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# Integrated Geostationary Solar Energetic Particle Events Catalog: GSEP

Sumanth Rotti<sup>1</sup>, Berkay Aydin<sup>2</sup>, Manolis K. Georgoulis<sup>3</sup>, and Petrus C. Martens<sup>1</sup>
Georgia State University, Department of Physics and Astronomy, Atlanta, GA, USA; srotti@gsu.edu
Georgia State University, Department of Computer Science, Atlanta, GA, USA
Academy of Athens, Research Center for Astronomy and Applied Mathematics, Athens, Greece
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#### Abstract

We present a catalog of solar energetic particle (SEP) events covering solar cycles 22, 23 and 24. We correlate and integrate three existing catalogs based on Geostationary Operational Environmental Satellite integral proton flux data. We visually verified and labeled each event in the catalog to provide a homogenized data set. We have identified a total of 341 SEP events of which 245 cross the Space Weather Prediction Center threshold of a significant proton event. The metadata consists of physical parameters and observables concerning the possible source solar eruptions, namely flares and coronal mass ejections for each event. The sliced time-series data of each event, along with intensity profiles of proton fluxes in several energy bands, have been made publicly available. This data set enables researchers in machine learning and statistical analysis to understand the SEPs and the source eruption characteristics useful for space weather prediction.

Unified Astronomy Thesaurus concepts: Solar energetic particles (1491)

#### 1. Introduction

Solar energetic particle (SEP) events are radiation storms of particle fluxes comprising electrons, protons, and heavier ions from the Sun. SEP events are known to originate in large eruptions such as solar flares (SFs) and coronal mass ejections (CMEs) (Reames 1999, 2013; Desai & Giacalone 2016). The number of SEP events occurring in any solar cycle (SC) varies and is much less than the number of SFs and CMEs that occur because of the acute directionality effects of SEPs and the fact that they are only detected in situ (Klein & Trottet 2001; Klein & Dalla 2017; Anastasiadis et al. 2019). The time intensities of particle fluxes are used to define and characterize SEP events. Enhancement above a nominal background level is considered to indicate a possible event. Such time profiles can be used to distinguish the source event as the temporal behavior appears to be different.

The energy of particles in large SEP proton events can reach GeV in some instances (Reames et al. 2001; Bruno et al. 2018), and these events can last from a few hours to several days (Kallenrode 2003: Klein & Posner 2005: Kahler 2005: Cane & Lario 2006). These events have the capacity to disrupt spacecraft operations (Smart & Shea 1992; Pulkkinen 2007), and pose a hazard of radiation exposure to astronauts and aircraft traveling in polar routes where protection/shielding is limited (Beck et al. 2005; Schrijver & Siscoe 2010; Schwadron et al. 2010; Jiggens et al. 2019). Understanding the origin and propagation of SEPs is a formidable scientific challenge, and of crucial importance to space weather research (Jackman & McPeters 1987; Gopalswamy 2003). In addition, as these hazards impose significant constraints on space-based activities for both humans and electronic equipment, predicting the event occurrences along with a sufficient advanced warning time is of vital importance to operations.

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Multiple space and ground-based missions currently obtain in situ solar particle composition and energy spectra fluxes. Researchers have prepared catalogs of SEP events using the available in situ particle data. Flux measurements beyond the Earth's magnetosphere have been used to populate these catalogs. For example, Wind spacecraft data are used by Kahler (2005) and Miteva et al. (2018). Solar and Heliospheric Observatory (SOHO) mission data are used by Cane et al. (2010) and Paassilta et al. (2017). SEPServer (Vainio et al. 2013) uses data from Wind, SOHO, and the Advanced Composition Explorer.

Solar proton event catalogs based on near-Earth observations such the Geostationary Operational Environmental Satellite (GOES) and Interplanetary Monitoring Platform (IMP-8) are of interest in this study. In Table 1, a list of existing SEP event catalogs utilizing near-Earth satellites is presented.

Researchers who do not often work on data-processing issues can benefit enormously from a carefully integrated data set in testing theoretical or working hypotheses. Whether we consider data from active regions or time-series measurements or images of the full solar disk, cleaned and organized data sets are crucial when it comes to building space weather forecasting systems. To implement machine-learning methodologies, cleaned data sets are vital during the research phase because the unavailability of feasible data creates a shortfall to researchoriented approaches. Hence, careful integration of observational evidence backed up with theoretical reasoning is necessary while developing data sets. In addition, it is necessary to identify and correct errors, shortcomings, and caveats in the measurements and corresponding metadata because (1) data quality can impact the research output; and (2) it can mislead both model and data-driven analysis. To bridge the gap, comparisons and integration of data catalogs are critical for improving the performance of event predictions and the outputs of comparative scientific studies. The Astroinformatics cluster at Georgia State University pursues data-driven research with particular solar physics applications (Angryk et al. 2020; Rotti et al. 2020). One of the areas is SEP event forecasting. The tasks include integrating reference data sets,

Table 1
The Consulted List of SEP Catalogs Based on the GOES Data

Catalog	Period	Threshold		Solar Source		
8		Channel (MeV)	Intensity (pfu)	Flare	CME	Active Region
Kurt et al. (2004)	1970–2002 (253)	>10	>10	Y	N	Y
Belov et al. (2005)	1975-2003 (1144)	>10	>0.1	Y	Y	Y
Gerontidou et al. (2009)	1996–2006 (368)	>10	>0.1	Y	Y	N
Dierckxsens et al. (2015)	1997–2006 (90)	>10	>0.1	Y	Y	N
Papaioannou et al. (2016)	1984-2013 (314)	>10	>0.5	Y	Y	Y
PPS (Kahler et al. 2017)	1986–2016 (138)	>50	>1.0	Y	N	N
CDAW-SEP <sup>a</sup>	1998–2017 (152)	>10	>10	Y	Y	Y
NOAA-SEP <sup>b</sup>	1976 onward (266)	>10	>10	Y	Y	Y
RF-SPE <sup>c</sup>	1970-2019	>10	>1.0	Y	Y	Y

Notes. The value in parenthesis under "Period" denotes the number of events reported in that catalog.

constructing metadata with well-defined statistical parameters derived from the measurements, and postprocessing. Efforts on SEP event predictions using machine learning have been ongoing over the last decade (Laurenza et al. 2009; Falconer et al. 2011; Engell et al. 2017; Stumpo et al. 2021; Kasapis et al. 2022). The GSEP data set to be discussed in this work supports the SEP predictions research area in two key perspectives, namely, in providing:

- 1. metadata for the source active regions, associated flares, CMEs and radio bursts;
- 2. time-series subsets of proton fluxes for the SEP event duration with an observation window of 12 hr.

This paper aims to bring together available SEP event catalogs based on GOES data as explained in Section 3. We have integrated a comprehensive list of SEP events with reference to their parent SFs and CMEs. The database comprises 341 SEP events, extending from 1986 to 2017. Section 4 describes the processes undertaken in data retrieval, preprocessing the GOES data, and the generation of the catalog under discussion. In Section 5, the results with observational details and minor differences between the catalogs are summarized. The purpose of this work is to provide the largest possible base for experimenting with statistical and machinelearning models on SEPs and their solar-source (SF and CME) properties. Source eruptions can then be correlated with photospheric magnetic field and metadata thereof to complement and physically/statistically connect SEP events with their solar, low-atmospheric progenitors.

## 2. Background

The National Oceanic and Atmospheric Administration (NOAA) continuously monitors the near-Earth space environment through GOES in geostationary orbit (Sauer 1989; Bornmann et al. 1996). The GOES satellites record the solar activity and the in situ radiation environment. They usually operate in pairs with one satellite over the west coast and another over the east coast of the United States in geostationary orbit. NOAA classifies the two GOES satellites making parallel measurements as the "primary" and the "secondary" one. Over the three SCs from 1986 to 2017, 11 different GOES satellites have been launched and commissioned.

The GOES series carries various instruments, including the Space Environment Monitor (SEM; Grubb 1975). One of its constituent detectors is called the Energetic Particle Sensor (EPS; Onsager et al. 1996) on GOES-05 to 12. The twin EPS system on GOES-13 to 15 is called the Energetic Proton, Electron, and Alpha Detector (EPEAD). There are seven proton channels in the EPS/EPEAD taking in situ differential measurements with characteristic energies spanning from a few up to several hundred MeV (Sandberg et al. 2014). Furthermore, these channels are binned to seven nominal integral energies: P1 (>1 MeV), P2 (>5 MeV), P3 (>10 MeV), P4 (>30 MeV), P5 (>50 MeV), P6 (>60 MeV), and P7 (>100 MeV). However, GOES-09 and 14 missions, and channels P6 and P7 on GOES-12 have failed (Rodriguez et al. 2014). Nonetheless, measurements are available from as many as nine GOES satellites, from GOES-05 to GOES-15.

NOAA's Space Weather Prediction Center (SWPC) provides radiation storm products based on proton intensity levels as observed by SEM's particle sensors (Rodriguez et al. 2014; Kress et al. 2020). The severity of the proton events is measured using the NOAA Solar Radiation Storm Scale (Sscale). SWPC's S-scale relates to biological impacts and effects on technological systems. The S-scale relies on the ≥10 MeV integral peak proton flux that characterizes an SEP event's size or intensity, although different peak fluxes logarithmically define different event sizes. The base threshold, associated with an S1 storm, corresponds to a GOES 5 minutes averaged ≥10 MeV integral proton flux exceeding 10 particle flux units (1 pfu = 1 particle cm $^{-2}$  sr s) for at least three consecutive readings (Bain et al. 2021). As can be seen in Table 1, many studies do not always conform to this definition because multiple enhancements or rises in the proton flux are considered in one SEP event. Differences in event definition occur due to different needs in research and operations, making it hard to achieve a harmonized data treatment.

## 3. Source Catalogs

We consider three SEP event catalogs developed using GOES data as sources: PSEP (Papaioannou et al. 2016),

<sup>&</sup>lt;sup>a</sup> https://cdaw.gsfc.nasa.gov/CME\_list/sepe/

b https://umbra.nascom.nasa.gov/SEP/

c http://www.wdcb.ru/stp/solar/solar\_proton\_events.html

CDAW-SEP<sup>4</sup> and NOAA-SEP.<sup>5</sup> We classify the former two as "primary" and the latter as "reference" data.

#### 3.1. PSEP Catalog

Papaioannou et al. (2016) developed a catalog of 314 well-defined SEP events by statistically studying the relationship between SEP events and possible source eruptions such as flares and CMEs. For each event, they calculated the SEP onset times per event and per channel using the so-called  $\sigma$  method (for details see Papaioannou et al. 2014). This catalog is based on cleaned differential proton fluxes from EPS made available directly by the the Solar Energetic Particle Environment Modeling (SEPEM) Team (Crosby et al. 2015). The cleaned EPS data set spans over 40 yr (1974–2016) and has been cross calibrated by Sandberg et al. (2014) with data from the Goddard Medium Energy instrument on IMP-8. Papaioannou et al. (2016) define an SEP event based on the following threshold parameters:

- 1. a threshold of 0.01 particles cm<sup>-2</sup> sr s MeV (differential flux) above which a possible enhancement was marked;
- 2. a minimum peak of 0.5 pfu of the candidate event;
- 3. a waiting time of 2 hr between two consecutive candidate events;
- 4. a minimum event duration of 2 hr.

#### 3.2. CDAW-SEP Catalog

The series of Coordinated Data Analysis Workshops (CDAW) was organized to analyze the set of all major SEP events (>10 MeV protons crossing the ≥10 pfu threshold) detected by NOAA's GOES spacecraft (Gopalswamy et al. 2002, 2003b). The CDAW-SEP list has 152 events from 1997 to 2017 identified using integral proton data. The only criterion used for event selection was the peak proton flux crossing 10 pfu in the 10 MeV channel following the NOAA S1 standard. Each SEP event in the CDAW-SEP list, the associated flares and CMEs, and their properties are identified when available (Gopalswamy et al. 2003a, 2015). All the information is compiled and extended from an earlier report by Gopalswamy (2003, 2012). SEP events from SC 23 and 24 are studied by Gopalswamy et al. (2004, 2005, 2014), Makela et al. (2015), Thakur et al. (2016), and Xie et al. (2016).

# 4. GSEP Events List

The preliminary data-processing and work structure in the integration and development of the catalog is illustrated in Figure 1.

#### 4.1. GOES Data

We utilize the integral proton fluxes measured on board GOES-05 to 15 that are archived on the NOAA website. Lower-energy fluxes corresponding to the P1 channel were not used because of their high sensitivity to interplanetary disturbances. We performed a visual inspection of GOES data to understand flux enhancements and identify the more accurate

observational sources. Although the design of EPS and EPEAD on board GOES has not changed, some variations in the measurements have occurred between satellites. As the instruments were built with passive shielding, measurements are affected by significant side- and rear-penetration effects, i.e., particles can pass through the shielding from any direction and be counted as though they had entered through the nominal detector entrance aperture (Posner 2007; Bruno 2017). This is crucial as the differences in sensor data could impact the identification of an event and its timing in cases where the flux levels are near the event threshold. For instance, in the intercalibration of GOES 815 solar proton detectors by Rodriguez et al. (2014), it was reported that the relative responses between GOES primary and secondary agree to within  $\pm 20\%$  while varying during a significant event. Based on a calibration study of the EPSs on board GOES-05, -07, -08, and -11, Rodriguez et al. (2017) validated the derived cross calibrated energies by comparison with the STEREO data. In their study, they utilize the integrated proton fluxes calculated using the algorithm developed by R. Zwickl in 1989. See the Appendix of Rodriguez et al. (2017) for the details of the algorithm.

In light of this significant/known instrument-to-instrument variation, we carefully identified reliable missions by comparing the time-intensity plots of primary and secondary GOES instruments for all the observed event periods. To illustrate this, Figure 2 shows the difference in the flux-level enhancements between primary (GOES-06) and secondary (GOES-05) satellites for an SEP event during SC 22. Therefore, it is not a straightforward option to utilize data from the primary GOES satellite. The differences in the measurements of solar proton fluxes between the GOES primary and secondary are due to the geomagnetic cutoff, i.e., the effect of variation of the magnetic field configuration with geomagnetic longitude (Rodriguez et al. 2014). Therefore, we consider the strongest proton signal as the best for two reasons: (1) the corrected fluxes have been checked with intercalibration and (2) the peak values of the strongest signals closely match with those reported in the CDAW-SEP and NOAA-SEP lists. We performed additional data processing that ensured a compromise with imputable data gaps on better sensory responses of the instruments. That is, if the primary (secondary) GOES has a better response, but with more data gaps than the secondary (primary) GOES, then we consider the GOES primary (secondary) as a reliable data provider. We impute all the data gaps with linear interpolation. In addition, the EPEAD data were inspected for differences in enhancements between the "East" and "West" channels. According to Rodriguez et al. (2010), the East-West effects are more relevant at lower energies. We have examined all SEP event temporal profiles and observed up to  $\pm 190\%$  (in SC 22),  $\pm 90\%$  (in SC23), and  $\pm 30\%$  (in SC 24) differences between the primary and secondary source energy channels.

#### 4.2. Integration of Catalogs

The SEP events from the PSEP and the CDAW-SEP catalogs are integrated into Geostationary Solar Energetic Particle (GSEP) events list of this paper. In addition, we utilize the NOAA-SEP list as a reference catalog. That is, each event in the GSEP list is cross-checked with the reference catalog. Furthermore, a binary secondary source verification indicator is given in the metadata, where 0 represents that no source was found in the NOAA-SEP list, changing to 1 if found.

<sup>4</sup> https://cdaw.gsfc.nasa.gov/CME\_list/sepe/

<sup>5</sup> ftp.swpc.noaa.gov/pub/indices/SPE.txt

<sup>&</sup>lt;sup>6</sup> SEPEM Reference Data Set (RDS): http://sepem.eu/help/SEPEM\_RDS\_v2-01.zip.

https://www.ngdc.noaa.gov/stp/satellite/goes/index.html

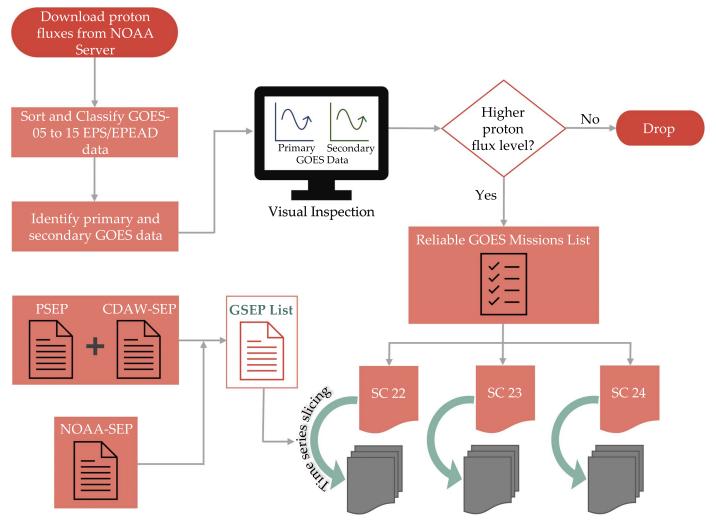


Figure 1. Process flow diagram indicating the background work of GOES data inspection, verification, and slicing in this work. The time-series slices are generated from the GSEP metadata. For details, see the text.

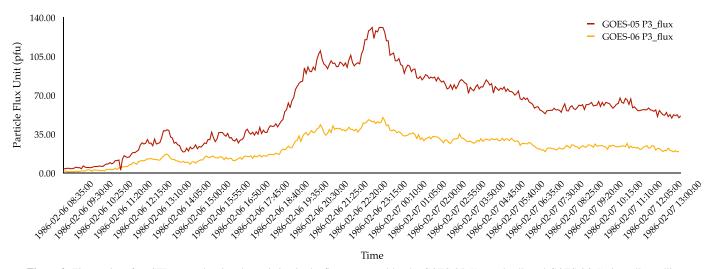
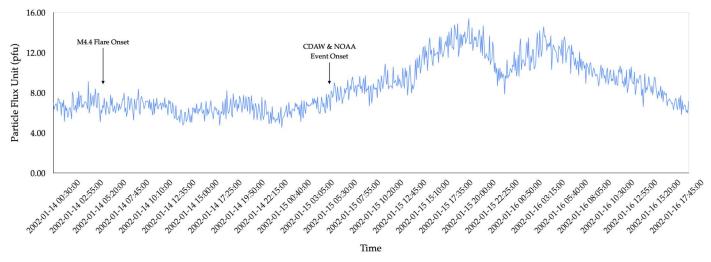


Figure 2. Time series of an SEP event showing the variation in the fluxes captured by the GOES-05 ("secondary") and GOES-06 ("primary") satellites.

The PSEP and CDAW-SEP catalogs contain many valuable parameters related to temporal characteristics, integrated flux information, and solar-source metadata. Details on the SEP events' start time, peak time, and peak-flux value in the >10 MeV channel are provided. They also report associations

of SEP events with a parent solar eruption. Information such as the event coordinates about the associated flare and CME is provided as well. This information is used to determine if the entries in the PSEP, CDAW-SEP, and NOAA-SEP catalogs represent the same event, notwithstanding the minor



**Figure 3.** Time profile of an SEP event occurring between 2002 January 14 and 16. The time series begins with the event start time (2002 January 14 00:30:00) according to the PSEP catalog. A solar flare of magnitude M4.4 occurs at 05:30:00 followed by a CME 6 minutes later from the western limb. The second arrow points to the onset of the SEP event (2002 January 15 05:35:00) as considered by the CDAW-SEP and NOAA-SEP catalogs. The event start time differs by >29 hr compared to PSEP. For this event, both catalogs report the same solar source (flare and CME). We retain the event onset as reported in the CDAW-SEP list.

differences in temporal characteristics, i.e., if they happened simultaneously with the same enhancements or if they vary and are eventually different events.

#### 4.3. Challenges

Key challenges we had to address in integrating multiple catalogs were overlapping events, repetitions, and different criteria in event start time, peak time, and the corresponding peak fluxes. Different catalogs implemented different data calibration methods as well. To illustrate with the example of different onset criteria, a time-series plot of GSEP event 211 is shown in Figure 3. Here, PSEP considers the event onset prior to an M4.4 class solar flare and >29 hr ahead compared to the CDAW-SEP (2002 January 14 00:30:00 and 2002 January 15 05:35:00, respectively). The associated flare had a rise time of 58 minutes and is followed by a CME erupting behind the western limb. We take into consideration the start time as reported in CDAW-SEP as it accounts for the SWPC threshold of a significant SEP event. The event peak is observed on 2002 January 15 at 20:00:00 to reach a maximum of 15 pfu in the >10 MeV channel.

In the above example, although both source catalogs refer to the same event, the difference in start time is due to the criterion (like the event threshold) in considering a distinct onset. Such dissimilarities between catalogs have been verified with the time profiles. Also, plots available from NOAA<sup>8</sup> were used to cross verify our time-series plots and conclude whether an event occurred or crossed the NOAA threshold on a specific date.

#### 4.4. Description of the Catalog

Our integrated catalog gathers SEP event records from multiple sources and provides relevant metadata useful for space weather research. The headers in the GSEP list and their descriptions are presented in Table 2. The majority of the SEP events have been captured by the primary GOES instrument. However, a total of 19 events were observed by the secondary instrument. Among them 13 events are in SC 22, and three for

each of SCs 23 and 24. The final catalog has observed source instrument flag "P" or "S" indicating whether the event was measured in the primary or secondary GOES instrument, respectively.

#### 4.5. Time-series Slices

The plots of time-series slices from the GSEP list consist of:

- 1. electron fluxes (channels E2 and E3, i.e., >2.0 MeV and >4.0 MeV);
- 2. proton fluxes (channels P2 to P7, i.e., from >5.0 MeV to >100.0 MeV).

Here, the integral fluxes are derived from the observations of GOES/EPS from 1986 to 2012 and GOES/EPEAD from 2013 to 2017. Each value in time-series data represents a 5 minute interval. The length of each time profile denotes the events' start and end times. These characteristics, which help describe the flux evolution and the data quality, provide visual information for selecting events for further analysis.

To summarize, we downloaded the GOES integral fluxes and classified the data into respective instruments. We visually inspected the primary and secondary observations to understand the overlaps, data gaps, and intensity variations. We merged the data in series for each SC. Finally, we sliced the GOES particle fluxes with reference to the onset/start time and the observed end time of each SEP event as defined in the GSEP list. The identification metadata is encoded in the file names of time-series data instances. We use the SEP event initiation as a default reference time. The best and simplest form we opted for contains the event date and time that correspond to the time stamp of the event onset; for example, 2017-09-10\_04-25.csv). We also assign and maintain the correspondence between our index and the indices in the primary source catalogs.

#### 5. Results

Integrating the primary catalogs, we have obtained 335 unique events. However, after comparing with the reference one, six more events were included. In the course of this work, we discussed with NASA's Space Radiation Analysis Group

https://satdat.ngdc.noaa.gov/sem/goes/data/plots/

Table 2
Header Description in the GSEP List

Header Description in the GSEP List					
Header	Description				
sep_index	Index for the GSEP events list				
pp_id	Event identifier in the PSEP catalog				
cdaw_sep_id	Event identifier in the CDAW-SEP list				
timestamp	Start time of the event in PSEP				
cdaw_start_time	Start time of the event in CDAW-SEP				
cdaw_max_time	Event peak time in CDAW-SEP				
cdaw_evn_max	Event peak flux in CDAW-SEP				
cme_id	Identifier of the CME in the LASCO CME catalog				
cme_launch_time	Start time of the CME				
cme_1st_app_time	First appearance time of the CME				
lasco_cme_width	Width of the CME in the LASCO catalog				
p_cme_width	Width of the CME in PSEP				
lasco_linear_speed	CME velocity reported by LASCO				
p_cme_speed	CME velocity reported by PSEP				
fl_id	Autogenerated unique flare identifier				
fl_start_time	Start time of the flare				
fl_peak_time	Time of flare maximum				
fl_rise_time	Time taken to reach peak				
fl_lon	Longitude of flaring region				
fl_lat	Latitude of flaring region				
fl_goes_class	GOES flare classification				
noaa_ar	NOAA active region number				
noaa_ar_uncertain	Flag for NOAA active region number uncertainty				
harpnum	HMI Active Region Patch (HARP) number corresp-				
	onding to the originating NOAA AR				
noaa_pf10MeV	Peak flux in the NOAA-SEP >10 MeV channel				
ppf_gt10MeV	Peak flux in the PSEP >10 MeV channel				
ppf_gt30MeV	Peak flux in the PSEP >30 MeV channel				
ppf_gt60MeV	Peak flux in the PSEP >60 MeV channel				
ppf_gt100MeV	Peak flux in the PSEP >100 MeV channel				
fluence_gt10MeV	Peak fluence in the PSEP >10 MeV channel				
fluence_gt30MeV	Peak fluence in the PSEP >30 MeV channel				
fluence_gt60MeV	Peak fluence in the PSEP >60 MeV channel				
fluence_gt100MeV	Peak fluence in the PSEP >100 MeV channel				
gsep_pf_gt10MeV	Peak flux in the GSEP >10 MeV channel				
gsep_max_time	Event peak time in GSEP				
m_type2_onset_time	Metric type II radio burst start time				
dh_type2_onset_time	Decameter-hectometric (DH) type II radio burst start time				
noaa-sep_flag	1 if present in NOAA-SEP; 0 otherwise				
Inst_category	GOES instrument category: P for primary; S for secondary				
Comments	Retained from PSEP				
Notes	Retained from PSEP				
Fe_e_p_shock_notes	Retained from PSEP				
gsep_notes	Data observational notes, if any				
slice_start	Start time of the slice				
slice_end	End time of the slice				

**Note.** The catalog is available at Harvard Dataverse at doi:10.7910/DVN/DZYLHK.

(SRAG) to validate our SEP events list. Hence, a total of 341 events are available in the GSEP catalog from 1986 to 2017. The time-series profile for each event has been visually inspected to confirm the event definition. Of these, 96 events fall under the weak enhancement category (peak flux <10 pfu at >10 MeV), while 245 events achieve a peak flux >10 pfu in the >10 MeV channel over the past three SCs. In Table 3, the number of events is provided according to the flux enhancements in different levels of the NOAA solar radiation storm scale. Here, S0 is a custom scale used to denote a subevent of

Table 3

Number of SEP Events with Respect to the NOAA Solar Radiation Storm
Scale in the 10 MeV Channel across the Last Three SCs

Scale (flux level in pfu)	SC22	SC23	SC24
S0 <sup>a</sup> (<10)	48	34	14
S1 ( $\geq 10$ to $< 10^2$ )	49	61	31
S2 ( $\geq 10^2$ to $< 10^3$ )	21	31	10
S3 ( $\geq 10^3$ to $< 10^4$ )	14	13	6
$S4 (>10^4)$	3	6	0
Total	135	145	61

#### Note.

proton fluxes below 10 pfu. As the PSEP catalog has no records beyond 2013, the number of subevents in the GSEP catalog for SC24 is lesser as compared to the prior two cycles.

An important property we want to address is the timescales of SEP events. We retained the criteria followed by the source catalogs PSEP and CDAW-SEP. During SC22, all events' start times are based on PSEP. For cycles 23 and 24, we choose CDAW-SEPs' criteria and switch to PSEP or NOAA-SEP when discrepancies occur. That is, for an event, whenever there is a CDAW-SEP onset available, it is visually verified to see if the temporal profile matches the event definition. If yes, then the CDAW-SEP onset is used. Else, we prefer PSEP. In Figures 4(a)–(c), we present rise-time distributions for both weak enhancements and strong events (S1 and above) for the three latest SCs. It can be seen that the majority of the events last more than 6 hr over the rising phase, and several events take more than 24 hr to reach peak proton fluxes. A great number of events have the rising phase predominant anywhere from 24 to 48 hr while some events take more than 48 hr to reach peak proton fluxes. Interestingly, this trend has reduced with the SC. In addition, a few large events in the last two SCs take more than 72 hr to reach peak fluxes.

In some cases with complicated SEP event temporal profiles, the peak flux occurs after an initial, or a pair of, peaks. Although initial peaks could directly reflect the parent (SF or CME) properties, later peaks may be due to particle transport effects (Kihara et al. 2020). Regardless, it is the proton fluence (i.e., the time-integrated flux) that determines doses which are crucial when space weather effects are considered.

In the GSEP list, the NOAA active region number is available for 297 SEP events. Full source information (i.e., a flare and a CME) exists for 164 events. Nonetheless, 145 SEP events are associated with flares only, and 24 SEP events are associated with CMEs only. Because the necessary CME data is unavailable for SC 22, the numbers for CME-SEP association are less. For 309 SEP events where a source flare could be determined, 84 events are weak and 225 events are large. There are two SEP events with no recorded flare peak time, five SEP events with no recorded GOES flare class, and 12 SEP events (nine in SC 22 and three in SC 23) with no reference to the flare location. There are eight SEP events (three in SC 22 and five in SC 23) in the GSEP list that do not have any source association. Three of these events have weak proton enhancements. Among the five large SEP events, three are flagged as probable energetic storm particle events by SRAG.

In terms of a sensory response to measure protons, the peak flux recorded by the primary GOES instrument is better than

<sup>&</sup>lt;sup>a</sup> S0 is a custom label to indicate a subevent.

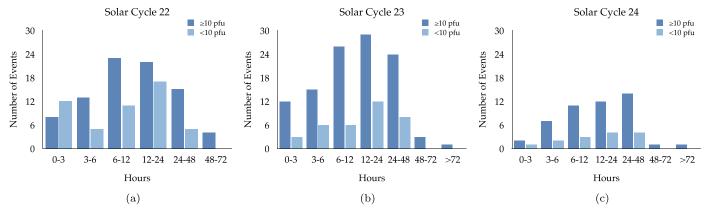
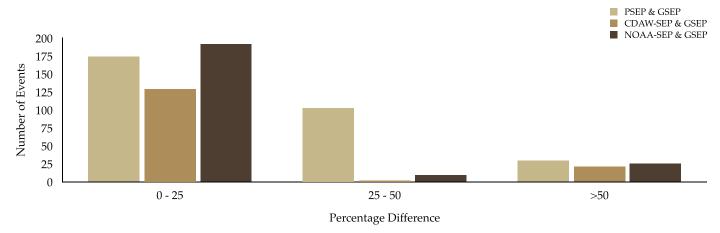


Figure 4. Histograms of rise times (i.e., times elapsed between onset and peak flux) for the GSEP events. Shown are numbers of SEP events vs. their rise times, classified in bins of 0-3, 3-6, 6-12, 12-24, 24-48, 48-72, and >72 hr. Weak enhancements (<10 pfu for protons >10 MeV) and events above the NOAA S1 scale are included in (a)–(c) for SCs 22, 23, and 24, respectively.



**Figure 5.** Distribution of the absolute percentage differences classified in bins of 0–25, 25–50, and >50% in the peak proton fluxes between GSEP and (a) PSEP, (b) CDAW-SEP, and (c) NOAA-SEP.

Table 4

SEP Events Reported in PSEP with Peak Fluxes <10 pfu but Observed to Be >10 pfu in the GSEP List

tart time noaa max time gsep max time ppf gt10MeV noaa pf10MeV

sep_index	event_start_time	noaa_max_time	gsep_max_time	ppf_gt10MeV (PSEP)	noaa_pf10MeV (NOAA-SEP)	gsep_pf_gt10MeV (GSEP)
gsep_034	1989-06-18 15:00:00	1989-06-18 19:10:00	1989-06-18 20:25:00	9.24	18	10.8
gsep_058	1989-11-15 07:05:00	1989-11-15 09:10:00	1989-11-15 09:05:00	4.85	71	38.3
gsep_062	1990-03-28 13:50:00	1990-03-29 10:05:00	1990-03-29 10:05:00	2.14	16	15.9
gsep_086	1991-03-31 21:25:00		1991-04-03 09:10:00	3.04	•••	25.5
gsep_117	1992-03-16 04:35:00	1992-03-16 08:40:00	1992-03-16 09:00:00	9.11	10	10.4
gsep_130	1993-03-06 21:15:00		1993-03-07 07:10:00	9.73	•••	10.8
gsep_195	2001-09-15 12:20:00	2001-09-15 14:55:00	2001-09-15 14:55:00	9.49	12	11.6
gsep_200	2001-10-19 17:45:00	2001-10-19 22:30:00	2001-10-19 22:30:00	9.53	12	11.7
gsep_295	2011-10-22 12:15:00	•••	2011-10-23 15:35:00	7.88	•••	13.1

the secondary in the majority of the cases. Nonetheless, the peak values reported by PSEP, CDAW-SEP, and NOAA-SEP differ from the GSEP metadata on several occasions. In Figure 5, the distribution of percentage difference comparing the GSEP list with the PSEP and CDAW-SEP catalogs is shown.

A comparative summary between the GSEP and the PSEP and CDAW-SEP catalogs is given below:

- 1. GSEP and PSEP lists:
  - (a) 280 out of 303 events from the PSEP catalog are within  $\pm 50\%$  difference in the peak-flux enhancements with respect to GSEP.
- (b) There are nine events where PSEP records a peak flux of <10 pfu, but GSEP records >10 pfu. Out of these, five events are close enough with fluxes between 9 to 12 pfu, while differences in the remaining four events are significant. All these events are listed in Table 4 in Appendix A.
- (c) PSEP event 185 (psep185) reports same proton fluxes as event 186 (psep186). This could be a possible computational or human error because the episode appears to be entangled. It is a relatively weak event and of a short duration. However, we did not merge the two events because they are associated with

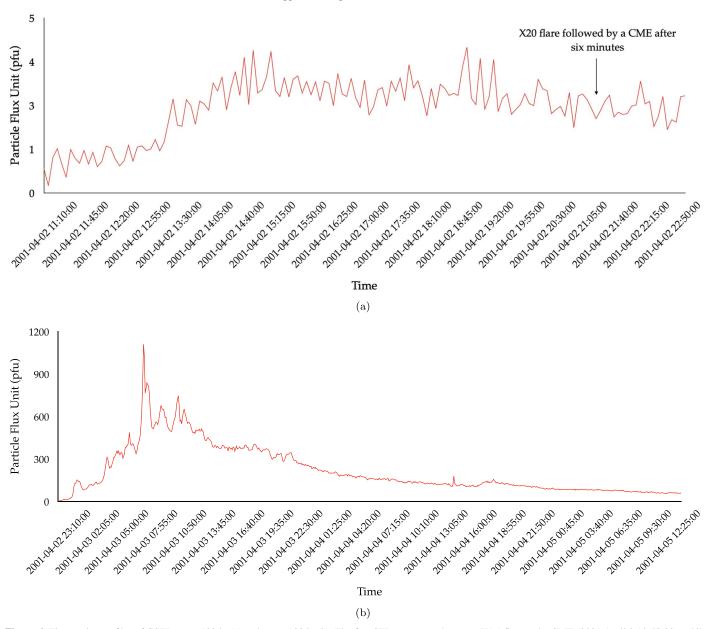


Figure 6. Time-series profiles of GSEP event 182 in (a) and event 183 in (b). The first SEP event was due to an X1.1 flare and a CME (2001 April 2 10:58:00), while the second event was triggered due to an X20 flare (2001 April 2 21:32:00) and a CME erupted after 6 minutes. Both events originated from NOAA AR 9393.

distinct solar sources, both flares and CMEs (see Appendix B).

#### 2. GSEP and CDAW-SEP lists:

- (a) 126 out of 150 events have peak-flux enhancements agreeing within  $\pm 20\%$ .
- (b) Slight discrepancies exist for extremely large events (with peak proton fluxes at least >1500 pfu).
- (c) Due to the variation in the event identification criteria, some of the event peaks have been missed by the CDAW-SEP.

#### 3. GSEP and NOAA-SEP lists:

- (a) 189 events are within ±20% difference in the peakflux enhancements.
- (b) Seven events with higher differences correspond to extremely large events (of peak proton fluxes at least >1500 pfu).

# 6. Conclusions

We present an integrated Geostationary Solar Energetic Particle Events Catalog (GSEP) created from a set of available SEP event catalogs based on the particle fluxes of GOES missions from 1986 to 2017. We homogenized the SEP events from two primary catalogs (Papaioannou et al. 2016 and CDAW-SEP) by filtering all events, i.e., removing overlapping and repetitive episodes. Then we cross-checked the SEP events with the reference, i.e., the NOAA-SEP list. Every entry in the catalog is assigned a new index for SEPs with reference to the indices of the source catalogs. The metadata provides an association of an SEP event to the corresponding source solar eruption, where available. The main summary of the paper is as follows:

1. There are 341 SEP events in the GSEP list. Within that, 245 events have peak proton fluxes >10 pfu in the >10 MeV channel.

- The particle fluxes of each event are visually inspected for errors and variations by parallel comparison of time profiles.
- 3. The fluxes are further sliced with respect to the event start and end times as reported in the GSEP metadata.
- 4. The headers in the GSEP list describe physical descriptors (both those stored in the source catalogs and calculated by us) and carry relevant indicators (data quality, observed GOES instrument, and parallel reports.)
- 5. The time-series slices are published as a data set to implement machine learning or other statistical analysis for experimenting on SEP event forecasting.

This work provides a catalog from which users can explore SEP events with parameters of interest for various statistical studies and machine-learning exercises. Also, it provides a reference to various parameters for each event, allowing researchers to understand if the event satisfies the criteria for case studies. Our approach is to contribute to the SEP research community with a combined database and present additional data for each event. The integrated GSEP catalog provides a one-stop database for researchers to study SEP events using an extensive, long-term data archive.

Our GSEP data set is available at Harvard Dataverse at doi:10.7910/DVN/DZYLHK. The plots and statistics presented in this study are based on version 4.0 of the data set.

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#### Appendix A Weak Events in PSEP

In Table 4 below, the nine events that are reported in PSEP with peak proton fluxes below 10 MeV are listed. The index refers to the event number in the GSEP list. The next column indicates the event onset followed by event maximum time stamp as reported in NOAA-SEP and GSEP. The last three columns show the peak proton fluxes (in pfu) from the PSEP, NOAA-SEP, and GSEP lists, respectively.

# Appendix B Entangled SEP Events

In Figure 6, the time profiles of two SEP events (182 and 183) in the GSEP list are shown. The latter is a very large event, while the former is apparently a weak event with peak proton flux of 4 pfu at >10 MeV. On 2001 April 2, the first SEP event appears to be associated with an X1.1 flare at 10:58:00, while an X20 flare at 21:32:00 leads to the second SEP event. The flaring active region (9393) is positioned at the

western hemisphere of the Sun while erupting. Both the SEP events are associated with distinct CMEs, detected after the respective flares.

# **ORCID iDs**

Sumanth Rotti https://orcid.org/0000-0003-1080-3424 Berkay Aydin https://orcid.org/0000-0002-9799-9265 Manolis K. Georgoulis https://orcid.org/0000-0001-6913-1330

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