# Relationship between solar wind, $D_{st}$ , and plasmasphere mass density on one-hour time scales

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#### Abstract

This paper compares various magnetosphere conditions around the onset of geomagnetic events. It confirms results from previous papers that a sudden drop in  $D_{st}$  correlates with a spike in equatorial mass density under certain conditions, while adding a level of depth and specification to the applicability of their results. It compares data at 1-hour averages to data at 1-day averages to examine if the trend holds at varying time scales and finds that it does, so long as the data is pre-processed to linearly remove a large time scale  $F_{10.7}$  dependence. By then looking at an hourly average of parameters from 24 hours before event onset to 48 hours after, short timescale trends can be discerned.

#### Introduction

Takahashi et al. [2006], show how trends in storm dependence on mass/density only appear in longer timescales. Looking at  $K_p$  vs mass (amu) in the range of 6 to 7  $R_E$ , a trend shows up in the 1.5 day averages that doesn't appear in the 3 hour averages.

Denton et al. [2006] show how  $D_{st}$  affects the distribution of plasma density along different magnetic latitudes, and specifically along the same field lines as looked at in later papers (6-8 $R_E$ ). Though this shows that the trends for density may differ between field lines, it's mentioned mostly as a point for future research as the data used in this paper is already adjusted for one field line, as described by Takahashi et al. [2010].

Yao et al. [2008] looks at the differences in how  $D_{st}$  correlates with number density for different ions in different regions (ring current and plasma sheet), but still finds a general correlation during each of the four storms selected.

Takahashi et al. [2010] state that spikes in the Disturbance Storm Time  $(D_{st})$  index coincide with with significant changes in  $\rho_{eq}$  at an L-shell of  $6.8R_E$ . For five storms over a 20 day period two had  $\rho_{eq}$  spikes after the  $D_{st}$  drop, two had  $\rho_{eq}$  spikes before the drop,

and one showed little change in  $\rho_{eq}$ . They then show an epoch analysis where  $\rho_{eq}$  is seen to spike the day of a  $D_{st}$  drop, using a daily average of 30 minute  $\rho_{eq}$ and one hour  $D_{st}$  measurements.

## 2 Data Preparation

The parameters  $\rho_{eq}$  used in this work is from the dataset associated with Denton [2007], with data available from 1980-1991 on a non-uniform 10 minute grid. The  $F_{10.7}$  parameter comes from the OMNIWeb data collection at NASA Goddard Space Flight Center and covers 1980-2000 on an hourly grid, but with one daily value repeated for each hour of the day. All other parameters are from Kondrashov et al. [2014] over the time range of 1972-2013, which are on a 1hour time grid.  $\rho_{eq}$  is the inferred mass density based on the 3rd harmonic frequency of magnetic field measurements. The smallest cadence for  $\rho_{eq}$  values is 10 minutes. To compute an hourly average over the same time range as the solar wind parameters, the median of all values in a given hourly range was used. Fill values were used for hours when no measurements were available. In cases where  $\rho_{eq}$  was available from multiple Geostationary Operational Environmental Satellites (GOES) satellites at the same time in the Denton [2007] dataset, the value from GOES 6 was selected to avoid overlapping data points. In the dataset, measurements from GOES 6 had the longest time span of coverage. An overview of the data is given in Figure 1.

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In this work events are defined to occur when  $D_{st}$  or  $\rho_{eq}$  crosses a threshold value, as indicated in by horizontal dashed lines in the respective panels of Figure 1. In finding events, all fill values were replaced with linearly interpolated values. Figure 1 shows the values of  $B_z$ ,  $V_{SW}$ ,  $D_{st}$ ,  $F_{10.7}$ , and Mass Density for the duration of the dataset.

#### 3 Results

Figure 1 shows values of solar wind averages and mass density used in this study. We will briefly compare our results to other published results to verify our methods and handling of data.

## 3.1 Previous Results

Figure 2a shows the long-term trends of  $log(\rho_{eq})$  and  $F_{10.7}$  by computing the median in 27-day windows using all non-fill hourly values. A scatter plot of these two lines is shown in Figure 2b. The linear correlation is found to be 0.87. In comparison, Takahashi et al. [2010] found a correlation coefficient of 0.94 using measurements from all satellites in the time interval of 1980 to 1992.

The correlation seen between 27-day averages  $log(\rho_{eq-27d})$  and  $F_{10.7-27d}$  isn't quite as good in this data as in Takahashi et al. [2010], but shows the same trend as seen in Figure 2.

Figure 3 show that the trends observed by Takahashi et al. [2010] for one day averages only seems to hold true for the one-day averaged data. Namely that a drop in median daily  $D_{st}$  between 1989 and 1991 coincides with a significant spike in  $\rho_{eq}$ .

## 3.2 $D_{st}$ Events

Two event indicators are looked at in this study. The first is looking for a drop in DST below the threshold of -40nT specified in Takahashi et al. [2010], dubbed the "onset", and then considering the timeframe an event until  $D_{st}$  passes back above the -40nT threshold. This method finds 669 such periods between May 1983 and August 1991 with an average duration of 9 hours and a median duration of 3 hours. Figure 5 shows the average values of all events over a window of 24 hours before onset and 48 hours after. Figure 5a shows events selected by looking for event onsets where  $D_{st}$  crossed a threshold of -40nT. The dashed red lines indicate plus and minus one standard deviation of values from all events that went into the average. The final plot in the stack shows both  $\rho_{eq}$  and a bar plot of how many valid data points went into the  $\rho_{eq}$  average. Since  $\rho_{eq}$ 

comes from a sparser dataset, it has less valid points contributing to the averages than the other parameters in the stack. A subset of longer duration events will be looked at later.

This figure shows a definite spike in the Z component of the magnetic field, as well as the defined drop in DST, but no obvious change in mass density at an hourly timescale. This points to an issue with only looking at long-timescale trends between density and  $D_{st}$ , and allows for the possibility that other factors are influencing the long term correlation since there's no obvious connection on a short timescale. One possibility is that, as suggested in Takahashi et al. [2010],  $F_{10.7}$  plays a significant role in driving long term density values which biases the long term correlation of density and  $D_{st}$ .

#### 3.3 Mass Density Events

Figure 5b shows this same algorithm, but looking for a rise in mass density over a value of  $40g/cm^3$ . This results in 130 events with a mean duration of 32 hours and a median duration of 17 hours, marked in red on the left figure.

This shows that when using all data for mass density derived events, almost no significant changes can be seen around event onset.

#### 4 More specific events

It's hypothesized that progressively picking more specific event criteria will allow for the possibility of more significant results, at the expense of more bias in the selection process and potentially less overall usefulness of the results. That said, the predictability of extreme events is of definite interest, so an attempt has been made to find some reproducible method of prediction. Looking at events that last longer than 12 hours and events with an onset threshhold greater than  $70g/cm^3$  results in the left and right sides of Figure 6 respectively.

Neither of these seem to indicate anything too significant, so looking at  $D_{st}$  events instead to look for something that causes a significant change in Mass Density results in Figure 7. This shows that by either looking only at  $D_{st}$  events that last longer than an hour (left) or at events where the onset condition is  $D_{st} < -80nT$ , a spike in mass density is seen, but also a definite lack of data availability to the point where that spike may be coming from less than five of the total 143 events.

Unfortunately there are no events in this time frame that are longer than 12 hours with  $D_{st}$  minima lower than -80nT that have existing mass density data around onset, so an analysis of this particular relationship can't be made.

## 4.1 Change in $\rho_{eq}$

If instead of looking for events based on a threshold of  $\rho_{eq}$ , we instead look for a certain amount of change in  $\rho_{eq}$  as the basis for event onset, we get Figure 8.

Both raw change and percent change were done in case of bias towards high or low  $\rho_{eq}$  periods, respectively. This shows a distinct lack of correlation in either case to a change in  $D_{st}$ . The percent change in  $\rho_{eq}$  does, however, seem to be preconditioned by changes in  $B_z$  and  $F_{10.7}$ .

#### 5 F10.7 dependence

In an effort to analyze the dependence of  $\rho_{eq}$  on  $F_{10.7}$ , a few tests were performed. Takahashi et al. [2010] mention a strong correlation between the two. The long term correlation could be a bias for  $D_{st}$ 's effects, so a linear model was created, recreating mass density purely from  $F_{10.7}$  in the form of  $\rho_{eq}(t) = A * F_{10.7}(t)$ . This re-created  $\rho_{eq}$  shows around a 45% correlation with the actual  $\rho_{eq}$ , suggesting a strong influence, while doing the same procedure with DST shows only a 20-25% correlation.

Taking this re-created data set and subtracting it from the original should remove the  $F_{10.7}$  dependence from the data, and allow for a less biased analysis of the relationship between  $D_{st}$  and  $\rho_{eq}$ . Figure 9 shows the stack plot for the reduced  $F_{10.7}$ , where a more distinct peak after event onset can be seen. It also shows what that removed trend looks like, of the form  $\rho_{eq} - \rho_{eq,F_{10.7}}$ .

## 6 Appendix

#### 6.1 Bias

While attempting to reproduce Figure 11 from Takahashi et al. [2010], an ambiguity in datahandling was found. It is unknown how they got from hourly  $\rho_{eq}$  to daily medians, whether in one step or two steps, and whether the hourly medians are an hour ahead of each hour grid point, or a median of points a half hour to either side, so attempts were made to reproduce all possibilities and compare in order to find a data-handling method with the least bias. These attempts are shown in Figure 10. This also shows the effect of only considering events with a minimum before noon. All show a similar spike in

 $\rho_{eq}$  at the time of  $D_{st}$  minimum, though none quite reproduce the exact values seen in Takahashi et al. [2010]. Figure 11 shows where the median falls for all of the found events during that period, as a sanity check for why the prior work would get median values nearing  $30amu/cm^3$ . Both authors of this paper conducted independent trials to confirm that the data and analysis don't quite yield the results of Figure 11 in Takahashi et al. [2010] with the processes described in that paper, but the same general trend is still seen.

To check for potential bias in the data as used by our analysis, we checked how the data availability varied with hour, shown in Figure 12. We also looked at how storm conditions affected data availability. Both a two sample t-test for difference in means and a Wilcoxon rank sum test showed significance at the 1% level that  $D_{st}$  during periods with available data was of a different distribution than  $D_{st}$  during periods missing data. When testing for other significant  $D_{st}$  differences, the Wilcoxon test was significant while the t-test was not in pre-noon vs post-noon distributions, as well as  $\rho_{eq} > 40$  vs  $\rho_{eq} < 40$  distributions indicating perhaps an increase in variability without an increase in mean.

While the GOES Satellites tend to keep an average geostationary distance of around  $L=6.8R_E$  shown in Takahashi et al. [2010], the actual plasmapause location varies significantly, as shown in O'Brien and Moldwin [2003]. This means that during periods of large  $D_{st}$  the plasmapause may be far from the point of measurement of  $\rho_{eq}$  creating a discord in the correlation. Gallagher et al. [2000] provides a model for  $\rho_{eq}$  at a range of L-shells and a brief discussion of the elemental contributions.

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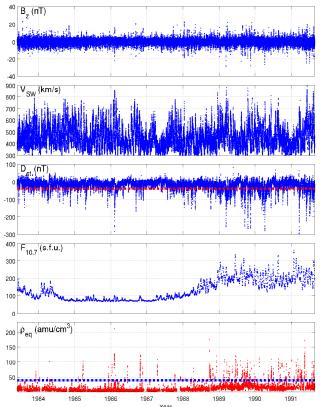


Figure 1: Overview of data used in this study. The top four panels show parameters from Kondrashov et al. [2014] and the bottom panel is based on  $\rho_{eq}$  from Denton [2007] after interpolation and averaging described in the text. Dashed horizontal lines in the  $D_{st}$  and  $\rho_{eq}$  panels indicate sample event cutoff thresholds of  $D_{st}=-50~nT$  and  $\rho_{eq}=40~amu/cm^3$ 

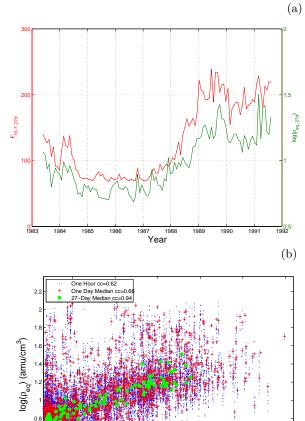


Figure 2: (a) All data of  $F_{10.7,27d}$  and  $\rho_{eq,27d}$ . (b) Correlation between  $log(\rho_{eq})$  and  $F_{10.7}$  at hour, day, and 27-day intervals; compare to Takahashi et al. [2010] Fig. 14

F<sub>10.7</sub> (s.f.u.) <sup>250</sup>

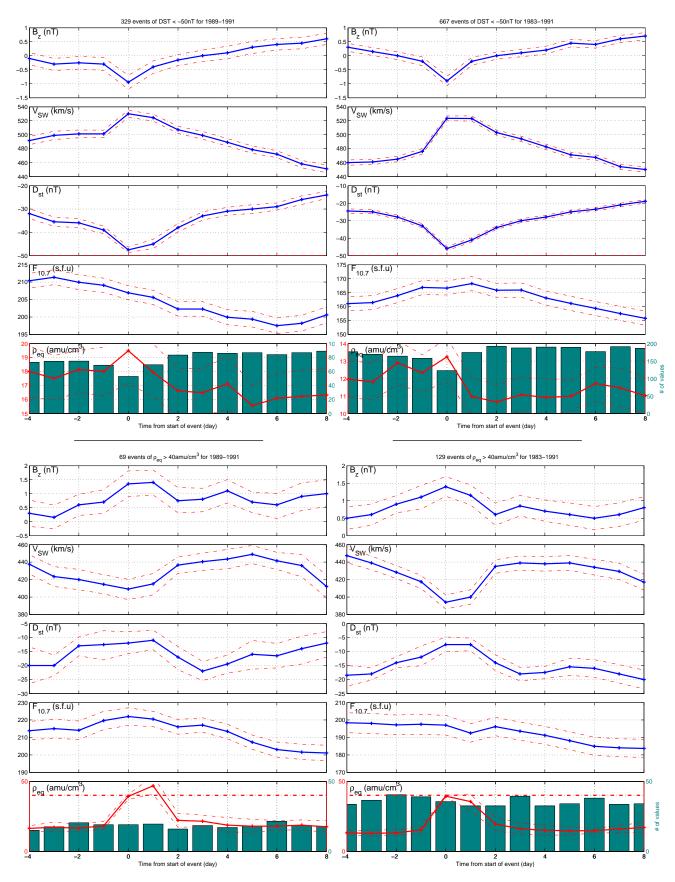
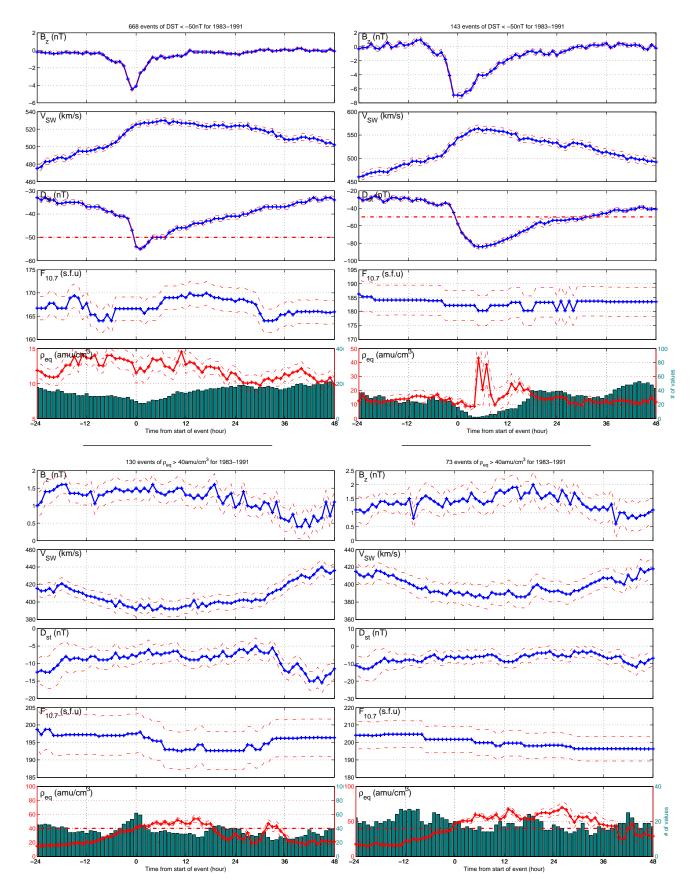


Figure 3: (a) Verifying Takahashi et al. [2010] Fig. Figure 4: Daily averages for all events in full time 11 conditions:  $D_{st}<-50nT$  between 1989 and 1991 range for (a)  $D_{st}<-50~nT$  events and (b)  $\rho_{eq}>$  and (b) Same as (a) but for  $\rho_{eq}$  events



measurements around the time  $D_{st}$  crossed below straint that  $D_{st}$  stayed below  $-50 \ nT$  for at least -50 nT onset. (b) Same as (a) except around  $^7$  12 hours. (b) Same as Figure 5(b) except for contime intervals where mass density crossed above strain that  $\rho_{eq}$  stayed above 50  $amu/cm^3$  for at least  $40 \ amu/cm^3$ . The bottom panel shows the number of mass density data points that were used for the

Figure 5: (a) Average of solar wind and near-Earth Figure 6: (a) Same as Figure 5(a) except with con-12 hours.

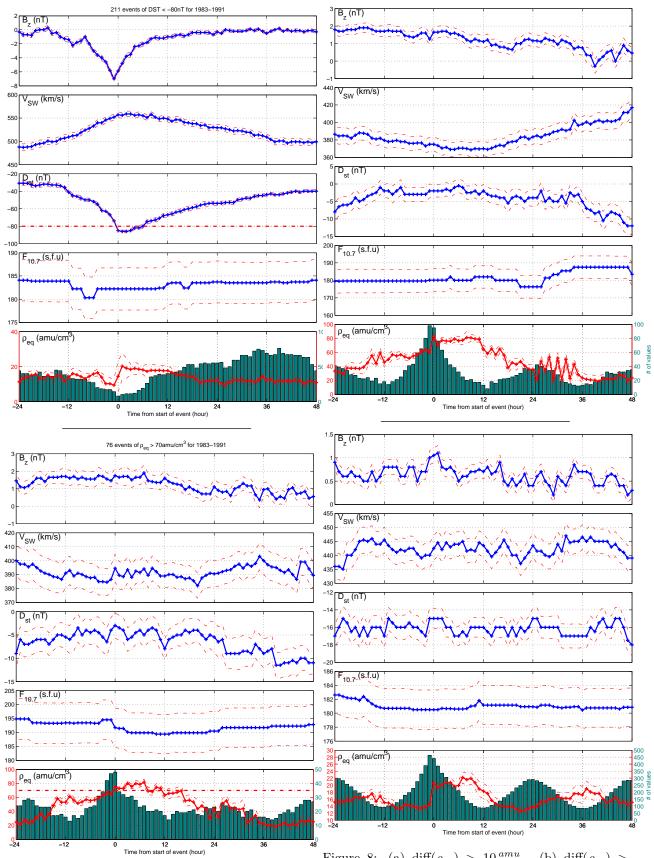


Figure 7: (a) Same as Figure 5(a) except with constraint that  $D_{st}$  crossed below -80nT (b) Same as Figure 5(b) except for constrain that  $\rho_{eq}$  crossed 8 above 70  $amu/cm^3$ .

Figure 8: (a) diff( $\rho_{eq}$ ) >  $10\frac{amu}{hour}$ . (b) diff( $\rho_{eq}$ ) >  $30\frac{\%}{hour}$ 

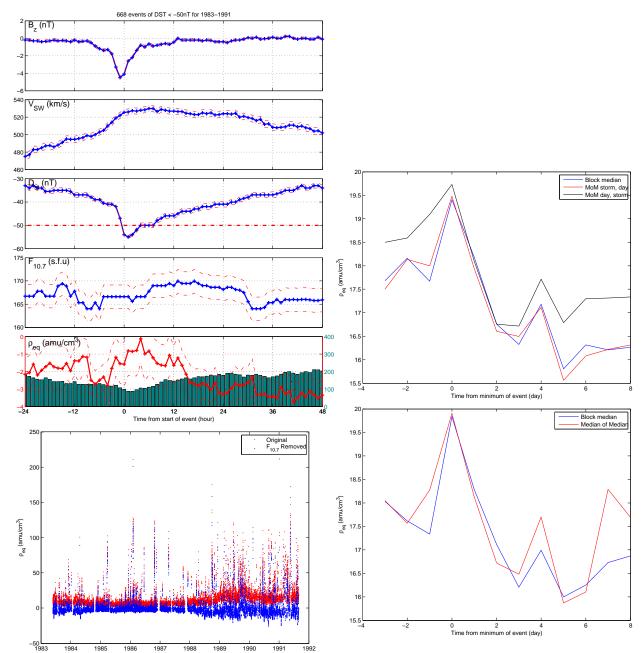


Figure 9:  $D_{st}$  events where  $\rho_{eq}$  has  $F_{10.7}$  dependence removed, and Difference between original  $\rho_{eq}$  and  $F_{10.7}$ -less  $\rho_{eq}$ 

Figure 10: Comparing median values calculated as median of all 1-hour points in the 12 day block, and as the daily median of all hourly-mediated events. (b) Same, but only events starting between 0-12 UTC

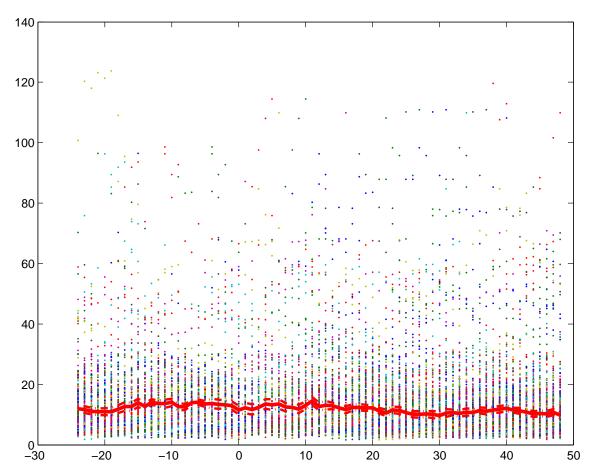


Figure 11: Comparing all events to their median and  $1\sigma$  range

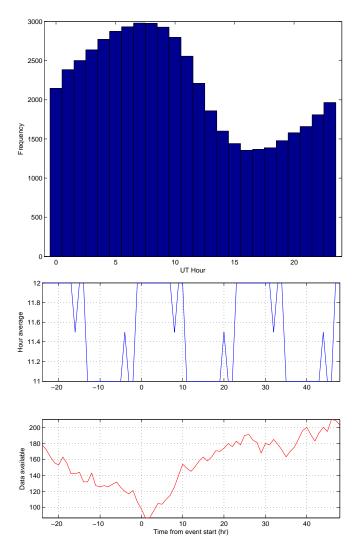


Figure 12: (a) Number of NaN points per hour of observation in the total data set (b)  $\rho_{eq}$  data availability relative to average event hour in events where  $D_{st} < -80nT$