

Analysis and Correction of LEO Satellite Propagation Errors with Application to Navigation

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BIOGRAPHY

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ABSTRACT

The propagation error dynamics of low Earth orbit (LEO) space vehicles (SVs) are analyzed and modeled, leading to an approach to correct these errors. The approach maps a propagation error in the SV's argument of latitude orbital element to an error in the SV's position and velocity states, resolved in the SV's body frame of reference. The effect of an ephemeris epoch time adjustment on LEO SV orbit errors is examined using orbital dynamics. Implementing the epoch time adjustment is demonstrated to significantly decrease open-loop simplified general perturbations (SGP4)-propagated ephemeris errors with (i) real transmitted orbit data from an Orbcomm LEO SV and (ii) SpaceX published accurate orbit data describing four Starlink LEO SVs. Finally, experimental results are presented, evaluating opportunistic unmanned aerial vehicle (UAV) navigation with carrier phase measurements from 2 Orbcomm LEO SVs. The UAV traversed a trajectory of 780 m in 90 seconds. Global navigation satellite system (GNSS) signals were only available to the UAV during the first 30 seconds of the flight duration, during which the proposed ephemeris correction approach was performed, after which GNSS signals were cut off for the remaining 60 seconds, during which the UAV navigated with signals from the 2 LEO SVs. It is shown that using open-loop SGP4-propagated ephemerides for the LEO SVs yields a three-dimensional (3D) UAV position root-mean squared-error (RMSE) of 75.69 m, while incorporating the corrected ephemerides resulted in a position RMSE of 12.28 m.

I. INTRODUCTION

The advent of recent and upcoming low Earth orbit (LEO) satellite megaconstellations is shaping a new era of satellite-based navigation. LEO-based communication has been offered over the past couple of decades by LEO constellations such as Orbcomm, Iridium, and Globalstar; each of which composed of tens of LEO space vehicles (SVs). However, the birth of LEO megaconstellations such as Starlink, OneWeb, and Kuiper; which are aggregately planning to launch tens of thousands of LEO SVs is promising to revolutionize several domains, bringing unprecedented high-resolution images; remote sensing; and global, high-availability, high-bandwidth, and low-latency Internet (Osoro and Oughton, 2021). Recently, the growing interest

in utilizing LEO SVs for navigation purposes has been the subject of several theoretical and experimental studies (Morales et al., 2018; Jardak and Jault, 2022; Singh et al., 2022; Prol et al., 2022; Kassas et al., 2023; Shi et al., 2023; Yang et al., 2023; Khalife and Kassas, 2023; Farhangian and Landry, 2023; Jiang et al., 2023; Zhao et al., 2023; Liu et al., 2024; Prol et al., 2024; Kang et al., 2024).

This growing research effort towards LEO satellite-based positioning, navigation, and timing (PNT) is mainly due to their desirable attributes (Stock et al., 2024): (i) abundance and geometric diversity, (ii) high received signal power, (iii) high orbital velocity, and (iv) spectral diversity. These inherent qualities present LEO-PNT systems as a complement or even an alternative to classic GNSS systems that reside in the medium Earth orbit (MEO), and whose signals are vulnerable to attenuation and interference (Ioannides et al., 2016; Hegarty et al., 2020; Burbank et al., 2024). While some studies proposed to design navigation-dedicated LEO satellite constellation signals (Reid et al., 2020; Celikbilek et al., 2022; Egea-Roca et al., 2022; Ferre et al., 2022; Ries et al., 2023; Menzione and Paonni, 2023; Yan et al., 2023), other research proposed to exploit LEO SV signals for navigation in an opportunistic fashion (Kassas et al., 2019; Zhao et al., 2022; Singh et al., 2022; Kozhaya et al., 2023; Stock et al., 2023; Saroufim et al., 2023; Grayver et al., 2024; Kassas et al., 2024).

Opportunistic navigation with LEO SVs considers minimal or imperfect knowledge about the SV signals or ephemerides at the user (receiver) end. Recent designs of specialized receivers leveraged the periodicity in LEO SV signals (Landry et al., 2019; Khalife and Kassas, 2019; Huang et al., 2022; Liang et al., 2024) or adopted blind frameworks (cognitive receivers) (Khalife et al., 2021, 2022; Kozhaya and Kassas, 2023; Shahcheraghi and Kassas, 2024) to estimate key signal parameters and consequently generate navigation observables. In contrast to GNSS SVs that transmit ephemeris data and clock corrections in their navigation message, most LEO SVs are operated by private companies that do not publicly share information about the SV's position, velocity, and time. Therefore, the user must ensure continuous or intermittent access to reliable LEO SV ephemerides (Ardito et al., 2019) or implement a sufficiently accurate orbit initialization and propagation scheme in order to employ their navigation observables in a positioning or navigation solution (Shuster, 2017).

A common source of LEO SV ephemerides data is the North American Aerospace Defense Command (NORAD) published two-line element (TLE) files. TLE files are updated a few times a day and consist of designation, epoch time, and atmospheric drag parameter data, in addition to the SV Keplerian orbital elements: inclination, right ascension of ascending node, eccentricity, argument of perigee, mean anomaly, and mean motion (Kelso, 2022). The simplified general perturbation 4 (SGP4) software (Vallado and Crawford, 2008) is compatible with TLE files that are used to initialize the propagator. The reasons for inaccuracies resulting from the TLE-initialized SGP4-propagation scheme are two fold. First, TLE data describing LEO SV orbits suffer from inherent errors (Coffee et al., 2013; Riesing, 2015). The calculation of Keplerian elements from the SV's position and velocity vectors may cause practical and numerical issues, specifically in the presence of singular orbital elements (Montenbruck and Gill, 2000). Second, similarly to most orbit propagators, SGP4 involves dynamical models for the various forces acting on an SV, including gravitational forces, atmospheric drag, and solar radiation pressure. Nevertheless, orbit propagation through SGP4 has been shown to exhibit errors concentrated along the SV's direction of motion (Kelso, 2007). Specifically, it was found that SGP4 propagation induces a linearly increasing error in the SV's argument of latitude orbital element (Easthope, 2015). Previous work studied the recursive estimation of the argument-of-latitude to mitigate the large ephemeris errors inherited from TLE-initialized SGP4 orbit propagation (Hayek et al., 2023, 2024).

This paper focuses on the analysis and modeling of LEO SV orbit propagation errors to meet accurate PNT requirements by refining publicly available ephemeris data. This paper presents the following contributions. First, analytical models for the error propagation from the argument of latitude orbital element to the SV body frame position and velocity states are derived. Second, the effect of an ephemeris epoch time adjustment on the orbit errors is analyzed by examining the underlying dynamics. Implementing the epoch time adjustment is demonstrated to significantly decrease open-loop SGP4-propagated ephemeris errors with (i) real transmitted orbit data from an Orbcomm LEO SV and (ii) SpaceX published accurate orbit data describing four Starlink LEO SVs. Finally, experimental results are presented, evaluating opportunistic unmanned aerial vehicle (UAV) navigation with carrier phase measurements from 2 Orbcomm LEO SVs. The UAV traversed a trajectory of 780 m in 90 seconds. Global navigation satellite system (GNSS) signals were only available to the UAV during the first 30 seconds of the flight duration, during which the proposed ephemeris correction approach was performed, after which GNSS signals were cut off for the remaining 60 seconds, during which the UAV navigated with signals from the 2 LEO SVs. It is shown that using open-loop SGP4-propagated ephemerides for the LEO SVs yields a three-dimensional (3D) UAV position root-mean squared-error (RMSE) of 75.69 m, while incorporating the corrected ephemerides resulted in a position RMSE of 12.28 m.

The rest of the paper is organized as follows. Section II describes the modeling and analysis of LEO SV propagation errors and the effect of epoch time adjustment. Section III presents experimental results of UAV opportunistic navigation using corrected ephemerides sets. Section IV gives concluding remarks.

II. MODEL DESCRIPTION

This section presents analytical models for LEO SV position and velocity propagation errors and the effect of an ephemeris epoch time adjustment on the error dynamics.

1. Satellite Orbital Elements

The SV's dynamic state can be described in terms of the six classical orbital elements: angular momentum magnitude h , eccentricity e , inclination i , right ascension of the ascending node Ω , argument of perigee ω , and the true anomaly ν . The SV's motion is governed by the time derivatives of the the orbital elements that are described in Gauss' planetary equations (Curtis, 2019) as:

$$\begin{aligned}\frac{de}{dt} &= \frac{3J_2\mu R_e^2}{2hr_s^3} \left\{ \frac{h^2}{\mu r_s} \sin \nu (3 \sin^2 i \sin^2 u - 1) - \sin(2u) \sin^2 i [(3 + e \cos \nu) \cos \nu + e] \right\} \\ \frac{d\omega}{dt} &= \frac{3J_2\mu R_e^2}{2ehr_s^3} \left[\frac{h^2}{\mu r_s} \cos \nu (1 - 3 \sin^2 i \sin^2 u) - (2 + e \cos \nu) \sin(2u) \sin^2 i \sin \nu + 2e \cos^2 i \sin^2 u \right] \\ \frac{d\nu}{dt} &= \frac{h}{r_s^2} + \frac{3J_2\mu R_e^2}{2ehr_s^3} \left[\frac{h^2}{\mu r_s} \cos \nu (3 \sin^2 i \sin^2 u - 1) + (2 + e \cos \nu) \sin(2u) \sin^2 i \sin \nu \right] \\ \frac{du}{dt} &= \frac{h}{r_s^2} + \frac{3J_2\mu R_e^2}{2ehr_s^3} (2e \cos^2 i \sin^2 u),\end{aligned}\tag{1}$$

where μ is the Earth's standard gravitational parameter, R_e is the mean radius of the Earth, J_2 is the second zonal harmonic coefficient, $r_s \triangleq \|\mathbf{r}_s\|$, and $h \triangleq \|\mathbf{h}\|$ is the magnitude of the angular momentum vector $\mathbf{h} \triangleq \mathbf{r}_s \times \dot{\mathbf{r}}_s$. Fig. 1 shows the instantaneous time derivatives of the orbital elements over a 6-hour duration for Starlink ID 48010, that has an orbital period of about 95 minutes.

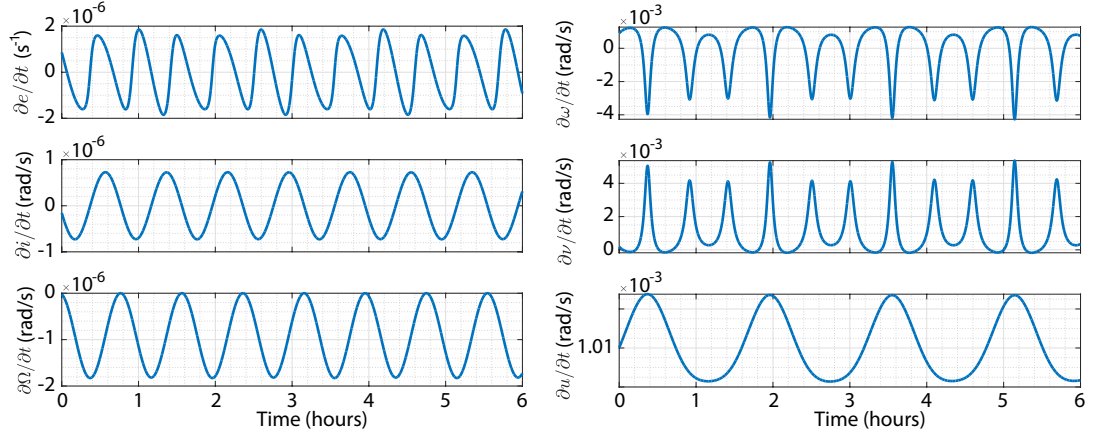


Figure 1: Time derivatives of the orbital elements for Starlink 48010.

The argument of latitude $u \triangleq \omega + \nu$ is the angle from the line of nodes, i.e., the intersection of the orbital and equatorial planes, to the SV position vector. It can be seen in Fig. 1 that the rates of the argument of perigee, true anomaly, and the argument of latitude are 3 orders of magnitude higher than the rates of the eccentricity, inclination, and right ascension, indicating that most of the SV dynamics are concentrated in the argument of latitude element.

2. Satellite Propagation Error Dynamics

The SV's position and velocity vectors in the Earth-centered inertial (ECI) frame $\{\mathbf{i}\}$ can be written in terms of the orbital elements (Montenbruck and Gill, 2000) as

$${}^i\mathbf{r}_s = r_s \begin{bmatrix} \cos u \cos \Omega - \sin u \cos i \sin \Omega \\ \cos u \sin \Omega + \sin u \cos i \cos \Omega \\ \sin u \sin i \end{bmatrix} \quad \text{and} \quad {}^i\dot{\mathbf{r}}_s = \frac{\mu}{h} \begin{bmatrix} -\cos \Omega (\sin u + e \sin \omega) - \sin \Omega \cos i (\cos u + e \cos \omega) \\ -\sin \Omega (\sin u + e \sin \omega) + \cos \Omega \cos i (\cos u + e \cos \omega) \\ \sin i (\cos u + e \cos \omega) \end{bmatrix}.\tag{2}$$

Since most of the ephemeris prediction error is concentrated in the argument-of-latitude element, the prediction errors for r , i , and Ω will be neglected; thus, the predicted SV position and velocity are written as

$${}^i\mathbf{r}'_s \approx r_s \begin{bmatrix} \cos u' \cos \Omega - \sin u' \cos i \sin \Omega \\ \cos u' \sin \Omega + \sin u' \cos i \cos \Omega \\ \sin u' \sin i \end{bmatrix} \quad \text{and} \quad {}^i\dot{\mathbf{r}}'_s \approx \frac{\mu}{h} \begin{bmatrix} -\cos \Omega (\sin u' + e \sin \omega) - \sin \Omega \cos i (\cos u' + e \cos \omega) \\ -\sin \Omega (\sin u' + e \sin \omega) + \cos \Omega \cos i (\cos u' + e \cos \omega) \\ \sin i (\cos u' + e \cos \omega) \end{bmatrix}, \quad (3)$$

where u' represents the predicted argument of latitude. The SV position and velocity errors are defined as

$$\tilde{\mathbf{r}}_s \triangleq \mathbf{r}_s - \mathbf{r}'_s \quad \text{and} \quad \tilde{\dot{\mathbf{r}}}_s \triangleq \dot{\mathbf{r}}_s - \dot{\mathbf{r}}'_s.$$

The ephemeris errors of the predicted orbit in the ECI frame $\{i\}$ can be represented in the SV's body frame $\{b\}$, namely the RSW frame, as

$${}^b\tilde{\mathbf{r}}_s = \mathbf{R}_i^b {}^i\tilde{\mathbf{r}}_s \quad \text{and} \quad {}^b\tilde{\dot{\mathbf{r}}}_s = \mathbf{R}_i^b {}^i\tilde{\dot{\mathbf{r}}}_s \quad (4)$$

$$\mathbf{R}_i^b = \begin{bmatrix} [\mathbf{h}/h \times \mathbf{r}_s/r]^\top \\ \mathbf{h}^\top/h \\ \mathbf{r}_s^\top/r \end{bmatrix},$$

where \mathbf{R}_i^b is the rotation matrix from the the ECI frame $\{i\}$ to the SV's RSW satellite coordinate system $\{b\}$, that is determined using the LEO SV's true dynamic states, where the SV's position vector determines the *radial* axis, the angular momentum vector determines the *cross-track* axis, and finally the common perpendicular to both the radial and cross-track directions determines the *along-track* axis.

Using standard trigonometric identities, the position and velocity errors of the predicted orbit (4) due to an argument-of-latitude error $\tilde{u} \triangleq u - u'$ can be represented in the SV's body frame, i.e., in the along-track (A), cross-track (C), and radial (R) components as

$$\begin{aligned} {}^b\tilde{r}_s^A &= \frac{r_s}{2(e \cos \nu + 1)} \left\{ 2 \sin \tilde{u} - e[\sin(u' - 2u + \omega) + \sin(u' - \omega)] \right\} \\ {}^b\tilde{r}_s^C &= 0 \\ {}^b\tilde{r}_s^R &= r_s(1 - \cos \tilde{u}) \end{aligned} \quad (5)$$

$$\begin{aligned} {}^b\tilde{\dot{r}}_s^A &= \frac{\mu}{2h(e \cos \nu + 1)} \left\{ -2 \cos \tilde{u} + 2 + e[-\cos(u' - 2u + \omega) + 2 \cos(u - \omega) - \cos(u' - \omega)] \right\} \\ {}^b\tilde{\dot{r}}_s^C &= 0 \\ {}^b\tilde{\dot{r}}_s^R &= -\frac{\mu}{h} \sin \tilde{u}. \end{aligned} \quad (6)$$

For perfectly circular orbits, i.e., $e \equiv 0$, the predicted orbit's body frame errors can be further simplified to

$$\begin{aligned} {}^b\tilde{r}_s^A &= r_s \sin \tilde{u} & {}^b\tilde{\dot{r}}_s^A &= \frac{\mu}{h}(1 - \cos \tilde{u}) \\ {}^b\tilde{r}_s^C &= 0 & {}^b\tilde{\dot{r}}_s^C &= 0 \\ {}^b\tilde{r}_s^R &= r_s(1 - \cos \tilde{u}) & {}^b\tilde{\dot{r}}_s^R &= -\frac{\mu}{h} \sin \tilde{u}. \end{aligned}$$

The following remarks can be deduced from the above expressions. First, the predicted orbit's body frame errors suggest that the along-track position and radial velocity errors are both governed by the $\sin \tilde{u}$ term with different scaling factors and opposite directions. Note that propagation errors are typically concentrated in these two states. Second, the radial position and along-track velocity errors are both governed by the $(1 - \cos \tilde{u})$ term with different scaling factors. Third, a propagation error that is purely concentrated in the argument of latitude element exhibits neither position nor velocity errors in the cross-track direction.

To analyze and evaluate the derived propagation error expressions, two different ephemeris sets for the same LEO SVs were considered: (i) SpaceX-published ephemeris files (SpaceX, 2024) as the true ephemeris and (ii) SGP4-propagated TLE files as the predicted ephemeris. Empirical SV position and velocity errors between the true and predicted ephemeris sets were computed and resolved in the SV's body frame according to (4). On the other hand, the analytical SV position and velocity errors were computed based on the derived expressions in (5) and (6). Fig. 2 shows the error time series over a 1.5-hour duration for four Starlink LEO SVs, labeled by their NORAD IDs. The close match between the empirical and analytical curves shows how the position and velocity errors can be parameterized by the argument of latitude error. It is important to note that the presented analytical expressions do not consider the errors in the remaining orbital elements, namely the angular momentum magnitude, eccentricity, inclination, and right ascension, leading to slight discrepancies with the error values obtained from the ephemerides sets, as seen in Fig. 2.

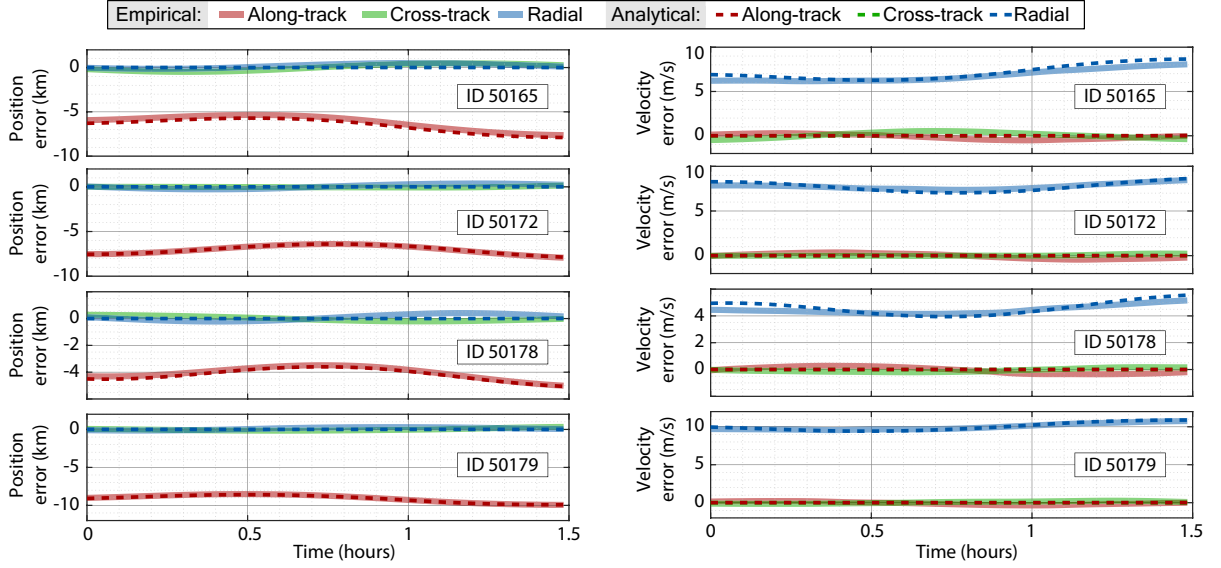


Figure 2: Empirical and analytical SV position (left) and velocity (right) errors in the SV's body frame for 4 Starlink LEO SVs.

3. Ephemeris Epoch Time Adjustment

The SV position and velocity prediction error magnitudes are determined by

$$\tilde{r}_s(t) \triangleq \|\mathbf{r}_s(t) - \mathbf{r}'_s(t)\|_2, \quad (7)$$

$$\tilde{\dot{r}}_s(t) \triangleq \|\dot{\mathbf{r}}_s(t) - \dot{\mathbf{r}}'_s(t)\|_2. \quad (8)$$

Using (2) and (3) and standard trigonometric identities, (7) and (8) can be simplified to

$$\tilde{r}_s(t) \approx r_s(t) \sqrt{2(1 - \cos[\tilde{u}(t)])}, \quad (9)$$

$$\tilde{\dot{r}}_s(t) \approx \frac{\mu}{h(t)} \sqrt{2(1 - \cos[\tilde{u}(t)])}. \quad (10)$$

The SV position and velocity error magnitudes can be significantly reduced by invoking an epoch time adjustment to the predicted ephemeris. The following analysis explains this phenomenon. The position and velocity errors between the true SV and an epoch time-adjusted version of the predicted SV are written as

$$\tilde{r}_s(t, \tau) \triangleq \|\mathbf{r}_s(t) - \mathbf{r}'_s(t + \tau)\|, \quad (11)$$

$$\tilde{\dot{r}}_s(t, \tau) \triangleq \|\dot{\mathbf{r}}_s(t) - \dot{\mathbf{r}}'_s(t + \tau)\|. \quad (12)$$

Using (9) and (10), (11) and (12) can respectively be written as

$$\tilde{r}_s(t, \tau) \approx r_s(t) \sqrt{2(1 - \cos[u(t) - u'(t + \tau)])}, \quad (13)$$

$$\tilde{\dot{r}}_s(t, \tau) \approx \frac{\mu}{h(t)} \sqrt{2(1 - \cos[u(t) - u'(t + \tau)])}. \quad (14)$$

Using the argument of latitude dynamics described in (1), where the first term is more dominant than the J_2 perturbation term, the following relationship can be established

$$u(t + \tau) \approx u(t) + \frac{h}{r_s^2} \tau. \quad (15)$$

Substituting (15) into (13) and (14), the position and velocity errors in terms of the epoch time adjustment become

$$\tilde{r}_s(t, \tau) = r_s(t) \sqrt{2 \left(1 - \cos \left[\tilde{u}(t) - \frac{\tau h(t)}{r_s^2(t)} \right] \right)}, \quad (16)$$

$$\tilde{\dot{r}}_s(t, \tau) = \frac{\mu}{h(t)} \sqrt{2 \left(1 - \cos \left[\tilde{u}(t) - \frac{\tau h(t)}{r_s^2(t)} \right] \right)}. \quad (17)$$

The epoch time adjustment that minimizes the position and velocity errors is calculated as

$$\tau^*(t) = \arg \min_{\tau} \tilde{r}_s(t, \tau) = \arg \min_{\tau} \tilde{\dot{r}}_s(t, \tau) = \frac{r_s^2(t) \tilde{u}(t)}{h(t)}. \quad (18)$$

Moreover, by taking the second derivative of the squared position error with respect to the epoch time adjustment, the convexity property is shown

$$\frac{\partial^2 \tilde{r}_s^2(t, \tau)}{\partial \tau^2} = 2 \cos \left(\tilde{u}(t) - \frac{\tau h}{r_s^2} \right) \frac{h^2}{r_s^2} \geq 0, \quad \text{for } \left| \tilde{u}(t) - \frac{h\tau}{r_s^2} \right| \leq \frac{\pi}{2}, \quad (19)$$

where τ will practically lie in the domain of convexity in (19) since \tilde{u} is much smaller than $\frac{\pi}{2}$.

The effect of ephemeris epoch time adjustment is analyzed by comparing the TLE-initialized, SGP4-propagated position and velocity with real GPS-derived position and velocity data, which is transmitted from Orbcomm satellite-mounted GPS receivers. The truth ephemeris was obtained by a LEO receiver based in Irvine, California, USA, which decoded the transmitted ephemeris from Orbcomm FM107 SV's downlink signals over approximately 280 seconds. Fig. 3 shows the position and velocity errors between the true ephemeris and the SGP4-propagated counterpart, i.e., the plots depict $\tilde{r}_s(t_0, \tau)$ and $\tilde{\dot{r}}_s(t_0, \tau)$ as a function of τ at an arbitrarily chosen fixed time instant $t_0 \equiv 100$ s into the recorded data. The empirical position and velocity errors are calculated according to (11) and (12), respectively, while the analytical position and velocity errors are calculated according to (16) and (17), respectively. The epoch time adjustment that minimizes the position and velocity was obtained empirically at a 1 ms step size and was found to be -949 ms and -917, respectively. On the other hand, the analytical minimizing epoch time adjustment was computed according to (18) and was found to be -996 ms. The discrepancies between the empirical and analytical errors arise due to the assumption that the predicted orbit errors are only translated in an argument of latitude error and do not affect the remaining orbital elements.

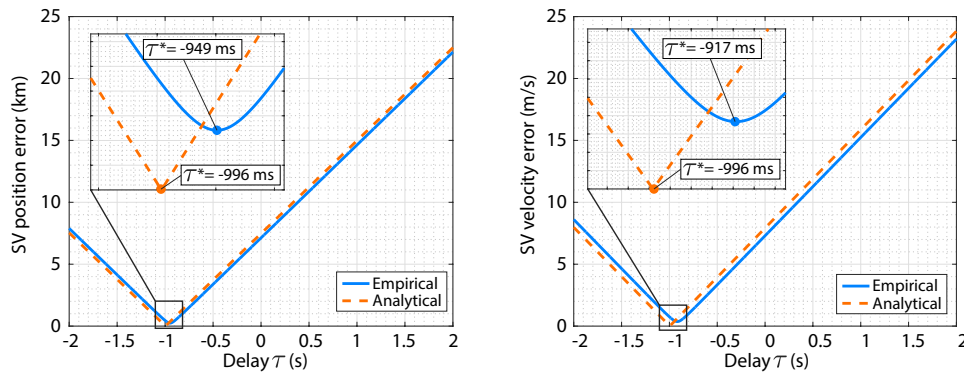


Figure 3: Empirical and analytical SV position (left) and velocity (right) errors versus ephemeris epoch time adjustment τ . The values of τ^* denote the epoch time adjustment that minimizes the SV position and velocity errors, determined empirically or analytically.

To demonstrate the effect of epoch time adjustment on propagated orbit errors, (18) is used to generate an adjusted ephemeris set from the SGP4-propagated ephemeris, denoted $\{\mathbf{r}'(t + \tau^*(t)), \dot{\mathbf{r}}'(t + \tau^*(t))\}$. Fig. 4 shows (top) the original SGP4 position and velocity errors, computed as $\|\mathbf{r}_s(t) - \mathbf{r}'_s(t)\|_2$ and $\|\dot{\mathbf{r}}_s(t) - \dot{\mathbf{r}}'_s(t)\|_2$, respectively, and (bottom) the epoch time-adjusted SGP4 position and velocity errors, computed as $\|\mathbf{r}_s(t) - \mathbf{r}'_s(t + \tau^*(t))\|_2$ and $\|\dot{\mathbf{r}}_s(t) - \dot{\mathbf{r}}'_s(t + \tau^*(t))\|_2$, respectively. The

RMSE of the SGP4-propagated position and velocity decreased from about 7,136 m to 392 m and from about 7.39 m/s 0.67 m/s after the epoch time adjustment. This experimental analysis shows the significant improvement in the accuracy of the epoch time-adjusted predicted orbit. Note that the remaining errors are due to the aforementioned assumptions in the computation of $\tau^*(t)$ as well as the original cross-track and radial errors in the predicted orbit.

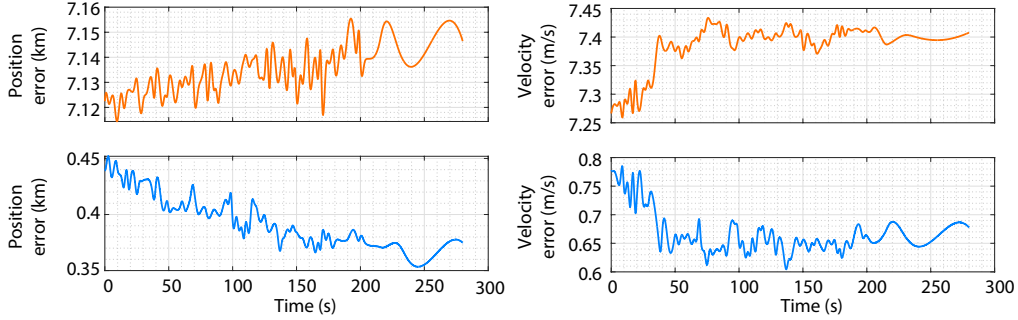


Figure 4: Orbcomm FM107 position and velocity errors before (top) and after (bottom) epoch time adjustment.

Ephemeris epoch time adjustment was also analyzed with SpaceX published accurate ephemerides files (SpaceX, 2024), considered as the true orbit versus TLE-initialized SGP4-propagated ephemerides, considered as the predicted orbit. Fig. 5(a) shows the calculated epoch time adjustment according to (18) for four Starlink LEO SVs, labeled by their NORAD IDs. Fig. 5(b) and (c) show the original predicted orbit position and velocity errors, while Fig. 5(d) and (e) show the epoch time-adjusted SGP4 position and velocity errors, computed as $\|\mathbf{r}_s(t) - \mathbf{r}'_s(t + \tau^*(t))\|_2$ and $\|\dot{\mathbf{r}}_s(t) - \dot{\mathbf{r}}'_s(t + \tau^*(t))\|_2$, respectively. The errors decreased by approximately one order of magnitude after the epoch time adjustment.

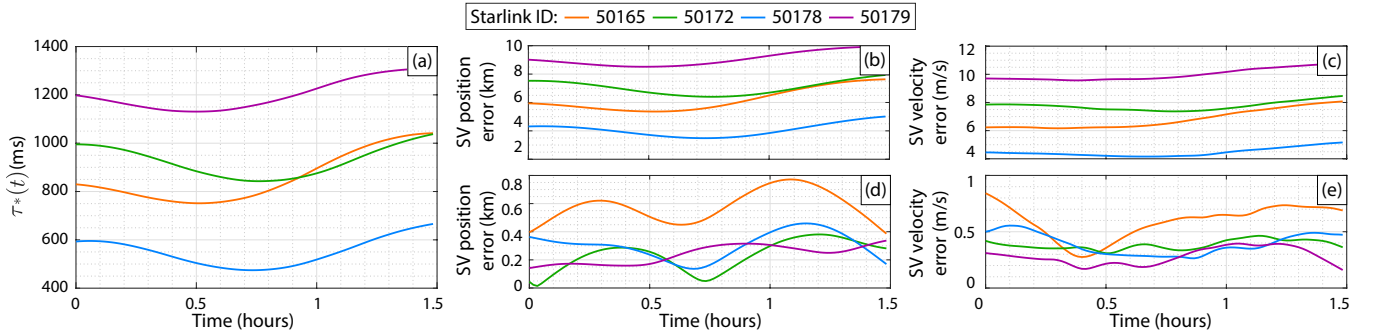


Figure 5: (a) Epoch time adjustment calculated according to (18) for four different Starlink SVs. SV (b) position and (c) velocity errors of the original open-loop SGP4-propagated orbits. SV (d) position and (e) velocity errors of the epoch time adjusted SGP4-propagated orbits.

III. EXPERIMENTAL RESULTS

This section presents UAV navigation experimental results validating the proposed ephemeris error correction with Orbcomm LEO SV signals. The experimental setup is first described and then experimental results are presented.

1. Experimental Setup

A DJI Matrice 600 UAV was equipped with an Ettus E312 universal software radio peripheral (USRP), a high-end very high frequency (VHF) antenna, and a small consumer-grade GPS antenna to discipline the onboard oscillator. The receiver was tuned to a 137 MHz carrier frequency with 2.4 Msps sampling bandwidth to collect downlink Orbcomm signals that are transmitted in the 137-138 MHz band. Samples of the received signals were stored for off-line post-processing. The software defined radio (SDR) implementation discussed in (Kozhaya and Kassas, 2022) was used to generate carrier phase measurements from the collected samples. The ground truth UAV trajectory was taken from its GNSS-based on-board navigation system. The experimental hardware setup is shown in Fig. 6(a). The UAV traversed a total trajectory of 780 m in 90 seconds. Over the course of the trajectory, the on-board receiver collected signals from 2 Orbcomm LEO SVs, namely FM108 and FM116. A skyplot of the 2 Orbcomm SVs is shown in Fig. 6(b), demonstrating the relative geometries of the SVs with respect to the UAV. The carrier phase measured by the receiver for the 2 Orbcomm SVs is shown along with the expected carrier phase calculated from TLE files and SGP4 software in Fig. 6(c).

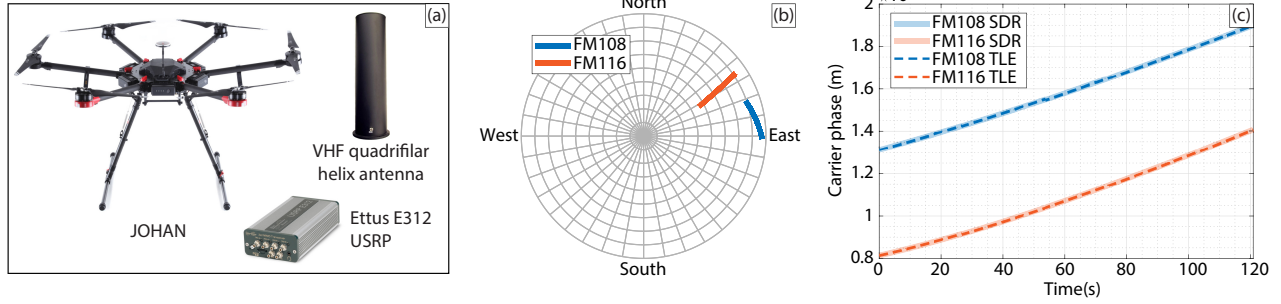


Figure 6: Experimental setup and environment: (a) UAV on-board signal collection hardware, (b) skyplot of the 2 Orbcomm SVs during the experiment, and (c) the measured carrier phase using the SDR and the expected carrier phase based on the TLE for both Orbcomm SVs.

2. Navigation Filter Settings

GNSS measurements were only available to the UAV during the first 30 seconds of the flight duration, during which the ephemeris correction approach discussed in Section II was implemented, before being virtually cut off for the remaining 60 seconds, during which the UAV navigated with LEO signals. The argument of latitude errors were estimated via a batch least squares that incorporated the first 30 seconds of carrier measurements to the 2 LEO SVs (Hayek and Kassas, 2024). Next, the epoch time adjustment was computed based on (18) and was found to be $\tau_1^* = 190.8\text{ms}$ and $\tau_2^* = 14.6\text{ms}$ for Orbcomm FM108 and FM116, respectively. These values were applied to the open-loop SGP4-propagated ephemeris for each SV to generate the corrected ephemerides denoted by $\{\mathbf{r}'(t + \tau_i^*), \dot{\mathbf{r}}'(t + \tau_i^*)\}_{i=1}^2$.

The estimated state vector by the extended Kalman filter (EKF) consisted of the UAV's position and velocity, along with two clock error states, capturing the difference between the receiver's and each LEO SV's clock error states. The UAV's position and velocity were modeled according to a nearly constant velocity model and the clock states were modeled according to the standard double integrator driven by noise (Brown and Hwang, 1997). Note that the carrier phase ambiguity term λN was lumped into the clock error states for each SV. The UAV's continuous-time acceleration process noise spectra were set to $\tilde{q}_E = \tilde{q}_N = 5 \text{ m}^2/\text{s}^3$ and $\tilde{q}_U = 0.05 \text{ m}^2/\text{s}^3$ for the East, North, and Up components, respectively. The choice of these spectra is due to the fact that the UAV's maneuvers are mainly in the horizontal direction. The position and velocity process noise covariance matrix can be readily obtained from these power spectra (Kassas and Humphreys, 2014). The UAV's and LEO SV's oscillator qualities were both assumed to be that of a typical oven-controlled crystal oscillator (OCXO), from which the process noise covariance can also be readily obtained (Kassas and Humphreys, 2014). A prior for the UAV position and velocity was obtained from the UAV's on-board GNSS system. The initial UAV position and velocity estimation error covariance values were set to $\mathbf{P}_{\mathbf{r}}(0|0) \equiv 10 \cdot \mathbf{I}_{3 \times 3} \text{ m}^2$ and $\mathbf{P}_{\dot{\mathbf{r}}}(0|0) \equiv \mathbf{I}_{3 \times 3} (\text{m/s})^2$, respectively. The initial estimation error covariance for the clock error states of each SV was set to $\mathbf{P}_{\text{clk}}(0|0) \equiv \text{diag}[9 \times 10^4, 9 \times 10^2]$ with units $[\text{m}^2, (\text{m/s})^2]$, corresponding to a 1σ of $1 \mu\text{s}$ and $0.1 \mu\text{s/s}$ for the clock bias and drift, respectively. The carrier phase measurement noise was modeled as a discrete-time zero-mean white Gaussian sequence with variance σ_i^2 . The filter's time-varying measurement noise standard deviations were set to be equal to the measurement innovations for each SV and ranged between 0.85 mm and 15.08 m for Orbcomm FM108 and 2.90 mm and 16.94 m for Orbcomm FM116. Altimeter measurements from the UAV's on-board navigation system were also fused into the EKF with a noise variance of 3 m^2 . To demonstrate the benefit of correcting the LEO SV ephemerides, the UAV's 3-D position was estimated using the carrier phase measurements from the 2 LEO SVs using (i) the open-loop SGP4-propagated versus (ii) the corrected ephemerides.

3. Results

The navigation results demonstrate the advantages of adopting the ephemerides correction strategy. Fig. 7 shows the EKF UAV position and velocity estimation errors along with the $\pm 3\sigma$ uncertainty bounds for the open-loop SGP4 ephemerides case. The errors are resolved in the local navigation frame, namely the East, North, and Up directions. The UAV position estimate is inconsistent as the error is not contained within the uncertainty bounds. This is due to the model mismatch in the filter when using the open-loop SGP4-propagated ephemerides that suffer from SV position errors. Fig. 8 shows the EKF UAV position and velocity estimation errors along with the $\pm 3\sigma$ uncertainty bounds for the corrected ephemerides case. The errors are bounded by the filter's uncertainty which is slightly diverging during the flight duration. This divergence could be attributed to stochastic observability issues (Mortlock and Kassas, 2020). The altitude measurements prevent the divergence of the Up direction errors in both cases. The 3D position RMSEs and final errors for both cases are summarized in Table 1. The LEO SVs' trajectories are shown in Fig. 9(a) and the UAV ground truth and estimated trajectories are shown in Fig. 9(b).

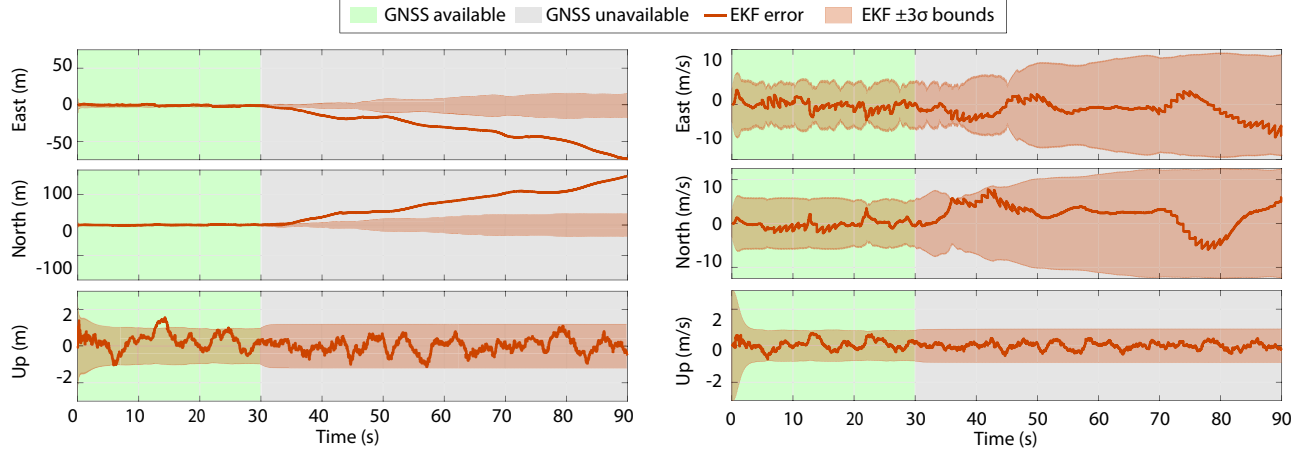


Figure 7: UAV position (left) and velocity (right) EKF estimation errors and $\pm 3\sigma$ bounds, resolved in the ENU frame, where the SV positions are obtained from open-loop SGP4 propagation.

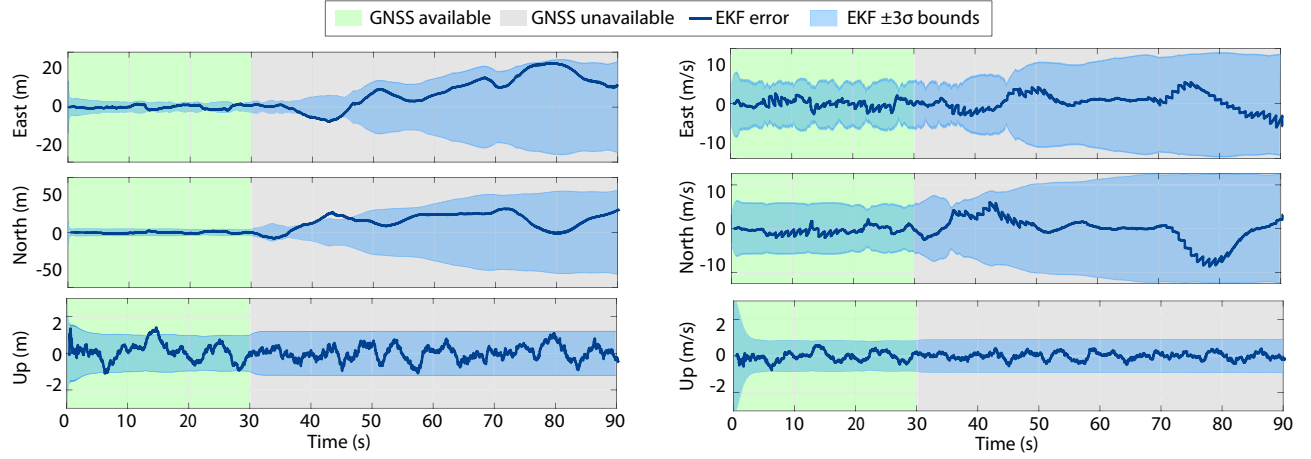


Figure 8: UAV position (left) and velocity (right) EKF estimation errors and $\pm 3\sigma$ bounds, resolved in the ENU frame, where the SV positions are obtained from the corrected ephemerides.

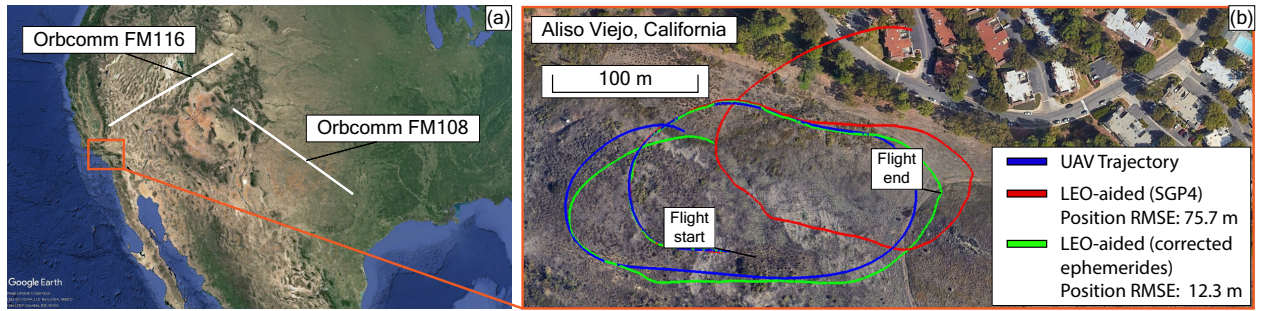


Figure 9: Experimental results: (a) trajectories of the 2 Orbcomm LEO SVs and (b) the UAV's true trajectory and estimated trajectory with (i) open-loop SGP4 propagated and (ii) corrected ephemerides.

Table 1: Experimental results: UAV 3D position RMSEs and 3D final errors

	Position RMSE [m]	Final error [m]
Open-loop SGP4 ephemerides	75.69	176.59
Corrected ephemerides	12.28	22.26

IV. CONCLUSION

This paper developed analytical models for LEO SV orbit propagation errors to correct publicly available ephemeris information. The effect of epoch time adjustment was examined and was shown to lead to significant ephemeris error reductions with Orbcomm experimental data as well as SpaceX published accurate ephemerides sets. The advantages of corrected LEO SV ephemerides sets were demonstrated experimentally with UAV opportunistically navigating with carrier phase observables from 2 Orbcomm LEO SVs. It is shown that using open-loop SGP4-propagated ephemerides yields a 3D UAV position RMSE of 75.69 m over a trajectory of 780 m, while incorporating the corrected ephemerides sets resulted in an RMSE of 12.28 m.

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