

# Predicting the Time-of-Arrival of Coronal Mass Ejections at Earth Solely From Heliospheric Imaging Observations

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## Key Points:

- We studied CME propagation relying only observations from the Heliospheric Imager 1
- We derived a CME Time-of-Arrival mean absolute error of 6.1 hours for a set of 14 events
- The CME Time-of-arrival error derived here is comparable to results from coronagraphs

## Abstract

The Time-of-Arrival (ToA) of coronal mass ejections (CME) at Earth is a key parameter due to the space weather phenomena associated with the CME arrival, such as intense geomagnetic storms. Several approaches to estimate the ToA based on kinematical parameters derived from single- and multi-viewpoint white-light coronagraph observations have been proposed and implemented, particularly in the last decade. Despite the incremental use of new instrumentation and the development of novel methodologies, ToA estimated errors remain above 10 hours on average. Here, we investigate the prediction of ToA of CMEs using observations solely from heliospheric imagers, i.e., from heliocentric distances higher than those covered by the existent coronagraphs. To that aim, we analyse 14 CMEs observed by the heliospheric imager HI-1 onboard the twin STEREO spacecraft to determine their front location and speed. Outside the field of view of the instruments, we assume that the dynamics of the CME evolution is controlled by the aerodynamic drag, a force that comes from the interaction with particles from the background solar wind. We found a CME ToA error mean value of  $0.4 \pm 7.3$  hours ToA and a mean absolute error of  $6.1 \pm 3.6$  hours in a set of 14 events. The results we found here illustrate that observations from HI-1 allow us to estimate the ToA with similar errors than observations from coronagraphs.

## 1 Introduction

Coronal mass ejections (CMEs) have been tracked with space-based coronagraphs for more than 40 years. Thousands of events have been studied and cataloged (Tousey, 1973; Gosling et al., 1974; Robbrecht & Berghmans, 2004; Yashiro, 2004; Vourlidas et al., 2017). One of the key open issues about CMEs is understanding their propagation in the heliosphere, specially for events directed to Earth.

CMEs are the main drivers of intense geomagnetic storms (Gosling, 1993) and one of the most basic variables from a Space Weather perspective is the Time-of-Arrival (ToA) of a given CME in the Earth's vicinity. Not surprisingly, the ToA has been studied for a long time. An extensive review of methods to estimate the ToA and their results can be found in Zhao and Dryer (2014) and Vourlidas et al. (2019).

The methods applied to ToA estimation include empirical approaches, magneto-hydrodynamic (MHD) modeling, CME three dimensional (3D) reconstruction, and CME propagation analysis based on drag-based models, just to name a few (see, e.g., Zhao and Dryer (2014)). In

spite of the insight gained with the dual view-point provided by the Solar Terrestrial Relations Observatory (STEREO) mission (Kaiser et al., 2007) since 2007, the uncertainty of the CME ToA persist. According to Vourlidas et al. (2019), the average CME ToA accuracy is  $9.8 \pm 2$  hours. The identification of the source of these errors is not straightforward. The evaluation and comparison of the different methodologies across the literature is complicated because of the different event samples, assumptions with regard to the propagation of the events in the interplanetary medium (i.e., beyond the field of view of the instrument utilized), and ToA criteria. Hence, it is difficult to assess which methodology yields the best results, i.e., the lowest ToA error. In general, the errors tend to be lower for small samples studies, which is most likely due to an event-selection bias.

Thanks to the Sun-Earth Connection Coronal and Heliospheric Investigation (SECCHI) suite onboard STEREO, CMEs can be observed further into the inner heliosphere by the heliospheric imagers (HI-1 and HI-2). Details about SECCHI are described in R. A. Howard et al. (2008). Nevertheless, a quick check of the literature reveals that the use of the imaging products of the heliospheric imagers is limited compared to those of the coronagraphs (Vourlidas et al., 2019; Zhao & Dryer, 2014).

The relative contribution of the electron corona signal (i.e., the K-corona) to the total signal recorded by the HI instruments for elongations greater than about  $8^\circ$  ( $\sim 32 R_\odot$ ) is well below that recorded by coronagraphs, all of them covering smaller heliocentric distances. Therefore, to help reveal the CME boundaries and inner structure during their evolution across the HI instrument field-of-view (FOV), it is necessary to remove the dominant signal coming from the F-corona, i.e., photospheric light scattered by the dust particles in orbit around the Sun (Leinert et al., 1998).

In addition, at the solar elongation covered by the heliospheric imagers, the emission properties of the coronal electrons change due to Thomson Scattering (Minnaert, 1930). The maximum brightness contribution along the line of sight is now located on the “curved” Thomson sphere rather than the flat “sky-plane” (Vourlidas and Howard (2006) and references therein). This effect complicates the visualization of the event boundaries, as CMEs move away from the Sun.

To help reveal the faint K-coronal structures in STEREO HI-1 FOV, Stenborg and Howard (2017) devised an algorithm to model the background signal (a proxy of the F-corona) out of each individual image. The technique exploits the break out in spatial

frequencies between the discrete K-corona structures and the smooth and homogeneous F-corona signal. In this work, we take advantage of this state-of-the-art methodology to investigate the effect of a cleaner identification of the CME boundaries to higher heliocentric distances in the estimation of the ToA at Earth.

To carry out the investigation, we apply a customized version of the technique developed by Stenborg and Howard (2017) to remove the background signal in the HI-1 FOV on a set of 14 Earth-directed CME events spread over the rise and maximum of Cycle 24 (2010-2013). Co-temporal HI-1 observations from two viewpoints are used to construct an elliptical model of the CME fronts and hence estimate their locations in the solar corona. Beyond the HI-1 FOV, we apply a drag force model to propagate the CME up to 1 au. We finally compare the CME ToA errors computed with this approach to those calculated using mainly observations from SECCHI coronagraphs.

A motivation for this work is the application of similar methodology to CME observations in the inner heliosphere from upcoming and planned missions, such as the recently selected PUNCH or L5-mission concepts (Lavraud et al., 2016).

This article is organized as follows. In Section 2.1 we describe the events studied. From Section 2.2 to Section 2.8, we describe the methodology applied to calculate the CME kinematics in the HI-1 FOV and extrapolate them in the remaining trajectory toward the Earth. The results (the calculated CME travel time, final speed, etc.) and a comparison with the actual observations are shown in Section 3. Finally, we summarize the results in Section 4.

## 2 Materials and Methods

We devised a methodology to estimate the CME ToA by combining a geometric front reconstruction model with a CME propagation model. To obtain the CME propagation direction, we fit the CME front in the ecliptic plane with an ellipse (see Section 2.5). To determine the CME kinematics, we use an aerodynamic drag force model (see Section 2.6). The elliptical front allows us to estimate the initial position and the speed, which are then used as input parameters for the drag force estimation. As a final result, we derive the CME speed and ToA at 1 *au*.

## 2.1 Event List

Our starting point is the list of CME events analyzed by Sachdeva et al. (2017), which includes 38 well-observed events between March 2010 and March 2013. Since our study is targeting only observations from heliospheric imagers, we do not use the kinematic parameters and height-time profiles derived by Sachdeva et al. (2017) because they were derived using observation from coronagraphs (SECCHI and LASCO) and heliospheric imagers. We take only the timing of each event to identify the corresponding observations on the HI-1 FOV. Moreover, Sachdeva et al. (2017) did not identify the CME counterparts in the Earth’s vicinity (the so-called interplanetary coronal mass ejections - ICMEs); therefore, we undertake this task for each event.

For this task, we use the ICME list compiled from WIND mission observations from Nieves-Chinchilla et al. (2018), which is available online at <https://wind.nasa.gov/ICMEindex.php>. Our criterion to associate a given ICME to its corresponding CME counterpart is based on the time elapsed ( $t_{el}$ ) between the ICME in situ observation time and the time of the first coronagraph observation of the CME counterpart candidate. The CME travel time considered was taken from an extensive study of CME-ICMEs pairs by Richardson and Cane (2010). We consider it a match when  $0.5 \text{ days} < t_{el} < 5 \text{ days}$ .

From our initial list comprising 38 events (Table 1) we could identify 30 ICMEs counterparts. The 8 unmatched events are #7, #10, #12, #14, #15, #16, #22 and #23 (indicated by  $\emptyset$  in column “Remark”). In these cases, either the corresponding ICME was not included in the ICME list possibly due to data gaps or poor data quality, or the CME reported on Sachdeva et al. (2017) missed the WIND spacecraft.

In two other cases (#8 and #32, rows labeled “too short” in Table 1), the ICME event arrives at Earth less than 24 hours after the time of first appearance in the coronagraph FOV as reported in Sachdeva et al. (2017) in spite of the very low speed reported for this CME event. For other event (#35, row labeled “too long”), the travel time is longer than 5 days and hence it is not considered to be a reasonable CME-ICME pair. Since we have not made a comprehensive study of all other CMEs observed in close timing to each of our events (few days before and after and including other instruments from the SECCHI suite or from LASCO coronagraphs C2 and C3), some of the three ICME with unreasonable travel time are perhaps not associated to the CMEs under study. We considered that these CME-ICME association are inconsistent and removed them from our analysis.

**Table 1.** List of CMEs and corresponding ICMEs. The symbols  $\parallel$  indicate the events removed from the list due to observation of another CMEs in close timing. Events associated to multiple ICMEs, without any ICME associated, or whose time elapsed between the CME and corresponding ICME observation falls outside our criteria are indicated by  $\Pi$ ,  $\emptyset$  and  $\Delta$ , respectively. We could not apply the F-corona background removal methodology (see Section 2.2) to events indicated by  $\dagger$  and they were removed from the analysis. The final list of 14 events that match all the criteria explained in Section 2.1 and that could be processed as explained in Section 2.2 are indicated by a star.

| ID | Remark      | Date       | Realistic timing | Unique ICME | ICME start date  |
|----|-------------|------------|------------------|-------------|------------------|
| 1  | $\dagger$   | 2010/03/19 | yes              | yes         | 2010/03/23 22:29 |
| 2  | $\star$     | 2010/04/03 | yes              | yes         | 2010/04/05 07:55 |
| 3  | $\star$     | 2010/04/08 | yes              | yes         | 2010/04/11 12:20 |
| 4  | $\parallel$ | 2010/06/16 | yes              | yes         | 2010/06/21 03:35 |
| 5  | $\dagger$   | 2010/09/11 | yes              | yes         | 2010/09/15 02:24 |
| 6  | $\dagger$   | 2010/10/26 | yes              | yes         | 2010/10/31 02:29 |
| 7  | $\emptyset$ | 2010/12/23 | -                | -           | -                |
| 8  | $\Delta$    | 2011/01/24 | Too short        | yes         | 2011/01/24 06:43 |
| 9  | $\star$     | 2011/02/15 | yes              | yes         | 2011/02/18 19:50 |
| 10 | $\emptyset$ | 2011/03/03 | -                | -           | -                |
| 11 | $\star$     | 2011/03/25 | yes              | yes         | 2011/03/29 09:07 |
| 12 | $\emptyset$ | 2011/04/08 | -                | -           | -                |
| 13 | $\star$     | 2011/06/14 | yes              | yes         | 2011/06/17 02:09 |
| 14 | $\emptyset$ | 2011/06/21 | -                | -           | -                |
| 15 | $\emptyset$ | 2011/07/09 | -                | -           | -                |
| 16 | $\emptyset$ | 2011/08/04 | -                | -           | -                |
| 17 | $\star$     | 2011/09/13 | yes              | yes         | 2011/09/17 02:57 |
| 18 | $\parallel$ | 2011/10/22 | yes              | yes         | 2011/10/24 17:41 |
| 19 | $\parallel$ | 2011/10/26 | yes              | yes         | 2011/11/01 08:09 |
| 20 | $\parallel$ | 2011/10/27 | yes              | yes         | 2011/11/02 00:21 |
| 21 | $\Pi$       | 2012/01/19 | yes              | no          | 2012/01/21 04:02 |
| 22 | $\emptyset$ | 2012/01/23 | -                | -           | -                |
| 23 | $\emptyset$ | 2012/01/27 | -                | -           | -                |
| 24 | $\dagger$   | 2012/03/13 | yes              | yes         | 2012/03/15 12:35 |
| 25 | $\star$     | 2012/04/19 | yes              | yes         | 2012/04/23 02:15 |
| 26 | $\star$     | 2012/06/14 | yes              | yes         | 2012/06/16 09:03 |
| 27 | $\star$     | 2012/07/12 | yes              | yes         | 2012/07/14 17:39 |
| 28 | $\star$     | 2012/09/28 | yes              | yes         | 2012/09/30 10:14 |
| 29 | $\star$     | 2012/10/05 | yes              | yes         | 2012/10/08 04:12 |
| 30 | $\star$     | 2012/10/27 | yes              | yes         | 2012/10/31 14:28 |
| 31 | $\parallel$ | 2012/11/09 | yes              | yes         | 2012/11/12 22:12 |
| 32 | $\Delta$    | 2012/11/23 | Too short        | yes         | 2012/11/23 20:51 |
| 33 | $\star$     | 2013/03/15 | yes              | yes         | 2013/03/17 05:21 |
| 34 | $\star$     | 2013/04/11 | yes              | yes         | 2013/04/13 22:13 |
| 35 | $\Delta$    | 2013/06/28 | Too long         | yes         | 2013/07/04 17:17 |
| 36 | $\Pi$       | 2013/09/29 | yes              | no          | 2013/10/02 01:15 |
| 37 | $\dagger$   | 2013/11/07 | yes              | yes         | 2013/11/08 21:07 |
| 38 | $\dagger$   | 2013/12/07 | yes              | yes         | 2013/12/08 07:31 |

In two particular cases (events #21 and #36, indicated by II in column “Remark” of Table 1), there is more than one ICME candidate. These events were also removed from our analysis because it is impossible to confirm (at least with the data we are using in the current analysis) which ICME corresponds to the CME arrival.

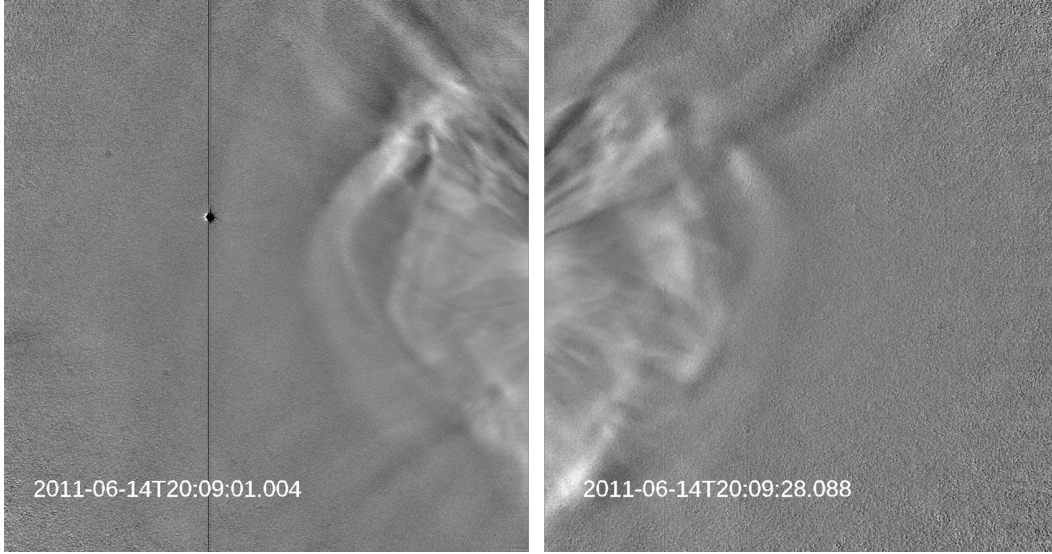
We also removed CME events from the list of Sachdeva et al. (2017) that were preceded or followed closely (within less than 24 hours) by other CME events. We performed this analysis on HI-1 FOV only (both on STEREO-A and STEREO-B) and considered the timing of the first observation of each event. These events are removed from the travel time analysis because interaction between consecutive is likely CMEs before their arrival at 1 au. Five events fit this criterion (#4, #18, #19, #20 and #31) and are indicated by || in column “Remarks” of Table 1. When CME-CME interaction takes places, a detailed study would be necessary because additional forces need to be taken into account in the CME propagation to estimate their travel time (see, e.g., Liu et al. (2012); Colaninno et al. (2013); Temmer et al. (2012), just to name a few). Case studies of CME interaction are beyond the scope of the present manuscript.

Therefore, from the original list of 38 events, 20 were left after the application of all criteria mentioned in the paragraphs above.

## 2.2 Removal of the background F-corona

The HI-1 observations include a background scene that must be removed to allow the CME event characterization by analysing the K-corona emission. This background scene is dominated by the scattering from dust particles in orbit around the Sun, the so-called F-corona (the F letter stands for Fraunhofer). The F-corona intensity overtakes the K-corona above approximately  $5R_{\odot}$  (Koutchmy & Lamy, 1985), well below the inner edge of the HI-1 instrument, which is about  $16R_{\odot}$ .

Experience from observations of the corona over the last 40 years suggests that the F-corona is constant over timescales of days or weeks while the K-corona is highly dynamic and can change significantly in a matter of hours. For this reason, empirical models of the F-corona are usually constructed by computing the minimum of the daily median images over an extended period of time (normally a solar rotation), centered on the day of observation (Morrill et al., 2006).



**Figure 1.** Example of CME #13 (2011/06/14) observed on HI-1-A (left) and HI-1-B (right) FOVs after removal of the background F-corona.

Stenborg and Howard (2017) showed that at the larger elongations covered by the HI-1 instruments, the use of background models obtained considering extended periods of time leads to the introduction of artifacts. This occurs due to the subtle changes resulting from different viewpoints (Stenborg et al., 2018). Therefore, to remove the background contribution from the F-corona from each individual HI-1 observation, we created its respective background model following Stenborg and Howard (2017).

An example of a processed HI-1 observation pair highlighting a CME feature is shown in Figure 1. The resulting images shown in this figure clearly reveal the morphology of both the CME front and the internal structures without the known artifacts that result from the use of the running difference scheme generally adopted by the solar physics community. In the current study, we focused on the selection of the CME furthestmost point visible in the HI-1 FOV at each time-instance and at a position angle close to the ecliptic plane. Since we are interested in the arrival of the transient at the Earth, we did not take any measurement of their internal structure (e.g., the core of the events).

As mentioned above, for some events in Table 1, the corresponding observations could not be properly processed (i.e., the background brightness model could not be determined) due to the presence of extended bright objects in the FOV of the instruments (e.g., the Milky Way), saturated objects (e.g., a bright planet) and/or instrumental artifacts (e.g.,



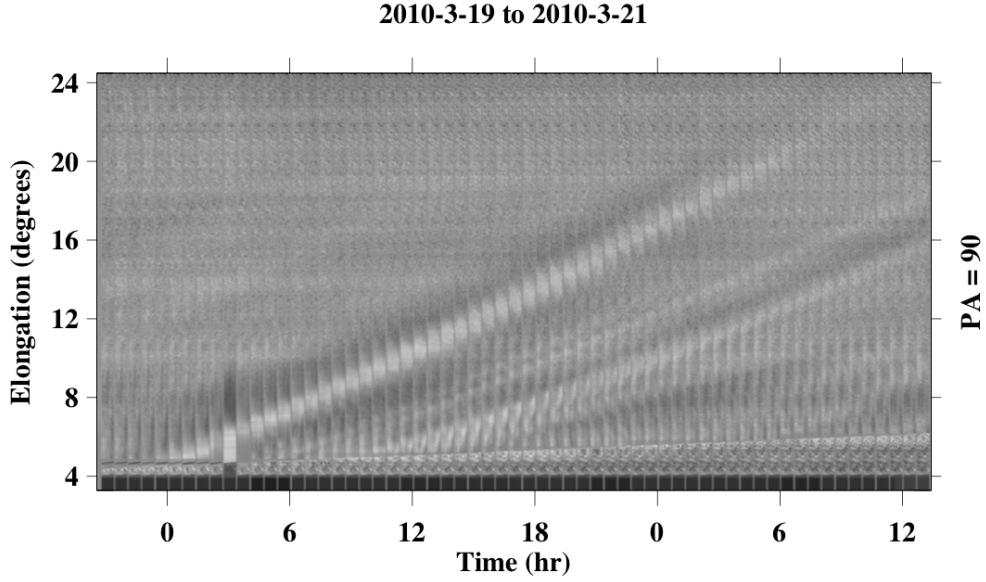
ghost features). We kept only events with simultaneous observation in HI-1 both on-board STEREO-A and STEREO-B that allowed proper identification of the CME front in at least part of the FOV in each spacecraft. Due to these reasons, the following 6 events were removed from our analysis: #1, #5, #6, #24, #37 and #38. After removing these 6 events from the 20 available after the application of criteria explained in Section 2.1, we end up having 14 events.

### 2.3 Extraction of the elongation profiles

To analyze the kinematic evolution of the events, we need to identify their corresponding fronts in the processed images and construct elongation-time maps of a given part of the fronts. The spatial location can then be derived under some assumptions for translating angular positions to heliocentric distances.

Given a set of sequential images observed by HI-1, we selected a position angle (PA) close to the ecliptic plane to construct the time-elongation profiles, frequently called J-maps (Davies et al., 2009). We use the PA of  $90^\circ$  for STEREO-A and  $270^\circ$  for STEREO-B, a region that nearly corresponds to the central height of the image. The PA is kept constant for a given CME event in each viewpoint, i.e., it is set to be the same at all instances. Each time-elongation profile constructed in this way shows at least one bright feature that looks like an inclined line. This corresponds to the brighter points along the selected PA in the images, i.e., to the apex of the CME projected onto the plane of the sky at that particular PA. An example of a J-map created for event #1 is shown in Figure 2. Note that the brighter tracks in the map appear surrounded by a darker region. This is just a result of the image processing applied to the images to reveal the CME features, which exploits the brightness contrast between the foreground and background in a way resembling an unsharp mask filter.

Once the J-map is created, we select the front by eye. Since the identification is subjective, we repeat this procedure 9 times so that we can have an estimate of the error associated to the identification by eye. In the following steps we normally take 3 time-elongation profiles: the median, minimum and maximum for each time instance (hereafter  $\epsilon_{med}[t]$ ,  $\epsilon_{min}[t]$ ,  $\epsilon_{max}[t]$ ). These 3 profiles are all used to estimate the CME Time-of-Arrival (ToA) at Earth, as described in Section 2.5 and Section 3.



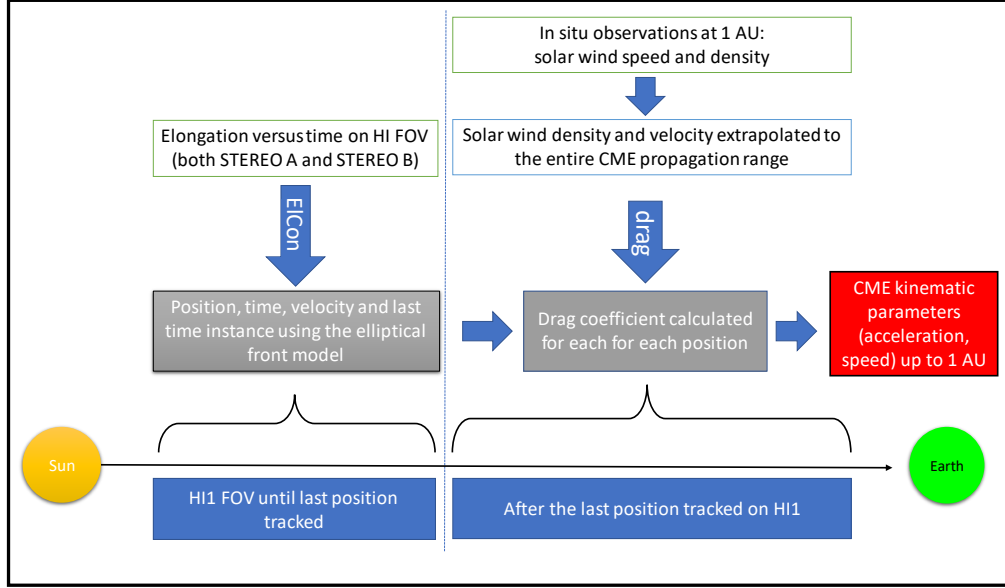
**Figure 2.** Example of J-map of CME #1 (2010/03/19) observed on HI-1-A FOV

In a few events, the J-maps produced at the PA mentioned ( $90^\circ$  for STEREO-A and  $270^\circ$  for STEREO-B) were not clear and we used PA shifted by up to 3 degrees instead. This happened due to the presence of artifacts in the background at a given elongation, such as a bright planet. This negatively affected the CME front tracking in the J-map at that particular PA due to the excessive brightness of this feature as compared to that of both the background and the CME front. From our assessment using a few test CMEs, we understood that the shifted position angle within the range mentioned here produces differences that are within the error range between ( $\epsilon_{min}$  to  $\epsilon_{max}$ ) and, therefore, are not expected to affect significantly the results found here.

## 2.4 Overview of the CME Time-of-Arrival and Speed-on-Arrival determination

We calculate the travel time and Speed-on-Arrival of the CME using the drag model (Section 2.6) and kinematic parameters derived only from HI-1 observations from both spacecraft.

The delineation of the procedure followed is depicted in the diagram in Figure 3. Briefly, we first extract the elongation of the CME front at a given PA as a function of time inde-



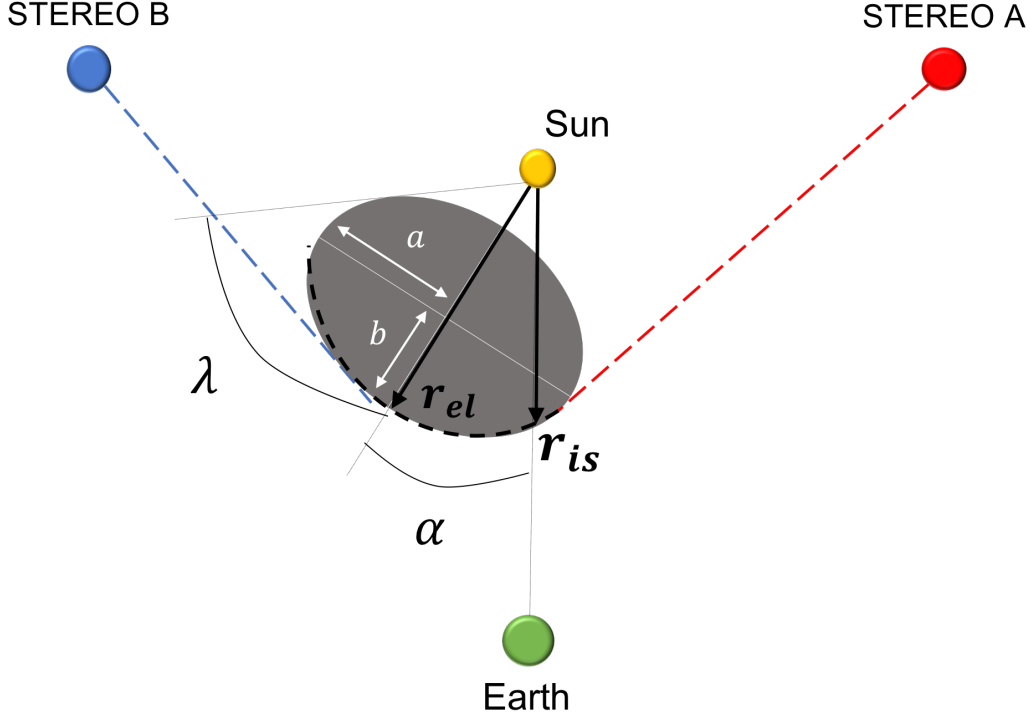
**Figure 3.** Diagram explaining the CME’s Time-of-Arrival (ToA) and Speed-on-Arrival (SoA) determinations. The left half illustrates the determination of CME front as a function of time from observation in the HI-1 FOV. The right half explains the application of the drag model, that is used only after the last position observed on HI-1 FOV. The boxes in white indicate inputs for the models and their outputs are shown in gray. The blue boxes indicate the range (along the Sun-Earth line) where each methodology is applied.

pendently for each telescope. Then, a geometric model (Section 2.5) is used to derive the CME front position at each time instance, as well as its direction of propagation and its speed. These parameters are then used to calculate the CME acceleration at each point (in steps of 0.01 au along the Sun-Earth line) after its last observation on HI-1 (typically from tenths of solar radii) to the L1 point (around  $220 R_{\odot}$ ) using the aerodynamic drag model (Section 2.6).

We have not considered other forces, such as the Lorentz force in this model, because this force is considered to be important only closer to the Sun, especially for fast CMEs (Sachdeva et al., 2015, 2017).

## 2.5 The elliptical front model

To derive the CME position in the HI-1 FOV, we adopt the Elliptical Conversion (ElCon) model as described in Möstl et al. (2015) and Rollett et al. (2016). This model



**Figure 4.** The elliptical front model used in this study to derive the CME front position (dashed black line). The parameters of the model (CME half width in the ecliptic plane  $\lambda$ , aspect ratio of elliptical front  $f = a/b$ , central position angle in the ecliptic plane  $\alpha$ ) are derived by a best-fit of a sequence of time-instances observed simultaneously by HI-1-A and HI-1-B. For each time-instance we derive the position of the CME front point along the Sun-Earth line ( $r_{is}$ ) and along the central axis of the CME ( $r_{el}$ ).

considers an elliptically shaped CME front on the ecliptic plane. Its position and speed can then be derived at any location in space using just geometrical arguments, provided the time evolution of the front's elongation is known and a set of given parameters of the CME front (e.g., angular width, direction of propagation, aspect ratio, etc.) are defined. The model adds an extra degree of freedom when compared to cylindrical CME fronts. Since the CMEs can have various shapes, the elliptical front should be a good fit for more events. This model and its parameters are shown in Figure 4.

In this study, we derive the parameters of the model (CME half width in the ecliptic plane  $\lambda$ , aspect ratio of elliptical front  $f$ , central position angle in the ecliptic plane  $\alpha$ , speed) by doing a best-fit of a sequence of  $n$  time-instances observed simultaneously by

HI-1-A and HI-1-B. In previous studies these parameters were fixed for a given set of CMEs for simplicity (Möstl et al., 2015; Rollett et al., 2016). The residual  $\sigma$  was calculated from the following expression:

$$\sigma = \sum_{t=1}^n (|r_{is}(t)^A - r_{is}(t)^B| + |r_{el}(t)^A - r_{el}(t)^B|)/n$$

where  $r_{is}(t)$  is the position of the CME front point along the Sun-Earth line on the ecliptic plane as a function of time,  $t$ , derived using observations from a given spacecraft;  $r_{el}(t)$  denotes the position of the central axis on the CME front. The angle between  $r_{is}$  and  $r_{el}$  corresponds to  $\alpha$ . Positive values of  $\alpha$  indicate that the CME propagates towards STEREO-A. The superscripts  $A$  and  $B$  indicate values from STEREO-A and STEREO-B observations, respectively.

The list of parameters derived using the ElCon model is shown in Table 2. As already mentioned, from the list of 38 events shown in Table 1, only 14 are used with the ElCon model. The rest were removed due to the reasons described in Section 2.1 and 2.2.

We have fit the elliptical model three times for each event: one using the median elongation extracted at each time instance  $\epsilon_{med}[t]$ , a second with minimum elongation  $\epsilon_{min}[t]$  and a third time using the maximum  $\epsilon_{max}[t]$ . In each case, a set of parameters  $\lambda$ ,  $f$ ,  $\alpha$  is derived and  $r_{is}$  at each time instance  $t$  is calculated as the average of  $r_{is}^A$  and  $r_{is}^B$ .

$v_{med}$ ,  $v_{min}$ ,  $v_{max}$  are the linear speeds calculated from the parameters of the ElCon derived using  $\epsilon_{med}[t]$ ,  $\epsilon_{min}[t]$  and  $\epsilon_{max}[t]$ , respectively. All three speeds considered here are calculated along the Sun-Earth line, i.e., using  $r_{is}$ . The difference between the 3 values (typically well below 100 km/s) give us an idea of the error introduced in the CME speed due to differences in the identification of the CME front in the J-maps. The 3 speeds are used for the calculation of the CME travel time and ToA error, as described in Section 3. The remaining parameters shown in Table 2 ( $f$ ,  $\lambda$ ,  $\sigma$  and  $\alpha$ ) are calculated using the median elongation profile.

## 2.6 The drag model

The aerodynamic drag results from the interaction of the CME with the solar wind. There are many references applying such force and most of them rely on empirical drag coefficients (Cargill, 2004; Vršnak, 2006; T. A. Howard et al., 2007; Borgazzi et al., 2009; Byrne

**Table 2.** Parameters of the CMEs elliptical front derived using the ElCon model: linear speeds ( $v_{med}$ ,  $v_{min}$  and  $v_{max}$ ), CME half width in the ecliptic plane ( $\lambda$ ), aspect ratio of the front ( $f$ ) and the CME central position angle on the ecliptic plane ( $\alpha$ , positive ahead of the Earth). Other parameters shown are the residual ( $\sigma$ ) and the position of the last point that the CME was tracked simultaneously on both viewpoints ( $s_0$ ).

| ID | last tracked time (UT)<br>(UT) | $s_0$<br>[au] | $v_{med}$<br>[km/s] | $v_{min}$<br>[km/s] | $v_{max}$<br>[km/s] | $f$ | $\lambda$<br>[°] | $\sigma$<br>[au] | $\alpha$<br>[°] |
|----|--------------------------------|---------------|---------------------|---------------------|---------------------|-----|------------------|------------------|-----------------|
| 2  | 03-Apr-2010 20:29:21           | 0.22          | 846                 | 866                 | 876                 | 0.5 | 80               | 0.0047           | -17             |
| 3  | 09-Apr-2010 00:39:22           | 0.28          | 490                 | 448                 | 491                 | 0.6 | 60               | 0.0021           | 12              |
| 9  | 15-Feb-2011 18:29:34           | 0.26          | 465                 | 456                 | 475                 | 0.5 | 65               | 0.0028           | -12             |
| 11 | 26-Mar-2011 07:59:25           | 0.20          | 448                 | 446                 | 427                 | 0.5 | 50               | 0.0033           | -11             |
| 13 | 14-Jun-2011 23:49:28           | 0.28          | 769                 | 765                 | 775                 | 0.5 | 70               | 0.0081           | -19             |
| 17 | 14-Sep-2011 10:29:53           | 0.14          | 605                 | 584                 | 568                 | 0.5 | 80               | 0.0093           | 63              |
| 25 | 20-Apr-2012 10:29:25           | 0.25          | 446                 | 446                 | 453                 | 0.5 | 80               | 0.0079           | -32             |
| 26 | 15-Jun-2012 03:19:22           | 0.27          | 741                 | 755                 | 776                 | 0.5 | 80               | 0.0051           | -7              |
| 27 | 13-Jul-2012 07:59:27           | 0.31          | 743                 | 732                 | 780                 | 0.9 | 80               | 0.0475           | 20              |
| 28 | 28-Sep-2012 08:29:50           | 0.18          | 740                 | 721                 | 739                 | 0.6 | 20               | 0.0056           | 20              |
| 29 | 06-Oct-2012 01:49:52           | 0.36          | 692                 | 686                 | 712                 | 0.5 | 30               | 0.0075           | 15              |
| 30 | 28-Oct-2012 11:59:57           | 0.21          | 431                 | 422                 | 441                 | 0.5 | 20               | 0.0097           | 11              |
| 33 | 15-Mar-2013 15:59:43           | 0.19          | 765                 | 703                 | 737                 | 0.6 | 80               | 0.0030           | 1               |
| 34 | 11-Apr-2013 15:49:33           | 0.18          | 764                 | 780                 | 667                 | 0.5 | 65               | 0.0042           | -1              |

et al., 2010; Maloney & Gallagher, 2010; Vršnak et al., 2010, 2012; Mishra & Srivastava, 2013; Dolei et al., 2014; Iju et al., 2014; Temmer & Nitta, 2015).

Among these works, many authors have used a constant drag coefficient for a given CME in its path from the Sun to the Earth so that the drag could only be a function of: (i) the difference between the CME and solar wind speed, (ii) CME mass, (iii) solar wind density and (iv) cross section area of the CME. Only a few works have used a drag coefficient as a function of the Reynolds number, which in turn depends on the viscosity of the solar wind plasma (Subramanian et al., 2012; Sachdeva et al., 2015). Following Sachdeva et al. (2015), we consider the drag force description given by:

$$F_{drag}[s] = -m_{CME} \gamma[s] (v_{CME}[s] - v_{SW}[s]) |v_{CME}[s] - v_{SW}[s]|,$$

where  $v_{CME}$  is the CME speed and  $v_{SW}$  is the background solar wind speed. Both speeds are a function of CME position  $s$  along the Sun-Earth line. For a CME propagating towards the Earth,  $s$  increases as time passes.  $m_{CME}$  is the CME mass taken from the CDAW CME catalog (Yashiro, 2004). If not available, we consider  $m_{CME} = 1.1 \times 10^{15} g$ , the median value reported on Vourlidis et al. (2010) for CMEs observed between 1996 and 2009.  $\gamma$  is given by:

$$\gamma[s] = C_D[s] n_{SW}[s] \frac{m_P A_{CME}[s]}{m_{CME}}$$

where  $C_D$  is the dimensionless drag parameter,  $n_{SW}$  is the solar wind proton number density,  $m_P$  is the proton mass,  $A_{CME}$  is the CME cross section area (explained in the next paragraphs) and  $m_{CME}$  is the CME mass. Typically  $\gamma$  has values range from  $1 \times 10^{-9} km^{-1}$  to  $2 \times 10^{-7} km^{-1}$ , see, e.g. Temmer and Nitta (2015) and Vršnak et al. (2013).

In several previous studies,  $C_D$  was empirically determined while considered to be constant (see, e.g. Cargill (2004); Vršnak et al. (2010); Mishra and Srivastava (2013); Temmer and Nitta (2015), and references therein). In these studies,  $C_D$  typically ranges from 0.2 to 0.4.

In this study, on the other hand, we determine the value of  $C_D$  using a set of equations based on a physical definition of the CME aerodynamic drag introduced by Subramanian et al. (2012) and previously studied by Sachdeva et al. (2015, 2017). Here we describe  $C_D$  using the following expression determined experimentally by Achenbach (1972):

$$C_D[s] = 0.148 - 4.3 \times 10^4 (Re[s])^{-1} + 9.8 \times 10^{-9} Re[s] .$$

This equation for  $C_D$  is a fit to data observed on a solid metal sphere immersed on a flow with high Reynolds number  $Re$ . We considered that this result is suitable for the interaction of the CME with the background solar wind because (i) the equation of the drag force considers a solid-like body immersed on a high-Reynolds number and (ii) typically the boundaries of magnetic clouds (and therefore, CMEs) are over-pressured structures that do not tend to deform in response to tangential stresses because the total pressure (magnetic plus plasma) has a substantial jump in this region according to Jian et al. (2006).

The Reynolds number depends on the macroscopic lengthscale of the CME, its velocity relative to the background solar wind particles and the viscosity of the solar wind. For more details, the reader is referred to Sachdeva et al. (2017).

The CME cross section area  $A_{CME}$  is calculated as:

$$A_{CME} [s] = \pi \times R_{CME}^2 [s] \times w / 360$$

where  $w$  is the width of the CME (in degrees, as determined by the CME CDAW catalog) and  $R_{CME}$  is the radius of the CME that was taken to be  $0.4s$ . This expression of  $R_{CME}$  was experimentally chosen in this study as a good solution to reduce the ToA error for the set of CME events studied here among different values of the coefficient lower than the unit.

## 2.7 Background solar wind speed

As described in previous section, the solar wind speed  $v_{SW}$  at any point along the Sun-Earth is required to calculate the drag. Close to 1 au, the solar wind conditions are continuously observed by instrumentation at the Lagrangian point L1, such as by the Solar Wind Electron, Proton, and Alpha Monitor (SWEPAM) instrument (McComas et al., 1998) onboard Advanced Composition Explorer (ACE) mission (Stone et al., 1998) and by the Solar Wind Electron (SWE) instrument (Ogilvie et al., 1995) onboard Wind spacecraft (King, 2005). In the remaining points of the trajectory, on the other hand,  $v_{SW}$  need to be calculated using empirical models or simulation.

In this study, we use an empirical expression to extrapolate the solar wind speed at any position along the Sun-Earth line using observation at 1 au ( $v_{SW@1au}$ ). Following N. R. Sheeley et al. (1997) and Sheeley et al. (1999), the solar wind speed along the Sun-Earth line ( $v_{sw}[s]$ ) is considered to be:



$$v_{SW}[s] = v_{SW@1au}[1 - e^{-(s-r_0)/r_a}]$$

where  $s$  is a given position along the Sun-Earth line,  $r_0 = 1.5 R_\odot$  is the distance from the Sun where the solar wind is taken to be zero and  $r_a = 50 R_\odot$  is the distance over which the asymptotic speed is reached. According to this model, the solar wind speed increases more significantly close to the Sun, typically up to approximately  $100 R_\odot$ , and then it is almost constant up to  $1 au$ .

In this work, we considered that  $v_{SW@1au}$  is the average observed value in the time period from 48 up to 24 hours before the CME first observation on LASCO C2. We chose this time period taking into account the typical travel time for a solar wind packet to travel from the solar corona to  $1 au$ .

## 2.8 Background solar wind density

Besides the solar wind speed, the solar wind density along the CME trajectory is also required for calculating the drag force as described in Section 2.6. Again, the observations are limited to  $1 au$  and the density evolution must be derived via a model. The solar wind proton density  $n_{SW}$  as a function of position  $s$  is given by

$$n_{SW}[s] = \left(\frac{n_{SW@1au}}{7.2}\right) (3.3 \times 10^5 s^{-2} + 4.1 \times 10^6 s^{-4} + 8 \times 10^7 s^{-6})$$

where  $n_{SW@1au}$  is the solar wind density observed in the L1 Lagrangian Point (close to  $1 au$ ). Here we use the model of electron density from Leblanc et al. (1998) assuming that the electron and proton densities are equal. The term between parentheses considers the difference of the density at  $1 au$  from the original value of  $7.2 cm^{-3}$  used on the model.  $n_{SW@1au}$  was assumed to be the average observation value from 48 up to 24 hours before the CME first observation on LASCO C2.

## 3 Results

### 3.1 Application of the drag model

We use the position of the CME at the time of the last HI-1 observation in the calculation of the drag coefficient and the linear speed of the portion of the CME front along the Sun-Earth line ( $v_{med}$ ,  $v_{min}$ ,  $v_{max}$ ). Some geometric parameters derived using ElCon (such as the angular width and angle) are not used directly by the drag force, but they are indirectly taken into account in the derivation of  $r_{is}$  in each time-instance.

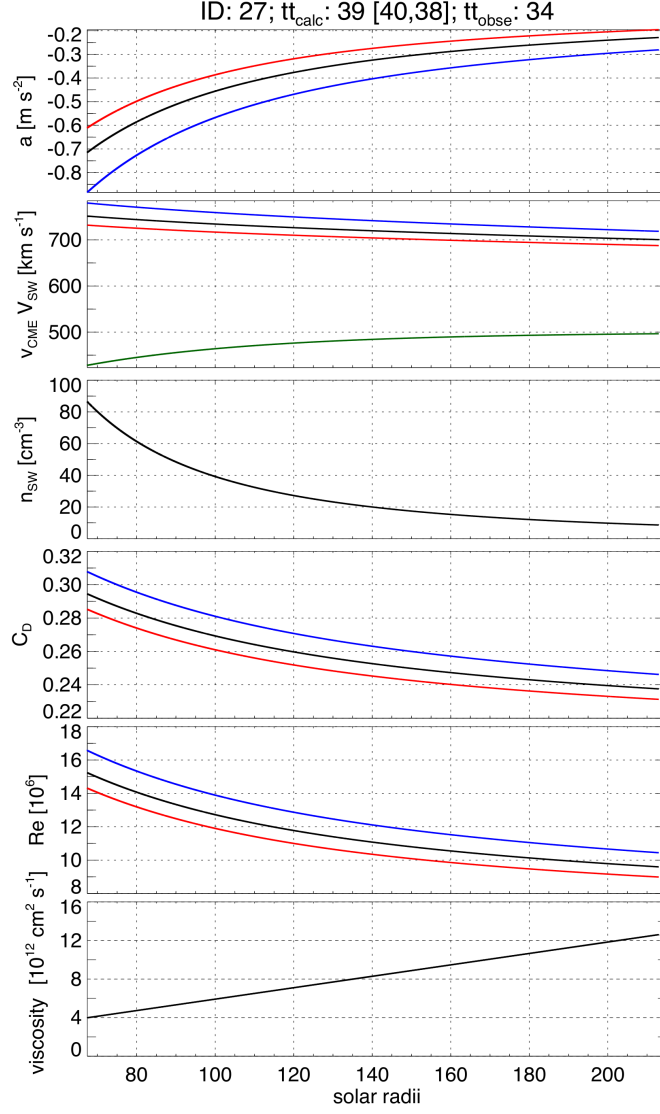
We start the application of the drag model at the last HI-1 observation position ( $s_0$ ). In some cases, the brightness of the CME front is equal to the background and the CME front cannot be resolved, specially in the outer half of the FOV. Thus, the  $s_0$  position changes from event to event, and it is indicated in the second column of Table 2. Typically, the last height-time observation ranges between 20 and 80 solar radii.

An example of the application of the drag model is shown in Figure 5. In each panel, the horizontal axis shows the distance from the Sun (in solar radii). In the top left panel, the black line denotes the acceleration based on the initial speed  $v_{med}$ . Acceleration profiles based on  $v_{min}$  and  $v_{max}$  are indicated by the red and blue lines, respectively. The CME speed derived using  $v_{med}$  as initial speed is shown in the second panel, from top to bottom. The speed of the background solar wind speed ( $v_{sw}$ ) is indicated by the green line. The remaining lines represent speeds calculated using  $v_{min}$  and  $v_{max}$ . The background solar wind proton density is represented on the third panel, from top to bottom. Other parameters shown are drag coefficient (fourth panel, from top to bottom), the Reynolds number (fifth panel) and the viscosity (lower panel).

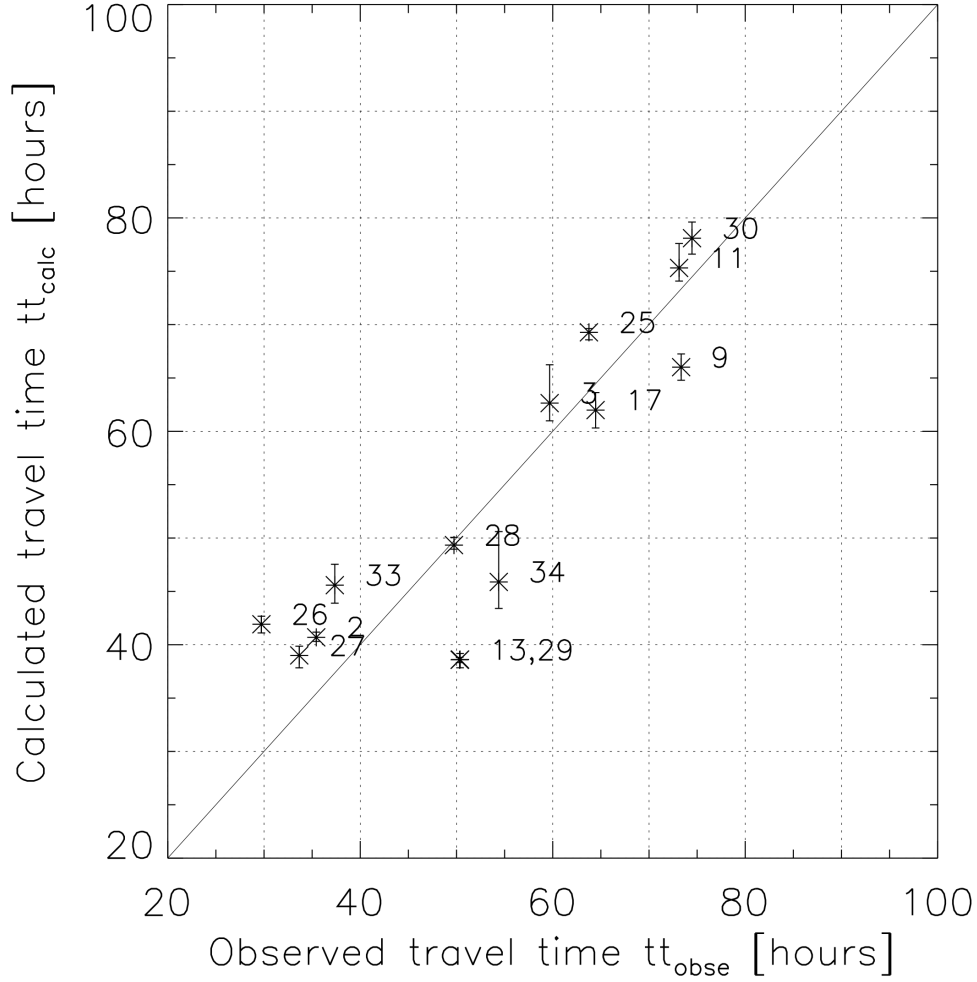
For all analyzed events,  $C_D$  has a decreasing profile from the Sun to 1 au, typically with steeper slope close to the Sun, as shown in Figure 5. The variations for the different cases arise from differences between the CME and background solar wind speed and density, and the CME area and mass. Close to the Sun,  $C_D$  ranges from 0.36 to 0.19 while at L1 its values ranges from 0.16 to 0.28. Values of  $C_D$  in any position mentioned above lie in the same range than previous studies that adopted a single drag coefficient for a set of events, which have values typically chosen between 0.2 and 0.4.

As the CME moves toward the Earth, the background solar wind speed increases asymptotically. Given the nature of the drag force, the CME decelerates and, as a result, the magnitude of the drag force decreases. Other reasons for the decrease in the drag force with distance are: (i) the solar wind density ( $n_{sw}$ ) decreases (from values typically around  $50 \text{ cm}^{-3}$  to  $5 \text{ cm}^{-3}$  and/or (ii) the Reynolds number ( $Re$ ) decreases thus reducing the drag coefficient  $C_D$ .

All 14 CMEs in our sample decelerate since all have  $v_{CME} > v_{SW}$ . The deceleration rate is higher close to the Sun (values up to  $3.25 \text{ m/s}^2$ ) and decreases as the CME propagates toward 1 au.



**Figure 5.** The application of the drag force to a sample CME that is decelerated from the solar corona to 1 au. In the panels with multiple lines, the black ones indicate the CME kinematic parameters calculated using  $v_{\text{med}}$  and the red and blue lines indicate CME parameters calculated using  $v_{\text{min}}$  and  $v_{\text{max}}$ , respectively. The green line on the second panel (from top to bottom) indicates the background solar wind speed.



**Figure 6.** The calculated and observed travel time (from the last observation on HI-1 FOV until L1). The labels correspond to the CME IDs in Table 1. The line indicates the points where the model and observed travel times are identical, i.e., the ToA error is zero ( $\delta t = 0$ ).

### 3.2 The CME Time-of-Arrival (ToA) errors

In this section we compare the CME travel time from its last HI-1 observation point  $s_0$  up to 1 au calculated using the aerodynamic drag model ( $tt_{calc}$ ) with the actual travel time ( $tt_{obse}$ ). The latter is the time difference between the first ICME observation and the last CME observation at  $s_0$ . The results are shown in Figure 6.

The instant of the CME arrival at Earth is clearly identified from in situ observations for all events studied here. All events are preceded by a clear discontinuity in the magnetic field

and solar wind parameters (solar wind speed, density and temperature). For this reason, it is unlikely that the CME ToA errors found here are due to by ambiguous determination of ICME arrival time. Since  $tt_{obs}$  is not expected to be a source of errors, we focus this study on sources of errors associated to  $tt_{calc}$ .

For the 14 CME-ICMEs pairs studied here, the ToA error mean value is  $0.4 \pm 7.3$  hours and the mean absolute error (MAE) is  $6.1 \pm 3.6$  hours. The Pearson correlation coefficient found when we compare  $tt_{calc}$  and  $t_{obs}$  is 0.87.

According to an extensive review of CME ToA from Vourlidas et al. (2019) that considers more than 20 studies of ToA error, the MAE found here lies among the lowest values. Among the previous studies, 7 consider the drag force (most of them using empirical values of  $\gamma$  rather than the model we adopted here) and only one adopted the ElCon model (although without using simultaneous observations from STEREO). Our sample size is among the smallest (only 14 CMEs are analyzed): other studies using drag-based model included up to 34 events and other references about empirical methods have more than 200 CMEs in their sample. The main reasons for the small data set are our rather strong selection criteria. As mentioned in Section 2.1, we require simultaneous observations from both HI-1s, events well-separated in time/space and reliable CME-ICME identifications.

The relatively low ToA error found here does not necessarily mean that the methodology is better than in studies with higher MAE and larger event sizes. However, it is an encouraging indication that better ToA estimates could be attained via carefully selected event samples along with improved image processing and measurements higher in the corona (when the CME is more likely to be in equilibrium with its surroundings)

Our results along with results from Rollett et al. (2016), suggest that the HI-1 leads to lower ToA error than coronagraph observation, at least among those reported on Vourlidas et al. (2019). This suggests that the observations from HI-1 are suitable for CME ToA estimates at least for the set of events analyzed here.

### 3.3 The CME Speed-on-Arrival (SoA) and its error

In this section we compare the CME Speed-on-Arrival (SoA) at  $1 au$  derived from our drag-based model with the corresponding in situ observed ICME speed ( $v_{ICME}$ ).

**Table 3.** Calculated and observed CME travel time and speed between end HI-1 FOV and L1.

| ID | first observation<br>(UT) | last tracking<br>(UT) | Arrival at 1 au<br>(UT) | $t_{calc}$<br>[h] | $t_{obse}$<br>[h] | $\delta t$<br>[h] | $v_{init}$<br>[km/s] | $v_{final}$<br>[km/s] | $v_{final}^+$<br>[km/s] | $v_{final}^-$<br>[km/s] | $v_{ICME}$<br>[km/s] | $v_{SW@1au}$<br>[km/s] | $n_{SW@1au}$<br>[cm <sup>-3</sup> ] |
|----|---------------------------|-----------------------|-------------------------|-------------------|-------------------|-------------------|----------------------|-----------------------|-------------------------|-------------------------|----------------------|------------------------|-------------------------------------|
| 2  | 03-Apr-2010 10:33:58      | 03-Apr-2010 20:29:21  | 05-Apr-2010 07:55:00    | 41                | 35                | 6                 | 863                  | 752                   | 757                     | 746                     | 666                  | 620                    | 4                                   |
| 3  | 08-Apr-2010 04:54:07      | 09-Apr-2010 00:39:22  | 11-Apr-2010 12:20:00    | 63                | 60                | 3                 | 476                  | 466                   | 478                     | 443                     | 419                  | 401                    | 5                                   |
| 9  | 15-Feb-2011 02:24:05      | 15-Feb-2011 18:29:34  | 18-Feb-2011 19:50:00    | 66                | 73                | -7                | 465                  | 456                   | 464                     | 448                     | 487                  | 378                    | 5                                   |
| 11 | 25-Mar-2011 08:48:25      | 26-Mar-2011 07:59:25  | 29-Mar-2011 09:07:00    | 75                | 73                | 2                 | 440                  | 436                   | 443                     | 423                     | 361                  | 346                    | 5                                   |
| 13 | 14-Jun-2011 06:12:05      | 14-Jun-2011 23:49:28  | 17-Jun-2011 02:09:00    | 39                | 50                | -11               | 770                  | 756                   | 761                     | 752                     | 458                  | 448                    | 5                                   |
| 17 | 14-Sep-2011 00:00:05      | 14-Sep-2011 10:29:53  | 17-Sep-2011 02:57:00    | 62                | 64                | -2                | 586                  | 558                   | 572                     | 546                     | 463                  | 455                    | 5                                   |
| 25 | 19-Apr-2012 15:12:09      | 20-Apr-2012 10:29:25  | 23-Apr-2012 02:15:00    | 69                | 64                | 5                 | 448                  | 445                   | 450                     | 443                     | 377                  | 340                    | 5                                   |
| 26 | 14-Jun-2012 14:12:07      | 15-Jun-2012 03:19:22  | 16-Jun-2012 09:03:00    | 42                | 30                | 12                | 757                  | 676                   | 687                     | 666                     | 431                  | 408                    | 10                                  |
| 27 | 12-Jul-2012 16:48:05      | 13-Jul-2012 07:59:27  | 14-Jul-2012 17:39:00    | 39                | 34                | 5                 | 752                  | 701                   | 719                     | 688                     | 590                  | 500                    | 9                                   |
| 28 | 28-Sep-2012 00:12:05      | 28-Sep-2012 08:29:50  | 30-Sep-2012 10:14:00    | 49                | 50                | -1                | 733                  | 639                   | 643                     | 630                     | 345                  | 279                    | 5                                   |
| 29 | 05-Oct-2012 02:48:05      | 06-Oct-2012 01:49:52  | 08-Oct-2012 04:12:00    | 39                | 50                | -11               | 697                  | 659                   | 672                     | 650                     | 377                  | 323                    | 5                                   |
| 30 | 27-Oct-2012 16:48:05      | 28-Oct-2012 11:59:57  | 31-Oct-2012 14:28:00    | 78                | 74                | 4                 | 431                  | 405                   | 412                     | 399                     | 354                  | 279                    | 5                                   |
| 33 | 15-Mar-2013 07:12:05      | 15-Mar-2013 15:59:43  | 17-Mar-2013 05:21:00    | 46                | 37                | 9                 | 735                  | 721                   | 747                     | 693                     | 625                  | 536                    | 5                                   |
| 34 | 11-Apr-2013 07:24:06      | 11-Apr-2013 15:49:33  | 13-Apr-2013 22:13:00    | 46                | 54                | -8                | 737                  | 728                   | 769                     | 661                     | 482                  | 421                    | 2                                   |

In this study, we calculated the SoA in 3 different ways for each CME, labelled  $v_{final}$ ,  $v_{final}^-$  and  $v_{final}^+$  (Table 3). They were calculated using  $v_{med}$ ,  $v_{min}$  and  $v_{max}$ , respectively, as initial speeds in the drag model. The difference between  $v_{med}$ ,  $v_{min}$  and  $v_{max}$  comes from the multiple visual CME identification in the J-map (as described in Section 2.3) and it is  $< 50 \text{ km s}^{-1}$  for all events, except for #34 that is  $113 \text{ km s}^{-1}$ . For all events in our list, the mean value of  $v_{final}^+ - v_{final}^-$  is  $28 \text{ km s}^{-1}$ . Compared to the typical CME speed error, which is about  $100 \text{ km s}^{-1}$  (Mierla et al., 2010), the errors found in this study can be considered low.

This result illustrates that the specific feature selected on a given J-map by eye (responsible for the difference in the initial speed used on the drag model) leads to a minor difference on the SoA. An example of CME speeds as a function of position calculated using both  $v_{min}$  and  $v_{max}$  is shown in Figure 5 (second panel, from top). They are represented by the blue and red lines, respectively. In this example the difference between  $v_{final}^-$  and  $v_{final}^+$  is  $31 \text{ km s}^{-1}$ .

The ICME speed  $v_{ICME}$  is calculated here as the average proton speed observed in situ during the ICME period reported on the Wind ICME list. The data used here comes from the OMNI database and consists of merged observations from the ACE and the Wind spacecraft.

The distribution of  $v_{final}$  versus  $v_{ICME}$  is shown in Figure 7. The error bars shown in the plot are defined by  $v_{final}^+$  and  $v_{final}^-$ . The CME SoA error ( $\delta v = v_{final} - v_{ICME}$ ) is  $140 \pm 109 \text{ km s}^{-1}$  and the SoA MAE is  $144 \pm 102 \text{ km s}^{-1}$ . The trend is that the CME arrival speed calculated here is higher than the actual ICME speed. The Pearson correlation coefficient between  $v_{final}$  and  $v_{ICME}$  is 0.60, lower than the correlation found comparing observed and calculated travel times.

The SoA error is not reduced significantly when we consider  $v_{final}^+$  and  $v_{final}^-$ . This indicates that the error in the initial CME speed, estimated via multiple visual identifications on the J-maps, cannot explain the majority of the SoA error. In this way, this error could be due to (i) an error in the initial CME speed ( $v_{init}$ ) due to the ElCon model and its assumptions, such as linear speed and fixed direction of propagation; (ii) an incomplete or incorrect description of the forces that affect the CME propagation from  $s_0$  to  $1 \text{ au}$ ; and/or (iii) the  $v_{ICME}$  does not correspond to the CME front speed precisely. This could happen because  $v_{ICME}$  is measured in situ from observations of the solar wind particles around

the observing spacecraft and  $v_{final}$  is a parameter describing the CME front as a whole, having dimensions that are orders of magnitude larger than the region observed in situ by a spacecraft.

The SoA MAE was compared with results from 5 other studies, as shown in Table 1 of Vourlidas et al. (2019). Our results are similar except the much lower SoA in Rollett et al. (2016) ( $16 \pm 53 \text{ km s}^{-1}$ ).

We identified that 5 events studied here (# 13, #26, #28, #29 and #34) have SoA absolute error ( $|\delta v| = |v_{final} - v_{ICME}|$ ) higher than  $200 \text{ km s}^{-1}$  while the remaining are lower than  $120 \text{ km s}^{-1}$  (this can be seen clearly in Figure 7. We tried to identify any trend between the  $|\delta v|$  and input parameters used in the drag model, particularly those that change between events. We could not find, though, any trend between  $|\delta v|$  and CME mass, width, background solar wind speed in the corona and 1 au nor solar wind density at 1 au.

One common point among events with higher  $|\delta v|$  is that the CME initial speed is between  $\sim 700 \text{ km s}^{-1}$  and  $\sim 800 \text{ km s}^{-1}$ . The opposite is not true, however. Some CMEs with initial speed in the same range have  $|\delta v|$  among the lowest values ( $< 120 \text{ km s}^{-1}$ ).

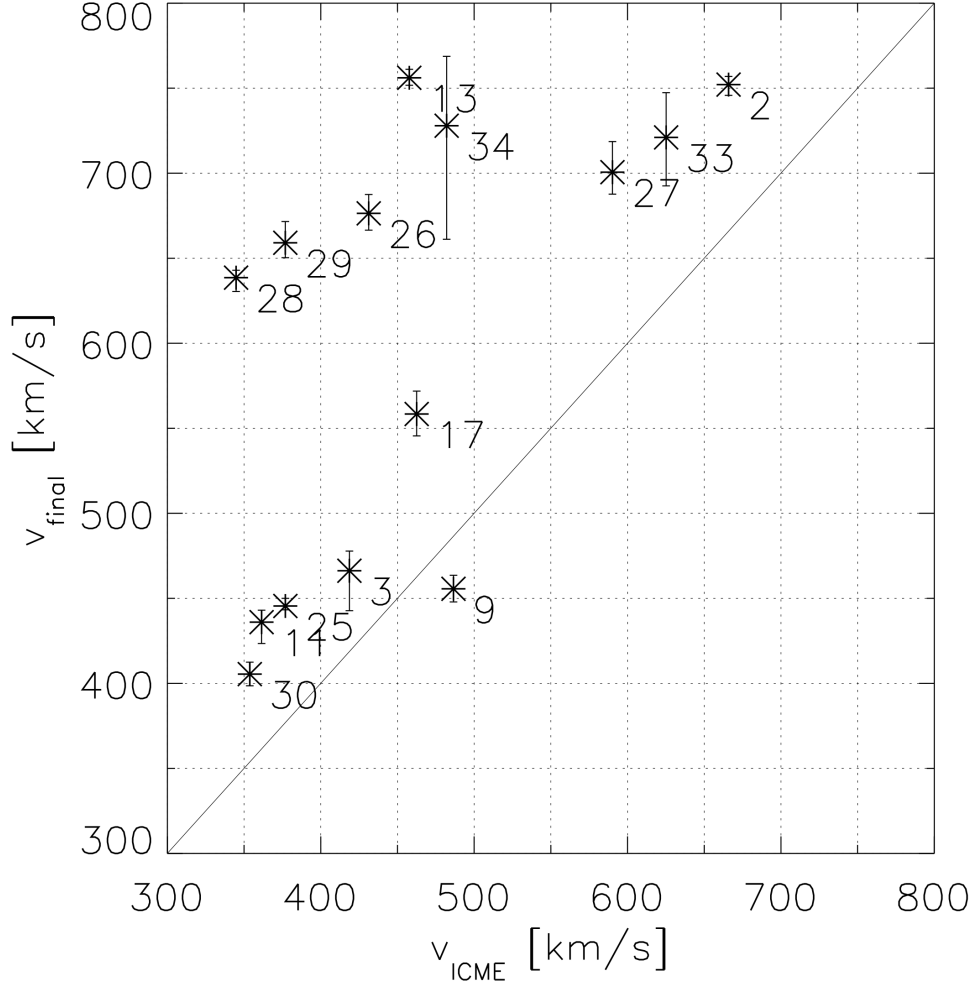
### 3.4 CME ToA and SoA errors during different background solar wind conditions

In this section we discuss whether the aerodynamic drag model adopted here lead to  $\delta t$  and  $\delta v$  higher or lower in any particular condition of the background solar wind condition, such as proton density or speed.

The drag force, according to the description in Section 2.6, depends on the difference between CME and background solar wind speed. Our events occur over a diverse range of 1 au solar wind speeds,  $v_{sw@1au}$ , as listed in the second column of Table 3, from right to left. Since  $v_{sw@1au}$  is used to extrapolate the solar wind speed to  $s_0$ , it affects the drag force in the whole range calculated here.

In all cases studied here we observed that the  $v_{sw}$  is lower than  $v_{CME}$  at the first point of application of the drag force ( $s_0$ ) and, as a result, the drag force produces deceleration. In 11 of the 14 events studied here,  $v_{sw@1au}$  was lower than  $500 \text{ km/s}$ . The highest value of  $v_{sw@1au}$  was observed in CME #2:  $620 \text{ km/s}$ . In some events (such as #28 and #30), the solar wind speed is particularly low  $v_{sw@1au} = 279 \text{ km/s}$ .





**Figure 7.** The CME speed calculated at 1 au using the drag model ( $v_{final}$ ) compared to the in situ ICME speed ( $v_{ICME}$ ). The labels correspond to the CME IDs in Table 1. The line represents the region with  $\delta v = 0$ , i.e., the position a given event would be located if it had null SoA error.

When comparing  $v_{sw}$  to  $\delta t$  or  $\delta v$ , we did not find any clear trend. This result can be interpreted in two alternative ways: (a) the drag force description used here leads to similar errors in any background solar wind speed values or (b)  $\delta t$  and  $\delta v$  found here are mainly associated to sources other than the drag force, such as errors in the determination of initial CME speed, direction of propagation or position.

Other observed solar wind parameter used in the drag model is the background solar wind density at 1 *au*. This is used to estimate the solar wind density at any position along the path used on the drag force calculation. Among the set of events studied here, the solar wind density is higher than the average for quiet periods ( $n_{SW@1au} = 5 \text{ cm}^{-3}$ ) only in two events (#26 and #27). In these cases,  $n_{SW@1au}$  is approximately two times higher than the quiet period values.

We did not see any trend when associating the background solar wind density with the  $\delta t$  and  $\delta v$  errors. This result suggests that the drag model usability is not limited to average values of solar wind density since the errors found are not clearly different in any background solar wind density condition observed in the cases studied here.

### 3.5 The contribution of the drag force on the CME SoA estimation

The CME speed variation ( $\Delta v = v_{final} - v_{init}$ ) in the entire range we applied the drag force (from  $s_0$  up to 1 *au*) is  $> 100 \text{ km s}^{-1}$  for event #2 and  $\Delta v > 50 \text{ km s}^{-1}$  for the following events: #26, #27 and #28. On the remaining 10 events,  $0 < \Delta v < 50 \text{ km s}^{-1}$ .

Since the typical error of CME speed in coronagraph observations is around  $100 \text{ km s}^{-1}$  (Mierla et al., 2010), we conclude that the contribution of the drag force on the SoA is small and within the error range of the CME speed observations, at least for the events considered here and within the heights we apply the drag force (from  $s_0$  up to 1 *au*). Here  $s_0$  ranges from 0.14 *au* (32 solar radii) to 0.36 *au* (77 solar radii).

Our results agree with Sachdeva et al. (2015) who found that the drag force is minimum at distances above 15-50 solar radii for slow CMEs since they propagate almost at constant speeds after that range.

A second point is that all events with  $\Delta v > 50 \text{ km s}^{-1}$  have  $v_{init} > 697 \text{ km s}^{-1}$  but some events with  $v_{init} > 697 \text{ km s}^{-1}$  (#13, #33 and #34) have  $\Delta v < 30 \text{ km s}^{-1}$ . This result illustrate that although the drag force absolute value is frequently higher for

high-speed CMEs, this force is also strongly affected by other factors in some events studied here.

### 3.6 The contribution of the aerodynamic drag force on the CME ToA estimation

In order to assess the importance of the drag force in the estimation of the ToA, we repeated its calculation ignoring the drag force. This corresponds to a very simplified model consisting of a CME propagating from  $s_0$  (located in the HI-1 FOV) to 1 *au* with constant speed equals to the initial speed attributed to the CME  $v_{init}$  after applying the ElCon model.

The ToA mean error found considering no drag force is  $-1.2 \pm 7.0$  *h* and ToA mean absolute error is  $5.8 \pm 3.9$  *h*. Comparing these values to the results found using the drag force, we can see that they are slightly higher but still within the error range.

This result suggests that the contribution of the drag force is at most at the same level of magnitude than other unknown reasons that could explain the ToA error. As discussed in Section 3.5, results from previous studies using the same drag force model suggest that this is not very expressive at the position range that  $s_0$  typically lies.

We do not understand that this means, necessarily, that the drag model should be considered negligible for studying CME propagation. The drag force is normally more intense at points closer to the Sun than at the position studied here ( $s_0$ ) because the solar wind speed is lower and, at least for fast CMEs, the CME speed is higher. Both factors result in higher drag forces in positions closer to the Sun than studied here and lead to higher ToA error when aerodynamic drag force is simply neglected.

### 3.7 Does Tracking the CME further in the HI-1 FOV reduces ToA and SoA errors?

The application of the drag model used here does not start at the same position for all 14 events analyzed. Each CME is tracked until  $s_0$ , which is the last point where it is clearly observed in HI-1 FOV (onboard both STEREO-A and STEREO-B). After this, the drag is applied from this point up to 1 *au*, as explained in Section 2.4. CMEs with lower  $s_0$  have their speed, direction of propagation and morphological parameters (such as angular width

in the ecliptic plane and elliptical aspect ratio) derived in a smaller position range along the Sun-Earth line and drag force application starts closer to the Sun.

In the set of 14 events analyzed here, there is no correlation between the SoA absolute error  $|\delta v| = |v_{final} - v_{ICME}|$  and  $s_0$ . There is, however, a trend that CME with higher  $s_0$  have higher absolute values of ToA errors  $|\delta t|$ .

The trends observed here could arise from the following considerations: (i) as a CME moves away from the Sun, its brightness decreases in the HI-1 FOV and identifying its front becomes more ambiguous; (ii) errors associated to the ElCon assumptions about CME kinematics. As described in Section 2.5, we are assuming linear speed and fixed direction of propagation for each CME up to  $s_0$  when we are deriving its parameters using ElCon. After  $s_0$ , a free parameter for acceleration is included but the direction propagation is still assumed to be constant.

The last hypothesis for higher  $|\delta t|$  is also pointed out on Barnard et al. (2017). The authors observed unrealistic acceleration in regions close to the outer side of the HI-1 FOV, mainly after typical values of  $s_0$ . The same study also found unrealistic accelerations when other methods with constraints in the direction of propagation were used, such as harmonic mean and self-similar expansion. In this way, results from Barnard et al. (2017) seem to support hypothesis (ii) as the explanation for higher  $|\delta t|$  found is found in events with higher  $s_0$  studied here.

## 4 Conclusions

Starting with a list of 38 Earth-directed CMEs in 2010-2013 compiled by Sachdeva et al. (2017), we reduced it to 14 events by applying three rather strict criteria: simultaneous observations from both HI-1, clear CME-ICME identifications, and events separated in time to avoid CME-CME interactions. Our objective was to minimize as much as possible the errors in the measurements of the CME kinematics and ToA. The arrival time of all 14 events could be unambiguously determined from in-situ observation thanks to a discontinuity clearly observed in both magnetic field and solar wind plasma parameters.

We extracted the kinematics of the events using solely observations from HI-1 and extrapolated both their time-of- and their speed-on- arrival using a drag force model. The modeled CME speed at 1 *au* was typically higher than the observed ICME speed. This was the case for all events analyzed but one (#9). SoA absolute errors are higher than 200 *km/s*

for 5 events (#13, #26, #28, #29 and #34) and below 120  $km/s$  for the remaining 8 events. This suggests that either the actual initial CME speed was lower than what our measurements suggested or that the deceleration magnitude calculated using the drag-based model studied here was lower than the actual one. The latter seems to be a more likely explanation since excess SoA is a common result in many studies (Vourlidas et al., 2019).

The resulting ToA absolute errors are below 10 hours for 11 events rising to 12 hours when considering all 14 events. Our MAE compares favorably against past studies and is encouraging regarding our approach. However, the results are based on a small number of events and the methodology may not necessarily lead to lower ToA when applied to more CMEs. We plan to pursue this further by addressing the various issues we identified below.

Sources of ToA and SoA errors can arise in drag force calculation or in the presence of other unaccounted for forces, such as the Lorentz force. Another source of error may be the assumption of the elliptical conversion model used for the determination of the CME radial position from its elongation, such as fixed direction of propagation and constant speed. Finally, errors on the front identification arise towards the outer FOV of HI-1 as the CME front becomes fainter.

The drag force calculation at any point in the CME trajectory depends on the ambient solar wind density and speed. These conditions can change significantly during CME propagation and unfortunately in-situ observations were available only close to the Earth for the CMEs under study. In this study, both solar wind density and speed were extrapolated using empirical expressions. For this reason, the drag force should be understood as an approximation rather than a precise calculation. More realistic solar wind conditions derived using simulation are out of the scope of the present manuscript and could be part of a future study.

The amplitude of the drag force is stronger close to the Sun when compared to conditions close to the Earth. The reason is twofold: (i) the difference between the solar wind and the CME speeds and (ii) the density profile of the solar wind, which is higher close to the Sun (typically by one order of magnitude at 50 solar radii when compared to L1).

Deceleration was observed in all 14 events since all had initial speeds higher than the solar wind speed at the starting point of the drag force application. This deceleration is more intense close to the Sun, where the background solar wind speed is also lower. The

deceleration reaches values up to  $-3.25 \text{ m s}^{-2}$  close to the Sun and  $-0.5 \text{ m s}^{-2}$  close to the Earth.

Despite the difficulties to track CMEs in the HI-1 FOV due to the presence of the F-corona and reduced CME brightness, the results suggest that the ToA error is similar to many studies based on coronagraph observations, at least for the events discussed here.

The recently (2018) launched Parker Solar Probe (PSP) Mission (Fox et al., 2015) has an imager instrument with comparable elongation range to the HI-1 used. This imager is the Wide-field Imager for Solar PRobe (WISPR) (Vourlidas et al., 2016). Similar observations will also be performed by the Solar Orbiter Heliospheric Imager (SoloHI) (R. A. Howard et al., 2019), onboard the upcoming Solar Orbiter (SO) mission (Müller et al., 2013). In this sense, the present study, which relies only on observations from heliospheric imagers, can be used as a guideline for future studies with the PSP and SO targeted on CME ToA or SoA estimations. We hope the results of CME ToA errors estimated could motivate future studies with similar objectives using observations from WISPR and SoloHI.

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<https://lasco-www.nrl.navy.mil/index.php?p=content/retrieve/products>

The SOHO LASCO CME catalog is generated and maintained at the CDAW Data Center by NASA and The Catholic University of America in cooperation with the Naval Research Laboratory. This catalog is available at [https://cdaw.gsfc.nasa.gov/CME\\_list/](https://cdaw.gsfc.nasa.gov/CME_list/)

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Figure 1.



2011-06-14T20:09:01.004



2011-06-14T20:09:28.088

Figure 2.

**2010-3-19 to 2010-3-21**

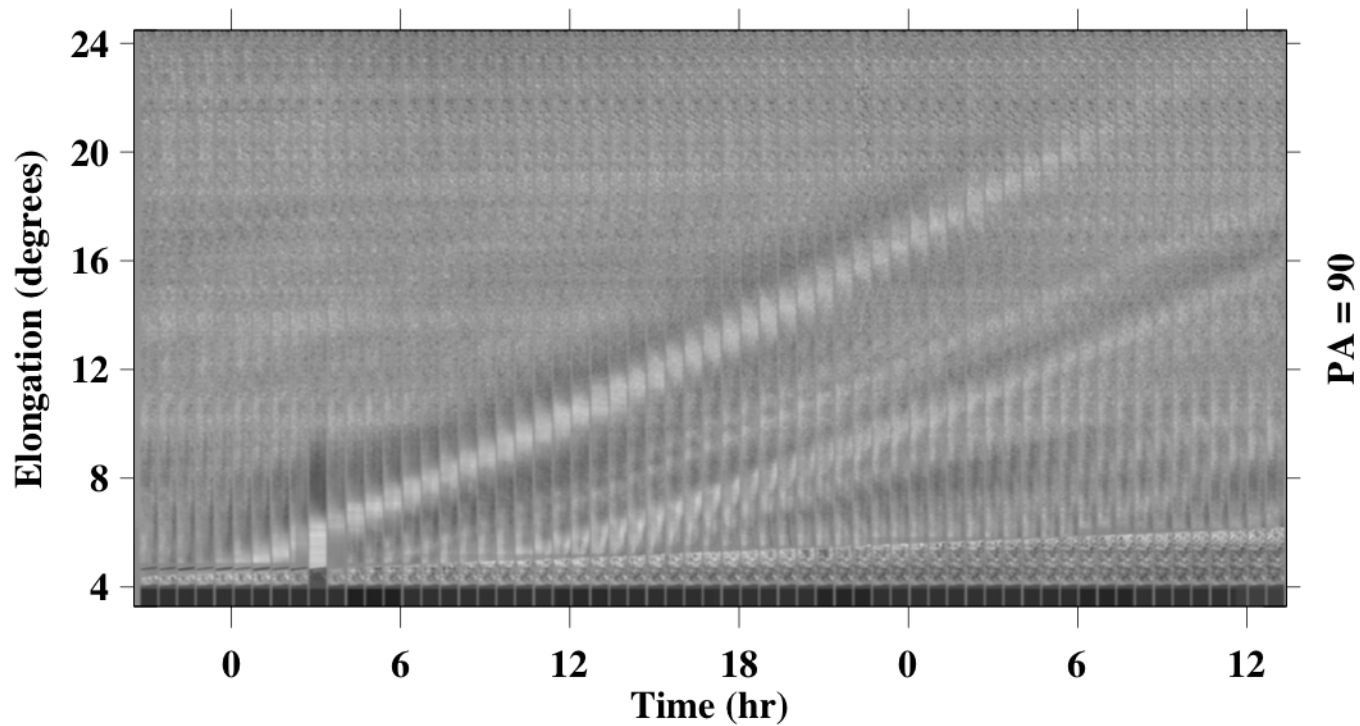
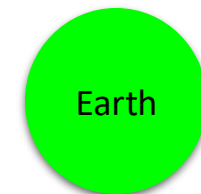




Figure 3.



Elongation versus time on HI FOV  
(both STEREO A and STEREO B)



Position, time, velocity and last  
time instance using the elliptical  
front model

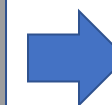
In situ observations at 1 AU:  
solar wind speed and density



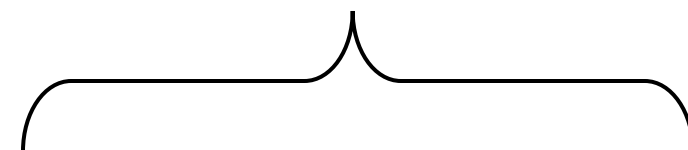
Solar wind density and velocity extrapolated to  
the entire CME propagation range



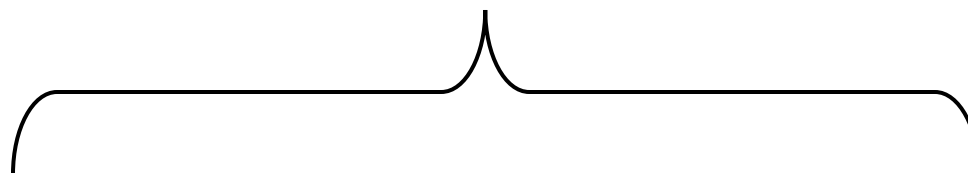
Drag coefficient calculated  
for each for each position



CME kinematic  
parameters  
(acceleration,  
speed) up to 1 AU



HI1 FOV until last position  
tracked



After the last position tracked on HI1

Figure 4.

STEREO B

STEREO A

Sun

Earth

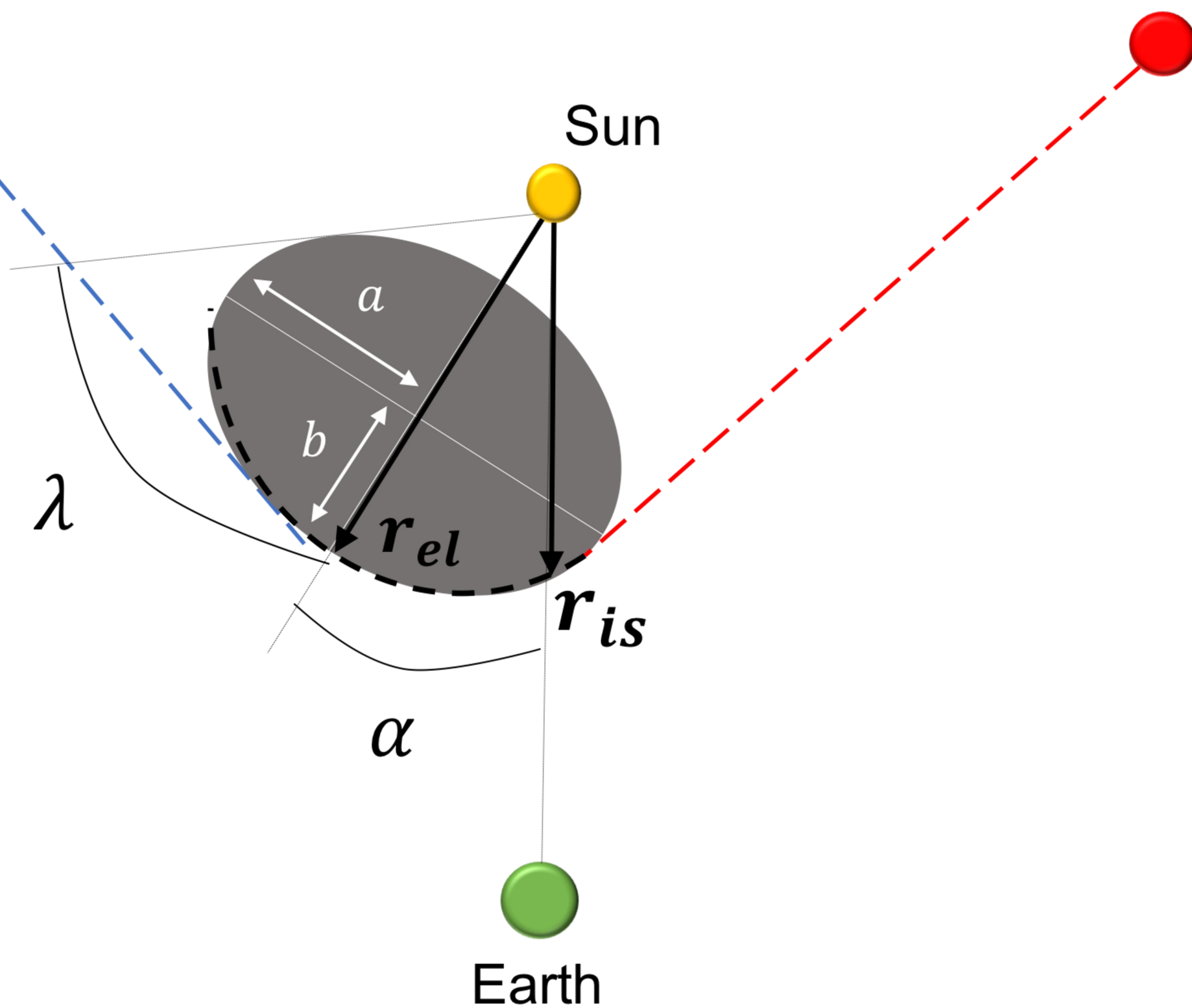


Figure 5.

ID: 27;  $tt_{\text{calc}}$ : 39 [40,38];  $tt_{\text{obse}}$ : 34

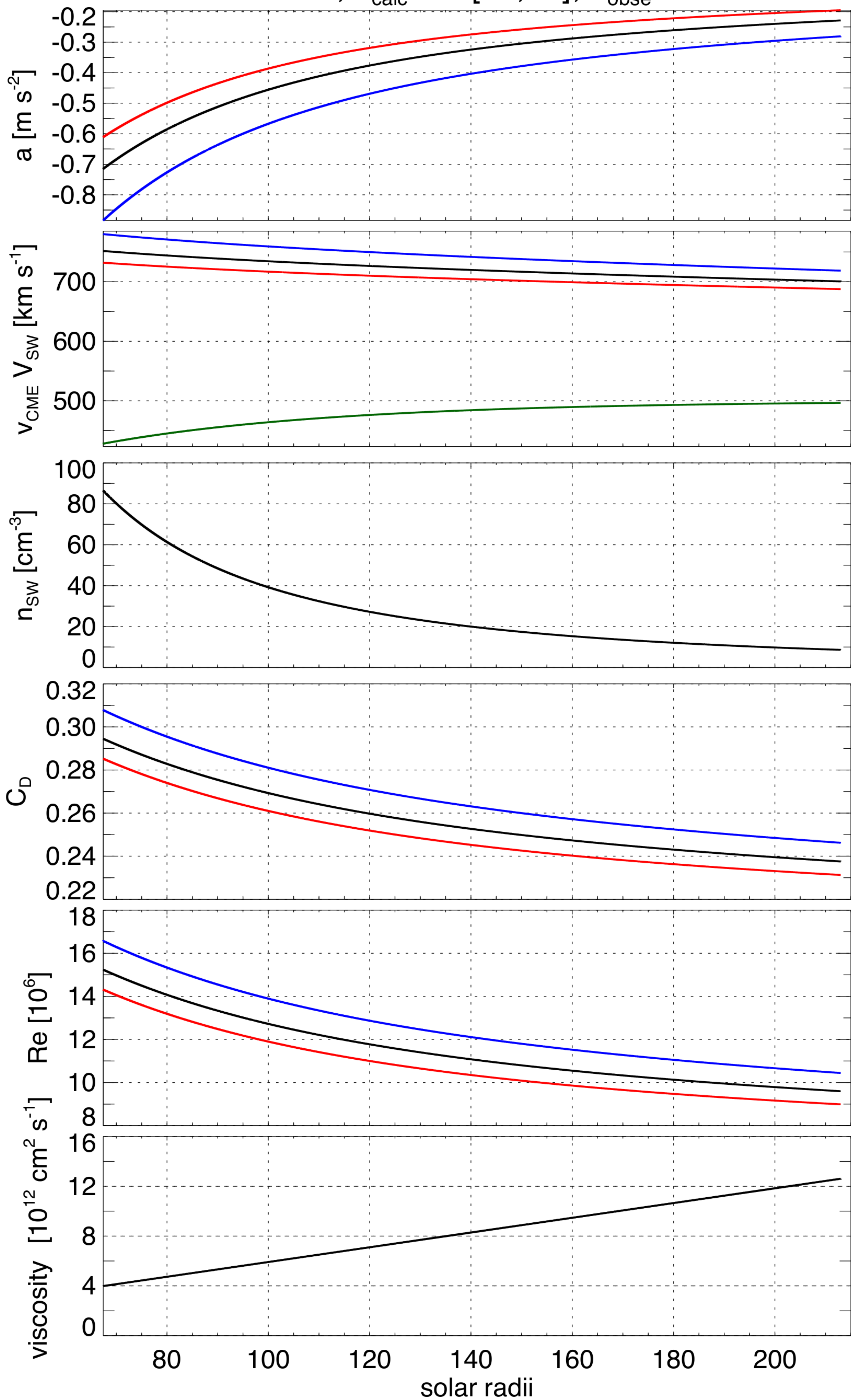
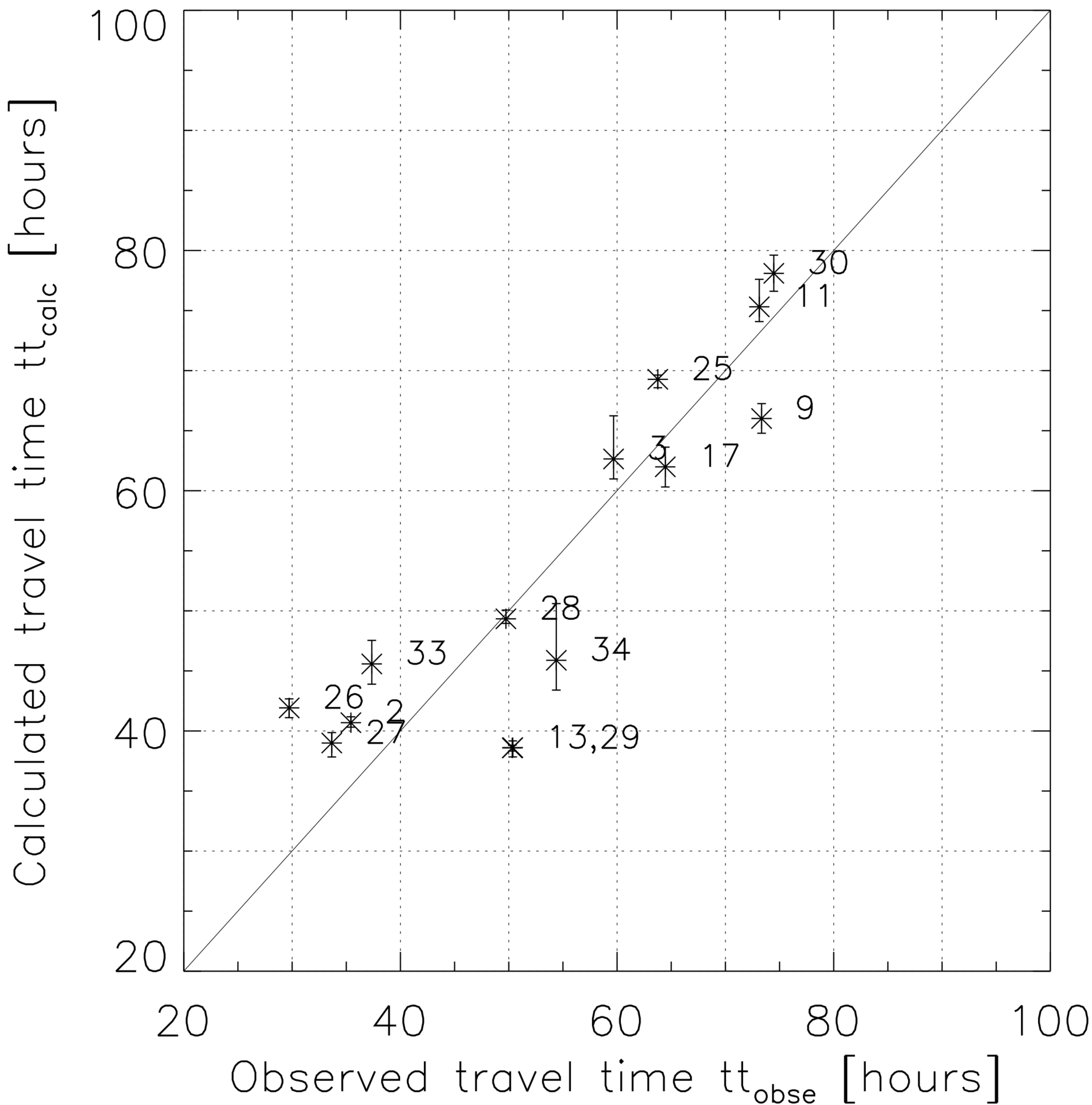


Figure 6.





**Figure 7.**

