

Prediction of shock arrival times from CME and flare data

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Abstract

This paper presents the Shock ARrival Model (SARM) for predicting shock arrival times for distances from 0.72 AU to 8.7 AU by using coronal mass ejections (CME) and flare data. SARM is an aerodynamic drag model described by a differential equation that has been calibrated with a dataset of 120 shocks observed from 1997 to 2010 by minimizing the mean absolute error (MAE), normalized to 1 AU. SARM should be used with CME data (radial, earthward or plane-of-sky speeds), and flare data (peak flux, duration, and location). In the case of 1 AU, the MAE and the median of absolute errors were 7.0 h and 5.0 h respectively, using the available CME/flare data. The best results for 1 AU (an MAE of 5.8 h) were obtained using both CME data, either radial or cone-model-estimated speeds, and flare data. For the prediction of shock arrivals at distances from 0.72 AU to 8.7 AU, the normalized MAE and the median were 7.1 h and 5.1 h respectively, using the available CME/flare data. SARM was also calibrated to be used with CME data alone or flare data alone, obtaining normalized MAE errors of 8.9 h and 8.6 h respectively for all shock events. The model verification was carried out with an additional dataset of 20 shocks observed from 2010 to 2012 with radial CME speeds to compare SARM with the empirical ESA model [Gopalswamy *et al.*, 2005a] and the numerical MHD-based ENLIL model [Odstroicil *et al.*, 2004]. The results show that the ENLIL's MAE was lower than the SARM's MAE, which was lower than the ESA's MAE. The SARM's best results were obtained when both flare and true CME speeds were used.

Key words: Space Weather / modeling / shock arrival time prediction

1. Introduction

One of the targets for space weather forecasters is to improve the interplanetary (IP) CME-driven shock time arrival predictions. CMEs often drive interplanetary (IP) shocks that impart the first pressure pulse on the magnetosphere resulting in sudden storm commencements [*Chao and Lepping, 1974*]. IP shocks are also drivers of high-energy solar energetic particle events, which can, for example, damage space-based equipment [*Miller et al., 2003; Wilson et al., 2005*], and interact with the Earth's atmosphere to produce penetrating neutrons that irradiate passengers and flight crews in commercial aircraft flying polar routes [*Beck et al., 2005*].

Several models have been proposed to predict shock arrival times, from empirical approaches, like the ESA (Empirical Shock Arrival) Model [*Gopalswamy et al., 2005a, 2013*], to numerical MHD-based models such as the WSA-ENLIL + Cone Model [*Odstrcil et al., 2004*], HAFv.3 model [*Fry et al., 2001, 2003; McKenna-Lawlor et al., 2006; Smith et al., 2009*], the STOA (Shock Time of Arrival) [*Dryer et al., 2004; Fry et al., 2001; McKenna-Lawlor et al., 2006; Zhao and Dryer, 2014*], and the Interplanetary Shock Propagation Model (ISPM) [*Smith and Dryer, 1990*]. The ESA and the ENLIL models will be used for comparison of the results later in the paper.

The use of flare data for predicting CME-related IP phenomena, such as shocks and related SEP events is a topic that has been debated and researched for decades [*Smith and Dryer, 1990; McKenna-Lawlor et al., 2006; Núñez, 2011, 2015; Liu and Qin, 2012*]. It is widely accepted that CMEs and flares are not causally related to each other; however, there is empirical evidence of a close relationship between flares and CMEs. *Yashiro and Gopalswamy* [2009] reported nearly a one-to-one correspondence between flares and CMEs, when energy fluence exceeds 0.1 J m^{-2} . *Jain et al.* [2010] showed that the speed of CMEs increases with the plasma temperature of X-ray flares, having a correlation coefficient $r = 0.82$. *Núñez* [2011] presented a SEP forecasting model, called UMASEP, that uses flare data to predict the occurrence of well-connected SEP events (obtaining a Probability of Detection (POD) of 90%), and the intensity of the prompt component of those well-connected events.

From a physical perspective, some studies have been carried out to obtain a broader view of the whole CME-flare eruption process. For example, *Chen et al.* [2010] analyzed the physical

connection between the acceleration of CMEs and associated flare energy release. They use the erupting flux rope model [*Chen and Garren, 1993; Krall et al., 2000*], in which the driver is a poloidal flux injection. They concluded that injection of poloidal flux produces an electromotive force around the flux rope that can accelerate particles to X-ray energies. In summary, *Chen et al. [2010]* hypothesized that the poloidal flux injection, driver of flux rope eruptions, is also related to X-ray signatures. This can explain why empirical relationships exist between flare manifestations and CME travel times (e.g., [*Caroubalos, 1964*]; *Pick and Vilmer [2008]*, and *Reeves and Moats [2010]* addressed this relationship quantitatively)

In this paper, we use the SARM model to predict IP shock arrival times from CME and/or flare data. We assume that the restraining IP force on CMEs is the aerodynamic drag caused by a lower-speed ambient solar wind [*Cargill, 2004; Vršnak et al., 2010*]. The main goal of this paper is to calibrate a formula that predicts the interplanetary shock speed from CME data (radial, cone-model-estimated or plane-of-sky speed) and/or flare data (duration, peak flux and location). We use the term IP shock speed to mean the physical speed of the shock discontinuity in the solar wind detected by spacecrafts. This study presents empirical evidence that IP shocks (directly driven by CMEs) are correlated with flares. There are important justifications for using a combination of CME and flare data in SARM: As noted above, flare and CME are physically related to the energy release process. Flare data are easy to obtain for real-time and historic data, radial CME-speed data are less readily available. For most of the multi-spacecraft observations we used to calibrate the SARM model, only plane-of-sky speeds were available. Since these speeds are rough earthward CME-speed approximations they are affected by projection effects.

Section 3.1 shows that the best shock arrival time prediction results were obtained with either radial or cone-model-estimated CME data, and flare data; however, satisfactory results were obtained using flare data alone. It is important to mention that due to the current low availability of radial CME speeds, the SARM model is being applied with flare data alone for the real-time prediction of shock arrival times as part of a larger model that predicts >10 MeV SEP event occurrence, peak flux and duration for the European Space Agency [*Garcia-Rigo et al., 2016*].

The SARM model has been calibrated with a dataset of 120 observations of shocks by an in-situ spacecraft from 1997 to 2010 from 0.72 to 8.7 AU. The shock arrival time prediction errors are presented in terms of mean absolute errors normalized to 1 AU, which are calculated as the mean

absolute error divided by the distance (in AUs) at which the shock was detected. Finally, in this paper, we have compared SARM with the empirical ESA model and the MHD-based ENLIL model using a dataset of 20 shocks analyzed in other studies [Taktakishvili *et al.*, 2009; Gopalswamy, 2013] by using radial CME speeds and/or flare data during the interval 2010-2012, and with/without the consideration of multi-CME complex shock events.

The paper is organized as follows: section 2 presents the empirical SARM model, and the approach used to calibrate its coefficients from a dataset of 120 shock events; section 3 presents the results, including the validation experiments with shock data that were not used in the calibration of the model; and, finally, section 4 presents the conclusions.

2. Shock arrival time prediction model

The Shock ARrival Model (SARM) that we present in this paper uses an equation of motion of a body under a drag force. A peculiarity of these problems is seen when the deceleration of the body is proportional to the square of its initial speed. For the case of the CME propagation, Cargil [2004] suggested that the drag force is $F_{drag} = -k A \rho (V_{CME} - V_{SW})^2$, where k is the solar wind-induced drag coefficient for the CME, A is the cross-sectional area of the CME, ρ is the ambient solar wind density, V_{CME} is the CME speed, and V_{SW} is the ambient solar wind speed.

Several authors [McKenna-Lawlor *et al.*, 2002; Zhao and Feng, 2014] concluded that solar wind speed measurements V_{SW} do not significantly improve the shock arrival predictions, and their use in shock models is less of an advantage than might at first appear. For the few benefits of using solar wind speed measurements V_{SW} , and for the sake of simplicity in the posterior calibration process, we decided to construct a drag-based model that does not take into account the solar wind speed. With the aim of building this model, we know that for these problems in which the drag force is $-kv^2$ [Conrad, 2002; Herman, 2013], the speed v of the body influenced by the drag force may be expressed with an exponential decrease that is a function of the distance x traveled from the initial location, and the drag coefficient k . Observational data [Wang *et al.*, 2001, 2003] show that CMEs with very high initial speeds have corresponding IP shock speeds at distances > 1 AU that decrease very slowly out to several tens of AU. Thus we assume that the IP shock speed decreases gradually to an *asymptotic* shock speed, V_a , whose value depends on CME and flare data. This speed V_a is a mathematical approximation that is necessary to simplify

the model and its calibration. Several multi-spacecraft studies have reported on shocks detected at 1 AU and later, at several AUs [Riley *et al.*, 2003; Gonzalez-Esparza *et al.*, 1998]. From these studies, one can conclude that: 1) the shock speeds at distances of ~8.7 AU associated with most of the high-speed CME events are notably greater than the average solar wind speed (e.g., see Figure 1), and 2) the speeds of the aforementioned shocks decreased very slowly in most of their time traveling to those distances.

To fit the observational data, we also adopt a simple mathematical model in which the shock speed has an exponential decrease until an asymptotic speed. We use observational data to calibrate the initial conditions, the drag coefficient, and the asymptotic speed of this model. Based on these approximations, the instantaneous IP shock speed (V_s) may be estimated as a function of the radial distance x from the sun, as:

$$V_s(x) = \frac{dx}{dt} = V_{cme_x} e^{-kx} + V_a \quad (1)$$

where x is the heliospheric distance from the sun to the IP shock, and V_{cme_x} is the component of the radial CME initial speed (V_{cme}), projected on the axis from the sun to the spacecraft for which the arrival time will be predicted. V_{cme_x} is calculated as $V_{cme} \cos(\alpha) \cos(\beta)$, where α and β are the longitude and latitude of the associated flare from the spacecraft's viewpoint. We assume that the shock's front propagates radially from the associated flare's location. The use of the location of the associated flare as the propagation direction of the IP shock is an approximation to simplify the model and its calibration.

In other words, V_{cme} is calculated along a vector that is normal to the solar flare site, and V_{cme_x} is calculated along a vector in a different direction (i.e., the sun-spacecraft axis). Therefore, we need to project the initial CME speed on the sun-spacecraft axis by using the cosine function, which is an approach adopted by Gopalswamy [2013] for estimating earthward CME speeds from STEREO-observations-based radial CME speeds. This is appropriate for keeping scalar SARM and ESA equations; all of the parameters in the equations are parallel vectors.

In order to properly use SARM, radial CME speeds should be used to calculate its component V_{cme_x} in the direction of the target goal (i.e., the location of the shock observation); however,

other CME speed types may be the only available data. Section 2.1 presents the used approach to calculate V_{cme_x} using plane-of-sky speeds without correction and with the cone-model-based correction [Xie *et al.*, 2004].

Note that equation (1) does not simulate the propagation speed of the CME; in fact, the CME speed is not used for any calculation, nor included in the calibration process. The differential equation (1) is used to simulate the shock displacements dx from the sun, to a distance x_T , where the spacecraft is located. SARM needs to solve the propagation formula described in equation (1) by using a numerical method (e.g., Runge Kutta 4th order) for iteratively simulating the shock location of every time step. The numerical solution calculates the instantaneous IP shock speed as a function of x , that is $dx/dt = f(x)$, where $f(x)$ is the differential equation (1), and where the initial conditions ($x = 0$ and $t = 0$) are also taken into account. This simulation may be summarized as follows: let us assume that at a time t_1 the shock is at a distance x_1 and propagates with a speed v_1 , calculated according to equation (1) for $x = x_1$. With the purpose of performing a simulation until the time $t_1 + dt$, the integration method uses v_1 and dt to calculate the shock-traveled distance dx_1 . The simulation of the next time step dt takes into account the new shock location (i.e., $x_1 + dx_1$), and the new IP shock speed, say v_2 , calculated at the new location by using equation (1). The simulation process continues until $x = x_T$, that is, until the shock reaches the target distance. Therefore the simulated time t at x_T will be the SARM's predicted arrival time at the target location.

Figure 1 illustrates the design strategy of SARM in terms of an MHD-simulated shock speed profile (red curve) and the SARM's target shock speed profile (blue curve) for the case of the Bastille Day CME-driven shock on July 14th, 2000. The MHD-simulated profile was derived from the results obtained by *Von Steiger & Richardson* [2006] from 1 AU to 63 AU using a 2.5-D MHD numerical model. The speeds for intermediate distances show a decrease in the CME deceleration to an observed shock speed at 63 AU of 460 km s^{-1} . The deceleration is higher during the first hours of the CME expansion throughout the heliosphere, while the deceleration is very low at distances $> 1 \text{ AU}$. With the aim of predicting a similar behavior, the SARM's target shock speed profile assumes an asymptotic shock speed, V_a , that is proportional to the released energy of the associated solar event. The initial CME speed and the peak flux and duration of the

associated flare are well-documented manifestations of the released energy. For this reason V_a is derived from CME and flare data. The rest of section 2 explains the calibration approach of SARM (including how the drag coefficient k , as well as the formula to calculate V_a from CME and flare data, were empirically found).

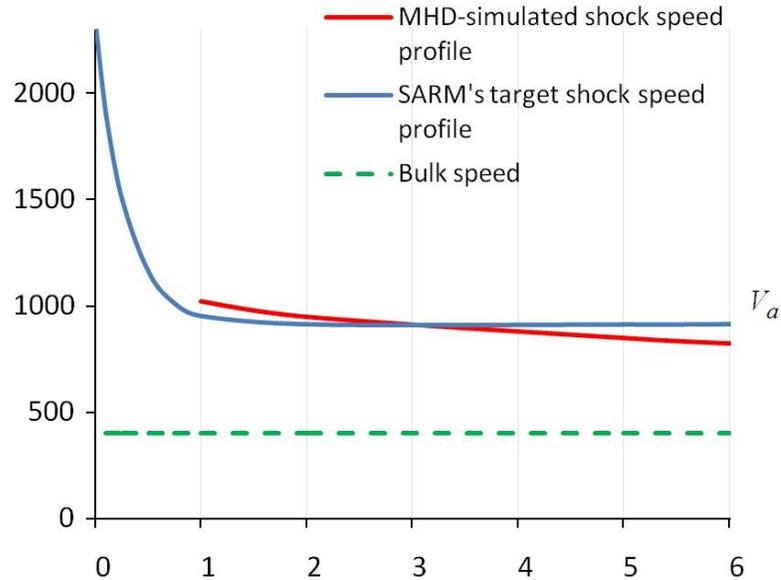


Figure 1. This figure illustrates the design strategy of the SARM model. The solid red curve shows an MHD-simulated shock speed profile as a function of distance (AU) from the sun to 6 AU for the case of the Bastille Day CME-driven shock on July 14th, 2000. This profile was derived from the results obtained by *Von Steiger & Richardson* [2006], using a 2.5-D MHD numerical model [Wang *et al.*, 2001; Wang and Richardson, 2003]. The green dashed line shows the mean solar wind speed, which is approximately 400 km s^{-1} according to several authors [Fleishman and Toptygin, 2013]. The blue curve shows the SARM's target shock speed profile: the IP shock speed decreases due to the solar-wind induced drag on its driver (i.e. the CME) until it reaches an asymptotic speed V_a , which is calculated from the initial CME speed and the peak flux and duration of the associated flare.

2.1. Empirical approximation of V_{cme_x} from radial and non-radial CME speeds

The procedure to estimate the CME speed component V_{cme_x} depends on the target location of the spacecraft (e.g., Mars) for which the arrival time is going to be predicted, as well as the available CME data (radial, cone-model-estimated or plane-of-sky speeds). In general, we may say that if the CME speed in the direction of the spacecraft is not known, an estimate of the

radial CME speed V_{cme} is needed to project it onto the direction from the Sun to the spacecraft, located at Earth or elsewhere in the solar system.

If we know the radial CME speed (i.e., V_{cme}), V_{cme_x} is V_{cme} projected on the sun-spacecraft axis; that is, $V_{cme_x} = V_{cme} \cos(\alpha) * \cos(\beta)$, where α is the longitudinal distance between the flare location and the spacecraft location and β is the latitudinal distance between the flare location and the spacecraft location. To predict shock arrival times at Earth, α and β are the associated flare's longitude and latitude. To make predictions for another place in the solar system, α is calculated as $\alpha' - \Delta\alpha$, where α' is the flare's longitude from the earth's point of view, and $\Delta\alpha$ is the heliocentric longitudinal distance between the earth and the spacecraft. β is calculated the same way in terms of latitudes. The longitudinal distance between the earth and the spacecraft is well-documented data for shock events observed at long distances.

In those cases for which the earthward speed V_{cme_E} is known (e.g., by using the Cone model approach), we use it to calculate V_{cme_x} depending on the case. To predict shock arrival times at Earth, $V_{cme_x} = V_{cme_E}$. To make predictions for another place in the solar system, V_{cme_E} is deprojected to make an estimation of the radial speed; that is, $V_{cme} = V_{cme_E} / (\cos(\alpha') \cos(\beta'))$, where α' and β' are the flare's longitude and latitude from the earth's point of view. Then, the radial speed is projected onto the direction from the Sun to the spacecraft, by using the approach mentioned in the previous paragraph.

In those shock events for which plane-of-sky CME speed (V_{POS}) is the only available information, we need to infer the earthward speed, V_{cme_E} , *Michalek et al.* [2003] reported that actual earthward speeds are 20% higher than plane-of-sky speeds. We used their finding as a first approximation of a statistical conversion factor: $V_{cme_E} = 1.2 V_{POS}$. After completing SARM's calibration process (explained in section 2.3), we empirically confirmed *Michalek et al's* finding. Taking advantage of the use of a larger dataset, we refined the statistical conversion factor to $V_{cme_E} = 1.26 V_{POS}$, by minimizing the arrival time prediction errors. To predict shock arrival times at Earth, $V_{cme_x} = V_{cme_E}$. To make predictions for another place in the solar system, V_{cme_E} is deprojected to make an estimation of the radial speed, which is projected onto the direction from the Sun to the spacecraft, by using the approach mentioned in the previous paragraphs.

It is important to say that, while not very accurate, radial and cone-model estimated CME speeds are estimations that are closer to true values; for this reason, in this paper, we say that they are *true* speeds. In section 3, we study the effect on the accuracy of shock arrival time predictions by using true and plane-of-sky speeds (see Figure 5).

2.2. SARM calibration steps

The SARM calibration process uses equation (1) with interplanetary shock arrival times and solar associations in Table 1 to carry out an iterative data-driven three-step analysis to determine the coefficients that minimizes the mean absolute error (MAE), normalized to 1 AU. The calibration process finally leads to equation (2). Table 1 presents the shock events that were used to calibrate SARM. It shows the observed IP shocks and the reported solar associations (i.e., CME and/or flare data) of 120 shocks observed from 1997 to 2010 at distances from 0.72 to 8.7 AU.

Table 1. List of shock events observed from 0.72 to 8.7 AU. The last column includes the references of the studies that investigated the shocks' solar associations and IP observations from spacecraft data, including ACE, IMP, Stereo, Mars Global Surveyor, Ulysses, and Cassini. ^a

Event	Shock				Shock's associated CME						Shock's Associated Flare						
	Dist (AU)	Shock Time (UTC)	Transit Time (h)	Long Distance (deg)	V _{cme} ^b (km/s)	V _{cme} ^c Axis (km/s)	V _{pos} ^d (km/s)	Relative direction ^e		CME time (UTC)	Location	Class	Start	Peak	end	s/c ^f	Ref ^g
								Lat (deg)	Long (deg)								
Event1	0.72	8/2/10 11:30	27.7	-53.2	1284			20	19.18	8/1/10 7:50	N19E34	C3.2	7:55	8:26	9:35	5	23, 15
Event2	0.72	8/1/10 14:41	54.2	-53.2	619			20	-4.8	7/30/10 8:30						5	23, 15
Event3	1	1/10/97 0:52	81.7	0			136	-18	-6	1/6/97 15:10						6	9, 10
Event4	1	2/9/97 12:40	60.2	0			490	-20	4	2/7/97 0:30						6	9, 10
Event5	1	4/10/97 12:55	70.5	0		790		-30	-19	4/7/97 14:27	S30E19	C6.8	13:50	14:07	14:19	6	24
Event6	1	4/10/97 12:58	70.5	0			830	-30	-19	4/7/97 14:27	S30E19	C6.8	13:50	14:07	14:19	6	24, 17, 18
Event7	1	5/15/97 1:15	66.8	0			464	21	19	5/12/97 6:30	N21W19	C1.3	4:42	4:55	5:26	6	9, 10
Event8	1	11/6/97 22:18	64.1	0			785	-14	33	11/4/97 6:10	S14W33	X2.1	5:52	5:58	6:02	6	9, 10, 11, 17
Event9	1	11/22/97 9:10	68.7	0			150	-17	12	11/19/97 12:27						6	9, 10
Event10	1	11/30/97 7:14	65.3	0			441	20	60	11/27/97 13:57	N20W60	X2.6	12:59	13:17	13:20	6	17, 18
Event11	1	12/30/97 1:15	94.7	0			197	24	-14	12/26/97 2:31						6	9, 10
Event12	1	1/6/98 13:30	86.0	0			438	47	3	1/2/98 23:28						6	9, 10
Event13	1	3/4/98 11:05	94.3	0			176	-24	1	2/28/98 12:48						6	9, 10, 16
Event14	1	5/1/98 21:00	52.0	0		1448		-18	-20	4/29/98 16:58	S18E20	M6.8	16:06	16:37	16:59	6	24
Event15	1	5/1/98 21:20	52.4	0			1374	-18	-20	4/29/98 16:58	S18E20	M6.8	16:06	16:37	16:59	6	9, 10
Event16	1	5/4/98 6:00	39.9	0	1418			11	18	5/2/98 14:06						7	25
Event17	1	10/18/98 19:28	81.4	0			262	22	1	10/15/98 10:04						6	9, 10
Event18	1	11/8/98 4:20	55.3	0			1124	18	21	11/5/98 20:59	N18W21	M8.4	19:00	19:55	20:12	6	24, 17, 18
Event19	1	11/8/98 4:42	55.7	0		1230		18	21	11/5/98 20:58	N18W21	M8.4	19:00	19:55	20:12	6	9, 10, 24
Event20	1	2/11/99 8:58	51.4	0			808	-25	24	2/9/99 5:33	S25W24	C2.3	4:54	5:08	5:31	6	17, 18
Event21	1	3/10/99 0:38	41.7	0			664	-22	-76	3/8/99 6:54						7	17, 18
Event22	1	4/16/99 11:10	68.5	0			291	16	0	4/13/99 3:30						6	9, 10
Event23	1	7/2/99 0:25	66.5	0			589	18	7	6/29/99 5:54	N18W07	M1.4	5:01	5:10	5:17	7	17, 18
Event24	1	7/2/99 0:25	64.9	0		771		18	7	6/29/99 7:31	N18W07	M1.4	5:01	5:10	5:17	6	24
Event25	1	7/13/99 8:45	55.2	0			318	13	-32	7/11/99 1:31						7	17, 18
Event26	1	7/22/99 9:50	78.7	0			430	12	16	7/19/99 3:06	N12W16	C4.2	1:49	2:53	2:53	7	17, 18
Event27	1	8/8/99 17:50	107.4	0			405	16	64	8/4/99 6:26	N16W64	M6	5:45	5:57	6:14	7	18
Event28	1	8/23/99 11:30	60.1	0			812	-25	-64	8/20/99 23:26	S25E64	M9.8	23:01	23:10	23:17	7	17, 18
Event29	1	8/31/99 1:31	55.1	0			462	-26	14	8/28/99 18:26	S26W14	X1.1	17:52	18:05	18:18	7	17, 18
Event30	1	9/2/99 9:35	72.8	0			404	18	16	8/30/99 8:50						7	17, 18
Event31	1	9/15/99 20:05	50.6	0			444	15	17	9/13/99 17:31						6	17, 18
Event32	1	2/11/00 2:33	65.0	0		1089		25	-26	2/8/00 9:30	N25E26	M1.3	8:42	9:00	9:18	6	24
Event33	1	2/11/00 21:28	49.6	0		954		31	-4	2/9/00 19:54						6	24

Table 1 (Cont.)

Event	Shock				Shock's associated CME						Shock's Associated Flare						
	Dist (AU)	Shock Time (UTC)	Transit Time (h)	Long Distance (deg)	Vcme ^b (km/s)	Vcme ^c Axis (km/s)	V _{Pos} ^d (km/s)	Relative direction ^e		CME time (UTC)	Location	Class	Start	Peak	end	s/c ^f	Ref ^g
								Lat (deg)	Long (deg)								
Event34	1	2/11/00 23:18	44.8	0			944	31	-4	2/10/00 2:30						7	17, 18
Event35	1	2/14/00 6:56	50.4	0			1107	26	23	2/12/00 4:31	N26W23	M1.7	3:51	4:10	4:31	7	17, 18
Event36	1	2/20/00 20:50	71.3	0			550	-29	-7	2/17/00 21:30	S29E07	M1.3	20:17	20:35	21:07	6	9, 10, 11
Event37	1	2/20/00 21:00	71.5	0		719		n/a	n/a	2/17/00 21:30	n/a	M1.3	20:17		21:07	6	24
Event38	1	4/7/00 1:00	56.5	0	2038			16	66	4/4/00 16:32	N16W66	C9.7	15:12	15:41	16:05	7	25
Event39	1	5/2/00 10:44	49.8	0			540	-11	18	4/30/00 8:54						7	17, 18
Event40	1	6/8/00 8:40	40.8	0			1119	33	-25	6/6/00 15:54	N33E25	X2.3	14:58	15:25	15:40	7	11, 17, 18
Event41	1	6/8/00 9:04	41.2	0		1282		33	-25	6/6/00 15:54	N33E25	X2.3	14:58	15:25	15:40	6	24
Event42	1	6/18/00 17:02	68.9	0			1081	20	65	6/15/00 20:06						7	17, 18
Event43	1	7/13/00 9:18	59.5	0			1352	18	-49	7/10/00 21:50	N18E49	M5.7	21:05	21:42	22:27	7	17, 18
Event44	1	7/14/00 15:32	43.0	0			820	17	65	7/12/00 20:30						7	17
Event45	1	7/14/00 15:39	74.2	0			1078	18	-27	7/11/00 13:27						6	9, 10,
Event46	1	7/15/00 14:18	27.4	0			1674	18	27	7/14/00 10:54	N18W27	X5.7	10:03	10:24	10:43	6	9, 10, 11, 12
Event47	1	7/16/00 1:00	38.1	0	1686			22	25	7/14/00 10:54						7	25
Event48	1	7/28/00 5:41	74.2	0			528	6	3	7/25/00 3:30	N06W03	M8	2:43	2:49	2:54	7	17, 18
Event49	1	8/11/00 18:51	50.3	0			702	11	11	8/9/00 16:30	N11W11	C2.3	15:19	16:22	17:00	6	9, 10
Event50	1	8/12/00 10:00	65.5	0	960			11	11	8/9/00 16:30	N11W11	C2.3	15:19	16:22	17:00	7	25
Event51	1	9/6/00 16:12	117.3	0			411	10	60	9/1/00 18:54	N10W60	C9.1	18:05	18:20	18:30	7	17, 18
Event52	1	9/17/00 16:57	35.6	0			1215	14	7	9/16/00 5:18	N14W07	M5.9	4:06	4:26	4:48	7	18
Event53	1	9/17/00 17:00	35.7	0		1327		14	7	9/16/00 5:18	N14W07	M5.9	4:06	4:26	4:48	6	24
Event54	1	9/18/00 0:00	42.7	0	1493			14	7	9/16/00 5:18	N14W07	M5.9	4:06	4:26	4:48	7	25
Event55	1	10/3/00 1:05	55.0	0			703	-20	-42	9/30/00 18:06	S20E42	M1	17:38	18:27	19:05	6	9, 10
Event56	1	10/12/00 21:44	69.9	0			798	1	14	10/9/00 23:50	N01W14	C6.7	23:19	23:43	0:21	6	9, 10, 16, 17
Event57	1	11/6/00 9:20	62.9	0			291	2	2	11/3/00 18:26	N02W02	C3.2	18:35	19:02	20:06	6	9, 10
Event58	1	3/19/01 11:37	79.8	0			271	11	9	3/16/01 3:50						6	9, 10
Event59	1	3/31/01 9:00	46.6	0	913			20	19	3/29/01 10:26	N20W19	X1.7	9:57	10:15	10:32	7	25
Event60	1	4/11/01 13:40	45.8	0			1192	-21	4	4/9/01 15:54	S21W04	M7.9	15:20	15:34	16:00	8	1
Event61	1	4/11/01 14:06	46.2	0		1210		-21	4	4/9/01 15:54	S21W04	M7.9	15:20	15:34	16:00	6	24
Event62	1	4/12/01 0:00	42.5	0	1260			9	-52	4/10/01 5:30	N09E52	X2.3	5:06	5:26	5:42	7	25
Event63	1	4/21/01 15:31	51.0	0			392	20	20	4/19/01 12:30						6	9, 10
Event64	1	4/28/01 5:02	40.5	0		1003		17	31	4/26/01 12:30	N17W31	M7.8	11:26	13:12	13:19	6	24
Event65	1	4/28/01 5:06	40.6	0			1006	17	31	4/26/01 12:30	N17W31	M7.8	11:26	13:12	13:19	6	9, 10
Event66	1	5/27/01 14:52	58.8	0			569	-9	4	5/25/01 4:06						6	9, 10
Event67	1	9/25/01 20:18	33.8	0		1773		-16	-23	9/24/01 10:30	S16E23	X2.6	9:32	10:38	11:09	6	24
Event68	1	9/25/01 20:45	34.3	0			2402	-16	-23	9/24/01 10:30	S16E23	X2.6	9:32	10:38	11:09	8	1
Event69	1	10/21/01 22:00	53.2	0	1452			15	29	10/19/01 16:50	N15W29	X1.6	16:13	16:30	16:43	7	25
Event70	1	10/31/01 13:47	50.0	0			598	12	-25	10/29/01 11:50	N12E25	M3.6	10:56	11:13	11:19	6	9, 10

Table 1 (Cont.)

Event	Shock				Shock's associated CME						Shock's Associated Flare						
	Dist (AU)	Shock Time (UTC)	Transit Time (h)	Long Distance (deg)	Vcme ^b (km/s)	Vcme ^c Axis (km/s)	V _{Pos} ^d (km/s)	Relative direction ^e		CME time (UTC)	Location	Class	Start	Peak	end	s/c ^f	Ref ^g
								Lat (deg)	Long (deg)								
Event71	1	11/6/01 7:00	38.4	0	1999			38	6	11/4/01 16:35	N38W06	X1	16:03	16:03	16:57	7	25
Event72	1	11/19/01 18:15	60.8	0			1379	-13	-42	11/17/01 5:30	S13E42	M2.8	4:49	5:25	6:11	8	1
Event73	1	11/24/01 4:52	29.4	0		1551		n/a	n/a	11/22/01 23:30	n/a	M9.9	22:32		0:06	6	24
Event74	1	11/24/01 5:50	30.3	0			1437	-17	36	11/22/01 23:30	S17W36	M9.9	22:32	23:30	0:06	6	9, 10
Event75	1	11/24/01 17:00	41.5	0	2809			-17	36	11/22/01 23:30	S17W36	M9.9	22:32	23:30	0:06	7	25
Event76	1	3/18/02 12:33	61.5	0			907	-8	3	3/15/02 23:06						6	9, 10
Event77	1	3/23/02 10:47	58.9	0			1049	-19	60	3/20/02 23:54	S19W60	C5.7	23:46	0:23	0:46	6	9, 10
Event78	1	4/19/02 8:00	47.6	0			1231	-14	1	4/17/02 8:26						6	9, 10
Event79	1	5/18/02 19:50	67.0	0			600	-22	-14	5/16/02 0:50						6	9, 10
Event80	1	5/18/02 19:51	67.0	0		870		-22	-14	5/16/02 0:50						6	24
Event81	1	5/23/02 18:00	38.2	0	1957			-30	34	5/22/02 3:50						7	25
Event82	1	5/29/03 19:10	45.1	0			1122	-7	17	5/27/03 22:06	S07W17	X1.3	22:56	23:07	23:13	8	1
Event83	1	5/29/03 19:10	42.3	0			964	-7	20	5/28/03 0:50	S07W20	X3.6	0:17	0:27	0:39	8	1
Event84	1	5/30/03 16:20	38.9	0			1366	-6	37	5/29/03 1:27	S06W37	X1.2	0:51	1:05	1:12	8	1
Event85	1	10/29/03 6:00	18.5	0		2752		-16	-8	10/28/03 11:30	S16E08	X17.2	9:51	11:10	11:24	6	24
Event86	1	10/29/03 6:10	18.7	0			2459	-16	-8	10/28/03 11:30	S16E08	X17.2	9:51	11:10	11:24	8	1
Event87	1	10/30/03 1:00	37.5	0	2868			-16	-8	10/28/03 11:30	S16E08	X17.2	9:51	11:10	11:24	7	25
Event88	1	10/30/03 20:00	23.1	0			2029	-15	2	10/29/03 20:54	S15W02	X10	20:37	20:49	21:01	8	1
Event89	1	10/30/03 23:00	26.1	0	1872			19	30	10/29/03 20:54	N19W30	X10	20:37	20:49	21:01	7	25
Event90	1	11/20/03 8:25	47.6	0			1660	0	-18	11/18/03 8:50	N00E18	M3.9	8:12	8:31	8:59	8	1
Event91	1	11/20/03 21:00	60.2	0	1215			0	11.8	11/18/03 8:50	N00W12	M3.9	8:12	8:31	8:59	7	25
Event92	1	7/27/04 14:00	47.1	0	1289			8	33	7/25/04 14:54	N08W33	M1.1	14:19	15:14	16:43	7	25
Event93	1	11/8/04 7:00	52.9	0	1525			7	0	11/6/04 2:06	N07W00	M3.6	1:40	1:57	2:08	7	25
Event94	1	9/11/05 11:00	39.2	0	1903			-10	-58	9/9/05 19:48	S10E58	X6.2	19:13	20:04	20:36	7	25
Event95	1	4/5/10 7:58	46.9	0	1011			n/a	n/a	4/3/10 9:05	-					6	13
Event96	1	4/5/10 9:00	39.7	0	1071			n/a	n/a	4/3/10 17:16						9	26
Event97	1	5/29/10 22:00	56.3	0	600			n/a	n/a	5/27/10 13:39						9	26
Event98	1	6/3/10 9:00	55.3	0	760			n/a	n/a	6/1/10 1:40						9	26
Event99	1	8/3/10 5:00	45.2	-71.3	1284			19	-34	8/1/10 7:50	N19E34	C3.2	7:55	8:26	9:35	5	15
Event100	1	8/17/10 18:00	79.8	78.57	600			17	52	8/14/10 10:12	N17W52	C4.4	9:38	9:20	10:31	5	16
Event101	1.38	11/20/01 3:35	70.1	-55.9			1379	-13	13.94	11/17/01 5:30	N13E42	M2.8	4:49	5:25	6:11	4	1
Event102	1.4	10/30/03 5:30	42.0	-21.5			2459	-16	13.47	10/28/03 11:30	N16E08	X17.2	9:51	11:10	11:24	4	1
Event103	1.4	10/31/03 11:30	38.6	-21.9			2029	19	30	10/29/03 20:54	S05W02	X10	20:37	20:49	21:01	4	1
Event104	1.43	12/31/01 18:00	69.5	-72.3	2216			-24	-17.7	12/28/01 20:30	N50E90	X3.4	20:02	20:45	21:32	4	1
Event105	1.43	11/21/03 4:50	68.0	-29.8			1660	0	11.83	11/18/03 8:50	N00E18	M3.9	8:12	8:31	8:59	4	1
Event106	1.43	5/31/03 3:45	50.3	31.35			1237	-6	5.65	5/29/03 1:27	S06W37	X1.2	0:51	1:05	1:12	4	1
Event107	1.44	9/25/01 19:55	33.4	-36.5			2402	-16	13.45	9/24/01 10:30	S16E23	X2.6	9:32	10:38	11:09	4	1

Table 1. (Cont)

Event	Shock				Shock's associated CME						Shock's Associated Flare						
	Dist (AU)	Shock Time (UTC)	Transit Time (h)	Long Distance (deg)	Vcme ^a (km/s)	Vcme _E ^c Axis (km/s)	V _{POS} ^d (km/s)	Relative direction ^e		CME time (UTC)	Location	Class	Start	Peak	end	s/c ^f	Ref ^g
								Lat (deg)	Long (deg)								
Event108	1.44	5/29/03 23:20	47.5	32.1			964	-7	-15.1	5/27/03 23:50	S07W17	X1.3	22:56	23:07	23:13	4	1
Event109	1.44	5/29/03 23:20	46.5	31.72			1366	-7	-11.7	5/28/03 0:50	S07W20	X3.6	0:17	0:27	0:39	4	1
Event110	1.53	4/19/01 3:35	85.5	26.15	1199			20	58.85	4/15/01 14:06	S20W85	X14.4	13:19	13:50	13:55	4	1
Event111	1.57	4/12/01 11:00	53.5	29.02			2411	9	-52	4/10/01 5:30	N09E23	X2.3	5:06	5:26	5:42	4	1
Event112	1.57	4/12/01 11:00	67.1	29.02			1192	-21	-25	4/9/01 15:54	S21W04	M7.9	15:20	15:54	16:00	4	1
Event113	1.58	3/9/89 20:15	78.0	-72	1260			35	3	3/6/89 14:15	N35E69	X15	13:50	14:05	14:40	3	2
Event114	5	3/2/99 0:00	332.8	0			n/a	22	14	n/a	S23W14	M3.2	2:49	3:12	3:45	2	3, 20
Event115	5.24	11/13/03 16:19	212.4	100	2657			-34	-17	11/4/03 19:54	S19W83	X17.4	19:29	19:53	20:06	1	4
Event116	5.24	11/15/03 0:03	176.2	100	2237			0	-10	11/7/03 15:54						1	4
Event117	5.3	1/26/05 17:00	154.1	29		3675		-17	32	1/20/05 6:54	N14W61	X7.1	6:36	7:01	7:26	2	21, 5
Event118	5.4	3/23/98 21:30	560.7	5.5			176	-3	-3.5	2/28/98 12:48						2	7
Event119	6.6	12/7/01 12:00	348.5	21			1437	15	13	11/22/01 23:30	S15W34	M9.9	22:32	0:06	0:06	1	19
Event120	8.7	11/10/03 0:00	174.5	60			2981	-14.4	-1	11/2/03 17:30	S18W59	X8.3	17:03			1	4

a This table presents the 120 shocks observed from 1997 to 2010, at distances from 0.72 to 8.7 AU, that were used to calibrate SARM. The following columns also present the reported solar associations. Column 1 lists the identifiers of the shocks. Columns 2-4 contain the shock data: column 2 presents the distances at which shocks were detected, column 3, the shock arrival time, and column 4, the IP shock transit time. Column 5 lists the heliocentric longitudinal distance in degrees between Earth and the spacecraft. Columns 6-11 present data from the CME associated with the corresponding shock: the radial CME speed V_{cme} (if available) is listed in column 6; the cone-model-based earthward CME speed V_{cme_E} (if available), using the *Xie et al.* [2004]'s approach, is listed in column 7; if neither V_{cme} or V_{cme_E} is available, column 8 lists plane-of-sky speed from in the Catalog of CME events observed by the Large Angle and Spectrometric Coronagraph Experiment (LASCO) instrument in the Solar and Heliospheric Observatory (SOHO) Catalog (linear speed); columns 9 and 10 present the shock propagation direction in terms of the longitude and latitude of the associated solar event from the spacecraft's point of view; the first time of CME detection by LASCO is listed in column 11. Columns 12-16 present X-ray-related data from the flare associated with the corresponding shock; the location in column 12, the flare peak flux in column 13, the peak start, time and end time are listed in columns 14, 15, and 16, respectively, according to the NOAA/SWPC's edited event list (i.e., <http://legacy-www.swpc.noaa.gov/ftppdir/indices/events/events.txt>). Finally, column 17 contains the bibliographic references from where each shock event, and its corresponding CME and flare associations, was taken.

b V_{cme} is the radial CME speed.

c V_{cme_E} is the earthward CME speed obtained by using the cone-model approach explained in *Xie et al.* [2004].

d V_{POS} is the linear speed in the SOHO/LASCO catalog (http://cdaw.gsfc.nasa.gov/CME_list).

e Columns 9 and 10 list the shock propagation direction from the target spacecraft's point of view. See Section 2.1 about the approach used to calculate the values of this column.

f Spacecraft or interplanetary shock database: 1: Cassini; 2: Ulysses; 3: Phobos-2; 4: Mars Global Surveyor; 5: Stereo A/B; 6: WIND; 7: ACE; 8: NASA's OMNI-DB; 9: NASA's DONKI-DB.

g Bibliographic references: 1: [*Falkenberg, et al., 2011*]; 2: [*Aran et al., 2007*]; 3: [*Riley et al., 2003*]; 4: [*Jian, 2008*]; 5: [*Lepri et al., 2012*]; 6: [*Richardson et al., 2006*]; 7: [*Skoug et al., 2000*]; 9: [*Gopalswamy et al., 2005a*]; 10: http://lepmpi.gsfc.nasa.gov/mfi/mag_cloud_pub1p.html; 11: [*McKenna-L. et al., 2002*]; 12: [*Burlaga et al., 2001*]; 13: [*Xie et al., 2013*]; 15: [*Möstl et al., 2012*]; 16: [*Steed et al., 2010*]; 17: [*Fry et al., 2003*]; 18: [*Cho et al., 2003*]; 19: [*Lario et al., 2004*]; 20: [*Lario et al., 2001*]; 21: [*Gopalswamy et al., 2005b*]; 23: [*Webb et al., 2013*]; 24: [*Xie et al., 2006*]; 25: [*Taktakishvili et al., 2011*]; 26: <http://kauai.ccmc.gsfc.nasa.gov/DONKI/>.

The strategy of the SARM's calibration approach is to get first estimates of the speed V_a in Eq. 1 by using shocks observed at distances > 1 AU, and then, starting from these, refine the estimate of all parameters in Eq. 1 by using all shocks in Table 1.

The overall idea is that: at distances > 1 AU, V_a can be approximated by the distance Sun-observer divided by the observed travel time (i.e., the IP shock transit speed); therefore, the purpose of the first two calibration steps is to obtain an approximate predictor of the speed V_a from CME data alone and from flare data alone at distances > 1 AU. To this end, this approach uses coronagraphic measurements of CME speeds (explained in detail in Section S.1) and a proxy inferred from soft X-ray observations (explained in Section S.2). In the last calibration step (explained in detail in Section S.3), we found that the mean value of the two CME speeds (i.e., the observed CME speed and the X-ray-inferred proxy) is most appropriate, with the further advantage that a CME speed can be guessed even when the data coverage is incomplete. Starting from these first guesses of V_a , all 120 shocks in Table 1 (from 0.72 to 8.9 AU) are used to encounter the drag coefficient k and refine V_a . During the last calibration step, full numerical simulations are undertaken, from the sun to the observed IP shock's distance, to calibrate the coefficients of equation (1) by minimizing the mean absolute error of arrival time predictions, normalized to 1 AU.

In summary, section S describes the details of the coarse-to-fine optimization process approach used to transform equation (1) into equation (2), which presents the resulting formula for calculating the instantaneous IP shock speed:

$$\frac{dx}{dt} = V_{driver_x} e^{-7x} + 0.42 V_{driver_x} + 330 \text{ km s}^{-1} \quad (2)$$

where:

- x is the heliospheric distance (in AUs) from the sun to the IP shock
- V_{driver_x} is the *Average* (V_{cme_x} , saV_{cme_x}) in km s^{-1} . That is, if no flare data are available, $V_{driver_x} = V_{cme_x}$; if no CME data are available, $V_{driver_x} = saV_{cme_x}$
- V_{cme_x} is the radial CME speed V_{cme} projected on the sun-spacecraft axis; that is, $V_{cme_x} = V_{cme} \cos(\alpha) * \cos(\beta)$, where α and β are the longitude and latitude of the associated flare from the

spacecraft's viewpoint. If radial CME speed is not available, the cone-model speed V_{cme_E} may be used; that is, $V_{cme_x} = V_{cme_E}$. For more information about how to obtain V_{cme_x} , see section 2.1.

- saV_{cme} is calculated as $1015 \log_{10}(PF_{swpc} \times FD_{swpc}) + 5500$, where PF_{swpc} and FD_{swpc} are the flare peak flux and the flare duration, using the NOAA/SWPC data. This empirical formula is introduced in this paper (see section S.2 for details about how this log-linear equation was obtained).

2.3. SARM's triggering conditions for issuing shock arrival time predictions

If SARM issues a forecast for each CME or flare occurrence, it will generate a high number of false alarms; therefore, SARM has to filter out some forecasts to maximize the number of issued forecasts and minimize the mean absolute error. We realized that the angular distance between the locations of the solar event and the spacecraft is an important CME geometry-oriented triggering condition. We also realized that a minimum CME speed is an important triggering condition of forecasts that are only based on CME data; and a minimum flare peak flux is another important triggering condition of forecasts that are only based on flare data.

We empirically found the following three forecast triggering rules, which were used in section 3 as necessary conditions to trigger forecasts: the minimum speed of V_{cme_x} to issue a CME-related shock forecast is 330 km s^{-1} ; the minimum flare peak flux to issue an X-ray-related shock forecast is C4; and, the maximum Euclidean angular distance ω between the flare and the spacecraft locations is 60 degrees, where ω is calculated as the square root of the sum of the squares of the longitudinal distance and the latitudinal distance between the aforementioned locations.

As we mentioned in section 2, the asymptotic shock speed V_a is calculated in terms of CME and flare data. Thus, equation (2) shows that the term V_a is calculated as $0.42 V_{driver_x} + 330$ (i.e., the non-exponential summand in equation (2)), where V_{driver_x} is a function of CME and flare data. That is, V_a is estimated as the sum of two terms: the fixed term 330 km s^{-1} , and the V_{driver} -dependant term. If the minimum speed of V_{cme_x} to trigger a SARM prediction is 330 km s^{-1} (as we mentioned in the previous paragraph), and there are no flare data, V_{driver_x} is also 330 km s^{-1} ; therefore, the asymptotic shock

speed V_a for the minimum-speed CME is 468.6 km s^{-1} (i.e., $0.42 \times 330 + 330$), which is larger than mean solar wind speed, as it should be.

A web-based version of SARM that uses equation (2) to make shock arrival time forecasts is available in <http://spaceweather.uma.es/sarm/index.html>

3. Results and arguments

The calibration data includes the shock data from Table 1 (i.e., from 1997 to 2010), describing solar situations that are very diverse; therefore, section 3.1 includes the analysis of the prediction results with calibration data in order to give a better idea of the model's expected strengths and weaknesses; and section 3.2 includes the validation results with shock data that were not used in the model's calibration.

3.1. Analysis of prediction results with calibration data

Table 2 presents the SARM's predicted shock transit times for the events of Table 1. The last three columns show the normalized prediction errors (i.e. observed transit time - predicted transit time) for the 120 shocks, by using CME and/or flare data. Note that some of the predictions are not issued, because the properties of the associated solar event do not fulfill the SARM's triggering conditions explained in section 2.3. The last three columns are the main reference for presenting the analysis of the results in Figures 2 to 5. As shown in this table, the use of CME and flare data obtained a normalized mean absolute error of 7.1 h for all the events in Table 1 that meet SARM's triggering conditions, which is better than the mean absolute errors of the individual models, by using data from the CME alone (8.9 h), or by using flare data alone (8.6 h).

Figure 2 shows the distribution of the errors listed in the last column of Table 2 (i.e., normalized errors of SARM's predictions from CME and flare data) for all shocks of Table 1 (top chart) and for shocks at 1 AU (bottom chart). For both figures, the most frequent interval is $[-2.5 \text{ h}, 2.5 \text{ h}]$. Regarding normalized absolute errors, Figure 2a shows that the mean, median and standard deviation are 7.1 h, 5.1 h and 6.0 h, respectively. Figure 2b shows that the mean, median and standard deviation are 7.0 h, 5.0 h and 6.3 h, respectively. Although the performance of SARM's predictions for 1 AU is similar to the performance for all the analyzed distances, a closer analysis of the error performance as a function of the distance (see Figure 3) shows that there are important differences in the performance of SARM's shock arrival predictions for different distances, taking into account shock events in Table 1.

Table 2. Model's input data for each shock and its forecast error with flare and/or CME data (normalized to 1 AU) ^a

Event	SARM's outputs									
	Shock		Predicted Shock Travel Times					Normalized prediction error		
	Distance AU	V_{cme_x} km/s	saV_{cme_x} kms ⁻¹	Average V_{cme_x} & saV_{cme_x} kms ⁻¹	With CME Data Only hours	With Flare Data Only hours	With CME & Flare Data hours	With CME Data Only hours	With Flare Data Only hours	With CME & Flare Data hours
Event1	0.7	1140		1140	32.1		32.1	-4.42	c	-4.42
Event2	0.7	580		580	41.9		41.9	12.30	c	12.30
Event3	1.0	171		171				B	c	b, c
Event4	1.0	617		617	63.5		63.5	-3.31	c	-3.31
Event5	1.0	790	350	570	55.9	86.1	67.7	14.57	-15.60	2.77
Event6	1.0	1046	350	698	47.6	86.1	61.1	22.97	-15.55	9.39
Event7	1.0	585		585	65.2		65.2	1.57	c	1.57
Event8	1.0	989	977	983	49.2	55.7	52.2	14.98	8.46	11.91
Event9	1.0	189		189				b	c	b, c
Event10	1.0	556	1398	977					d	d
Event11	1.0	248		248				b	c	b, c
Event12	1.0	552		552	67.0		67.0	19.06	c	19.06
Event13	1.0	222		222				b	c	b, c
Event14	1.0	1448	1215	1332	38.5	46.4	42.1	13.55	5.60	9.95
Event15	1.0	1731	1215	1473	34.0	46.4	39.2	18.42	5.94	13.14
Event16	1.0	1325		1325	40.9		40.9	-0.97	c	-0.97
Event17	1.0	330		330	82.2		82.2	-0.75	c	-0.75
Event18	1.0	1416	1444	1430	39.1	41.8	40.4	16.27	13.58	14.97
Event19	1.0	1230	1444	1337	42.9	41.8	42.3	12.81	13.96	13.40
Event20	1.0	1018		1018	48.3		48.3	3.10	c	3.10
Event21	1.0	837		837					c	d
Event22	1.0	367		367	79.2		79.2	0.47	c	0.47
Event23	1.0	742	350	546	57.8	82.2	67.8	8.70	-15.63	-1.30
Event24	1.0	771	350	561	56.6	82.2	67.0	8.27	-17.25	-2.12
Event25	1.0	401		401	76.6		76.6	-21.39	c	-21.39
Event26	1.0	542	350	446	67.5	82.2	74.1	11.20	-3.50	4.60
Event27	1.0	510	894	702					d	d
Event28	1.0	1023	848	936					d	d
Event29	1.0	582	1113	848	65.3	49.7	56.4	-10.20	5.38	-1.32
Event30	1.0	509		509	69.4		69.4	3.35	c	3.35
Event31	1.0	559		559	66.5		66.5	-15.96	c	-15.96
Event32	1.0	1089	350	720	46.4	86.3	60.2	18.70	-21.20	4.83
Event33	1.0	954		954	50.2		50.2	-0.65	c	-0.65
Event34	1.0	1189		1189	43.9		43.9	0.95	c	0.95
Event35	1.0	1395	480	937	39.5	76.9	52.1	10.92	-26.50	-1.70
Event36	1.0	693	460	577	59.9	76.6	67.3	11.43	-5.29	4.08
Event37	1.0	719	460	590	58.8	76.6	66.5	12.72	-5.12	4.97
Event38	1.0	791	357	574					d	d
Event39	1.0	680		680	60.5		60.5	-10.65	c	-10.65
Event40	1.0	1410	1650	1530	39.2	42.6	40.8	1.55	-1.78	-0.03
Event41	1.0	1282	1650	1466	41.8	42.6	42.2	-0.60	-1.38	-0.98
Event42	1.0	1362		1362					c	d
Event43	1.0	1704	1330	1517	34.4	54.6	42.2	25.12	4.89	17.32
Event44	1.0	1033		1033					c	d
Event45	1.0	1358		1358	40.2		40.2	34.00	c	34.00
Event46	1.0	2109	2028	2069	29.4	34.2	31.6	-1.95	-6.75	-4.17
Event47	1.0	1415		1415	39.1		39.1	-1.00	c	-1.00
Event48	1.0	665	594	630	61.2	64.9	63.0	13.00	9.26	11.20

Table 2 (cont.)

Event	SARM's outputs									
	Shock		Predicted Shock Travel Times					Normalized prediction error		
	Distance AU	V_{cme_x} km/s	saV_{cme_x} kms ⁻¹	Average V_{cme_x} & saV_{cme_x} kms ⁻¹	With CME & Flare			With CME & Flare		
					With CME Data Only hours	With Flare Data Only Hours	With CME & Flare Data hours	With CME Data Only hours	With Flare Data Only hours	With CME & Flare Data Hours
Event49	1.0	885		885	52.5		52.5	-2.15	c	-2.15
Event50	1.0	926		926	51.1		51.1	14.37	c	14.37
Event51	1.0	518	350	434					d	d
Event52	1.0	1531	1050	1291	37.1	48.5	42.0	-1.40	-12.83	-6.35
Event53	1.0	1327	1050	1189	40.8	48.5	44.3	-5.12	-12.78	-8.63
Event54	1.0	1439	1050	1245	38.7	48.5	43.0	4.03	-5.78	-0.32
Event55	1.0	886	589	737	52.5	76.0	62.0	2.51	-20.99	-7.04
Event56	1.0	1005	350	678	48.7	81.4	60.9	21.22	-11.48	9.05
Event57	1.0	367		367	79.2		79.2	-16.30	c	-16.30
Event58	1.0	341		341	81.2		81.2	-1.44	c	-1.44
Event59	1.0	811	1436	1124	55.1	41.9	47.6	-8.53	4.67	-1.00
Event60	1.0	1502	1157	1330	37.6	46.6	41.6	8.22	-0.85	4.17
Event61	1.0	1210	1157	1184	43.4	46.6	45.0	2.83	-0.42	1.25
Event62	1.0	773	2597	1685	56.6	36.1	44.0	-14.10	6.45	-1.52
Event63	1.0	494		494	70.4		70.4	-19.35	c	-19.35
Event64	1.0	1003	1610	1306	48.8	41.0	44.5	-8.22	-0.45	-4.00
Event65	1.0	1268	1610	1439	42.1	41.0	41.5	-1.48	-0.38	-0.93
Event66	1.0	717		717	58.9		58.9	-0.13	c	-0.13
Event67	1.0	1773	2073	1923	33.4	32.6	33.0	0.43	1.25	0.85
Event68	1.0	3027	2073	2550	22.1	32.6	26.3	12.17	1.70	7.93
Event69	1.0	1228	1342	1285	43.0	45.2	44.1	10.19	7.97	9.10
Event70	1.0	753	567	660	57.4	69.8	63.0	-7.42	-19.80	-13.00
Event71	1.0	1574	1394	1484	36.3	46.2	40.7	2.09	-7.73	-2.25
Event72	1.0	1738	1017	1377	33.9	58.0	42.8	26.88	2.73	18.00
Event73	1.0	1551	1633	1592	36.7	42.2	39.3	-7.33	-12.83	-9.90
Event74	1.0	1811	1633	1722	32.9	42.2	37.0	-2.55	-11.87	-6.62
Event75	1.0	2172	1633	1903	28.7	42.2	34.2	12.80	-0.70	7.35
Event76	1.0	1143		1143	45.0		45.0	16.45	c	16.45
Event77	1.0	1322	350	836					d	d
Event78	1.0	1551		1551	36.7		36.7	10.87	c	10.87
Event79	1.0	756		756	57.2		57.2	9.77	c	9.77
Event80	1.0	870		870	53.0		53.0	14.05	c	14.05
Event81	1.0	1388		1388	39.6		39.6	-1.46	c	-1.46
Event82	1.0	1414	1000	1207	39.1	50.4	44.1	5.94	-5.31	1.02
Event83	1.0	1215	1562	1389	43.3	38.3	40.6	-0.94	4.03	1.70
Event84	1.0	1721	1058	1389	34.1	53.9	41.8	4.78	-15.04	-2.89
Event85	1.0	2752	2883	2817	23.9	23.9	23.9	-5.35	-5.38	-5.37
Event86	1.0	3098	2883	2990	21.7	23.9	22.7	-2.98	-5.21	-4.05
Event87	1.0	2732	2883	2808	24.0	23.9	23.9	13.52	13.62	13.57
Event88	1.0	2557	2051	2304	25.3	30.8	27.8	-2.18	-7.67	-4.65
Event89	1.0	1531	2051	1791	37.0	34.7	35.9	-10.93	-8.63	-9.75
Event90	1.0	2092	917	1504	29.5	52.9	37.9	18.05	-5.29	9.70
Event91	1.0	1190	917	1054	43.9	52.0	47.6	16.32	8.15	12.60
Event92	1.0	1074	853	963	46.8	59.2	52.2	0.32	-12.07	-5.12
Event93	1.0	1514	654	1084	37.4	62.0	46.6	15.55	-9.08	6.33
Event94	1.0	1003	2387	1695	48.8	42.3	45.3	-9.57	-3.08	-6.10
Event95	1.0	917		917	51.4		51.4	-4.52	c	-4.52
Event96	1.0	892		892	52.2		52.2	-12.49	c	-12.49
Event97	1.0	588		588	65.0		65.0	-8.67	c	-8.67

Table 2 (cont.)

Event	SARM's outputs									
	Shock		Predicted Shock Travel Times					Normalized prediction error		
	Distance	V_{cme_x}	saV_{cme_x}	Average V_{cme_x} & saV_{cme_x}	With CME	With Flare	With CME &	With CME	With Flare	With CME &
AU	km/s	kms ⁻¹	kms ⁻¹	Data Only	Data Only	Flare Data	Data Only	Data Only	Flare Data	
				hours	Hours	hours	hours	hours	hours	hours
Event98	1.0	732		732	52.4		52.4	-2.94	c	-2.94
Event99	1.0	957		957	40.2		40.2	-5.00	c	-5.00
Event100	1.0	528	350	439	90.7	74.8	83.6	10.89	-5.03	3.82
Event101	1.4	2271	1017	1644	48.4	71.1	56.6	21.68	-1.05	13.52
Event102	1.4	3045	2883	2964	35.0	37.3	36.1	7.04	4.69	5.93
Event103	1.4	2101	2051	2076	41.8	47.2	44.3	-3.18	-8.58	-5.66
Event104	1.4	1929	2158	2044	53.6	54.1	53.8	15.94	15.40	15.68
Event105	1.4	2154	917	1535	50.6	74.2	59.1	17.42	-6.23	8.94
Event106	1.4	1943	1058	1500	47.8	64.5	54.4	2.49	-14.19	-4.14
Event107	1.4	3200	2073	2637	32.3	42.8	36.5	0.72	-9.35	-3.12
Event108	1.4	1227	1000	1113	59.1	66.3	62.4	-11.60	-18.80	-14.91
Event109	1.4	1794	1562	1678	48.6	52.9	50.6	-2.14	-6.38	-4.14
Event110	1.5	573	2391	1482					d	d
Event111	1.6	2048	2597	2322	51.5	57.3	54.1	2.03	-3.84	-0.62
Event112	1.6	1363	1157	1260	66.7	76.2	71.0	0.40	-9.06	-3.86
Event113	1.6	1035	2553	1794	78.9	59.7	67.0	-0.86	18.30	10.99
Event114	5.0	n/a	907	907		327.2	327.2		5.59	5.59
Event115	5.2	2105	2486	2296	205.3	207.3	206.1	7.16	5.10	6.32
Event116	5.2	2204		2204	174.9		174.9	1.28	c	1.28
Event117	5.3	4532	2224	3378	146.0	162.4	149.6	8.07	-8.25	4.46
Event118	5.4	242		242				B	c	b, c
Event119	6.6	2130	1633	1882	329.0	337.5	332.8	19.51	10.98	15.74
Event120	8.7	3753	2148	2950	175.9	188.5	180.8	-1.41	-13.98	-6.27

^a This table lists the normalized mean absolute errors of the SARM's predictions by using the CME and flare data. Column 1 shows the identifiers of the events. Column 2 presents the distance at which the shock was detected. Columns 3, 4 and 5 list the used V_{cme_x} , saV_{cme_x} and the average (V_{cme_x} , saV_{cme_x}), respectively. Columns 6, 7 and 8 present the prediction by using the speeds listed in columns 3-5, and columns 7-9 show the normalized absolute errors (i.e., absolute error / distance in AU) of the predictions using CME data only (column 9), flare data only (column 10) and both CME and flare data (column 11).

^b Prediction using CME and flare data was filtered out because the Euclidean angular distance between the flare and the spacecraft locations is greater than 60°.

^c Prediction using CME data only was filtered out because CME initial speed is lower than 330 km s⁻¹.

^d Prediction using flare data only was filtered out because the associated flare peak flux is < C4 or no flare data is available.

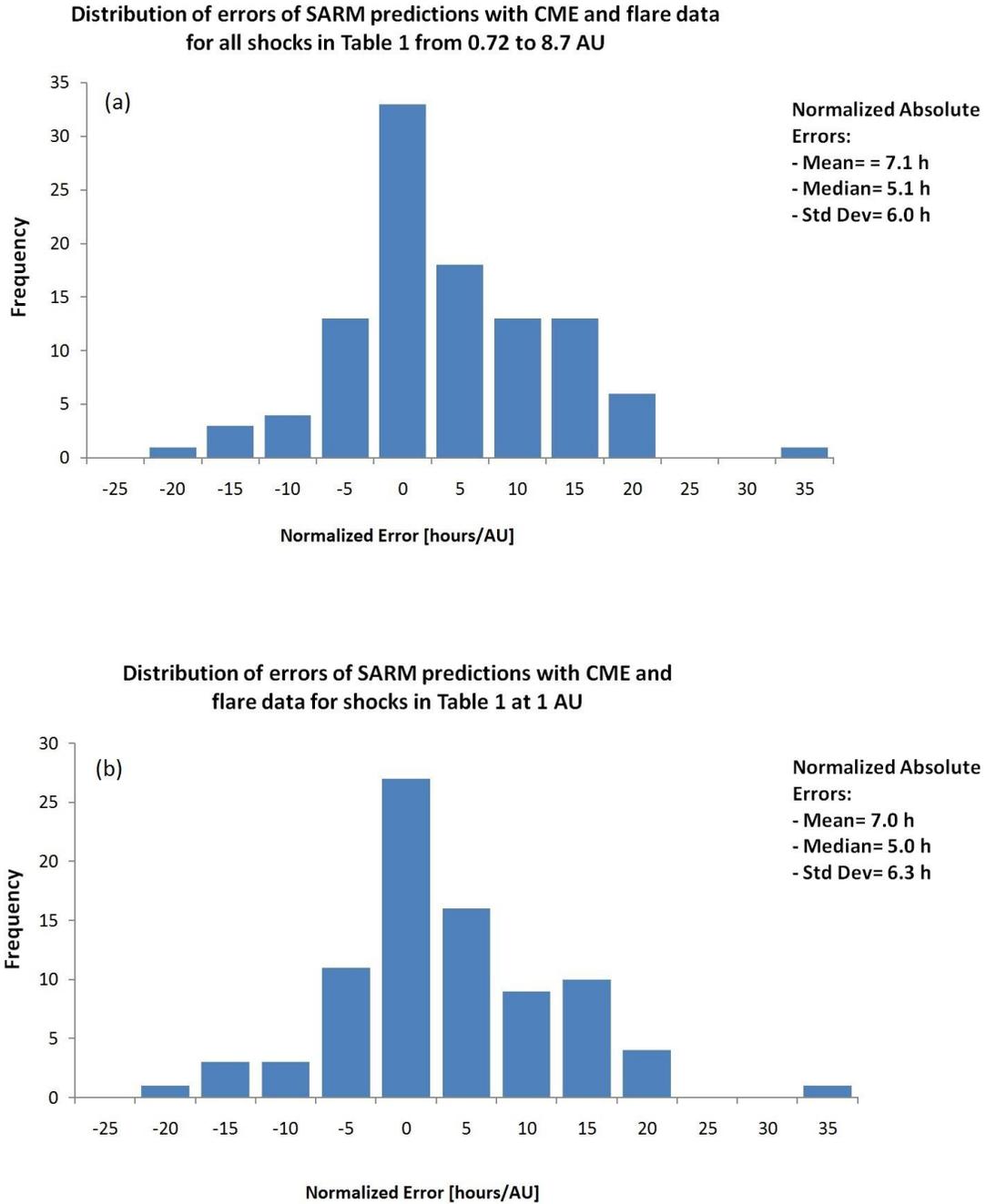


Figure 2 shows the distribution of errors of SARM predictions using CME and flare data. These errors were extracted from the results presented in Table 2. The top chart shows the distribution of errors for all shocks in Table 1 from 0.72 AU to 8.7 AU. The top chart also shows that the mean, median and standard deviation of normalized absolute errors are 7.1 h, 5.1 h, and 6.0 h, respectively. The bottom chart shows the distribution of errors for shocks at 1 AU. The bottom chart also shows that the mean, median and standard deviation of the normalized absolute errors for 1 AU are 7.0 h, 5.0 h, and 6.3 h, respectively. For both figures, the most frequent interval of errors is [-2.5 h, 2.5 h].

Figure 3 shows the normalized mean absolute errors for five groups of distances (i.e., 0.72 AU, 1 AU, 1.4-1.6 AU and 5.0-5.4 AU and 6.6-8.7 AU) from predictions using CME and/or flare data. It can be seen that the error averages using CME and flare data are less than 8.5 h, except for large distances 6.6-8.7 AU. The best normalized mean absolute error was obtained from predictions of shock arrival times for distances in the interval 5.0-5.4 AU, which was 4.5 h. In the case of 1 AU, the normalized mean absolute error is 7.0 h using both flare and CME data; if only CME speeds are used, the MAE was 9.2 h; and if only flare data are used, the MAE was 8.4 h.

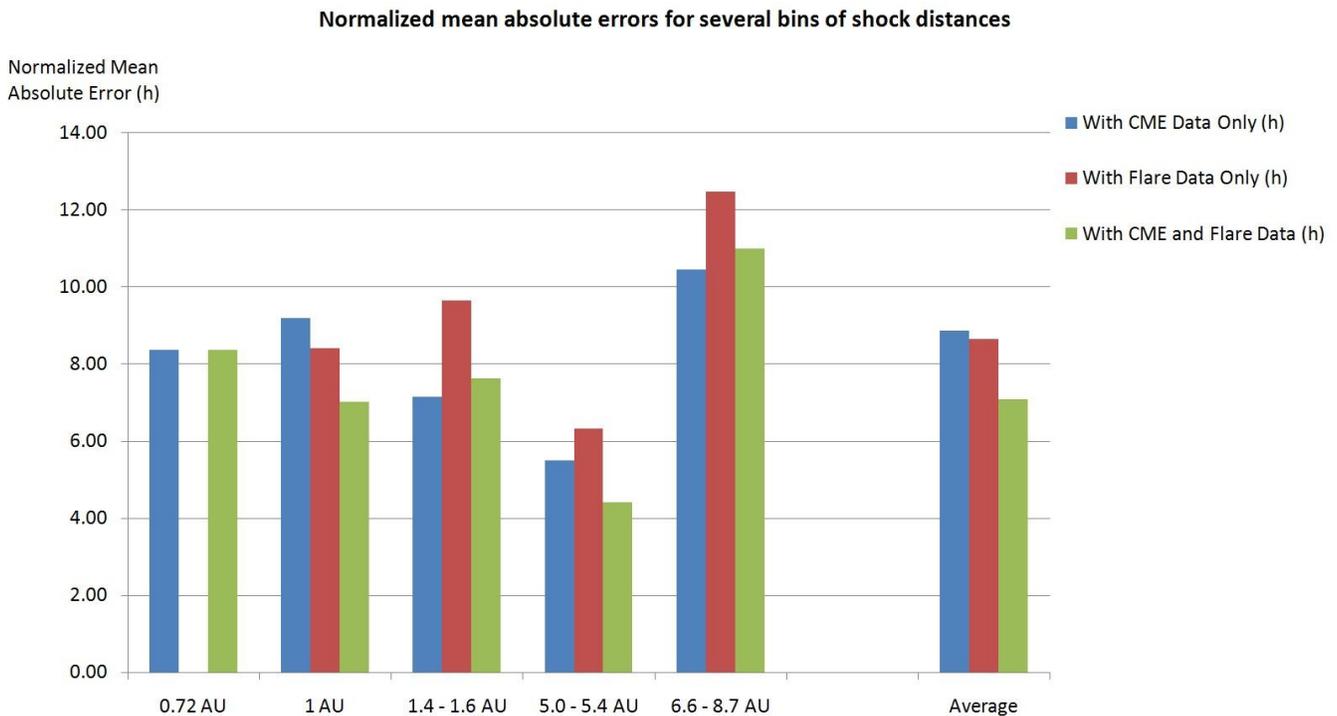


Figure 3. Distribution of normalized mean absolute errors for several groups of shock distances from CME and/or flare data. Blue, red and green bars show the normalized mean absolute errors using CME data only, flare data only, and both CME and flare data, respectively. Regarding the use of both CME and flare data, the least normalized mean absolute error was obtained from predictions of shock arrival times for distances in the interval 5 AU-5.4 AU, which was 4.5 h; the highest normalized mean absolute error was obtained from predictions for distances in the interval 6.6-8.7 AU, which was 11.0 h.

Figure 4 shows the forecasting error for those cases where flares were used. It presents the normalized mean absolute errors for several ranges of flare peak flux. It can be seen that SARM's forecasts using CME & flare data (green bars) are better when shocks are associated with >M4 flares. It is interesting to see that the SARM propagation model is also good for predicting the arrival time from CME data only

when the shocks are associated with $>M4$ flares. Section 3.2, obtained a similar conclusion with validation experiments that use the earthward speed calculated from radial speeds.

Mean absolute error as a function of the associated flare's peak flux

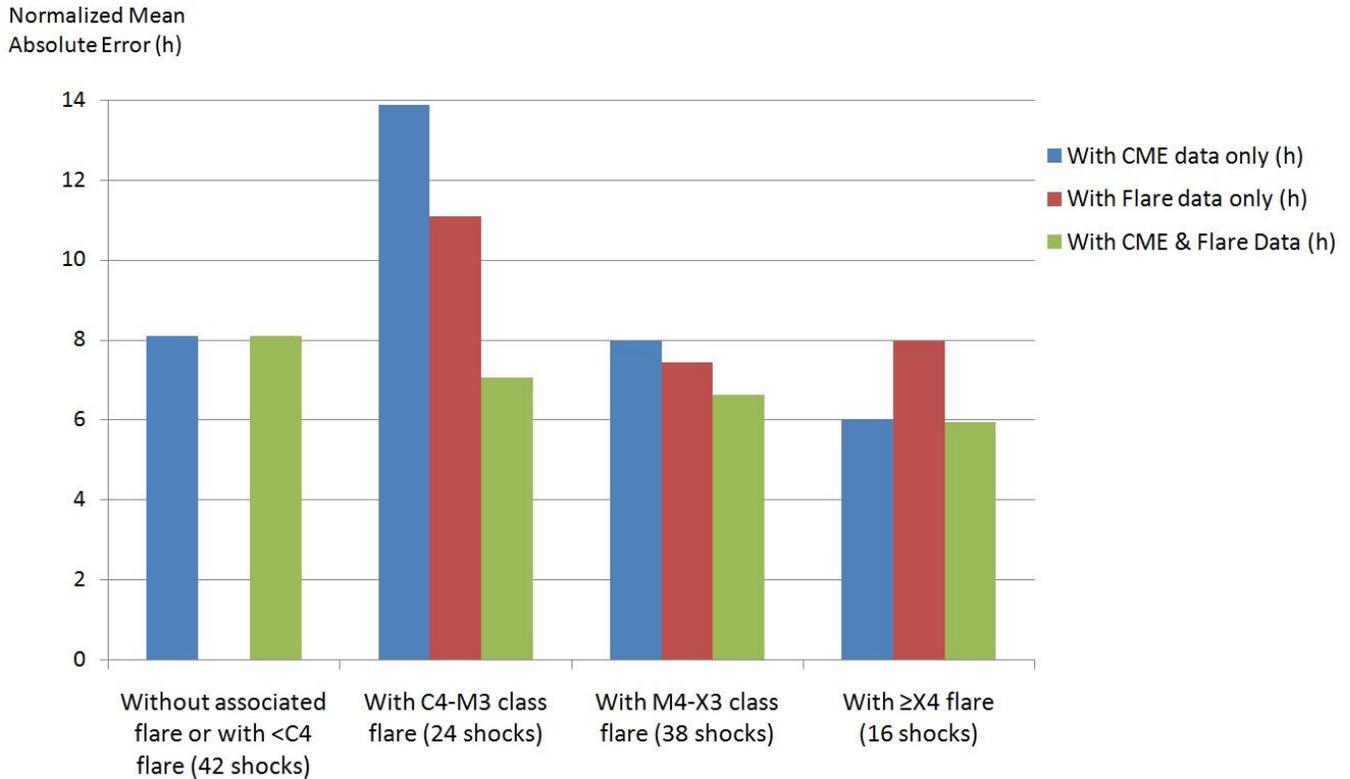


Figure 4. This chart shows the normalized mean absolute error depending on the associated flare's peak flux. The left group of bars shows the errors for the case in which the shock is not associated with a flare or it is associated with a $<C4$ flare. If the shock is associated with a $\geq C4$ flare, the figure shows the normalized mean absolute error depending on whether the flare's peak flux is between an interval (i.e. C4 - M3, M4 - X3, and $\geq X3$). It can be seen that SARM's forecasts are better as shocks are associated with $>M4$ flares.

The ESA model [Gopalswamy *et al.*, 2005a] was introduced with 29 events that are included in Table 1. Gopalswamy *et al.* [2005a] reported a mean absolute error of 12 hours. For these data, SARM's combined approach (i.e., using CME and flare data) obtained a lower mean absolute error, which was 9.1 hours. Since ESA and SARM models used the same shock data during their calibration, this comparison is valid.

In Falkenberg, *et al.* [2011], a study was carried out using ENLILv2.6 for predicting shock arrivals at Earth and Mars. Falkenberg *et al.* [2011] reported a mean absolute error of 19.16 hours (by using

manual parameter settings) while SARM obtained a mean absolute error of 12.86 hours; however, these results are not conclusive because SARM's triggering conditions filtered out several shocks, and these shocks were part of SARM's calibration data set. In section 3.2, a comparison is made with 1-AU shock data not included in the SARM calibration dataset which will allow us to provide a valid conclusion with regard to the comparison of SARM and the ENLIL models.

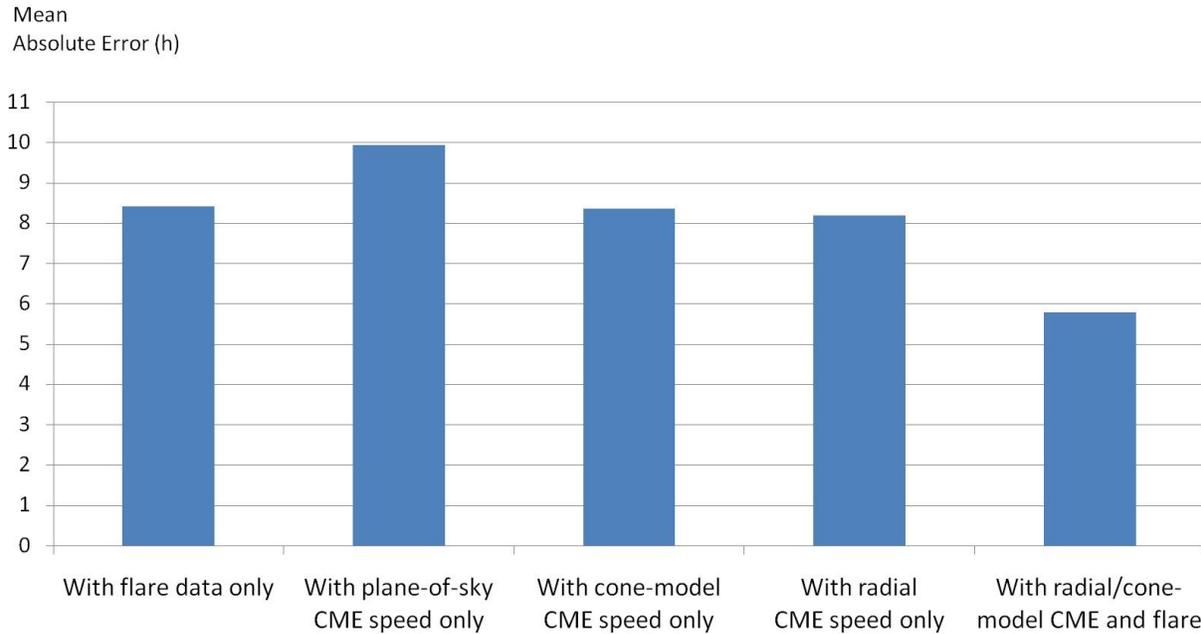


Figure 5. Mean absolute error of arrival predictions to 1 AU as a function of the data availability. The first bar shows the mean absolute errors if only flare data are used. The second, third and fourth bars show the mean absolute errors if only plane-of-sky, cone-model-estimated, or radial CME speeds are used. The fifth column presents the mean absolute errors if both flare and true CME speed (radial or cone-model speeds) are used. This figure shows that the worst results were obtained if only plane-of-sky speed data are used (9.9 h). The best results are obtained when both flare and true CME speeds are used (5.8 h).

Figure 5 summarizes the SARM's absolute errors of arrival predictions to 1 AU as function of the data availability. These MAE errors were extracted from the results presented in Table 2. The first bar shows that SARM obtained a MAE of 8.4.h if only flare data are available. The second bar shows a MAE of 9.9.h if only plane-of-sky CME speed data are available. Since plane-of-sky speed V_{POS} are lower than the actual CME speeds, they were statistically adjusted to actual speeds (see section 2.1) by minimizing their normalized MAE error. The third bar shows a MAE of 8.3 h if only cone-model-corrected CME speeds are used. Cone-model speeds are considered *true* speeds, for this reason if only cone-model speed V_E are available, $V_{cme_E} = V_E$. The fourth bar presents a MAE of 8.2 h if only radial CME speeds are

used. And finally, the fifth bar presents a MAE of 5.8 h if true CME speeds (i.e., cone-model or projected-radial speeds) and flare data are used. The improvement of MAE using flare data and true CME data is nearly 30% compared to the MAE obtained with any true CME speed alone (i.e., projected radial speed or cone-mode-based CME speed).

Regarding Figures 2 to 5, the following conclusions may be drawn: in the case of 1 AU, the normalized mean and the median of absolute errors were 7.1 h and 5.1 h respectively; the mean absolute error using both true CME speeds and flare data was 5.8 h; for the prediction of shock arrivals at distances from 0.72 to 8.7 AU, the normalized mean and the median of absolute errors were 7.0 h and 5.0 h, respectively. If only CME data are available or if only flare data are available, the normalized MAE errors were 8.9 h and 8.6 h respectively, using all shock events.

3.2. Validation of the model

This section presents validation experiments with shock data that were not included in the calibration of the model. In this validation test, a list of 20 shock data selected in a recent study by *Gopalswamy et al.* [2013] is presented, in which radial CME speeds are obtained by using STEREO A/B data.

Gopalswamy et al. [2013] reported the forecasting error with CME speeds calculated for the ecliptic plane using STEREO data. An additional advantage of this shock data is that they reported a comparison between the ESA and ENLIL model, which was useful to compare SARM with these two state-of-the-art models. Of the 20 shocks, *Gopalswamy et al.* [2013] reported 2 shocks associated with complex CME-CME and CME-coronal hole interaction which could lead to large deviations from model predictions [*Nieves-Chinchilla et al.*, 2012, 2013].

Table 3 presents the subset of 20 full halo events selected by *Gopalswamy et al.* [2013], and the forecast results after applying SARM and ENLIL with the same CME data.

Table 3. Shock data from *Taktakishvili et al.* [2009] and *Gopalswamy et al.* [2013] which includes radial and earthward CME speeds (using two measuring approaches). This table also presents the associated flare data.^a

	Shock	Transit	CME	Radial	Earthward	Earthward	Flare	Flare	Flare
	data and time	Time	Date and time	Speed (V_{cme})	speed (V_{cme_E})	speed_1 (V_{cme1_E})	location	class	Duration (h)
eventT1	2/15/10 17:28	75.9	2/12/10 13:31	867	765	756	N26E11	M8.3	0.15
eventT2	4/11/10 12:18	79.8	4/8/10 4:30	771	677	630	N24E16		
eventT3	8/3/10 16:51	56.4	8/1/10 8:24	1031	784	1257	N20E36	C3.2	1.67
eventT4	2/18/11 0:40	70.1	2/15/11 2:36	945	879	864	N12W18	X2.2	0.37
eventT5	3/10/11 5:45	63.0	3/7/11 14:48	691	633	738	N11E21	M1.9	1.18
eventT6	6/23/11 2:18	47.0	6/21/11 3:16	986	939	812	N16W08		
eventT7	8/4/11 21:10	62.6	8/2/11 6:36	1015	951	883	N14W15	M1.4	1.48
eventT8	8/5/11 17:23	52.1	8/3/11 13:17	1322	1062	1161	N22W30	M6.0	0.88
eventT9	8/5/11 18:32	38.9	8/4/11 3:40	1709	1307	1945	N19W36	M9.3	0.38
eventT10	9/9/11 11:49	81.4	9/6/11 2:24	513	494	521	N14W07	M5.3	0.50
eventT11	9/17/11 3:05	75.1	9/14/11 0:00	577	534	467	N22W03		
eventT12	11/12/11 5:10	63.6	11/9/11 13:36	1366	911	1210	N22E44	M1.1	1.13
eventT13	1/22/12 5:18	62.9	1/19/12 14:25	1153	907	674	N32E22		
eventT14	1/24/12 14:33	34.9	1/23/12 3:38	2002	1645	1245	N29W20	M8.7	0.93
eventT15	2/26/12 21:07	65.3	2/24/12 3:46	779	623	678	N25E28		
eventT16	3/8/12 10:53	33.3	3/7/12 1:36	2190	1866	1402	N17E27	X5.4	0.63
eventT17	3/11/12 12:52	56.6	3/9/12 4:14	861	822	1176	N17W03		
eventT18	3/12/12 8:45	39.1	3/10/12 17:40	1558	1361	1081	N17W24	M8.4	1.25
eventT19	6/16/12 8:52	42.3	6/14/12 14:36	1207	1148	1317	S17E06	M1.9	3.07
eventT20	7/14/12 17:27	48.6	7/12/12 16:49	1548	1502	1210	S14W01	X1.4	1.88

^a This table presents the subset of 20 full halo events selected by *Gopalswamy et al.* [2013]. Column 1 presents the identifier of the event. Column 2 presents the date and time of shocks. The transit times are listed in column 3. The associated CMEs at the sun (date and time) are listed in column 4. The CME time refers to the first appearance of the CME in the STEREO/COR2 FOV. The solar source of the CME is identified as the heliographic coordinates of the eruption location observed in EUV images either from the Solar Dynamics Observatory (SDO) or STEREO. The speed measured in that STEREO/COR2 FOV in which the CME was closest to the limb is the radial speed (V_{rad}) of the CME is presented in column 5 as V_{cme} . The speed is the average speed within the COR2 FOV obtained by fitting a straight line to the height-time measurements. The earthward speed V_{cme_E} (column 6) was obtained by applying a simple projection correction to the COR2 radial speed i.e., $V_{cme_E} = V_{cme} * \cos(\alpha) * \cos(\beta)$ km s⁻¹, where a and b are the heliolongitude and heliolatitude of the solar event location (SARM also uses this projection formula to calculate the earthward CME speed (see equation (2)); for this reason, we kept the same speed name, V_{cme_E}). Column 7 lists the earthward CME speeds in the ecliptic plane from STEREO A/B data (V_{cme1_E}) calculated by *Gopalswamy et al.* [2013] by making the CME height-time measurements at position angles 90° (STA) and 270° (STB), neglecting the solar B0 angle (the heliographic latitude of the ecliptic). The associated flare's location, peak and duration are listed in columns 8, 9 and 10, respectively.

Table 4 presents the absolute errors in two validation tests: Test A) by using the 20 events selected by *Gopalswamy et al.* [2013], and Test B) by using the 15 shock cases that are common between *Taktakishvili et al.* [2009] and *Gopalswamy et al.* [2013]. According to the summary of Table 4 (see last

three rows), SARM's absolute errors are lower than ESA's absolute errors in all tests and statistical measures. The last three columns of Table 4 also show that ENLIL's absolute errors are the lowest.

Table 4. Validation test of SARM and comparison with ESA and ENLIL ^a

	Test A [<i>Gopalswamy et al.</i> , 2013]				Test B [<i>Taktakishvili et al.</i> , 2009]				
	Using $Vcme_E$		Using $Vcme_{1E}$		Using $Vcme_E$		Using $Vcme_{1E}$		
	ESA	SARM	ESA	SARM	ESA	SARM	ESA	SARM	ENLIL
eventT1	11.7	12.3	11.0	12.02					
eventT2	8.7	19.2	4.7	16.95	8.7	19.2	4.7	16.95	3.3
eventT3	6.4	0.2	18.1	14.15	6.4	0.2	18.1	14.15	6.9
eventT4	13.4	23.1	12.5	22.89	13.4	23.1	12.5	22.89	9.8
eventT5	11.8	2.2	3.3	4.52	11.8	2.2	3.3	4.52	1.8
eventT6	6.1	3.6	14.0	8.04	6.1	3.6	14.0	8.04	9.6
eventT7	10.2	8.0	6.2	6.72					
eventT8	5.5	3.1	9.9	4.55	5.5	3.1	9.9	4.55	0.4
eventT9	2.3	9.2	16.9	1.53					
eventT10	6.7	20.0	3.9	20.57	6.7	20.0	3.9	20.57	5.2
eventT11	8.9	7.2	15.9	3.08	8.9	7.2	15.9	3.08	5.9
eventT12	8.9	0.4	23.4	7.17	8.9	0.4	23.4	7.17	3.5
eventT13	8.0	11.0	8.4	2.11					
eventT14	7.6	5.0	3.9	9.26	7.6	5.0	3.9	9.26	0.5
eventT15	10.4	2.1	5.7	4.77	10.4	2.1	5.7	4.77	1.0
eventT16	10.3	0.0	14.5	3.52	10.3	0.0	14.5	3.52	0.8
eventT17	3.7	2.0	15.1	12.46					
eventT18	4.3	1.9	6.6	5.02	4.3	1.9	6.6	5.02	14.3
eventT19	0.4	2.6	6.0	0.65	0.4	2.6	6.0	0.65	10.0
eventT20	17.9	13.6	8.4	11.25	17.9	13.6	8.4	11.25	5.5
Summary of results:									
- Mean:	8.2	7.3	10.4	8.6	8.5	6.9	10.1	9.1	5.2
- Mean w/o outliers:	7.3	6.1	10.4	7.6	7.4	5.2	10.0	7.9	4.9
- Median:	8.4	4.3	9.2	6.9	8.7	3.1	8.4	7.2	5.2

^a Table 4 presents the absolute errors in two validation tests: Test A) by using the 20 events selected by *Gopalswamy et al.* [2013], and Test B) by using the 15 shock cases that are common between *Taktakishvili et al.* [2009] and *Gopalswamy et al.* [2013]. Column 1 presents the shock identifier. Columns 2 to 5 present the mean absolute errors for Validation Test A using the ESA and SARM models with two CME speeds (i.e., $Vcme_E$ and $Vcme_{1E}$), and Columns 6 to 10 present the mean absolute errors of ESA, SARM and ENLIL (reported by *Taktakishvili et al.* [2009] for the Test B) using the mentioned speeds. The last three columns of Table 4 present the summary of the results. The first row of the summary presents the mean of the absolute errors of the respective columns. The second row of the summary presents the mean of absolute error without considering two outliers identified by *Gopalswamy et al.* [2013] because of CME-CME and CME-Coronal hole interactions (i.e., eventT4 and eventT20); the last row of the summary presents the median of the respective columns.

Figure 6 shows the distribution of errors of SARM predictions with CME data (using the speed estimation approach V_{cme_E}) and flare data with the dataset in *Gopalswamy et al.* [2013]. This figure also shows that the most frequent error interval is [2.5 h, 7.5 h], the MAE is 7.3 h, and the standard deviation of errors is 7.1 h. Note that the MAE for the calibration shock events at 1 AU (i.e., 7.0 h – see Figure 2b) is similar to the MAE with the validation shock events at 1 AU (i.e., 7.3 h – see Figure 6). These results also show that the overall performances of SARM with the calibration and validation shock cases were similar.

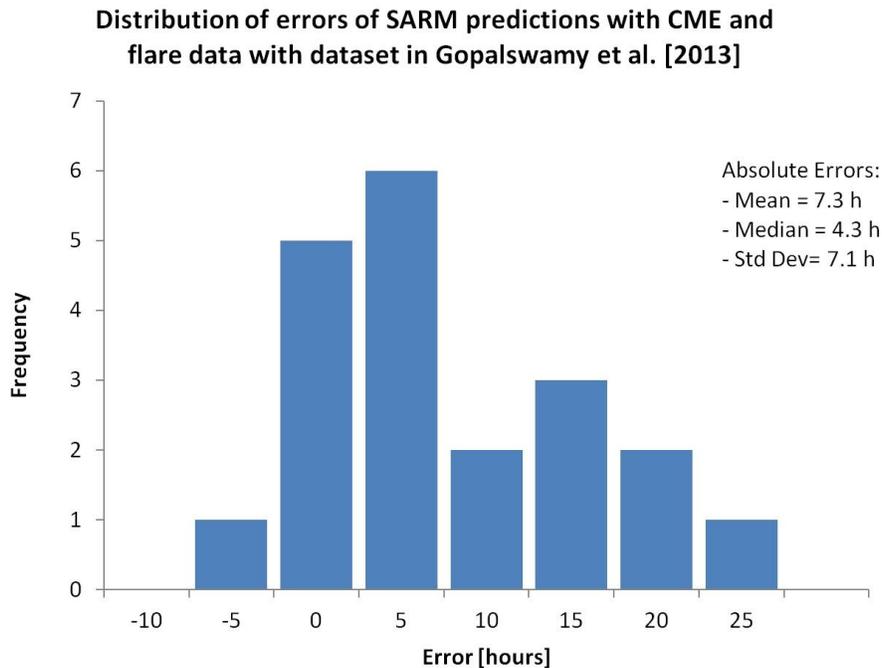


Figure 6. Distribution of errors of SARM predictions with CME data (using the speed estimation approach V_{cme_E}) and flare data with the test set using V_{cme_E} in *Gopalswamy et al.* [2013]. These errors were extracted from the results presented in Table 4. This figure shows that the most frequent error interval is [2.5 h, 7.5 h], the MAE is 7.3 h, and the standard deviation of errors is 7.1 h.

From Table 4 we may say that ENLIL's median of absolute errors and MAE are lower than those errors yielded by the SARM and the ESA models, and that SARM's median of absolute errors and MAE are lower than those errors of the ESA models in tests A and B, and in every particular condition (i.e., with and without outliers). With the aim of studying the statistical support of the differences between the median of absolute errors of the three models shown in the last three columns in Table 4 (i.e., 8.4 h, 7.2 h, and 5.2 h for the ESA, SARM, and ENLIL models, respectively), we applied the Wilcoxon signed-rank test [*Wilcoxon*, 1945] with a statistical significance of 0.05. We conclude that there is statistical

evidence of the difference between the aforementioned errors of ENLIL and ESA ($0.01 < p < 0.02$), i.e., the probability of obtaining similar results by chance is very low, so the conclusion that ENLIL yields a lower median of absolute errors is statistically supported; on the other hand, we also concluded that there is no statistical evidence of the difference between the medians of absolute errors of ENLIL and SARM ($0.05 < p < 0.1$), and between the aforementioned errors of SARM and ESA ($p > 0.2$); therefore, no statistically supported conclusions may be drawn with the later comparisons.

The mean absolute errors presented in section 3 may be verified by using data in Table 1 and Table 3 as input to the SARM model that is available in <http://spaceweather.uma.es/sarm/index.html>.

4. Conclusions

This paper has presented the SARM (Shock Arrival Model) tool's principles for the prediction of shock arrival times for distances from 0.72 AU to 8.7 AU. This drag-based model is the result of a comprehensive analysis of data, catalogs and observations of CMEs and flares from heliospheric observatories.

The SARM model is an empirical drag model that calculates the shock speed as a function of its location, and whose motion is subjected to a drag force, until a constant speed is reached. A dataset of 120 shocks observed from 1997 to 2010 was used to find the best coefficients that allow the absolute errors to be minimized. The coefficients were obtained by minimizing the normalized mean absolute errors, that is, those where the absolute error is divided by the shock distance in AUs.

The SARM model calculates the shock speed by using the differential equation (2) $dx/dt = V_{driver_x} e^{-7x} + 0.42 V_{driver_x} + 330 \text{ km s}^{-1}$, where V_{driver_x} is a function of the CME data (radial, earthward or plane-of-sky speeds) and the flare data (peak flux, duration, and location). This model may also be used with the CME data only or with flare data only.

For the prediction of shock arrivals at distances from 0.72 AU to 8.7 AU, the MAE error was 7.1 hours. This average was lower than the errors using the individual approaches: 8.9 h using the CME data only (radial, cone-model, plane-of-sky speeds) and 8.6 h using flare data only.

For 1 AU, the MAE error was 7.0 h. This average was lower than the errors using the individual approaches: 9.2 h using the CME data only (radial, cone-model, plane-of-sky speeds) and 8.4 h using flare data only. The best combination for 1 AU was found using both flare and true CME data (radial or

cone-model-estimated speed), which obtained a MAE of 5.8 h. It is important to note the very satisfactory results of SARM in terms of the median: for 1 AU, for example, the median of absolute errors was 5.0 h during the calibration phase (see Figure 2). For all shocks the median of normalized absolute errors was also low (5.1 h).

SARM model was compared with the empirical ESA model [Gopalswamy *et al.*, 2005a] and the numerical MHD-based model ENLIL [Odstrcil *et al.*, 2004] with a dataset of 20 shocks that were not used during the calibration phase (see Table 4). These shocks were observed at 1 AU and associated with true CME data from 2010 to 2012 [Taktakishvili *et al.*, 2009; Gopalswamy *et al.* 2013]. The ESA model obtained a MAE error of 8.16 h taking into account all shock events and using true CME speeds. SARM obtained a MAE of 7.3 h with these shock events and using both true CME data (with the same simple projection approach) and flare data. Gopalswamy *et al.* [2013] also found that the predictions of two of these events obtained large deviations due to complex CME-CME and CME-coronal hole interactions, considered as outliers. For this reason, the main result that they reported was obtained without considering the aforementioned complex interplanetary events. They reported a MAE of 7.3 h for the 18 shocks without the outliers. SARM obtained a MAE of 6.1 h for the same 18 shock events (using CME and flare data).

Table 4 also shows that the median of absolute errors obtained by the ENLIL, SARM and ESA models were 5.2 h, 7.2 h, and 8.4 h, respectively. In order to test the statistical support of these results, we used the Wilcoxon signed-rank test with a statistical significance of 0.05. We concluded that the ENLIL's median of absolute error is significantly lower than the same error of the ESA model, and that there is no statistical support of the differences between the median of absolute errors of ENLIL and SARM, nor between the median of absolute errors of SARM and ESA.

Although promising, the SARM model needs to be tested with real-time data for a large period of continuous operations. In an operational mode, predictors yield higher errors than those using historical data (e.g., Zhao and Dryer [2014] concluded that operational CME/shock arrival time prediction models for 1 AU generally yield mean absolute errors of 10 h for a large number of data events).

Although there is no physical relationship between flares and CME-driven shocks, this study shows that it is possible to predict shock arrival times using flare data alone, and that the best results are obtained when true CME speeds and flare data are used.

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Supporting Information S1



Space Weather
Supporting information for

Prediction of shock arrival times from CME and flare data

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The SARM calibration process, described in this document, is an iterative data-driven three-step analysis. This document explains how to get the first estimates of the speed V_a in Eq. 1 by using shocks observed at distances > 1 AU, and how, starting from these, to refine the estimate of all parameters in Eq. 1 by using all shocks in Table 1.

In section S.1, we assume that at distances > 1 AU, V_a can be approximated by the distance Sun-observer divided by the observed travel time. To this end Section S1 uses coronagraphic measurements of CME speeds. Section S2 refines V_a by using a proxy inferred from soft X-ray observations. In section S.3 we present that the mean value of the two is most appropriate, with the further advantage that a CME speed can be guessed even when the data coverage is incomplete. Starting from these first guesses, section S.3. uses all shocks in Table 1 (i.e., 120 shocks observed from 0.72 to 8.9 AU) to encounter the drag coefficient k and refine V_a (eq. S.3).

S.1. Correlation between IP shock transit speed and CME data alone

In the first analysis step, explained in detail in this section, we explore the correlation between CME data alone and the IP shock transit speeds for distances between 1.3 AU (by Mars) and 8.7 AU (by Saturn). We found that the IP shock transit speed is easily obtained with historical data (i.e., the radial distance of the spacecraft from the sun divided by the observed transit time); therefore, the purpose of this step has been to obtain a predictor of the IP shock transit speed from CME data alone for the aforementioned distances. In this section we obtain a linear regression formula that allow us to make rough predictions of the IP asymptotic speed V_a in equation (1) from CME data alone.

In order to avoid the necessity of determining the drag coefficient in this first iteration of the model design, we use shock data associated with shocks observed at *long* distances (i.e., > 1.3 AU). Figure S.1 presents the events in Table 1 observed at distances > 1.3 AU in terms of the observed IP shock transit speed \bar{v} and $V_{\text{CME}x}$ (which is calculated by using the approaches presented in section 2.1). Note that we carry out this correlation with the purpose of finding a first approximation of the IP asymptotic speed from CME data alone that will be refined in sections S2 and S3. The IP shock transit speed \bar{v} is calculated as D/tt , where D is the distance (i.e., column 2 of Table 1) at which the shock was observed, and tt is the transit time of the shock (i.e., column 4 of Table 1).

The linear dependence between the IP shock transit speed and the CME initial speed alone for shocks in Table 1 whose distances are greater than 1.3 AU is shown in Figure S.1. The solid line represents a linear

formula whose coefficients were found by minimizing the mean of absolute errors. The found regression equation is to estimate the observed IP shock transit speeds:

$$\bar{v} = 0.39 V_{\text{CME}x} + 322 \text{ (km s}^{-1}\text{)} \text{ for distances between 1.3 and 8.7 AU} \quad (\text{S.1})$$

Correlation between IP shock transit speed and the projected CME initial speed ($V_{\text{CME}x}$) or shock in Table 1 observed at distances > 1.3 AU

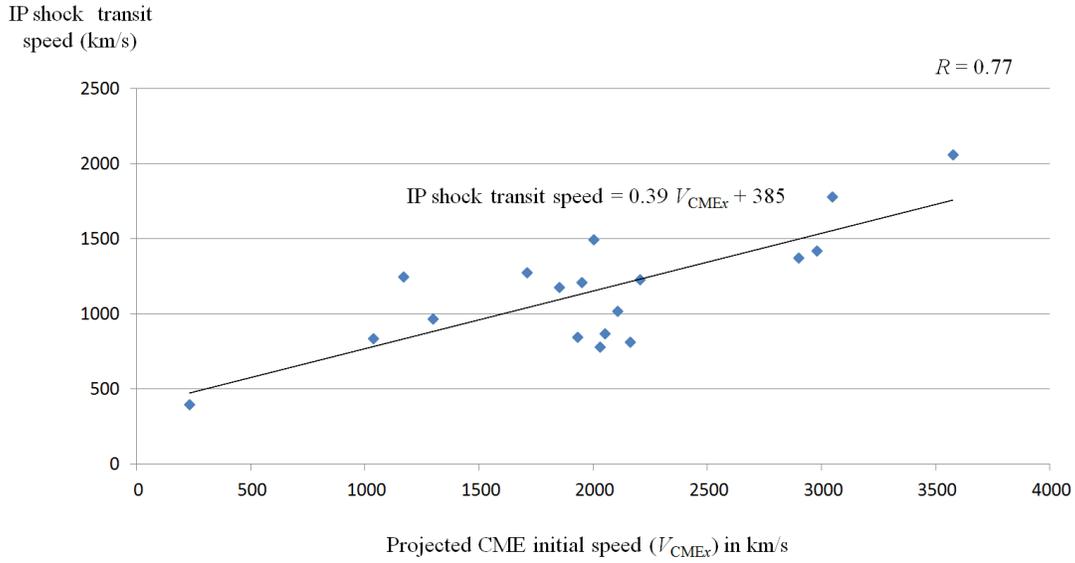


Figure S.1. Linear dependence between the observed IP shock transit speed and the projected CME initial speed ($V_{\text{CME}x}$) alone for shocks in Table 1 whose distances are greater than 1.3 AU. The solid line shows the regression line calculated by minimizing the mean of absolute distances of each point to the solid line.

Although the correlation coefficient of Figure S.1 is not high ($R = 0.77$), the associated regression line was useful to find \bar{v} , which is a first rough approximation of the asymptotical shock speed V_a at large distances, from V_{CME} speeds only. Note that the regression line in Figure A.1 cannot be directly validated, because V_a does not correspond to any observed measure at the spacecraft; therefore, what will be important at the end of the whole calibration process is the validation in terms of the absolute value of errors of shock arrival time predictions with all events in Table 1 and with new shock events (see section 3).

S.2. Correlation between IP shock transit speed and flare data alone

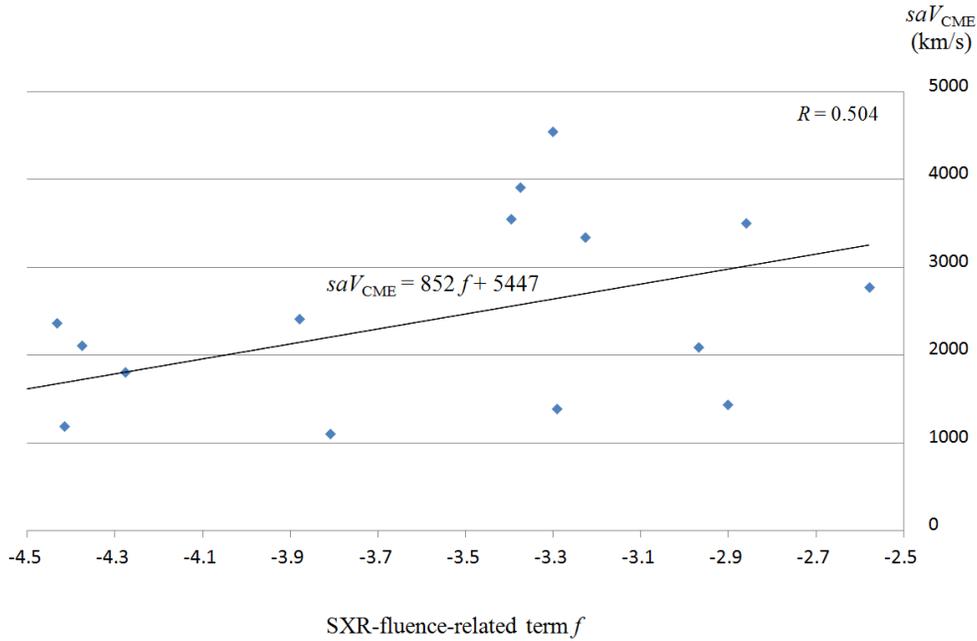
The purpose of the second analysis step, explained in this section, is to obtain a radial CME speed saV_{CME} from flare data alone (duration, peak, and location) for distances between 1.3 AU and 8.7 AU. We finalize this section by refining the linear regression equation (S.1) that allows us to predict the IP asymptotic speed V_a in equation (1) from CME and flare data.

Firstly, we want to predict the radial CME initial speed from the soft X-ray flux associated to the same solar-activity process. Therefore, in this section we want to predict the radial CME speed (i.e., V_{CME}) from flare data. To differentiate the observed V_{CME} and the predicted CME initial speed, we refer to the

latter as saV_{CME} to emphasize that it is predicted from the solar-activity data. We have to study the correlation between the saV_{CME} term and a flare-related term in the context of the prediction of the observed IP shock transit speed. In this context, we want to correlate the observed IP shock transit speed with saV_{CME} . With the purpose of making a linear regression correlation, each shock event in Table 1 (for distances > 1.3 AU) should be used to construct an analysis instance in a 2D graph, in which an X-ray-related input is used to predict a saV_{CME} -related output, as follows:

- There have been studies in which soft X-ray fluxes have been used to predict shock-related events: On the other hand, *Smith et al.* [1994] showed that the product of the soft X-ray flare peak and duration is proportional to the energy released by flares. Later, *Liu and Qin* [2012] used this product as a proxy to predict whether or not a IP shock will hit the Earth; therefore, the product of flare duration with flare peak seems to be a proxy that needs to be studied. Besides, these data are easy to consult (e.g., they are found in the NOAA's edited event list). The time-integration of the X-ray flux has also been used by the UMASEP system to forecast the >10 MeV and >100 MeV integral proton flux intensity of the prompt component of well-connected SEP events [*Núñez*, 2011, 2015]. Observationally, we know that X-class flares are correlated with high CME speeds and C-class flares with low CME speeds. These observations led us to study the linear correlation between CME speeds with the \log_{10} of the aforementioned product (i.e., flare duration FD times the flare peak FP). We used the NOAA/SWPC's edited event list as a reference to obtain the flare duration (abbreviated as FD_{swpc}) and the flare intensity peak (abbreviated as PF_{swpc}).
- Regarding the saV_{CME} -related output, we could use V_{CME} in Table 1 as the target prediction output; however, it is not advisable given the fact that we have a more accurate goal to predict: the *observed* IP transit speed \bar{v} , which is easy to obtain (see column 3 in Table 1) and is accurate. Since we know that equation (S.1) presents a formula that predicts \bar{v} from V_{CME} , saV_{CME} may be used in equation (S.1) to more accurately predict \bar{v} ; that is, $\bar{v} = 0.39 saV_{CME} \cos(\alpha) \cos(\beta) + 322$, for distances > 1.3 AU (where α and β are the longitude and latitude of the associated flare from the spacecraft's viewpoint) by isolating saV_{CME} in this formula, the term $saV_{CME} = (\bar{v} - 322) / (0.39 \cos(\alpha) \cos(\beta))$. Note that V_{CMEx} in the original equation (S.1) depends on the radial CME speed; therefore, we want to predict the radial saV_{CME} that, used alone (without CME data) and with the corresponding projection i.e., saV_{CMEx} , may provoke that shocks arrive at the observe transit time.

Correlation between the radial saV_{CME} and the \log_{10} of the soft X-ray-fluence



Note: the term f is the \log_{10} of the soft X-ray fluence, calculated as $\log_{10}(FD_{\text{swpc}} * FP_{\text{swpc}})$

Figure S.2. Regression analysis for predicting the solar-activity-calculated CME initial speed (saV_{CME}) from X-ray data for predicting the observed IP shock transit speed at distances between 1.3 to 8.7 AU. The coefficients of the regression line are discovered by minimizing the normalized mean absolute error.

Figure S.2 presents shocks at distances from 1.3 to 8.7 AU for each shock in terms of the aforementioned input and output terms, and the corresponding regression line. The regression line $saV_{\text{CME}} = 852*f + 5447 \text{ km s}^{-1}$ (where $f = \log_{10}(PF_{\text{swpc}} * FD_{\text{swpc}})$) represents a linear formula whose linear coefficients were obtained by minimizing the normalized mean absolute error (see Figure S.2). Although the correlation coefficient of Figure S.2 is not high ($R = 0.504$), the associated regression line was useful to find a first rough approximation of the asymptotical shock speed V_a at large distances in terms of flare data only, that will be refined in Section S.3. If we use the regression line shown in Figure S.2 in equation (S.1) to predict the IP shock transit speed (i.e., $\bar{v} = 0.39 saV_{\text{CME}_x} + 322$), and calculate the observed IP shock arrival time (i.e., the spacecraft distance divided by the transit speed \bar{v}), the normalized mean absolute error of time arrival predictions is 10.5 h for the shocks in Table 1 detected at distances of between 1.3 and 8.7 AU, which means this second approximation (i.e. prediction of \bar{v} from saV_{CME_x}) yields acceptable results.

S.3. Estimating the IP shock speed from CME and/or flare data

The third analysis step uses all shock events in Table 1 to refine all the model coefficients (e.g., the drag coefficient k and all the linear regression coefficients obtained in section S.1 and section S.2) by minimizing the mean absolute error of arrival time predictions.

In section S.1 and S.2 we found an estimation of V_a as a function of V_{CME} (i.e. from coronagraphs), and from saV_{CMEx} (i.e., a proxy inferred from soft X-ray observations). In this section we present that the mean value of the two is most appropriate, because, if no CME observations are available, the proxy saV_{CMEx} may be used; that is V_a may be approximated as average between $((0.39 V_{CMEx} + 322)$ and $((0.39 saV_{CMEx} + 322)$). Another way to express this equation is the equation (S.2):

$$\bar{v} = 0.39 V_{DRIVERx} + 322 \quad \text{for shock distances between 1.3 and 8.7 AU} \quad (\text{S.2})$$

where $V_{DRIVERx}$ is the average between V_{CMEx} and saV_{CMEx} , and \bar{v} is the IP shock transit speed to be predicted. The term saV_{CMEx} is calculated as the cosine projection of the radial term $(852 * \log_{10}(PF_{swpc} * FD_{swpc}) + 5447)$ in the sun-spacecraft axis. If we replace \bar{v} (i.e., equation (S.2)) in equation (1), we obtain V_a in equation (S.3) to calculate the instantaneous IP shock speed. Instead of presenting a refined equation with the coefficients found from flare data alone and CME data alone, we present it in equation (1) in terms of its five coefficients (i.e., a , b , c , d and k), because we want to emphasize that the coefficients found are approximations that need to be tuned by using both CME and flare data with all shocks in Table 1.

$$V_{shock}(x) = \frac{dx}{dt} = V_{DRIVERx} e^{-k x} + \underbrace{a V_{DRIVERx} + b}_{V_a \text{ (see equation (S.2))}} \quad (\text{S.3})$$

where a and b are the linear coefficients to calculate the IP shock transit speed, which is a first approximation of V_a , the asymptotic speed in equation (1).

In order to estimate the drag coefficient k of equation (S.3) we ran the Runge Kutta 4th order numerical method with different values of k for the 120 shock events in Table 1 with all CME and flare data, and by using the coefficients a and b in equation (S.2). We found a first approximation of the drag coefficient k that yielded the lowest mean absolute error with equation (S.3) taking into account the above analysis was -6.18.

The final optimization process also requires us to optimize the statistical finding reported by *Michalek et al.* [2003] that found that the actual earthward speeds V_{CMEe} are 20% higher than plane-of-sky speeds, V_{POS} . They also reported that halo CMEs originating close to the Sun center, subjected to the largest projection effects, were not included in their results. Since we have 48 shock events (including CMEs close to the Sun center), we decided to refine the aforementioned percentage. We empirically found by using the refinement process presented in this section, that using equation (S.3) a ratio V_{CMEe}/V_{POS} of 1.26 (instead of 1.2) minimizes the normalized mean absolute errors of SARM's arrival predictions using the shock events in Table 1 that use plane-of-sky speeds.

Now we need to do the final refinement of all coefficients in equation (S.3) by using both CME and flare data. This refinement is done by minimizing the normalized mean absolute error of the predictions on all shock data in Table 1 by using an optimization via a Coarse-to-Fine approach; that is, for each iterative refinement step, each shock in Table 1 needs to be simulated with the differential equation (S.3) configured with slightly different coefficients than those obtained in the previous refinement step. For each ^{simulated} shock propagation, single absolute errors (from observed shock arrivals in Table 1) are

normalized by dividing them by the corresponding distance (in AU), and averaged. The best sets of coefficients are taken as input of the next refinement step. This iterative optimization approach finalizes when no more improvement is achieved. The resulting refined coefficients were: $a = 0.42$, $b = 330$, $c = 1015$, $d = 5500$, and $k = -7$. We may take the common factor $V_{DRIVERx}$ out and transform equation (S.3) into equation (S.4), which corresponds to the SARM equation (see equation (2)) for calculating the instantaneous IP shock speed:

$$\frac{dx}{dt} = V_{DRIVERx} e^{-7x} + 0.42 V_{DRIVERx} + 330 \quad km \ s^{-1} \quad (S.4)$$

where

- x is the heliospheric distance from the sun to the IP shock
- $V_{DRIVERx}$ is the *Average* (V_{CMEx} , saV_{CMEx}). That is, if no flare data are available, $V_{DRIVERx} = V_{CMEx}$; if no CME data are available, $V_{DRIVERx} = saV_{CMEx}$
- V_{CMEx} is the radial CME speed V_{CME} projected in sun-spacecraft axis; that is, $V_{CMEx} = V_{CME} \cos(\alpha) * \cos(\beta)$, where α and β the longitude and latitude of the associated flare from the spacecraft's viewpoint. If radial CME speed is not available, the cone-model speed V_E may be used; that is, $V_{CMEx} = V_E$. For more information about how to obtain V_{CMEx} , see section 2.1.
- saV_{CME} is calculated as $1015 \log_{10}(PF_{swpc} \times FD_{swpc}) + 5500$, where PF_{swpc} and FD_{swpc} are the flare peak and the flare duration, using the NOAA/SWPC data.