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# **RESEARCH ARTICLE**

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## **Special Section:**

Studies of the 2018/Mars Year 34 Planet-Encircling Dust Storm

#### **Key Points:**

- We reconstruct subdaily maps of column dust optical depth for Martian year 34 to be used for data analysis and modeling
- We observe seasonal, daily, and diurnal variability in the column dust, notably during the global dust event (GDE)
- Simulations with a global climate model examine the impact of the GDE on the atmospheric circulation and diurnal variability of column dust

#### **Supporting Information:**

- Supporting Information S1
- Supporting Information S2Figure S1
- Figure S1

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# Martian Year 34 Column Dust Climatology from Mars Climate Sounder Observations: Reconstructed Maps and Model Simulations

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**Abstract** We have reconstructed longitude-latitude maps of column dust optical depth (CDOD) for Martian year (MY) 34 (5 May 2017– 23 March 2019), using observations by the Mars Climate Sounder (MCS) aboard NASA's Mars Reconnaissance Orbiter spacecraft. Our methodology works by gridding a combination of standard (v5.2) and novel (v5.3.2) estimates of CDOD from MCS limb observations, using an improved "Iterative Weighted Binning." In this work, we have produced four gridded CDOD maps per sol, at different Mars Universal Times. Together with the seasonal and daily variability, the use of several maps per sol also allows us to explore the diurnal variability of CDOD in the MCS dataset, which is shown to be particularly strong during the MY 34 equinoctial global dust event (GDE). In order to understand whether the diurnal variability of CDOD has a physical explanation, and examine the impact of the MY 34 GDE on some aspects of the atmospheric circulation, we have carried out numerical simulations with the "Laboratoire de Météorologie Dynamique" Mars Global Climate Model. We show that the model is able to account for at least part of the observed CDOD diurnal variability. This is particularly true in the southern hemisphere where a strong diurnal wave at the time of the GDE is able to displace dust horizontally as well as vertically. The simulations also clearly show the impact of the MY 34 GDE on the mean meridional circulation and the super-rotating equatorial jet, similarly to the effects of the equinoctial GDE in MY 25.

**Plain Language Summary** Large dust storms on Mars have dramatic impacts on the entire atmosphere but may also have critical consequences for robotic and future human missions. Therefore, there is compelling need to produce an accurate reconstruction of their spatial and temporal evolution for a variety of applications, including to guide Mars climate model simulations. The Martian year 34 (5 May 2017–23 March 2019) represents a very interesting case because an extreme dust event occurred near the time of the northern autumn equinox, consisting of multiple large dust storms engulfing all longitudes and most latitudes with dust for more than 150 Martian days ("sols"). We have used satellite observations from the Mars Climate Sounder instrument aboard NASA's Mars Reconnaissance Orbiter to reconstruct longitude-latitude maps of the opacity of the atmospheric column due to the presence of dust at several times in each sol of Martian year 34. These maps allow us to analyze the seasonal, day-to-day, and day-night variability of dust in the atmospheric column, which is particularly intense during the extreme dust event. We have also used simulations with a Mars climate model to show that the strong day-night variability may be partly explained by the large-scale circulation.

# 1. Introduction

Martian dust aerosols are radiatively active, and the dust cycle—lifting, transport, and deposition—is considered to be the key process controlling the variability of the Martian atmospheric circulations on a wide range of time scales (see e.g. the recent review by Kahre et al., 2017, and references therein). Dust storms are the most remarkable manifestations of this cycle and one of the most crucial weather phenomena in need of study to fully understand the Martian atmosphere.

Martian dust storms are: 1. a source of strong atmospheric radiative forcing and alteration of surface energy budget (e.g. Streeter et al., 2020); 2. a major component of the atmospheric interannual, seasonal, daily, and

diurnal variability (see Kleinböhl et al., 2020, for an example related to the diurnal variability); 3. a way to redistribute dust on the planet via long-range particle transport (as inferred, for instance, using albedo changes: Szwast et al., 2006); 4. a means of producing perturbations of temperature and density, which propagate from the lower to the upper atmosphere, including the lower thermosphere, the ionosphere, and the magnetosphere (e.g. Girazian et al., 2020; Xiaohua et al., 2020); 5. a cause of increased loss of chemical species via escape (e.g. Fedorova et al., 2018; Heavens et al., 2018; Xiaohua et al., 2020); and 6. a source of hazards for spacecraft entry, descent, and landing maneuvers, for operations by solar-powered surface assets, and for future robotic and human exploration (e.g. Levine et al., 2018). Dust storms on Mars can be studied by using a variety of approaches: analysis of observations from satellites and landers/rovers, numerical simulations from global climate models (GCMs), and data assimilation techniques.

One of the most dramatic and (thus far) unpredictable events linked to Martian dust storms is the onset of a global dust event—hereinafter GDE. In the literature, these events are also named "planet-encircling dust storms" (e.g. Cantor, 2007; Zurek & Martin, 1993), "global dust storms" (probably the most common name), or "great dust storms" (e.g. Zurek, 1982). Here we choose the denomination "global dust event" because 1. even large regional storms can inject dust high enough in the atmosphere, which eventually encircles the planet; 2. these global dust events are usually characterized by several storms occurring simultaneously, or one after the other one in rapid succession; and 3. the GDE denomination was already discussed and used in Montabone and Forget (2018) and is currently adopted by several authors. However, in this paper we also argue that the key characteristics of this kind of events is their "extreme" nature, rather than their "global" nature, for which the denomination "extreme dust events" would probably be even more appropriate. The Mars scientific community will need in future to define a consensus-based terminology for dust events, based on scientific arguments and measurable variables, as it is the case for other kinds of meteorological events (see, for instance, the distinction among terrestrial tropical depressions, tropical storms, and hurricanes).

In the last Martian decade (Martian year—hereinafter MY—25 to 34), spanning nearly two Earth decades from 2000 to 2019, three GDEs occurred: an equinoctial event in MY 25, a solstitial event in MY 28, and another equinoctial event in MY 34, starting only a few mean solar days—sols—after the corresponding onset of the MY 25 event. GDEs inject a large amount of dust particles into the Martian atmosphere, strongly modify the thermal structure and the atmospheric dynamics over several months (i.e. several tens of degrees of areocentric solar longitude,  $L_{\rm S}$ , see e.g. Montabone et al., 2005; Wilson & Hamilton, 1996) and impact the Martian water cycle and escape rate (Fedorova et al., 2018; Heavens et al., 2018). Similar events were previously observed in MYs 1, 9, 10, 12, 15, and 21 (Cantor, 2007; Martin & Zurek, 1993; Montabone & Forget, 2018; Sánchez-Lavega et al., 2019). The interannual variability of GDEs is irregular and likely controlled at the first-order by the redistribution of dust on Mars over the timescale of a few years (Mulholland et al., 2013; Newman & Richardson, 2015; Vincendon et al., 2015).

The latest equinoctial GDE had its initial explosive growth in early northern fall of MY  $34 (L_S approximately$  in the range  $185^{\circ} - 190^{\circ}$ , i.e. late May 2018 – early June 2018). A regional dust storm started near the location of the Mars Exploration Rover "Opportunity." The visible opacity quickly reached a very high value of 10.8, which led to the end-of-mission of the Opportunity rover, with last communication received on 10 June 2018. The regional dust storm then moved southward along the Acidalia storm track and expanded both in the northern hemisphere from eastern Tharsis to Elysium (including the location of the Mars Science Laboratory "Curiosity" rover and the landing site of "InSight") and towards the southern hemisphere (Hernández-Bernal et al., 2019; Kass et al., 2019; Malin & Cantor, 2018; Sánchez-Lavega et al., 2019; Shirley et al., 2020).

The evolution of this MY 34 GDE in summer 2018 has been closely monitored by three of NASA's orbiters, including the Mars Reconnaissance Orbiter (MRO) and its Mars Climate Sounder (MCS) instrument (Kass et al., 2019), two of ESA's orbiters (Mars Express and the ExoMars Trace Gas Orbiter), the ISRO's Mangalyaan orbiter, and ground-based telescopes (Sánchez-Lavega et al., 2019). It has also been observed in detail from the surface by the Curiosity rover, which could still operate in dust storm conditions thanks to its nuclear-powered system. From meteorological observations carried out aboard Curiosity with the Rover Environmental Monitoring Station (REMS), Guzewich et al. (2019) concluded that the local optical depth reached 8.5, the incident total UV solar radiation at the surface decreased by 97%, the diurnal range of air temperature decreased by 30 K, and the semidiurnal pressure tide amplitude increased to 40 Pa. Curiosity

did not witness dust lifting within the Gale Crater site, which indicates that the increase in dust loading at its location is the result of dust transport from outside the crater area.

Beyond the undoubtedly interesting GDE, MY 34 also features the development of an unusually intense and large late-winter regional storm, whose peak value of column dust optical depth (CDOD) is only rivaled by the late-winter regional storm in MY 26 (reaching 75% of the peak value of the former). It is, however, reminiscent of the two global events that were successively monitored by the Viking landers in 1977 at  $L_{\rm S} = 205^{\circ}$  and  $L_{\rm S} = 275^{\circ}$  (Ryan, 1979; Zurek, 1982). Overall, therefore, MY 34 represents a unique year for studies linked to the onset/evolution of dust storms and their impact on the entire Martian atmospheric system. Consequently, there is a compelling need to produce an accurate reconstruction of the spatial and temporal evolution of the dust optical depth in MY 34, particularly covering the GDE, but also putting the unprecedented weather measurements acquired by the InSight lander during the late-winter regional storm into global context (Spiga et al., 2018).

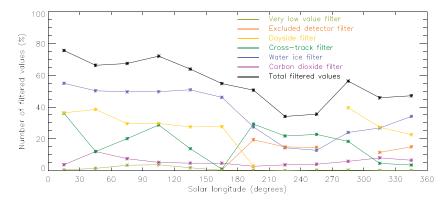
Montabone et al. (2015) developed a methodology to grid values of CDOD retrieved from multiple polar orbiting satellite observations, such as NASA's Mars Global Surveyor, Mars Odyssey, and MRO. Using this methodology (a combination of "Iterative Weighted Binning"—IWB—and kriging spatial interpolation), they were able to produce multi-annual datasets of daily CDOD maps extending from MY 24 to MY 33, which are publicly available on the Mars Climate Database (MCD) project webpage at http://www-mars. lmd.jussieu.fr/ (look for "Martian dust climatology" on the MCD webpage). The datasets include both irregularly gridded maps (because of the presence of missing grid point values after the application of the IWB, where observations are not available) and regularly kriged ones. The kriged maps can be used as a daily, column-integrated "dust scenario" to prescribe or guide the evolving atmospheric dust distribution in numerical model simulations.

In this paper we describe how we make use of newly processed dust opacity retrievals from thermal infrared observations of the MRO/MCS instrument (McCleese et al., 2007) in order to reconstruct maps of column dust optical depth specifically for MY 34 and describe aspects of the two-dimensional dust climatology. In section 2, we discuss the improvements both to the MCS retrievals and to the gridding methodology described in Montabone et al. (2015). In section 3, we analyze in general terms the CDOD variability at seasonal timescale and, in specific terms, the daily evolution of the GDE and late-winter dust storm. We also address the diurnal variability observed when reconstructing multiple CDOD maps per sol. In section 4, we use simulations with the Laboratoire de Météorologie Dynamique Mars GCM (LMD-MGCM) in order to 1. assess some of the impacts of the MY 34 GDE on the Martian atmospheric circulation (in this case the model dust distribution is guided by the kriged maps) and 2. verify that the GCM is able to reproduce at least part of the diurnal variability observed in the reconstructed multiple CDOD maps per sol (in this case the model dust distribution is only initiated using the kriged maps but is not subsequently guided). Conclusions are drawn in section 5.

# 2. Building Column Dust Optical Depth Maps

The methodology described in Montabone et al. (2015) to grid CDOD values using the IWB, and to spatially interpolate the daily maps using kriging, has been applied to observations by Mars Global Surveyor/Thermal Emission Spectrometer (TES), Mars Odyssey/Thermal Emission Imaging System (THEMIS), and MRO/MCS from MY 24 to MY 32. For MY 33, because of the progressive change in local time of THEMIS observations, we have introduced a weighting function specific for the THEMIS dataset in order to favor the MCS dataset (i.e. we simply apply a 0.5 weight to THEMIS CDODs during the first iteration with the time window of 1 sol, reduced to 0.1 for the subsequent iterations using larger time windows. The impact of THEMIS observations is therefore reduced to 50% or 10% with respect to MCS ones). As mentioned in the introduction, version 2.0 (v2.1 for MY 33) of both irregularly gridded maps and regularly kriged ones (we refer to the latter as the column-integrated "dust scenario" in this paper) are available on the MCD project website.

For the specific case of the MY 34 GDE, the MCS team has updated their retrievals of temperature, dust, and water ice profiles. We have correspondingly updated the gridding/kriging methodology with the aim of producing a more refined and accurate climatology, both for scientific studies and for the use in numerical model simulations. Therefore, in the following we describe how we reconstruct CDOD maps for MY 34



**Figure 1.** Percentage number of column dust optical depth values flagged by each individual filter in the quality control procedure within 30°  $L_S$  ranges in MY 34 (color lines), together with the percentage total number of filtered column dust optical depths after the application of the complete quality control procedure (black line). The numbers are associated to the middle of each 30°  $L_S$  range. Note that the "excluded detector" filter does not apply before  $L_S = 179^\circ$  and for 269° <  $L_S < 312^\circ$ , and that the "dayside" filter does not apply during the global dust event (186.5°  $\leq L_S \leq 269^\circ$ ).

(currently version 2.5). We provide some details about the differences between current and previous versions (i.e. v2.2, v2.3, and v2.4) in Appendix A.

#### 2.1. Observational Dataset

In MY 34, single THEMIS CDOD retrievals are no longer available. Because of the late local time of THEMIS observations in MY 34, Smith (2019) had to develop a "stacking" algorithm that assesses how a group of THEMIS spectra in a  $L_S$ /latitude bin change as a function of estimated thermal contrast. Therefore, we do not use THEMIS anymore in MY 34, and we completely rely on estimated CDODs from MCS.

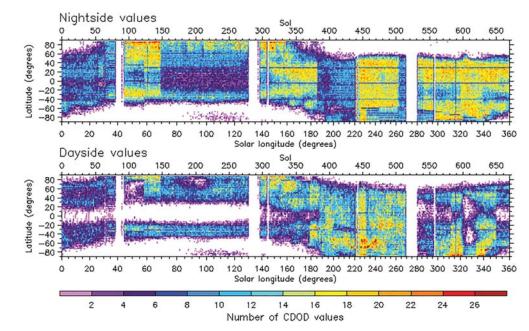
Dust opacity retrievals from thermal infrared observations of the MCS instrument aboard MRO are described in Kleinböhl et al. (2009), Kleinböhl et al. (2011), and Kleinböhl, Friedson, et al. (2017). The currently standard MCS dataset, based on the v5.2 "two-dimensional" retrieval algorithm specifically described in (Kleinböhl, Friedson, et al., 2017), has been reprocessed by the MCS team for the time of the MY 34 GDE to obtain better coverage in the vertical and, therefore, more reliable estimates of CDOD values during the event (Kleinböhl et al., 2020). This latest MCS dataset, only available between 21 May 2018 ( $L_S \approx 179^\circ$ ) and 15 October 2018 ( $L_S \approx 269^\circ$ ), and labelled v5.3.2, is an interim version that includes the use of a far infrared channel for retrievals of dust. The differences between MCS retrievals version 5.2 and 5.3 are as follows:

- Use of B1 detectors to extend the dust profile retrieval: the dust extinction efficiency in channel B1 at 32  $\mu$ m is only about half the value of channel A5 at 22  $\mu$ m (Kleinböhl, Chen, et al., 2017), which is the primary channel for dust retrievals, allowing profiles to extend deeper by 1 to 1.5 scale heights;
- Accepting a higher aerosol to CO<sub>2</sub> gas opacity ratio along the line of sight in the temperature retrieval channel A3;
- Modifications for determining surface temperature when there are no matching on-planet views (primarily cross-track views) to improve the performance under high dust conditions when the array is lifted and limb views do not intersect the surface.

CDODs are estimated by integrating the dust opacity profiles after an extrapolation from the lowest altitude at which profile information is available, under the assumption of homogeneously mixed dust (see Figure 1 of Kleinböhl et al., 2020, as well as Figure 15 in this paper). For the reconstructed CDOD maps in MY 34, we use MCS v5.3.2 estimated CDODs from  $L_{\rm S} \approx 179^{\circ}$  to  $L_{\rm S} \approx 269^{\circ}$  and MCS v5.2 otherwise.

#### 2.2. Data Quality Control

A general discussion about the limitations of using CDOD estimates from MCS is included in Montabone et al. (2015), specifically section 2.1.2. As mentioned in the previous subsection, the extended vertical coverage in MCS v5.3.2 helps estimate CDODs more accurately. In the present work, therefore, we have improved the definition of the quality control (QC) procedure with respect to the one used in Montabone et al. (2015), particularly by allowing a more extensive use of dayside observations. We define dayside observations as those with local times (lt) in the range 09:00 < lt  $\leq$  21:00, although most of dayside observations at low



**Figure 2.** Number of nightside (upper panel) and dayside (lower panel) values of column dust optical depth available for gridding after passing the quality control procedure described in the text. The number of values is summed in 1 sol  $\times$  2° latitude bins, and plotted as a function of time and latitude, where time is shown both as sol from the beginning of MY 34 and as areocentric solar longitude. Dayside observations are defined to have local times between 09:00 (excluded) and 21:00 (included), whereas nightside observations are defined to have local times between 00:00 and 09:00 (included) as well as between 21:00 (excluded) and 24:00. CDOD = column dust optical depth.

latitudes have local times close to 15:00. Nightside observations are defined as those outside the dayside range, with most nightside observations at low latitude having local times close to 03:00.

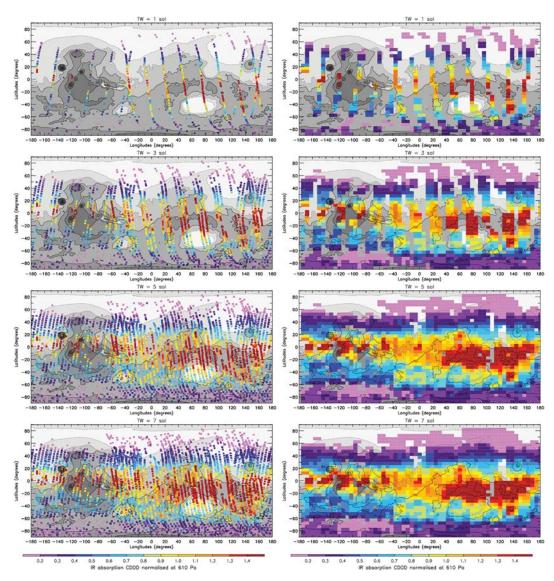
We need to stress that, despite the improvements in MCS v5.3.2, the main issue for estimating column optical depths using limb observations remains the fact that many opacity profiles have rather high cutoff altitudes (particularly dayside ones, see also right column of Figure 5), due to either dust or water ice opacities that are too large. During the dust storms, cutting off due to dust and extrapolating over a big altitude range under the assumption of homogeneously mixed dust provide reasonable CDODs, although increase the uncertainty on the column values. However, when the profile is cutoff due to water ice, the dust column is poorly constrained due to the extrapolation. Because water ice clouds are a dominant source of questionable CDOD values, especially on the dayside, we specifically apply stringent filters when we suspect that the dust opacity is likely contaminated by the water ice opacity. Conversely, we relax our filtering for dayside values during the dust storms, when water ice clouds are not likely to be present.

Note that MCS is also able to observe cross-track, thus providing information within a range of local times at selected positions during the MRO orbits (Kleinböhl et al., 2013). We have also better defined a dust quality flag in MCS v5.3.2 to help filter those observations where a significant number of detectors were excluded in the retrieval of the dust opacity profile, because of radiance residuals exceeding threshold values (Kleinböhl et al., 2009). Each excluded detector corresponds to a truncation of about 5 km in the reported profile compared to the altitude range that was originally selected by the retrieval algorithm based on line-of-sight opacity.

We apply the following QC procedure to the MCS CDOD values at 21.6 µm in extinction:

- To discard values when they are most likely contaminated by  $CO_2$  ice (i.e. if, at any level below 40-km altitude, the temperature is  $T < T_{CO_2} + 10$ K, and the presumed dust opacity is larger than  $10^{-5}$  km<sup>-1</sup>);
- To discard values when water ice opacity is greater than dust opacity at the cutoff altitude of the corresponding dust profile;
- To discard cross-track CDODs with cutoff altitudes higher than 8 km (i.e. the corresponding dust opacity profiles do not extend down to 8-km altitude or lower), because they are likely to produce questionable CDODs;





**Figure 3.** This figure shows longitude-latitude gridded maps (right column) built using column dust optical depth observations (left column) selected within four iterative time windows (TW = 1, 3, 5, and 7 sols, from top to bottom). All maps have MUT = 12:00 and are representative of the sol-of-year (SOY) 400,  $L_S \approx 196^\circ$ , in the growth phase of the global dust event (The SOY is the integer sol number starting from SOY=1 as first sol of the year). The column dust optical depths are infrared (IR) absorption (9.3 µm) values normalized to 610 Pa. The rows from top to bottom illustrate the application of the iterative weighted binning procedure (including the use of the four subsequent time windows) at a fixed MUT. The final result of the iteration is the map in the bottom right position.

- Dayside values are specifically filtered based on a cutoff altitude that depends on the MCS retrieval version and the amount of ice that is present. The threshold cutoff altitude is 8 km during the icy MCS v5.2 data period prior to  $L_{\rm S} = 179^{\circ}$ . It increases to 16 km during the icy MCS v5.3.2 data period prior to the start of the GDE ( $179^{\circ} < L_{\rm S} < 186.5^{\circ}$ ). There is no threshold cutoff altitude during the GDE with v5.3.2 available ( $186.5^{\circ} \le L_{\rm S} \le 269^{\circ}$ ). The threshold cutoff altitude was reinserted at 8 km after the GDE with icy conditions and MCS v5.2 data in the period  $269^{\circ} < L_{\rm S} \le 312^{\circ}$ . During the late-winter regional dust storm under less icy conditions, the MCS v5.2 data threshold cutoff altitude was again increased to 16 km ( $312^{\circ} < L_{\rm S} < 350^{\circ}$ ) to return to 8 km after the end of the storm and following possible presence of the ice clouds ( $L_{\rm S} \ge 350^{\circ}$ );
- To discard CDODs when more than one detector is excluded inside the limits of the MCS v5.3.2 (179°  $\leq L_{\rm S} \leq 269^{\circ}$ ) as well as if any detector is excluded in MCS v5.2 during the late-winter dust storm (312°  $< L_{\rm S} < 350^{\circ}$ );

• To assign a fixed value of 0.01 to very low values of CDOD < 0.01 having cutoff altitude higher than 4 km.

We plot in Figure 1 the percentage number of CDOD values that are flagged by each individual filter, together with the total of the filtered values after the application of the complete QC procedure. The total does not correspond to the sum of each single filter, as a CDOD value can be flagged by multiple filters. This figure clearly shows that the presence of water ice in spring and summer strongly affects the number of CDOD values passing the QC. Dayside values are also problematic because their corresponding dust profiles usually have rather high cutoff altitudes, compared to nightside values. Cross-track values have the tendency to exhibit rather high cutoff altitudes as well and lead to questionable column dust optical depths. As a consequence, a large number of them at low- and mid-latitudes are discarded throughout the year. Observations where more than one detector was excluded in the retrieval are about 20% throughout MCS v5.3.2. The number of values filtered because of possible carbon dioxide ice contamination is relatively low throughout the year (less than 10%).

After QC, the number of available values is plotted in Figure 2, separated into nightside and dayside values. The aphelion cloud belt and the winter polar hoods are mainly responsible for the lack of data at equatorial latitudes in the dayside plot and at high-latitudes in both dayside and nightside plots. The implementation of the new "water ice" filter is effective in reducing the probability that the lowest levels of the dust profiles are contaminated by the presence of clouds, but there is a risk of filtering out retrievals that actually may have been usable, particularly at high latitudes. A refinement of this filter should be addressed in future work. Vertical bands with no data are periods when MCS did not observe.

#### 2.3. Data Uncertainties and Processing

Together with the QC procedure, we have also revised the empirical method to estimate the uncertainties on the MCS CDOD values at 21.6  $\mu$ m in extinction, with respect to the one used in Montabone et al. (2015). We apply the following relative uncertainties:

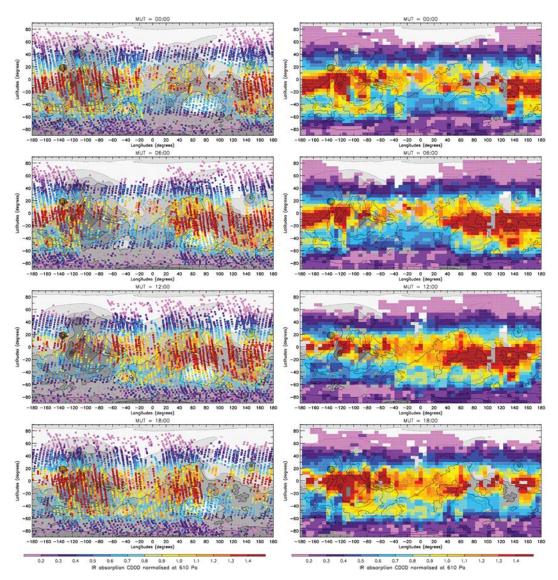
- 10% for CDOD values < 0.01 having cutoff altitude higher than 4 km (i.e. for those values replaced with CDOD = 0.01);
- 5% for CDOD values < 0.01 or values with cutoff altitudes lower than 4 km;
- When  $CDOD \ge 0.01$  or cutoff altitude  $\ge 4$  km, we assign the largest relative uncertainty between the one calculated as a linear function of  $CDOD \left(\frac{15}{1.49} \cdot CDOD + \frac{7.3}{1.49}\right)$  and the one calculated as a linear function of the cutoff altitude  $\left(\frac{25}{21} \cdot \operatorname{alt} + \frac{5}{21}\right)$ . The two functions are defined in such a way that, for instance, the uncertainty is 5% if CDOD = 0.01 or cutoff altitude = 4 km, 20% if CDOD = 1.5, and 30% if cutoff altitude = 25 km.

As detailed in Montabone et al. (2015), further data processing consists in converting MCS CDODs from 21.6  $\mu$ m in extinction to absorption only 9.3  $\mu$ m by multiplying by the factor 2.7, to be consistent with the climatologies of the previous MYs. We then normalize the values to the reference pressure level of 610 Pa, but instead of using the surface pressure value calculated by the MCD preso routine (Forget et al., 2007), we now use the same surface pressure value used for the corresponding MCS retrieval. MCS retrieves pressure at the pointing altitude where it is most sensitive to pressure (typically 20–30 km, see Kleinböhl et al., 2020), from which surface pressure can be extrapolated with an uncertainty estimate based on pointing uncertainty. In conditions where a pressure derived from the climatological Viking surface pressure (Withers, 2012). In this case, the uncertainty of the surface pressure is derived from the daily root mean squared of surface pressure from the MCD v5.3, interpolated at the specific location and season of an observation using a pre-built 5°  $L_S \times 5^\circ$  latitude array (as described in section 2.3 of Montabone et al., 2015).

#### 2.4. Gridding Methodology

In this work we closely follow the basic principles of reconstructing CDOD maps, which are detailed in section 3 of Montabone et al. (2015). IWB is applied to CDOD values and uncertainties at 9.3  $\mu$ m in absorption, normalized to 610 Pa, to produce gridded values on a 6° longitude  $\times$  5° latitude map. The current criterion to accept a value of weighted average at a particular grid point at any given iteration is that there must be at least one observation within a distance of 200 km from the grid point; otherwise, a missing value ("Not-a-Number", or NaN) is assigned to that grid point. The other used parameters as listed in Table 1 of Montabone et al. (2015) for MCS remain the same.

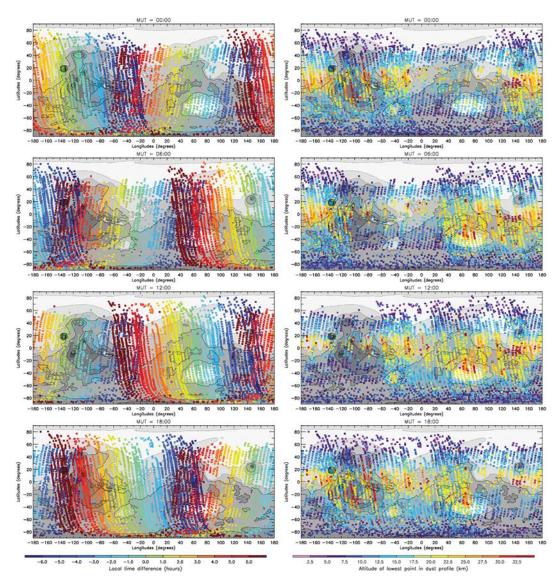




**Figure 4.** This Figure shows longitude-latitude gridded maps (right column) built using column dust optical depth observations (left column) selected within a time window of 7 sols (after the iterative application of time windows of 1, 3, and 5 sols, as in Figure 3) at four different Mars Universal Times: MUT = 00:00, 06:00, 12:00, and 18:00, from top to bottom. These maps are representative of the four different MUTs in sol-of-year (SOY) 400,  $L_S \approx 196^\circ$ , in the growth phase of the global dust event (This is the same SOY shown in Figure 3 only for MUT = 12:00). The column dust optical depths are infrared (IR) absorption (9.3 µm) values normalized to 610 Pa. Each row of this figure illustrates how the last iteration of the iterative weighted binning procedure is applied to eventually produce one map every 6 hr.

The application of the IWB for a sol in the growth phase of the GDE when the Mars Universal Time (i.e. the local time at 0° longitude) is MUT = 12:00 (noon) is shown in Figure 3. In the left column we plot the CDOD observations effectively used for gridding, while in the right column we plot the result of the gridding. The time window (TW) for considering single observations increases from 1 to 7 sols going from the upper to the lower row. All four iterations are applied when reconstructing a map, and each iteration with larger TW only fills NaN grid points left by the previous iterations with smaller TWs. By doing this, each map is always built around the most up-to-date observations, usually provided by the iteration with TW = 1 sol (unless there are missing observations for one or more sols). In general, the value of each valid grid point of a map is assigned using observations within the smallest possible TW. For this reason, daily maps respond to rapidly changing events, such as the onset of a dust storm, as quickly as single observations allow. Obviously, for a polar, Sun-synchronous satellite, such as MRO, there is an intrinsic limitation to the production of a synoptic map, given by the fixed local times of observations.





**Figure 5.** In this Figure we plot the same observations shown in the left column of Figure 4 for Mars Universal Times: MUT = 00:00, 06:00, 12:00, and 18:00, color coded according to: (left column) the difference in local time between each observation and the map grid point around which it is located, and (right column) the cutoff altitude above the local surface of the dust opacity profile corresponding to each estimated column dust optical depth observation.

The key differences we have introduced in this work with respect to the methodology described in section 3 of Montabone et al. (2015) are that we now opportunely separate the contribution of dayside and nightside observations, and we create four gridded maps per sol at four different MUTs. We achieve this by 1. only considering observations with local times within  $\pm$ 7 hr of the local time of a given grid point, in each TW iteration, and 2. repeating the IWB procedure for observations centered at MUT = 00:00, 06:00, 12:00, and 18:00, rather than simply at MUT = 12:00 (this is equivalent to a 6-hr rather than a 24-hr moving average).

The effect of applying a 7-hr window selection for observations to be gridded at each grid point can be already appreciated in Figure 3, where the distinction between nightside tracks (positive slope) and dayside ones (negative slope) is evident, at each TW iteration. Because we use a local time window of  $\pm$ 7 hr, there is a superposition of nightside and dayside values at some longitudes, which allows for a smoother transition between the two. In Figure 4 we show an example of the combined effect of the updated methodology for the same sol of Figure 3 but only for the last iteration with TW = 7 sol (we stress that all four iterations with increasing TWs are always applied at each MUT, though). In the left column we plot the CDOD observations effectively used for gridding in the four maps of the right column, with MUT = 00:00, 06:00, 12:00, and 18:00.

The difference in local time between each observation and the map grid point close to which it is located is plotted in the left column of Figure 5, using the same observations of the left column of Figure 4. Since in Figure 5 we only show examples with TW = 7, there are multiple orbit tracks with similar local time differences but belonging to different sols. For each map with different MUTs, there are two longitude ranges (with local times around 03:00 and 15:00) within which these differences are small, although only one orbit track also matches the specific sol. The most current update of CDOD in each map is therefore confined to these two longitude ranges. The weights on time, distance, and quality of observation (see details in section 3.2 of Montabone et al., 2015) eventually define the contribution of each single observation to the grid point average (plotted in the right column of Figure 4 only for the last iteration).

It is necessary to discuss the differences among the maps at different MUTs, because these are the novel results of this work. When looking at the four MUT maps in the right column of Figure 4, in fact, a clear diurnal variation of CDOD can be appreciated, particularly pronounced in the latitude band  $20^{\circ}S - 70^{\circ}S$  (see also section 3 and Figure 14). This variation of CDOD has the characteristics of a Sun-synchronous wave with wavenumber one: smaller optical depths are found at night and larger optical depths occur during the day. The diurnal variation is already present in the estimated MCS CDODs, as shown in the left column of Figure 4, and is not an artifact of the gridding methodology, nor it is limited to the sol showed in Figure 4, as Figure 14 clearly demonstrates. Furthermore, this strong diurnal variation of CDOD corresponds very well both in  $L_S$  (during the growth phase of the GDE) and in latitude to the strong diurnal variation of the MCS dust opacity profiles, as described in Kleinböhl et al. (2020). In that paper, GCM simulations are used to reproduce the diurnal variability of the dust profiles and help explain the likely dynamical effects at the origin of this phenomenon.

The question arises, then, whether the diurnal variability observed in estimated MCS CDOD can also have a dynamical origin or can be explained otherwise. We address the possibility of a dynamical origin with GCM simulations in section 4, while we point out here that interpreting results from MCS CDODs is particularly challenging, as already mentioned in subsection 2.2. The right column of Figure 5, in fact, shows that the dust opacity profiles (from which CDODs are estimated) in the latitude band where the diurnal CDOD differences are more pronounced have quite different cutoff altitudes above the local surface between day and night: nightside profiles tend to extend lower in altitude, while dayside profiles are generally cut at higher altitudes. This is due to several factors, although it is primarily driven by the altitude at which the retrieval algorithm finds the atmosphere too opaque in the limb path. The increase in the amount of dust or water ice (and their vertical extent) in the dayside profiles causes the profiles to terminate further from the surface than the nightside ones, on average. As previously pointed out, the different cutoff altitudes for nightside and dayside retrievals imply that the uncertainty in the CDOD extrapolation is larger during the day, but it does not necessarily imply that the homogeneously mixed dust assumption is not valid, particularly during the peak of the GDE. We refer to section 3 for in-depth discussion on this topic.

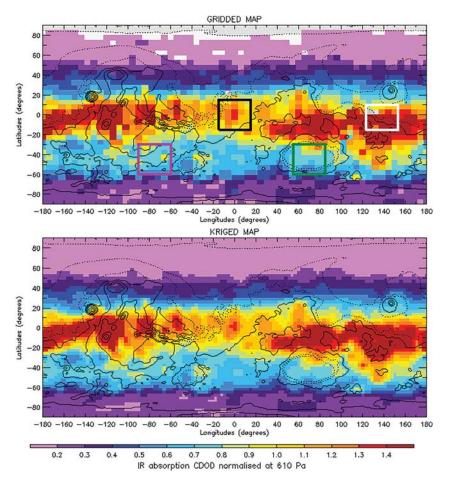
#### 2.5. Reference MY 34 Dust Climatology

The gridded and corresponding kriged maps of CDOD described in Montabone et al. (2015) have been used as reference multi-annual dust climatology in several studies and applications, including the production of MCD statistics. It is, therefore, compelling to produce a reference MY 34 climatology following the approach established for the previous MYs.

Although in this work we produce four gridded maps per sol, we calculate the diurnal average, and we use only one map per sol to build the reference MY 34 climatology. We do so because 1. the diurnal variability of MCS CDOD is not yet soundly confirmed by independent observations, 2. it is not clear whether using a column-integrated dust scenario with diurnal variability in model simulations would not trigger spurious effects, e.g. erroneously forcing the tides, and 3. we would like to be consistent with climatologies from previous MYs. There is also a technical issue complicating the production of diurnally varying kriged maps, which is the fact that some of the subdaily gridded maps have many missing values, particularly when the water ice opacity affects the dust opacity.

We show in Figure 6 an example of the diurnally averaged gridded map and corresponding kriged one, for the same sol as in Figure 3. The diurnally averaged maps are more complete than any single MUT map and rather spatially smooth. The transition to maps at previous and subsequent sols is also rather smooth (see e.g. Figures 11 and 13). We should mention that, in contrast to Montabone et al. (2015), we no longer modify the values of the gridded maps in a latitude band around the southern polar cap edge before applying

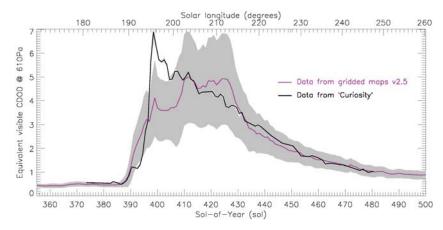




**Figure 6.** Diurnally-averaged gridded map (upper panel) and corresponding kriged map (lower panel) of 9.3  $\mu$ m absorption column dust optical depth (CDOD) for sol-of-year 400,  $L_S \approx 196^\circ$ , in the growth phase of the GDE. The gridded map showed here is the diurnal average of the four maps in the right column of Figure 4. The spatial resolution of the gridded map is 6° longitude  $\times 5^\circ$  latitude, whereas the resolution of the kriged one is 3° longitude  $\times 3^\circ$  latitude. The white rectangle in the gridded map highlights the averaging area around Gale Crater used in Figure 7 for comparison with the CDOD measured by the Curiosity rover. The other colored squares highlight the averaging areas in Aonia Terra (magenta), Meridiani Planum (black) and Hellas Planitia (green) used in Figure 14

the kriging interpolation. This was previously done to artificially introduce climatological "south cap edge storms" and balance TES and MCS years in terms of dust lifted at the south cap edge. The use of MCS v5.3.2 retrievals extending to lower altitudes and the fact that TES CDOD retrievals at the south cap edge are being revised (M. Smith, personal communication) alleviate the need for such correction.

The MY 34 daily maps of gridded and kriged IR absorption CDOD normalized to 610 Pa are included in NetCDF files together with maps of several other variables, as mentioned in Appendix B of Montabone et al. (2015). We note here that the number of observations, the TW, and the reliability value for valid grid points are calculated as diurnal averages. The uncertainty is calculated as combined uncertainty of the four subdaily values with equal weights. The combined RMSD is calculated as the square root of the average of the squared RMSDs of the four subdaily values (also with equal weights). We separately provide the RMSD of the diurnally averaged values, which is an indicator of the diurnal variability. We also note that, following the Montabone et al. (2015) sol-based Martian calendar (see their Appendix A for a description), MY 34 has 668 sols; therefore, we provide 668 gridded maps—MY 34 new year's  $L_S$  is 359.98°. The column-integrated dust scenario, though, has always 669 kriged maps for practical reasons; hence, the last sol of the MY 34 dust scenario is the first sol of MY 35. Both gridded and kriged maps version 2.5 for MY 34 are publicly available at the dedicated "Martian dust climatology" webpage on the MCD project website hosted by the LMD at the URL: http://www-mars.lmd.jussieu.fr/. They are also available on the "Institut Pierre-Simon Laplace" data repository at the URL: https://data.ipsl.fr/catalog/. For completeness, we have also made the diurnally



**Figure 7.** Time series of equivalent visible column dust optical depth calculated from the 9.3 µm absorption column dust optical depth normalized to 610 Pa, extracted from the diurnally averaged gridded maps in an area around Gale Crater (magenta line), compared to the time series of visible column optical depth measured by MastCAM aboard NASA's "Curiosity" rover (black line). Curiosity observations (Guzewich et al., 2019) have been diurnally averaged and normalized to 610 Pa (using the surface pressure from the Mars Climate Database pres0 routine). Both time series are shown between sol-of-year 355 and 500, i.e.  $L_S \approx 170^\circ - 260^\circ$ . We used a factor of 2.6 to convert 9.3 µm absorption column dust optical depths into equivalent visible ones. Data from gridded maps are averaged in the area shown by a white rectangle in Figure 6 (i.e. longitudes  $123^\circ$ E –  $153^\circ$ E, latitudes  $15^\circ$ S –  $10^\circ$ N) centered around Curiosity landing site at longitude 137.4°E and latitude 4.6°S. Light and dark gray shades show the uncertainty envelope (1-sigma), respectively, for Curiosity's time series and the time series extracted from the gridded maps.

varying gridded maps (identified as version 2.5.1) available on both sites. See the "Data availability" section at the end of this paper for detailed access information.

#### 2.6. Validation

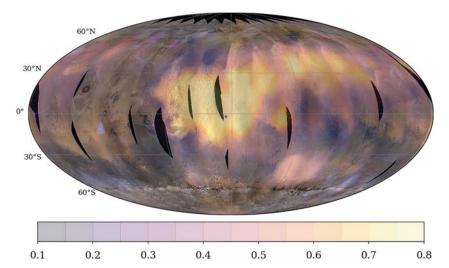
An important aspect of producing a reference dataset for the dust climatology is its validation with independent observations. The Opportunity rover entered safe mode right at the onset of the GDE, while the Curiosity rover took measurements of visible dust optical depth throughout the GDE using its MastCAM camera (Guzewich et al., 2019). Hence, we use measurements from Curiosity for validation, together with publicly available visible images taken by the Mars Color Imager (MARCI) camera aboard MRO.

Figure 7 shows the comparison between the time series of the dust optical depth (sol-averaged and normalized to 610 Pa) observed by Curiosity in Gale Crater during the GDE (Guzewich et al., 2019) and the time series of CDOD extracted from the gridded maps and averaged in a longitude-latitude box centered on Gale Crater (after conversion to equivalent visible values). The gridded maps are able to fairly well reproduce the timing and decay of the GDE around Gale, but they underestimate the peak of the event. Furthermore, they overestimate the decay between  $L_S \approx 205^\circ$  and  $L_S \approx 215^\circ$ , although within the uncertainty limit. Spatial inhomogeneity in the CDOD field, even during the mature phase of the GDE, may account for some of the differences. Looking within the white box over Gale Crater in the gridded map of Figure 6 (which is at  $L_S \approx 196^\circ$ , i.e. at the opacity peak for Curiosity), the northern third of the box has substantially lower opacity values. Regional (especially latitudinal) gradients can, therefore, be one of the causes of the peak difference. Also note that Gale Crater is a challenging location for MCS to observe due to MRO providing relay services to the Curiosity rover. In particular, the number of in-track profiles is limited and may be geographically biased. See also further comments about the comparison with Curiosity data in section 4 when discussing Figure 16. Finally, we note that the time series using the kriged maps is nearly identical to that using the gridded ones (i.e. the magenta line in Figure 7), although we do not show this here.

We show the comparison between one of our gridded CDOD maps and a MARCI image in Figure 8. The comparison is done for 6 June 2018, at the onset of the GDE, which corresponds to SOY 387 in our dataset. The extension of the dust cloud in both the MARCI image and the CDOD map is similar, with both showing intense activity around Meridiani, an eastward progression of the storm, and relatively clear skies over the Tharsis volcances. This specific CDOD map fails to show the onset of the south polar cap edge dust activity, but maps at subsequent sols do.



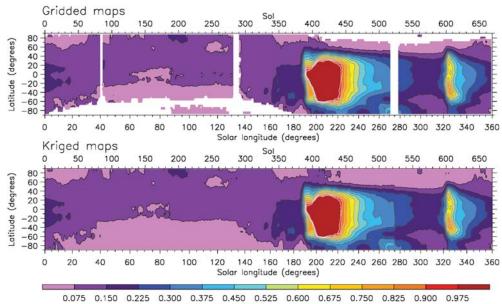




**Figure 8.** The background global image of Mars in this Figure is referenced PIA22329 in the NASA photojournal (credits: NASA/JPL-Caltech/MSSS). We wrapped this map on a Mollweide projection. It shows the growing MY 34 global dust event as of 6 June 2018. The map was produced by the Mars Color Imager camera on NASA's Mars Reconnaissance Orbiter spacecraft. The blue dot shows the approximate location of the Opportunity rover. We overlay on this image the column dust optical depth kriged map for the corresponding sol (sol-of-year 387), which we have reconstructed from Mars Climate Sounder observations. The infrared absorption (9.3 µm) column dust optical depth map (not normalized to 610 Pa) is plotted as filled colored contours.

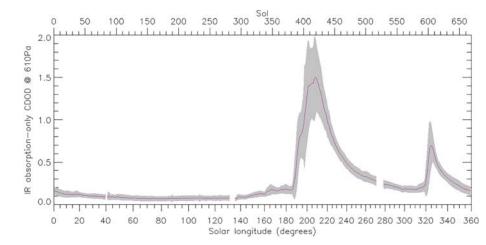
# 3. Seasonal, Daily, and Diurnal Variability of Column Dust

In this section we analyze the variability at different temporal scales, which is included in the MY 34 dust climatology reconstructed from MCS CDODs. In particular, we look at the seasonal, daily, and diurnal variability, as shown in Figures 9 to 15.



IR absorption CDOD normalized at 610 Pa

**Figure 9.** Martian year 34 latitude vs time plot of the zonally and diurnally averaged gridded maps of 9.3 µm absorption column dust optical depth normalized to the reference pressure level of 610 Pa (upper panel), compared to the same using kriged maps (lower panel). The white color in the upper panel indicates that no valid grid points are available at the corresponding times and latitudes. Kriged maps are complete (all grid points have valid values); therefore, no white color is present in the lower panel. CDOD = column dust optical depth.



**Figure 10.** Time series of column dust optical depth (9.3  $\mu$ m in absorption, normalized to 610 Pa) extracted from the diurnally averaged gridded maps and averaged at all longitude in the latitude band 60°S – 40°N. The gray shade represents the root mean squared deviation, i.e. the spatial variability within the averaged longitudes and latitudes (note that the diurnal variability is not included).

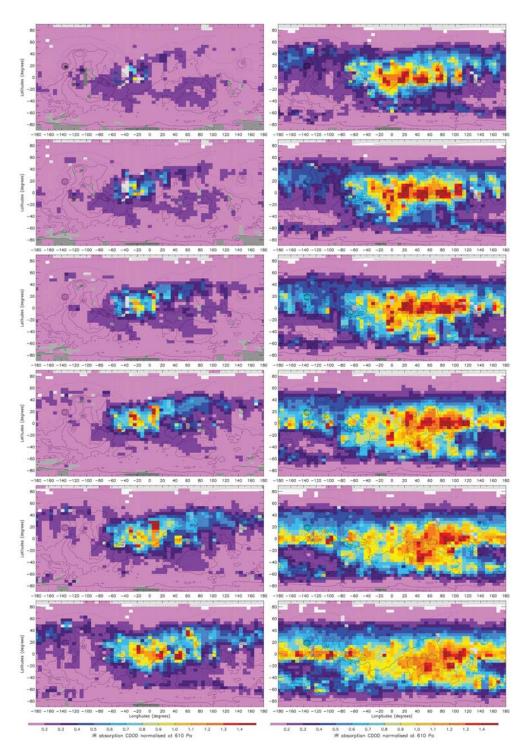
Starting from the seasonal variability, Figure 9 shows the latitude vs time plot of the zonally and diurnally averaged CDOD obtained from both the gridded maps and the kriged ones. This comparison shows that the kriged maps have the advantage of being complete (i.e. CDOD values are assigned at every grid point) while preserving the overall properties of the dust distribution. Montabone and Forget (2018) noted that MYs show two distinctive seasons with respect to the atmospheric dust loading, when a comparison of multi-annual zonal means of CDOD is carried out: a "low dust loading" season between  $L_{\rm S} \approx 10^{\circ}$  and  $L_{\rm S} \approx 140^{\circ}$  and a "high dust loading" season at other times, when regional dust storms and global dust events are most likely to occur—commonly referred to as the "dust storm season." MY 34 does not differ, as dust started to increase above the 0.15 level (IR absorption at 9.3 µm) after  $L_{\rm S} \approx 160^{\circ}$ , following a quiet low dust loading season (see Figure 10 as well, which is the time series obtained from the latitude vs time plot by averaging also in the latitude band  $60^{\circ}\rm S - 40^{\circ}\rm N$ ).

Nevertheless, the optical depth abruptly increased after  $L_S \approx 186^\circ$  due to the onset of the GDE, which rapidly grew to the west of Meridiani Planum, expanded eastwards and southwards, and spread a large amount of dust at all longitudes within approximately a latitude band  $60^\circ$ S –  $40^\circ$ N (see its daily evolution over 12 sols in Figure 11), then slowly decayed over about 130 sols, as can be observed from the tail of the GDE peak in Figure 10.

MY 34 also featured two other maxima in CDOD that are climatologically consistent with all other 10 previously observed years: one at southern polar latitudes centered at  $L_{\rm S} \approx 270^{\circ}$  and the other in the latitude band 60°S – 40°N peaking at  $L_{\rm S} \approx 325^{\circ}$ . These maxima are linked respectively to a regional dust storm occurring over the ice-freed southern polar region and to a particularly intense late-winter regional storm (see its daily evolution over 12 sols in Figure 13). The latter has the characteristics of a flushing storm following the Acidalia-Chryse storm track, although its precise origin cannot be easily tracked in the gridded maps of CDOD. Finally, the absence of the onset of significant storms in a range of areocentric solar longitude 250° – 310° is also climatologically consistent with what was observed in previous years, except for the solstitial planetary-scale event of MY 28 (see the so-called "solstitial pause" mentioned in, e.g., Kass et al., 2016; Lewis et al., 2016; Montabone & Forget, 2018; Montabone et al., 2015; Xiaohua et al., 2020).

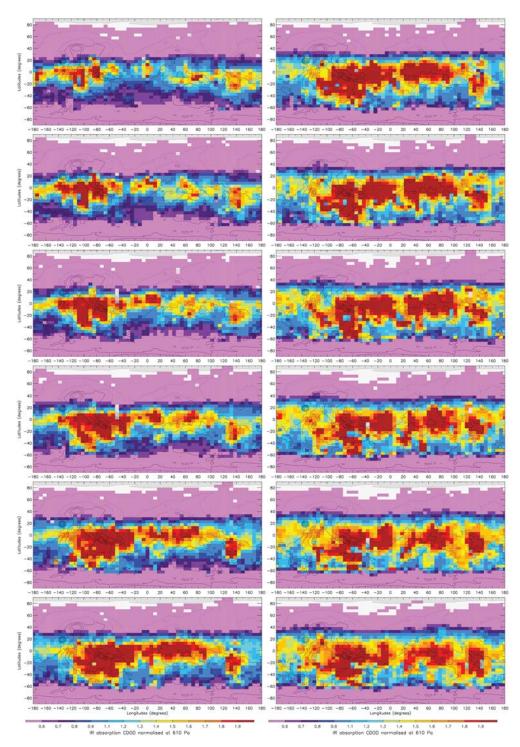
Before moving to the analysis of the CDOD diurnal variability, we must consider one last point about the variability of dust storms. When comparing the daily evolution of the GDE and the late-winter storm at their early stage in Figures 11 and 13, they look pretty similar both in intensity and extension. Furthermore, the shapes of the CDOD peaks in the time series of Figure 10 are also comparable (both positively skewed, with sharp increase and long decreasing tail). What really does make the difference is the fact that a GDE, such as the one in MY 34, took about 35 sols of continuous dust injection into the atmosphere to reach a peak in average CDOD that is more than twice as high than the one reached by the (rather intense) late-winter regional storm. This includes a much larger spatial variability during the GDE, as indicated by the root mean



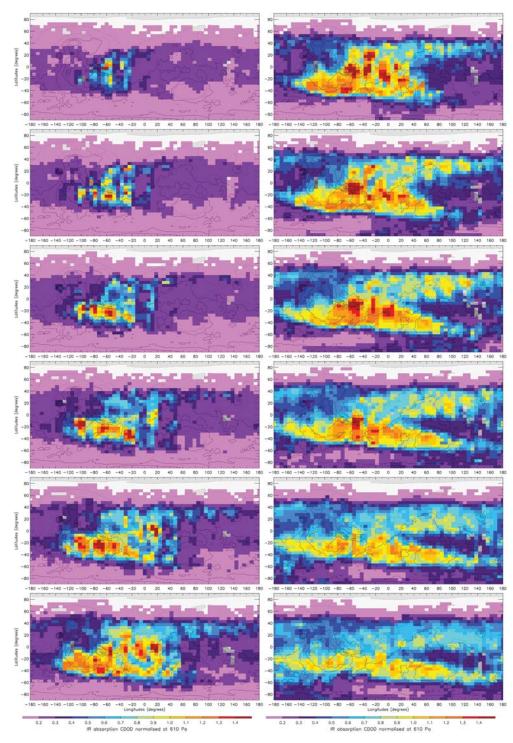


**Figure 11.** Initial evolution of the Martian year 34 global dust event. Each panel shows diurnally averaged gridded column dust optical depth (in absorption at 9.3  $\mu$ m) normalized to the reference pressure level of 610 Pa. From top left to bottom right, maps are provided for (sol-of-year/L<sub>S</sub>): 383/186.2°; 384/186.8°; 385/187.4°; 386/188.0°; 387/188.6°; 388/189.2°; 389/189.8°; 390/190.4°; 391/191.0°; 392/191.6°; 393/192.2°; 394/192.8°. L<sub>S</sub> is calculated at MUT = 12:00 of each sol and rounded to one decimal place. See also Appendix A of Montabone et al. (2015) for the description of the sol-based Martian calendar we use in this paper. CDOD = column dust optical depth.

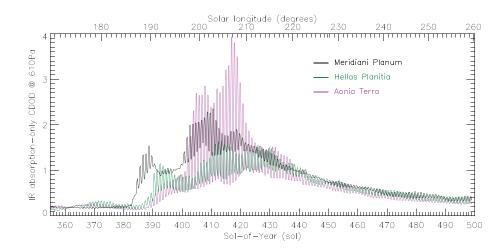




**Figure 12.** Same as Figure 11 but for the MY 34 secondary storm within the global dust event. From top left to bottom right, maps are provided for (sol-of-year/ $L_S$ ): 401/197.0°; 402/197.6°; 403/198.2°; 404/198.8°; 405/199.4°; 406/200.0°; 407/200.7°; 408/201.3°; 409/201.9°; 410/202.5°; 411/203.1°; 412/203.7°.  $L_S$  is calculated at MUT = 12:00 of each sol and rounded to one decimal place. Note that the scale for the column dust optical depth (CDOD) values has changed with respect to Figure 11.



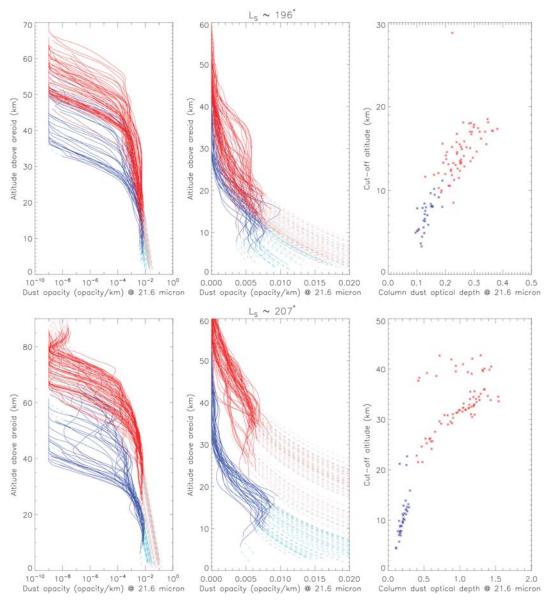
**Figure 13.** Same as Figure 11 but for the MY 34 late-winter regional storm. From top left to bottom right, maps are provided for (sol-of-year/ $L_S$ ): 596/320.0°; 597/320.6°; 598/321.2°; 599/321.8°; 600/322.4°; 601/322.9°; 602/323.5°; 603/324.1°; 604/324.7°; 605/325.2°; 606/325.8°; 607/326.4°.  $L_S$  is calculated at MUT = 12:00 of each sol and rounded to one decimal place. The scale for the column dust optical depth (CDOD) value is the same as in Figure 11.



**Figure 14.** Time series of column dust optical depth (9.3 µm in absorption, normalized to 610 Pa) extracted from the gridded maps with four MUT per sol and spatially averaged in three different areas: Meridiani Planum (15°W – 15°E longitude, 15°S – 15°N latitude), Hellas Planitia (55°E – 85°E longitude, 60°S – 30°S latitude), and Aonia Terra (East of Argyre Planitia: 90°W – 60°W longitude, 60°S – 30°S latitude). The boundaries of the three areas can be visualized as colored squares in the upper panel of Figure 6. The time series are shown between sol-of-year 355 and 500, i.e.  $L_S \approx 170^\circ - 260^\circ$ .

square deviation in Figure 10. An event that was very important in boosting the equinoctial dust storm into the GDE class was the activation of secondary lifting centers in the Tharsis region, which seems to have started around SOY 401 in the gridded maps ( $L_S \approx 197^\circ$ ), and later in the Terra Sabaea region—although one cannot distinguish from the maps whether the increase of optical depth in this region was the result of eastward transport from Tharsis or local dust lifting or both. Bertrand et al. (2020) highlight this event as well and analyze it using simulations with the NASA Ames Mars GCM guided by the kriged maps described in this paper. When looking at the CDOD daily evolution in Figure 12, this Tharsis event can be considered as a "storm within the storm," without which we might have only witnessed a regional storm instead of a GDE. This is one of the reasons why names, such as "global dust storm" or "planet-encircling dust storm," do not seem to capture the real nature of this type of extreme events, which are not single storms nor uniquely planet-encircling. Perhaps, even "global dust event" is not particularly appropriate, as high latitude regions are mostly free of dust—although indirectly affected by the dust via dynamical effects, but this can be true for regional dust storms as well. One possibility is, therefore, to give these events a name that represents what they really are: "extreme dust events."

Another extreme characteristic of the MY 34 equinoctial event is its strong diurnal variability, clearly observed by MCS in the vertical expansion of the dayside vs nightside dusty region (see Kleinböhl et al., 2020), but also featured in the column optical depth values, as already shown in Figure 4. The time series at different locations extracted from the dataset with four MUT maps per sol and shown in Figure 14 clearly illustrates this phenomenon. The nightside-dayside variability is different at different locations, but is particularly dramatic in Aonia Terra (to the East of the Argyre Planitia, 90°W – 60°W longitude and 60°S – 30°S latitude), which is located in the southern latitude band where Kleinböhl et al. (2020) observe strong variability in the dust profiles. In Figure 15, therefore, we compare the CDOD values in Aonia Terra at two times during the GDE (i.e. during its growth phase and near the peak) with the corresponding dust opacity profiles that are extrapolated and integrated in order to estimate the CDODs. The vertical expansion of about 20 km of the dayside dusty region with respect to the nightside one is quite spectacular at  $L_{\rm S} \approx 207^{\circ}$ , near the peak of the GDE. Unfortunately, with the rise in altitude of the dusty region comes the rise in cutoff altitude of the dust profile retrievals. However, from Figure 15 one cannot conclude that the homogeneously mixed dust hypothesis at the core of our dust profile extrapolation to the ground does not hold in these cases. Conversely, there is no evidence that rising dust is replaced by more well-mixed dust in the missing part of the profile, because we simply have no data there. Furthermore, uncertainties at the lowest levels of the dust profiles during the GDE tend to be larger (see e.g. the left panel of Figure 1 in Kleinböhl et al., 2020), hence the real shape of the profile in the lowest two scale heights could provide some surprises.



**Figure 15.** Data plotted in each panel of this figure are for 7 sols centered on either sol-of-year 400 ( $L_S \approx 196^\circ$ , upper panels) or sol-of-year 418 ( $L_S \approx 207^\circ$ , lower panels) in Aonia Terra (90°W – 60°W longitude, 60°S – 30°S latitude). Blue indicate nightside data, red are for dayside data. The left and central panels of this figure show the retrieved Mars Climate Sounder dust opacity profiles (solid, vivid lines) and the extrapolated sections (dashed, pastel lines) as a function of altitude above the areoid (topography values are interpolated from the MOLA dataset at the corresponding longitudes and latitudes). The x-axis is logarithmic in the left panels, whereas it is linear in the central ones, to better separate the profiles in the lowest scale heights. The right panels show the integrated Mars Climate Sounder column dust optical depth in extinction at 21.6  $\mu$ m (not normalized to 610 Pa) as a function of the cutoff altitudes of their corresponding dust opacity profiles. Note that the x-axis and y-axis ranges can be different among the panels.

At this point of the analysis, we can make three hypotheses about the diurnal variability observed in MCS CDODs:

1. There is an intrinsic, significant variability of the column dust abundance. In this case, quite a substantial amount of dust must be supplied in the lowest two scale heights during the day, which MCS cannot see through. This extra dust must either be lifted locally from the ground or supplied via horizontal advection (or both). Local mesoscale effects might operate at different locations (e.g. katabatic/anabatic winds, strong convective activity, etc.)

- 2. There is no significant variability in the column dust abundance. In this case, atmospheric dust is simply moved up and down during the day/night, and the dayside dust opacities actually decrease with decreasing altitude in the lowest scale heights, which are not seen by MCS. The diurnal variability of the dust opacity profiles in the lowest two scale heights during the GDE would then be expected to be very large, in order to compensate for the vertical expansion of the dust cloud.
- 3. There is some variability in the column dust abundance. In this case, dust is partly moved up and down at different local times, and partly lifted locally, or advected from nearby locations.

In order to help clarify which hypothesis is more likely, we have carried out simulations with the LMD-MGCM, which we discuss in the next section.

# 4. Global Climate Model Simulations of the MY 34 Global Dust Event

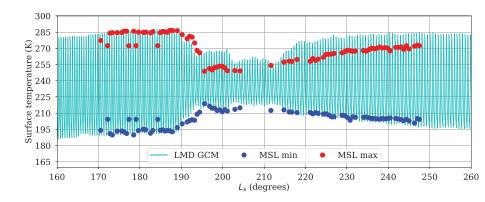
The simulations we have carried out using the LMD-MGCM have similar characteristics to those carried out to build the Mars Climate Database version 5.3 (Millour et al., 2015), except for the model top being set lower (at 100 km compared to 250 km, with 29 rather than 49 vertical levels) and the thermospheric parameterizations (González-Galindo et al., 2011) being switched off. The most up-to-date physical parameterizations are included: interactive dust cycle (explained in the next paragraph, Madeleine et al., 2011), thermal plume model (a physically-based parameterization for Planetary Boundary Layer—PBL—mixing, Colaïtis et al., 2013), water cycle with radiative effect of clouds (a key element to account for the measured atmospheric and surface temperatures, Madeleine et al., 2012; Spiga et al., 2017), and full microphysics scheme (in which the transported dust particles could serve as condensation nuclei for the formation of water ice clouds, Navarro et al., 2014). The "rocket dust storm" parameterization recently built and tested by Wang et al. (2018) is not included in this version of the GCM. The horizontal grid features 64 × 48 longitude-latitude points.

A complete description of the interactive dust cycle is included in Madeleine et al. (2011) and Spiga et al. (2013). To summarize, the transport of dust particles by the resolved dynamics is based on a two-moment scheme: the particle size distribution is fully described by two tracers (mass mixing ratio and number density) assuming a log-normal distribution of constant standard deviation. When a column-integrated dust scenario (such as the one described herein for MY 34) is used in a LMD-MGCM run, the value of total column dust opacity is normalized at each timestep by the value in the dust scenario. The vertical distribution of dust particles in the LMD-MGCM simulation remains a prediction from the model.

A run without the normalization of the total column dust opacity by the value provided in the dust scenario is named a "free dust" run, since both the column opacity and the vertical distribution of dust particles are fully predicted by the model. For GCM simulations guided by the column-integrated dust scenario, spatially uniform lifting rate is assumed all over the planet, with dust particles being injected in the first layers of the model PBL (Madeleine et al., 2011). Conversely, our "free dust" run assumes no lifting of dust particles from the surface. Only the normalization of the total column dust opacity and the lifting of dust particles from the surface are different between a regular GCM simulation and a "free dust" simulation. Physical processes, such as sedimentation, cloud scavenging, and small-scale mixing of dust particles, are still included in the "free dust" GCM simulation of atmospheric dynamics and sinks (sedimentation, cloud scavenging) is acting to modify the spatial distribution of dust particles in the Martian atmosphere. This kind of GCM simulations is appropriate for either the clear season or the decaying phase of dust storms (the latter being the case considered here). During 10 to 20 sols of simulation, the global column opacity predicted by the model does not depart significantly from the global column opacity reported in the dust scenario.

The initial state for the MY 34 run at  $L_S = 0^\circ$  uses the "climatological" column-integrated dust scenario typical of MYs devoid of global dust events. Then, two simulations for MY 34 are carried out:

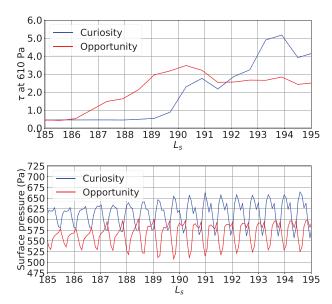
- 1. a simulation using the reference MY 34 dust scenario v2.5 (i.e. the maps kriged from the diurnally averaged gridded maps, as discussed in section 2.5) to guide the column dust field throughout the GDE period;
- 2. a simulation using the MY 34 dust scenario until  $L_{\rm S} = 210^{\circ}$  (around the peak of the GDE), then continuing as a "free dust" run for a few sols, with no more external guidance on the column dust field and no more regular injection of dust particles at the bottom of the model, as explained in the previous paragraph.



**Figure 16.** Comparison of surface temperature simulated by the Laboratoire de Météorologie Dynamique Mars global climate model model versus surface temperature measured by the Rover Environmental Monitoring Station (REMS) on board MSL "Curiosity" rover (diurnal minimum in blue and diurnal maximum in red). Data from MSL are provided as supplementary material of Guzewich et al. (2019). The model simulation is guided by the column-integrated dust scenario.

The LMD-MGCM simulations for MY 34 are also used in Kleinböhl et al. (2020) to discuss the diurnal cycle of the vertical distribution of dust observed by MCS. We use the two types of simulations for two different purposes: 1. the forced run is used to analyze some of the impacts of the MY 34 GDE on the local and global atmospheric dynamics, hence verifying that the use of a diurnally averaged dust scenario produces reasonable results; 2. the "free dust" run is used to identify possible diurnal variability of the column dust in the model, which could corroborate one of the three hypotheses provided at the end of the last section.

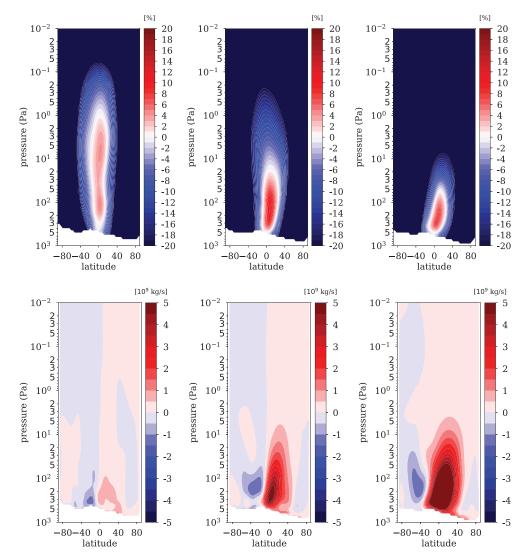
Figure 16 shows a comparison between the surface temperature measured by Curiosity (Guzewich et al., 2019) and the surface temperature computed by the LMD-MGCM. When the MY 34 global dust event starts, the diurnal amplitude of temperature is reduced: daytime temperatures are lower as a result of visible absorption of incoming sunlight being more efficient in a dustier atmosphere, and nighttime temperatures are higher as a result of increased infrared radiation emitted towards the surface in a dustier atmosphere. The temporal variability of temperature (absolute and relative values) is well reproduced



**Figure 17.** Time series of equivalent visible column dust optical depth at 610 Pa (upper panel) and surface pressure (lower panel) as simulated by the Laboratoire de Météorologie Dynamique Mars global climate model guided by the MY 34 column-integrated dust scenario. The focus of the figure corresponds to the onset of the global dust event. This is showing the simulated fields at the Opportunity (red curves) and Curiosity (blue curves) landing sites.

for the nighttime minimum temperature but less so for the daytime temperatures (although the qualitative behavior is correct). There might be three reasons for this: 1. thermal inertia is not well represented in the LMD-MGCM for daytime conditions in Gale Crater; 2. the CDOD observed by MCS in the region of Gale Crater is underestimated with respect to the one observed by Curiosity from  $L_{\rm S} \approx 195^{\circ}$  to  $L_{\rm S} \approx 202^{\circ}$ , and by consequence, the corresponding gridded and kriged maps are low biased at those times (see Figure 7 in section 2.6); 3. the accuracy of the calculations by the model radiative transfer could decrease under extreme dust loading conditions or could be affected by an inaccurate distribution of particle sizes.

An important test of the dynamical behavior of our LMD-MGCM simulation forced by the MY 34 column-integrated dust scenario is how thermal tides react to the global increase of dust opacity following the onset of the GDE. Figure 17 shows several diurnal cycles of surface pressure at the time of the GDE onset. Both the amplitude of the diurnal pressure cycle and its morphology are modified by the GDE at its onset. The diurnal pressure cycle is dominated by the diurnal tide before the GDE takes place. When the GDE starts to build up and the column optical depth increases, the diurnal mode increases slightly in amplitude, while the semidiurnal mode increases significantly compared to the other modes, as already described in previous studies (Lewis & Barker, 2005; Wilson & Hamilton, 1996; Zurek & Martin, 1993, their Figure 5). The reinforcement of the semidiurnal tide with increased column opacity is due to the fact that this tide component is dominated by a Hough mode with a large



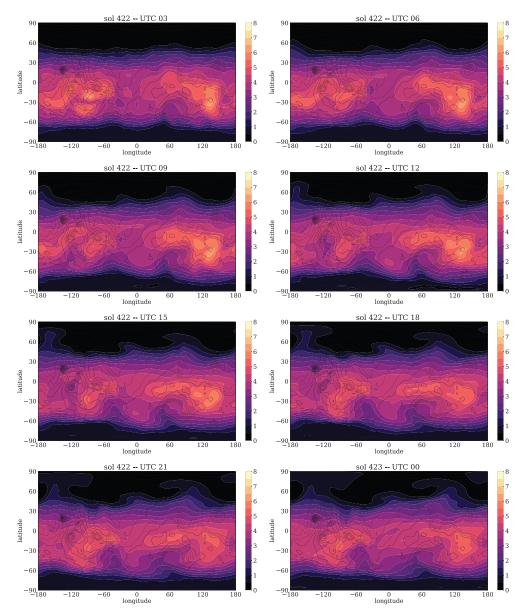
**Figure 18.** The impact of the Martian year 34 global dust event (GDE) on the zonally averaged global circulations on Mars is shown from left to right, averaged on the  $L_S$  intervals  $150^\circ - 180^\circ$  (pre-GDE conditions),  $180^\circ - 210^\circ$  (onset of the GDE), and  $210^\circ - 240^\circ$  (mature phase of the GDE). [Top] Super-rotation index *s* computed according to Lewis and Read (2003) with positive values denoting regions where eastward jets are super rotating, i.e. exceeding the solid body rotation of the planet. [Bottom] Mass stream function with blue regions corresponding to counterclockwise circulation and red regions corresponding to clockwise circulation.

vertical wavelength (Chapman & Lindzen, 1970). As a result, this Hough mode is very sensitive to forcing extended in altitude such as the absorption of incoming sunlight by dust particles during a dust storm.

Those major changes in the tidal modes take only a couple of sols to react to the MY34 GDE onset, and the simulations show that those changes are global. This is true for both the Opportunity site, located close to the regional storm that initiated the MY34 GDE, and the Curiosity site, at which dust opacity started to increase about 5° later than at the Opportunity site. Hence, at the Curiosity site, both the amplification of the diurnal and semidiurnal modes in the simulated surface pressure are predicted to occur before dust opacity increases locally. This is in agreement with the observations by Curiosity of the diurnal pressure amplitude, which is found to react about 4 sols before the increase of dust opacity observed by Curiosity in Gale Crater (Viúdez-Moreiras et al., 2019).

The increase in column dust optical depth associated with the MY 34 GDE has a profound impact on the large-scale circulation. Lewis and Read (2003) evidenced an equatorial low-troposphere super-rotating jet in the atmosphere of Mars and emphasized the strong positive impact of the atmospheric dust loading on





this jet. Our LMD-MGCM forced simulation for MY 34 shows that the intensity of this super-rotating jet, diagnosed by the super-rotation index as in Lewis and Read (2003), is indeed increased following the onset of the GDE from a 5% super-rotation index to a 15% super-rotation index. We also find that this jet becomes confined closer to the surface as the GDE develops (Figure 18, top panels). The mean meridional circulation is also deeply impacted by the large dust loading following the onset of the MY 34 GDE: the intensity of this mean meridional circulation is enhanced by a factor of 10 following the onset and mature phase of the GDE (Figure 18, bottom panels). This behavior is similar to the evolution of the mean meridional circulation simulated under MY 25 GDE conditions (see e.g. Montabone et al., 2005).

Finally, we discuss the use of a "free dust" simulation to gain some insights on the diurnal variability of CDOD in the GCM model. GCM simulations show that large-scale circulation components (i.e. the mean

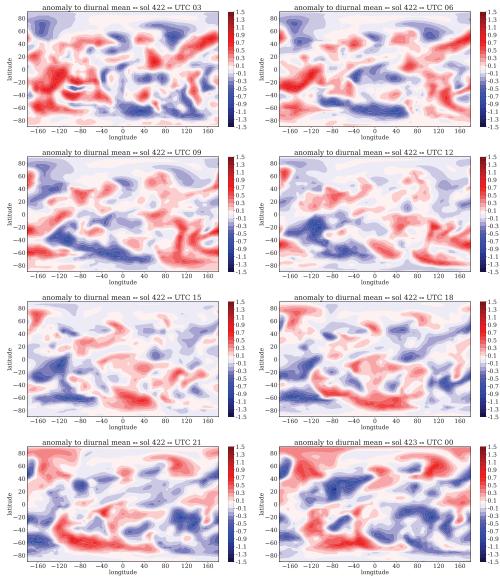
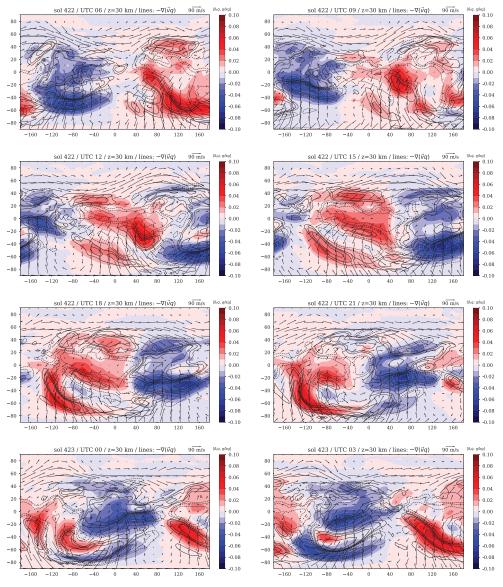


Figure 20. Same as Figure 19 except that the anomaly relative to the diurnal mean is shown.

meridional circulation, planetary waves, and the polar vortex) cause the vertical distribution of dust to undergo diurnal variations both in equatorial and extratropical regions (Kleinböhl et al., 2020). Figure 19 shows the column dust optical depth simulated in the free dust LMD-MGCM run after  $L_{\rm S} = 210^{\circ}$  (i.e. near the peak of the MY 34 storm). The total column optical depth freely evolves in the simulation without being normalized using the values in the MY 34 column-integrated dust scenario. As observed in the MCS CDOD values, and by consequence in the gridded/kriged maps reconstructed following the method described in this paper, the column optical depth in the "free dust" model run varies significantly on a diurnal basis in some regions. Figure 20 shows that the modeled diurnal anomalies in visible column dust optical depth can reach about  $\bar{\tau} \pm 1.5$  in specific regions—particularly Aonia Terra, as observed in the southern hemisphere, which coincides with what is observed for instance in Figure 5. Furthermore, when looking at anomaly maps for more than one sol, they also show that baroclinic waves are present at low latitudes in the northern hemisphere, thus explaining the variability at other locations (not shown here).

The diurnal variability of the CDOD reproduced by the model results from horizontal transport by the large-scale circulation. To diagnose this, and to rule out the influence of sinks of dust particles still included in the "free dust" GCM simulation, such as sedimentation and cloud scavenging, the temporal change  $\partial q/\partial t$ 



**Figure 21.** Sequence of maps separated by 3 hr over one sol in a Laboratoire de Météorologie Dynamique Mars global climate model "free dust" simulation (see the caption of Figure 19). Colors depict the temporal variation of dust mass mixing ratio q within a time interval corresponding to the considered local time  $\pm 3$  hr. Lines depict the horizontal divergence of dust flux  $q\vec{v}$ , i.e. the horizontal transport of dust particles. The horizontal wind vectors  $\vec{v}$  are superimposed. Note that the first panel (top left) is at 06:00 MUT because the temporal derivative uses data from the previous output at 03:00 MUT.

of dust mass mixing ratio q can be compared to the divergence  $\nabla \cdot (q\vec{v})$ , which represents the horizontal flux of dust particles transported by the horizontal wind  $\vec{v}$ . Under the assumption that the wind transport of dust particles dominates the sinks, the two terms should be strongly correlated since the horizontal transport is simply governed by a conservation law, which states:

$$\frac{\partial q}{\partial t} + \nabla \cdot \left( q \vec{\nu} \right) = 0.$$

Figure 21 provides a mapping of the two terms, along with wind vectors, at an altitude where the diurnal contrasts in dust mixing ratio are particularly strong (see Figure 15). At every local time in a sol, the divergence term and the temporal term are closely related. Especially in the southern hemisphere, the diurnal cycle of atmospheric circulations—notably the thermal tides amplified by the dust storm conditions—causes a significant diurnal cycle of horizontal transport of dust particles, hence an overall diurnal cycle of the column opacity at particular locations (such as Aonia Terra exemplified previously). Through the horizontal transport of dust particles, daytime regions are a "source" of dust particles, while nighttime regions are a "sink" of dust particles. Hence, in this study, we show that a diurnal cycle of column opacity is associated with the diurnal cycle of vertical distribution of dust particles evidenced in Kleinböhl et al. (2020).

While it is not possible to rule out the other possible interpretations for the observed diurnal variability of column dust optical depth as discussed at the end of section 3, the LMD-MGCM results in Figure 19 strongly suggest that this variability has a physical basis, and at least part of it is likely related to the large-scale horizontal transport. Vertical transport also likely plays a central role, as discussed in Kleinböhl et al. (2020). What our GCM simulation cannot tell, however, is how much specific mesoscale phenomena, including dusty deep convection (i.e. "rocket dust storms", Spiga et al., 2013), or PBL processes, contribute to the stronger diurnal variability observed by MCS.

# 5. Conclusions and Remarks

The work described in this paper was devoted to 1. reconstructing maps of column dust optical depth for MY 34 from Mars Reconnaissance Orbiter/Mars Climate Sounder observations, 2. analyzing the seasonal, daily, and diurnal variability of column dust showed by the maps, and 3. using numerical simulations with the LMD-MGCM, forced by or simply initiated with the reconstructed CDOD maps, in order to examine some aspects of the impact of the MY 34 global dust event on local and global scale atmospheric dynamics, including the diurnal variability of column dust.

The reconstructed maps for MY 34 follow the work by Montabone et al. (2015) and extend the publicly available multi-annual, multi-instrument climatology of column dust optical depth to 11 MYs. An important difference of the present work with respect to Montabone et al. (2015) is that we now reconstruct diurnally varying maps of column dust, which provides access to the analysis of the diurnal variability of this quantity. This is made possible by using novel retrievals (version 5.3.2) of dust opacity profiles from MCS observations during the period 21 May 2018 to 15 October 2018 ( $L_{\rm S} = 179^{\circ} - 269^{\circ}$  in MY 34), which extend lower in altitude than standard version 5.2 retrievals. In general, therefore, the estimated column dust optical depth values during the global dust event of MY 34 are more accurate, within the intrinsic limitations of estimating CDODs from limb observations.

The analysis of the MY 34 column dust variability at different temporal scales using the reconstructed maps highlights that

- MY 34 reproduces the dichotomy observed in the 10 previous years between the "low dust loading" and the "high dust loading" seasons. Note that MY 35, which started in March 2019, features an unusual regional dust storm during the low dust loading season at  $L_{\rm S} \approx 35^{\circ}$  (D. Kass, personal communication). However, its intensity and duration, preliminarily estimated from CDOD maps using MCS observations, are still compatible with the concept of a "low dust loading" season;
- It also features other typical characteristics of the seasonal evolution of CDOD, such as large values at southern polar latitudes peaking at  $L_{\rm S} \approx 270^{\circ}$ , a solstitial pause in a  $L_{\rm S}$  range  $250^{\circ} 310^{\circ}$ , and large values peaking again at  $L_{\rm S} \approx 325^{\circ}$  during the evolution of an intense late-winter regional dust storm;
- The key distinction of MY 34 is undoubtedly the equinoctial global dust event (starting at  $L_S \approx 186^\circ$  only a few sols after the equivalent event in MY 25), which seems to feature a "storm within the storm" at  $L_S \approx 197^\circ$ , boosting its growth to attain extreme characteristics, typical of GDEs;
- The MY 34 GDE seems also to feature very large CDOD diurnal variability at selected locations, particularly at southern mid- and high-latitudes, as already observed in the corresponding MCS dust opacity profiles by Kleinböhl et al. (2020).

While the diurnal variability in dust opacity profiles comes from direct MCS retrievals and could be explained by global climate model simulations invoking the effects of the large-scale circulation (Kleinböhl et al., 2020), the diurnal variability in the indirectly estimated column dust optical depth values poses more challenging questions. Is the diurnal variability intrinsic to the column dust, or should we expect that the shape of the dust profile in the lowest one or two scale heights not directly observed by MCS (particularly in dayside observations) is not compatible with a homogeneously mixed assumption? Whether the answer leans towards the former or the latter, or a bit of both, it would provide new knowledge on how dust is three-dimensionally distributed within Martian dust storms.

It is not the purpose of this paper to provide a definite answer to the aforementioned question. Nevertheless, we have resorted to numerical simulations with the LMD-MGCM to provide us with some hints. Using a "free dust" model run, initiated at  $L_{\rm S} = 210^{\circ}$  with the reconstructed CDOD field, the model is able to reproduce some diurnal variability in column dust at selected locations. Despite the fact that both the range of the variability and the precise locations do not coincide with what is estimated from MCS, this result provides physical evidence that some degree of diurnal variability can be expected not only in the upper portion of the dust profiles but also in the whole columns. Furthermore, the dust lifting and PBL parameterizations of the global model might actually miss some of the important features that lead to an accurate description of the three-dimensional dust distribution. The model result might, therefore, underestimate the real variability of the column dust.

What the model simulations clearly show when forced with diurnally averaged CDOD maps, however, is that the impact of the MY 34 GDE on the atmospheric dynamics is as large as for the MY 25 GDE. Key features of the local and global dynamics (such as tides, mean meridional circulation, and equatorial winds) respond to the equinoctial dust events in a very similar manner. This is also an indirect validation of the MY 34 reference column-integrated dust scenario based on the diurnally averaged CDOD maps from MCS, which is currently used in several modeling studies of the 2018 GDE.

Future work should address the possibility of producing diurnally varying (complete) kriged maps from the diurnally varying (incomplete) gridded ones and making them publicly available. As mentioned in subsection 2.5, we consider that this option is not currently viable, mainly because the CDOD diurnal variability is not yet independently confirmed, and because it is not yet clear whether model simulations forced by a diurnally varying, column-integrated dust scenario are free of spurious effects. Current Mars GCMs might need to be adapted to handle diurnally varying CDODs in a stable and sensible fashion, if the degree of variability is proved to be as large as the one shown in this paper. A further technical issue that complicates the production of diurnally varying kriged maps is that some of the gridded maps have many missing values (particularly when the water ice opacity affects the dust opacity); hence, some assumptions are required before applying the spatial interpolation. In the present work, we have bypassed this issue by diurnally averaging the gridded maps before producing the kriged ones. A future option could also be the production of fully three-dimensional maps, based on the values of dust opacity at different pressures rather than on the column-integrated values.

Strong emphasis should also be put on obtaining future observations of column-integrated dust as well as dust profiles with diurnal frequency. The planetary fourier spectrometer aboard Mars Express, and the Atmospheric Chemistry Suite aboard Trace Gas Orbiter currently provide the capability to retrieve CDOD at multiple local times and could help in the comparison with the estimated MCS day-night variability of column dust. Future observations from the forthcoming Emirates Mars Mission might provide even stronger evidence of the presence or absence of diurnal variability, due to the spacecraft coverage of multiple local times at once at apoapsis (when the spacecraft is able to observe the full Martian disk).

Moreover, novel approaches should be taken in the future, in order to fully characterize the diurnal cycle of dust and accurately monitor the evolution of dust storms on Mars. These include

- the use of satellites in Mars-stationary orbits (also called "areostationary"), which are equatorial, circular, planet-synchronous orbits equivalent to geostationary ones for the Earth (see e.g. Montabone et al., 2018);
- the use of instruments that allow observation of the vertical distribution of the dust in the Martian PBL, such as lidars. This is particularly important during dust storms when IR spectrometers/radiometers (both nadir- and limb-looking) fail to produce reliable retrievals because of the large atmospheric opacity and the reduced temperature contrast. In this paper we have in fact shown that it would be quite critical to know whether the assumption of homogeneously mixed dust still holds in the lowest scale heights in the midst of a dust storm.

# Appendix A: MY 34 Dust Climatology Versioning

MCS version 5.3.2 is an interim, experimental version of retrievals, leading to a possible future improved version of the whole MCS dataset. As a consequence, the MY 34 gridded and kriged datasets should be considered work in progress, as should the datasets related to other MYs. It is our intention to regularly update

the multi-annual, multi-instrument dust climatology with new observations, novel retrievals of past observations, and updated gridding methodologies/features. The updates are likely to be made publicly available on the Mars Climate Database project webpage at the URL http://www-mars.lmd.jussieu.fr/. There exist, therefore, multiple versions of these reference dust climatologies, notably for MY 34, and we would like to provide in this appendix some details about the main differences.

As mentioned in section 2, the reference version of the current maps from MY 24 to 32 is v2.0. For this version, the used gridding/kriging methodology is precisely the one described in Montabone et al. (2015). Version 2.1 is a specific version only for MY 33, where we have used an additional weight for THEMIS observations, in order to account for THEMIS retrievals being provided at progressively later local times (i.e. we apply a 0.5 weight to THEMIS CDODs during the first iteration with the time window of 1 sol, reduced to 0.1 for the subsequent iterations using larger time windows). Since v2.1, we have also started using MCS v5.2 "two-dimensional" retrievals (Kleinböhl, Friedson, et al., 2017) instead of v4.3 "one-dimensional" retrievals used for previous years 28 to 32.

For MY 34, we have produced three intermediate versions (v2.2, v2.3, and v2.4) and the v2.5 described in this paper, which should be considered as the reference version. All three intermediate versions use MCS v5.3.2 retrievals for the available period, and MCS v5.2 for the rest of the time, but do not use the two distinctive features described in subsection 2.4, namely the local time cutoff window of  $\pm$ 7 hr for observations considered for the weighted average at each grid point, and the 6 hr moving average producing four maps per sol. Instead, they use observations at all local times for each grid point (except in v2.3 and v2.4 during the GDE, see below), and the 24 hr moving average produces only one map per sol, centered at MUT = 12:00, as described in Montabone et al. (2015).

Within the intermediate versions, the differences are as follows:

- v2.2: This version still uses the same data QC and gridding methodology as in Montabone et al. (2015). The use of dayside values is limited by the application of the "dayside" filter with 8-km cutoff altitude threshold at any time. Apart the use of MCS v5.3.2 retrievals, the only other difference with respect to v2.0 is in the kriged maps, where we have artificially introduced climatological south cap edge "storms" only for areocentric solar longitude earlier than 180°, as in MY 25. This version also uses MCS observations only until end of September 2018 ( $L_{\rm S} \approx 260^\circ$ ), stopping at SOY 501.
- v2.3: This version uses only dayside values during the GDE (186.5° <  $L_{\rm S}$  < 269°, SOY 383 to 515). It has also an improved data QC with respect to v2.2: we introduced the "water ice" filter and the "cross-track" filter, and we did not apply the "dayside filter" with 8-km cutoff altitude threshold during the GDE and the late-winter regional storm ( $L_{\rm S}$  > 312°). This allowed to use many more dayside values during the two major dust events of MY 34, increasing the overall optical depth to levels observed by, e.g., the Opportunity rover. We also redefined the estimation of uncertainties according to the scheme that was later adopted in v2.5 (but with slightly lower uncertainties overall). Furthermore, we changed a couple of parameters in the IWB methodology: the criterion to accept a value of weighted average at a particular grid point at any given iteration became that there must be at least one observation within a distance of 200 km from the grid point. We started using the same surface pressure recorded in the MCS dataset to normalize CDOD to 610 Pa instead of the MCD surface pressure. If MCS surface pressure is not retrieved, we associated a 10% uncertainty by default. We stopped using the artificial modification of the latitude band around the southern polar cap at all times. This version also uses MCS observations only until end of February 2018 ( $L_{\rm S} \approx 349^\circ$ ), stopping at SOY 647.
- v2.4: This version is quite similar to v2.3. The only differences are in the refined data QC, which is the one we also use in v2.5 (see subsection 2.2). It also extends until the end of MY 34.

Refer to the two Figures in the Supplementary Information for a comparison of results using versions 2.2, 2.3, 2.4, and 2.5.

# **Data Availability Statement**

The maps of gridded and kriged CDOD produced in this work are publicly available on the "Institut Pierre-Simon Laplace" (IPSL) data repository (accessible via the URL https://doi.org/10.14768/ 20191217001.1). The available datasets include the diurnally averaged gridded and kriged maps (reference column dust climatology, version 2.5) and the subdaily gridded maps (version 2.5.1). The same maps are



available under the Mars Climate Database project webpage (at the current URL http://www-mars.lmd. jussieu.fr/mars/dust\_climatology/). Mars Climate Sounder data are publicly available on NASA's Planetary Data System (https://pds-atmospheres.nmsu.edu/). Data from Curiosity rover obtained by the Rover Environmental Monitoring Station (REMS) instrument are publicly available as supplementary material of Guzewich et al. (2019). GCM outputs and supporting Python scripts used to produce the figures related to modeling results are provided in the Supplementary Information of this paper.

#### Acknowledgments

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# Erratum

In the originally published version of this article, there were misplaced quotation marks in the first sentence as a result of a typographical error. This error has been corrected and this version may be considered the authoritative version of record.