0-1}^E$ .

For point  $P_0(x_0, y_0)$  in Fig. 1a, the E velocity  $V_{0-i}^E$  (i = 1, 2, ..., n) is presented by individual bars in Fig. 2. Correspondingly its L velocity of i-year span can be calculated as (Halliday et al., 2013)

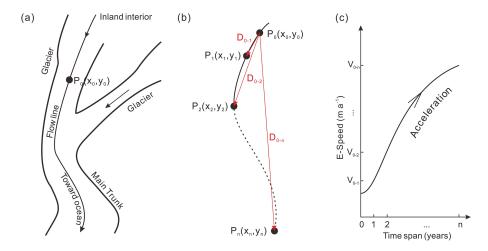
$$V_{0-i}^{L} = \frac{S_{0-i}^{L}}{\Delta t_{0-i}},\tag{3}$$

where  $S_{0-i}$  is the Lagrangian trajectory (*L* trajectory) distance (i = 1, 2, ..., n):

$$S_{0-i}^{L} = \int_{t_0}^{t_i} V_{0-1}^{E}(t) dt.$$
 (4)

Within a baseline time span (e.g., 1 year or shorter), the difference between the E distance and L distance may be considered within the mapping uncertainty  $(1 \sigma)$ :  $V_{0-1}^E \approx V_{0-1}^L$ . Beyond that span, the curved trajectory distance is longer than the straight distance  $(S_{0-i} \geq D_{0-i},$  see Fig. 1b); thus, we have  $V_{0-i}^L \geq V_{0-i}^E$  ( $i=2,3,\ldots n$ ). An approximation of the increased difference between  $V_{0-i}^L$  and  $V_{0-i}^E$  is presented by the trends of L velocity (blue line) and E velocity (red line), which start from the same velocity at  $V_{0-1}^L$  (or  $V_{0-1}^E$ ) and reach the maximum difference between  $V_{0-n}^L$  and  $V_{0-n}^E$  at the end (Fig. 2).

Premise I. Within a baseline time span (e.g., 1 year or shorter) each segment (from  $P_{i-1}$  to  $P_i$  in Fig. 1b) is relatively short, and the E and L velocity difference is smaller than  $\sigma$ . Furthermore, over the map span of n years (e.g., 5–10 years or longer) the accumulated E and L distances along the entire trajectory do not deviate significantly from each other, so that the maximum velocity difference in the Lagrangian and Eulerian frameworks (end points of blue and red lines in Fig. 2) is limited within a threshold  $(V_{0-n}^L - V_{0-n}^E \leq k\sigma)$ , where k is a constant and  $\sigma$  is the velocity mapping uncertainty.



**Figure 1.** Illustration of acceleration-induced overestimation in a velocity map derived from a satellite image pair with a long time span: (a) schematic scene of accelerated ice flow in a glacier–ice-shelf system in AIS, (b) calculation of E velocities at  $P_0(x_0, y_0)$  with an equal increment in time span (1 year), and (c) increase in E velocity at the same point  $P_0(x_0, y_0)$  as the time span increases – the cause of the acceleration-induced velocity overestimation.

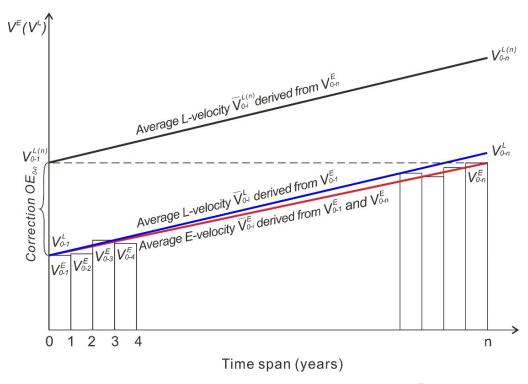


Figure 2. Derivation of equation for overestimation correction using L velocity. Eulerian velocities  $V_{0-i}^E$  ( $i=1,2,\ldots n$ ) are represented as bars. The red line is the average Eulerian velocity  $\overline{V}_{0-i}^E$  of  $V_{0-i}^E$  and  $V_{0-n}^E$ . The blue line is the average Lagrangian velocity  $\overline{V}_{0-i}^L$  of  $V_{0-1}^L$  and  $V_{0-n}^L$  derived from  $V_{0-n}^E$ . The black line is the average Lagrangian velocity  $\overline{V}_{0-i}^L$  of  $V_{0-i}^L$  and  $V_{0-n}^L$  derived from  $V_{0-n}^E$ .

In reality, the available historical images may only allow us to produce an E velocity map with the longest time span, i.e.,  $V_{0-n}$ , which leads to the maximum overestimation as defined in Eq. (2). Based on this map  $V_{0-n}$  of n-year span, the i-year span L velocity (black line in Fig. 2) is defined as

follow:

$$V_{0-i}^{L(n)} = \frac{S_{0-i}^{L(n)}}{\Delta t_{0-i}} \text{ and}$$
 (5)

$$S_{0-i}^{L(n)} = \int_{t_0}^{t_i} V_{0-n}^E(t_i) dt.$$
 (6)

Consequently,  $V_{0-1}^{L(n)}$  (start point of black line in Fig. 2) is set to be equal to  $V_{0-n}^{E}$ .

Premise II. Within the time span of n years (e.g., over 5–10 years), the velocity field described by  $V_{0-1}^E$  and  $V_{0-n}^E$  does not change significantly, so that the line between  $V_{0-n}^{L(n)}$  and  $V_{0-1}^{L(n)}$  (black line in Fig. 2) and that between  $V_{0-n}^L$  and  $V_{0-1}^L$  (blue line in Fig. 2) are approximately parallel to each other. Accordingly, the difference between their simple averaged accelerations is within a threshold  $(|\overline{a}(V^{L(n)}) - \overline{a}(V^L)| \le k' \frac{\sigma}{\Delta t_n})$ , where k' is a constant and  $\sigma$  is the velocity mapping uncertainty, and

$$\overline{a}\left(V^{L(n)}\right) = \frac{V_{0-n}^{L(n)} - V_{0-1}^{L(n)}}{\Delta t_n}, \overline{a}\left(V^L\right) = \frac{V_{0-n}^L - V_{0-1}^L}{\Delta t_n}.$$
 (7)

Given the long-span velocity  $V_{0-n}^E$  we can calculate the n-year L velocity  $V_{0-n}^{L(n)}$ . Premise II measures the degree of spatial acceleration invariance over the n-year span (parallelity between black and blue lines in Fig. 2). Thus, it is a necessary condition for using the difference of  $V_{0-n}^{L(n)} - V_{0-1}^{L(n)}$ , or  $\sim (V_{0-n}^{L(n)} - V_{0-n}^E)$ , from the n-year-span map to substitute for the difference of  $V_{0-n}^L - V_{0-1}^E$  from the 1-year-span map; furthermore, based on Premise I the overestimation can be computed as

$$OE_{0-n} = V_{0-n}^E - V_{0-1}^E = V_{0-n}^L - V_{0-1}^E = V_{0-n}^{L(n)} - V_{0-n}^E.$$
 (8)

Consequently, using the map with the longest time span of n years, we can effectively go back to  $V_{0-1}^E$  using a correction term defined as correction  $=V_{0-n}^E-V_{0-n}^{L(n)}$ . In principle, Premise I presents a sufficient condition,

In principle, Premise I presents a sufficient condition,  $V_{0-n}^L - V_{0-n}^E \le k\sigma$ . In case Premise I does not hold, for example, because of temporal accelerations induced by calving and basal melting activities (Experiment 1 and Experiment 3), we are still able to correct the OE portion induced by spatial acceleration and preserve the uncorrected OE portion induced by temporal acceleration in the residual  $\varepsilon$  for ice flow dynamics change analysis (Fig. A2).

Overestimation correction theorem. Assume that the necessary condition in Premise II is met; spatial-acceleration-induced overestimations in long-time-span velocities  $V_{0-n}^E$  can be corrected or reduced using the following correction term, regardless of temporal acceleration:

$$V_{0-1}^E = V_{0-n}^E + \text{correction} + \varepsilon, \tag{9}$$

correction = 
$$V_{0-n}^E - V_{0-n}^{L(n)}$$
. (10)

If Premise I holds, correction  $\approx -OE_{0-n}$ ; otherwise, |correction|  $< |OE_{0-n}|$ , preserving the velocity increases induced by temporal accelerations in the residual term  $\varepsilon$  (Fig. A2).

Additionally, given n discrete E velocities  $V_{0-i}^{E}$  (i = 1, 2, ..., n; Fig. 2), the acceleration can be estimated using a linear regression model. Its least squares (LS) estimation is (Montgomery et al., 2021)

$$a(V^{E}) = \frac{n\sum i V_{0-i}^{E} - \sum i \sum V_{0-i}^{E}}{n\sum i^{2} - (\sum i)^{2}}.$$
 (11)

On the other hand, this acceleration can also be approximated by an averaged acceleration using the initial and end velocities:

$$\overline{a}(V^E) = \frac{V_{0-n}^E - V_{0-1}^E}{\Delta t_n}.$$
(12)

The two acceleration estimates can be compared to determine if the averaged acceleration be used in the event that the intermediate velocities  $V_{0-i}^E$   $(i=2, \ldots n-1)$  are not available. The red line is then used instead of  $V_{0-i}^E$   $(i=1,2,\ldots n;Fig. 2)$ .

### 2.3 Implementation aspects

Trajectory and L velocity computation. The computation of the L trajectory distances  $S_{0-i}^L$  and  $S_{0-i}^{L(n)}$  involves the numerical implementation of the integral of the velocity field from  $P_0(x_0, y_0)$  to  $P_i(x_i, y_i)$  along a flow line on the maps of  $V_{0-1}$  and  $V_{0-n}$  using Eqs. (4) and (6), respectively. We select an area of the velocity map of 2013 of Pine Island Glacier, West Antarctica (Fig. 3a and b; Gardner et al., 2018), to show the details of integral implementation. The velocity map has a time span of 1 year and a resolution of 240 m. At each grid cell the velocity is stored according to its components  $(V_r^E, V_v^E)$ . We preprocess each component separately by using a moving window smoothing filter to reduce noise. A 10-year trajectory goes through an ice flow profile from  $P_0$  at 2560 m a<sup>-1</sup> to  $P_{10}$  at 3935 m a<sup>-1</sup> with an average acceleration of  $138 \,\mathrm{m\,a^{-2}}$ . As shown in the enlarged area for the annual trajectory from  $P_2$  to  $P_3$ (Fig. 3c), the integral is carried out by accumulation of subtrajectories (between white dots) with a monthly increment. The sub-grid positions of the monthly segments are interpolated for integration of the overall L distance. Finally, we have the result of  $V_{0-1}^E = 2560 \,\mathrm{m\,a^{-1}}$ ,  $S_{0-10}^L = 34960 \,\mathrm{m}$ , and  $V_{0-10}^L = 3496 \,\mathrm{m\,a^{-1}}$ , compared to  $V_{0-10}^E = 3491 \,\mathrm{m\,a^{-1}}$ . The 10-year overestimation  $(V_{0-10}^E - V_{0-1}^E)$  at  $P_0$  is approximately  $931 \,\mathrm{m\,a^{-1}}$  (36%). Examples of overestimation correction in PIG are given in Experiment 2 and the Discussion section.

Denoising and map quality. The quality of the reconstructed velocity field is important for L trajectory calculation and subsequent overestimation correction. Compared to the above Landsat 8 velocity map, velocity maps derived from historical images may have higher uncertainties due to the low image quality that is inherent in the satellite images of early missions (Kim, 2004; Ye et al., 2017). In some

cases, there may be even gaps in the velocity map because image features may not be tracked by using the optical flow or feature-matching techniques when ice features disappear through glaciological processes or large advection motion in ice shelf fronts (Scambos et al., 1992; Schenk, 1999; Mc-Glone, 2013). Therefore, preprocessing of the velocity maps should be performed to eliminate outliers; then interpolation may be applied to fill small gaps so that the integral of L trajectories and the calculation of L velocities can be realized. Despite the sub-pixel accuracy of the orthorectification of historical images and the sub-pixel precision of the cross-correlation-based feature-matching method, the reconstructed velocity maps may still be subject to a systematic bias called pixel locking, which results in matched features moving close to integer pixel positions (Shimizu and Okutomi, 2005). This pixel level bias may introduce additional uncertainties to areas of large velocity gradients. The pixel-locking effect can be reduced by using a coarse-tofine hierarchical feature-matching method as demonstrated in the Antarctic and planetary environments (Debella-Gilo and Kääb, 2011; Li et al., 2011; Heid and Kääb, 2012; Li et al., 2017).

### 3 Results

# 3.1 Experiment 1: validation of the correction method at Totten Glacier, East Antarctica

### 3.1.1 Preparation of validation velocity maps

This experiment is designed to validate the proposed velocity overestimation correction method using the velocity map of Totten Glacier (TG) (Fig. 4a; Gardner et al., 2019), which is one of the most active glaciers in East Antarctica and has been experiencing significant mass loss since 1989 (Li et al., 2017; Gardner et al., 2018; Shen et al., 2018). Figure 4b shows an ice flow velocity map of TG from 2013 from ITS\_LIVE (Gardner et al., 2019). This 240 m resolution velocity map was derived from the 15 m resolution Landsat 8 images with a 1-year span (January to December 2013). Under the primary forces of gravity, margin shear, basal drag, and others (Bamber et al., 2000; Cuffey and Paterson, 2010; Rignot et al., 2011a), the ice flow accelerates over a path of 130 km along the centerline at a velocity of  $\sim 600 \, \text{m a}^{-1}$  upstream of the grounding line to  $\sim 2300 \, \text{m a}^{-1}$  at the ice shelf terminus

In order to validate the velocity overestimation correction method, we need to determine if premises I and II are fulfilled. This further requires us to have E velocity from the map series of  $V_{0-i}$  ( $i=1,2,\ldots n$ ), which are not readily available except the 1-year map of 2013 in Fig. 4b. To avoid lower-quality historical velocity maps that may influence the effectiveness of the validation, we use the earliest available high-quality Landsat 8 images from 2013 to 2020 to pro-

duce velocity maps  $V_{2013-i}$  ( $i=2014,\ldots 2020$ ). The validation should also consider velocities of areas with different ice flow dynamics. Thus, we select five areas (white rectangles in Fig. 4) to produce smaller maps ( $\sim 10 \text{ km} \times \sim 20 \text{ km}$ ), which contain 7-year trajectories and represent different ice flow dynamic characteristics of the ice shelf, i.e., Area 1 close to the grounding line, areas 2 and 4 along the main trunk, Area 5 on the tributary flow, and Area 3 near a suture zone between the main and tributary glaciers.

Using the matching method adapted for ice surface features (Li et al., 2011, 2017), we produced 35 smaller-sized velocity maps  $V_{2013-i}$  ( $i=2014,\ldots 2020$ ) for seven time spans and five areas. Information about the Landsat 8 images used and the acquisition dates are given in Table A1. The OE-free velocity maps of 1-year  $V_{2013-2014}$  of all five areas are illustrated in panels 1a–5a of Fig. 5. The corresponding overestimated maps of 7-year span  $V_{2013-2020}$  are shown in panels 1b–5b.

The uncertainty of the maps is estimated from two error sources: the geolocation error of the satellite images  $\sigma_{Ref}$  and the error of feature matching  $\sigma_{Match}$ :

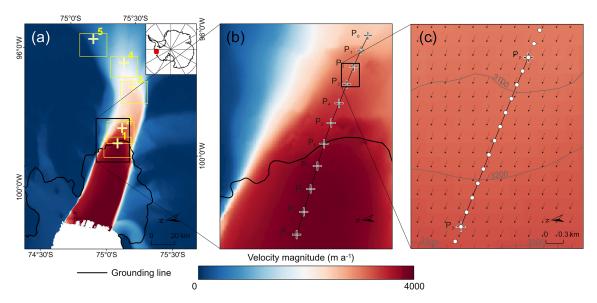
$$\sigma_{\text{Velocity}} = \frac{1}{\Delta t} \sqrt{\sigma_{\text{Ref}}^2 + \sigma_{\text{Match}}^2},\tag{13}$$

where  $\sigma_{\rm Ref}$  for Landsat 8 images is 18 m (Storey et al., 2014) and  $\sigma_{\rm Match}$  is set to 8 m,  $\sim$  0.5 pixel (Li, 1998; Li et al., 2017). Thus, the uncertainty of the measured E distance is 20 m. Consequently, the velocity uncertainty  $\sigma_{\rm Velocity}$  becomes 20 m a<sup>-1</sup> and 3 m a<sup>-1</sup> for a 1-year map and a 7-year map, respectively.

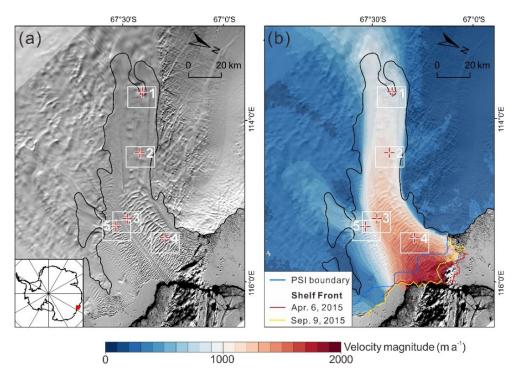
In each area, we select an ice feature in the upper stream part in 2013. Its locations in the following 7 years are determined from the satellite images of 2014–2020 using the feature-matching method and shown as red triangles in the maps (Fig. 5). Correspondingly, we track its annual trajectory locations from the 1-year and 7-year maps using Eqs. (4) and (6) and plotted them as blue dots and black crosses, respectively, on the maps. Using these trajectories in the Eulerian and Lagrangian frameworks we calculate  $V^E_{2013-i}$ ,  $V^L_{2013-i}$ , and  $V^{L(7)}_{2013-i}$  and plot them as red, blue, and black curves in panels 1c–5c, respectively.

### 3.1.2 Validation of premises I and II

In general, the L velocities from the 1-year map (blue curves in Fig. 5) are mostly faster than the corresponding E velocities (red curves). To validate Premise I we further examine the L velocity  $V_{2013-2020}^L$  and E velocity  $V_{2013-2020}^E$  of the 7-year span, i.e., differences between the end points of blue and red curves in all five areas (panels 1c–5c of Fig. 5). They are less than or equal to 8 m a<sup>-1</sup> (( $V^L - V^E$ )<sub>2013-2020</sub> in Table 1), except -31 m a<sup>-1</sup> in Area 4, which was influenced by a calving event in 2015 as mentioned in the Discussion section. The averaged difference of all five areas is  $-4 \pm 16$  m a<sup>-1</sup>, that is, within 20 m a<sup>-1</sup>, the uncertainty ( $1\sigma$ ) of the 1-year velocity



**Figure 3.** Implementation of numerical integral and L velocity calculation in Pine Island Glacier, West Antarctica: (a) black rectangle indicates the area of 10-year trajectory in panel (b), numbered yellow rectangles with crosses are five selected areas in Experiment 3 (Fig. A3), and background is a 1-year velocity map (Gardner et al., 2018); (b) enlarged trajectory area with annual points from  $P_0$  to  $P_{10}$ ; and (c) numerical integral of the third-year sub-trajectory from  $P_2$  to  $P_3$  with a monthly increment.



**Figure 4.** Totten Glacier as an example for the validation of the velocity overestimation correction method: (a) the Totten Glacier region and five areas (white rectangles) selected in different parts of the ice shelf; background is Landsat 8 image of 3 December 2013; black line is grounding line from Rignot et al. (2011c); and (b) velocity map of Totten Glacier of 2013 (Gardner et al., 2018); red and yellow lines are the shelf front of 6 April and 9 September 2015, respectively; light blue line is the PSI boundary (Fürst et al., 2016).

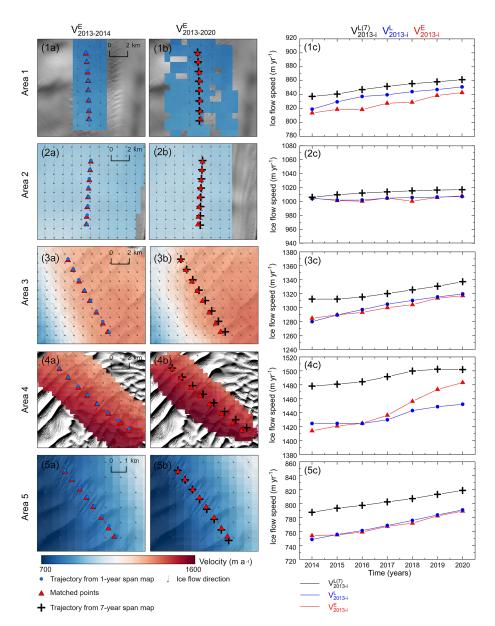


Figure 5. Velocities in five areas (rectangles in Fig. 4) of the Totten Glacier are used to validate Premises I and II. Panels (1a)–(5a) show the reconstructed 1-year velocity maps  $V_{2013-2014}$  in the areas; matched points (red triangles) are used to map E velocity  $V_{2013-i}^E$  ( $i=2014,\ldots$ , 2020) (red lines in panels 1c–5c); points along the flow line (blue dots) are tracked from the 1-year maps and used to calculate E velocity  $V_{2013-i}^E$  (blue lines in panels E). Similarly, panels (1b)–(5b) illustrate the reconstructed 7-year velocity maps E013–2020 in the areas with the matched points (red triangles) for E velocity E17 (black lines in panels E10. In each area (panels E20) the difference between red and blue lines increases with time but is limited within E2013 at the end (Premise I), except a large E3 in Area 4 because of the effect of a calving event; the black line is above the blue line due to the spatial-acceleration-induced OE over 7-year span, but they are relatively parallel (Premise II), and thus a correction can be estimated.

map (2013–2014) that is considered OE-free. Consequently, the conditions in Premise I are met.

For each area we calculated a least squares acceleration estimate  $\mathbf{a}(V_{2013-i}^{L(7)})$  of the 7-year L velocity (black curves in panels 1c–5c of Fig. 5) over all years (i=2013, 2014, ... 2020) using Eqs. (11); then we calculated an av-

erage acceleration  $\overline{\mathbf{a}}\left(V_{2013-2020}^{L(7)}\right)$  using Eq. (12) based only on the velocities of the beginning and end years (2013 and 2020). In all five areas their differences (Table A2) are less than 1.3 m a<sup>-2</sup>, which is less than  $\sigma_a$  (3 m a<sup>-2</sup>), the acceleration uncertainty estimated from the velocity uncertainty of  $20\,\mathrm{m\,a^{-1}}$  (1 $\sigma$ ). That means that within the uncertainty of

Table 1. Velocity and acceleration in Eulerian and Lagrangian frameworks used for validation of the overestimation correction method. "Actual E velocity and OE" lists actually mapped -year and 7-year E velocities and their differences as overestimations in all five areas. Premise I contains 7-year L velocities computed from the 1-year velocity map and corresponding well as their differences, which are used for validating Premise II. "Overestimation correction" presents 7-year L velocities computed from the 7-year map, overestimation corrections, and E velocities and residuals (or errors) after correction. L and E velocity differences, which

correction	$V_{\mathrm{Corr.}}^E$ $\varepsilon$ $(\mathrm{ma^{-1}})$	825 11	9- 666	1297 12	1464 50	759 5	1069 14 304 21
Overestimation correction	Corr. $(m a^{-1})$	-18	6-	-20	-19	-30	-19 7
Ove	$V_{2013-20}^{L(7)}$ (m a <sup>-1</sup> )	861	1017	1337	1502	819	1107
lse II	$\overline{\mathbf{a}}\left(V^{L(7)}\right) - \overline{\mathbf{a}}\left(V^{L}\right) \left  \begin{array}{c} \\ \end{array} \right  (\mathbf{m}\mathbf{a}^{-2}) \left  \begin{array}{c} \end{array} \right $	-1.2	1.2	-2.1	-0.5	-1.5	
Premise II	$\bar{\mathbf{a}} \begin{pmatrix} V^L \\ \mathrm{ma}^{-2} \end{pmatrix}$	4.6	0.4	5.7	3.9	0.9	4.1
	$ \bar{\mathbf{a}} \left( V^{L(7)} \right) \\ (\text{m a}^{-2}) $	3.4	1.6	3.6	3.4	4.5	3.3
Premise I	$(V^L - V^E)_{2013-20}$ (ma <sup>-1</sup> )	8	-1	3	-31	2	
	$\begin{array}{c c} 1 & V_{2013-20}^{L} \\ \hline \end{array}  \text{(m a}^{-1})$	851	1007	1320	1452	791	1084
d OE	OE <sub>Actual</sub> (m a <sup>-1</sup> )	29	3	32	69	35	34
Actual E velocity and OE	$V_{2013-20}^{E}$ (m a <sup>-1</sup> )	843	1008	1317	1483	789	1088
Actual E	$V_{2013-2014}^{E}$ (m a <sup>-1</sup> )	814	1005	1285	1414	754	1054 289
Area		1	2	3	4	S	Mean SD

the 1-year velocity map we can substitute the more rigid LS acceleration  $\bf a$  represented by a black curve in Fig. 5 with the average acceleration  $\bf \bar a$  estimated from the straight line between the beginning and end velocities. Similarly, the differences between accelerations  $\bf a$  and  $\bf \bar a$  of the 1-year L velocity  $V_{2013-i}^L$  in all five areas (Table A2) are also less than 1.5 m a<sup>-2</sup>. Within the uncertainty of the 1-year velocity map we can then substitute  $\bf a$  (blue curve in Fig. 5) with  $\bf \bar a$  (straight line) for the 1-year L velocity  $V_{2013-i}^L$ .

Validation of Premise II requires us to examine the accelerations represented by the 7-year L velocity  $V_{2013-i}^{L(7)}$  (black curves in Fig. 5) and the 1-year L velocity  $V_{2013-i}^{L}$  (blue curves). The relatively well maintained parallelity of the black and blue curves in all five areas shows that the velocity trend in the Lagrangian framework has not changed significantly over the 7 years. This is further quantified by the differences between the averaged 7-year and 1-year accelerations  $\overline{\bf a} \left( V^{L(7)} \right) - \overline{\bf a} \left( V^L \right)$  in Table 1. The differences are within  $\pm 2.1$  m a<sup>-2</sup> in all five areas, with an overall difference of  $-0.8 \pm 1.3$  m a<sup>-2</sup>, which are all within  $\sigma_a$  (3 m a<sup>-2</sup>). Thus, the conditions in Premise II are also fulfilled.

### 3.1.3 Overestimation correction

As shown in the first part of Table 1, we compare the overestimated E velocity  $V_{2013-2020}^E$  in the 7-year map  $V_{2013-2020}$  with  $V_{2013-2014}^E$  in the 1-year map  $V_{2013-2014}$ . Their differences make the actual overestimation  $OE_{Actual}$  in five areas. The mean overestimation of  $34 \, \mathrm{m \, a^{-1}}$  with a range from 3 to  $69 \, \mathrm{m \, a^{-1}}$  is significant in comparison to  $\sigma$  ( $20 \, \mathrm{m \, a^{-1}}$ ). Thus, the overestimation should be corrected. It should be noted that a higher overestimation is expected for historical velocity maps of longer time spans, e.g., 10-15 years.

Using our correction method in Eqs. (9)–(10), we estimated the correction term ( $V_{2013-2020}^E - V_{2013-2020}^{L(7)}$ ) and applied it to the overestimated  $V_{2013-2020}^E$ (Table 1). After the overestimation correction, the corrected velocity  $V_{\text{Corr.}}^E$  from the 7-year span  $V_{2013-2020}^E$  is agreeable to the 1-year span  $V_{2013-2014}^E$  within an average difference of 14 m a<sup>-1</sup> ( $\varepsilon$ , residual), which is less than  $\sigma$  (20 m a<sup>-1</sup>). Overall, the overestimations are effectively corrected.

# 3.2 Experiment 2: velocity overestimation correction in the David Glacier region, East Antarctica

Experiment 2 in the David Glacier region on the Scott Coast, East Antarctica, demonstrates the applicability of the introduced method to correct the overestimation in historical multi-year span velocity maps derived from long-term images from 1972 to 1989. Velocities in this region from 1988 to 1992 were mapped by using GPS and image-feature-tracking techniques (Frezzotti et al., 1998, 2000). A new GPS campaign was carried out in the region during 2005–2006 (Danesi et al., 2008). Velocity changes from 2016 to 2020 were detected using Sentinel-1A SAR images (Moon et al.,

2021). In this experiment we produced a velocity map of the region from 64 Landsat images collected from 1972 to 1989 (Table A3). The image pairs used for velocity mapping have mainly four time spans, namely 1, 15, 16, and 17 years, with their footprints illustrated in Fig. 6a. The Landsat images were first orthorectified using ground control points (GCPs), which were selected at outcrops, blue ice, and ice rises (Ye et al., 2017). Then the velocity field was reconstructed in three steps: (a) measurement of a set of manually selected seed points for representing the initial structural velocity information in stationary, low velocity, and dynamic flow areas; (b) velocity point generation by the ice-surface-feature-based matching method controlled by a triangular irregular network (TIN) model and initiated by the seed points; and (c) dense grid matching for generation of the gridded ice velocity field with a mixed time span from 1972 to 1989. This feature and grid image matching method has been developed for surface mapping from optical satellite images in challenging planetary and polar environments and successfully applied to the reconstruction of the ice velocity fields in the Rayner and Fimbul ice shelves in East Antarctica from historical optical satellite images of 1963-1987 (Li et al., 2011, 2017). The produced velocity map has a grid spacing of 500 m after a kriging interpolation from all matched feature and grid points (Fig. 6b). The uncertainty  $(1\sigma)$  of the velocity points is 4, 31, and 62 m a<sup>-1</sup> for time spans of 15–17 years, 1 year (TM), and 1 year (MSS), respectively.

At all velocity points, including 8564 matched features from the feature-matching process and 59783 grid points from the dense-grid-matching process, we calculated the velocity overestimation values (Fig. 6c). The OEs are generally low on the grounded ice, mostly within  $\pm 4 \,\mathrm{m \, a^{-1}}$ , which are less than the mapping uncertainties  $(1\sigma)$  of different time spans (Fig. 6d and Table 2). The higher OEs ranging from  $\sim 4$  to  $\sim 50 \,\mathrm{m\,a^{-1}}$  are on the ice tongue, ice shelves, and glaciers. We selected a total of 16 points from four glaciers and the inland region to examine detailed OEs in different areas of ice flow dynamics (Fig. 6b and c). The OEs at three points in the inland region (IL1–IL3) are negligible (Table 2). Points DG1-DG6 along the main trunk of the David Glacier present an increasing trend of OEs from 1 to 4 m a<sup>-1</sup> on the ice tongue up to  $36 \,\mathrm{m\,a^{-1}}$  at the ice shelf outlet, as the average Lagrangian acceleration  $\bar{\mathbf{a}}(V^{L(n)})$  increases from 0.1 to  $2.2 \,\mathrm{m\,a^{-2}}$ . However, DG7 is located in a relatively steady velocity area and thus has negligible overestimation. Furthermore, the OE values at the selected points on the smaller glaciers, Reeves Glacier (RG1 and RG2), Priestley Glacier (PG1 and PG2), and Campbell Glacier (CG1 and CG2), range from 0 to 12 m a<sup>-1</sup> and are generally greater than those on the grounded ice. At the velocity points where the OEs are greater than or equal to the velocity mapping uncertainties  $(1\sigma)$ , the corrected velocities are calculated by applying the overestimation corrections.

Overall, for a historical velocity map of 1972–1989 with time spans from 1 to 17 years in the David Glacier region, the

overestimations and corrections mainly occur on the David Glacier and smaller glaciers where accelerations in the spatial domain (not the temporal domain) exist, while those on the grounded ice are non-significant. We recommend that the overestimations that are greater than or equal to the mapping uncertainties  $(1\sigma)$  be corrected.

# 3.3 Experiment 3: velocity overestimation correction at Pine Island Glacier, West Antarctica

We further apply the OE correction method at the Pine Island Glacier, one of the most dynamic glaciers in Antarctica. Four areas (1, 2, 3, and 4) along the main trunk and one area (5) in the margin in PIG are selected (Fig. 3a). The longest time span of 7 years (2013–2020) is determined, restricted by the very high velocity (up to  $\sim 4500 \, \mathrm{m \, a^{-1}}$ ) on the ice shelf. untraceable surface features over long spans, and availability of the high-quality Landsat 8 images. Hence, most of the ice shelf cannot be covered by a 7-year span velocity map, and the five selected areas are near and upstream from the grounding line. The five areas were all mapped with a baseline span of 3 months (panels 1a–5a in Fig. A3) but different longest spans (n years, n = 6, 7, 7, 7, and 3 for the five areas) (panels 1b-5b in Fig. A3) because of difficulties in image feature tracking. Accordingly, in each area one surface feature was selected and tracked for n years to estimate E velocity  $V_{2013-i}^E$ ; its L velocities of  $V_{2013-i}^L$  and  $V_{2013-i}^{L(n)}$  were computed from the 3-month-span and n-year-span maps, respectively. Consequently, the resulting E velocity (red lines), L velocity from the 3-month-span maps (blue lines), and L velocity from the n-span maps (black lines) are illustrated in panels 1c-5c in Fig. A3.

The mapped ground truth data of 3-month- and 7-yearspan velocities in five selected areas showed actual OE values in PIG from  $18 \,\mathrm{m\,a^{-1}}$  in Area 5 of the inland interior to 626 m a<sup>-1</sup> in Area 2 near the grounding line at the glacier outlet (Table 3). Much of these OEs are attributed to the temporal acceleration patterns in panels 1c-5c in Fig. A3 where the tracked E velocities  $V_{2013-i}^{E}$  of red lines are, in the later years, consistently above the L velocities  $V_{2013-i}^{L}$  of blue lines from the 3-month-span maps of 2013. These temporal accelerations were mainly caused by the drastic calving activities in and after 2017 in PIG and continuous basal melting in the Amundsen Sea sector during the study period (Joughin et al., 2020, 2021). Furthermore, the black and blue lines are approximately parallel (panels 1c–5c in Fig. A3). Hence, the proposed method corrected on average  $97 \,\mathrm{m \, a^{-1}}$ of the spatial-acceleration-induced OE, which is  $\sim$  40 % of the overall OE (245 m  $\rm a^{-1}$ ) in five areas (Table 3). The average residual of 148 m  $\rm a^{-1}$ , accounting for another 60 % of the overall OE, represents the OE portion induced by the temporal acceleration in Eq. (9).

In summary, OEs exist in historical long-span velocity maps of Antarctica, from smaller glaciers, such as David Glacier, to the fast-flowing glacier of PIG, where spatial ac-

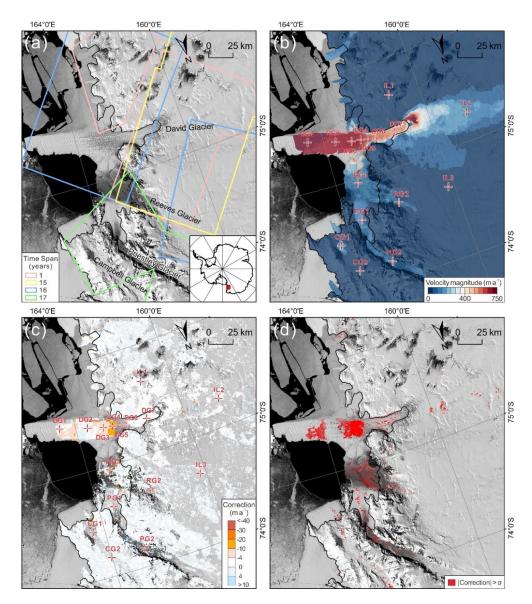


Figure 6. Application of the overestimation correction method to a historical velocity map of 1972–1989 of the David Glacier region, East Antarctica. (a) Footprints and time spans of the Landsat image pairs used for velocity mapping with a background of Landsat Image Mosaic of Antarctica (Bindschadler et al., 2008), (b) produced velocity map of 1972–1989 and selected points for examination of velocity overestimation and correction, (c) overestimation values of all velocity points generated using the image-feature-matching technique, and (d) velocity points with  $OE \ge 1\sigma$  (red points).

celerations are produced by, e.g., bed topography and slopes. In general, they are less significant in slow-flowing grounded regions with low spatial accelerations. Instead, they take effect in places of high ice dynamics, for example, near grounding lines and often in ice shelf fronts. Velocities in these areas are important for estimating ice sheet mass balance and contribution to global sea level changes, as well as for analyzing ice shelf instability. For instance, in the David Glacier the large OE corrections (up to  $36 \, \text{m a}^{-1}$ ) occur on the ice shelf (Fig. 6). The OEs of a 7-year span, up to  $69 \, \text{m a}^{-1}$  (Table 1), would be about  $\sim 50 \, \%$  of the veloc-

ity increase detected during 1989–2015 in the Totten Glacier (Li et al., 2016). The PIG experiment showed an extreme case in Antarctica where the OEs of a 7-year span can go as large as 626 m a $^{-1}$  ( $\sim$  20%) near the grounding zone (Table 3); furthermore, the OEs of a 15-year span can reach up to 1300 m a $^{-1}$  along the grounding line and cause an overestimated GL flux of 11.5 Gt a $^{-1}$  if not corrected (Fig. A4). Therefore, the magnitude of the OEs contained in the long-span historical velocity maps is significant. When overestimated historical maps of 1960s–1980s are used alongside recent maps of 1990s–2010s for assessment of the long-

ID	Time span	$V_{\text{Original}}^{E}$	$1\sigma$	$\bar{\mathbf{a}}\left(V^{L(n)}\right)$	Correction (-OE)	$V_{\text{Corr.}}^{E}$
	(years)	$(m a^{-1})$	$(m a^{-1})$	$(m a^{-2})$	$(m a^{-1})$	$(m a^{-1})$
DG1	15.95	717	4	0.2	-4	713
DG2	15.95	692	4	0.1	-1	692
DG3	15.95	679	4	0.3	-5	674
DG4	15.95	665	4	0.8	-12	653
DG5	15.95	634	4	1.4	-22	612
DG6	15.95	572	4	2.2	-36	536
DG7	1.04	524	62	0.0	0	524
RG1	16.96	125	4	0.7	-12	113
RG2	15.18	88	4	0.5	-7	81
PG1	16.96	110	4	0.4	-7	103
PG2	16.96	100	4	0.3	-6	94
CG1	16.96	143	4	0.3	-5	138
CG2	16.96	36	4	0.0	0	36
IL1	1.00	8	31	0.0	0	8
IL2	1.04	168	62	0.0	0	168
IL3	16.16	15	4	0.0	0	15
Mean	13.43	330	13	0.5	-7	323
SD	6.18	289	20	0.6	10	286

Table 2. Ice flow dynamics parameters, computed OEs, and corrected velocities at 16 selected points.

**Table 3.** Application of the OE correction method in PIG. "Actual E velocity and OE" includes E velocities of 3-month and n-year spans and their differences as OEs. "Overestimation correction" presents n-year E velocities from E velocities, and residuals (or errors) after correction.

Area ID (span)	Actual	E velocity	and OE	Overestimation correction			
	$V_{3 \text{ months}}^{E}$ $(\text{m a}^{-1})$	$V_n^E$ (m a <sup>-1</sup> )	$OE_{Actual}$ $(m a^{-1})$	$V_n^{L(n)} $ $(\text{m a}^{-1})$	Correction $(m a^{-1})$	$V_{\text{Corr.}}^{E}$ (m a <sup>-1</sup> )	$(m a^{-1})$
1 (6)	3935	4054	119	4090	-36	4018	83
2 (7)	3278	3904	626	4099	-195	3709	431
3 (7)	2341	2532	191	2599	-67	2465	124
4 (7)	1651	1922	271	2103	-181	1741	90
5 (3)	392	410	18	416	-6	404	12
Mean	2319	2564	245	2661	-97	2467	148
SD	1387	1506	232	1538	86	1477	163

term global climate change impact on the Antarctic ice sheet and for forecast modeling, the overestimated historical states may lead to underestimated long-term changes. Furthermore, compromised forecasting may result. Thus, the OEs in the long-span historical maps must be seriously examined and corrected.

### 4 Discussion

In this section we discuss the applicability of the proposed method in terms of overestimation-free time span, influence of complex glacier geometry, overestimation in fast flowing glaciers, and comparison with the "midpoint" method.

### 4.1 Threshold of the overestimation-free time span for trajectory segments

The choice of a short time span  $\Delta t_{\rm Ref}$  (e.g., a few months to 1 year) for the OE-free segments along a trajectory in Premise I makes sure that the difference between the E and L velocities within the span is negligible, or less than  $\sigma$  (velocity mapping uncertainty). It is also the baseline time span of the initial OE-free velocity map. Determination of this threshold has an implication on validation of Premises I and II, as well as the integration period of the trajectory segments from  $P_i$  to  $P_{i+1}$  (Fig. 3b). Estimation of  $\Delta t_{\rm Ref}$  can be performed in each glacier by a linear regression between the E or L velocity V and time span  $\Delta t$ ,  $V = K \Delta t + b$ . Given b, K, and  $\sigma$  (20 m a<sup>-1</sup>),  $\Delta t_{\rm Ref}$  can be calculated as  $\sigma \Delta t_{\rm Ref} = \frac{\sigma - b}{K}$ .

Our experiment results show  $\Delta t_{\rm Ref}$  as 3.2 years and 3 months for TG and PIG, respectively. Thus, the estimated OE-free time spans appear to be related to ice flow dynamics of the glaciers. In Experiment 1 and Experiment 3, we used 1 year for TG and 3 months for PIG, respectively. We suggest that a linear regression for  $\Delta t_{\rm Ref}$  estimation be performed before extensive historical velocity mapping is carried out.

### 4.2 Glaciers with complex geometry

Within a long time span (e.g., over 5–10 years) in Premise I the difference between L and E velocities accumulated over all segments along the entire trajectory, i.e., the end-point deviation between the red and blue lines in Fig. 2, is measured with a more tolerable threshold:  $(V_{0-n}^L - V_{0-n}^E) \le k\sigma$ . Although the OEs of the trajectory segments are controlled by  $\Delta t_{\text{Ref}}$ , ice mass moving along a curved flow line over this long span may result in an accumulative discrepancy. In Experiment 1 we showed that the average difference  $(V_{0-n}^L)$  $V_{0-n}^{E}$ ) in TG is within  $1\sigma$ . Our further experiments in five smaller Antarctic glaciers with complex geometry, including the George VI, Abbott, Dotson, Crosson, and Getz glaciers, resulted in  $(V_{0-n}^L - V_{0-n}^E)$  values that are negligible (smaller than  $1\sigma$ ) in all five glaciers. We further investigated Area 2 of PIG (Fig. 3a), a section with a high velocity of  $3278 \,\mathrm{m \, a^{-1}}$ and the highest curvature along the main trunk (7 %, namely, a 1305 m cross flow deviation from the 19720 m long straight line). Based on the feature-tracking result using eight annual Landsat 8 images, this curvature-induced E and L velocity difference is calculated as  $206 \,\mathrm{m}\,\mathrm{a}^{-1}$  over a 7-year span, among which 195 m a<sup>-1</sup> (95 %) was corrected (correction for Area 2 in Table 2). The results in these glaciers suggest that the velocity overestimation in glaciers with complex geometry can be mostly corrected and should not affect the applicability of the proposed method.

### 4.3 OE correction in fast-flowing glaciers

The Totten Glacier and Pine Island Glacier are among the most dynamic glaciers in Antarctica. The accelerated ice mass loss in these two fast-flowing glaciers has been realized by ice shelf basal melting and front calving (Li et al., 2015; Joughin et al., 2020, 2021). In Experiment 1 and Experiment 3 we show that such temporal accelerations do not alter the necessary condition in Premise II significantly, so that  $\left|\overline{a}\left(V^{L(n)}\right) - \overline{a}\left(V^{L}\right)\right| \leq k' \frac{\sigma}{\Delta t_{n}}$  holds with k' = 1 and 3 on average for all experiment areas in TG (Table 1) and PIG (Table A4), respectively. The spatial-acceleration-induced OEs can be corrected. On the other hand, the impact of temporal accelerations is represented in the sufficient condition in Premise I,  $(V_{0-n}^L - \hat{V}_{0-n}^E) \le k\sigma$ . For example, Area 4 of TG is located in a dynamic area of a velocity of  $\sim 1400 \, \mathrm{m \, a^{-1}}$ , about 30 km from the ice shelf front (Fig. 4). Its E velocity (red curve in panel 4c in Fig. 5) exceeded the L velocity (blue curve) in 2016 and showed a significant acceleration thereafter. This resulted in the largest actual overestimation  $OE_{Actual}$  of  $\sim 69 \,\mathrm{m \, a^{-1}}$  (Table 1), which may be attributed to large shelf front calving occurring during the period between 6 April and 20 September 2015, with an area loss of 136 km<sup>2</sup> (2 %; Fig. 4b). The L velocities  $V_{2013-i}^L$  (blue curve in panel 4c of Fig. 5) are derived from the 1-year-span map  $V_{2013-2014}$  before 2015 and thus do not reflect this temporal acceleration; furthermore, in L velocities  $V_{2013-i}^{L(7)}$  (black curve) derived from the 7-year-span map  $V_{2013-2020}$ , the effect of the calving-induced acceleration is averaged out over the 7-year span. Thus, the back and blue lines are approximately parallel with an average acceleration difference of only  $-0.5 \,\mathrm{m\,a^{-2}}$  (Table 1). Consequently, it appears that the calving event did not significantly reduce the buttressing potential of the ice shelf because the ice shelf front retreat occurred outside of the passive shelf ice (PSI) boundary (light blue line in Fig. 4b; Fürst et al., 2016); the other four areas are located farther away, inland, and away from the PSI boundary and thus were not influenced as much as in Area 4. Therefore, the calving-induced temporal acceleration only occurred in Area 4 ( $k = \sim 1.5$  in Premise I) but not in the four other areas ( $k \le 0.5$ ). Hence, the calculated correction of  $-19 \,\mathrm{m \, a^{-1}}$  in Area 4 is at a similar level to that in the four other areas and has only adjusted the OE caused by the spatial acceleration along the trajectory. The velocity increase due to the temporal acceleration by the calving event remains in the adjusted map as a large residual of 50 m a<sup>-1</sup>, which can serve as a signature to study the relationship between calving activities and ice flow dynamics.

With k = 1, 2, 2, 10, and 5 in Premise I for the five selected areas from the inland interior to the grounding zone in PIG (Table A4), the temporal accelerations caused by climate warming impact are indicated by the high values of k (10 and 5) near the grounding line at the glacier outlet. Overall, the proposed method was able to correct  $\sim 40\%$  of the total OEs, leaving another  $\sim 60\%$  in residuals as the signature of the velocity changes induced by the temporal accelerations.

In addition, based on an annual E velocity map of 2013 in PIG from ITS\_LIVE (Fig. A4a), L velocities along the grounding line (GL; Gardner et al., 2018) with time spans of 1 to 15 years (Fig. A4b) and the associated ice discharge were computed. The actual flux gates were set with nodes separated every 240 m, which were located up to 13 km upstream of the GL to reduce the uncertainty of ice thickness data (Gardner et al., 2019) from BedMachine (Morlighem et al., 2020). The results show that the velocity OEs of the 15year span can reach up to  $\sim 1300 \,\mathrm{m\,a^{-1}}$  in the GL region. Such OEs in velocity can further cause an overestimation in ice discharge across flux gates upstream the GL, which increases rapidly by  $\sim 6.3 \, \mathrm{Gt \, a^{-1}}$  within the first 4-year span (Fig. A4c); thereafter, the flux overestimation slows down until a maximum of 11.5 Gt a<sup>-1</sup> is reached at the 15-year span. This suggests that in fast-flowing glaciers like PIG, OEs in velocity maps with a time span of greater than 0.5– 2 years should be corrected. The fact that the OE effect in

PIG appears to level off after a couple of years is mainly because the velocity in the majority of the ice shelf is approximately leveled at  $\sim 4000 \, \mathrm{km} \, \mathrm{a}^{-1}$  and the acceleration is thus very small. This makes the average L velocities along the GL increase in a much-reduced pace where an integral of E velocities is performed in the leveled velocity area a few years after crossing the GL (Fig. A4d). Consequently, the flux OE indicated in Fig. A4c showed a similar trend. Extension of this exercise to the entire continent involves a complex situation, including deceleration caused by ice rises, mapping errors near ice shelf shear margins, GL data points that would calve into the ocean within n-year span, and other potential factors. It should be noted that given a velocity range in flux computation, the ice flow angle between a flux gate and ice flow controls the flux magnitude. In principle, at the same gate this angle changes with velocities of different time spans and flow line patters, resulting in an overestimation or underestimation in flux for individual glaciers. A systematic and in-depth investigation should be carried out to handle the overestimation issue in GL flux of all of Antarctica.

### 4.4 Comparison with the "midpoint" method

The "midpoint" method presented in Berthier et al. (2003) compensates for overestimations by assigning the overestimated velocities to middle points of the trajectories. We use the velocity measurements in Experiment 1 to compare the performances of these two OE correction methods. Since Area 4 was affected by a calving event during the time span, here we use the other four areas (areas 1, 2, 3, and 5, Fig. 4a). We estimated the E velocities of 7 years (2013– 2020)  $V_{2013-2020}^{E}$  and assigned them to the midpoints of the trajectories in the four areas (Table A5). They were then compared to the 1-year-span velocity  $V_{2013-2014}^{E}$  at the midpoints to calculate the bias  $\varepsilon_{\rm M}$ . Similarly, the same overestimated 7-year-span E velocities  $V_{2013-2020}^{E}$  were corrected using the OE correction method of this paper and assigned to the start points of the trajectories as  $V_{\text{corrected}}$  (Table A5). They were then compared to the 1-year-span  $V^E_{2013-2014}$  also, but at the start points to calculate another set of bias  $\varepsilon_{\rm S}$ . As shown in Table A5, the proposed OE correction method achieved a higher overall accuracy of  $4 \pm 10 \,\mathrm{m \, a^{-1}}$  compared to  $12 \pm 14 \,\mathrm{m \, a^{-1}}$  of the midpoint method.

In summary, our validation and application experiment results demonstrated that the proposed OE correction method can be applied to different types of glaciers in Antarctica, regardless of their ice flow dynamics. While the OEs are effectively corrected, temporal velocity increases caused by global-warming-induced activities can be preserved for long-term change studies. The implication is that, when using newer velocity maps of short spans along with historical maps of long spans produced in previous studies over the past few decades, the overestimation of historical velocities could have caused an underestimation in the long-term acceleration magnitude. On the other hand, new efforts in histori-

cal velocity mapping at an ice-sheet-wide or a large regional scale should be made with a full consideration of OE corrections. The applicability of the method to glaciers in Greenland should be further investigated in future research.

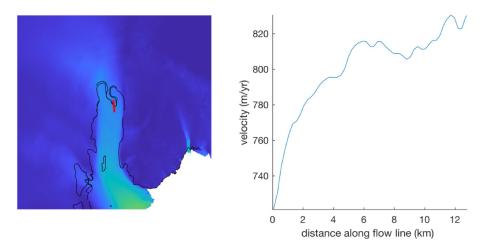
### 5 Conclusions

Velocity overestimation exists in Antarctic ice flow velocity maps produced from optical satellite images of long time spans. Such overestimations are inevitable for historical velocity maps due to the poor availability of earlier satellite images in Antarctica, especially before 1990. The results in this study show that the overestimations can reach up to  $\sim$  69 m a<sup>-1</sup> in the Totten Glacier, East Antarctica, over a 7year span and  $\sim 931 \,\mathrm{m\,a^{-1}}$  in the Pine Island Glacier, West Antarctica, over a 10-year span. The overestimated historical velocity maps should be adjusted before they are combined with recent velocity maps to build a long-term record for monitoring and forecasting the Antarctic ice flow dynamics and impact of global climate changes on the ice sheet. We used a set of ground truth velocity maps in the Totten Glacier produced from Landsat 8 images of 2013 to 2020 to validate the proposed innovative method for velocity overestimation correction. Based on the validated method, we successfully corrected the overestimations of a velocity map of 1972–1989 with time spans from 1 to 17 years in the David Glacier region, East Antarctica. Another experiment at the Pine Island Glacier (PIG) was carried out to demonstrate that the method can effectively adjust overestimated velocities as large as  $195 \,\mathrm{m \, a^{-1}}$ , while preserving the velocity change signature for long-term ice flow dynamics analysis. In summary we draw the following conclusions.

- The proposed Lagrangian velocity-based method is effective and easy to implement because the overestimation corrections are calculated by using the long-term velocity map itself only, without field observations or additional image data.
- 2. The premises of the correction method are validated by using a set of ground truth velocity maps developed from high-quality Landsat 8 images from 2013 to 2020 to show the rigidity of the method. The velocity overestimations of up to a 7-year span are proven to be corrected effectively to within the uncertainty  $(1\sigma)$  of the 1-year map.
- 3. The validated correction method is then successfully applied to correct overestimations in a historical velocity map of 1972–1989 with time spans from 1 to 17 years.
- 4. It is proven that ice velocity change information of temporal acceleration events, e.g., caused by shelf front calving and basal melting in the Totten Glacier and Pine Island Glacier, is preserved after the correction and can be used for long-term ice flow dynamics analysis.

The magnitude of the OEs contained in the long-span historical velocity maps is significant. When overestimated historical maps are used alongside recent maps for assessment of the long-term global climate change impact on the Antarctic ice sheet and for forecast modeling, the underestimated long-term changes and compromised forecasting may result. Thus, the OEs in the long-span historical maps must be seriously examined and corrected. It is recommended that OE values be computed for long-term historical velocity maps and corrections be made when OEs are more than the velocity uncertainty  $(1\sigma)$ . This velocity overestimation correction method can be applied to adjust velocity fields for the production of regional and ice-sheet-wide historical velocity maps from long-term satellite images before the 1990s.

### Appendix A



**Figure A1.** Velocity map of the Totten Glacier from ITS\_LIVE (left) used to explain the concept of velocity overestimation caused by acceleration (right): "Over 16 years, that parcel of ice travels about 13 km downstream (red path). It begins at a velocity of about 720 m/yr, and in the first 8 months it travels at an average rate very close to 720 m/yr. But then the ice picks up speed as it moves downstream, so in the first 10 years it does not travel just 7200 m – it actually travels about 7900 m, or an average speed of 790 m/yr" (Chad A. Greene, personal communication, 2020).

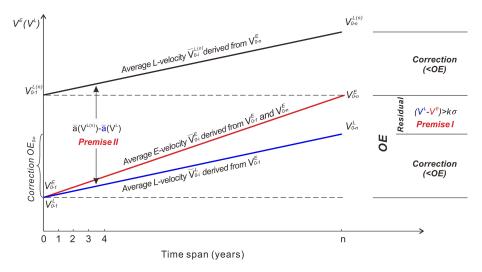


Figure A2. Overestimation correction in case of temporal accelerations.

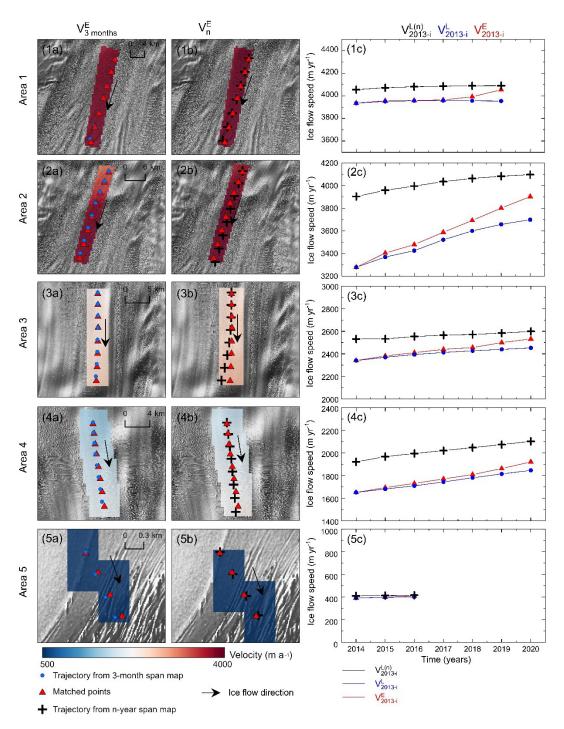
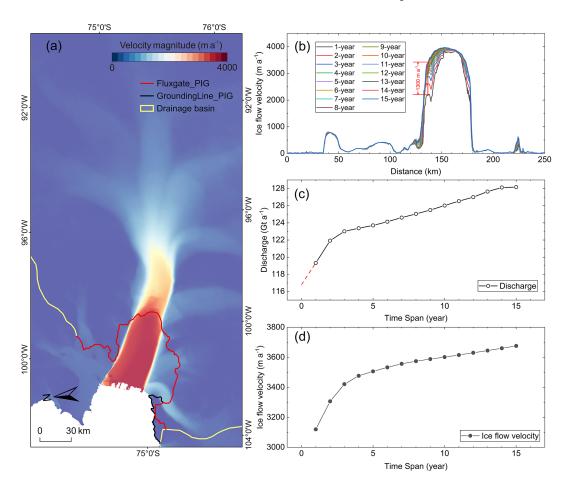


Figure A3. Velocities in five areas (numbered yellow rectangles in Fig. 3) of PIG are used to demonstrate application of the OE correction method. Panels (1a)–(5a) show the reconstructed 3-month velocity maps  $V_{2013-2014}$  in the areas; matched points (red triangles) are used to map E velocity  $V_{2013-i}^E$  (i=2014 (3 months),  $2015,\ldots,n$ ) (red lines in panels 1c-5c); points along the flow line (blue dots) are tracked from the 3-month maps and used to calculate L velocity  $V_{2013-i}^L$  (blue lines in panels 1c-5c). Similarly, panels (1b)–(5b) illustrate the reconstructed n-year velocity maps  $V_{2013-n}$  in the areas with the matched points (red triangles) for E velocity  $V_{2013-i}^{E(n)}$ ; points along the flow line (black crosses) are tracked from the n-year-span velocity map and used to calculate L velocity  $V_{2013-i}^{E(n)}$  (black lines in panels 1c-5c). In each area (panels 1c-5c) the difference between red and blue lines increases with time; the black line is above the blue line due to the spatial-acceleration-induced OE over n-year span, but they are relatively parallel, and thus a correction can be estimated. Background in panels (1a)–(5a) and (1b)–(5b) is Landsat 8 image of 12 February 2014.



**Figure A4.** (a) One-year-span ice velocity map of PIG (2013) from ITS\_LIVE (Gardner et al., 2019), (b) L velocities of 1- to 15-year span  $V_{0-i}^L$  ( $i=1, 2, \ldots 15$ ) along GL calculated from the 2003 velocity map, (c) ice discharge across flux gates upstream the grounding line estimated with time spans from 1 to 15 years, and (d) L velocities  $\overline{V}_{0-i}^L$  (averaged over the GL portion across main trunk) vs. time span.

**Table A1.** Information for the Landsat 8 images used for velocity mapping in Experiment 1.

Acquisition date (UTC)	Scene ID
2013/12/03	LC08_L1GT_102107_20131203_20170428_01_T2_B8
2014/11/13	LC08_L1GT_101107_20141113_20170417_01_T2_B8
2015/12/25	LC08_L1GT_102107_20151225_20170331_01_T2_B8
2016/11/25	LC08_L1GT_102107_20161125_20170317_01_T2_B8
2017/11/05	LC08_L1GT_101107_20171105_20171120_01_T2_B8
2018/12/17	LC08_L1GT_102107_20181217_20181227_01_T2_B8
2019/12/29	LC08_L1GT_101107_20191229_20200111_01_T2_B8
2020/10/19	LC08_L1GT_102107_20201019_20201019_01_RT_B8

**Table A2.** Acceleration estimates using least squares regression **a** and simple average  $\overline{\mathbf{a}}$  applied to L velocities of 7 years  $V^{L(n)}$  and 1 year  $V^L$ .

Area	$\mathbf{a} (V_{2013-i}^{L(n)})$ $(\text{m a}^{-2})$	$\overline{\mathbf{a}} \left( V_{2013, 2020}^{L(n)} \right) $ $(\text{m a}^{-2})$	Diff $(\mathbf{a} - \overline{\mathbf{a}})$ $(m  a^{-2})$	$\mathbf{a}  (V^L_{2013-i}) \ (\mathrm{m}  \mathrm{a}^{-2})$	$\bar{\mathbf{a}} \left( V_{2013,  2020}^L \right) $ $(\text{m a}^{-2})$	Diff $(\mathbf{a} - \overline{\mathbf{a}})$ $(m  a^{-2})$
1	4.1	3.4	0.7	4.9	4.6	0.3
2	1.8	1.6	0.2	0.7	0.4	0.3
3	4.4	3.6	0.8	6.6	5.7	0.9
4	4.6	3.4	1.2	5.3	3.9	1.4
5	5.1	4.5	0.6	7.1	6.0	1.1
Mean	4.0	3.3	0.7	4.9	4.1	0.8
SD	1.3	1.1	0.4	2.5	2.2	0.5

**Table A3.** Information for the Landsat images used for velocity mapping in Experiment 2.

Satellite	Acquisition date (UTC)	Scene ID
Landsat 1 (MSS)	1972/11/28	LM10641121972333AAA04
	1972/11/28	LM10641131972333AAA04
	1972/11/28	LM10651121972333FAK04
	1972/12/1	LM10671121972336AAA04
	1972/12/1	LM10671131972336AAA04
	1972/12/2	LM10681121972337AAA04
	1972/12/5	LM10711121972340AAA02
	1972/12/11	LM10781131972346FAK03
	1973/1/2	LM10641141973002AAA04
	1973/1/3	LM10831131973003AAA04
	1973/1/16	LM10611151973016AAA04
	1973/1/17	LM10781141973017XXX01
	1973/1/25	LM10681131973025FAK03
	1973/1/31	LM10741121973031FAK03
	1973/1/31	LM10741131973031FAK03
	1973/1/31	LM10741151973031FAK03
	1973/2/6	LM10801151973037AAA05
	1973/2/8	LM10641151973039AAA02
	1973/2/9	LM10831141973040XXX01
	1973/2/11	LM10671161973042FAK07
	1973/2/12	LM10861121973043FAK03
	1973/2/14	LM10701121973045AAA05
	1973/2/14	LM10701131973045AAA05
	1973/2/20	LM10761121973051FAK03
	1973/2/28	LM10661141973059AAA04
	1973/2/28	LM10661161973059AAA04
	1973/3/6	LM10721131973065XXX01
	1973/10/29	LM10751121973302AAA02
	1973/10/29	LM10751131973302AAA02
	1973/11/4	LM10811131973308FAK03
	1973/11/4	LM10811141973308FAK03
	1973/11/7	LM10841141973311FAK03
	1973/11/21	LM10801131973325FAK03
	1973/11/24	LM10641161973328AAA04

Table A3. Continued.

Satellite	Acquisition date (UTC)	Scene ID
	1973/12/20	LM10731151973354FAK03
	1973/12/25	LM10601161973359AAA04
	1973/12/31	LM10661141973365AAA04
	1973/12/31	LM10661161973365FAK02
	1973/12/31	LM10671141973365FAK02
	1973/12/31	LM10671151973365FAK01
	1974/1/5	LM10711121974005AAA04
	1974/1/5	LM10711131974005AAA04
	1974/1/12	LM10781141974012AAA04
	1974/1/12	LM10781151974012AAA04
	1974/1/14	LM10621161974014AAA04
	1974/1/16	LM10641141974016AAA02
	1974/1/18	LM10661151974018AAA04
	1974/1/20	LM10861121974020AAA04
	1974/1/25	LM10731121974025AAA05
Landsat 4 (TM)	1988/12/15	LT40601141988350XXX04
	1988/12/15	LT40601151988350XXX03
	1989/1/29	LT40551161989029XXX04
	1989/3/24	LT40651131989083XXX01
	1989/3/24	LT40651141989083XXX11
	1989/3/24	LT40651151989083XXX01
	1989/11/12	LT40641151989316XXX01
	1989/11/14	LT40621121989318XXX02
	1989/11/14	LT40621131989318XXX02
	1989/11/26	LT40661121989330XXX01
	1989/11/30	LT40621151989334XXX01
	1989/12/5	LT40651121989339XXX02
	1989/12/16	LT40621141989350XXX02
Landsat 5 (TM)	1986/1/4	LT50561161986004XXX04
	1986/12/13	LT50571161986347XXX05

**Table A4.** Application of the OE correction method in five selected areas in PIG. Premise I contains n-year tracked E velocities and L velocities computed from the 3-month velocity map, as well as their differences. Premise II illustrates averaged L accelerations computed from the n-year and 3-month velocity maps, respectively, as well as their differences.

Area ID	Time span (years)	Premise I			Premise II			
		$V_n^E$	$V_n^L$	$(V^L - V^E)_n$ $(m a^{-1})$	$\overline{\mathbf{a}}\left(V^{L(n)}\right)$	$\overline{\mathbf{a}}\left(V^L\right)$	$\overline{\mathbf{a}}\left(V^{L(n)}\right) - \overline{\mathbf{a}}\left(V^{L}\right)$	
		$(m a^{-1})$	$(ma^{-1})$	$(m a^{-1})$	$(m a^{-2})$	$(ma^{-2})$	$(ma^{-2})$	
1	6	4054	3954	-100	6.0	3.2	2.8	
2	7	3904	3699	-205	28.2	60.8	-32.6	
3	7	2532	2453	-79	9.5	15.9	-6.4	
4	7	1922	1847	-75	25.6	27.8	-2.2	
5	3	410	402	-8	2.2	3.6	-1.4	
Mean	6	2564	2471	-93	14.3	22.3	$-8.0^{*}$	
SD	2	1506	1447	71	11.8	23.8	14.2	

<sup>\*</sup> With an average span of 6 years for all areas and  $\sigma = 20\,\mathrm{m\,a^{-1}}$ , the mean of  $\overline{\mathbf{a}}\left(V^L(n)\right) - \overline{\mathbf{a}}\left(V^L\right)$  in Premise II is  $8\,\mathrm{m\,a^{-2}} \ (\leq 3\,\frac{\sigma}{\Delta t_{B}})$ .

Area ID	OE velocity assigned to midpoint	1-year map at midpoint	Bias	OE-corrected velocity assigned to start point	1-year map at start point	Bias
	$V_{2013-2020}^{E} \ (\text{m a}^{-1})$	$V_{2013-2014}^{E} \ (\mathrm{ma}^{-1})$	$(m a^{-1})$	$V_{\text{corrected}} \pmod{a^{-1}}$	$V^E_{2013-2014} \ (\mathrm{ma}^{-1})$	$(m a^{-1})$
1	843	860	17	824	824	0
2	1008	1007	-1	999	1007	8
3	1317	1332	15	1297	1280	-17
5	789	807	18	759	754	-5
Mean	989	1001	12	970	966	-4
RMSE			14			10

Table A5. Comparison of the proposed OE correction method with the midpoint method in Berthier et al. (2003).

Code availability. Code is available from the corresponding author upon request.

*Data availability.* ITS\_LIVE ice flow velocity maps used in this study are available at https://its-live.jpl.nasa.gov/ (last access: 26 February 2022) (Gardner et al., 2019).

Author contributions. RL led the study and developed the overestimation correction model. YC, MX, XY, ZL, and SL carried out velocity mapping. HC did the programming. RL, YC, and GQ were involved in data analysis and presentation.

Competing interests. The contact author has declared that neither they nor their co-authors have any competing interests.

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