# Time-of-Arrival of Coronal Mass Ejections: A Two-Phase Kinematics Approach Based on Heliospheric Imaging Observations 

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#### Abstract

Despite the ability to image coronal mass ejections (CMEs) from the Sun through the inner heliosphere, the forecasting of their Time-of-Arrival (ToA) to Earth does not yet meet most Space weather users' requirements. The main physical reason is our incomplete understanding of CME propagation in the inner heliosphere. Therefore, many ToA forecasting algorithms rely on simple empirical relations to represent the interplanetary propagation phase using, mostly, kinematic information from coronagraphic observations below 30 solar radii ( Rs ) and a couple rather implying assumptions of constant direction and speed for the transient. Here, we explore a different, yet still empirical approach. We replace the assumption of constant speed in the inner heliosphere with a two-phase behavior consisting of a decelerating (or accelerating) phase from 20 Rs to some distance, followed by a coasting phase to Earth. In a nod towards a forecasting scheme, we consider only Earth-directed CMEs use kinematic measurements only from the Heliospheric Imagers aboard both STEREO spacecraft, treat each spacecraft separately to increase the event statistics, analyze the measurements in a data-assimilative fashion and intercompare them against three popular localization schemes for single viewpoint observations (fixed- $\varphi$, harmonic mean and self-similar expansion. For the 21 cases, we obtain the best mean absolute error (MAE) of $6.4 \pm 1.9$ hours, for the harmonic mean approximation. Remarkably, the difference between predicted and observed ToA is $<52$ minutes for $42 \%$ of the cases. We find that CMEs continue to decelerate beyond even 0.7 AU , in some cases.


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# Time-of-Arrival of Coronal Mass Ejections: A Two-Phase Kinematics Approach Based on 

 Heliospheric Imaging ObservationsEvangelos Paouris ${ }^{1,2}$ and Angelos Vourlidas ${ }^{\mathbf{2}}$<br>${ }^{1}$ George Mason University, Fairfax, VA, USA.<br>${ }^{2}$ The Johns Hopkins University Applied Physics Laboratory, Laurel, MD, USA.

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## Key Points:

- We approach the inner heliospheric propagation of coronal mass ejections as a two-phase behavior of deceleration followed by coasting
- The lowest mean absolute ToA error is 6.4 hours for a sample of 19 events for harmonic mean technique
- Our data-assimilative approach indicates reasonable forecasts with a mean lead time of 31 hours


#### Abstract

Despite the ability to image coronal mass ejections (CMEs) from the Sun through the inner heliosphere, the forecasting of their Time-of-Arrival (ToA) to Earth does not yet meet most Space weather users' requirements. The main physical reason is our incomplete understanding of CME propagation in the inner heliosphere. Therefore, many ToA forecasting algorithms rely on simple empirical relations to represent the interplanetary propagation phase using, mostly, kinematic information from coronagraphic observations below 30 solar radii (Rs) and a couple rather implying assumptions of constant direction and speed for the transient. Here, we explore a different, yet still empirical approach. We replace the assumption of constant speed in the inner heliosphere with a two-phase behavior consisting of a decelerating (or accelerating) phase from 20 Rs to some distance, followed by a coasting phase to Earth. In a nod towards a forecasting scheme, we consider only Earth-directed CMEs use kinematic measurements only from the Heliospheric Imagers aboard both STEREO spacecraft, treat each spacecraft separately to increase the event statistics, analyze the measurements in a data-assimilative fashion and intercompare them against three popular localization schemes for single viewpoint observations (fixed- $\varphi$, harmonic mean and self-similar expansion. For the 21 cases, we obtain the best mean absolute error (MAE) of $6.4 \pm 1.9$ hours, for the harmonic mean approximation. Remarkably, the difference between predicted and observed ToA is < 52 minutes for $42 \%$ of the cases. We find that CMEs continue to decelerate beyond even 0.7 AU , in some cases.


## Plain Language Summary

Solar eruptive phenomena like the coronal mass ejections (CMEs) are able nowadays to affect almost every aspect of human activity in space or on the ground and human life. The early and valid prediction of the impact of these events on Earth is one of the most important open research fields. We propose a new way to use data from heliospheric imagers (HIs) onboard STEREO spacecraft which observe the area between the Sun and the Earth. In all previous published works where utilized data from HIs the CME propagation assumed as a constant speed movement. In our work we track CMEs in the inner heliosphere and we apply a simple and at the same time realistic scenario for their propagation. We assume that all CMEs, after their eruption from the solar atmosphere, are accelerating (or decelerating) to some distance, followed by a coasting phase to Earth. We found the lowest mean absolute error (MAE)between the predicted and the observed arrival times of CMEs to Earth was 6.4 hours for a sample of 19 cases. This value is almost 3.5 hours lower than the MAE which occurs from the approach of constant speed movement.

## 1 Introduction

The Coronal Mass Ejections (CMEs) are solar eruptions of great interest as their interplanetary counterparts (ICMEs) trigger the most intense geomagnetic storms (see e.g. Tsurutani and Gonzalez, 1997; Richardson et al., 2006; Zhang et al., 2007; Paouris and Mavromichalaki, 2017a; Paouris et al., 2021a and references therein). CMEs are primarily observed by white light coronagraphs like the Large Angle and Spectroscopic Coronagraph (LASCO; Brueckner et al., 1995) aboard the Solar and Heliospheric Observatory (SOHO; Domingo et al., 1995) and the Sun Earth Connection Coronal and Heliospheric Investigation (SECCHI) instruments (Howard et al., 2008) aboard the Solar TErrestrial RElations Observatory (STEREO) mission (Kaiser et al., 2008). The STEREO mission inaugurated a new era in Heliophysics research by offering the unique opportunity to simultaneously observe the same CME, with identical instrumentation, from two
vantage points along the full Sun-Earth line. This capability drove a large amount of research and technique development to estimate the properties of CMEs (angular width, linear speed, mass, propagation direction, etc.) based on multi-view point observations (see e.g. Mierla et al., 2008; Howard \& Tappin, 2008; Temmer et al., 2009; Lee et al., 2015; Jang et al., 2016; Vourlidas et al., 2017; Balmaceda et al., 2018).
The SECCHI payload includes a Heliospheric Imager (HI), consisting of two cameras (Eyles et al., 2009). The inner camera (HI-1) field of view (FOV) extends from $4^{\circ}$ to $24^{\circ}$ and is centered at $14^{\circ}$ elongation from Sun center. The outer camera (HI-2) FOV extends between $18.7^{\circ}-88.7^{\circ}$ centered at $53.7^{\circ}$ from Sun center. This instrument can observe a CME from a distance of 15 up to 330 solar radii (Rs), approximately. Taking radial slices from combined HI-1 and HI-2 runningdifference images along a given position angle (PA) and then stacking them as a function of time results in time-elongation maps, or so-called J-maps (see e.g. Sheeley et al., 1999; 2008; Barnes et al., 2019 and references therein). Any outward propagating structure is easily spotted in J-maps as a bright ridge. The tracking of a feature, e.g. the CME front, in J-maps provides the elongation angles as a function of time. the most important questions for space weather forecasting are: when will the CME arrive and how strong the impact will be. The answers to these are provided by three quantities: the Time-of-Arrival (ToA), the Speed-on-Arrival (SoA) and the magnitude of the southward component of the ICME magnetic field (see e.g. Vourlidas, 2019; Paouris et al., (2021b), hereafter referred to as P21). Here we focus mainly on the ToA and partially on the SoA issues.
Several methods have been developed to derive the propagation direction and speed of the transient under various geometric and kinematic assumptions. The two most common assumptions are that the CME propagates (1) at a constant speed and (2) along a fixed radial direction in the FOV of the HI.
But how accurate are these assumptions? This is actually the question we want to answer here. Regarding the fixed radial direction, several published works suggest that CME does indeed propagate away from the Sun in a constant propagation direction. On the other hand, several phenomena which may affect the propagation direction have been identified, such as latitudinal and longitudinal deflections (Byrne et al., 2010; Isavnin et al., 2013; Kay et al., 2013; 2015), nonuniform expansion in the lower corona (e.g. Nieves-Chinchilla et al., 2012) and CME/CME interactions (Lugaz et al., 2012). These analyses report that these phenomena take place close to the Sun ( $\mathrm{d}<10 \mathrm{Rs}$ ). It appears, therefore, that the CME propagation along a fixed radial direction, especially for distances $\mathrm{d}>50 \mathrm{Rs}$ (approximately the HI-1 FOV center), should be a reasonable assumption.
On the other hand, the assumption of CME propagation at constant speed within the HI FOV is rather weak. It is generally assumed that CMEs reach their final speed at radial distances below 20-40 Rs (Vrsnak et al., 2004; Vrsnak et al., 2013). However, other works suggest that the acceleration of slow CMEs and the deceleration of fast CMEs continues for greater distances, even as far as the Venus orbit ( $0.72 \mathrm{AU} \approx 155 \mathrm{Rs}$ ). In particular, Gopalswamy et al. (2001) found an acceleration cessation distance of 0.76 AU. Manoharan et al., (2001) studied an Earth-directed fast halo CME occurred on July 14, 2000 associated with a X5.7 solar flare. Using data from many instruments created the speed profile of the CME as a function of the heliocentric distance. They found a two-level deceleration: 1) a slow decrease of the CME speed from launch to 100 Rs and 2) a rapid decrease at larger distances ( $\mathrm{r}>100 \mathrm{Rs}$ ) from the Sun. Reiner et al., (2007) studied a sample of 42 fast and very fast ICMEs (mean $V_{\text {Lasco }} \approx 1600 \mathrm{~km} / \mathrm{s}$ ) and their associated shocks observed during solar cycle 23 . In all cases they found a deceleration cessation distance greater
than 0.27 $\mathrm{AU}(\mathrm{r} \approx 58 \mathrm{Rs}$ ) with a mean value of $0.65 \mathrm{AU}(\mathrm{r} \approx 140 \mathrm{Rs})$. Liu et al., (2013) studied three ICMEs and found that the rapid deceleration occurs over a relatively short timescale following the acceleration phase. The rapid deceleration lasts about 5 to 10 hours and the cessation distance is between 40 and 80 Rs from Sun center. Winslow et al., (2015) used data from the MErcury Surface, Space ENvironment, GEochemistry, and Ranging (MESSENGER) spacecraft, to investigate ICMEs around orbit Mercury (0.31-0.47 AU). In a sample of 61 ICMEs, they found that the speed decrease is possible to occur everywhere between Mercury's orbit and 1 AU . Wood et al., (2017) studied a sample of 28 ICMEs and they found that the CMEs reached their final speeds at distances ranging from 4.8 Rs up to 198.7 Rs while almost $40 \%$ of the events reached the final speed at heights of 65 Rs . They noted that it is likely that many CMEs still exhibit some degree of deceleration at 1 AU. Recently, Paouris et al., (2021a), examined the scenario of a more effective deceleration in the interplanetary medium. This scenario was tested with the Effective Acceleration Model (EAM) and the Drag Based Model (DBM). In particular, they estimated, for a sample of 16 fast ICMEs, the distance where the initial CME speed becomes equal to the corrected speed from the EAM model. It was possible to calculate these distances, for 11 cases, resulting in a mean cessation distance of $0.72 \mathrm{AU}(\mathrm{r} \approx 155 \mathrm{Rs}$. They presented, for the first time, to the best of our knowledge, a comparison of the performance of three different CME propagation models in estimating of the Time-of-Arrival (ToA) of CMEs to 1 AU; namely, an empirical data driven model (EAM - Paouris and Mavromichalaki, 2017b), a drag-based ensemble model (DBEM - Dumbovic et al., 2018) and an MHD analytical model (WSA-ENLIL+Cone model Mays et al., 2015) using the same CME/ICME sample and the same statistical metrics. The performance of the DBEM model improved significantly when greater values for the drag parameter were used. The optimal drag parameter was larger than the values used in Dumbovic et al., 2018 (i.e. $0.1 \times 10^{-7} \mathrm{~km}^{-1}$ ) by a factor of 2.1-4.8. Calogovic et al., 2021, also showed that the optimal drag parameter value is in higher by a factor of 3 compared to Dumbovic et al., 2018. This underestimate of the drag parameter indicates a stronger deceleration of the ICMEs in the interplanetary medium (see Paouris et al., (2021a) for details).
All previous approaches (Sheeley et al., 1999; 2008; Kahler and Webb, 2007; Rouillard et al., 2008; Lugaz et al., 2009; Lugaz et al., 2010; Davies et al., 2012; Barnes et al., 2019; Möstl et al., 2011; Möstl and Davies, 2013; Möstl et al., 2014) assumed constant propagation and speed to fit the measured elongation angles as a function of time. The best-fit values of direction and speed were then obtained by the minimum standard deviation of the residuals (see Lugaz 2010). Möstl et al., 2014 mentioned that the inclusion of a more realistic approach which will take into account the deceleration into the geometrical single-spacecraft fitting methods will further improve the accuracy of predicting CME arrival times and speeds instead of the current assumption of constant speed. This is the motivation behind this paper.

We take the following approach. We transform the observed elongation angles versus time, $a(\mathrm{t})$, into radial distances versus time $r(\mathrm{t})$ via techniques such as: a) the Fixed -Phi (FP) approximation (Sheeley et al., 1999; 2008; Kahler and Webb, 2007; Rouillard et al., 2008), b) the Harmonic Mean (HM) approximation (Lugaz et al., 2009), and c) the Self-Similar Expansion (SSE) approximation (Lugaz et al., 2010; Davies et al., 2012; Möstl and Davies, 2013). We then assume that all CMEs could accelerate or decelerate up to a distance from Sun and then they coast at a constant speed. Applying simple kinematic equations, we estimate the ToA at 1 AU utilizing the previous techniques. We call this the two-phase kinematics and present our methodology in the next section (Section 2). The impact of this approach on the ToA as well as

| CME onset (LASCO) |  |  | STEREO A/B HI availability $^{a}$ | Solar Flare |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Date | Time | Linear speed ( $\mathrm{km} / \mathrm{s}$ ) |  | Magnitude | Heliographic coordinates |
| 03/04/2010 | 10:34 | 668 | A/B | B7.4 | S25W03 |
| 15/02/2011 | 02:24 | 669 | A/B | X2.2 | S20W10 |
| 07/03/2011 | 14:48 | 698 | Only ST-B | M2.0 | N11E21 |
| 07/03/2011 | 20:00 | 2125 | Only ST-A | M3.7 | N30W48 |
| 04/08/2011 | 04:12 | 1315 | A/B | M9.3 | N15W39 |
| 11/04/2013 | 07:24 | 861 | A/B | M6.5 | N07E13 |
| 21/06/2013 | 03:12 | 1900 | Only ST-A | M2.9 | S14E37 |
| 29/09/2013 | 20:40 | 1179 | A/B | ${ }^{-b}$ | N20W30 |
| 07/01/2014 | 18:24 | 1830 | Only ST-A | X1.2 | S15W10 |
| 25/02/2014 | 01:09 | 2147 | A/B | X4.9 | S15E77 |
| 02/04/2014 | 13:36 | 1471 | A/B | M6.5 | N12E53 |
| 18/04/2014 | 13:09 | 1203 | A/B | M7.3 | S18W29 |
| 07/12/2020 | 16:24 | 1407 | Only ST-A | C7.4 | S23W11 |

a: If data from both HI cameras are available then we set the indicator "A/B". For unique data availability we note which of STEREO-A or $-B$ was available.
b: This CME is associated with an active region with known coordinates.
the Speed-on-Arrival (SoA) of the ICME at 1 AU are presented in Section 3. In Section 4, we present our conclusions and a discussion on the results.

## 2 Data Sources and Methodology

### 2.1 Events for analysis

We want to test the effect of the assumptions of constant speed and constant propagation angle on ToA estimates, using the HI observations. We are going to assume that CMEs accelerate (or decelerate) from the Sun up to a certain distance in the inner heliosphere. Beyond that distance, the CMEs propagate at constant speed until they reach Earth. Similar approaches for CME kinematics have been presented before (see e.g., Reiner et al., 2007; Wood et al., 2017). We refer to this profile as "two-phase" kinematics. We apply this approach to a sample of $13 \mathrm{CMEs} / \mathrm{ICMEs}$ observed by a combination of SOHO, STEREO-A (ST-A), and STEREO-B (ST-B). Here, we apply our technique using data from only the STEREO/HIs. The SOHO coronagraph data provide constraints on the CME direction and ensure that we are dealing with Earth-directed events.
Each CME in the HIGeoCAT catalog (Barnes et al., 2019 ; https://www.helcatsfp7.eu/catalogues/wp3_cat.html) was analyzed with the geometrical-fitting techniques of FP, HM and SSE, independently for each STEREO/HI. Thus, we can also treat those observations as 'separate events' to increase our sample to 21 cases. The selected CMEs are presented in Table 1. The first three columns show the LASCO CME onset date, time and linear speed, the fourth column marks the ST-A/-B availability of HI data, and the last two columns show the magnitude and the heliographic latitude and longitude of the associated solar flare.

Table 1. CME onset time and the associated solar flares used in our study.

The availability of heliospheric imaging from the two vantage points of STEREO satellites led to the development of many techniques based on the time-elongation profiles to estimate the speed and the direction of the CME in 3D space. The Fixed-Phi (FP) approximation (Sheeley et al., 1999; 2008; Kahler and Webb, 2007; Rouillard et al., 2008) treats the CME as a relatively compact structure (point source) moving along a fixed radial direction.
The radial distance using the FP is given by the equation:

$$
r_{F P}=\frac{d_{S C} \cdot \sin \alpha}{\sin (\alpha+\varphi)}
$$

Where $d_{S C}$ is the spacecraft-sun distance, $a$, is the elongation of the CME front, and $\varphi$ is the Observer-Sun-CME angle.
The Harmonic Mean (HM) method (Lugaz et al., 2009) assumes that the CME is represented by a circle anchored at the Sun expanding along a fixed radial direction, which results in

$$
\begin{equation*}
r_{H M}=\frac{2 d_{S C} \cdot \sin \alpha}{1+\sin (\alpha+\varphi)} \tag{2}
\end{equation*}
$$

Finally, the Self-Similar Expansion (SSE) approximation (Lugaz et al., 2010; Davies et al., 2012) assumes the CME as an expanding circle which propagates radially but with a fixed half-width $(\lambda)$. The radial distances are calculated by the equation:

$$
\begin{equation*}
r_{S S E}=\frac{d_{S C} \cdot \sin \alpha \cdot(1+\sin \lambda)}{\sin \lambda+\sin (\alpha+\varphi)} \tag{3}
\end{equation*}
$$

The equation reduces to the FP and the HM equations for the cases of $\lambda=0^{\circ}$ and $\lambda=90^{\circ}$. The three approximations (FP, HM and SSE) have been used extensively (Sheeley et al., 1999; 2008; Kahler and Webb, 2007; Rouillard et al., 2008; Lugaz et al., 2009; Lugaz et al., 2010; Davies et al., 2012; Barnes et al., 2019; Möstl et al., 2011; Möstl and Davies, 2013; Möstl et al., 2014) under the two basic assumptions of constant propagation direction and constant speed. Equations (1), (2) and (3) estimate the CME radial distance as a function of the measured elongation angle. First, under the assumption of constant speed, the radial distance $r$ is replaced by the product Vt , where V is the constant speed and t is the time. Then, the distances are inverted to elongation angles (Appendix I). We refer to these as the "theoretical profiles". The measured elongation-time profiles from the HI data, are then fitted to these theoretical profiles. Since there exist many possible solutions of pairs ( $\varphi, \mathrm{V}$ ), the pair that minimizes the standard deviation of the residual is selected as the best fit (Barnes et al., 2019). A comprehensive analysis on the accuracy as well as the limitations of these methods is presented in Lugaz (2010).

### 2.3 Proposed Methodology

Equations (1)-(3) indicate that the necessary parameters for the transformation from elongation to radial distance are: the heliocentric distance of the observer $\left(d_{S C}\right)$, the observed elongation angle ( $a$ ), the Observer-Sun-CME or exit angle ( $\varphi$ ) and the half-angular width of the CME $(\lambda)$. We obtain these parameters for each CME as follows:

- We use $\lambda=33.75^{\circ}$ for all cases. As we argued in P21 and in Vourlidas et al. (2017), the widths of CME can be bounded by the typical widths of flux-rope (F-Type) and the loop (L-Type) CMEs, as these two types represent the two projections of a typical flux-rope CME. Under the assumption that L-Type (F-Type) CMEs are CMEs face-on (edge-on),
we use $94^{\circ}$ as the upper limit and $41^{\circ}$ as the lower limit for the angular width (see P 21 for details). In the SSE approximation we use the average of the two upper and lower limits ( $33.75^{\circ}$ ) as the half-width.
- The distance between the observer and the Sun $\left(d_{S C}\right)$ is available through the SPICE routines in IDL for a given date and time.
- The elongation-time measurements are taken from the HIGeoCAT catalog (https://www.helcats-fp7.eu/catalogues/wp3_cat.html). A detailed description of HIGeoCAT is given by Barnes et al., 2019. The arrival times for HIGeoCAT CMEs were obtained from the ARRival CATalog (ARRCAT; https://www.helcats-
$\underline{\text { fp7.eu/catalogues/wp4_arrcat.html). ARRCAT lists predicted arrival time and speeds of }}$ CMEs at various spacecraft and planets with the STEREO heliospheric imager instruments, between April 2007 - September 2014. These arrival times calculated with the SSE approximation (with $\lambda=30^{\circ}$ ) from Möstl and Davies (2013). We also use the Space Weather Database of Notifications, Knowledge, Information (DONKI) to search for associations between the CMEs and solar flare activity.
- Finally, we adopt two methods to estimate the Observer-Sun-CME angle, $\varphi:$ (1) we use the $\varphi$ angle from the HIGeoCAT catalogue for each one of the three approximations; (2) we assume the CME is propagating radially above the flare location (see P21); hereafter referred to as the flare-site assumption. In this case, the $\varphi$ angle is the heliographic location ( $\varphi_{f l a r e}$ ) of the flare relative to the the spacecraft). Hence, we test our ToA predictions with four different $\varphi$. We choose to include the estimation of $\varphi$ from the flare location because of its potential utility in a CME propagation forecasting tool. On the contrary, the HIGeoCAT $\varphi$ parameter is derived after all the HI data become available and the fitting is performed. This process is not compatible with a real-time application.
- Critical angles and projection effects. The trigonometrical nature of equations (1)-(3) may lead to unphysical distances for certain critical angles. We count those cases as fails (F). For example, as the sum $a+\varphi$ approaches $180^{\circ}$ in the FP approximation, eq (1) approaches infinity. In the HM approximation, infinity occurs when the sum $a+\varphi$ in the denominator of equation (2) approaches $270^{\circ}$. This situation can occur under the flaresite assumption for $60^{\circ}$ elongation angle and direction $\varphi$ of $210^{\circ}\left(\varphi\right.$ is the sum $S C_{\text {angle }}+$ $\left|\varphi_{f l a r e}\right|$, as described before). For the SSE approximation, this situation arises when $\sin \lambda=$ $-\sin (a+\varphi)$ or the sum $a+\varphi=180^{\circ}+\lambda=213.75^{\circ}$, where $\lambda$ in our work is always equal to $33.75^{\circ}$. We came across these unphysical results with angles $\varphi$ from both the HIGeoCAT catalogue and the flare-site assumption. Hence, angles close to the critical angles could potentially lead to unphysical results (i.e., unreasonably high accelerations or SoAs) and thus each prediction should be examined carefully. Another important caveat is the effect of projection on the transformation of elongation angle to radial distance. Sheeley et al., 1999, report that when a transient is propagating away from the sky plane there is an additional contribution to the apparent acceleration, even if the transient propagates at constant speed.
- Once we have these values, we are ready to fit the kinematic profile.

$$
r(t)=c_{1} t_{d_{1}-d_{2}}^{2}+c_{2} t_{d_{1}-d_{2}}+c_{3}(4)
$$

Equation 4 represents the $2^{\text {nd }}$ order polynomial fit we apply to the distances $(r)$ vs. time $(t)$ for the first phase of the accelerating (or the decelerating) movement of the ICME
which is bounded to the radial distances $d_{1}$ and $d_{2}$. Then, from the distance $d_{2}$ up to 1 AU we assume constant speed. The factors $c_{i}(i=1$ to 3$)$ are calculated by the polynomial fit. In particular, the acceleration (or deceleration) of the ICME is equal to $2.0 \mathrm{x} c_{1}$ and the $c_{2}$ represents the theoretical initial speed of the ICME at time $\mathrm{t}_{0}=0$. Finally, $c_{3}$ is the radial distance at time $\mathrm{t}_{0}=0$.

- To simulate a real-time forecasting process, we treat the HI observations as real-time data. The forecasting algorithm (HeRPA - Heliospheric Reconstruction and Propagation Algorithm) begins when at least three elongation-time measurements become available. We use equations (1)-(3) to obtain the radial distance profile for each of the three geometrical assumptions. Then, we apply equations (4) to obtain the acceleration (or deceleration) of the CME. This estimate is referred to time $t$. We repeat the procedure as additional distance-time measurements become available. This updated acceleration is referred to time $t+1$. The process continues for all the available points $N(N$ is the total number of radial distances vs. time). The result is the acceleration profile. Positive values indicate acceleration while negative values indicate deceleration. We demonstrate the procedure with an example in the next section.


## 3 Case Study of August 4, 2011 CME

The event on August 4, 2011 is an appropriate example as the HeRPA algorithm resulted in neither the best nor the worst results. The CME was observed by SOHO, ST-A and ST-B. It appeared in the FOV of LASCO/C2 coronagraph on August 4, 2011 at $04: 12$ UT and was accompanied by a GOES M9.3 solar flare, peaking at 03:57 UT, from AR11261 (N15W39). This was an Earthdirected CME with a linear speed of $1315 \mathrm{~km} / \mathrm{s}$, according to LASCO CME catalogue. The CME arrived at Earth on August 5, 2011 at 17:20 UT and triggered a severe geomagnetic storm with maximum Ap index of 179 nT on August 5 (21:00-23:59 UT) and minimum Dst index of -115 nT on August 6 (03:00 - 03:59 UT). The average transit speed of the CME was $1135 \mathrm{~km} / \mathrm{s}$. This rather high transit speed is likely due to a previous event that affected the background conditions in the interplanetary medium clearing the path for this CME. The preconditioning of interplanetary space described in Temmer et al., (2017).
ST-A and -B were separated by $167^{\circ}$, at the time of the CME launch. The estimated CME directions from the HIGeoCAT database are plotted in the top panels of Figure 1. The propagation direction (angle $\varphi$ ) for each geometrical method and the radial direction from the associated solar flare are represented with colored arrows: blue for FP, black for HM, red for SSE and orange for flare-based direction. The direction $\varphi$ for radial propagation from the flare site is obtained by the sum of the Spacecraft-Earth separation angle ( $S C_{\text {angle }}=100^{\circ}$ for ST-A, $S C_{\text {angle }}=93^{\circ}$ for ST-B) and the flare longitude $\left(+39^{\circ}\right)$ as follows: $\varphi_{\mathrm{FL} \mid \mathrm{A}}=S C_{\text {angle } \mid \mathrm{A}}-\left|\varphi_{\text {flare }}\right|=100^{\circ}-\left|+39^{\circ}\right|=61^{\circ}$, and $\varphi_{\mathrm{FLLB}}=$ $S C_{\text {angle } \mid B}+\left|\varphi_{\text {flare }}\right|=93^{\circ}+\left|+39^{\circ}\right|=132^{\circ}$ for ST-A and -B respectively.
The bottom panels of Figure 1 show the radial distances as a function of time for each geometrical method using the time-elongation profiles from ST-A (left) and ST-B (right) with the same color code for FP, HM and SSE as in the top panels.
We see that the CME direction as estimated by the geometric approximations is inconsistent between ST-A and -B, indicating that projection effects may be affecting the measurements. This is especially true for the HM approximation. The HM-based direction using $\varphi$ from HIGeoCAT lies close to the Sun-spacecraft line leading to unphysical SoA speeds and early predictions (black points in middle row, Figure 1). This is expected. The $\varphi_{H M}$ for both cases (ST-A and -B) has a
large angle of $159^{\circ}$ and $170^{\circ}$ respectively, indicating that the CME is moving away from the spacecraft, and that creates an additional apparent acceleration, as discussed in subsection 2.3. The bottom row of Figure 1 contains the radial distances as a function of time estimated under the flare-site assumption. It is remarkable that all the geometrical approaches (FP, HM and SSE) are providing identical results for ST-A (bottom left panel). The explanation lies in the value of $\varphi_{\mathrm{FL} \mid \mathrm{A}}$ $=61.3^{\circ}$. For this angle all trigonometrical functions in equations (1) - (3) have nearly the same ratio for a given elongation angle. For ST-B (bottom right panel) we see that the slope of the points from FP approximation leads to nonphysical SoA and an early prediction as a result of the angle $\varphi_{\mathrm{FL} \mid \mathrm{B}}+a$. This angle is the sum of $\varphi_{\mathrm{FL} \mid \mathrm{B}}=131.9^{\circ}$ and the elongation angles $a$ varying from $5.7^{\circ}$ up to $33.6^{\circ}$. As mentioned before in section 2.3 as the sum $a+\varphi$ approaches $180^{\circ}$ in the FP approximation, Eq (1) approaches infinity.


Figure 1. Propagation directions ( $\varphi$ ) for August 04, 2011 CME for FP (blue), HM (black) and SSE (red) approximations for STEREO-A (top row - left) and -B (top row - right). The radial direction of the associated M9.3 solar flare is also indicated (orange arrow). The radial distances, and their errors, as a function of time for FP (blue), HM (black) and SSE (red) methods, utilizing the $\varphi$ directions from HIGeoCAT database are presented in the second row, and using the flare-site assumption in the third row, for STEREO-A (left) and STEREO-B (right) respectively.

As described in section 2.3, we treat each event as a real-time case. We calculate the acceleration (or deceleration) of the CME from a $2^{\text {nd }}$ order polynomial fit (Equation 4) starting always from the first three points and we are repeating the calculations adding one radial distance at a time up to the last available point. The resulting kinematic curve for the August 4, 2011 CME, for ST-B and the HM approximation using $\varphi$ from flare site, is presented in Figure 2.


Figure 2. The time-acceleration (top panel) and distance-acceleration (bottom panel) profiles for the August 04, 2011 CME using time-elongation data from ST-B, the HM approximation and $\varphi$ from flare site. The deceleration phase lasts up to a distance of 182.9 Rs approximately (points within magenta dashed vertical lines) and then we assume that the ICME is moving with an almost constant speed. The two-phase kinematics approach gave a ToA error of - 0.16 hours and a SoA of $895.8 \mathrm{~km} / \mathrm{s}$. The actual arrival time was 10 minutes later than our prediction and the maximum speed was about $700 \mathrm{~km} / \mathrm{s}$. The second vertical magenta dashed line indicates the transition from the deceleration phase to the movement with almost constant speed which
minimizes the ToA error. The vertical grey dashed line corresponds to the actual arrival time of the ICME at 1 AU. The red vertical lines on each point indicates the calculated error for the acceleration.

The CME decelerates (first phase) from the first HI-1 observation, at a distance of $d_{l}=24.5 \mathrm{Rs}$, to the distance of $d_{2}=182.9$ Rs. We apply Eq. (4) on the available $r(t)$ points to obtain the deceleration of $5.3 \mathrm{~m} / \mathrm{s}^{2}$. Beyond that distance we assume that the ICME is moving with constant speed (second phase). The distance $d_{2}$ is obtained by minimizing the ToA error. The ToA error is defined as $\Delta t=t_{\text {predicted }}-t_{\text {observed. }}$. Ideally the selection of $d_{2}$ should lead to ToA error of 0 . This two-phase kinematics methodology estimates the arrival of the August 4, 2011 CME on August 5, 2011 at 17:10, which is 10 minutes earlier (i.e. -0.16 hours) than the actual arrival time. The procedure of the two-phase kinematics which is the core of the HeRPA algorithm is presented graphically in Figure 3. Furthermore, the estimated SoA was $896 \mathrm{~km} / \mathrm{s}$ while the maximum observed ICME speed (in the sheath) was $700 \mathrm{~km} / \mathrm{s}$. This analysis repeated also for the FP and SSE approximations for ST-A and ST-B. The results for this ICME are presented in Table 2.


Figure 3. An example of how HeRPA algorithm actually works for the August 4, 2011 CME. The radial distances as a function of time obtained from Eq. (2) utilizing $\varphi$ from flare site for HM (black) approximation. The two vertical magenta dashed lines indicates the first phase of the deceleration of the ICME between $d_{1}(24.5 R s)$ and $d_{2}(182.9 R s)$ distances. The $2^{\text {nd }}$ order polynomial fit (Eq. 4) applied on the available points and indicated with the orange curve. The second phase where the ICME is assumed to move with constant velocity from $d_{2}$ up to 1 AU is represented by the green straight line. Finally, the grey dashed vertical line represents the actual ToA of the ICME at Earth and the yellow horizontal line represents the calculated distance of 1 AU (in Rs).

Table 2. Estimated ToA errors ( $\Delta t$ ) and SoA (V) for propagation directions from HIGeoCAT ( $\varphi_{H}$ ) and the flaresite assumption ( $\varphi_{F}$ ) for both spacecraft ST-A and ST-B for FP, HM and SSE approximations for the August 4, 2011 CME. The cases where unphysical accelerations and/or speeds-on-arrival occurred are indicated as failures $(F)$ of the algorithm and does not take into account for the statistical analysis but we still provide the values for clarity.

|  | $\varphi_{H}\left({ }^{\circ}\right)$ | $\begin{gathered} \Delta \mathrm{t} \\ \text { (hours) } \end{gathered}$ | $\begin{gathered} \mathrm{V} \\ (\mathbf{k m} / \mathrm{s}) \end{gathered}$ | $\begin{gathered} \mathbf{d}_{1} \\ (\mathbf{R s}) \\ \hline \end{gathered}$ | $\begin{gathered} \mathbf{d}_{2} \\ (\mathrm{Rs}) \\ \hline \end{gathered}$ | $\begin{gathered} a \\ \left(m / s^{2}\right) \\ \hline \end{gathered}$ | $\varphi_{F}\left({ }^{\circ}\right)$ | $\begin{gathered} \Delta \mathbf{t} \\ \text { (hours) } \end{gathered}$ | $\begin{gathered} \mathrm{V} \\ (\mathrm{~km} / \mathrm{s}) \end{gathered}$ | $\begin{gathered} \mathbf{d}_{1} \\ (\mathrm{Rs}) \\ \hline \end{gathered}$ | $\begin{gathered} \mathrm{d}_{2} \\ (\mathrm{Rs}) \end{gathered}$ | $\begin{gathered} a \\ \left(m / s^{2}\right) \\ \hline \end{gathered}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| STEREO-A HI |  |  |  |  |  |  |  |  |  |  |  |  |
| FP | $109 \pm 2$ | -7.53 | 1332 | 16.9 | 57.2 | -2.4 | $61.3 \pm 1$ | -0.32 | 1027 | 17.0 | 69.1 | -8.1 |
| HM | $159 \pm 3$ | $\begin{gathered} -17.54 \\ (F) \end{gathered}$ | $\begin{gathered} 2024 \\ (F) \end{gathered}$ | 24.1 | 76.5 | -0.5 | $61.3 \pm 1$ | 0.18 | 1011 | 16.2 | 71.6 | -8.4 |
| SSE | $131 \pm 2$ | -11.68 | 1549 | 19.2 | 59.4 | -4.2 | $61.3 \pm 1$ | 0.26 | 1006 | 16.5 | 71.7 | -8.8 |
| STEREO-B HI |  |  |  |  |  |  |  |  |  |  |  |  |
| FP | $116 \pm 3$ | -9.70 | 1363 | 26.2 | 177.2 | -4.2 | $131.9 \pm 2$ | $\begin{gathered} -19.39 \\ (F) \end{gathered}$ | $\begin{gathered} 2172 \\ (F) \end{gathered}$ | 33.1 | 97.5 | -31.5 |
| HM | $170 \pm 4$ | $\begin{gathered} -20.98 \\ (F) \end{gathered}$ | $\begin{gathered} 2299 \\ (F) \end{gathered}$ | 38.2 | 174.5 | -10.1 | $131.9 \pm 2$ | -0.16 | 896 | 24.5 | 182.9 | -5.3 |
| SSE | $140 \pm 3$ | -12.77 | 1490 | 28.5 | 195.6 | -5.5 | $131.9 \pm 2$ | -7.17 | 1179 | 26.0 | 166.3 | -7.2 |

The results based on the HIGeoCAT directions $\left(\varphi_{H}\right)$ overestimate of the event kinematics with increased SoA speeds and early ToA predictions ranging between -8 and -13 hours. Furthermore, the HM approximation fails, for both ST-A and ST-B, due to the large angles of $159^{\circ}$ and $170^{\circ}$, respectively. The flare-site assumption gives the best ToA results for both ST-A and ST-B. For ST-A, the absolute ToA error is less than 20 minutes for all approximations. For ST-B the FP approximation fails ( F ) as expected from the right plot of the third row of Figure 1 where the slope of the blue points indicates a high SoA and as a result of an early prediction. The SSE approximation gives an early prediction of -7 hours while the HM approximation gives the best overall ToA prediction of just 10 minutes error. For this case, we obtain a SoA of almost $900 \mathrm{~km} / \mathrm{s}$ which is the closest value to the maximum observed speed of $700 \mathrm{~km} / \mathrm{s}$.
The first impression from this analysis is that the flare-site assumption appears to improve significantly the ToA estimation with errors of the order of minutes. This is the first time, to the best of our knowledge, where a methodology implementing HI observations and single-spacecraft geometrical techniques, results in ToA errors below an hour.
A possible reason for the good ToA performance using the ST-A data with the flare-site assumption is the elimination of the projection effects. In $\underline{P 21}$ we showed that projection effects for CMEs associated with solar flares at longitudes beyond $60^{\circ}$ are negligible, especially for CMEs with true angular widths close to the upper limit of $94^{\circ}$. For this case study, the Spacecraft-SunCME angle is $61.3^{\circ}$. Thus, the point tracked in the j-maps is likely the CME front (or a point close to it). Furthermore, this CME has a true angular width of $107^{\circ}$ according to the MVC catalogue (Vourlidas et al., 2017) and this value is very close to our upper limit of $94^{\circ}(\mathrm{P} 21)$.
On the other hand, the ST-B results, based on HIGeoCAT, are poorer. For the flare assumption, the results are mixed: the FP approximation fails; the HM gives a good prediction; the SSE gives an early prediction of 7 hours. In this case, $\varphi=131.9^{\circ}$ and the CME is assumed to propagate away from the ST-B in a direction where projection effects are important. Thus, it is possible the assumed observed apex point to be actually a point in the flanks of the CME. This could also explain why the HM approximation performs better in contrast to the other methods as the HM
direction in this case (for ST-B) is away from the radial direction of the flare (see Figure 1, top row, right panel), so closer to the observed point (i.e. in the flanks and not at the assumed apex).

## 4 Results

We used STEREO/HI data to extract the kinematic profiles of 13 CMEs and derive their ToA and the SoA at 1 AU. The FP, HM and SSE methods were applied in this work as single-spacecraft geometric-fitting techniques to obtain the radial distances of the CME leading edge as a function of time. When a CME was observed by both ST-A and ST-B it was treated as two independent events. Taking this into consideration our sample of 13 CMEs/ICMEs consists of 21 independent events.
All the information from our analysis is provided as a supplementary material. For each case we provide: the date and time of the onset of the CME from LASCO coronagraphs, the $\varphi$ angle (from HIGeoCAT and the flare-site assumption), the ToA error (in hours), the SoA (in $\mathrm{km} / \mathrm{s}$ ), the distances $\mathrm{d}_{1}$ and $\mathrm{d}_{2}$ (in solar radii), and finally, the acceleration (or deceleration).
We calculate for each case basic statistical metrics which have been used also previous published works for the issue of the ToA (see e.g. Riley et al., 2018; Verbeke et al., 2019; Paouris et al., 2021a; P21). These metrics are the median, the mean error (ME), the mean absolute error (MAE) and the root mean square error (RMSE). All the metrics for each case utilizing $\varphi$ angles from the HIGeoCAT catalogue as well as from the flare site are presented in Table 3. The standard errors are calculated by a simple bootstrap method with replacement for $10^{6}$ runs.
The analysis revealed several interesting results. Unsurprisingly, perhaps, the assumption of deceleration (or acceleration) is a better representation of the real CME kinematics in the inner heliosphere as suggested by the improved MAE values. For example, using the same geometric technique (SSE), the HeRPA-based ToA predictions show an improvement of almost 3.5 hours against the ARRCAT predictions, which are made under the assumptions of constant direction and speed.

Table 3. Basic statistical metrics for ToA (in hours) for each geometrical technique utilizing the $\varphi$ angle from HIGeoCAT and flare-site assumption (last two columns). For comparison we also present the metrics for ToA using the predicted arrival times from ARRCAT (third column) under the assumption of constant speed movement with the SSE approximation.

|  |  | ARRCAT | $\varphi$ from HIGeoCAT | $\boldsymbol{\varphi}$ from FLARE <br> site |
| :---: | :---: | :---: | :---: | :---: |
| Median | $F P$ | - | $-\mathbf{1 . 0} \pm \mathbf{2 . 5}$ | $-7.3 \pm 6.0$ |
|  | $H M$ | - | $-12.7 \pm 5.2$ | $\mathbf{- 0 . 3} \pm \mathbf{2 . 7}$ |
|  | $S S E$ | $-2.1 \pm 5.7$ | $-5.8 \pm 3.5$ | $-0.9 \pm 4.1$ |
| Mean Error | $F P$ | - | $-\mathbf{4 . 7} \pm \mathbf{2 . 1}$ | $-10.5 \pm 3.4$ |
|  | $H M$ | - | $-11.2 \pm 2.9$ | $\mathbf{- 5 . 7} \pm \mathbf{2 . 1}$ |
|  | $S S E$ | $-3.6 \pm 5.0$ | $-6.8 \pm 2.2$ | $-6.8 \pm 2.4$ |
| Mean Absolute | $F P$ | - | $\mathbf{6 . 9} \pm \mathbf{1 . 8}$ | $11.1 \pm 3.2$ |
|  | $H M$ | - | $13.0 \pm 2.4$ | $\mathbf{6 . 4} \pm \mathbf{1 . 9}$ |
| Root Mean | $S S E$ | $11.5 \pm 3.4$ | $9.0 \pm 1.7$ | $8.1 \pm 2.1$ |
| Square Error | $H M$ | - | $\mathbf{1 0 . 4} \mathbf{2 . 0}$ | $16.1 \pm 3.2$ |
| (RMSE) | $S S E$ | - | $16.4 \pm 2.4$ | $\mathbf{1 0 . 6} \pm \mathbf{2 . 2}$ |

Furthermore, we see that our method tends to early predictions (see also Figure 4), i.e. the ICME arrived later than the predicted ToA for all cases, resulting from the overestimation of the radial distance, which leads to higher accelerations and/or higher speeds-on-arrival and hence to early arrivals. When the $\varphi$ propagation directions used by HIGeoCAT we see a much better performance for FP approximation (MAE of $6.9 \pm 1.8$ hours), while for the $\varphi$ directions from the associated flare site we see the best overall performance for HM approximation with an MAE of $6.4 \pm 1.9$ hours.

We can understand the difference in the performance by considering the propagation directions of the 21 cases for the FP, HM and SSE methods relative to the spacecraft. One should always keep in mind that we use geometric techniques so, it is very important to take also into account the positions of ST-A and ST-B spacecraft for each case. The mean angular separation from all events for the FP, HM and SSE methods is $\left\langle\varphi_{\mathrm{FP}}\right\rangle=88.1^{\circ}$, $\left\langle\varphi_{\mathrm{SSE}}\right\rangle=103.4^{\circ}$ and $\left\langle\varphi_{\mathrm{HM}}\right\rangle=120.7^{\circ}$, respectively, when using the HIGeoCAT $\varphi$ angles and the mean $\langle\varphi\rangle$ utilizing the flare-site assumption is $108.1^{\circ}$. Taking into account that in Equations (1) - (3) we can see that the sum $(a+\varphi)$ can to reach angles close to the critical angles (as described in section 2.3) for the SSE and HM approximations in HIGeoCAT leading to unphysical results. This is the reason we see more failures of our algorithm for FP approximation when the $\varphi$ from flare site is used, the percentage of the failures raised from $9.5 \%$ (HIGeoCAT) to 38.1 \% (flare-site). This logic explains the decrease of the failures for HM from $19.0 \%$ (HIGeoCAT) to $9.5 \%$ (flare-site). From our point of view, the angles above explain two important observations: (1) the better performance of the FP approximation, in contrast to HM and SSE, when using the HIGeoCAT angles, and (2), the improvement in the results from HM and $\operatorname{SSE}$ when the $\varphi$ direction is obtained from the associated solar flare.
The propagation direction from the flare site offers the best overall performance. After we exclude the cases with unphysical accelerations and velocities, due to the projection effects or the critical angles, the remaining 50 predictions from all of the geometric techniques (FP, HM and SSE) result in absolute ToA errors below 5 hours in 28 cases ( $56 \%$ ). In only 8 cases ( $16 \%$ ) we get absolute errors greater than 20 hours. Figure 4 shows the error distribution for all successful cases for $\varphi$ from HIGeoCAT (top panel) as well as $\varphi$ from flare site (bottom panel). If we focus on the cases where the absolute errors are below 5 hours, as these cases are more important from space weather point of view, we clearly see the superior performance of our HeRPA algorithm while for $\varphi$ from flare site, 21 cases has absolute errors less than 52 minutes (inset in the Figure 4 bottom panel). For 17 of these events, the best performance comes from the HM and SSE approximations.


Figure 4. Difference between prediction and observed arrival times ( $\Delta t$ ) and their distributions of a bin of 5 hours for the 55 successful applications of our algorithm for HIGeoCAT (top panel) and 50 for flare-site (bottom panel). The geometric techniques of FP, HM and SSE are indicating with blue, black and red colors. The superior performance of our algorithm when the $\varphi$ direction is obtained from the flare site (bottom panel) is obvious. In particular, 28 ( $56 \%$ ) of these events have an absolute error < 5 hours with 21 of those having an absolute error $\Delta t<$ 52 minutes. For the same range of error $<5$ hours for HIGeoCAT (top panel) we see a wider distribution without any remarkable performance.

Our algorithm is motivated by the need for a near real-time tool to exploit HI data from off SunEarth line viewpoints, such as the likely ESA mission to L5 (Pulikinnen et al., 2019). The L5 mission provides the unique opportunity to observe Earth-directed ICMEs from an observer angle of $60^{\circ}$ with respect to Sun-Earth line where the projection effects are negligible for these events, as we showed in P21.
If we focus on the events where the $S C_{\text {angle }}$ is less than $95^{\circ}$ then our methodology provides good results for a "wider" L5 scenario. This is the first time where the MAE is less than 1 hour ( $0.96 \pm 0.52$ hours for HM) for a small sample of 7 events of a total of 21 where the $S C_{\text {angle }}$ ranges between $57^{\circ}$ and $95^{\circ}$. The direct comparison of all the statistical metrics are indicating that HeRPA algorithm gives very good results if the flare-site assumption is used. In particular, there are two cases with $S C_{\text {angle }}$ very close to the ideal angle of L5 scenario (i.e. $57^{\circ}$ and $67^{\circ}$ respectively) where the $\Delta \mathrm{t}$ in both cases is less than 50 minutes. The above analysis shows the potential for accurate space weather forecasts, in terms of ToA, of a future L5 mission. The statistical metrics are presented in Table 4.

Table 4. Basic statistical metrics for ToA (in hours) for each geometrical technique utilizing the $\varphi$ angle from HIGeoCAT and flare-site assumption for events with spacecraft's separation angle with Earth less than $95^{\circ}$.

|  |  | $\boldsymbol{\varphi}$ from HIGeoCAT | $\boldsymbol{\varphi}$ from FLARE site |
| :---: | :---: | :---: | :---: |
| Median | $F P$ | $\mathbf{- 1 . 0 4} \pm \mathbf{2 . 8 6}$ | $-0.51 \pm 1.41$ |
|  | $H M$ | $-2.47 \pm 3.32$ | $\mathbf{- 0 . 1 6} \pm \mathbf{0 . 5 2}$ |
|  | $S S E$ | $-3.22 \pm 3.56$ | $-0.41 \pm 0.91$ |
| Mean Error (ME) | $F P$ | $\mathbf{- 2 . 0 6} \pm \mathbf{1 . 9 6}$ | $-1.07 \pm 1.44$ |
|  | $H M$ | $-2.96 \pm 2.48$ | $\mathbf{+ 0 . 4 6} \pm \mathbf{0 . 6 1}$ |
|  | $S S E$ | $-3.55 \pm 2.27$ | $-0.66 \pm 1.18$ |
| Mean Absolute | $F P$ | $\mathbf{3 . 9 5} \pm \mathbf{1 . 4 9}$ | $2.45 \pm 1.12$ |
|  | $H M$ | $5.24 \pm 1.74$ | $\mathbf{0 . 9 6} \pm \mathbf{0 . 5 2}$ |
| Root Mean Square | $S S E$ | $5.56 \pm 1.59$ | $1.99 \pm 0.94$ |
|  | $H M$ | $\mathbf{5 . 5 8} \pm \mathbf{1 . 4 6}$ | $3.68 \pm 1.31$ |
|  | $S S E$ | $6.75 \pm 1.96$ | $\mathbf{1 . 6 8} \pm \mathbf{0 . 8 0}$ |
|  | $6 P .98 \pm 1.60$ | $3.19 \pm 1.18$ |  |

## 5 Discussion and Conclusions

In this work we investigated the reliability of the transformation of elongation angles to radial distances under only the assumption of constant propagation direction. We treated the CME speed as variable, in contrast to previous works (Sheeley et al., 1999; 2008; Kahler and Webb, 2007; Rouillard et al., 2008; Lugaz et al., 2009; Lugaz et al., 2010; Davies et al., 2012; Barnes et al., 2019; Möstl et al., 2011; Möstl and Davies, 2013; Möstl et al., 2014) which also used single spacecraft geometric techniques. We find considerable improvement in the prediction of the arrival time of the CMEs by taking into consideration their deceleration in the interplanetary space and the location of the source region in contrast to previous methodologies based on constant direction and speed. A sample of $13 \mathrm{CMEs} / \mathrm{ICMEs}$ analyzed independently for ST-A and/or ST-B observations resulted in a set of 21 unique CME/ICME events with a mixture of slow and fast CMEs. This mix allowed us to test our method across a rather representative CME sample.

For each CME, we compare our results using two different values for the propagation direction; the angles provided by the HIGeoCAT catalogue and the angle resulting from the assumption of radial propagation from the flare site. Then, for each propagation direction, we transform elongation to radial distance, directly from the equations (1)-(3) for the FP, HM and SSE approximations, respectively.
Finally, we fit the resulting distance-time data with a two-phase kinematic profile (CME accelerating or decelerating, up to a distance $\mathrm{d}_{1}$, then coasting to 1 AU with constant speed). We simulate a data-assimilation scenario where HI measurements are added in time, as the event progresses, by starting the fitting procedure with the first three measurements and updating the fit one measurement at a time until the last available HI measurement. For each point, we make a prediction for the ToA and SoA at Earth.
The first finding from our analysis is that a variable CME speed (along a constant propagation direction) leads to better ToA estimates. Our assumed two-phase kinematic profile is consistent with past findings (Wood et al. 2017; Sachdeva et al. 2017; Colaninno et al. 2013) that indicate that CMEs continue to evolve beyond the typical coronagraph fields of view (i.e., beyond 15-30 Rs). Hence, heliospheric imaging observations are of considerable value in future space weather observing architectures.
We should not lose sight of the fact, however, that CME speed and direction are highly coupled the methodologies discussed here. They cannot be decoupled with single viewpoint observations or even dual viewpoint ones, as projection effects become quite important when dealing with the long lines-of-sight through the CMEs at these heliocentric distances. This issue seems partially responsible for the poorer performance when HIGeoCAT propagation directions are used. The directions are derived under the assumptions of both constant speed and direction for the CME apex. However, it has been shown (e.g., Liewer et al. 2011; Colaninno et al. 2013) that as the CME expands, projection effects tend to move the (projected) apex to the flanks of the event. This apparent motion registers as a deceleration that will couple into a direction/speed bias when both of these quantities are held constant. o
Our second finding is that the flare-site assumption provides better ToA estimates than the HIGeoCAT $\varphi$ directions, with an MAE of $6.4 \pm 1.9$ hours. This can be seen in Figure 4 where 21 cases have an ToA error below 52 minutes. Figure 5 shows the effectiveness of the flare-site assumption from a geometrical point of view. The ToA error for the flare-site based HM and SSE approximations lie close to $\Delta \mathrm{t}=0$ when the $S C_{\text {angle }}$ is less than $100^{\circ}$. These statistics are encouraging for our 'real-time' approach since the HeRPA algorithm can be applied soon after the first three HI images are obtained (assuming, of course, that an associated solar flare is detected from the Sun-Earth line).


Figure 5. Difference between prediction and observed arrival times ( $\Delta t$ ) as a function of the spacecraft angle (SCangle) with respect to Sun-Earth line for FP (left panels), HM (middle panels) and SSE (right panels) approximations utilizing $\varphi$ directions from HIGeoCAT (top row panels) and from flare-site assumption (bottom row panels). It is obvious that for $S C_{\text {angle }}<100^{\circ}$ the majority of the points are lying on the line $\Delta t=0$ indicating almost an ideal performance of our algorithm especially for the HM and SSE approximations when the $\varphi$ angle is utilized by the flare-site assumption in contrast to the $\varphi$ from HIGeoCAT. For $S C_{\text {angle }}>130^{\circ}$ the points are scattered as it was expected due to the importance of the projection effects. At the bottom right corner in every plot the percentage of the failures of our algorithm is also presented.

Finally, our methodology allowed us to compare the lead time of the ToA prediction against the ToA error. We show that relationship for 11 cases of the HM approximation, which has an absolute error $\Delta \mathrm{t}$ of less than 1 hour (Figure 6). We study also the CME distance when the prediction is made against the error, to provide a sense of the location of the CME in the inner heliosphere. We see that the ToA accuracy varies considerably from case to case. Only a handful of cases show a reduction of the error with decreasing lead time, which would correspond to the expected trend for the ideal case. All cases start with considerable overpredictions (negative $\Delta t$ ) indicating that the speed derived from the earlier measurements are too high, therefore CMEs decelerate considerably in the HI FOVs. This trend is reversed, for most cases, as more measurements become available but the error remains within 10 hours, with the exception of cases 04/08/2011 ST-A and 29/09/2013 ST-A. The underprediction points to projection effects discussed earlier. It appears that, at larger elongations, the observer follows a point on the CME front that it is not directed at Earth. This is particularly obvious for 04/08/2011 ST-A where according to the measurements the event is at 150 Rs but the CME has actually arrived at Earth. Clearly, we will be unable to make concrete advances in ToA accuracy without first reigning in projection effects at large elongation.


Figure 6. Time-of-Arrival error vs. lead prediction time in hours before arrival for 11 cases of HM approximation utilizing the flare site assumption. These events have all a best ToA error less than 1 hour.

One way to test the reliability of the explanation provided above is through the attempt to minimize the projection effects. The projection effects depend on the direction of the CME relative to the observer. The best way to minimize projection effects is to observe a CME in quadrature or, at least, from angles above $60^{\circ}$ (see P21).
We examine the December 7, 2020 CME. The CME is associated with a C7.4 class solar flare erupted from AR12790 at 16:32 peak time, with heliographic coordinates S23W11. The perspective of ST-A is ideal for this case, as the spacecraft observes from an angle of about $68.5^{\circ}$, assuming that the CME is propagating radially from the flare site. Using the flare-site assumption, we obtain good ToA estimates for all three geometric techniques. The best ToA arises from the HM approximation which predicts 50 minutes earlier arrival. The SoA is $634 \mathrm{~km} / \mathrm{s}$ compared to the observed speed of $493 \mathrm{~km} / \mathrm{s}$. Looking at Figure 7, we see that the angle from the HIGeoCAT FP approximation is closely aligned to the flare site direction with the other directions less than $20^{\circ}$ to the west. So, we would expect that HIGeoCAT-based prediction will provide similar levels of accuracy. Indeed, the HIGeoCAT FP approximation error is -1.04 hours. However, the other two approximations result in -5.6 h (HM) and -5.8 h (SSE) with SoA of 715 and $723 \mathrm{~km} / \mathrm{s}$, respectively. Clearly, the HIGeoCAT-based directions underperform the flare-site approximation across the three techniques considered here.


Figure 7. Propagation directions ( $\varphi$ ) for December 7, 2020 CME for FP (blue), HM (black) and SSE (red) approximations for STEREO-A. The radial direction of the associated C7.4 solar flare is also indicated (orange arrow).

A way to validate our flare-site assumption is to compare the flare-based propagation angle $\varphi$ against the same angle derived by a multiview triangulation technique. Several such techniques exist and are based on the assumption that either both ST-A and ST-B track the same point of the CME front (e.g. Liu et al., 2010a; Liu et al., 2010b) or that they track different points on the tangent of a circular CME cross section anchored the Sun (Lugaz et al., 2010). We use the harmonic mean triangulation (HMT) technique presented in Lugaz et al., 2010 as it seems more realistic. Unfortunately, the technique has its limitations and only one of the events in our list (out of eight possible) resulted in reasonable ToA. In particular, five cases occur when the STEREO spacecraft are beyond 120 deg from Earth. In these extreme viewing conditions, the fundamental assumption of Lugaz et al., 2010 that the tracking points lie on the tangent of the CME envelope may break down. The two spacecraft are almost surely tracking the opposite sides of CME flanks which may propagate independently at these distances. In another two cases, the ST-A and -B spacecraft are in opposition and hence provide symmetric views of Earth-directed events. In this situation, the two views reduce to a single view effectively and the triangulation provides unreliable results. We are left with triangulation results for the April 3, 2010 CME only. The direction from the HMT is $-13.6^{\circ} \pm 2.9^{\circ}$ while the longitude of the associated solar flare is $+3^{\circ}$. The CME direction as it is calculated with the HMT technique results to a reasonable angle close to our flare-site assumption. This provides further support that the flare-site assumption may be a better representation of the CME direction than the single viewpoint derived directions from HIGeoCAT.
Concluding, our methodology offers a new way to assess the ToA issue using data from heliospheric imagers. HeRPA algorithm is able, in principle, to perform the ToA analysis as soon data become available. This approach should be useful for operational spacecraft at the Lagrange points. Finally, we hope that such a service will be useful for space weather forecasting purposes in addition to the safety precautionary measures for manned space missions to Moon and Mars.

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fp7.eu/catalogues/wp3_cat.html) and arrival times from the ARRCAT catalog (https://www.helcats-fp7.eu/catalogues/wp4_arrcat.html). CMEs and solar flare associations are taken from the DONKI database (https://cemc.gsfc.nasa.gov/donki/).

## Appendix I

## Interpretation of elongation angles

The elongation angle, and eventually radial distance depends on the propagation angle $\varphi$ in different ways for the three approximations. So, the same propagation angle $\varphi$ could result in very different distance estimates. We proceed by rewriting the equations (1) - (3) with elongation angle $a$ expressed as a function of the dimensionless parameter $\rho=r / d_{S C}$, where $r$ is the radial distance and $d_{S C}$ is the spacecraft-Sun distance. The equations for FP, HM and SSE are:

$$
\begin{gather*}
a_{F P}=\frac{\sin \varphi_{F P}}{1-\cos \varphi_{F P}}(6) \\
a_{H M}=\cos ^{-1}\left(\frac{b_{1} \cdot \sqrt{b_{1}^{2}+b_{2}^{2}-1}-b_{2}}{b_{1}^{2}+b_{2}^{2}}\right) \tag{7}
\end{gather*}
$$

where $\mathrm{b}_{1}=2.0 / \rho-\cos \left(\varphi_{H M}\right)$ and $\mathrm{b}_{2}=\sin \left(\varphi_{H M}\right)$ and,

$$
\begin{equation*}
a_{S S E}=\cos ^{-1}\left(\frac{c_{1} \cdot \sqrt{c_{1}^{2}+c_{2}^{2}-c_{3}^{2}}-c_{2} \cdot c_{3}}{c_{1}^{2}+c_{2}^{2}}\right) \tag{8}
\end{equation*}
$$

where $\mathrm{c}_{1}=\left[\left(1.0+\mathrm{c}_{3}\right) / \rho\right]-\cos \left(\varphi_{S S E}\right), \mathrm{c}_{2}=\sin \left(\varphi_{S S E}\right)$ and $\mathrm{c}_{3}=\sin \lambda$. In our analysis $\lambda$ is equal to $33.75^{\circ}$ for all cases (see section 2.3). The elongation angle as a function of the dimensionless parameter $\rho=r / d_{S C}$ is plotted in the next figure for $\varphi$ of $30^{\circ}, 60^{\circ}, 90^{\circ}, 120^{\circ}$ and 150 .


Figure 8. Elongation angle as a function of the dimensionless parameter $r / d_{S C}$ for FP (blue), HM (black) and SSE (red) approximations for five different propagation direction angles $\varphi$ of $30^{\circ}, 60^{\circ}, 90^{\circ}, 120^{\circ}$ and $150^{\circ}$. The vertical orange dashed line indicates the 1 AU distance. The curves of $120^{\circ}$ and $150^{\circ}$ are represented with dots and dashes for better visual identification.

We focus on the consistency of the 1 AU distance as derived by the three approximations. For relatively small $\varphi$ angles (e.g., $30^{\circ}$ or $60^{\circ}$ ), the distance of 1 AU has small differences for the elongation angles among the FP, HM and SSE approximations. For larger $\varphi$ angles the distance of 1 AU has much larger differences between the FP, HM and SSE methods. In particular, for $\varphi$ of $120^{\circ}$ (dotted curves in Figure 8) we take an 1 AU correspondence elongation angle of $30^{\circ}$ for FP, $41.3^{\circ}$ for HM, and $37.3^{\circ}$ for SSE. Plots similar to our Figure 8 presented also by Sheeley et al., 2008; Lugaz, 2010 and Davies et al., 2012. Sheeley et al., 2008 plotted the elongation angles as a function of the dimensionless parameter $\rho$. Lugaz, 2010 plotted the elongation angles as a function of time, since CME launch, for FP and HM methods assuming a constant transient speed of $400 \mathrm{~km} / \mathrm{s}$ and a fixed distance of 0.975 AU . Davies et al., 2012 plotted the elongation angles as a function of time (since CME launch) for FP, HM and SSE methods assuming a movement with a constant speed of $400 \mathrm{~km} / \mathrm{s}$.

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