## **ORIGINAL ARTICLE**



# Integrated processing of ground- and space-based GPS observations: improving GPS satellite orbits observed with sparse ground networks

Wen Huang<sup>1,2</sup> → Benjamin Männel<sup>1</sup> · Pierre Sakic<sup>1</sup> → Maorong Ge<sup>1,2</sup> · Harald Schuh<sup>1,2</sup>

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#### **Abstract**

The precise orbit determination (POD) of Global Navigation Satellite System (GNSS) satellites and low Earth orbiters (LEOs) are usually performed independently. It is a potential way to improve the GNSS orbits by integrating LEOs onboard observations into the processing, especially for the developing GNSS, e.g., Galileo with a sparse sensor station network and Beidou with a regional distributed operating network. In recent years, few studies combined the processing of ground- and space-based GNSS observations. The integrated POD of GPS satellites and seven LEOs, including GRACE-A/B, OSTM/Jason-2, Jason-3 and, Swarm-A/B/C, is discussed in this study. GPS code and phase observations obtained by onboard GPS receivers of LEOs and ground-based receivers of the International GNSS Service (IGS) tracking network are used together in one least-squares adjustment. The POD solutions of the integrated processing with different subsets of LEOs and ground stations are analyzed in detail. The derived GPS satellite orbits are validated by comparing with the official IGS products and internal comparison based on the differences of overlapping orbits and satellite positions at the day-boundary epoch. The differences between the GPS satellite orbits derived based on a 26-station network and the official IGS products decrease from 37.5 to 23.9 mm (34%) improvement) in 1D-mean RMS when adding seven LEOs. Both the number of the space-based observations and the LEO orbit geometry affect the GPS satellite orbits derived in the integrated processing. In this study, the latter one is proved to be more critical. By including three LEOs in three different orbital planes, the GPS satellite orbits improve more than from adding seven well-selected additional stations to the network. Experiments with a ten-station and regional network show an improvement of the GPS satellite orbits from about 25 cm to less than five centimeters in 1D-mean RMS after integrating the seven LEOs.

Keywords POD · Integrated processing · Sparse ground network · GPS · LEOs · GRACE · Jason · Swarm

## 1 Introduction

The precise orbit determination (POD) of Global Navigation Satellite System (GNSS) satellites is mainly performed with ground-based observations by a dynamic approach (e.g., Montenbruck and Gill 2000; Hackel et al. 2015; Zhao et al. 2018). The weighted RMS of individual GPS orbit products provided by the International GNSS Service (IGS, Johnston et al. 2018) Analysis Centers with respect to the combined

solution is 6.3 mm to 11 mm (Choi 2014). Orbits of low Earth orbiters (LEOs) are usually determined by introducing GPS orbit and clock products to process the onboard GNSS observations. With a reduced dynamic strategy (Wu et al. 1991), the orbits of different LEOs are determined to an accuracy level of one to three centimeters (e.g., Haines et al. 2004; Jäggi et al. 2007; Montenbruck et al. 2018).

There are also some studies on the integrated processing of ground- and space-based observations, mainly focusing on the estimation of Earth parameters, including gravity field parameters (König et al. 2005), the geocenter (Kuang et al. 2015; Männel and Rothacher 2017), and the terrestrial reference frame (König 2018). The integrated POD of GPS satellites and LEOs was also performed by several studies. Zhu et al. (2004) and König et al. (2005) compared two POD approaches for GPS, the Gravity Recovery and Climate Experiment (GRACE), and the Challenging Minisatellite



Wen Huang wen.huang@gfz-potsdam.de

Deutsches GeoForschungsZentrum GFZ, Telegrafenberg 14473, Potsdam, Germany

Institute of Geodesy and Geoinformation Science, Technische Universität Berlin, Strasse des 17. Juni 135, Berlin 10623, Germany

Payload (CHAMP) satellites. In the first approach named 'one-step', the orbits of the above-mentioned satellites are estimated simultaneously. In the other approach, the orbits of the GPS satellites and the LEOs are determined sequentially. The authors concluded that the orbits determined by the 'one-step' approach are more accurate. Geng et al. (2008) shown that the GPS satellite orbits derived by supplementing a 21-station network with GRACE and CHAMP satellites are more accurate than the solution based on a 43-station network. Otten et al. (2012) combined various GNSS satellites and LEOs at the observation level including GNSS, Doppler Orbitography and Radiopositioning Integrated by Satellite (DORIS), and Satellite Laser Ranging (SLR). Zoulida et al. (2016) and Zhao et al. (2017) performed an integrated POD for OSTM/Jason-2 and FengYun-3C with GPS and Beidou, respectively. These studies reported the benefits of integrating LEOs into the POD in different aspects. However, only one or two LEO missions that have GNSS data were considered in the above-mentioned studies.

In this study, we considered seven LEOs, including GRACE-A, GRACE-B, OSTM/Jason-2, Jason-3, Swarm-A, Swarm-B, and Swarm-C. For the selection of ground stations, the characteristics of the ground segments of Galileo and Beidou are taken into consideration. The Galileo Sensor Station (GSS) network includes 16 sites (Sakic et al. 2018) and Beidou has a regionally distributed ground segment (Yang 2018). It is a potential way to supplement the limited ground segment by integrating LEOs in joint POD processing. Based on the integrated processing of different subsets of ground stations and LEOs, the impact of integrating LEOs on the GPS satellite orbits is discussed.

In Sect. 2, the integrated processing is introduced briefly. The characteristics of the LEOs and their data selection are presented. The processing days are selected based on the data status of the LEOs. Two main sparse subsets of the available IGS stations are selected based on the motivation of our study. The strategy of our processing and analysis and all the designed scenarios are explained in detail. All the results and analysis are given in Sect. 3. It includes four parts. Firstly, the impact of the number of LEOs and their orbital planes on GPS satellite orbits is discussed. Secondly, internal comparisons of the orbit quality based on the differences of overlapping orbits and satellite positions at day-boundary epochs are performed. Thirdly, the effects of supplementing a sparse and non-homogeneously distributed station network by seven carefully selected additional stations or three LEOs in different orbital planes are compared. Fourthly, we present an additional experiment to show the GPS satellite orbit improvement by adding seven LEOs to a regional ground network. The conclusions are given based on the above-mentioned results and analysis in Sect. 4.



# 2 Integrated POD of GPS satellites and LEOs

# 2.1 The method of integrated POD

The method of the integrated POD applied in this study is known as the one-step method (Montenbruck and Gill 2000). The approximate initial epoch status of GPS satellites and LEOs are computed from broadcast ephemerides and by single point positioning, respectively. Based on the equations of motion of GPS satellites and LEOs, the initial orbits of GPS and LEOs are delivered by numerical integration. The state equation reads

$$x_i = T(t_i, t_0)x_0 + S(t_i, t_0)f,$$
(1)

where  $x_i$  is the state vector of the satellite at epoch  $t_i$ ,  $x_0$  is the initial epoch state vector, f contains the force model parameters, and  $T(t_i, t_0)$  and  $S(t_i, t_0)$  are transition matrices and sensitivity matrices, respectively. In the one-step estimation, the ground- and space-based observation equations at epoch  $t_i$  read

$$L_{sta}^{gps} = F_{sta}^{gps}(x_{gps}, x_{sta}, C^{gps}, c_{sta}, T_{sta}^{gps}, I_{sta}^{gps}, A_{sta}^{gps}, t_{i}) + v_{sta}^{gps},$$

$$+ v_{sta}^{gps},$$

$$L_{leo}^{gps} = F_{sta}^{leo}(x_{leo}, x_{gps}, C^{gps}, c_{leo}, T_{leo}^{gps}, I_{leo}^{gps}, A_{leo}^{gps}, t_{i}) + v_{leo}^{gps},$$

$$+ v_{leo}^{gps},$$
(2)

where  $L_{sta}$  and  $L_{leo}$  are ground- and space-based measurements,  $x_{gps}$  and  $x_{leo}$  are the positions of GPS satellites and LEOs at the current epoch,  $x_{sta}$  is the static position of the ground station, c denotes the receiver clock offset, C denotes the GPS satellite clock offset, T is the troposphere delay, I is the ionosphere delay, I and I is the ionosphere delay, I and I is an analysis are carrier phase ambiguities of stations and LEOs, and I is an I in I in

Figure 1 presents the flowchart of the whole processing. Before the one-step estimation, all the observations are cleaned based on the TurboEdit algorithm (Blewitt 1990). Several iterations of estimation are performed to improve the solution. After each estimation, the orbits of GPS satellites and LEOs are updated by orbit integration based on the new solution of initial epoch states and force model parameters. Meanwhile, the data are cleaned based on the residuals of observations. After completing the data cleaning, the ambiguities of the ground station observations are fixed to improve the solution. After one more iteration of estimation and orbit

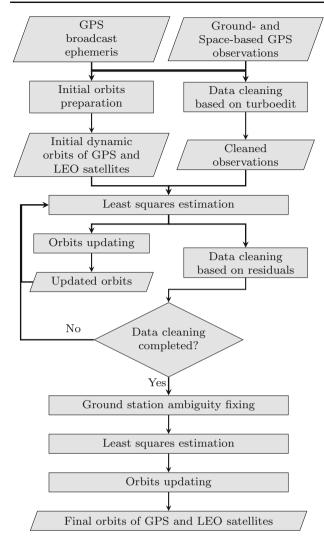


Fig. 1 Flowchart of the integrated POD

updating, the final orbits of GPS satellites and LEOs are determined.

## 2.2 LEO data and processing period selection

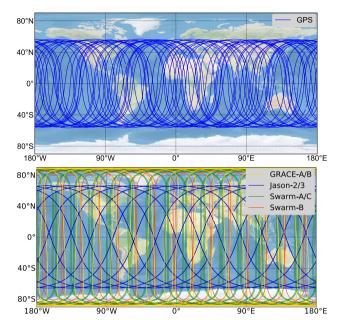
The seven LEOs in this study are part of four different missions. GRACE is a geodetic mission with the overall objective to obtain long-term data for global (high-resolution) models of the mean and the time-variable components of the Earth's gravity field (Tapley et al. 2004). OSTM/Jason-2 (Lambin et al. 2010) is a follow-on satellite to the joint NASA/CNES oceanography mission Jason-1 (Ménard et al. 2003), and Jason-3 (Vaze et al. 2010) is a follow-on satellite of OSTM/Jason-2. Swarm is a mini-satellite constellation mission to survey the geomagnetic field (Friis-Christensen et al. 2008).

Our processing period starts shortly after the launch of Jason-3, which is operated in the same orbital plane (66°

Table 1 Orbit characteristics of the seven LEOs

Satellites	Inclination [°]	Altitude [km]			
GRACE-A/B	89	485			
<ul><li>Jason-2/3</li></ul>	66	1336			
▲ Swarm-A/C	87.4	480			
▲ Swarm-B	87.8	530			

The colored symbols indicate the orbital planes



**Fig. 2** Daily ground tracks of all GPS satellites (upper) and the seven LEOs (lower) on day 160 of year 2016. The LEOs in the same orbital plane are plotted with the same color

inclination and 1336 km altitude) as OSTM/Jason-2. By mission definition, GRACE satellites are operating in the same orbital plane (GRACE-B leading GRACE-A in 89° inclination and 485 km altitude). The three satellites of the Swarm mission are operating in two different orbital configurations. Swarm-A and Swarm-C are flying at a mean altitude of 480 km in orbital planes with 87.4° inclination, while the Swarm-B orbit has a higher inclination (87.8°) and a larger mean altitude of 530 km. According to the operation status mentioned above, the seven LEOs are in four different orbital planes as summarized in Table 1. The colored symbols indicate the orbital planes. It has to be mentioned that Swarm-A and Swarm-C satellites remain side by side with separations about 50 to 200 km. However, due to the identical orbital characteristics of Swarm-A/C, we assume that they are in the same orbital plane. The daily ground tracks of GPS satellites and the seven LEOs are plotted with corresponding colors in Fig. 2.

Since the processing includes seven LEOs from four missions, the availability of the LEOs' data is a major limitation when defining the processing period. After checking the data



**96** Page 4 of 13 W. Huang et al.

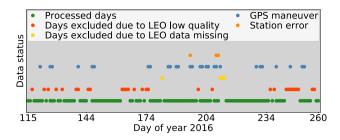


Fig. 3 Status of data availability in the processing period

**Table 2** The RMS of the orbit differences between our LEO POD solutions and the official orbit products averaged over 112 processed days

LEO	G-A	G-B	J-2	J-3	S-A	S-B	S-C
RMS [mm]	33.0	36.3	37.5	42.0	33.5	33.5	33.8

The daily RMS is computed over epochs and three orbital directions (along-track, cross-track, and radial)

availability of the seven LEOs, we choose day of year (DOY) 115 to 260 in 2016 as our processing period. In this period, all seven LEOs were in operation. GRACE satellites were at the end of their operating life, but the quaternion data of Jason-3 started to be available from DOY 115 in 2016. To check the LEOs' data quality, a daily POD of each LEO is processed with a 300-second data sampling rate. The IGS final orbit and clock products are introduced as a priori information. We noticed missing data (onboard GPS observation or attitude) for some days. Some additional days were excluded for maneuvering or low data quality caused by spacecraft problems. Please note that we excluded these days completely also in the following integrated processing. In the integrated processing, we also excluded maneuvering GPS satellites based on the information provided in the GPS NANU Messages. Finally, 112 days are selected for the integrated processing and are indicated by green dots in Fig. 3. The LEOs' daily orbits are compared with the official orbit products (Case et al. 2002; Dumont et al. 2009, 2016; Olsen 2019). The RMS of the orbit differences is computed over the epochs and three orbital directions in a daily solution. The average of the daily RMS values over the 112 days are presented in Table 2. We abbreviate the LEOs as G-A/B (GRACE-A/B), J-2/3 (OSTM/Jason-2 and Jason3), and S-A/B/C (Swarm-A/B/C). The larger RMS of Jason-3 compared to that of OSTM/Jason-2 is related to orbit modeling issues, as we applied the model of OSTM/Jason-2 to Jason-3, since some detailed information of Jason-3, for instance, the receiver antenna phase center location, are not yet available. Compared with previous studies and considering the 300-second data sampling rate, a comparable accuracy level of the LEO orbits is achieved.

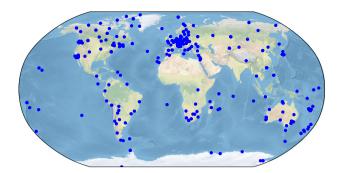
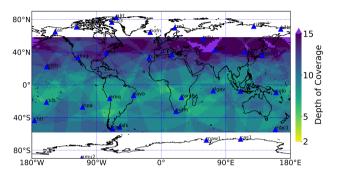


Fig. 4 Available IGS stations (in total 319) for the 112 selected processing days



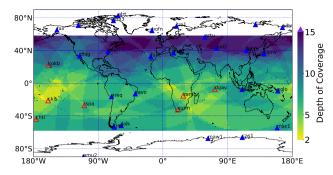
**Fig. 5** A subset of the available IGS stations including 33 homogeneously and sparsely distributed stations (blue triangles). The number of stations in sight of a potential GPS satellite position (Depth of Coverage) is presented as a colored bin  $(2^{\circ} \times 2^{\circ} \text{ resolution}, 20,200\,\text{km} \text{ altitude})$ 

#### 2.3 Ground networks selection

There are 319 IGS stations available during the selected 112 processing days. The distribution of the 319 stations is presented in Fig. 4. The operation of all GNSS is mainly based on their own ground segments and tracking stations. For example, as mentioned in Sect. 1, there are only 16 sites with GSS operating for Galileo. Considering this situation, we selected a sparse and homogeneously distributed subset from the 319 available IGS stations to study the sparse-network-based POD. This network contains 33 stations which are plotted as blue triangles in Fig. 5. The color of the bins in Figs. 5 and 6 presents the number of stations in sight of a potential GPS satellite position with an altitude of 20, 200 km and an inclination of 57° (i.e., Depth of Coverage, DoC). In general, more than five stations are visible, and this is also what we expected based on the selection criteria.

Despite the large and dense IGS tracking network in certain circumstances, depending on constellations and frequencies, one might be confronted with large regions without tracking stations, especially over the oceans and Africa. Seen from Fig. 4, although 319 stations are globally available, there are regions with only a few tracking stations. Moreover, IGS stations could be unavailable for various reasons,





**Fig. 6** A subset of the available IGS stations including 26 non-homogeneously and sparsely distributed stations (blue triangles). The red triangles are the seven excluded stations. The number of stations in sight of a potential GPS satellite position (Depth of Coverage) is presented as a colored bin  $(2^{\circ} \times 2^{\circ} \text{ resolution}, 20.200 \text{ km altitude})$ 

and it might happen to Galileo Sensor Stations as well, for instance, caused by the withdrawal of the United Kingdom from the European Union (Gutierrez 2018). To investigate how the LEOs could contribute to the GPS POD, we selected a sparser station network (see Fig. 6) by excluding seven (red triangles) of the 33 stations mentioned above. Consequently, gaps in some regions of the Pacific Ocean, the Indian Ocean, and Africa are visible. There are large areas where a fictitious GPS satellite could be tracked by only two to four (yellow bins) stations. Although two simultaneous observations can support the estimation of satellite clock corrections and orbit parameters in a dynamic solution, the fewer observations still lead to a reduced contribution.

The GPS satellite orbits derived from the two sparse networks mentioned above are our benchmark which will be compared with different integrated solutions. All selected stations are used to define the datum. Since we applied a Helmert transformation when comparing our orbits with the IGS final products, there will be little systematic effect when we analyze the RMS of the orbit differences compared to these two benchmark results.

To investigate the performance of the integrated POD with regional networks, another network including stations mainly located in China will be introduced in Sect. 3.4.

# 2.4 Processing and analysis strategy

We use the software PANDA (Liu and Ge 2003) to do all the processing. PANDA is capable of GNSS satellite and LEO orbit modeling. Separated and integrated POD of GNSS satellites and LEOs can be performed. For this study, the implementation of OSTM/Jason-2, Jason-3, and Swarm-A/B/C data formats (observation, attitude, and precise orbit) was necessary. Table 3 shows the dynamic models used for the orbit integration of GPS satellites and LEOs. Table 4 introduces the processing configuration and the estimated parameters.

To investigate the impact of the number of integrated LEOs and their orbital planes on the determined GPS satellite orbits, we applied a total of 26 different scenarios for the POD processing. All the scenarios are summarized in Table 5. The first two are the GPS-only POD by applying the two sparse station networks which are described in Sect. 2.3. The other 24 scenarios are the integrated POD of GPS satellites and LEOs, and all of them supplement the sparser network with 26 stations by including different subsets of the seven LEOs. We compared the estimated GPS satellite orbits of all scenarios to the IGS final products to show the orbit quality and the differences between the scenarios. Due to the large number of satellites and scenarios, we computed statistical measures of the orbit comparisons to quantify the result of each scenario. The statistical computation is shown in Fig. 7. For each daily orbit comparison, we computed the RMS of orbit differences in three orbital directions (along-track, cross-track, and radial) and the 1D-mean RMS. The RMS in three orbital directions is computed over epochs and satellites. The 1Dmean RMS is computed over epochs, satellites, and the three orbital directions. Based on the 112-day solutions, we computed the mean and the empirical standard deviation of the time series of the above-mentioned RMS values. The statistical measures mentioned above are highlighted in green in Fig. 7, and the analysis in Sect. 3.1 is mainly based on these measures.

Besides the external orbit comparison, internal comparisons are performed in two different ways. The first one is

Table 3 Dynamic orbit models of GPS satellites and LEOs

Dynamic Models	GPS	LEOs
Atmosphere drag	Not applied	DTM94 (Berger et al. 1998)
Earth gravity field	EIGEN-GRACE02S ( $12 \times 12$ , Reigber et al. 2005)	EIGEN-GRACE02S ( $120 \times 120$ )
Earth radiation pressure	Box-wing (Marshall et al. 1992)	Not applied
N-body perturbation	JPL DE405 (Standish 1998)	JPL DE405
Relativity	IERS 2010 (Petit and Luzum 2010)	IERS 2010
Solid Earth, ocean, pole tide	IERS 2010	IERS 2010
Solar radiation pressure	reduced ECOM (Springer et al. 1999)	Box-wing



**96** Page 6 of 13 W. Huang et al.

**Table 4** Processing configurations and estimated parameters

Arc length 24 hours (expanding 3 hours to the previous and the next day for overlapping comparison)

Cut-off elevation 7°

GPS Antenna PCO/PCV IGS08.atx (Schmid et al. 2016)

LEOs Antenna PCO/PCV PCO values are offered by mission operators, and PCV is not applied

LEOs attitude Quaternion data provided by mission operators

Observation type Undifferenced ionosphere-free phase and code measurements
Weighting Ground and space-based observations are equally weighted
Sampling rate Five minutes for both ground and onboard observations

Datum definition IGS weekly solution of station coordinates aligned to ITRF2008 (Rebischung et al. 2012)

Ambiguity fixing Only within ground stations

Parameters

Station coordinate Highly constrained

GPS satellite orbit Six orbital elements and five solar radiation pressure parameters

LEOs orbit Six orbital elements; piece-wise empirical and atmosphere drag parameters

Earth rotation Rotation pole coordinates and UT1 for 24h intervals; piece-wise linear modeling

Tropospheric delay For each ground station; piece-wise constant zenith delays for 1h intervals; piece-wise constant horizontal

gradients for 4h intervals

Phase ambiguities Fixed for ground observations; float for space-based observations

Clock offsets Satellites and receivers; epoch-wise; pre-eliminated

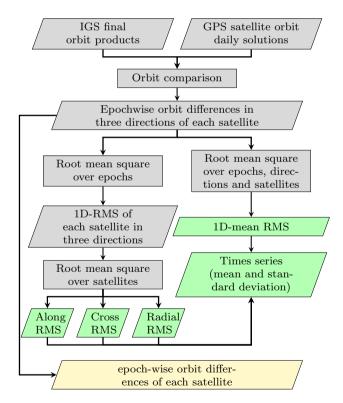


Fig. 7 Flowchart of the statistical computation. The green and yellow outputs are the values used in the analysis of this study

the comparison of the orbit overlaps. We expand the POD arc length of scenarios 1, 2, and 26 from 24 hours to 30 hours (three hours to both the previous and the next day). Consequently, a pair of 6-hour overlapping orbit arcs derived by real data processing is generated between two adjacent days. The 1D-mean RMS of the orbit differences of the 6-hour overlap is computed. Another comparison is about the satellite position differences at the day-boundary epoch of two adjacent 24-hour orbits at midnight. We extrapolate one more epoch from a 24-hour orbit by orbit integration, then the GPS satellite positions at the extrapolated epoch are compared with the estimated satellite positions in the first epoch of the next 24-hour orbit. The RMS of the satellite position differences is computed over the satellites and the three orbital directions at the day-boundary epochs. The detailed discussion will be given in Sect. 3.2.

Based on a geolocated comparison of epoch-wise satellite orbit differences (yellow box in Fig. 7) between scenarios 1, 2, and 19, we will discuss the different effects of supplementing a sparse station network with additional stations and LEOs in Sect. 3.3. An additional experiment is designed to show the GPS satellite orbit improvement by adding the seven LEOs to a small and mainly regionally distributed station network. The 1D-mean RMS of the GPS satellite orbit differences compared to IGS final products will be used for the analysis in Sect. 3.4.



Table 5 Statistical results of the GPS satellite orbit differences w.r.t. the IGS final products from 26 scenarios

Scenario S	Stations	G-A	G-B	J-2	J-3	S-A	S-C	S-B	LEOs	Orbital planes	Mean/STD of orbit RMS [mm]			Improve-	
											Along	Cross	Radial	1D-mean	ment [%]
1	26								0	0	50.9/22	31.6/5	22.0/3	37.5/13	-
2	33								0	0	34.5/6	24.2/3	16.5/2	26.7/4	27
3	26								1	1	41.3/14	27.0/3	19.4/3	31.2/8	16
4	26								1	1	42.7/15	27.7/4	19.7/3	31.7/9	15
5	26								1	1	41.9/13	27.9/3	19.9/2	31.7/8	14
6	26				•				1	1	39.7/14	27.4/3	19.5/2	30.6/8	17
7	26					<b>A</b>			1	1	41.0/10	27.8/4	19.6/2	31.3/6	14
8	26						<b>A</b>		1	1	40.9/8	27.7/3	19.6/2	31.4/4	14
9	26							<b>A</b>	1	1	40.8/8	28.4/3	19.5/2	31.2/5	14
10	26								2	1	39.1/11	26.3/3	18.9/3	29.9/6	19
11	26			•	•				2	1	39.2/12	27.2/3	19.6/2	30.4/7	17
12	26					<b>A</b>	<b>A</b>		2	1	39.8/7	27.7/3	19.5/2	30.7/4	16
13	26					<b>A</b>		<b>A</b>	2	2	36.2/4	26.8/3	18.3/2	28.6/3	21
14	26				•	<b>A</b>			2	2	34.9/6	25.3/3	18.1/2	27.5/4	24
15	26					<b>A</b>			2	2	36.0/5	25.5/3	18.2/2	28.1/3	23
16	26					<b>A</b>	<b>A</b>	<b>A</b>	3	2	35.6/4	26.9/3	18.2/2	28.3/3	22
17	26				•	<b>A</b>	<b>A</b>		3	2	34.3/5	25.2/2	17.9/2	27.2/3	25
18	26				•	<b>A</b>		<b>A</b>	3	3	32.1/3	24.9/3	17.2/2	26.0/2	28
19	26				•	<b>A</b>			3	3	31.1/4	23.6/2	17.0/2	25.1/2	31
20	26			•	•	<b>A</b>	<b>A</b>		4	2	34.0/4	25.1/2	18.0/2	27.0/3	25
21	26				•	<b>A</b>	<b>A</b>	<b>A</b>	4	3	31.7/3	24.9/2	17.1/2	25.8/2	29
22	26				•	<b>A</b>		<b>A</b>	4	4	29.8/3	23.7/3	16.5/2	24.4/2	32
23	26			•	•	<b>A</b>	<b>A</b>		5	3	30.6/3	23.5/2	17.0/2	24.9/2	31
24	26			•		<b>A</b>	<b>A</b>	<b>A</b>	5	4	29.6/3	23.7/2	16.5/2	24.4/2	32
25	26			•	•	<b>A</b>	<b>A</b>	<b>A</b>	6	4	29.5/3	23.6/3	16.5/2	24.3/2	33
26	26			•	•	<b>A</b>	<b>A</b>	<b>A</b>	7	4	28.9/3	23.2/3	16.4/2	23.9/2	34

The first two scenarios are ground-based only solutions. In the other 24 scenarios, the 26-station network is supplemented by different subsets of LEOs. The colored symbols present the different orbital planes. The mean values and the standard deviations of the orbit RMS (direct-specific and 1D-mean) time series are listed in four columns. The last column is the 1D-mean improvement w.r.t. scenario 1

Although the focus of this study is on improving the GPS satellite orbits derived from limited ground networks, we also presented the quality of the GPS satellite orbits derived from a 62-station globally distributed network as a reference for interested readers. The network distribution and the GPS satellite orbit comparison with scenario 26 are given in the Appendix.

## 3 Results and discussions

## 3.1 Orbit comparison with IGS final products

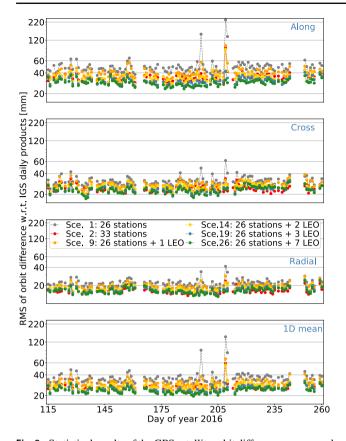
Based on the statistical results shown in Table 5, we will discuss the impact of the number of integrated LEOs and their orbital planes on the GPS satellite orbits. Except for

the first two ground-based only solutions, different subsets of the seven LEOs are integrated with the 26-station network. Besides the mean and the standard deviation values of the orbit RMS time series listed in Table 5, the time series of scenarios 1, 2, 7, 14, 19, and 26 are shown in Fig. 8. Correspondingly, the time series of the 1D-mean orbit improvements of scenarios 2, 7, 14, 19, and 26 compared to scenario 1 is shown in Fig. 9.

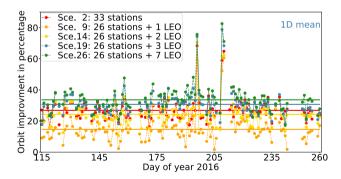
Generally, we observe improved GPS satellite orbits and reduced variations of the time series when increasing the number of ground stations or the integrated LEOs. The GPS satellite orbit accuracy improves most when all the seven LEOs are integrated into the POD. In all scenarios, the orbit accuracy of the three directions is ranked as along-track < cross-track < radial, while the orbit improvements in the three directions are ranked in the reverse order



**96** Page 8 of 13 W. Huang et al.

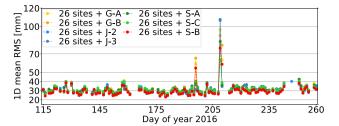


**Fig. 8** Statistical results of the GPS satellite orbit differences compared to the IGS final products of scenarios 1, 2, 7, 14, 19, and 26. The RMS of orbit differences in the along-track, the cross-track, and the radial directions are computed over epochs and satellites in each day. The 1D-mean RMS is computed over epochs, satellites, and the three orbital directions



**Fig. 9** Improvements of the GPS satellite orbits derived by scenarios 2, 7, 14, 19, and 26 compared to scenario 1. The improvements are derived from 1D-mean RMS. Vertical lines indicate the averaged values

(along-track > cross-track > radial). With only three LEOs integrated, the determined GPS satellite orbits of scenario 19 (28% improvement) are slightly better than those of scenario 2 (27% improvement) which includes seven well-selected additional ground stations, with a stronger improvement mainly in the along-track direction. There are two peaks in



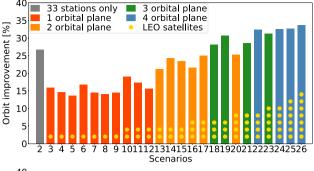
**Fig. 10** Statistical results of the GPS satellite orbit differences compared to the IGS final products of the one-LEO scenarios in time series. The RMS of orbit difference is computed over epochs, satellites, and three orbital directions (along-track, cross-track, and radial)

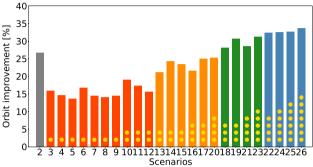
all the plots. One is on DOY 196, and the other one is on DOY 209 and 210. These three days are presented as orange dots in Fig. 3. After checking the residuals, we realized that the large RMS is caused by large errors in code measurements of a ground station (GODN). Since our data editing strategy is based on the residuals of the phase measurements, the station GODN with large residuals in its code measurements was not excluded. The GPS orbit improvements for these three days are more significant (about 50% to 82% in different scenarios) than for the other days (about 10% to 35%), and with only one LEO included, the improvement is close to the scenario including seven additional stations.

With only one LEO integrated (scenarios 3 to 9), the solutions are similar, for example, the 1D-mean RMS values vary slightly from 30.6 mm to 31.7 mm. Thus, compared to the 26-station only solution, the orbit improvements vary from 14% to 17%. However, the standard deviations of the RMS of these one-LEO scenarios have larger differences (up to 4 mm in 1D-mean). Seen from Fig. 10, there is no systematic difference between these one-LEO scenarios. The impact of different LEOs on the derived GPS satellite orbits is not visible.

Comparing the values given in Table 5 by considering the different LEO subsets, we find some phenomenons. In scenarios 10 to 15, two LEOs are included in the estimation. If the additional LEO is in the same orbital plane as the first one, the GPS orbit accuracy improves only by about 1 mm compared to the one-LEO scenarios (see scenarios 3 and 4 versus 10; 5 and 6 versus 11; 7 and 8 versus 12). Thus, the GPS orbit improvements compared to scenario 1 remain below 20% (16% to 19%). However, if the LEOs are flying in two different orbital planes, the orbit improvements compared to scenario 1 increase up to 24%, and the 1D-mean RMS values of the GPS orbits decrease to around 28 mm. By increasing the number of the integrated LEOs, the impact of the spacebased observations and the LEO orbital planes on the derived GPS satellite orbits is getting more obvious. Figure 11 shows the orbit improvements sorted with respect to the numbers of LEOs (upper) and the numbers of orbital planes (lower). The number of integrated LEOs is marked with yellow dots,



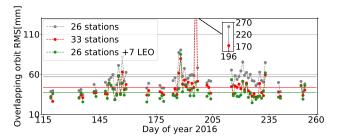




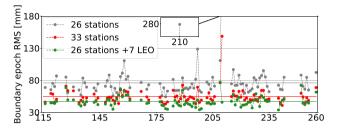
**Fig. 11** GPS satellite orbit improvements compared to scenario 1. The improvements are sorted with respect to the number of integrated LEOs (upper) and the number of LEO orbital planes (lower)

and the number of different orbital planes is represented by colored bars. Seen from the upper plot, GPS satellite orbits improve generally by integrating more LEOs. However, the improvement does not correspond strictly to the increasing number of LEOs. For example, scenario 20 (with four LEOs in two orbital planes) includes one more LEO than scenario 19 (with three LEOs in three orbital planes), but the GPS orbit improvement of it is smaller (25% against 31%). This phenomenon happens also to the comparison between scenario 22 (with four LEOs in four orbital planes) and scenario 23 (with four LEOs in three orbital planes). When we sort the results by the number of LEO orbital planes, a clear trend is visible. One can see the increasing GPS orbit improvement related to the increasing number of LEO orbital planes from the lower plot of Fig. 11. In summary, the LEO orbital geometry is more critical for the improvement of the GPS satellite orbits than the number of space-based observations.

The positive effect of different LEO orbit geometries to the geocenter estimation is also given by some other studies, for example, the simulation study of the LEOs+GPS combined processing for geocenter estimation by Kuang et al. (2015) and the real data study on the geocenter variations derived from combined processing of the ground- and space-based GPS observations by Männel and Rothacher (2017).



**Fig. 12** RMS of the differences between the 6-hour overlapping GPS satellite orbits computed over satellites and three orbital directions. The horizontal lines are the mean values of the time series.



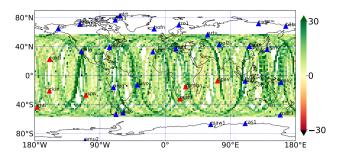
**Fig. 13** RMS of the GPS satellite position differences computed over satellites and three orbital directions at the day-boundary epoch between two 24-h arcs. The horizontal lines are the mean values of the time series

## 3.2 Internal comparison of the orbits

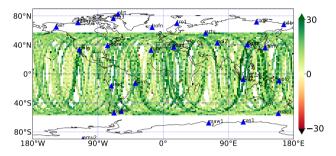
In this section, we will discuss the overlaps and the day-boundary epochs of the GPS satellite orbits derived from scenarios 1, 2, and 26. Due to the excluded days described in Sect. 2.1 and the overlapping processing strategy introduced in Sect. 2.4, only 65 pairs of overlapping orbits with a 6-hour arc length are available for the comparison. Figure 12 shows the 1D-mean RMS of the differences between the overlapping orbits. Seen from the time series of the three scenarios, the differences of the overlapping orbits are ranked as scenarios 1 > 2 > 26, and the mean values and the standard deviations of the overlapping orbit differences computed over 65 days are 57/27 mm, 44/19 mm and 38/10 mm.

There are 92 day-boundary epochs between the processed 112 days. The GPS satellite position differences in these day-boundary epochs are plotted in Fig. 13. The mean values and the standard deviations of the results computed over the 92 epochs are 76/25 mm, 55/12 mm, and 50/8 mm in scenarios 1, 2, and 26, respectively. This plot agrees with the comparison of the overlapping orbits in Fig. 12 and the external orbit comparison in Fig. 8. The outliers in Figs. 12 and 13 are caused by the observation errors of station GODN which have been mentioned in the last section.





**Fig. 14** GPS satellite orbit improvements of scenarios 2 w.r.t. scenario 1. IGS final products are reference. The color of each bin presents the average value of the epoch-wise solutions located in the bin. The unit of the color bar is [mm]

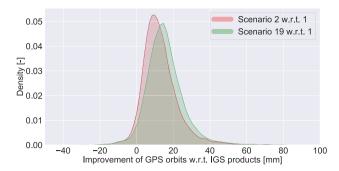


**Fig. 15** GPS satellite orbit improvements of scenarios 19 w.r.t. scenario 1. IGS final products are reference. The color of each bin presents the average value of the epoch-wise solutions located in the bin. The unit of the color bar is [mm]

## 3.3 Geolocated visualization of orbit comparison

In Sect. 2.3, we explained that the seven additional stations in scenario 2 were selected in the regions with few stations in scenario 1. For the analysis regarding station distributions, the GPS satellite orbit improvements of scenarios 2 and 19 compared to scenario 1 are projected to the surface of the Earth. Based on the epoch-wise orbit difference of each GPS satellite compared to the IGS final products, we computed the improvements of the GPS satellite orbits of scenarios 2 and 19 compared to scenario 1 with a 900-second sampling rate for all GPS satellites in 112 days (approximate 344,064 epochwise solutions). The results are presented in Figs. 14 and 15. In these two figures, the potential GPS satellite position area is divided into geographical  $2^{\circ} \times 2^{\circ}$  bins (10,260 in total). We computed the average of all the epoch-wise solutions located in the same bin. These geolocated statistical results are presented as the color of the corresponding bins. Green means the satellite orbits are closer to the IGS final products (improvement), and red means getting further (degradation). Additionally, the ground tracks of GPS satellites are also visible in the plots.

In general, with seven well-selected additional stations (scenario 2) or three LEOs (scenario 19), the GPS satellite orbits improve globally (as indicated by the green bins). The



**Fig. 16** Density distributions of all the epoch-wise solutions of satellite orbit improvements from scenario 1 to scenario 2 (red) and 19 (green). Positive means getting closer to the IGS final products

improvements are more clearly presented in Fig. 16. The density distributions of all the epoch-wise solutions from both comparisons are mainly positive. However, there are still regions without significant improvement (as indicated by the yellow bins), and there are only a few bins in red with degradation caused by the additional observations. Comparing Figs. 14 and 15, there are more dark-green bins and fewer red bins in the plot of scenario 19. Correspondingly, the density distribution of the epoch-wise solutions of scenario 19 is located on the right of that of scenario 2 in Fig. 16. Therefore, compared to scenario 1, the GPS satellite orbits derived in scenario 19 improve more than those of scenario 2. Particularly in some regions of the Pacific Ocean, the Indian Ocean, and Africa, seen from the color of the bins, the improvement of scenario 19 is more significant than that of scenario 2. In summary, to a sparsely and non-homogeneously distributed network of ground stations, the derived GPS satellite orbits are improved more by supplementing the network with three LEOs in different orbital planes than with seven well located additional stations, especially for the orbit arcs above the regions lacking stations.

## 3.4 Results about regional station network

To show the potential benefits of supplementing a regionally distributed ground network by integrating LEOs, we selected an additional subset of the available IGS stations. Figure 17 represents the network with five stations in China and another five stations in other regions. The figure shows that about two-thirds of potential GPS satellite positions  $(2^{\circ} \times 2^{\circ} \text{ resolution}, 20,200\,\text{km}$  altitude) can be observed by only two or even fewer stations. The GPS-only and seven-LEO-integrated POD were performed with this network. The 1D-mean RMS of the GPS satellite orbit differences compared to the IGS final products are presented in Fig. 18. Enhanced by seven LEOs, the 1D-mean RMS decreases significantly from about 25 cm to 4 cm. Also, the variations of the time series are reduced significantly from about 4.3 cm to



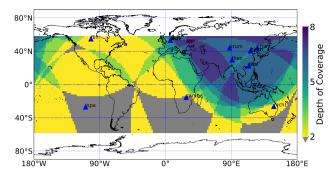


Fig. 17 A subset of the available IGS stations including five stations in China and five stations in other regions. The station visibility from a potential GPS satellite position (Depth of Coverage) is presented as a colored bin  $(2^{\circ} \times 2^{\circ} \text{ resolution}, 20,200 \, \text{km} \text{ altitude})$ 

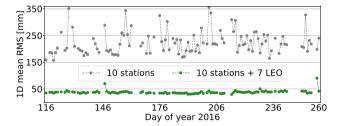


Fig. 18 GPS satellite orbit RMS from POD with and without LEOs (comparison against IGS final products)

0.7 cm. The GPS orbit improvement by integrating LEOs to a regional ground network was also demonstrated by Wang et al. (2016) with seven stations within China and three LEOs (GRACE-A/B and Feng Yun-3C). We also performed a test of just using five stations in China. To get an acceptable result, the number of observations should be increased by expending the arc length to three days and increasing the sampling rate to 30 seconds. The derived GPS satellite orbits differ from the IGS final products by about 20 cm in 1D-mean RMS, but the LEO orbits degrade significantly. Further studies should be done to improve the solution in this situation.

#### 4 Conclusions

It is a potential way to improve the GPS satellite orbits by including LEOs in the POD processing due to the additional observations and geometries offered by the LEOs, especially when there is no additional station available. The benefit of integrating LEOs into the POD is convincing for a sparse or regional network. The GPS satellite orbits are improved more by supplementing a sparse ground network with LEOs than with comparable numbers of additional stations. By integrating three LEOs in three different orbital planes into the POD, the determined GPS satellite orbits (25.1 mm 1D-mean RMS compared to the IGS final products) are more accurate than those of the scenario with seven carefully selected additional

ground stations (26.7 mm 1D-mean RMS). The benefits of adding LEOs do not correspond strictly to the number of the integrated LEOs but the diversity of their orbit planes. With the LEOs in different orbital planes, the GPS satellite orbits are improved. Ground stations might bring some undetectable outliers in the observations, especially in sparse networks with less redundancy. In general, the effect of these bad observations can be reduced with more ground stations or LEOs. The mitigation with LEOs introduced is more significant than with more ground stations added. By integrating seven LEOs, the GPS satellite orbits derived from a 10-station and regional ground network are improved impressively with decreased 1D-mean RMS compared to IGS final products from about 25 cm to 4 cm. The impact of LEO orbit modeling quality on derived GPS satellite orbits is not discussed in this study. The impact of different characteristics of the LEO orbits on the integrated POD is a topic for further studies.

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## **Appendix A**

See Figs. 19 and 20.



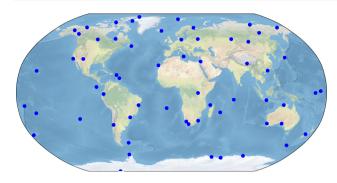


Fig. 19 A dense subset of the IGS ground stations with 62 globally distributed stations

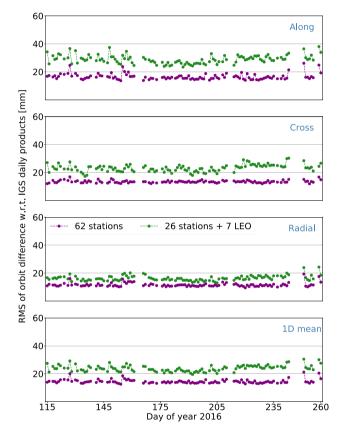
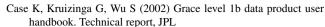


Fig. 20 Statistical results of the GPS satellite orbit differences w.r.t. the IGS final products of 62-station scenario and 26-station+7-LEO scenario. The RMS of orbit differences in the along-track, the cross-track, and the radial directions are computed over epochs and satellites in each day. The 1D-mean RMS is computed over epochs, satellites, and the three orbital directions

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